

**Special Issue Reprint** 

# New Trends in Long-Life Road Infrastructures

Materials and Structures

Edited by Jue Li, Junhui Zhang, Junfeng Gao, Junhui Peng and Wensheng Wang

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Jue Li Junhui Zhang Junfeng Gao Junhui Peng Wensheng Wang



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## Editorial New Trends in Long-Life Road Infrastructures: Materials and Structures

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## 1. Introduction

The development of long-life road infrastructure has become a pressing global priority, fueled by escalating demands stemming from rapid urbanization, escalating environmental concerns, and the critical necessity for sustainable, environmentally friendly transportation alternatives [1]. With global and ongoing rapid urbanization, current road networks are encountering increasing difficulty in adapting to rising traffic volumes and changing mobility needs. Concurrently, the urgent need to tackle climate change and lower the environmental impact of transportation infrastructure has underscored the importance of constructing environmentally sustainable and resilient road networks [2].

Conventional road designs and methods often fall short of meeting these evolving demands, as they tend to focus on immediate concerns and do not sufficiently prioritize enduring performance and resilience. For instance, the typical design lifespan of road pavements is often restricted to 15–20 years in China, significantly below the benchmarks established by its economic development [3]. This disparity between the existing capacities and emerging demands has instigated a coordinated endeavor to transform the materials, structures, and technologies utilized in the creation and upkeep of road infrastructure.

The quest for long-life road infrastructures has driven researchers and practitioners worldwide to explore innovative approaches that can enhance the performance, serviceability, and sustainability of road systems. The key areas include the development of advanced eco-friendly materials with superior durability [4], the design of resilient structural systems capable of withstanding escalating demands [5], and the integration of cutting-edge numerical and intelligent technologies to optimize the performance and life-cycle management of road networks [6].

In the materials domain, significant advancements have been made in the development of novel cementitious, asphalt, and composite materials that can offer improved strength, flexibility, and resistance to the environmental degradation of road infrastructures [7]. The incorporation of supplementary cementitious materials, such as fly ash and slag, has demonstrated the potential to enhance the sustainability and long-term durability of concrete-based road infrastructures [8]. Similarly, the utilization of modified asphalt binders and renewable aggregates has shown promise in improving the performance and service life of flexible pavement systems [9,10].

Alongside materials innovation, researchers have also dedicated effort to the enhancement of structural design and analysis capabilities. The integration of advanced numerical modeling techniques, including finite element analysis and discrete element modeling, has enabled a deeper understanding of the complex behavior of road structures under various loading and environmental conditions. This, in turn, has facilitated the development of

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optimized structural designs that can withstand the demands of increased traffic, climate change, and natural hazards better.

In summary, the convergence of these technological innovations, combined with a holistic emphasis on sustainability and life-cycle performance, has set the stage for a new era in road infrastructure development. This book, titled *New Trends in Long-Life Road Infrastructures: Materials and Structures*, aims to showcase the latest research and advancements in this critical field, providing a platform for the dissemination of cutting-edge knowledge and the exploration of transformative solutions. By advancing our understanding of material behavior, structural performance, and life-cycle management strategies, these research findings can inform the design, construction, and maintenance of more durable, eco-friendly, and adaptable road infrastructures.

## 2. An Overview of Published Articles

From the Special Issue on "New Trends in Long-Life Road Infrastructures: Materials and Structures", this book features a diverse collection of 20 state-of-the-art research contributions and 1 comprehensive review article. The articles collected in this book span a wide range of topics, including material characterization, structural behavior, performance assessment, and maintenance planning, all aimed at advancing the state of the art in long-life road infrastructure design and construction.

Contribution 1 investigated the field compaction properties of ultra-thin, porous friction course (UPFC) mixtures designed using the Marshall compaction method. Through laboratory simulation and virtual compaction tests, the researchers revealed significant differences between the laboratory and field compaction characteristics of UPFC, highlighting the need for more appropriate design methods to ensure adequate field performance.

Contribution 2 investigated the effects of modification with glass fiber recycled from wind turbine blades on SBS-modified asphalt and their mechanisms. This study evaluated the performance of the GF-WTB/SBS composite-modified asphalt and explored the underlying modification mechanisms.

Contribution 3 investigated the use of a silane coupling agent to enhance the adhesion properties between recycled concrete aggregates (RCAs) and asphalt. The researchers examined the macroscopic properties, interfacial microstructure, and nanoscale interactions to elucidate the mechanism by which the silane coupling agent improved the RCA/asphalt interface, contributing to the development of sustainable asphalt mixtures.

Contribution 4 explored the use of a composite modifier of rock asphalt and montmorillonite to improve the rutting resistance and anti-aging performance of bio-asphalt. This study determined the optimum content of the components and evaluated the rheological properties and anti-aging performance of the modified bio-asphalt.

Contribution 5 investigated the effect of thermo-oxidative aging and the test temperature on the cracking resistance of asphalt mixtures. The researchers analyzed the stress–strain curves and evaluation indexes of asphalt mixtures with different aging degrees and at test temperatures.

Contribution 6 explored the anisotropic swelling characteristics of expansive soils. The researchers developed a nonlinear elastic constitutive model that incorporated the directionally dependent swelling behavior, providing practical tools for assessing the pressures exerted by expansive soils more comprehensively and guiding their utilization and design.

Contribution 7 presents an extensive examination of the dynamic elastic modulus and damping ratio of coarse-grained soils under varying relative densities. The researchers conducted dynamic triaxial tests to reveal the complex relationships between these critical dynamic parameters and the relative density of the soil, providing valuable insights for geotechnical engineering applications.

Contribution 8 explored the effect of mixing homogeneity on the compaction of soilrock mixtures using the discrete element method. Analysis of the particle motion and energy dissipation mechanisms revealed the critical role of rolling slip energy dissipation in promoting compaction, offering insights for improving the compaction of heterogeneous granular materials.

Contribution 9 investigated the permanent deformation of coal gangue subgrade filler under cyclic loading. This study examined the effects of the confining pressure, grading, and compaction degree on permanent deformation and proposed a unified calculation model for the permanent deformation of coal gangue subgrade filler.

Contribution 10 examined the influence of lime content on the road performance of low liquid limit clay. This study used a limit water content test, a compaction test, and the California bearing ratio test to evaluate the improvements in the basic properties of the subgrade soil after adding lime.

Contribution 11 investigated the use of high volumes of fly ash in the development of high-performance, low-carbon concrete. Through compressive strength, flexural strength, and microscopic tests, the researchers demonstrated the beneficial effects of fly ash on the mechanical properties and microstructure of the concrete, contributing to the promotion of green and sustainable construction materials.

Contribution 12 aimed to clarify the negative pressure distribution in drainage structures of soft foundations reinforced by vacuum preloading. This study established numerical models to analyze the consolidation process of the soft foundation and the distribution of negative pressure in the drainage structure.

Contribution 13 focused on enhancing the seismic resilience of tunnels crossing active fault zones. The researchers conducted large-scale shake table tests and numerical simulations to analyze the seismic responses of a twin-tube tunnel and evaluate the effectiveness of various mitigation measures, such as rock grouting and shock absorption layers, in reducing the amplified seismic demands caused by fault zones.

Contribution 14 explored the effect of combining fiber reinforcement and microbial curing technologies to enhance the deformation resistance and toughness of the soil. This study analyzed the effects of basalt fibers on the strength and toughness of microbial consolidated soil and the stability of the reinforced slope.

Contribution 15 used critical state soil mechanics to study the mechanical properties of Aeolian sand, a special road-building material in desert areas. This study conducted a series of triaxial compression tests to obtain the three-dimensional state boundary surface of the Aeolian sand and provided a basis for constitutive modeling and a reference for road construction in desert areas.

Contribution 16 developed a novel normal cloud framework for a holistic evaluation of the performance of existing asphalt pavements. The researchers integrated a comprehensive weighted indicator system and a cloud model approach to address the fuzziness and randomness inherent in pavement condition data, offering a more sensitive and accurate assessment tool for highway reconstruction and expansion projects.

Contribution 17 introduced a novel approach that employed blind number theory to evaluate the reliability of pavement performance test data. The proposed method aimed to enhance the representativeness of the Pavement Quality Index (PQI) and was demonstrated using detection data on highway asphalt pavements.

Contribution 18 explored the influence of the properties of paint and glass beads on the retroreflectivity performance of pavement markings. By analyzing field data from three test sites, the researchers developed a statistical model that identified the key characteristics with the greatest impact on the retroreflectivity of pavement markings, offering valuable insights for their improved durability and safety.

Contribution 19 investigated the causes of accelerated damage to urban cement concrete pavements. Through field evaluations, including visual inspections, ground-penetrating radar surveys, and permeability tests, the researchers identified the critical roles of an inadequate subgrade bearing capacity and poor drainage conditions in the premature deterioration of urban concrete roads, offering insights for improved pavement foundation design and maintenance.

Contribution 20 focused on the challenges in maintaining and managing rural road networks in China under limited budgets. The researchers proposed an evaluation framework, performance prediction models, and an optimization method for developing cost-effective long-term maintenance strategies for rural roads, providing a theoretical basis for the scientific management of these critical transportation assets.

In Contribution 21, this review discussed the microscopic mechanisms of microbialinduced calcite precipitation (MICP) and its effects on the mechanical properties of unsaturated soils, highlighting the influence of MICP on the moisture-dependent properties of unsaturated soils.

## 3. Conclusions

The collection of articles presented in this book showcases the latest advancements in the research on long-life road infrastructures, covering a wide range of topics, from materials and structures to performance evaluation and modeling.

The research on evaluating the performance of pavements using blind number theory and confidence models demonstrates an innovative approach to quantifying the reliability of pavement data, which can aid in more accurate and representative assessments of overall pavement quality. Studies on the cracking resistance and aging behavior of asphalt mixtures provide important insights into the durability of road surfaces under various environmental conditions.

Investigations into the use of alternative materials, such as low liquid limit clay stabilized with lime and glass fiber recycled from wind turbine blades, highlight the potential for sustainable and cost-effective solutions in road infrastructure construction. Techniques like fiber–microbial curing and the utilization of coal gangue as subgrade filler also show promise in enhancing the mechanical properties and long-term performance of road structures.

Fundamental research on the mechanical behaviors of specialized geotechnical materials, including Aeolian sand in desert environments and the moisture-dependent properties of unsaturated soils, contributes to a better understanding of the unique challenges faced in different geographical and geological settings. The models proposed and the experimental findings obtained in these studies can inform the design and construction of long-life road infrastructures.

Overall, the articles in this Special Issue demonstrate the multidisciplinary nature of the research in the field of long-life road infrastructures, encompassing advances in materials science, geotechnical engineering, and innovative evaluation and modeling techniques. The knowledge and insights gained from these studies will undoubtedly contribute to the development of more sustainable, durable, and efficient road systems that can withstand the demands of modern transportation networks.

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Abstract: As a preventive maintenance treatment, the ultra-thin porous friction course (UPFC) has been widely recognized and used in road maintenance because of its excellent performance and cost effectiveness. The Marshall compaction method (MCM) has been adopted to design UPFC mixtures worldwide, particularly in China. However, there are few studies concerning the field compaction properties of MCM-designed UPFCs. The laboratory test results of this study from simulating on-site compaction showed that all UPFC specimens with thicknesses of less than 20 mm barely achieved the target compaction thickness, and all UPFC specimens with different thicknesses failed to meet the air void (AV) requirements of UPFC mixes designed using the MCM. According to the results of a virtual compaction test, and using the discrete element method, the strong force chains were strengthened as the UPFC thickness decreased inside the specimen, making it difficult to evenly diffuse and transfer inside the specimen and resulting in insufficient compaction of the UPFC. Furthermore, it was demonstrated that the MCM-designed UPFC specimens showed significant differences in the AV distributions along the vertical and lateral directions from those of the UPFC specimens that simulated field compaction. The UPFCs designed using the MCM had a poor correlation with field compaction.

**Keywords:** air void distribution; discrete element method; field compaction characteristics; ultra-thin porous friction course; X-ray computed tomography; compaction method

## 1. Introduction

Ultra-thin porous friction courses (UPFCs) are currently one of the most widely used maintenance preventive measures. As a typical open-grade friction course (OGFC) mixture, UPFC mainly contains fine aggregates and asphalt, which are applied to maintain the performance of road surfaces [1]. It has been demonstrated that UPFC technology is beneficial for the noise reduction and skidding resistance of road surfaces and enhances the traffic safety of drivers [2,3]. Owing to its excellent technical performance and cost effectiveness, it is currently widely used as a surface layer over highway pavements in Europe, the United States, Asia, and other regions and countries.

The full life-cycle cost of UPFCs has been comprehensively evaluated, demonstrating that they have significant economic and social benefits compared to other maintenance techniques [4–6]. To date, the materials, road performance, and engineering applications of UPFCs have been extensively studied. Son et al. developed a 4.75 mm ultra-thin SMA friction course and assessed the performance and engineering benefits of its wear process under laboratory and field conditions [7]. A high-toughness UPFC was proposed by Yu et al. according to the climatic characteristics of South China, and it has been used in more than 100 cases of road maintenance engineering owing to its excellent noise reduction, anti-skidding properties, and durability [8]. In addition, a low-carbon and sustainable

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**Copyright:** © 2024 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). cold-mixed ultra-thin asphalt overlay was proposed [9]. Another study recommended a porous ultra-thin overlay (PUTO) technology [10], and its service performance was evaluated [11]. The compaction characteristics of UPFCs have also been the focus of researchers. It is well known that compared to ordinary asphalt layers, the thickness of a UPFC is only 1–2 cm, resulting in different compaction requirements, temperature, and other conditions in the process of construction [12]. Owing to its minimal thickness, heat is easily lost, leading to a rapid temperature drop rate during the paving process, which has an adverse effect on compaction [13]. Insufficient compaction leads to air void (AV) content in the UPFC over the design range, which impairs the moisture sensitivity, fatigue life, and road performance at different temperatures of the UPFC, making it prone to aggregate peeling, loosening, and other problems [14]. Luo et al. studied the field compaction parameters of a UPFC using laboratory compaction tests based on the energy equivalent principle [13]. Similarly, a study by Suresha et al. investigated the influence of Marshall compaction efforts on the compaction characteristics of UPFCs [15]. It was found that the target mineral gradation and the traffic level are key factors in selecting the suitable compaction efforts of a UPFC mix. Norhidayah et al. focused on the AV characteristics in PUTO using X-ray CT technology [16]. The aggregate size and compaction thickness of the UPFC mix affected the particle flow during the compaction process, thereby affecting the AV characteristics and determining the compaction effect. Similarly, Alvarez et al. investigated the influence of densification on the road performance of UPFC mixes [17]. Density control of the UPFC during construction is suggested to ensure a balance between mix durability and functionality. Furthermore, the internal AV structures were analyzed between laboratory samples and UPFC field cores and it was found that significant differences existed [18]. According to ground-penetrating radar data, Wang et al. studied the thickness and density in the field compaction process of UPFCs and proposed a corresponding prediction algorithm [19]. The current research on the compaction characteristics of UPFCs has made some progress, but further studies are still needed to describe the differences in the compaction characteristics between the field and indoor compaction of UPFCs more accurately to achieve better simulations of field cores with laboratory specimens.

One of the most used design methods for UPFCs is the Marshall compaction method (MCM), particularly in China. Many studies have proven that there is a poor correlation between field cores and MCM-designed asphalt mixtures with ordinary thickness [20–22]. Laboratory UPFC specimens molded via the MCM are 2.5 to 6 times thicker than the actual paving thickness of the UPFCs. The difference in thickness inevitably leads to different compaction characteristics of the UPFC, which have different effects on its volume parameters. If a MCM-designed UPFC cannot reflect the actual compaction condition, the performance evaluation of the UPFC will deviate significantly from that of the actual pavement. Therefore, it cannot contribute to accurate guidance for the application of thin-layer overlays [23,24]. Currently, no studies have used field compaction tests to verify MCM-designed UPFC mixes. There may also be a poor relationship between the MCM-designed UPFC is only 1–2 cm, more research on the correlation assessment of the compaction characteristics between on-site compaction and the MCM is required.

The development of nondestructive technologies, especially image analysis and X-ray CT, has enabled road workers to thoroughly study the internal structure inside asphalt mixes over the past two decades. The relative properties can be obtained involving the distribution, orientation, contact, and AV distribution of the aggregates using X-ray CT technology [25]. The AV distributions of the specimens with different gradations molded by Superpave gyratory compaction (SGC) were obtained using X-ray CT to analyze the compaction characteristics [26,27]. In addition, relevant research on the meso-mechanical response of asphalt mixes during the compaction process has made significant progress owing to the continuous progress in the discrete element method (DEM). It has been demonstrated that the SGC test simulated via the DEM was consistent with the laboratory

test [28]. Moreover, the DEM was used to explore the effects of force chain evolution and aggregates in the compaction process [29]. There is no doubt that research progress on the application of CT technology and DEM in asphalt mixtures provides a powerful means and experience for exploring the current compaction characteristics of UPFCs.

Therefore, this study explores the field compaction mechanism of a UPFC designed using an MCM. Owing to the lack of field core samples, SGC and rolling-wheel compaction (RWC) methods were used to form laboratory specimens with the same thickness as the paving thinness of a UPFC, with the aim to simulate on-site compaction conditions. Accordingly, the compaction characteristics and mesoscopic force of the UPFC during the compaction process were studied. The research results are significant for improving the road performance of UPFCs.

## 2. Experimental Design

## 2.1. Experimental Objective

This study aimed to explore the field compaction properties of MCM-designed UPFC mixes based on laboratory simulations of the SGC and RWC methods. To achieve this objective, the AV characteristics and compaction mechanism of the UPFC were analyzed using X-ray CT and DEM according to the following tasks:

- To analyze the compaction characteristics of the MCM-designed UPFC mixes with different thicknesses, the SGC method was used to simulate field compaction.
- The compaction mechanism of the UPFCs with different thicknesses was analyzed using the DEM.
- To analyze the relationship between the AV characteristics of the MCM-designed laboratory specimens and the simulated field cores molded using the SGC and RWC methods, we evaluated the rationality of the UPFC mixes designed using the MCM.

#### 2.2. Raw Materials and Mix Design

A kind of styrene–butadiene–styrene (SBS) high-viscosity asphalt was selected [30], with a dosage of 6% by weight of mineral aggregates. Limestone aggregates of 0–3 mm and basalt aggregates of 3–5 mm were adopted, and the ore powder was made of limestone. Basalt fiber accounted for 0.3% by weight of the mixture. The technical indexes of all materials met the requirements of the Chinese technical specifications for construction of highway asphalt pavements (JTG F40-2004) [31]. OGFC mixes with a maximum nominal particle size of 4.75 mm (OGFC-5) were adopted to prepare the UPFC, hereinafter referred to as OGFC-5 UPFC. Tables 1 and 2 present the OGFC-5 gradations and the mix designs, respectively.

Sieve size (mm)	9.5	4.75	2.36	1.18	0.6	0.3	0.15	0.075
Passing rate (%)	100.0	92.1	16.1	11.7	9.8	7.9	7.2	5.0

Table 1. The mineral gradation of OGFC-5 mixtures.

Table 2. The results of OGFC-5 mix design.

Mix Design	Target Size of S	pecimen (mm)	OAC	Target AV	Measured		
Method	Diameter	Height	(%)	Ratio (%)	AV Ratio (%)		
Marshall	101.6	63.5	6.0	18.0	17.9		
Note: OAC remains antimal combalt content							

Note: OAC represents optimal asphalt content

## 2.3. Methodology and Testing

### 2.3.1. Compaction Characteristics of OGFC-5 UPFC with Different Thicknesses

Khan et al. demonstrated that an internal rotation angle of 1.25° in the SGC method best reflected the compaction characteristics of the field cores [20]. In addition, the Stratagem Highway Researching Plan (SHRP) recommended an internal rotation angle of

1.16° and a compaction pressure of 600 kPa in the SGC method, which better represents the field compaction. Therefore, to simulate the compaction characteristics of the UPFC with the actual paving thickness, OGFC-5 specimens with different thicknesses were formed using the SGC method, and the compaction height changes in the OGFC-5 specimens under different compaction parameters were analyzed. Considering that the actual paving thickness of the OGFC-5 UPFC in a paving process is as thin as 1 cm, the target compaction heights were selected as 15, 20, 25, 40, and 63.5 mm, respectively. Table 3 lists the SGC parameters. Notably, the mixed masses of the SGC specimens under different test conditions were calculated according to the equivalent volumes of the Marshall specimens to ensure the same density of the mixtures.

Table 3. Compaction parameters.

Compaction Parameters		The Value of Compaction Parameters						
Target height (mm)	15	15	15	15	20	25	40	63.5
Target Radius (mm)	100	100	100	150	100	100	100	100
Vertical pressure (kPa)	600	600	800	600	600	600	600	600
Angle of internal gyration (°)	1.15	1.72	1.15	1.15	1.15	1.15	1.15	1.15
Specimen ID	S100/15	S100/15-1	S100/15-2	S150/15	S100/20	S100/25	S100/40	S100/63.5

2.3.2. Compaction Mechanism of OGFC-5 UPFC with Different Thicknesses

The DEM was used to simulate the SGC test to explore the compaction mechanism of the OGFC-5 mixture with different compaction thicknesses [32–34]. The displacement and force chain transmission of the DEM model were recorded at certain gyratory compaction times. Table 1 presents the OGFC-5 gradations used in the DEM simulations. To enhance the computing speed, the generated particles were greater than 2.36 mm. The Burgers model was used as the contact model, and its parameter values are listed in Table 4 [33,34]. As shown in Figure 1, the heights of the DEM model were 20, 40, and 63.5 mm, respectively. The model set an initial AV content of 35.0%, an angle of 1.15°, compaction pressure of 600 kPa, and a compaction time of 1 h between the loading wall and plane.

Table 4. The model parameters.

	Model Parame	ters	Value
	Spring	shear stiffness (Pa·m)	$5.1 \times 10^7$
Kelvin model	oping	Normal stiffness (Pa·m)	$5.1 \times 10^7$
	Dashpot	Normal stiffness (Pa·m·s)	$3.6 imes10^6$
	Dashpot	shear stiffness (Pa·m·s)	$3.6 imes10^6$
	Corrigo	shear stiffness (Pa⋅m)	$4.3  imes 10^9$
NG 11 1 1	Spring	Normal stiffness (Pa·m)	$4.3 imes10^9$
Maxwell model	Dechrot	Normal stiffness (Pa·m·s)	$1.8  imes 10^9$
	Dashpot	shear stiffness (Pa·m·s)	$1.8  imes 10^9$



Figure 1. DEM model of SGC method.

## 2.3.3. AV Characterization of OGFC-5 UPFC Based on CT Scanning

The OGFC-5 mixture possesses an AV content of 18–25%. Internal AV characteristics (such as the AV content and size) are critical for noise reduction and drainage improvement. In view of this, 15 mm OGFC-5 specimens were formed using the SGC and RWC methods to simulate the field core samples of the UPFCs. Similar to the SGC specimen, the mix masses of the RWC specimen were calculated according to the equivalent volume of the Marshall specimens. The roller-forming equipment used was an Italian control pavement roller, as shown in Figure 2. A 400 mm  $\times$  300 mm  $\times$  15 mm (length, width, height, respectively) cuboid specimen was fabricated using a height control procedure, and core samples were drilled to obtain cylindrical specimens. The samples are listed in Table 5. According to the OFGC-5 UPFC mix design results using the MCM, 15 mm UPFC specimens formed via SGC and RWC that simulate the field compaction were not compacted to the target AV content and height, which indicated that the MCM-designed UPFC mixes did not conform to the field compaction.



Figure 2. Controls pavement roller.

Table 5. Summary of different test specimens.

Specimen ID	Molding Method	Target Specimen Size (Diameter $\times$ Height)	$\begin{array}{llllllllllllllllllllllllllllllllllll$	Target AV Ratio (%)	Measured AV Ratio (%)
M100/63.5	Marshall	101.6 mm $\times$ 63.5 mm	101.6 mm $ imes$ 63.0 mm		17.9
S100/15	SGC	$100~\text{mm}\times15~\text{mm}$	$100~\text{mm} \times 16.7~\text{mm}$	10	27.2
S150/15	SGC	$150~\text{mm}\times15~\text{mm}$	5 mm 150 mm × 16.8 mm <sup>18</sup>		26.5
R100/15	RWC	$100~\text{mm}\times15~\text{mm}$	$100~\text{mm} \times 17.0~\text{mm}$		27.4

In the experiment, the PrecisionIICT for industrial use produced by YXLON was used to scan the samples, and pictures were obtained every 0.1 mm along the height of the samples, as shown in Figure 3. These obtained pictures were automatically handled by a macro, and then Image-Pro Plus software (IPP 6.0.0.260) was applied to obtain the AV characteristics. According to the study conducted by Masad et al. [35], the average AV contents of the single and total images were determined using Equations (1) and (2), respectively. In addition, because the AV diameter largely depends on the packing degree of the granular skeleton inside the UPFC samples, the average AV diameter should be analyzed [36]. Therefore, the AV size decreased with increasing packing and particle contact. Equation (3) was adopted to calculate the average AV radius of the *i*-th image. Furthermore, the horizontal variability in the AV ratios and the mean AV diameter in the

cross sections of different radii (Figure 4) were investigated to obtain the horizontal AV distribution of the Marshall specimens and simulated field cores.

$$AV_i = \frac{A_{vi}}{Ai} \tag{1}$$

$$AV_s = \frac{\sum_{i=1}^{n} AV_i}{N}$$
(2)

$$d_i = 2\sqrt{\frac{A_{vi}}{\pi n}} \tag{3}$$

where  $A_i$ ,  $A_{vi}$ ,  $AV_i$ ,  $d_i$ , and n are the cross-sectional area, AV area, AV ratio, AV mean diameter, and AV number of the *i*-th image, respectively. The AV<sub>s</sub> and N correspond to the AV rate and total number of CT images of the test specimen, respectively.



Figure 3. CT scanning.



**Figure 4.** Different radius cross sections used in analysis on horizontal AV variability: (**a**) 1/4 radius; (**b**) 1/2 radius; (**c**) 3/4 radius; (**d**) full radius.

## 3. Results and Discussion

## 3.1. Compaction Properties of OGFC-5 UPFC with Different Thickness

According to the compaction parameters in Table 3, different OGFC-5 UPFC samples were prepared to monitor the compaction process. The simulated field compaction results for the OGFC-5 UPFC under different compaction parameters are presented in Table 6 and Figure 5. The curve of the specimen height with respect to the gyratory number is shown in Figure 5a. According to Equation (4), linear regression analysis was performed on the

specimen height and gyratory number, as shown in Figure 5b. The results of the linear regression analysis are presented in Table 7.

$$\ln H(N) = a - k \ln(N) \tag{4}$$

where *a* and *k* correspond to the fitting parameters, and *N* and H(N) represent the gyratory number and height at gyratory number of *N*, respectively. The parameters *a* and *k* reflect the initial density and difficulty of the compaction process, respectively. The larger the *a* and *k* values, the easier it is for the specimen to be compacted to the target height [37].

Table 6. The compaction results of different SGC compaction parameters.

Specimen ID	S100/15	S100/15-1	S100/15-2	S150/15	S100/20	S100/25	S100/40	S100/63.5
Gyratory number	200	200	200	200	200	128	80	32
Height AV ratio	16.7 27.2%	16.7 27.3%	16.5 27.3%	16.8 26.5%	21.7 24.4%	25.2 18.6%	40.2 18.3%	63.4 19.1%



Figure 5. Compaction curves: (a) common coordinates; (b) semi-logarithmic coordinates.

Table 7. The results of linear-regression analysis.

Specimen ID	S100/15	S100/15-1	S100/15-2	S150/15	S100/20	S100/25	S100/40	S100/63.5
k	0.030	0.027	0.028	0.023	0.035	0.041	0.048	0.058
а	2.949	2.942	2.936	2.925	3.241	3.418	3.894	4.348
$R^2$	0.978	0.990	0.983	0.903	0.996	0.995	0.992	0.999

As shown in Table 6, 5 test specimens, S100/15, S100/15-1, S100/15-2, S150/15, and S100/20, were insufficiently compacted and did not achieve the target compaction thickness after 200 gyratory numbers. In addition, the AV contents of the five specimens were 27.2%, 27.3%, 26.5%, and 25.4%, respectively, which were much higher than the design AV requirement of 18% for UPFC mixes designed using the MCM.

According to Table 7, for the 15 mm UPFC specimen, the *a* and *k* values of all 15 mm  $\times$  100 mm (height and diameter, respectively) test samples showed little difference, and increasing the vertical pressure and the internal gyration angle had little effect on the compaction height. The S150/15 specimen had the smallest k value, indicating that the S150/15 specimen was the most difficult to compact to 15 mm. In this regard, the increased radius of the specimen made the compaction pressure more dispersed and increased the difficulty of compaction of the UPFC specimen. In addition, a decrease in the compaction thickness decreased the values of parameters *a* and *k*. The initial compaction density of the UPFC specimen decreased, which resulted in compaction difficulties. At the same time,

Figure 5a exhibits that the smaller the compaction thickness, the more gyratory numbers were required. This could be because the pressure inside the specimen was non-uniform as the target compaction height decreased. The aggregates in one or several regions were stabilized and bore the main pressure, whereas the other unstabilized regions received less force, and it was difficult for the particles to move, rotate, and be sufficiently compacted.

# 3.2. Compaction Mechanism of OGFC-5 UPFC with Different Thickness 3.2.1. Displacement and Stress of Loading Wall

Figure 6 shows the displacement curve of the loading wall with respect to the loading time. Remarkably, there was an initial displacement at the time of formal loading because the wall needed to be preloaded before loading. Figure 6 shows the time it took for the SGC model displacement curves of different compaction thicknesses to reach the stable stage ranked 63.5 mm, 40, and 20 mm in descending order.



Figure 6. Displacement-time curves of loading wall.

The stress curve of the loading wall with respect to time is shown in Figure 7. The wall continued to move downward at a stress below 600 kPa, indicating that the model was still not fully compacted. The compaction tends to stabilize when the stress is maintained at approximately 600 kPa [38]. As shown in Figure 7, the stress of the 20 mm model was stable and fluctuated around 600 kPa at the earliest. Subsequently, the 40 mm and 63.5 mm models reached a stable stage.



Figure 7. Stress-time curves of loading wall.

A conclusion drawn from Figures 6 and 7 is that the 20 mm UPFC model was the first to reach a steady state. On the one hand, this may be because the 20 mm model is the easiest to compact fully, and it enters the stable state first. However, this may be because the 20 mm model could not be fully compacted, leading to a stable state in advance. Therefore, further analysis of the displacement of the loading wall is required to determine its specific cause. Aggregate crushing can affect the degree of interlocking between aggregate particles and the filling effect of asphalt. However, it should be noted that the DEM model does not take into account the effects of aggregate fragmentation and morphology, which may lead to misjudgment of the compaction process, thereby affecting the stability and durability evaluation of the UPFCs. Crushed aggregates require different compaction energies to achieve optimal compactness. Meanwhile, aggregate crushing affects the volume change and compaction curve of UPFCs. Although the DEM model does not consider the aggregate fragmentation and morphology, which may lead to a certain deviation between the time-displacement curve and the actual compaction, the simulation results can basically explain the above-mentioned laboratory test results, that is, when the UPFC target compaction thickness is too small, no matter what compaction parameters are used, the UPFC sample cannot meet the compaction requirements.

The final displacements of all models with different heights were obtained, representing the compacted thickness of the model. The definition index  $D_H$  is the compacted thickness per unit height of the model, which reflects the difficulty of compaction at different heights. The  $D_H$  value was equal to the displacement of the loaded wall divided by the height of the model. The calculated  $D_H$  values are listed in Table 8. The DH values ranked as D20, D40, and D63.5 in ascending order. This indicates that as the molding height decreased, the model became more difficult to compact. This result explains why a model displacement of 20 mm reached a stable state the earliest, which is consistent with the compaction data in Section 3.1.

Table 8. The DH values.

UPFC Height/mm	20	40	63.5
Displacement of loading wall/mm	1.42	8.61	17.46
$D_{H}$	0.07	0.22	0.27

## 3.2.2. Micromechanical Response

Figure 8 presents the direction results of the normal contact force of the particles after loading for 1 h. The contact normal forces of the different models were distributed in all directions, and there were no distribution concentrations in any specific direction. Remarkably, the contact normal force of the 20 mm model exhibited a sudden increase in several directions. This phenomenon was also found in the 40 mm model, while the increment of the contact normal force was relatively small in comparison to that of the 20 mm model. As for the 63.5 mm model, the force values were relatively uniform in each interval. The maximum contact normal force values of the 20 mm and 40 mm models were 8 times and 2.67 times that of the 63.5 mm model, respectively. The smaller the molding height, the greater the force value observed.

The force chain and contact force were further studied to analyze the load transmission in the model. Figures 9 and 10 show the simulation results of the contact force and force chain, respectively. The colors of the particles in Figure 9 indicate the magnitude of the contact force. A phenomenon occurred where the contact forces of some particles were much stronger than that of other particles. The maximum force value increased with a decrease in model height, and the particle size showed a random trend in the force concentration region, indicating that the concentrated force region was independent of the particle size.



**Figure 8.** Direction distribution of contact normal force of different thickness UPFC model: (**a**) general drawing; (**b**) 20 mm; (**c**) 40 mm; (**d**) 60 mm.



Figure 9. Contact force distribution of different thickness UPFC models: (a) 20 mm; (b) 40 mm; (c) 60 mm.



**Figure 10.** Force chain distribution of different thickness UPFC models: (**a**) 20 mm; (**b**) 40 mm; (**c**) 60 mm.

A schematic of the force chain clearly reflects the load transmission in the model. The thickness of the force chain in Figure 10 indicates the magnitude of the contact force. It can be found that the 63.5 mm model had more uniform thickness in the force chain, while the 20 mm model had less force in other areas owing to the existence of a strong chain area. With a decrease in height, the force chain became more significant, resulting in a load that is more difficult to fully diffuse and transfer inside the model [39]. Particles in the weak force chain region could not move and rotate sufficiently, making the model more difficult to compact. In conclusion, the target height of the UPFC specimen designed by the MCM method was 63.5mm, which varied from the actual UPFC paving thickness, making it difficult to achieve the specified on-site compaction degree. Therefore, it is possible to consider reducing the target height of the UPFC to make the MCM design more in line with construction.

## 3.3. AV Characterization of OGFC-5 UPFC Based on CT Scanning

## 3.3.1. Vertical Distribution

The vertical distributions of the AV content and coefficient of variation (COV) are shown in Figure 11. The vertical distribution of the AV diameter is shown in Figure 12. As shown in Figures 11a and 12, the curves of the AV content and AV diameter are in a "bathtub" shape along the vertical direction. The AV content was homogeneous and stable in the middle part, whereas those in the bottom and top parts were much larger than the average AV content. In addition, except for the Marshall specimen, the AV content of the other simulated field cores exceeded the design range. The overall AV content and diameter of the MCM-designed UPFC samples was smaller than those of the simulated field cores. The results show that the MCM-designed UPFC did not correspond well with the field construction situation. Obviously, in order to achieve the AV content of the Marshall-designed UPFC during the on-site construction process, it is necessary to increase the compaction tonnage, which will inevitably lead to an increase in the aggregate crushing. Crushed aggregates further embed and fill voids, resulting in a decrease in porosity. However, this will have an adverse impact on the performance of the UPFC.



Figure 11. The vertical distribution: (a) mean AV content; (b) vertical variability.



Figure 12. The vertical distribution of AV diameter.

As shown in Figure 11b, the COV of the Marshall specimen was the largest among all test samples. This is because the SGC and RWC methods exert a kneading effect during the compaction process, such that the aggregates can be fully moved and arranged, thereby producing a relatively homogeneous internal structure. However, because the Marshall compaction method relies mainly on vertical impact, the homogeneity of the internal structure of the sample was relatively poor. The COV of the S150/15 specimen was the smallest, indicating that increasing the compaction area improved vertical uniformity [18,40]. In addition, the COV values of the 15 mm specimens were all smaller than those of the 63.5 mm specimen, indicating that a small compaction thickness was conducive to uniform compaction. The reason that the 15 mm UPFC specimen could not reach the target height was not compaction. According to Figures 10 and 12, a concentrated force region existed, resulting in insufficient movement and packing between the aggregates when the compaction thickness of the UPFC was small. Thus, the AV size between the aggregates was large, and the thin UPFC specimen could not be compacted to the target thickness.

#### 3.3.2. Horizontal Distribution

The horizontal distributions of the AV content and COV are presented in Figure 13. The AV content of the 63.5 mm Marshall specimen was the most uniform and stable in the horizontal direction, while that of the other 15 mm simulated field cores exhibited a wave shape along the horizontal distribution. In addition, Figure 13b shows that the COV of all the specimens showed a wavy trend along the radial direction. Remarkably, the S150/15 specimen had the smallest COV, which conforms to the conclusion drawn from Figure 11b. Overall, the horizontal distributions of the AV between the MCM-designed UPFC and the simulated field cores were quite different. It was also proven that the MCM-designed UPFC mixes did not accurately reflect the field construction of the UPFC.



Figure 13. The horizontal distribution: (a) mean AV content; (b) horizontal variability.

## 4. Conclusions

The compaction characteristics of an OGFC-5 UPFC specimen designed using the MCM and simulated field cores were studied at multiple scales using laboratory compaction tests, DEM, and X-ray CT techniques. On the basis of the results, some conclusions were drawn, as follows:

- (1) The compaction-test data demonstrate that the simulated field specimens with thicknesses of 15 and 20 mm barely achieved the target compaction thicknesses. All the UPFC specimens of different thicknesses failed to meet the AV requirements of the UPFC mixes designed via the MCM.
- (2) As the compaction thickness decreased, the values of parameters *a* and *k* also decreased. The initial compaction density of the UPFC specimen decreased, which resulted in compaction difficulties.
- (3) According to the results of the SGC test based on the DEM, the smaller the height of the virtual specimen, the earlier its displacement and stress reached a stable state. Moreover, as the model decreased in height, the D<sub>H</sub> value; that is, the compacted thickness per unit height of the model, decreased, and the model was more difficult to compact.
- (4) DEM models with different thicknesses exhibited several force concentration regions. Compared to that of the 63.5 mm model, the maximum contact normal force of the 20 mm and 40 mm models increased by 266% and 800%, respectively. The decrease in the UPFC thickness strengthened the strong force chain in quantity and strength inside the specimen, resulting in difficulty in evenly diffusing and transferring pressure inside the specimen.
- (5) Based on the results of the UPFC specimens obtained using CT scanning, a small compaction thickness was conducive to uniform compaction. The AV distributions of the Marshall specimens were quite different in the vertical and horizontal directions from those of the UPFC specimens that simulated the field compaction. The MCMdesigned UPFCs showed poor consistency with the field compaction.
- (6) According to the investigation results, the MCM-designed UPFC is not in compliance with on-site construction. In order to better align with actual construction and ensure the performance of the UPFC, potential paths to improve UPFC designs from the perspective of mixture design include reducing the height of the MCM design specimens and changing the UPFC design methods.

These research results provide feasible references for achieving more durable UPFCs. However, this study did not take into account the influence of some factors, such as mineral gradation and aggregate characteristics, and it lacked on-site experimental validation. Future research will focus on the above aspects, particularly regarding the effects of aggregate morphology and crushing on the compaction behavior of UPFCs. **Author Contributions:** Conceptualization, X.D.; methodology, X.D. and H.L.; validation, M.S.; formal analysis, X.D., H.L. and W.L.; investigation, X.D., H.L., M.S. and W.L.; data curation, X.D., H.L., M.S. and W.L.; writing—original draft preparation, H.L.; writing—review and editing, X.D. and H.L.; supervision, H.Z. All authors have read and agreed to the published version of the manuscript.

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## Article Performance and Modification Mechanism of Recycled Glass Fiber of Wind Turbine Blades and SBS Composite-Modified Asphalt

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Abstract: Efficient disposal of composite materials recycled from wind turbine blades (WTB) at end-of-life needs to be solved urgently. To investigate the modification effects and mechanism on SBS-modified asphalt of the recycled glass fiber (GF) from WTB, GF-WTB/SBS composite-modified asphalt was prepared. Dynamic shear rheometer (DSR) and bending beam rheometer (BBR) were adopted to evaluate its performance. FTIR, SEM, EDS, and AFM methods were used to assess coupling agent pretreatment effects on GF-WTB and observe the modification mechanism. The macroscopic tests show that reasonable addition of GF-WTB effectively raises the high-temperature performance and low-temperature crack resistance evaluation index k-value of SBS-modified asphalt, and the optimal content is 2 wt% GF-WTB with 4 wt% SBS. FTIR, SEM, and EDS tests show GF-WTB can be successfully grafted by UP152 coupling agent and show that adhesion of the GF-WTB to the SBS-modified asphalt can be improved. AFM observation shows SBS and GF-WTB have good compatibility, improving the asphalt elasticity and toughness. This study provides a feasible solution for environmentally friendly regeneration of the composite materials from WTB and contributes to the development of the secondary modifier of SBS-modified asphalt.

Keywords: composite-modified asphalt; recycled glass fiber; wind turbine blades; silane coupling agent; SBS-modified asphalt

## 1. Introduction

Wind power can offer clean and renewable energy with a low environmental impact and an increasing number of wind farms are built around the globe. The service life of a wind turbine blade (WTB) is typically 20–25 years [1]. However, many blades are coming out-of-service prior to that due to increasing power. The wind turbine industry is expected to store millions of tons of waste composite wind blades in the coming years [2–4]. These structures are mainly manufactured with glass fiber (with some use of carbon fiber) embedded in thermoset matrix materials such as epoxy, unsaturated polyester resin, or vinyl ester resins [5]. Waste disposal of fiber-reinforced polymer (FRP) composite materials from wind turbine blades at end-of-life, a majority of which are handled by landfills or incineration, is a problem that needs to be solved.

Due to the cross-linked structure after curing of the thermoset matrix materials, the thermoset composite cannot be melted and molded for the second time, meaning that the reinforced materials in thermoset composite are difficult to be recycled. Recycling technologies developed for thermoset composite materials mainly contain mechanical recycling, thermal recycling, and chemical recycling [6–8]. The latter two technologies are in the laboratory stage and currently have no practical application. Mechanical recycling is a simple physical process, which can partly recycle the reinforced materials in thermoset composite. Based on comparative analysis, the mechanical recycling seems to be the best choice at present. The mechanically recycled materials obtained by breaking up the

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**Copyright:** © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). waste into particles or milling into fine powder are mainly used as fillers, reinforcement or raw materials for cement, concrete, etc. One of the most extensive research studies was carried out on Portland cement concrete in which mechanically recycled glass fiberreinforced polymer (GFRP) waste was incorporated either as reinforcement, aggregate, or filler replacement [9,10]. Asokan et al. [11] assessed that GFRP waste substitution of fine aggregates in concrete could save approximately 15% of the fine aggregate cost. Presently, mechanical recycling has been applied in the waste composite recycling of WTB. Ribeiro et al. [12] reused the mechanically recycled GFRP pultrusion wastes from wind blades as aggregate and filler replacement for concrete–polymer composite materials. Schmidl and Hinrichs [13] mechanically recycled GFRP composites from blades which were used in cement production.

Rich studies have been carried out on various pristine fibers such as polymer fibers, lignin fibers, mineral fibers, glass fibers (GF), etc. in the application of asphalt pavement materials [14]. Many results indicate that the incorporation of fiber can significantly improve the high-temperature performance of asphalt. There are some applications of recycled fibers from waste fiber materials or thermoplastic materials such as waste plastic bottles added to asphalt pavement materials. However, few researchers reported the asphalt pavement engineering applications of recycled fibers from waste thermoset composites in wind energy, automotive, aerospace, construction industries, etc. Compared to the recycled fibers from waste fiber materials, the mechanically recycled glass fibers from wind turbine blades are of smaller size and blended with resin residues. By applying the recycled fibers from waste tires and waste plastic bottles or new polyester fiber to asphalt mixture, Liu [15] found that the high-temperature stability, water stability, and anti-fatigue properties were improved compared with ordinary asphalt mixtures; however, the effect was relatively insignificant compared with the new polyester fiber. Dehghan and Modarres [16] evaluated the effect of recycled polyethylene terephthalate (PET) fibers from waste plastic bottles on the fatigue properties of hot asphalt mix. Qilin Yang et al. [17] found recycled glass fiber chips from GFRP composite of waste airplane cabins blended into the 70/100 penetration bitumen improved high-temperature performance of the bitumen, water resistance, and low-temperature crack resistance of the bitumen mixture.

To summarize, mechanically recycled GF from WTB is viable and promising in the modification of the asphalt pavement materials and provides a new environmentally friendly recycling method for the waste WTB. Though mechanical recycling is relatively simple, the structure of the fiber may be damaged and the mechanical properties may be reduced in the recovery process. Considering the crushing, screening, and surface treatment process, the recycled GF from GFRP composites of WTB is the secondary modifier of SBS-modified asphalt in this study. Modifying the glass fiber prior to adding to SBS-modified asphalt can further improve the stability of composite-modified asphalt. These modification methods mainly include physical modification, surface chemical grafting, and surface chemical etching [18–24]. In this study, the surface chemical grafting by silane coupling agent was chosen as the surface treatment process. The objective of this study is to investigate the pretreated GF-WTB modification effects and mechanism on SBS-modified asphalt by macroscopic high- and low-temperature tests and microscopic observation, providing an effective regeneration solution for GFRP from waste WTB.

#### 2. Materials and Experiments

## 2.1. Raw Materials and Sample Preparation

#### 2.1.1. Matrix Asphalt and Raw GFRP Composites

The virgin asphalt binder in this study was AH-70 (60–80 penetration) from Petro-China Company Limited (Beijing, China). The raw glass fiber-reinforced polymer (GFRP) composites were obtained from the decommissioned wind turbine blade (WTB) at end-life, as seen in Figure 1a, which was crushed into small pieces using Los Angeles Abrasion Value machines by the Hunan Chuangyi Industrial Material Company (Xiangtan, China), as seen in Figure 1b.



**Figure 1.** Raw GFRP composites from wind turbine blade at end-of-life: (**a**) wind turbine blade at end-of-life; (**b**) recycled GFRP.

## 2.1.2. Grading of GFRP Pieces

Using the vibrating screen machine (ZBSX-89), the raw GFRP pieces were screened and recycles with different diameters were mechanically separated. GF components were mainly distributed in the following several diameter particles: A (<0.075 mm), B (0.15–0.075 mm), C (0.3–0.15 mm), as seen in Figure 2. Among the three particle types, particle C is of the best degree of uniformity and relatively large size, which was selected as the original modifier in the following study.



**Figure 2.** Three types of GF particles obtained after grading of GFRP pieces: (**a**) <0.075 mm; (**b**) 0.15–0.075 mm; (**c**) 0.3–0.15 mm.

#### 2.1.3. GF Particles Heat- and Humidity-Resistance Check and Surface Treatment

According to current Chinese specification [25], under conditions of 210 °C and 1 h, the weight damage rate of the sample must be not more than 6% and the sample should not exhibit combustion. GF particles were placed in a beaker and heated in an oven at 210 °C for 1 h to measure the weight damage rate. With a mean damage rate of 3.2% from two measurements and no combustion, it was determined that the GF was resistant to high temperature and met the relative requirement for asphalt modification. For a humidity-resistance check, GF particles were prepared in a beaker with moderate deionized water and placed in a curing box at about 20 °C and 90% relative humidity to observe its shape and color changes and record quality change after 5 days. With no obvious change of color, no dispersed trend of the fiber clump, and a 1% (less than 5%) water absorption rate, it was determined that the GF was resistant to humidity and met the relative requirement for asphalt modification [25].

The GF particles surface treatment process was as follows. Firstly, the GF particles were dried at 230 °C for 1 h and after cooling they were then soaked in acetone for 1 h to remove the surface impurities. Three types of silane coupling agents (UP152, KH550, and KH792) were chosen for comparison. Silane coupling agent, ethanol, and water (at a volume ratio of 5:85:10) were stirred fully and the blend was placed for 10 min until

hydrolysis. The GF particles were immersed in quantitative coupling agent solution for 1 h and was then taken out to be dried and ready for use.

#### 2.1.4. Preparation of GF-WTB/SBS-Modified Asphalt

Quantitative asphalt AH-70 was heated at 145 °C for 0.5 h to reach the flow state and evaporate water and then subsequently added with SBS (based on the weight of the matrix asphalt, 2, 3, 4, 5% SBS) and the blend was shear emulsified under 2000 rpm for 20 min at 160–170 °C.

Silane coupling agent modified GF-WTB was added to the prepared SBS-modified asphalt sample (based on the weight of the matrix asphalt, 0, 1, 2, 4% GF-WTB) and the GF-WTB was kept warm and swelled for 10 min at 160 °C. Then, the GF-WTB incorporated SBS-modified asphalt was evenly dispersed under 4000 rpm for 40 min at 140 °C and finally was developed for 10 min at 150 °C. The sample naming was shown in the following example. If the SBS modifier dosage was 2% and the GF-WTB dosage was 1%, the GF-WTB/SBS composite-modified asphalt sample was marked as SBS2 + WTB1. Figure 3 shows the preparation flowchart of the GF-WTB/SBS composite-modified asphalt.



Figure 3. Flowchart of GF-WTB/SBS composite-modified asphalt preparation.

#### 2.2. Rotational Viscosity

According to the standard test methods of asphalt for highway engineering [26], the rotational viscosity of the GF-WTB/SBS composite-modified asphalt was tested using a Brookfield viscometer (model NDJ-1F, Shanghai Changji Geological Instrument Co., Ltd, Shanghai, China) at 135 °C.

## 2.3. Dynamic Shear Rheometer (DSR) Test

The DSR test was used to characterize viscous and elastic behavior of the GF-WTB/SBS composite-modified asphalt at medium to high temperatures. The DSR model used in the test was DHR-3, adopting the sinusoidal strain control mode. The gap and the diameter for the test were 1 mm and 25 mm, respectively. The angular velocity was 10 rad/s, the control strain was 12%, the range of the scanning temperature was 40–76 °C, and the heating rate was 2 °C/min. For each experimental run using the DSR test, two replicate specimens were measured to avoid the wrong operation or a sample preparation deviation.

## 2.4. Bending Beam Rheometer (BBR) Test

The BBR test provided a measurement of low-temperature stiffness and relaxation properties of the GF-WTB/SBS composite-modified asphalt. In order to obtain the test results in a relatively short time, according to the time-temperature equivalence principle [27], SHRP researchers increased the test temperature by 10 °C, and the same creep stiffness S-value and the stiffness change rate m-value were obtained when the sample was loaded for 60 s. According to the specification AASHTO T313-2012 [28], the heated sample was poured into BBR mold and after cooling and demolding the asphalt beam was placed in the BBR bath at test temperature for 60 min. In this study, test temperatures of -12 °C, -18 °C, and -24 °C were set and all stiffnesses and m-values were the mean of three measurements.

#### 2.5. Fourier Transform Infrared Spectroscopy (FTIR) Test

Infrared spectral analysis is one of the most widely used methods in the study of chemical structure of polymers. In this study, by comparing with the unpretreated GF particles and observing the changes in the absorption peaks of the main functional groups, characteristics of the functional groups in silane coupling agent pretreated GF particles were expected to be obtained and the surface treatment process of GF particles was expected to be further understood based on chemical changes. The FTIR (Thermo Scientific Nicolet 6700, Waltham, MA, USA) parameters were revolution 4 cm<sup>-1</sup> with a scan number of 32 times. The sample was blended with potassium bromide (KBr) with ratio of about 1:10, grinded fully, and finally tableted to thin circularity chip. Immediately, the prepared circular specimen was put into FTIR and scanned by infrared light. To avoid the wrong operation or a sample preparation deviation, for each experimental run using the FTIR test, two parallel specimens were measured.

# 2.6. Scanning Electron Microscope (SEM) Observation and Energy Dispersive Spectrometer (EDS) Analysis

SEM (Zeiss sigma 300) photographs were obtained to observe the surface morphology changes of silane coupling agent pretreated GF particles compared to the unpretreated GF particles. The SEM accelerating voltage was 15 kV and the imaging probe was SE2. The sample was scattered on the conductive glue stuck on the sample stage, sprayed with a thin layer of gold, and then put into the SEM for observation. Combined with the surface morphology observation, the elements distribution on the silane coupling agent pretreated GF particle sample surface was obtained by using the scanning function of the EDS equipped on the SEM.

## 2.7. Atomic Force Microscope (AFM)

AFM was used to examine the morphology of the matrix asphalt, SBS-modified asphalt, and GF-WTB/SBS composite-modified asphalt at the nanoscale. The asphalt sample was heated and dropped onto the microscope slide to shape the thin film. After cooling down, the AFM specimen was tested by Bruker Dimension ICON in tapping mode.

## 3. Results and Discussion

The basic technical properties of the virgin asphalt binder AH-70 are listed in Table 1.

 Table 1. Technical properties of AH-70.

Technical Index	Specification Requirement	Test Result	Experimental Method [26]
Penetration@25 °C, 100 g, 5 s (0.1 mm)	60~80	60.3	T0604
Penetration index (PI)	$-1.5 \sim 1.0$	-0.5	T0604
Ductility@15 °C, 5 cm/min (cm)	$\geq 100$	>120	T0605
Softening point (°C)	$\geq 45$	47	T0606

Te	chnical Index	Specification Requirement	Test Result	Experimental Method [26]
Rotational viscosity@135 °C (Pa·s)		-	0.571	T0625
	Mass change (%)	$\leq \pm 0.8$	0.1	T0610
RTFOT residue	Residual penetration ratio (%)	$\geq 61$	65	T0604
	Residual ductility @15 °C (cm)	$\geq 15$	21.8	T0605

Table 1. Cont.

#### 3.1. Rotational Viscosity

The effect of GF-WTB content on the rotational viscosity of a certain content (2, 3, 4, or 5 wt%) SBS-modified binders is shown in Figure 4. Figure 4 is the average of the measurement results. Three specimens of each asphalt were measured to ensure reliable test results. The maximum coefficient of variation (CV) of each asphalt sample group in the rotational viscosity test was 3.5%. As seen in Figure 4, the rotational viscosity values of a certain content SBS-modified binders increase with the GF-WTB content. The values of the 5 wt% SBS-modified binder ranged from 3.5 Pa·s for 0 wt% GF-WTB content to 3.9 Pa·s for 4 wt% content, which are both larger than 3.0 Pa·s, which is the maximum allowable value in SHRP specification considering mixing performance. Therefore, the 5 wt% SBS-modified binder was only used for the trend evaluation in the following analysis. In the figure, the maximum rotational viscosity increasing rate 17% appeared in the 4 wt% SBS-modified binder from 2.3 Pa·s for 1 wt% GF-WTB content to 2.7 Pa·s for 2 wt% content. The rotational viscosity test results will be helpful to further research for GF-WTB/SBS composite-modified asphalt mixture pavement performance.



Figure 4. Effect of GF-WTB content on rotational viscosity under certain SBS dosage.

3.2. Dynamic Rheological Properties and Temperature Sensitivity

The complex shear modulus  $G^*$  can be considered the binder sample's total resistance to deformation when repeatedly sheared. The log  $G^*$  values of the 2, 3, 4, or 5 wt% SBSmodified binders with different GF-WTB contents vs. temperatures from 40 °C to 76 °C are shown in Figure 5. Figure 5 shows that the log  $G^*$  values lineally decrease with the increase in temperature for all the asphalt samples. For the same SBS content, the log  $G^*$  value at the end temperature 76 °C increases obviously with the GF-WTB content. In addition, the sensitivity of log  $G^*$  to temperature, i.e., the regression coefficient (regression line slope), decreases with the increase in GF-WTB dosage under certain SBS content. The DSR test result analysis indicates that the addition of silane coupling agent modified GF-WTB reduces  $G^*$  temperature sensitivity of the SBS-modified asphalt and the increase in the  $G^*$  value of binder will transmit to the increase in the stiffness of respective asphalt mixture.



Figure 5. Cont.


**Figure 5.** The logarithm of the complex shear modulus of GF-WTB/SBS composite-modified asphalt: (a) SBS2 + WTBx; (b) SBS3 + WTBx; (c) SBS4 + WTBx; (d) SBS5 + WTBx.

Under the same G<sup>\*</sup> value, the smaller the phase angle  $\delta$ , which means the large elastic component and the small viscous one, the stronger the anti-rutting ability of the asphalt material. Under high-temperature conditions, the larger G<sup>\*</sup>/sin  $\delta$  indicates that G<sup>\*</sup> is larger and  $\delta$  is smaller [29]. Therefore, the rutting factor G<sup>\*</sup>/sin  $\delta$  is used to represent the anti-rutting ability in the SHRP specification. The G<sup>\*</sup>/sin  $\delta$  values of the 2, 3, 4, or 5 wt% SBS-modified binders with different GF-WTB contents vs. high temperatures 64–76 °C are shown in Figure 6. The Figure 6 shows that the G<sup>\*</sup>/sin  $\delta$  values decrease with the increase in high temperature for all the asphalt samples. Evidently, the rutting factor increases with the SBS dosage. The horizonal line in Figure 6 represents the minimum G<sup>\*</sup>/sin  $\delta$  value 1.0 kPa for the unaged binder in the performance-graded DSR specifications. Under the same SBS content, the addition of silane coupling agent modified asphalt, incorporation of 2 or 4 wt% GF-WTB elevates the high-temperature PG from 70 °C to 76 °C. The DSR test results show that GF-WTB/SBS composite-modified binders are of better resistance to deformation, anti-rutting ability, and temperature-insensitivity. Among the

composite-modified binders with 2, 3, 4 wt% SBS, in comprehensively considering the high-temperature PG, temperature sensitivity, and GF-WTB dosage, SBS4 + WTB2 is the optimal one.



Figure 6. Cont.



**Figure 6.** The rutting factor and high-temperature PG of GF-WTB/SBS composite-modified asphalt: (a) SBS2 + WTBx; (b) SBS3 + WTBx; (c) SBS4 + WTBx; (d) SBS5 + WTBx.

## 3.3. Low-Temperature Properties

In this study, BBR test temperatures of -12 °C, -18 °C, and -24 °C were set and S-values and m-values of all GF-WTB/SBS composite-modified binders are in Tables 2 and 3. Tables 2 and 3 present the average of the measurement results. Three BBR specimens of each asphalt were measured to ensure reliable test results. The maximum coefficient of variation of each asphalt sample group in the BBR test was 5.0%. Table 2 shows under -12 °C and 60 s loading conditions, with S-values and m-values of four SBS2 + WTB binders and four SBS3 + WTB binders all satisfying S  $\leq$  300 MPa and m  $\geq$  0.3 SHRP specification demands, respectively, and meeting performance-grade PG-22. In addition, for SBS3 + WTB1 and SBS3 + WTB4, the performance grades also reached PG-28 demand. Table 3 shows four SBS4 + WTB binders and four SBS5 + WTB binders that can meet performance-grade PG-34.

Table 2. BBR test results of SBS2 + WTBx and SBS3 + WTBx.

Terrer			Code of the Asphalt Binder						
(°C)	Test	SBS2 + WTB0	SBS2 + WTB1	SBS2 + WTB2	SBS2 + WTB4	SBS3 + WTB0	SBS3 + WTB1	SBS3 + WTB2	SBS3 + WTB4
	S (MPa)	175	142	160	121	121	112	106	115
-12	m	0.352	0.315	0.385	0.309	0.312	0.306	0.294	0.321
	k (×10 <sup>−4</sup> MPa <sup>−1</sup> )	20.11	22.18	24.06	25.54	25.79	27.32	27.74	27.91
	S (MPa)	368	303	208	209	187	198	171	167
-18	m	0.312	0.307	0.252	0.261	0.279	0.301	0.292	0.305
	$k (\times 10^{-4} \text{ MPa}^{-1})$	8.48	10.13	12.12	12.49	14.92	15.20	17.07	18.26
	S (MPa)	661	615	594	375	391	340	302	281
-24	m	0.240	0.257	0.250	0.259	0.273	0.265	0.290	0.295
	$k (\times 10^{-4} \text{ MPa}^{-1})$	3.63	4.18	4.21	6.91	6.98	7.79	9.60	10.50
Perfo	ormance grade	PG-22	PG-22	PG-22	PG-22	PG-22	PG-28	PG-22	PG-28

Tomm			Code of the Asphalt Binder						
(°C)	Test	SBS4 + WTB0	SBS4 + WTB1	SBS4 + WTB2	SBS4 + WTB4	SBS5 + WTB0	SBS5 + WTB1	SBS5 + WTB2	SBS5 + WTB4
	S (MPa)	116	107	106	103	96	93	91	89
-12	m	0.343	0.323	0.342	0.347	0.339	0.341	0.346	0.344
	k (×10 <sup>−4</sup> MPa <sup>−1</sup> )	29.57	30.19	32.26	33.69	35.31	36.67	38.02	38.65
	S (MPa)	145	140	132	128	119	115	111	108
-18	m	0.312	0.317	0.330	0.338	0.332	0.337	0.342	0.339
	$k (\times 10^{-4} \text{ MPa}^{-1})$	21.52	22.64	25.00	26.41	27.90	29.30	30.81	31.39
	S (MPa)	263	256	231	246	220	223	184	186
-24	m	0.306	0.311	0.302	0.331	0.325	0.333	0.301	0.313
	$k (\times 10^{-4} \text{ MPa}^{-1})$	11.63	12.15	13.07	13.46	14.77	14.93	16.36	16.83
Perfe	ormance grade	PG-34	PG-34	PG-34	PG-34	PG-34	PG-34	PG-34	PG-34

Table 3. BBR test results of SBS4 + WTBx and SBS5 + WTBx.

Relative research shows that when the low-temperature grade of PG classification is set every 6 °C, although different asphalts under the same PG low-temperature grade have the same classification standard, the difference in low-temperature performance between them cannot be reflected [30,31]. Based on the S and m indexes, a new low-temperature evaluation index k = m/S is proposed by combining the two together; that is, the creep rate of asphalt under the unit creep stiffness. It can be seen from the representation that the larger the k index, meaning small creep stiffness and large stiffness change rate, the better the low-temperature crack resistance of asphalt. The index k-values under -12 °C, -18 °C, or -24 °C vs. GF-WTB contents of certain SBS dosage-modified asphalt are shown in Figure 7 and the k-values data are in Tables 2 and 3. Figure 7 shows that k-values decrease with the test temperature decreasing for all the asphalt samples and k-value increases evidently with the SBS dosage increasing. Under the same SBS dosage, GF-WTB content elevates the k-value and the low-temperature crack resistance of SBS-modified asphalt. For SBS4 + WTB composite-modified binders under -12 °C, -18 °C, or -24 °C, from 0 to 4 wt% GF-WTB k-value increases by 13.9%, 22.7%, 15.7%, respectively, from 1 to 2 wt% GF-WTB by 6.9%, 10.4%, 7.5%, respectively, and from 2 to 4 wt% GF-WTB only by 4.4%, 5.6%, 3%, respectively. In comprehensively considering the k-value increasing rate and GF-WTB dosage, SBS4 + WTB2 is the optimal combination.



Figure 7. Cont.



**Figure 7.** Effect of GF-WTB content on BBR k-value under certain SBS dosage and temperature: (a) SBS2 + WTBx; (b) SBS3 + WTBx; (c) SBS4 + WTBx; (d) SBS5 + WTBx.

#### 3.4. Fourier Transform Infrared Spectroscopy (FTIR) Test

The silane coupling agent UP152 used in the study with the chemical name vinyltriacetoxysilane and the molecular formula  $C_8H_{12}O_6Si$  was produced by the Nanjing Upchemical company. The chemical reaction mechanism between GF-WTB and UP152 is shown in Figure 8. The UP152 Si functional groups acetoxyl -OAc hydrolyze and generate silanol Si-OH, which are unsteady and generate Si-O-Si in further polycondensation, and the carbon functional group vinyl CH<sub>2</sub>=HC- in UP152 can react with some organic functional groups in asphalt materials. Therefore, the UP152 can couple the inorganic glass fiber recycled from WTB with the organic asphalt materials.



Figure 8. Chemical reaction mechanism between GF-WTB and UP152.

The FTIR spectrograms of the untreated GF-WTB and UP152-modified GF-WTB are in Figure 9. Absorption peaks at 2929 and  $2872 \text{ cm}^{-1}$  for the original GF-WTB respectively represent C-H stretching of CH<sub>2</sub> and CH in aliphatic of the polyester resin curing agent residues, corresponding to 2954 and 2842  $\text{cm}^{-1}$  for the modified GF-WTB [32]. The original GF-WTB and the UP152-modified GF-WTB show the band corresponding to the C=O stretching of the polyester resin curing agent residues respectively at 1728 cm<sup>-1</sup> and 1720 cm<sup>-1</sup> [33]. The new absorption peaks at 1635 and 1454 cm<sup>-1</sup> for UP152-modified GF-WTB respectively characterize the carbon functional group vinyl C=C stretching and the vinyl CH<sub>2</sub> scissor bending vibration. Absorption peaks at 1091, 699, and 479 cm<sup>-1</sup> for the modified GF-WTB characterize the antisymmetric stretching, symmetric stretching, and bending vibration of Si-O-Si, with the corresponding bands 1073, 699, and 477 cm<sup>-</sup> for the original GF-WTB. The three absorption peaks all show the same trend; that is, the absorption peak of UP152-modified GF-WTB is stronger than that of original one. It shows that the chemical reaction between the coupling agent and the glass fiber surface produces new Si-O-Si bonds. The analysis of the FTIR results shows that the silicon coupling agent UP152 was successfully grafted to the surface of the recycled glass fiber from WTB.



Figure 9. FTIR spectrograms of untreated GF-WTB and UP152-modified GF-WTB.

# 3.5. Scanning Electron Microscope (SEM) Observation and Energy Dispersive Spectrometer (EDS) Analysis

The SEM photographs of the untreated GF-WTB and UP152-modified GF-WTB are shown in Figure 10. It can be seen from the figure that the surface of the original GF-WTB is smooth without any rough groove structure except for some resin curing agent residues scattered on it. After the modification of UP152, the surface of the fiber is covered with a rough graft layer of silane coupling agent and the fiber diameter also increases, indicating that the graft layer of the coupling agent UP152 has a certain thickness. Figure 11 shows the corresponding EDS element spectrum by spot scanning, and relative contents of elements are listed in Tables 4 and 5. Tables 4 and 5 show that after UP152 modification, the C element on the surface of GF-WTB increases significantly, Si and O contents decrease, and Ca element decreases significantly, indicating that the coupling agent UP152 was successfully grafted.



Figure 10. SEM photographs of the GF-WTB: (a) untreated; (b) UP152-modified.



Figure 11. EDS element spectrum of the GF-WTB: (a) untreated; (b) UP152-modified.

Table 4. Element content of untreated GF-WT	B.
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Element	Series	Weight %	Atomic %	Error %
С	К	0.36	0.67	20.36
О	Κ	38.94	54.84	9.30
Na	Κ	0.45	0.44	14.88
Mg	Κ	2.08	1.92	7.38
AĬ	Κ	7.61	6.36	4.74
Si	Κ	30.53	24.50	3.72
Κ	Κ	0.36	0.21	17.17
Ca	K	19.67	11.06	3.19

Element	Series	Weight %	Atomic %	Error %
С	К	33.31	45.25	10.20
Ν	Κ	2.27	2.65	20.96
0	Κ	34.26	34.94	9.54
Na	Κ	0.66	0.47	17.17
Mg	Κ	0.71	0.48	12.25
AĬ	Κ	1.82	1.10	6.57
Si	Κ	23.20	13.48	3.05
S	Κ	0.86	0.44	14.94
C1	Κ	0.11	0.05	23.64
K	Κ	0.28	0.12	13.49
Ca	Κ	2.52	1.03	7.85

Table 5. Element content of UP152-modified GF-WTB.

According to the FTIR, SEM, and EDS analysis of the UP152-modified GF-WTB, the coupling agent grafted fiber surface becomes thicker and rougher and introduces a vinyl functional group, which improves the adhesion of the grafted GF-WTB to the SBS-modified asphalt.

#### 3.6. Atomic Force Microscope (AFM)

Figure 12a–c show the AFM three-dimensional images of the matrix asphalt, SBSmodified asphalt (with 4 wt% SBS), and GF-WTB/SBS composite-modified asphalt (with 4 wt% SBS and 2 wt% GF-WTB), respectively. In Figure 12, the dark areas are pits and the bright areas are bumps. It can be seen from Figure 12a that the microscopic morphology of the matrix asphalt surface is relatively uniform. The surface is distributed with alternating dark and pale areas, which are close to bee-shaped structure. Research shows that these beeshaped structures are the clustering of the asphaltene micelles not completely dispersed in the dispersion medium [34]. It can be seen from Figure 12b that the surface of SBSmodified asphalt presents a network structure, which is formed by the SBS block copolymer crosslink and swelling by absorbing light components in asphalt. This network structure can effectively change the elasticity, plasticity, and ductility of asphalt, thereby improving the high- and low-temperature performance of asphalt.



Figure 12. AFM of: (a) matrix asphalt; (b) SBS-modified asphalt; (c) GF-WTB/SBS composite-modified asphalt.

From Figure 12c, the convex GF-WTB particles (white areas) can be clearly seen in the SBS-modified asphalt network structure, and the two modifiers have good compatibility. During preparation, the GF-WTB/SBS composite-modified asphalt was stirred and developed at a high temperature. Swelling, adsorption of the asphalt light components, and reaction between some organic functional groups in asphalt and the vinyl functional group on grafted GF-WTB particles surface occurred. Then, the GF-WTB agents were evenly dispersed in the SBS-modified asphalt in the form of particles and chains, and the GF-WTB/SBS composite-modified asphalt obtained better toughness and low-temperature crack resistance.

#### 4. Conclusions

In this study, composite-modified asphalt composed of silane coupling agent pretreated recycled GF from WTB and SBS-modified asphalt was investigated in terms of modification effects and mechanism. The following conclusions can be drawn from this research:

- (1) The recycled GF particles from WTB are of good heat- and humidity-resistance performance and in regular asphalt performance tests the rotational viscosity of SBSmodified binders evidently increases with the GF-WTB addition dosage under certain SBS content. In the high-temperature rheology performance DSR test, GF-WTB/SBS composite-modified binders presented better resistance to deformation, anti-rutting ability, and temperature-insensitivity.
- (2) In the low-temperature BBR test, for 4 wt% SBS content GF-WTB/SBS compositemodified binders under -24 °C, low-temperature crack resistance evaluation index k-value increased by 15.7% from 0 to 4 wt% GF-WTB dosage. Addition of GF-WTB can elevate the low-temperature crack resistance of SBS-modified asphalt.
- (3) In comprehensively considering the high-temperature PG, high-temperature sensitivity, k-value increasing rate, and GF-WTB dosage, 4 wt% SBS content with 2 wt% GF-WTB as a secondary modifier is the optimal combination.
- (4) FTIR, SEM, and EDS microscopic tests analysis shows that the GF-WTB successfully grafted by UP152 coupling agent is of thicker and rougher surface and a vinyl functional group was introduced, improving the adhesion of the GF-WTB to the SBS-modified asphalt. Silane coupling agent modification pretreatment for GF-WTB is one important and indispensable step for GF-WTB/SBS composite-modified binder preparation.
- (5) AFM observation found that SBS and GF-WTB exist in GF-WTB/SBS compositemodified asphalt in their own specific structural forms and the two modifiers have good compatibility. This compound form can better absorb asphalt light components, improve the elasticity and toughness of asphalt, and then improve high- and lowtemperature properties of asphalt.

The good asphalt properties will transmit to the pavement performance in each respective asphalt mixture. GF-WTB/SBS composite-modified asphalt anti-aging performance and its mixture pavement performance will be further researched.

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Article



## Study on the Properties and Mechanism of Recycled Aggregate/Asphalt Interface Modified by Silane Coupling Agent

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Abstract: The use of recycled concrete aggregates (RCA) instead of natural aggregates in hot-mix asphalt mixtures is one of the ways to achieve energy savings and reduce carbon emissions in road engineering. However, the cement mortar on the surface of RCA adversely affects the adhesion properties between asphalt and aggregates, leading to a reduction in the performance characteristics of asphalt mixtures. In this study, a silane coupling agent (SCA) was employed to improve the adhesion properties of the RCA/asphalt interface. The enhancement mechanism of SCA on the RCA/asphalt interface was investigated from multiple perspectives, including macroscopic properties, interfacial microstructure, and nanoscale interfacial interactions. Firstly, the adhesion behavior and tensile strength of the interface between RCA and asphalt were determined through a boiling water test and direct tensile test, both before and after SCA modification. Secondly, scanning electron microscopy (SEM) was employed to observe the surface microstructure of RCA and the microstructure of the RCA/asphalt interface. Finally, the main component of mortar, calcium silicate hydrate (C-S-H), was taken as the research subject of investigation to examine the hydrogen bonding, interaction energy, and interface transition zone of the C-S-H/asphalt interface system using the molecular dynamics methodology. The results demonstrate a two-level enhancement in the adhesion performance of the interface at the macroscopic scale following SCA modification. The interface tensile strength increased by 72.2% and 119.7% under dry and wet conditions, respectively. At the microscopic scale, it was observed that the surface pores of RCA were repaired after SCA modification, resulting in a more tightly bonded interface between the RCA and asphalt. At the nanoscale, SCA modification reduces the hydrophilicity of the C-S-H surface, increases the interaction energy and water resistance of the C-S-H/asphalt interface, and enhances the weak interface transition zone between C-S-H and asphalt. This study provides a theoretical basis for using SCA to enhance the bond strength of the RCA/asphalt interface and lays the foundation for the application of RCA asphalt mixtures on highways.

**Keywords:** silane coupling agent; recycled concrete aggregates; RCA/asphalt interface; interface reinforcement mechanism; molecular dynamic

## 1. Introduction

The amount of construction trash produced each year has increased significantly as a result of the fast urbanization and infrastructural development. However, the utilization rate of solid waste during construction is still very low [1–4]. On the other hand, mining natural aggregates can lead to irreversible ecological damage in mountainous areas, while the processing and transportation processes result in high carbon emissions, highlighting the increasingly prominent environmental and social issues [5–7]. In the context of global efforts to promote energy conservation and emission reduction, the transformation of

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resource utilization in the construction industry, which involves replacing natural sand and stone with construction solid waste, emerges as the path for the industry to achieve carbon reduction goals and upgrade development [8–10]. With the continuous improvement of construction solid waste particle-size crushing and component-sorting technology, a large amount of uniformly shaped, clean, and high-purity recycled concrete aggregate (RCA) can be obtained, and the cost of using RCA is lower than that of natural aggregates [11–14]. Therefore, the application of RCA in asphalt pavement has significant environmental value and economic benefits [15].

The primary distinction between RCA and natural aggregates is that the surface absorbs a lot of cement mortar [16,17]. According to studies, the main factor that contributes to the inadequate adhesion of asphalt and aggregates is the existence of cement mortar on the surface of RCA [18,19]. The calcium silicate hydrate (C-S-H) in the cement mortar accounts for approximately 60–70% of the hydration products, and it is the principal component and strength source of cement hydration products [20]. However, the chemical bonding between C-S-H and asphalt is weak, which can easily lead to inadequate bond strength between the mortar and asphalt. On the other hand, the mortar pores and microcracks on the surface of RCA are plentiful, and water adsorbed by capillary action is difficult to discharge under natural conditions. Because asphalt is hydrophobic, the existence of water might cause damage to the RCA/asphalt interface [21]. Therefore, in order to add the amount of RCA blending and improve the performance of hot-mix asphalt mixtures, it is necessary to address the problem of inadequate chemical bonding between RCA and asphalt, as well as water damage to the interface.

For enhancing the basic properties of materials, many scholars have chosen different modification methods [22-26]. The addition of anti-spalling chemicals into asphalt mixtures is an efficient technique to boost binding strength and improve resistance to water damage at the asphalt/aggregate interface [27-29]. At the moment, the most popular anti-spalling agent is silane coupling agent (SCA), which is widely applied to enhance the interface binding strength of organic and inorganic materials [30]. This is due mainly to the fact that its organic functional groups and hydrolyzed groups can be chemically linked with organic and inorganic materials, respectively, which helps to improve the interfacial binding strength of organic and inorganic interface materials [31]. Due to the unique nature of SCA, its application in asphalt mixtures has attracted extensive attention from researchers. Li et al. [32] investigated the effect of SCA (KH550) on the adhesion properties between acidic aggregates and asphalt. They found that SCA can act as a molecular bridge to enhance the bond strength between asphalt and acidic aggregates. Ye et al. [33] conducted an analysis on the water stability of SCA-modified asphalt with aggregates, comparing it to SBS-modified asphalt and rock-modified asphalt. The study revealed that SCA-modified asphalt exhibited superior water stability when combined with aggregates. Ran et al. [34] modified oil sludge pyrolysis residue with SCA and found that the surface of the oil sludge pyrolysis residue became rough after treatment with KH550, forming strong physical and chemical adsorption between the oil sludge pyrolysis residue and asphalt.

Currently, most research on the interface between RCA/asphalt is conducted at a macroscopic level. However, the interaction between RCA and asphalt is a complex process that is easily influenced by interactions between different molecular groups. With current experimental techniques, it is still very difficult to understand the impact of SCA modification on the interaction for the RCA/asphalt interface [35]. It is now possible to know how SCA modification affects the interaction between RCA and the asphalt interface, as molecular dynamics simulation techniques have been widely used to investigate the interaction between asphalt and aggregates. Previous studies have used molecular dynamics simulations to establish molecular models of asphalt, aggregates, and C-S-H and have studied their interactions [36,37]. Sun et al. [38] explored the impact of interface water on the structure of asphalt and the interaction energy of the asphalt/aggregate interface and discovered that the existence of interface water altered the nanostructure of the asphalt and diminished the interaction energy of the interface. Luo et al. [39] revealed that the anisotropy of aggregate surfaces significantly affects the interaction energy with asphalt and the water stability of the interface. Zhai et al. [40] investigated the effect of asphalt aging on the damage behavior of the asphalt/aggregate interface and found that asphalt aging reduced the thermodynamic properties of asphalt, such as surface free energy and cohesive energy. However, it also enhanced the adhesion strength between the asphalt/aggregate interface.

The above study primarily describes the influence of SCA modification on the interfacial performances through experimental methods. It also investigates the interaction relationship between the asphalt and aggregate using molecular dynamics. However, the influence of SCA modification on the interfacial performances and interaction relationship between RCA and asphalt has not yet been resolved. Therefore, the objective of this study is to explore the multi-scale enhancement mechanism of SCA modification on the interface between RCA and asphalt. First, at the macro-scale, the adhesion behavior and tensile strength of the interface between RCA and asphalt were determined before and after SCA modification using a boiling water test and direct tensile test. Second, on a micro-scale, the impact of SCA modification on the microstructure of the RCA/asphalt interface was observed through scanning electron microscopy. Finally, at the nanoscale, the main component of mortar, C-S-H, was taken as the research object to analyze the hydrogen bonding, interaction energy, and interface transition zone of the C-S-H/asphalt interface system using the molecular dynamics method.

#### 2. Materials and Methods

#### 2.1. Main Materials

This study utilized samples of RCA1 and RCA2 in different experimental tests. RCA1 is a cubic sample measuring  $30 \times 30 \times 30$  mm, cut from a discarded cement column. It is used to measure the interfacial bond strength in direct tensile tests. RCA2 is obtained by crushing and sieving discarded concrete blocks to obtain samples with dimensions of 13.2–19 mm. It is used in boiling water tests to determine the adhesion properties for the RCA/asphalt interface. The RCA1 and RCA2 samples in this experiment needed to be cleaned and dried before the experiment to avoid the impact of surface pollutants on the experimental results. In addition, SCA (KH-550)-modified RCA was selected to enhance the interface properties. The physical parameters of KH-550 are shown in Table 1. The No. 70 base asphalt was chosen to evaluate the interfacial behavior between RCA and asphalt. The physical parameters of the base asphalt are presented in Table 2. All abbreviations in this paper are shown in Table 3.

Table 1. Physical parameters of KH-550 coupling agent.

Physical Parameters	Units	Value	Test Standard
Boiling point	°C	73.6	ASTM D1078-11 [41]
Density	g/cm <sup>3</sup>	48.0	ASTM D4052 [42]
Refractive index ND25	—	102.2	ASTM D542-14 [43]

Table 2. Physical parameters of No. 70 asphalt binder.

Physical Parameters	Units	Value	Test Standard
Penetration (25 °C, 100 g, 5 s)	0.1 mm	73.6	ASTM D5-06 [44]
Softening point	°C	48.0	ASTM D36-06 [45]
Ductility (15 °C, 5 cm/min)	cm	102.2	ASTM D113-07 [46]

Table 3. Al	l prefixes i	n this paper.
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Prefix	Full Name
RCA	Recycled concrete aggregate
RCA1	Discarded cement column ( $30 \times 30 \times 30$ mm)
RCA2	Recycled concrete aggregate (13.2–19 mm)
C-S-H	Calcium silicate hydrate
SCA	Silane coupling agent
SEM	Scanning electron microscopy
SARA	Saturates, aromatics, resins, and asphaltenes

#### 2.2. Treatment Methods and Reaction Mechanisms

In this study, deionized water and ethanol were chosen as solvents for the hydrolysis reaction of SCA. In addition, to determine the optimal concentration of SCA, conductivity was chosen as a measure to assess the effect of concentration on the degree of SCA hydrolysis. This is because the conductivity of SCA and deionized water is very low, while the conductivity of the hydrolysis products of SCA is high. In addition, in the solution proportioning, there is no effect on the conductivity of the system because ethanol always makes up 50% of the total solution volume in the solution proportion. Therefore, the degree of hydrolysis of the SCA can be confirmed through conductivity measurements. As shown in Figure 1, the conductivity increased significantly when the SCA concentration was increased from 2% to 5%. However, as the SCA concentration continued to increase, the conductivity did not increase; instead, it showed a decreasing trend. The results indicate that the hydrolysis of SCA is highest when the concentration of SCA is 5%. Therefore, the optimal ratio of the SCA mixture solution is SCA:



Figure 1. Conductivity of SCA mixed solutions at various concentrations.

The RCA treatment method and modification mechanism are shown in Figure 2. First, the SCA mixed solution (SCA:distilled:ethanol = 5:45:50) was stirred at 60 °C for 30 min to promote the hydrolysis reaction of SCA. Then, the RCA was immersed in an SCA mixture for 30 min to ensure a sufficient reaction between the SCA and RCA. Finally, the RCA was dried at a high temperature of 160 °C for 60 min to undergo a dehydration condensation reaction. During the entire process, the methoxy group (-OCH3) in the molecular structure of SCA (KH550) can hydrolyze into the alkoxy group (-SiOH) of silanol in a mix of ethanol and water. Then, under high temperature conditions, the alkoxy group undergoes a dehydration condensation reaction with the hydroxyl group on the RCA surface to form Si-O-Si bonds [47].



Figure 2. RCA treatment method and modification mechanism.

## 2.3. Experimental Testing Methods

## 2.3.1. Boiling Water Test

The boiling water test is a commonly used method to test the adhesion performance of asphalt to aggregate surfaces and evaluate the aggregate's resistance to water stripping. According to ASTM D36-25 [48] and the Chinese boiling test, the specific steps of the experiment are as follows. First, tie the RCA with wire and place it in a 105 °C drying oven to dry. Then, immerse the dried RCA in asphalt at 140 °C for 45 s, remove it, and cool it at room temperature for 15 min. Finally, immerse it in boiling water for 3 min, remove it, and observe the degree of asphalt film peeling on the surface of the RCA to evaluate its adhesion grade according to Table 4.

Table 4. Grade of adhesion of RCA to asphalt.

The Degree of Asphalt Film Spalling on the Surface of RCA after Boiling Water Test	Adhesion Grade
The asphalt film is not damaged and there is no peeling.	5
The thickness of the RCA surface asphalt film is uneven, with a peeling area percentage of	4
less than 10%.	-
The asphalt film is generally retained on the surface of the RCA, with a peeling area	3
percentage of less than 10%. The asphalt film is partially rotained on the surface of the PCA, with a pealing area	
percentage greater than 30%.	2
The surface asphalt film of the RCA has mostly peeled off, allowing the asphalt to float on the water's surface.	1

## 2.3.2. Direct Tensile Test

The direct tensile test is a crucial method for determining the interface characteristic parameters of asphalt mixtures. This test can be used to assess the fracture performance of the asphalt mixtures. In this study, the direct tensile test was used to examine the influence of SCA modification on the bonding strength of the interface in RCA asphalt mixtures. To prepare the samples, RCA and asphalt were placed in an oven at 170 °C for approximately 30 min. Then, 1.2 g of melted asphalt was dropped onto the RCA surface and evenly spread. Another RCA was then pressed on top. Considering that water penetration into the RCA/asphalt interface may cause damage, the samples were divided into two groups. The first group was tested directly, while the second group was submerged in water for 24 h before testing. Before the experiment, the RCA was secured to the tensile device using epoxy resin adhesive. The loading rate of the tensile test equipment (CTM6001) was

set at 0.5 mm/min. The adhesion rate of asphalt on the RCA surface was determined by conducting a black and white image binarization analysis on the side of the RCA surface with less asphalt adhesion after stretching. Three sets of experiments were conducted for each experimental condition, and the average value of the three sets of experiments was calculated. If the ratio of the average value to the maximum or minimum value exceeds 10%, the investigation should be repeated.

## 2.3.3. SEM

This study utilizes SEM (Hitachi-S3400N) to observe the surface microstructure of RCA and the interface microstructure of RCA/asphalt. For the surface microstructure of RCA, RCA2 samples can be directly observed. For the RCA/asphalt interface microstructure, the intact RCA/asphalt interface was selected for observation after crushing the RCA1 samples. Then, the powder impurities generated at the interface were cleaned with anhydrous ethanol and observed after drying at room temperature (18–25 °C).

## 3. Simulation Methods

#### 3.1. Computational Models

## 3.1.1. Asphalt Model

Asphalt is a residual petroleum mixture composed of hydrocarbons, sulfur and nitrogen compounds, and their non-metallic derivatives. These molecules have significant differences in polarity and molecular weight, making it difficult to represent their composition with a single molecule. In order to understand the molecular structure of asphalt, Jennings et al. constructed an average molecular structure based on the nuclear magnetic resonance (NMR) spectra of eight asphalt samples from the Strategic Highway Research Program (SHRP) in the United States. However, these structures cannot reflect the interactions between asphalt components. Subsequently, the asphalt system was divided into four components: saturates, aromatics, resins, and asphaltenes (SARA) using the standard test method (ASTM D4124-09 [49]). Through continuous improvement, Li and Greenfield constructed three 12-component asphalt models (AAA-1, AAK-1, and AAM-1) based on the SARA components. Therefore, in this study, the AAA-1 asphalt 12-component model was selected as a representative of the matrix asphalt for research. Figure 3 shows the molecular structure of the 12-component asphalt model. Figure 4 shows the model parameters of the 12-component asphalt model.



Figure 3. Asphalt 12-component model.



Figure 4. Asphalt 12-component model parameters: (a) the number of molecules; (b) the mass fraction of asphalt component.

In this study, the density and glass transition temperature (Tg) of the asphalt model were computed to verify the accuracy of the model. In this case, the density of asphalt was calculated using the isobaric–isothermal ensemble (NPT) at 1 atm pressure. As shown in Figure 5a, when the simulation time is greater than 30 ps, the density curve of the asphalt model tends to stabilize, so we calculated the average density of the asphalt model from 50 to 100 ps. From the analysis of the asphalt density curve, it can be concluded that the density of asphalt after equilibrium at 298 K is  $1.02 \text{ g/cm}^3$ . The experimental density value of SHRP AAA-1 asphalt is  $1.01-1.04 \text{ g/cm}^3$ , which is consistent with the density of the asphalt model.



Figure 5. Physical properties of asphalt model: (a) density of asphalt; (b) glass transition temperature of asphalt.

After obtaining the asphalt density at different temperatures, the curve of asphalt specific volume (reciprocal of density) versus temperature was plotted, and linear regression analysis was performed. As shown in Figure 5b, the Tg of the asphalt is the intersection point of the two fitted lines. The Tg of the asphalt is lower than 273.15 K (0  $^{\circ}$ C), being at

269.61 K, which is consistent with previous research results [50–52]. Therefore, it can be considered that the asphalt model is reasonable.

#### 3.1.2. SCA/C-S-H Model

For cement mortar adhered to RCA surfaces, C-S-H accounts for about 60–70% of the hydration products and is the main component and strength source of the hydration products [53,54]. In this study, a C-S-H model was established based on the method proposed by Pellenq et al., as shown in Figure 6. The specific steps are as follows: (1) Tobermorite 11 was used as the initial model. After removing the water molecules of the initial model, a  $4 \times 3 \times 1$  supercell simulation was performed, and the monoclinic structure was changed to an orthorhombic one (Figure 6a); (2) To get the silicate chains to satisfy Q1 = 11.63%, Q2 = 67.44%, Q3 = 20.93%, and Ca/Si = 1.67, some SiO<sub>2</sub> groups and Si<sub>2</sub>O<sub>5</sub> groups were randomly removed from the silicate chains (Figure 6b); (3) The adsorption of water molecules to saturation was achieved using the grand canonical Monte Carlo (GCMC) method (Figure 6c); (4) To achieve equilibrium of model, the relaxation was continued under the NPT system (Figure 7d). Finally, the dimensions of the C-S-H model are 22.32 Å  $\times$  22.17 Å  $\times$  22.77 Å. The density (2.45 g/cm<sup>3</sup>) of the constructed model is close to the results obtained from previous simulations or experiments, indicating that the model is reasonably valid [55,56].



**Figure 6.** The construction of the C-S-H model (**a**) Orthogonal transformed model; (**b**) Remove some  $SiO_2$  groups and dimer structures; (**c**) Absorb water molecules through the GCMC simulation; (**d**) Relax the model until equilibrium.

Figure 7 illustrates the establishment of the SCA/C-S-H model. Firstly, the C-S-H model 2  $\times$  2  $\times$  1 supercell simulation was performed. Then, based on the SCA and cement mortar binding mechanism, the hydrolysis products of SCA were connected to the non-bridging oxygen atoms of the C-S-H matrix through Si-O-Si chemical bonding. The dimensions of the SCA/C-S-H model are 44.64 Å  $\times$  44.34 Å  $\times$  24.86 Å.



Figure 7. The SCA/C-S-H model.

3.1.3. C-S-H/Asphalt Interface Models

In this study, all simulations were performed using the Materials Studio 2020 software, and the COMPASS force field was selected to investigate the interaction mechanism of the C-S-H/asphalt interface. Taking the unmodified C-S-H model as an example, the asphalt/C-S-H interface model is shown in Figure 8a. For the placement of C-S-H and asphalt in the same simulation box, the dimensions of the C-S-H and asphalt models need to match in the x and y directions. Therefore, the asphalt model was first created with dimensions of 44.64 Å imes 44.34 Å imes 27.35 Å in the x, y, and z directions and subjected to 50,000 steps of geometry optimization. Next, the C-S-H model was expanded to a 2  $\times$  2  $\times$  1 supercell with lattice parameters: a = 44.64 Å, b = 44.34 Å, and c = 22.17 Å. Then, the C-S-H/asphalt interface model was established, and a 30 Å vacuum layer was added above the asphalt layer to eliminate periodic boundary effects. As shown in Figure 8b, based on the C-S-H/asphalt interface model, the influence of water on the interface bonding was studied by inserting a 2 Å water layer between the C-S-H and asphalt layers. Finally, each interface model was relaxed for 500 ps under the canonical (NVT) ensemble, and the interface properties were analyzed using the trajectory from the last 100 ps.



Figure 8. Interface models: (a) C-S-H/asphalt interface model; (b) C-S-H/water/asphalt interface model.

## 3.2. Simulation Calculations

#### 3.2.1. Hydrogen Bond

Hydrogen bonding is a type of intermolecular interaction force formed between a hydrogen atom and an atom with a higher electronegativity, such as F, O, or N [57,58]. In this study, hydrogen bonding indirectly characterizes the interaction between the C-S-H surface and water molecules. The conditions for hydrogen bonding formation are as follows: (1) The distance between the hydrogen atom and the acceptor atom is less than 2.5 Å; (2) The donor-hydrogen-acceptor angle is less than 90°. The molecules providing the hydrogen atom and accepting the hydrogen atom are defined as the donor and acceptor, respectively.

#### 3.2.2. Interaction Energy

The interaction energy can reflect the repulsive force and gravity of the C-S-H to the asphalt molecule [38,59]. From the molecular level, its main components include a covalent bond, van der Waals force, electrostatic electron, hydrogen bond, and so on. Here, the interaction energy can be calculated according to Equation (1).

$$E_{Asp-C-S-H} = E_{total} - (E_{Asp} + E_{C-S-H})$$

$$\tag{1}$$

where  $E_{Asp-C-S-H}$  is the interaction energy between asphalt and C - S - H;  $E_{total}$  is the total potential energy of the entire interface system;  $E_{Asp}$  is the potential energy of asphalt; and  $E_{C-S-H}$  is the potential energy of C - S - H.

## 3.2.3. Relative Concentration

The interface transition zone refers to the region where different materials meet. In the C-S-H/asphalt system, the thickness of this zone is indicative of the extent to which asphalt is adsorbed onto the C-S-H surface. This research aims to determine the thickness of the interface transition zone by examining the relative concentration of asphalt and C-S-H in the Z direction. Furthermore, the study also investigates the impact of interface water on the nanostructure of asphalt by analyzing the relative concentration changes of the asphalt SARA components in the Z direction. At the same time, combined with the difference in the content of SARA components in the Z direction, the effect of interfacial moisture on the structure of the asphalt interface is discussed.

## 4. Results and Discussions

#### 4.1. Boiling Water Test

The peeling condition of the asphalt film on the RCA surface before and after the boiling water test is shown in Figure 9. The results show that there is a significant difference in asphalt film stripping on the surface of RCA before and after SCA modification. Specifically, when the RCA is not modified by SCA, it can be observed that a large area of the asphalt film on the RCA surface peels off after the boiling water test, and the adhesion level is below grade 3 as shown in Table 4. This is because the surface of the aggregate absorbs a considerable amount of cement mortar, and there are massive pores on the surface. When a large number of pores exists on the surface of RCA, it will cause structural defects at the interface between the RCA and asphalt. During the boiling water experiment, the high temperature causes the gas inside the pores of the RCA to expand. This expansion leads to the destruction of the interface between the RCA and the asphalt, resulting in further shedding of the asphalt on the aggregate surface. This results in poor adhesion between asphalt and RCA and a weak interface transition zone. When RCA was modified by SCA, the asphalt film on the surface of RCA remained relatively intact after the boiling water experiment, and no apparent bubbles were observed in the boiling water experiment. According to Table 4, it can be concluded that the adhesion grade of the RCA asphalt mixture reached grade 5. This indicates that the SCA modification improves the interface properties of the RCA asphalt mixture.



**Figure 9.** Boiling water test: (a) unmodified RCA before the test; (b) unmodified RCA after the test; (c) SCA-modified RCA before the test; (d) SCA-modified RCA after the test.

## 4.2. Direct Tensile Strength Test

The tensile strength of the interface between the RCA and asphalt is shown in Figure 10. The results indicate that the interface tensile strength significantly increases after SCA modification under both dry and wet conditions. Under dry conditions, the interface tensile strength between RCA and asphalt without SCA modification is 97 kPa. After SCA modification, the interface tensile strength increases by 72.2%. Under wet conditions, the interface tensile strength without SCA modification decreases by 56%. After SCA modification, the interface tensile strength increases by 119.7%.



Figure 10. The tensile strength of the interface and adhesion rate of asphalt on RCA surface.

The influence of SCA modification on the interface failure types was analyzed by the interface failure forms shown in Figure 11 and the corresponding adhesion rates in Figure 10. The results showed that the adhesion rate of asphalt on the surface of RCA increased after SCA modification, changing the form of interface failure. In the unmodified RCA, the main type of interface failure was adhesion failure between the asphalt and RCA, with an adhesion rate of approximately 27.2%. However, after SCA modification, the type of interface failure was mostly cohesive failure, and the adhesion rate increased significantly to 98.4%. This is because when the adhesive force of the RCA/asphalt interface is greater than the cohesive force of asphalt itself, the asphalt undergoes cohesive failure. This indicates that SCA modification reinforces the adhesive strength of the interface, making the adhesive force more significant than the cohesive force of asphalt itself. At the same time, SCA modification also showed good performance under wet conditions, increasing the adhesion rate from 9.5% in the unmodified state to 81.2%.





**Figure 11.** The fracture surface of RCA after binarization: (**a**) no modification under dry conditions; (**b**) SCA modification under dry conditions; (**c**) no modification under moist conditions; (**d**) SCA modification under moist conditions.

#### 4.3. Microstructure Analysis

The surface microstructure of the RCA is shown in Figure 12. The results indicate that the surface porosity of the RCA is repaired after SCA modification, resulting in a tighter bond between the RCA and the interface. In terms of the surface microstructure of the RCA, without SCA modification, there are a large number of mortar pores on the RCA surface, which is the main reason for the high water absorption and poor adhesion performance of the RCA to asphalt. After SCA modification, the mortar pores of the RCA surface are significantly reduced. The reason for the reduction in surface pores of the RCA is that SCA first undergoes hydrolysis to form silanol, which then undergoes a condensation reaction with the hydroxyl groups on the cement mortar surface, resulting in the coverage of the cement mortar surface with alkyl-terminated siloxane, forming chemical adsorption.

The interface microstructure of the RCA/asphalt is shown in Figure 13. In terms of the interface structure between the RCA and asphalt, without SCA modification, the presence of a large number of pores on the RCA surface leads to defects in the RCA/asphalt interface structure. After SCA modification, the bond between the RCA and asphalt interface becomes denser. This is mainly because one end of the hydrolysis product of SCA is tightly adsorbed on the RCA surface, while the organic functional groups extend into the asphalt, tightly connecting the RCA and the asphalt. It acts as a "molecular bridge" between the RCA and asphalt interface, tightly connecting the RCA and asphalt together and improving the interface properties between the asphalt and RCA.

#### 4.4. Hydrogen Bonding Analysis

In this study, we primarily calculated the number of hydrogen bonds formed between interfacial water and the C-S-H surface to investigate the effect of SCA alteration on the hydrophilicity of the C-S-H surface. As shown in Figure 14, the hydrogen bonds at the interface mainly form between water molecules and the silicate chains, as well as between water molecules and SCA.



Figure 12. The surface microstructure of the RCA: (a,b) no modification; (c,d) SCA modification.



Figure 13. The interface microstructure of the RCA/asphalt: (a) no modification; (b) SCA modification.



Figure 14. Type of hydrogen bond: (a) water-silicate chains; (b) water-SCA (KH550).

The number of hydrogen bonds formed between C-S-H and interfacial water is shown in Figure 15. The results indicate that there are fewer hydrogen bonds between C-S-H and interfacial water after SCA modification. Specifically, unmodified C-S-H forms 213 hydrogen bonds with interfacial water. The more hydrogen bonds form between C-S-H and interfacial water, the stronger the hydrophilicity of the C-S-H surface. Due to the hydrophobic nature of asphalt, stronger hydrophilicity of the C-S-H surface leads to weaker adhesion between asphalt and the C-S-H. After SCA modification, the number of hydrogen bonds at the C-S-H interface decreases by 19.7%, indicating a decrease in the hydrophilicity of the C-S-H surface after SCA modification, thereby enhancing the interaction at the asphalt/C-S-H interface. This is mainly because the C-S-H surface is composed of silicate chains and calcium ions, which have strong hydrophilicity. After SCA modification, the distance between interfacial water and the C-S-H surface is increased, thereby reducing the formation of hydrogen bonds and decreasing the hydrophilicity of the C-S-H surface. Compared to the previous SCA-modified SiO<sub>2</sub> interface, the SCA modification can be very effective in reducing the hydrophilicity of both SiO<sub>2</sub> and C-S-H surfaces, thus improving the effect of water molecules on the aggregate/interface [60]. The results show that SCA modification has a positive effect on enhancing the water damage resistance of the aggregate/asphalt interface.



Figure 15. The number of hydrogen bonds for C-S-H/water interface.

#### 4.5. Interaction Energy Analysis

The interaction energy between C-S-H and asphalt is shown in Figure 16. The results indicate that SCA modification can increase the interaction energy of the interface under both dry and wet conditions. Under dry conditions, the interface interaction energy of the SCA modification increased by 32.1%. This increase is attributed to the ability of SCA modification to alleviate the harmful effects of Ca ions and water molecules on the C-S-H surface, thereby improving the interface decreased by 47.15%. This is primarily due to the fact that the interaction energy of the interface is mainly governed by van der Waals forces, and the presence of water at the interface increases the distance between the asphalt and

C-S-H interface, resulting in a 48.2% reduction in van der Waals forces. Consequently, the interaction energy of the interface decreases. In comparison, the SCA modification under wet conditions showed a 63.9% increase in interaction energy compared to the unmodified interface. This indicates that SCA modification can effectively enhance the water resistance of the interface. This is because SCA modification reduces the hydrophilicity of the C-S-H interface, diminishing the impact of water molecules on the interface performance and consequently increasing the interaction energy at the asphalt and C-S-H interface.



Figure 16. Interaction energy for C-S-H/asphalt interface.

## 4.6. Interface Transition Zone Analysis

The thickness of the interface transition zone and interface structure for the C-S-H/asphalt interface are shown in Figure 17. It can be seen that SCA modification has an important impact on the transition zone thickness and interface structure. For the unmodified interface, the thickness of the transition zone is 5.04 Å. This may be due to the diffusion of water molecules in C-S-H into the area near the surface of the asphalt, where the water molecules overlap with the asphalt molecules. After SCA modification, the thickness of the transition zone increased from 5.04 Å to 11.2 Å, indicating that SCA modification enhanced the attraction of the C-S-H surface to asphalt. Moreover, two distribution patterns of SCA molecular chains on the C-S-H surface can be observed at the interface structure between C-S-H and asphalt: one is parallel to the C-S-H surface, and the other is inserted into the asphalt layer. The insertion of SCA molecular chains into the asphalt layer is strongly entangled with asphalt molecules, thereby enhancing the weak interface transition zone between C-S-H and asphalt.

The influence of interface water on the asphalt nanostructure is shown in Figure 18. The results indicate that SCA modification reduces the effect of water on the relative concentration of SARA components at the interface. For the unmodified interface, interface water causes a varying degree of decrease in the relative concentration of asphalt SARA components within 0–7 Å. This is why the interaction energy between

asphalt and C-S-H decreases when interface water exists. Within the distance of 7–15 Å, the relative concentration of asphaltene, aromatics, and resins increases, indicating that the addition of water molecules causes the asphalt components at the interface to aggregate towards the center, also demonstrating the hydrophobicity of asphalt. After SCA modification, the relative concentration of resins and aromatics at the interface within 0–5 Å remains basically unchanged, while the concentration of saturates slightly increases. It is noting that the relative concentration of asphaltene increases at 4–8 Å and forms a peak. This indicates that after SCA modification, the interface structure of SARA components can remain relatively stable even under the action of water, thereby increasing the resistance to water damage between C-S-H and asphalt.



**Figure 17.** Interface transition zone thickness and interface structure for C-S-H/asphalt interfaces: (a) C-S-H/asphalt interface zone thickness; (b) C-S-H/SCA/asphalt interface transition zone thickness; (c) C-S-H/asphalt interface structure; (d) C-S-H/SCA/asphalt interface structure.



**Figure 18.** The concentration profiles of SARA components: (a) C-S-H/water/asphalt model; (b) C-S-H/SCA/water/asphalt model.

## 5. Conclusions

Based on macroscopic experiments, microscopic structure observation, and molecular dynamics simulation, this study examined the enhancement effect of SCA modification on the interface performance of RCA and asphalt before and after modification and investigates its underlying mechanism for enhancement. The following findings were made.

The results of the boiling water experiment and direct tensile experiment indicate that SCA modification significantly improves the interface behavior between RCA and asphalt. The bond between SCA-modified RCA and asphalt is enhanced by two grades, and the tensile strength goes up by 72.2% in dry conditions and 119.7% in wet conditions.

The observation results of SEM show that SCA modification effectively improves the interface structure defects between RCA and asphalt. Before SCA modification, there are numerous pores on the surface of RCA, resulting in structural defects between the RCA and asphalt interface. After SCA modification, a dense film is formed on the surface of the RCA, effectively filling the pores of the RCA surface mortar and creating a more compact bond at the RCA/asphalt interface.

The results of the molecular dynamics simulations indicate that SCA modification reduces the number of hydrogen bonds formed between C-S-H and water molecules, thereby decreasing the hydrophilicity of the C-S-H surface. SCA modification also improves the interaction energy and water resistance of C-S-H with asphalt. Additionally, SCA molecules can penetrate the asphalt layer to create a dense interfacial transition zone between C-S-H and asphalt. This makes the two substances work better together and reduces the effect of water on the nanoscale structure of the asphalt interface.

The study findings help us understand the mechanisms of interfacial interactions between asphalt and modified aggregate surfaces and develop more effective interface modifications. In addition, it lays the foundation for the application of RCA/asphalt mixtures on road surfaces and for improving the road performance of asphalt mixtures. Future research can consider the influence of SCA modification on the interactions between different interfaces, such as SIO<sub>2</sub>/asphalt, CaCO<sub>3</sub>/asphalt, etc. The interaction mechanism of SCA modification on RCA/asphalt interface is explained from a more comprehensive perspective.

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## Article Laboratory Investigation of the Composite Influence of Rock Asphalt and Montmorillonite on the Performance of Bio-Asphalt

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Abstract: To improve the rutting resistance and anti-aging performance of bio-asphalt, the composite modifier of rock asphalt and montmorillonite is used to modify the bio-asphalt. The optimum content of each component was determined by orthogonal tests based on the results from penetration, softening point, ductility and viscosity tests. The rheological properties and anti-aging performance of rock asphalt and montmorillonite composite-modified bio-asphalt (RAMB) with the optimum content were evaluated as compared to those of matrix asphalt (MA), untreated/treated bio-asphalt (UBA/TBA) and rock asphalt-/montmorillonite-modified bio-asphalt (RMB/MMB). The test results illustrated that the optimum content of each component in the rock asphalt/montmorillonite composite-modified bio-asphalt—as determined by orthogonal experimental design and penetration, softening point, ductility and viscosity tests—was 7% bio-oil treated by thermostatic water bath, 5% rock asphalt and 30% montmorillonite. The high-temperature performance, low-temperature performance and anti-aging performance of RAMB were studied by comparison to those of matrix asphalt, UBA, TBA, RMB and MMB. Additionally, the composite modification mechanism was studied by Fourier transform infrared spectroscopy (FTIR). The results suggested that the high-temperature of TBA was obviously improved compared with UBA. The reason, as seen from infrared spectrum tests, was that the amount of ester compounds decreased after water bath treatment. The light components and soluble substances in bio-oil decreased. Compared to UBA, the unrecoverable creep compliance (Jnr) of RAMB decreased by 66.6% and the recovery rate (R) increased by 75.9% at 0.1 KPa. The stiffness modulus (S) of RAMB was 0.87 times that of matrix asphalt and the creep rate (m) was 1.03 times that of base asphalt. Compared to single-modified asphalt, the high- and low-temperature performance of RAMB was good. Meanwhile, the complex modulus aging index (CMAI) and stiffness modulus aging index (SAI) of RAMB were lower than all other asphalt studied, while the phase angle aging index (PAAI) and creep rate aging index (mAI) of RAMB were the largest. The results of infrared spectroscopy also suggest that the mixing of rock asphalt, montmorillonite, bio-oil and matrix asphalt is a physical blending process. During the process, no functional groups are formed. Pretreatment and addition of rock asphalt and montmorillonite can improve high-temperature performance, low-temperature performance and anti-aging performance of the bio-asphalt.

**Keywords:** bio-asphalt; composite modification; rheological performance; anti-aging; modification mechanism

## 1. Introduction

The development of road networks plays an important role in the national economy. Petroleum asphalt is rapidly consumed with the quick development of road networks. There is a desperate shortage of petroleum asphalt. To ensure good road performance, the development of economically- and environmentally-friendly alternative materials is highly significant. Bio-asphalt is considered the alternative material with the most potential.

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**Copyright:** © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). However, the high-temperature performance and anti-aging performance of existing bioasphalt are seriously insufficient.

According to research findings, bio-oil can replace a portion of petroleum asphalt [1]. The production cost of bio-asphalt is about  $3/10 \sim 2/5$  of that of petroleum asphalt. Bioasphalt shows reasonable economic and environmental performance [2]. Road workers have performed plenty of tests on the preparation technology, chemical composition, modification mechanism, physicochemical properties and road performance of waste cooking oil bio-asphalt [3-6]. Waste cooking oil contains high amounts of water and volatile substances. This limits the incorporation of waste cooking oil into bio-asphalt. Compared to petroleum asphalt, bio-oil contains hundreds of oxygenated compounds. Its moisture content and oxygen content are higher. Therefore, bio-oil is unstable and the aging rate of bio-oil accelerates with increasing temperature [7,8]. Wang et al. found that the presence of moisture and volatile substances may lead to delamination of bio-oil. Thus, the bio-oil was distilled at 110 °C before being added to asphalt [9]. Zhang et al. treated bio-oil with distilled water at 50 °C, which can remove polar light components in bio-oil [10]. Yang et al. removed water from bio-oil before addition to petroleum asphalt [11]. The mixture's physical properties were tested, such as pH value and water content. Ruikun et al. removed the water in the waste cooking oil [12]. Waste cooking oil- and pre-desulfurization rubber powder-modified asphalt were obtained. The results of Maharaj et al. showed that the anti-fatigue of the mixture was improved with the introduction of waste cooking oil [13]. The bio-asphalt mixture has good low-temperature performance and water stability. Conversely, high-temperature performance and anti-aging performance are poor [4,14,15].

To improve the high-temperature performance of bio-asphalt, Yang et al. added 4% polyethylene and found that the rutting resistance was improved [16]. Sun et al. added SBS to bio-asphalt to improve the high-temperature performance. They found that the activation energy of SBS-modified asphalt was reduced by adding bio-oil. SBS-modified asphalt containing bio-oil had a low viscosity value. Bio-oil can lower the high-temperature rutting resistance [17]. The nitrogen and asphaltene content were much higher in rock asphalt compared to matrix asphalt. As such, rock asphalt-modified asphalt showed good high-temperature performance. Lv et al. found that the high-temperature performance of matrix asphalt was improved by rock asphalt because asphaltenes and gums were increased [18-20]. Menglan et al. prepared composite-modified asphalt by adding European rock asphalt and castor oil bio-asphalt. The addition of composite modifier was in the range of 20–30%. The high-temperature and anti-aging properties of asphalt were upgraded by adding composite modifier. The low-temperature properties and temperature sensitivity of asphalt were also improved. Different performance requirements can be met by adjusting the upper and lower limits of the content. Rock asphalt played a significant role as a high temperature modifier [21]. Yu et al. carried out X-ray diffraction and found that montmorillonite-modified asphalt could form an intercalated structure, while organic montmorillonite-modified asphalt could form an exfoliated structure. This improved the thermal oxidation aging resistance and ultraviolet aging resistance of asphalt [22]. Fen Ye and Vargas performed dynamic shear rheological tests (DSR). Organic montmorillonitemodified asphalt showed better anti-aging performance and high-temperature performance [23,24]. The temperature sensitivity was reduced. Lu compared the effects of nano-montmorillonite and naphthenic oil on SBS-modified asphalt. They found that nano-montmorillonite reduced the low-temperature performance and high-temperature viscosity [25]. To improve the viscosity and high-temperature stability of bio-asphalt, Siqing Liu [26] added hard asphalt particles, C5 petroleum resin, organic montmorillonite and styrene-butadiene rubber to bio-asphalt. According to research findings, the modified bio-asphalt with the best modifier ratio was still soft (penetration was 123 (0.1 mm)). The high-temperature performance was not ideal. The addition of crosslinking agent, anti-aging agent and dispersant improved the high-temperature stability, anti-aging performance and storage stability of the asphalt. Nevertheless, this is difficult to use in engineering applications due to the complex preparation process and many kinds of modified substances and

additives. Therefore, further work is needed to improve the high-temperature performance and anti-aging performance of bio-asphalt.

Therefore, this paper employed pretreatment measures. Organic montmorillonite and rock asphalt were selected to modify bio-asphalt. Organic montmorillonite can form stripping structure and improve the anti-aging performance of asphalt. Asphaltene and colloid content in asphalt were increased and the high-temperature performance of asphalt was improved because of the addition of rock asphalt. The rheological properties and anti-aging of modified asphalt were analyzed. The mechanism of composite modification was revealed by FTIR. This provided a basis for improving the performance of waste cooking oil bio-asphalt. A technology roadmap was established, as shown in Figure 1.



Figure 1. Test flow chart.

#### 2. Materials and Methods

2.1. Materials

2.1.1. Asphalt

No.70 matrix asphalt was used in this paper. The basic performance was measured by "Standard Test Methods of Asphalt and Bituminous Mixtures for Highway Engineering, JTG E20-2011" [27]. The experimental results are listed in Table 1. According to the "Technical Specifications for Construction of Highway Asphalt Pavement, JTG F40-2004" [28], all indicators of No.70 asphalt are within the range of specification requirements.

Table 1. Basic properties of asphalt.

Pro	oject	Unit	Demand	Result	Test Method
Penetration (2	5 °C, 100 g, 5 s)	0.1 mm	60~80	67.6	T 0604-2011
Ductility (10	°C, 5 cm/min)	cm	$\geq 10$	13.5	T 0605-2011
Softening point (rin	ng and ball method)	°C	$\geq 46$	48.5	T 0606-2011
Penetrat	ion index		$-1.5 \sim +1.0$	-0.78	T 0604-2011
Density		g/cm <sup>3</sup>	Measured	1.027	T 0603-2011
60 °C Dyna	mic viscosity	Pa·s	$\geq 180$	272	T 0620-2000
Flash	point	°C	$\geq 260$	294	T 0611-2011
	Mass change rate	%	$\pm 0.8$	-0.083	T 0610-2011
After RTFOT	Residual penetration ratio	%	$\geq 61$	81	T 0604-2011
	Residual ductility (10 °C)	cm	$\geq 6$	7	T 0605-2011

## 2.1.2. Bio-Oil

The bio-oil came from waste cooking oil. It was a by-product obtained in the production of biodiesel. The basic properties are shown in Table 2. Compared to the values in Table 1, the density and viscosity are less than the matrix asphalt and the acid value is larger.

## Table 2. Basic properties of bio-oil.

Project	Unit	Index	Test Method
Density	g/mL	0.92~0.95	GB/T 2540
Water content	%	$\leq 0.3$	SH/T 0264
60 °C Dynamic viscosity	Pa⋅s	0.126	GB/T 265
Acid value	mg KOH/g	30~60	SH/T 264

#### 2.1.3. Buton Rock Asphalt

Buton rock asphalt was used, which contains 24.8% asphalt, 74.9% ash and some impurities. After being ground and passed through a 0.15 mm standard sieve, the rock asphalt particles could be used as modifiers. Table 3 lists some indexes of rock asphalt.

Table 3. Technical indexes of rock asphalt.

Project	Unit	Demand	Result	Test Method
Trichloroethylene Solubility	%	≥18	26.65	T0607
Density	g/cm <sup>3</sup>	$\leq 1.9$	1.71	T0603
Heating loss	%	$\leq 2.0$	0.27	T0608
Flash point	°C	≥230	318	T0611

## 2.1.4. Montmorillonite

Montmorillonite is a good asphalt modifier to improve aging resistance. The montmorillonite in this paper was purchased from China Zhejiang Feng Hong clay chemical plant. The montmorillonite was modified with organic quaternary ammonium salt. As a cationic surfactant, organic quaternary ammonium salt reduced the surface energy of montmorillonite by exchanging interlayer cations of montmorillonite. Thus, the dispersion of organic nano-montmorillonite in asphalt was significantly improved compared to montmorillonite without organic treatment. In addition, organic nano-montmorillonite also has the advantages of large layer spacing, good dispersion and large cation exchange capacity. Some performance indexes of montmorillonite are summarized in Table 4.

Table 4. Basic performance of OMMT.

Project	Unit	Result	Test Method
Density	g·cm <sup>−3</sup>	1.02	ASTM D854-14
Granularity	Mesh	5000	GB/T 2922
Coefficient of expansion	/	0.05	GB/T 50123-2019
Hardness	/	1.02	-
Montmorillonite content	%	>99	GB/T 17188-2016
Specific surface area	$m^2 \cdot g^{-1}$	750	-
Diameter thickness ratio	Ĭ	200	-

2.1.5. Preparation of Rock Asphalt and Montmorillonite Composite-Modified Bio-Asphalt (RAMB)

The distilled water and bio-oil were mixed in a mass ratio of 1:1 and placed in a bath at 50  $^{\circ}$ C for 10 min. The upper bio-oil was then taken out. Figure 2 shows the bio-oil before and after treatment. The matrix asphalt was heated at 135  $^{\circ}$ C for 1 h in an oven. When it

reached the molten state, the asphalt was taken out and then quickly heated and insulated on the electric furnace. The high-speed shear instrument was turned on and set to a speed of 1000 r/min. Next, 7% bio-oil (mass ratio of bio-oil to matrix asphalt) was added and the rotation speed was adjusted to 3000 r/min; the asphalt was sheared at 150~160 °C for 30 min. At this point, bio-asphalt preparation was complete. Next, 30% montmorillonite (mass ratio of montmorillonite to the matrix asphalt and bio-oil) was added and the mixture was sheared for 60 min. A small amount of 5% of the rock asphalt (mass ratio of rock asphalt to the matrix asphalt and bio-oil) was added after passing through a 0.15 mm standard sieve. This was poured into the asphalt several times and mixed manually while adding. After all rock asphalt was added, this was sheared for 30 min. Rock asphalt swelled and developed with volume expansion. When the rock asphalt particles were dissolved and the surface of the modified asphalt presented a mirror effect, the preparation of RAMB was finished.



Figure 2. Pretreatment of bio-oil. (a) Mixing of water and oil; (b) Bio-oil before and after treatment.

## 2.1.6. Proportion Optimization of RAMB

The orthogonal design method of four factors at three different levels was used to determine the mass ratio of water and bio-oil in RAMB and the optimal content of each material. The influence of bio-oil content, the mass ratio of water and bio-oil and the content of rock asphalt and montmorillonite on penetration, ductility, softening point and rotational viscosity of asphalt was considered. Three levels were set for each factor, as shown in Table 5. According to the orthogonal design table of L9(34) (as shown in Table 6), nine asphalts with different content combinations were prepared and tested.

	Factor				
Level	Mass Ratio of Water and Bio-Oil	Content of Bio-Oil (%)	Content of Rock Asphalt (%)	Content of Montmorillonite (%)	
1	1:1	5	20	3	
2	2:1	7	30	5	
3	3:1	9	40	7	

Table 5. Factors and levels.
Number	Mass Ratio of Water and Bio-Oil	Content of Bio-Oil (%)	Content of Rock Asphalt (%)	Content of Montmorillonite (%)	Orthogonal Combinations
1	1:1	5	20	3	$A_1B_1C_1D_1$
2	1:1	7	30	5	$A_1B_2C_2D_2$
3	1:1	9	40	7	$A_1B_3C_3D_3$
4	2:1	5	30	7	$A_2B_1C_2D_3$
5	2:1	7	40	3	$A_2B_2C_3D_1$
6	2:1	9	20	5	$A_2B_3C_1D_2$
7	3:1	5	40	5	$A_3B_1C_3D_2$
8	3:1	7	20	7	$A_3B_2C_1D_3$
9	3:1	9	30	3	$A_3B_3C_2D_1$

Table 6. Combinations of orthogonal test L9(34).

Table 7 lists the orthogonal test results. The penetration of the matrix asphalt was 67.6 (0.1 mm) and the softening point was 48.5 °C in this paper. The penetration values of No.6, No.8 and No.9 were far larger than matrix asphalt. Additionally, the softening point was slightly lower than that of matrix asphalt. This indicates that the high-temperature performance of these three combinations was poor. Improving the high-temperature performance of bio-asphalt was the main purpose of this paper but these three combinations could not meet the requirements. After these three combinations were eliminated, the remaining six combinations were selected by Technique for Order Preference by Similarity to Ideal Solution (TOPSIS) in multi-objective decision-making. The decision matrix was a  $6 \times 4$  matrix [29,30].

Table 7. Basic properties of orthogonal test.

Combinations	Penetration (0.1 mm)	Softening Point (°C)	Ductility at 10 °C (mm)	Rotational Viscosity at 135 °C (Pa·s)
1	59.47	52.2	116.5	0.690
2	63.77	50.6	152.8	0.805
3	62.4	51.3	101.3	0.965
4	52.63	52.7	95.5	0.955
5	62.83	53.3	99.5	0.940
6	95.9	47.6	304.2	0.640
7	57.23	51.4	132.1	0.935
8	81.1	48.3	183.2	0.755
9	83.67	47.8	288.8	0.715

Table 8 lists the ranking results of TOPSIS. According to the table, the second combination was a suitable preparation method for RAMB. In this method, the mass ratio of water and bio-oil was 1:1, the content of bio-oil was 7%, the content of rock asphalt was 30% and the content of montmorillonite was 5%. Note: Di<sup>+</sup> presents the distance between each combination and positive ideal solution; Di<sup>-</sup> presents the distance between each combination and negative ideal solution; CI presents approaching index.

Table 8. Results of TOPS
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Combination	Di <sup>+</sup>	$Di^-$	CI	Sort
1	0.105575933	0.044310354	0.29562647	4
2	0.08704551	0.047591609	0.353480599	1
3	0.114158233	0.03963836	0.257732365	5
4	0.115642707	0.058291842	0.335136648	3
5	0.115200269	0.039523716	0.255446599	6
7	0.058596286	0.115635936	0.352389578	2

# 2.2. Methods

To prove the performance of RAMB, six asphalts were prepared, including matrix asphalt, untreated bio-asphalt, treated bio-asphalt, rock asphalt-modified bio-asphalt, montmorillonite-modified bio-asphalt and RAMB. When carrying out different tests, parallel samples of each asphalt were prepared. The repeatability error value according to the specification requirements were determined, to ensure the reliability of the experiment. By comparing a series of experimental indicators, the road performance of RAMB was analyzed. Specific tests and indicators are described as follows.

# 2.2.1. Dynamic Shear Rheological Test (DSR)

# Frequency Scanning Test (FS)

The dynamic shear rheological test is one of the most important tests in the American Strategic Highway Research Program (SHRP). This test shears asphalt using the reciprocating motion of oscillating plates parallel to fixed plates. Wheel movement on a road surface is simulated at 55 miles per hour. Due to the viscoelastic properties of asphalt, strain (stress) delayed response occurs under the action of shear stress (strain). The basic principle of the dynamic shear rheometer is shown in Figure 3.





The frequency scanning test of unaged asphalt was carried out. The changes in hightemperature rheological parameters of asphalt at different frequencies were revealed. The test temperature was 58 °C. The frequency range was 0~100 Hz. The measurement was carried out from high frequency to low frequency and 31 data points were recorded. The temperature scanning test of unaged, short-term aging and long-term aging asphalt were used to evaluate the anti-aging properties of asphalt. The test angular frequency was 10 rad/s (that is, a constant frequency of 1.59 Hz). There were four temperatures which ranged from 46 °C to 60 °C, with every 6 °C as a temperature interval. A 25 mm oscillating plate was used for the unaged and short-term aging asphalt. The gap between the two parallel plates was 1 mm. The parallel plate was replaced with an 8 mm oscillating plate for the long-term aging asphalt. The gap between the two parallel plates was 2 mm. The differences were used because the long-term aging asphalt was harder than the unaged and short-term aging asphalt. The angle phase ( $\delta$ ) and complex modulus (G\*) of asphalt were obtained and the rutting factor was calculated.

# Multiple Stress Creep Recovery Test (MSCR)

MSCR test of the short-term aging asphalt was carried out at 58 °C. The asphalt was subjected to 30 creep recovery cycles at two constant stress levels of 0.1 KPa and 3.2 KPa. The creep occurred for 1 s and the recovery process lasted for 9 s. According to

Equations (1)–(3), the R and  $J_{nr}$  values of asphalt at 0.1 KPa and 3.2 KPa were calculated. The elastic recovery ability and high-temperature rutting resistance of asphalt were evaluated.

$$J_{\rm nr}(0.1) = \frac{\varepsilon_r - \varepsilon_0}{0.1}$$
(1)

$$J_{nr}(3.2) = \frac{\varepsilon_r - \varepsilon_0}{3.2} \tag{2}$$

$$R = \frac{(\varepsilon_1 - \varepsilon_{10}) \times 100}{\varepsilon_1}$$
(3)

## 2.2.2. Bending Beam Rheological Test (BBR)

The S and m values of asphalt were measured by BBR test, as shown in Figure 4. These two low-temperature rheological indexes are closely related to the low-temperature performance of asphalt. SHRP states that the S value of asphalt should not exceed 300 MPa and the m value of asphalt should not be less than 0.3. BBR tests of the unaged asphalt, short-term aging asphalt and long-term aging asphalt were carried out. The low-temperature performance of asphalt and the effect of aging on the low-temperature performance of asphalt and the effect of aging on the low-temperature performance of asphalt were revealed. An asphalt specimen with a size of 127 mm × 12 mm × 6.35 mm was formed in a cuboid mold without cover. Then, the constant load of 980 mN  $\pm$  50 mN was continuously applied to the simply supported beam at -18 °C for 240 s. The deformation and load of specimens were recorded at 8.0 s, 15.0 s, 30.0 s, 60.0 s, 120.0 s and 240.0 s. The S and m values at 60.0 s were acquired as evaluation indexes of the bending beam rheometer test.



Figure 4. Schematic figure of the bending beam rheometer.

## 2.2.3. Aging of Asphalt

Asphalt ages under high-temperature and it oxidizes during preparation and mixing with aggregate. Laboratories usually use film oven or rotating thin film oven test under standard conditions to simulate the process of aging. In this study, asphalt underwent short-term aging by the rotating thin film oven test. The asphalt after short-term aging was used for further long-term aging and conducted mechanism tests. Each aging bottle was filled with  $35 \pm 0.5$  g asphalt. A group of 8 aging bottles was placed on the annular supports of the rotating thin film oven. The asphalt was aged for 85 min at 163 °C.

Pressure Aging Vessel-accelerated asphalt aging test (PAV) is a method to simulate the long-term aging of asphalt during service. In this method, asphalt aged by rotating thin film oven was separately divided into PAV sample plates. The quantity of short-term aging asphalt in each sample plate was  $50 \pm 0.5$  g, to form about 3.2 mm-thick asphalt film. Then, the plate was kept at 100 °C and 2.1 MPa for 20 h to accelerate the aging process in a constant-temperature and constant-pressure vessel.

# 2.2.4. Fourier Transform Infrared Spectroscopy Test (FTIR)

To obtain information about functional groups, FTIR was carried out. The effects of the pretreatment of distilled water and the addition of rock asphalt and montmorillonite on the chemical composition of bio-oil were studied. The infrared spectroscope was Thermo Scientific Nicolet iS50 FT-IR. Solid asphalt and solid powder modifiers (rock asphalt and montmorillonite) were directly measured at room temperature without sample preparation. For solid asphalt, such as the liquid bio-oil at room temperature in this study, the method of sample preparation was with potassium bromide pellets. The infrared spectral curve was collected for liquid asphalt. Because potassium bromide had no absorption peak in the infrared band, it showed a blank spectrum. The spectral curve of the sample shows that the band range is  $4000-500 \text{ cm}^{-1}$  and the number of scans is 32 [27].

# 3. Results

# 3.1. Rheological Properties

3.1.1. High-Temperature Rheological Properties FS

FS tests were carried out at different frequencies by oscillatory shear strain. They revealed the effect of loading frequency on the viscoelastic properties of RAMB. Figure 5 lists the G<sup>\*</sup> and  $\delta$  values of six asphalts at different frequencies.



Figure 5. Graph of the G\* and  $\delta$  values of six asphalts at 58 °C.

The composite shear modulus, G\*, characterizes the resistance value of the asphalt material during repeated deformation in shear.  $\delta$  represents the hysteresis of the stress relative to the stress.  $G^*$  and  $\delta$  together represent the viscoelastic properties of the asphalt: the larger the  $\delta$  value, the closer the asphalt is to a viscous body, while the smaller the  $\delta$ value, the closer the asphalt is to an elastomer, meaning the asphalt is more resistant to deformation at high temperatures. The G\* value of the six asphalts gradually increased and the  $\delta$  value decreased with the increase in frequency. Compared to matrix asphalt, the G<sup>\*</sup> value of bio-asphalt was significantly reduced and the  $\delta$  value improved. The lack of hightemperature performance can be attributed to bio-oil containing lots of free fatty acids. Free fatty acids are introduced when bio-oil replaces part of the matrix asphalt. This is one of the reasons for the poor rutting resistance of bio-asphalt [31]. Compared to the G\* value and  $\delta$ values of untreated bio-asphalt, treated bio-asphalt, rock asphalt-modified bio-asphalt and montmorillonite-modified bio-asphalt, pretreatment, rock asphalt and montmorillonite improved the G<sup>\*</sup> value of bio-asphalt. The  $\delta$  value of bio-asphalt was also reduced. The modification effect of rock asphalt was most obvious. The G\* value of RAMB was greater than the matrix asphalt. The  $\delta$  value was lower than the matrix asphalt. Thus, pretreatment, rock asphalt and montmorillonite comprehensively increase the elastic component, the G\* value and the high-temperature rutting of bio-asphalt. G\* values are sorted as follows: RAMB > matrix asphalt > rock asphalt-modified bio-asphalt > montmorillonite-modified bio-asphalt > treated bio-asphalt > untreated bio-asphalt.

## MSCR

The shear strain of the six asphalts is shown in Figure 6. The strain of asphalt under 0.1 KPa was small and the difference between different asphalts was also small. However, the strain of asphalt sharply increased under 3.2 KPa. The growth rate showed a significant difference. The untreated bio-asphalt exhibited a large deformation under the action of load. The shear strain increased rapidly with the repeated loading. The pretreatment and single modifier reduced the shear strain of bio-asphalt, but the effect was not as good as that of rock asphalt–montmorillonite materials composite-modified bio-asphalt.



Figure 6. Shear strain figure of six asphalts at 58 °C.

 $J_{nr}$  can reflect the permanent deformation resistance of asphalt: the smaller the value, the higher the deformation resistance of the asphalt at high temperatures. R can represent the elastic component of the asphalt: the larger the value, the more elastic the asphalt.  $J_{nr}$  and R values of six asphalts at 0.1 KPa and 3.2 KPa are shown in Figures 7 and 8. Shown here, bio-asphalt had the lowest R value and the highest  $J_{nr}$  value among the six asphalts. Bio-asphalt had a large shear deformation under the action of stress. The plastic deformation was the main part, with only a small portion of elastic deformation. The R value of montmorillonite-modified bio-asphalt, treated bio-asphalt and untreated bio-asphalt became negative under 3.2 KPa because the high-temperature performance of the three kinds of asphalt at 58 °C was insufficient in the nonlinear viscoelastic range. The order of R values of the 6 groups of asphalt samples was RAMB > MA >RMB > MMB > TBA > UBA. The RAMB had the minimum  $J_{nr}$  value and the maximum R value. Compared to the untreated bio-asphalt, the  $J_{nr}$  value decreased by 66.6% and the R value increased by 75.9% under 0.1 KPa. The improvement effect of the three measures on the high-temperature rutting resistance is significant. This is consistent with the above frequency scanning results.



Figure 7. R value of different asphalts.



Figure 8. Jnr value of different asphalts.

3.1.2. Low-Temperature Rheological Test

S value reflects the resistance of asphalt binder to load, while m value reflects the rate of change in asphalt stiffness with time. Specifications require S < 300 MPa and m > 0.3; additionally, a smaller S value and a larger m value lead to better low-temperature rheological properties. The S and m values of the six unaged asphalts at -18 °C are shown in Figure 9. As shown in Figure 9, untreated bio-asphalt had the lowest S value and the largest m value among the six asphalts. The low-temperature performance was good. The bio-asphalt had satisfactory performance in terms of low-temperature deformation resistance because of the significant softening effect of bio-oil. The low-temperature performance of RAMB was lower than that of bio-asphalt, but the S value was less than 300 MPa at -18 °C and them value was greater than 0.3. The requirements of SHRP for low-temperature performance of asphalt binder were met. The S value was 0.87 times that of matrix asphalt and the m value was 1.03 times that of matrix asphalt. Its low-temperature rheology energy was better than matrix asphalt.



Figure 9. S and m of six asphalts at -18 °C.

# 3.2. Anti-Aging Performance

3.2.1. Anti-Aging Performance of RAMB Based on High-Temperature Rheological Performance

The dynamic shear rheological test was performed on the short-term and long-term aging of asphalt and the  $\delta$  and G<sup>\*</sup> values were obtained to calculate the aging index. The rutting indexes for the six asphalts were measured at different temperatures and three aging states (no aging, short-term aging and long-term aging), as shown in Figure 10. The G<sup>\*</sup> value of three of the aging asphalts decreased and the  $\delta$  value increased as the temperature increased. The high temperature increases the mobility of the asphalt and reduces the anti-deforming capability. The G<sup>\*</sup> value of all asphalts increased and the  $\delta$  value gradually decreased with aging at constant temperature. The physical hardening effect caused by aging favors the anti-deforming capability of asphalt. The rutting indexes of matrix asphalt, rock asphalt-modified bio-asphalt and RAMB met the requirements. RAMB had the highest G<sup>\*</sup> value and the lowest  $\delta$  value. The rutting index of the original asphalt was 2.60 times that of the untreated bio-asphalt and 1.12 times that of the matrix asphalt at 64 °C. The rutting index of the short-term aging asphalt at 64 °C was 2.36 times that of the untreated bio-asphalt and the matrix asphalt.

The aging resistance of asphalt was evaluated by calculating CMAI and PAAI using Equations (4) and (5). With smaller CMAI, larger PAAI indicates better aging resistance.

$$CMAI = \frac{Complex modulus of short or long term aging asphalt}{Complex modulus of original asphalt}$$
(4)

$$PAAI = \frac{Phase angle of short or long term aging asphalt}{Phase angle of original asphalt}$$
(5)

The changes in CMAI and PAAI after short- and long-term aging of the six asphalts are shown in Figures 11 and 12. As seen from Figures 11 and 12, untreated bio-asphalt had the largest CMAI and the smallest PAAI in the range of 46 °C to 64 °C. This indicates that untreated bio-asphalt has poor aging resistance and the high-temperature rheological properties are greatly affected by aging because there are many light components in bio-asphalt. The volatilization of light components leads to the change in high-temperature performance of asphalt. The CMAI and PAAI of treated bio-asphalt were improved, compared to untreated bio-asphalt. The pretreatment of distilled water reduced the introduction of light components in matrix asphalt by removing the light components in bio-oil. Thus, the volatilization of light components in bio-asphalt was reduced during the aging. The addition of rock asphalt and montmorillonite reduced the CMAI and increased the PAAI of bio-asphalt. The performance of rock asphalt demonstrated little change under the influence of aging, meaning it can bear rutting deformation under high temperature by serving as the hard particles in bio-asphalt. Montmorillonite within the layered structure reduces the volatilization of light components. Stability of asphalt components is maintained. This prevents oxygen incorporation and reduces the oxidation of asphalt components. The changes in bio-asphalt in terms of chemical composition are reduced. Therefore, the high-temperature rheological properties of treated bio-asphalt, rock asphalt-modified bio-asphalt and montmorillonite-modified bio-asphalt change little under the influence of aging. The CMAI of RAMB is less than that of other asphalts. The PAAI is greater than other asphalts. Its anti-aging properties are better. Bio-asphalt has good anti-aging performance with pretreatment, rock asphalt and montmorillonite.



Figure 10. Rutting indexes of six asphalts.

3.2.2. Anti-Aging Performance of RAMB Based on Low-Temperature Rheological Performance

The low-temperature bending beam tests of unaged and aged asphalt were carried out to compare the changes in S and m values. The S value of each asphalt increased after the aging treatment of the original asphalt, as shown in Figure 13. The polymerization reaction occurred inside the asphalt under the influence of aging and the low-molecular weight aromatic phenol was polymerized into high-molecular weight asphaltene. The aging of the asphalt made it physically brittle. Therefore, the aging was more damaging than it was for the original asphalt at low temperature. The m of long-term aging asphalt was greater than that of short-term aging asphalt, while the m of short-term aging asphalt was greater than that of original asphalt. The decrease in the rate of m was accelerated with the increase in aging. On the other hand, the S value of matrix asphalt after short-term aging exceeded 300 MPa and the m value was less than 0.3. The S and m value of rock asphalt-modified bio-asphalt and RAMB after short-term aging met the requirements. This shows that the

low-temperature performance of the two asphalts after mixing and paving is better than that of matrix asphalt. Conversely, the S and m values after long-term aging exceeded the standard value. The two asphalts were damaged at low temperature after a period of service, but the time to show damage for these two asphalts was longer than that of matrix asphalt at low temperature under the same service conditions. The low-temperature rheological indexes of the other three asphalts under three aging conditions all met the specification requirements. The stress relaxation ability was good after aging and the deterioration via cracking was slow.



Figure 11. CMAI and PAAI of short-term aging of six asphalts.







Figure 13. The S and m values of six asphalts in different aging states.

According to Equations (6) and (7), the SAI and mAI were calculated. When SAI is small and mAI is large, that asphalt has strong low-temperature aging resistance. The calculation results of the SAI and mAI are illustrated in Figures 14 and 15. According to Figures 14 and 15, the SAI value of untreated bio-asphalt was the largest among the six asphalts and the mAI value was the smallest. This shows that the deterioration of low-temperature properties was the most serious under the influence of aging. The SAI value was reduced and the mAI value was increased after distilled water treatment. The SAI value of rock asphalt-modified bio-asphalt, montmorillonite-modified bio-asphalt and matrix asphalt showed less differentiation. The anti-aging performance of bio-asphalt was only slightly improved by the addition of rock asphalt. The improvement effect of montmorillonite was obvious, but was not as pronounced as the matrix asphalt. Compared to the matrix asphalt, the SAI value of RAMB was smaller and the mAI value was larger. The SAI value of RAMB after short-term aging was 0.98 times that of matrix asphalt and the SAI value after long-term aging was 0.96 times that of matrix asphalt, while the mAI value after short-term aging was 1.03 times that of matrix asphalt and the mAI value after longterm aging was 1.01 times that of matrix asphalt. RAMB has good anti-aging performance.



Figure 14. Short-term aging SAI and mAI for six asphalts.



Figure 15. SAI and mAI of six asphalts after long-term aging.

#### 3.3. FTIR

The infrared spectroscopy of untreated bio-oil was coincident with that of treated bio-oil, shown in Figure 16, but the intensity values of some characteristic peaks were different. The intensity of characteristic peaks represents the content of functional groups

in asphalt. The peak intensity of two bio-oils were observed at 2923.88 cm<sup>-1</sup>, 2853.37 cm<sup>-1</sup>, 1743.18 cm<sup>-1</sup>, 1463.41 cm<sup>-1</sup>, 1377.09 cm<sup>-1</sup>, 1162.01 cm<sup>-1</sup> and 967.08 cm<sup>-1</sup>. The peak intensity of treated bio-oils was smaller than that of untreated bio-oils [32]. The peak corresponding to 967.08 cm<sup>-1</sup> is out-of-plane deformation of C-H bond. The peak corresponding to 1162.01 cm<sup>-1</sup> is stretching vibration of ester group O=C-O. The peak corresponding to 1463.41 cm<sup>-1</sup> is the in-plane bending vibration of methyl C-H bond. The peak corresponding to 1463.41 cm<sup>-1</sup> is the in-plane bending vibration of methyl and methylene C-H. The peak corresponding to 2923.88 cm<sup>-1</sup> is the stretching vibration of seter O-C=O. The peak corresponding to 2853.37 cm<sup>-1</sup> is stretching vibration of methyl and methylene CH<sub>2</sub>. The peak corresponding to 1162 cm<sup>-1</sup> and 1743 cm<sup>-1</sup> indicate that the bio-oil contained ester compounds [16,34]. Ester compounds are volatile substances with low boiling points and strong volatility when heated. The peak intensity of the treated bio-oil was weakened at 1162 cm<sup>-1</sup> and 1743 cm<sup>-1</sup>.



Figure 16. Infrared spectroscopy of untreated and treated bio-oil.

As shown in Figure 17, there were three differences in light absorption in the midinfrared region between bio-asphalt and matrix asphalt, namely, 1744.54 cm<sup>-1</sup>, 1159 cm<sup>-1</sup> and 966.2 cm<sup>-1</sup>. The stretching vibration of ester group O-C=O corresponds to 1744.54 cm<sup>-1</sup>. The peak at 1159.83 cm<sup>-1</sup> corresponds to the stretching vibration of ester group O=C-O. The peak at 966.20 cm<sup>-1</sup> corresponds to the out-of-plane deformation of trans-carbon–carbon double C-H bond. The three peaks existed in the spectroscopy of bio-oil. Therefore, the three peaks of bio-asphalt were all from bio-oil. The mixing of bio-oil and matrix asphalt is a physical blend system.

As shown in Figures 18–20, the infrared spectroscopy of treated bio-asphalt was consistent with the rock asphalt-modified asphalt, but the absorption peak of bio-asphalt was very weak at 873.41 cm<sup>-1</sup>, while rock asphalt-modified bio-asphalt showed obvious an absorption peak—the carboxyl C-H in  $CO_3^{2-}$  of rock asphalt [35]. When montmorillonite was added to bio-asphalt, there was a strong and wide absorption peak at 1085.08 cm<sup>-1</sup>—the Si-O-Si antisymmetric stretching vibration bond [36,37]. Other absorption peaks did not change. The new peak of bio-asphalt came from montmorillonite. The incorporation of montmorillonite did not react with bio-asphalt to generate new functional groups. When the rock asphalt and montmorillonite were added into the bio-asphalt, the infrared spectroscopy of the bio-asphalt had two changes. From the above analysis, the emergence of these two peaks is due to the strong vibration of the two peaks in the rock asphalt and montmorillonite. Thus, the preparation process of rock asphalt, montmorillonite and bio-asphalt is also a physical blending process.



Figure 17. Infrared spectroscopy of bio-oil, matrix asphalt and bio-asphalt.



Figure 18. Infrared spectroscopy of rock asphalt, bio-asphalt and rock asphalt-modified bio-asphalt.



Figure 19. Infrared spectroscopy of montmorillonite, bio-asphalt and montmorillonite-modified bio-asphalt.



Figure 20. Infrared spectroscopy of rock asphalt, montmorillonite, bio-asphalt and RAMB.

# 4. Conclusions

To improve the high-temperature performance and anti-aging performance of bioasphalt, this paper proposed a preparation method for RAMB. The DSR test, BBR test, anti-aging performance test and FTIR test were carried out. From the research, the primary conclusions are as follows:

- Through the method in the paper, the high-temperature performance of bio-asphalt is significantly improved. The low-temperature cracking resistance can meet the requirements of SHRP for low-temperature performance of asphalt binder.
- (2) The anti-aging performance of RAMB is much better than that of bio-asphalt. The distilled water treatment removes some light components in bio-oil and the addition of rock asphalt and montmorillonite increases the absorption peaks of two functional groups, C-H and Si-O-Si, respectively.
- (3) Based on the results of FTIR, the mixing of rock asphalt, montmorillonite and bioasphalt is a physical blending system. The modification effect and road performance of this mixture still need further experimental research.

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# Article Experimental Study on the Cracking Resistance of Asphalt Mixture with Different Degrees of Aging

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Abstract: The cracking resistance of asphalt mixture is a non-negligible issue. However, the cracking resistance evolution law, motivated by two factors (thermos-oxidative aging degree and test temperature), is not yet well understood. The aim of this investigation is to gain more insight into the effect of thermos-oxidative aging and test temperature on the cracking resistance of asphalt mixture. Asphalt mixture (AC-13) and stone mastic asphalt mixture (SMA-13) were selected and exposed to different thermo-oxidative aging degrees (unaging (UA); short-term thermo-oxidative aging (STOA); long-term thermo-oxidative aging for 2/5/8 days (LTOA2d/LTOA5d/LTOA8d)). A direct tension test at different test temperatures (10 °C, 20 °C, 30 °C, 40 °C) was adopted to obtain their stress-strain curves and evaluation indexes (tensile strength, ultimate strain, pre-peak strain energy density, and post-peak strain energy density). The comprehensive index-cracking resistance index (CRI) was established by the entropy weight method combined with the technique to order preference by similarity to ideal solution (TOPSIS) method and the corresponding aging coefficient was determined. The results showed that STOA can increase the aging coefficient of asphalt mixture, thereby boosting the cracking resistance. Additionally, the effect can be weakened by elevations in the test temperature. Meanwhile, LTOA can decrease the aging coefficient and thereby weaken the cracking resistance. This effect becomes more prominent with elevations in the test temperature. SMA-13 possesses a superior cracking resistance to AC-13, with a gap in CRI value of 3-69%, regardless of the aging degree and test temperature. A good relationship exists between the aging coefficient and the two factors (aging degree and test temperature).

Keywords: cracking resistance; thermo-oxidative aging; entropy weight TOPSIS; comprehensive cracking resistance index; aging coefficient

## 1. Introduction

Cracking is one of the most common hazards in asphalt pavement, associated with the cracking resistance of the main constituent of asphalt–pavement mixture. Aging occurs throughout the life cycle of asphalt pavement. During mixing, pavement rolling, and service, the asphalt mixture itself is inevitably exposed to complex environmental factors (such as oxygen, a high ambient temperature, light, and water), which can cause changes in the cracking resistance of asphalt mixture to a certain extent, and thereby change the durability of asphalt pavement [1,2]. Generally speaking, aging can be classified into thermo-oxidative aging, light-oxidative aging, and water aging, of which thermooxidative aging is the most common. Therefore, it is important to study the cracking resistance of asphalt mixture considering thermo-oxidative aging, and much research has been conducted on this issue. Song et al. [3] demonstrated the existence of aging during the transportation procedure using a direct tension test at low temperatures, and the results revealed that cracking resistance at low temperatures worsened with transportation time. Yan et al. [4] and Zhu et al. [5] investigated the cracking resistance of AC13 in STOA

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Copyright: © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). and conditions through a disk-shaped compact tension (DCT) test (-12°C). The results show that STOA can accelerate the cracking propagation regardless of the increased effect on the tensile strength. Song et al. [6] conducted a trabecular bending beam test (0 °C, -10 °C, -20 °C) on a warm mixed asphalt mixture to investigate aging degree variation and discovered that cracking resistance at low temperatures deteriorated more severely in LTOA than STOA. This accordingly emphasized the need for research on asphalt mixtures under LTOA conditions. Bonaquist et al. [7], Chen et al. [8], Wang et al. [9], and Wu [10] examined the effects of different degrees of aging (LTOA and STOA) on cracking resistance by semi-circular bending (SCB) test (15 °C, 20 °C and 25 °C). They all concluded that the cracking process can be sped up with the increase in aging degree. Islam et al. [11] studied the effect of aging duration on the indirect tensile strength of AC at 20 °C and highlighted that tensile strength increased with the extension of LTOA duration, but first increased and then decreased with the extension of STOA duration. Similarly, Radeef et al. [12] adopted an indirect tension (IDT) test (25 °C) to study the rubberized asphalt mixture under LTOA and STOA conditions. They found that STOA can enhance the cracking resistance and LTOA can degrade it in reverse.

Moreover, some researchers took test temperature into consideration, as well as the degree of aging. Omranian et al. [13] used the SCB test (10 °C, 20 °C and 30 °C) to evaluate the cracking resistance of treated AC-14 exposed to different STOA durations. The results showed that mixtures exposed to longer aging durations were more prone to cracking at lower test temperatures and that the regulation is reversed at high temperatures. Ye [14] evaluated the cracking resistance of AC-13 treated with different degrees of aging (UA, STOA, LTOA) by the application of the SCB test (0  $^{\circ}$ C,  $-5 {^{\circ}}$ C,  $-10 {^{\circ}}$ C,  $-20 {^{\circ}}$ C). It was found that the mixture was more susceptible to cracking when treated by deeper degrees of aging at the discussed test temperature region. Wang et al. [15] compared the significance of LTOA and test temperature on the cracking resistance of AC-13 under unaging and LTOA conditions using the SCB test (-20 °C. -10 °C. 0 °C. 25 °C). It was concluded that cracking resistance was more remarkably affected by test temperature than LTOA. Hamedi et al. [16] studied the impact of short-term aging on the cracking resistance of asphalt mixture using the SCB test (-10 °C to -22 °C). It was demonstrated that the short-term aging asphalt mixture exhibited a superior cracking resistance to that of the mixture under unaging conditions at a lower test temperature, which was captured by the elevation in the surface free energy of the asphalt binder caused by aging.

As described in the above literature, a majority of the current experimental research on cracking resistance that considers different degrees of aging is limited to low or medium temperatures. However, cracking can also occur at high temperatures [17]. Therefore, it is necessary to test cracking resistance at high temperatures. Even so, it is worth noting the cracking resistance of asphalt mixture considering a high temperature (30 °C) was only reported in one study [13]. As the highest temperatures can reach about 40 °C in most parts of southern China, it seems that the highest test temperature should be set at 40 °C instead.

Furthermore, as asphalt mixture is a kind of multi-phase composite material, its overall mechanical properties are bound to be associated with its internal structure, such as its gradation. On this basis, a few studies have been launched to probe the effect of gradation on the cracking resistance of asphalt mixture. Li et al. [18] employed the SCB test at different test temperatures below 0 °C on both continuous gradation and gap gradation asphalt mixtures (AC-16, SMA-16, AC-20). Additionally, test results were more influenced by gradation than test temperature. Yin et al. [19] conducted an indirect tension low-temperature creep test (0 °C, 10 °C, and -20 °C) on AC-20 with different gradations (coarse, medium, and fine). It was revealed that medium gradation showed the best cracking resistance at 0 °C, medium gradation at -10 °C, and coarse gradation at -20 °C.

There are five main types of indoor evaluation method for the cracking resistance of asphalt mixture: semi-circular bending test, indirect tension test, trabecular bending test, disk shaped compact tension test [20,21] and direct tension test. Among them, the direct tension test is simpler regarding the specimen preparation as well as loading mode, more direct regarding the stress–strain data acquisition and better regarding the reflection of actual stress state of the asphalt mixture. Therefore, it is more suitable to be employed than the other four test methods [22–24]. As mentioned in the literature review, however, only the direct tension test was reported [3].

In terms of evaluation indexes, tensile strength, peak deformation, and modulus are most widely used. Nevertheless, Wang et al. [25] believed that conflicting conclusions could be drawn based on the three indexes mentioned above, and a single tensile strength index and failure strain sometimes cannot fully reflect the cracking resistance of the asphalt mixture. Based on this situation, Yang et al. [26] evaluated the cracking resistance by calculating the strain energy density. The result showed that the cracking resistance decay rate of the asphalt mixture prepared by the oven heating method was equivalent to that prepared by the delayed mixing method. Furthermore, Zheng [27] revealed that it is difficult to judge the cracking resistance of asphalt mixture using only the fracture energy index and established a more comprehensive evaluation index by determining the weight of each index through the analytic hierarchy process (AHP). However, the weight definition is susceptible to the decision-makers' preference for the AHP method, leading to less convincing evaluation results. In contrast, the entropy weight TOPSIS method, a combination of the entropy weight method and TOPSIS method, cannot only avoid the influence of human subjectivity on the evaluation results but also has the advantages of less information loss and flexible computation, meaning that it is widely used in economic, management and other scientific fields, but is less applied in the pavement engineering material field [28-30].

Therefore, in this paper, SMA-13 and AC-13 were selected as they are commonly used in road engineering. Additionally, monotonic tensile tests were conducted on these two asphalt mixtures with different thermo-oxidative aging degrees at different test temperatures. The change rule of commonly used indexes (tensile strength, ultimate strain, and pre-peak and post-peak strain energy density) was obtained with different aging degrees, test temperatures, and mixture gradations. Finally, the comprehensive cracking resistance index (CRI) was established by the entropy weight TOPSIS method to evaluate the cracking resistance of asphalt mixture with different thermo-oxidative aging degrees.

# 2. Materials and Test Protocol

### 2.1. Materials

The styrene-butadiene-styrene (SBS)-modified asphalt was used and purchased from Shell (Xingyue) Co., Ltd., located in Foshan City, Guangdong Province, China. Its fundamental performance parameters were tested. The results are shown in Table 1. The diabase, limestone, and limestone powder were selected for the coarse aggregate, fine aggregate, and filler, respectively, sourced from a test section of the highway in Foshan City, Guangdong Province, China. Their fundamental performance parameters were tested. The results are summarized in Table 2. Furthermore, the aggregate gradation of AC-13 and SMA-13 is presented in Table 3.

Table 1. Basic performance parameters test results of SBS-modified asphalt.

Performance Parameters	Unit	Test Result	Method
Density	g/cm <sup>3</sup>	1.051	ASTM D70-17a
Penetration (25 °C, 100 g, 5 s)	0.1 mm	44.1	ASTM D5-13
Ductility (5 °C, 5 cm/min)	cm	25.8	ASTM D113-17b
Softening point	°C	93.6	ASTM D36-14
Flash point	°C	>230	ASTM D92-12b
Mass loss of residue after TFOT (Thin-film oven test)	%	0.4	ASTM D6-11
Penetration ratio of residue after TFOT (25 $^{\circ}$ C)	%	72.5	ASTM D5-13
Ductility of residue after TFOT (5 °C, 5 cm/min)	cm	21	ASTM D113-17b

Performance Parameters	Unit	Coarse Aggregate	Fine Aggregate	Filler	Method
Los Angeles abrasion	%	10.9			ASTM C131-14
Flat and elongated particles	%	1.4			ASTM D4791-19
Fine aggregate angularity	%		38		AASHTO T304-17
Specific gravity	g/cm <sup>3</sup>	2.762			ASTM C127-15
Specific gravity	g/cm <sup>3</sup>		2.73		ASTM C128-15
Specific gravity	g/cm <sup>3</sup>			2.704	ASTM D854-14

Table 2. Basic performance parameters test results of coarse aggregate, fine aggregate and filler.

Table 3. Mineral aggregate gradation.

	Passing Pe	ercentage/%
Sieve Size/mm —	AC-13	SMA-13
16	100	100
13.2	95	90
9.5	76.5	50
4.75	53	20
2.36	37	15
1.18	26.5	14
0.6	19	12
0.3	13.5	10
0.15	10	9
0.075	6	8

#### 2.2. Specimen Preparation

Compared with existing compaction methods, the wheel-rolling method was selected for the compact asphalt mixture plate specimen (300 mm  $\times$  300 mm  $\times$  50 mm) by virtue its better field simulation [31]. Then, each plate specimen was cut into a beam specimen (250 mm  $\times$  50 mm) by a rock-cutting machine.

The Strategic Highway Research Program (SHRP) proposed oven-heating, delayed mixing, and microwave-heating methods to simulate the thermos-oxidative aging of asphalt mixture. Among them, the oven-heating method is the most effective and common one. Therefore, this method was used in this study.

(1) STOA: put the mixed loose asphalt mixture in the oven with a temperature controlled at 135  $^{\circ}$ C for 4 h and stir hourly; then, mold the specimen according to the chapter mentioned above.

(2) LTOA: based on STOA, the beam specimen should be placed in the oven with temperature controlled at 85 °C for the intended number of days (2, 5 and 8 days).

# 2.3. Monotonic Direct Tension Test

The monotonic direct tension test was conducted by the material test systems (MTS) 810 machine imported from MTS Company located in Eden Prairie, MN, USA. For each specimen, each of the two ends was bonded with a round steel loading plate by steel glue. Then, after at least 3 days, specimens were moved into a temperature-controlled cabinet at the corresponding target test temperature for 4 h. Subsequently, specimens were shifted out and clamped onto the loading platform to be tested at a loading rate of 5 mm/min [32]. Pretension was performed at the beginning of each test to prevent eccentric phenomena from occurring during the test process. All the test results were acquired through the built-in computer system at a sampling frequency of 10 Hz. The relative indexes were calculated according to the following equations.

$$\sigma_{\max} = \frac{F_{\max}}{bd} \tag{1}$$

$$\varepsilon_{\max} = \frac{\varepsilon_{1\max} + \varepsilon_{2\max}}{2} \tag{2}$$

$$\omega_{\rm pre} = \int_0^{\varepsilon_{\rm max}} \sigma d\varepsilon \tag{3}$$

$$\omega_{\text{post}} = \int_{\varepsilon_{\text{max}}}^{\varepsilon_{\sigma=\frac{1}{2}}\sigma_{\text{max}}} \sigma d\varepsilon \tag{4}$$

where  $\sigma_{max}$  denotes the tensile strength (MPa);  $F_{max}$  denotes peak loading value (N); b and d denote the width and the height of the specimen, respectively (mm);  $\varepsilon_{max}$  denotes the ultimate strain (10<sup>-6</sup>)  $\varepsilon_{1max}$ ,  $\varepsilon_{2max}$  denote the strain value of extensometers corresponding to the loading value, respectively (10<sup>-6</sup>);  $\omega_{pre}$  denotes the pre-peak strain energy density (MJ/m<sup>3</sup>);  $\omega_{post}$  denotes the post-peak strain energy density (MJ/m<sup>3</sup>);  $\varepsilon_{\sigma=\frac{1}{2}}\sigma_{max}$  denotes the strain at which the corresponding stress drops to half of the tensile strength (10<sup>-6</sup>);  $\sigma$  denotes stress in the tension process (MPa);  $\varepsilon$  denotes strain in the tension process (10<sup>-6</sup>).

## 2.4. Entropy Weight-TOPSIS Method

The idea of the entropy weight TOPSIS method is to use the entropy weight method to determine the weight of each index and then use the TOPSIS method to calculate the value of the comprehensive indexes. The specific steps are described below.

#### 2.4.1. Establish the Initial Evaluation Matrix

There were 40 evaluation objects and 3 evaluation indexes in this study. The initial evaluation matrix  $A = (a_{ij})_{m \times n} (m = 40; n = 3)$  is depicted in the following equation:

$$A = \begin{bmatrix} a_{11} & a_{12} & \cdots & a_{1n} \\ a_{21} & a_{22} & \cdots & a_{2n} \\ \vdots & \vdots & \vdots & \vdots \\ a_{m1} & a_{m2} & \cdots & a_{mn} \end{bmatrix}$$
(5)

where aii denotes the jth evaluation index value of the ith evaluation object.

# 2.4.2. Standardize the Initial Evaluation Matrix

In view of the different dimensions among the three kinds of indexes, the standardized evaluation matrix  $B = (b_{ij})_{m \times n}$  is expressed as follows:

$$b_{ij} = \frac{a_{ij} - \min_j}{\max_j - \min_j} \tag{6}$$

where  $b_{ij}$  denotes the jth evaluation index value of the ith evaluation object after standardization; min<sub>j</sub> denotes the minimum value of the jth evaluation index; max<sub>j</sub> denotes the maximum value of the jth evaluation index.

#### 2.4.3. Calculate Entropy Weight of Each Index

The entropy and entropy weight of each index can be calculated according to the following equations:

$$e_{j} = -\frac{1}{\ln m} \sum_{i=1}^{m} \frac{b_{ij}}{\sum_{i=1}^{m} b_{ij}} \ln \frac{b_{ij}}{\sum_{i=1}^{m} b_{ij}}$$
(7)

$$w_j = \frac{1 - e_j}{\sum_{j=1}^n e_j} \tag{8}$$

where  $e_j$  denotes the entropy of each evaluation index and  $w_j$  denotes the entropy weight of each evaluation index.

# 2.4.4. Establish Weighted Standardization Evaluation Matrix

The weighted standardization evaluation matrix  $C = (c_{ij})_{m \times n}$  is established according to the following equation:

$$c_{ij} = b_{ij} \times w_j \tag{9}$$

where cij denotes the jth evaluation index value of the ith evaluation object after being weighted.

2.4.5. Determine the Ideal Solution and Calculate the Euclidean Distance

The positive and negative ideal solution can be defined as follows:

$$c^{+} = [max(c_{ij})] = [c_{1}^{+} \quad c_{2}^{+} \quad \dots \quad c_{n}^{+}]$$
 (10)

$$c^{-} = [min(c_{ij})] = [c_{1}^{-} \ c_{2}^{-} \ \dots \ c_{n}^{-}]$$
 (11)

The Euclidean distance between the evaluation object and the positive and negative ideal solution can be measured as follows.

$$S_{i}^{+} = \sqrt{\sum_{j=1}^{n} \left( c_{ij} - c_{j}^{+} \right)^{2}}$$
(12)

$$S_{i}^{-} = \sqrt{\sum_{j=1}^{n} \left( c_{ij} - c_{j}^{-} \right)^{2}}$$
(13)

where  $c^+$  and  $c^-$  denote the positive and negative ideal solution, respectively;  $S_i^+$  and  $S_i^-$  denote the Euclidean distance between the evaluation object and the positive and negative ideal solution for each evaluation object.

#### 2.4.6. Calculate the Closeness of Each Evaluation Object to the Ideal Solution

The closeness of each of each evaluation object to the ideal solution can finally be defined as follows and can be regarded as the CRI value of each evaluation object.

$$CRI = E_i = \frac{S_i^-}{S_i^+ + S_i^-}$$
(14)

where E<sub>i</sub> denotes the closeness of each evaluation object to the ideal solution.

# 3. Results and Discussion

## 3.1. Stress–Strain Plot

Figures 1–4 show the stress–strain curves in the direct tension test process for AC-13 and SMA-13 with different aging degrees at 10  $^{\circ}$ C, 20  $^{\circ}$ C, 30  $^{\circ}$ C, 40  $^{\circ}$ C, respectively.

As shown in Figures 1–4, the overall shape of these plots can all be divided into three similar stages and the plot of AC13-UA in Figure 3 is taken as an example for the illustration. (1) Elastic stage: the plot in the initial loading phase is approximately a straight line, and the stress linearly increases with the increase in strain. (2) Strain-hardening stage: with the elevation of strain, the plot begins to deviate from the straight line in the former stage and to stretch as an approximate arc. With the elevation of strain, stress continues to nonlinearly climb to a peak value with a speed slower than that in the former stage. (3) Strain-softening stage: with the continuous elevation of strain, stress shows a remarkable downward trend as soon as stress reaches over the peak value.

For both AC-13 and SMA-13, the stress–strain plots exhibit similar a change with the increase in degree of aging at the same test temperature. The plots of AC13-UA, AC13-STOA, AC13-LTOA2d, AC13-LTOA5d and AC13-LTOA8d in Figure 1 are as shown in Figure: With the increase in aging degree, each plot shifts upward and is left as a whole. Particularly, the slope of the straight line in the elastic stage becomes steeper, which means that the elevation of the degree of aging can increase the rigidity of the asphalt mixture.

The arc length and the radius of curvature of the hardening stage curve decrease. At the same time, the downward trend of the strain-softening stage becomes sharper.

For both AC-13 and SMA-13, the stress–strain plots present a few changes with the elevation of test temperature under the same degree of aging. The plots of SMA13-UA in Figures 1–4 are used as an example. Each entity generally tends to shift downward and to the right. Specifically, the slope of the elastic stage decreases, which indicates that the rigidity of the asphalt mixture can be weakened with the increase in test temperature. The deviation of the strain-hardening stage curve from the former straight line tends to be more pronounced. Furthermore, the downward trend of the strain-softening stage curve becomes gentler.

There are also differences between stress–strain curves of AC-13 and SMA-13 when the same aging degree and test temperature are considered. The plots of AC13-LTOA2d and SMA13-LTOA2d in Figure 4 are taken as an example. The coverage height of the plot of SMA-13 is lower than that of AC-13. However, the coverage width of the plot of SMA-13 is remarkably greater than that of AC-13, which causes the whole plot of SMA-13 to be plumper.



Figure 1. Stress-strain plots of AC-13 and SMA-13 under different aging degrees, plotted at 10 °C.



Figure 2. Stress-strain plots of AC-13 and SMA-13 under different aging degrees, plotted at 20 °C.



Figure 3. Stress-strain plots of AC-13 and SMA-13 under different aging degrees, plotted at 30 °C.



Figure 4. Stress-strain plots of AC-13 and SMA-13 under different aging degrees, plotted at 40 °C.

# 3.2. Tensile Strength

Table 4 and Figures 5 and 6 present the tensile strength results versus test temperature for AC-13 and SMA-13 under different degrees of aging. As shown in Figures 5 and 6, the tensile strength of both SMA-13 and AC-13 gradually increases with the increase in aging degree when test temperature remains the same. This phenomenon can be explained as follows: under a thermo-oxidative aging environment, light components can be transformed into asphaltene by the chemical reaction between the hydrocarbon (derivatives) in asphalt and oxygen, which undoubtedly increases the number of polar molecules in bitumen. A high temperature can also enhance the polarity of aggregate is generated by the linkage of polar molecules. Therefore, it follows that the adhesion between bitumen and aggregate can be strengthened and the load-bearing capacity of the asphalt mixture can be enhanced after thermo oxidative aging.

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Gradation	Test Temperature	Specimen		NA			STOA			LTOA2d			LTO A5d			LTOA8d	
	ိုင်	Number	Sample Value (MPa)	Average Value (MPa)	Standard Deviation												
		1	0.84			1.10			121			1.35			1.42		
	10	2	0.90	06'0	0.040	1.10	1.10	0.013	121	1.20	0.004	1.29	131	0.031	1.40	1.40	0.051
		n	0.93			1.09			120			1.30			1.49		
		4	0.93			1.12			120			1.28			1.37		
		1	0.71			0.72			0.92			1.15			1.16		
	20	2	0.70	0.69	0.018	0.74	0.73	0.025	0.91	0.92	0.006	1.11	1.12	0.034	1.18	1.16	0.013
		eo	0.66			0.70			0.91			1.14			1.15		
AC-13		4	0.68			920			0.92			1.07			1.15		
		1	0.62			09'0			69'0			0.76			0.81		
	08	2	0.57	0.58	0.077	0.56	0.60	0.030	0.68	0.69	0.015	0.78	0.77	0.071	0.81	0.80	0.017
	3	ю	0.57	-		0.62	2	2	0.71	2		0.79		T MOLES	0.78	2	
		4	0.57			0.63			29'0			0.74			0.81		
		1	0.11			0.29			0.33			0.35			0.40		
	UP	2	0.12	013	0.077	030	0.27	0.028	0.36	750	0.015	0.35	0.35	0.007	0.44	0.43	0.041
	P	3	0.13	crin	77000	0.25	/7:0	07010	0.32	#C'D	CTOYO	0.35	n	70070	0.39	C#0	14010
		4	0.17			0.24			0.34			0.36			0.48		
		1	0.53			0.68			0.83			0.96			1.20		
	10	2	0.54	0.55	0.035	0.68	0.69	0.020	0.77	0.78	0.038	0.84	060	0.055	1.26	1.22	0.062
	4	3	0.53			990			0.76			0.87			1.28		100 CL C
		4	0.60			0.71			0.74			0.93			1.14		
		1	0.34			0.48			0.54			0.72			0.89		
	20	2	0.34	0.35	0.014	0.51	0.50	0.019	0.56	0.55	0.009	0.72	1/20	0.022	0.94	0.88	0.057
		6	0.35			0.49			0.54			0.71			0.86		
SMA-13		4	0.37			0.53			0.54			0.68			0.81		
		1	0.15			0.35			0.52			0.53			19:0		
	90	6	0.16	0.16	0.005	0.36	0.35	0.026	240	0.49	0.021	0.54	0.55	0.021	0.58	090	0.012
		e	0.16			0.38			0.48			0.58			0.60		
		4	0.15			0.32			0.50			0.56			0.61		
		1	0.12			0.19			026			0.29			0.37		
	UP	2	0.10	010	0.015	0.22	0.23	0400	0.25	0.25	0.009	0.26	0.31	0.036	0.40	070	0.019
	ł	е	0.10			0.22			0.24			0.34			0:39		
		4	0.08			0.29			0.25			0.34			0.42		

Table 4. Tensile strength at different test temperatures of AC-13 and SMA-13 under different aging degrees.



Figure 5. Tensile strength versus test temperature for AC-13 under different degrees of aging.



Figure 6. Tensile strength versus test temperature for SMA-13 under different degrees of aging.

For AC-13, the increase trend of the tensile strength becomes weaker with the overall elevation of aging degree. At 10 °C and 30 °C, STOA presents the most obvious increasing effect on tensile strength, with a growth gradient of 22% (10 °C) and 99% (40 °C). With the increase in aging degree, the growth gradient drops to 10% (10 °C) and 55% (40 °C). Comparatively, there are fluctuations in AC-13 at 20 °C and 30 °C, which means that the LTOA2d condition presents the most obvious increasing effect on tensile strength by a growth gradient of 29% (20 °C) and 15% (30 °C). Similarly, the growth gradient drops to 6% for the LTOA8d condition. At 10 °C and 20 °C, the elevation effect of aging degree on

tensile strength of SMA-13 fluctuates, but it is worth noting that the LTOA8d condition exhibits the most remarkable elevation effect by a growth gradient of 20% (10 °C) and 13% (20 °C). At 30 °C and 40 °C, while the STOA condition presents the most obvious increasing effect on the tensile strength of SMA-13 by a growth gradient of 20% (30 °C) and 13% (40 °C). The growth gradient declines with the increase in aging degree at 30 °C; however, it fluctuates at 40 °C.

With the elevation in test temperature, the tensile strength at each degree of aging shows a decreasing trend for both AC-13 and SMA-13. The cause of the phenomenon may be illustrated as follows: the increase in test temperature can intensify the periodic thermal movement of macromolecules inside the asphalt mixture, thus enlarging the distance between the macromolecules, weakening the mutual attraction between the macromolecules, and eventually reducing the load required to destroy the structure of the asphalt mixture [34]. For AC-13 under LTOA2d, LTOA5d and LTOA8d conditions, tensile strength decreases approximately linearly, with an average decline rate of 24% with every increase of 10 °C. Comparatively, for AC-13 under STOA conditions, tensile strength decreases unsteadily by 12% (from 10 °C to 20 °C), 30% (from 20 °C to 30 °C) and 21% (from 30 °C to 40 °C). When it comes to AC-13 under UA conditions, tensile strength decreases by an average decline rate of 18% with every increase of 10  $^{\circ}$ C when temperature is in the range of from 10 °C to 30 °C; however, a sharp drop in tensile strength by 50% appears when temperature goes up from 30 °C to 40 °C. Similarly, for SMA-13 under UA, STOA, LTOA5d and LTOA8d conditions, tensile strength steadily decreases with an average decline rate of 36% (UA and STOA), 22% (LTOA5d and LTOA8d) with every increase of 10 °C. When it comes to SMA-13 under LTOA2d conditions, volatility occurs in the tensile strength descent trend by 29% (from 10 °C to 20 °C), 7% (from 20 °C to 30 °C) and 31% (from 30 °C to 40 °C).

Additionally, it is easy to see that the tensile strength of AC-13 is higher than that of SMA-13 when the aging degree and test temperature remain the same and the value of the gap can be up to 2.8 times as high (UA, 30 °C). This may be attributed to the following causes: the higher admixture of AC-13 aggregate renders a thicker asphalt mortar film, which has a correspondingly stronger ability to grip the aggregate than SMA-13. In addition, the higher distribution uniformity of air voids in AC-13 means that it performs better regarding the overall structural uniformity of the mixture, thus endowing AC-13 with a higher tensile strength at the macroscopic level [35,36]. Furthermore, the gap between the tensile strength of AC-13 and SMA-13 is narrowed by the elevation of aging degree and test temperature.

## 3.3. Ultimate Strain

Table 5 and Figures 7 and 8 display the ultimate strain results versus test temperature for AC-13 and SMA-13 under different degrees of aging. As shown in Figures 7 and 8, the ultimate strain of both SMA-13 and AC-13 gradually descends with the increase in aging degree at the same test temperature. The reason for this phenomenon may be that during thermos-oxidative aging, long-term exposure to a high temperature increases the kinetic energy of light molecules in asphalt and further widens the diffusion rate gap between light and heavy molecules, thus weakening the intermolecular attraction and reducing the stability of asphalt mortar or even the overall structure of the asphalt mixture [37].

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Table 5. Ultimate strain at different test temperatures of AC-13 and SMA-13 under different degrees of aging.



Figure 7. Ultimate strain versus test temperature for AC-13 under different degrees of aging.



Figure 8. Ultimate strain versus test temperature for SMA-13 under different degrees of aging.

For AC-13, the ultimate strain of the mixture undergoing STOA, LTOA2d, LTOA5d, and LTOA8d is 19–40%, 43–46%, 59–76%, and 75–80% lower than that of the unaging mixture, respectively. For SMA-13, the ultimate strain of the mixture undergoing STOA, LTOA2d, LTOA5d, and LTOA8d decreases by 4–12%, 21–35%, 31–48%, and 58–64%, respectively, compared with that of the unaging mixture. Additionally, the attenuation effect of aging on the ultimate strain of AC-13 is significantly greater than that of SMA-13. For AC-13 at 10 °C, 20 °C and 40 °C, the ultimate strain decreases linearly when aging degree is confined to LTOA2d conditions by a decrease gradient of 23% (10 °C), 31% (20 °C) and 22% (30 °C). When the degree of aging continuously deepens, the ultimate decrease recedes. It is worth noting that the decrease gradient drops to only 3% (10 °C), 4% (20 °C) and 16% (30 °C) when the degree of aging reaches LTOA8d. When the test temperature is 40 °C, AC-13 treated by STOA conditions shows a dramatic drop in ultimate strain, by 40%. Then, the ultimate strain exhibits an approximate linear descent trend with a decrease gradient of

16%. For SMA-13 at 10 °C and 20 °C, the ultimate strain decreases slightly, by 3% (10 °C) and 8% (20 °C), under STOA conditions, and when aging degree reaches LTOA2d, there is a sharper descent with a decrease gradient of 23% (10 °C) and 21% (20 °C). However, when the degree of aging further decreases, the descent of the ultimate strain slows down and becomes steadier, with a decrease gradient of 9% (10 °C) and 17% (20 °C). For SMA-13 at 30 °C and 40 °C, the descent of the ultimate strain exhibits slight fluctuations, with an average decrease gradient of 5% (STOA), 18% (LTOA2d), 8% (LTOA5d) and 30% (LTOA8d).

With the elevation of test temperature, the ultimate strain under each aging degree shows an increasing trend for both AC-13 and SMA-13. The cause of this phenomenon may be explained as follows: the Brownian motion in asphalt molecules becomes more active, and free volume between molecules increases under the impact of rising temperature, which reduces the viscous flow of asphalt mortar and the eventual enhancement in ultimate strain [38]. For AC-13 under STOA and LTOA8d conditions, the ultimate strain grows nearly proportionally by an average increase rate of 26% (STOA) and 61% (LTOA8d) with every increase of 10 °C. Comparatively, for AC-13, under the other aging conditions, ultimate strain increases unsteadily. However, when test temperature climbs from 30 °C to 40 °C, the sharpest variation in ultimate strain can be seen, with an average increase rate of 80% (UA), 85% (LTOA2d) and 182% (LTOA5d). For SMA-13, the increasing tendency of the ultimate strain is weakened with the elevation of test temperature. For SMA-13 under LTOA5d conditions, ultimate strain steadily increases, with an average increase rate of 50% with every rise of 10  $^{\circ}$ C, when the discussed test temperature is in the range of from 10  $^{\circ}$ C to 30 °C. When test temperature increases from 30 °C to 40 °C, the average increase rate drops to only 10%. At the same time, for SMA-13 under the other four aging conditions, ultimate strain lifts by 42% (UA), and only 37% (STOA), 55% (LTOA2d) and 28% (LTOA8d), with the elevation of test temperature from 10  $^{\circ}$ C to 20  $^{\circ}$ C. With further elevations in test temperature, the ultimate increasing tendency becomes flat, with an average increase rate of 7% (UA), 8% (STOA), 16% (LTOA2d), 10% (LTOA8d).

Moreover, it is apparent that the ultimate strain of SMA-13 is higher than that of AC-13. This can be explained by the following causes: one is that the contact action between coarse aggregates is more prominent in SMA-13 than AC-13. Furthermore, the lignin fiber in SMA-13 can fully contact and fuse with asphalt to form a wet surface under its large surface area and excellent bitumen-absorbing property, which strengthens the viscosity of the bitumen film wrapped around the aggregate [39,40]. The combined action of the above two aspects can better restrain the sliding between aggregates and then improve the overall deformation of the mixture to a certain extent. In addition, the gap between the ultimate strain of AC-13 and SMA-13 is narrowed with the elevation of test temperature. Furthermore, whatever the test temperature, the largest gap between the ultimate strain of AC-13 and SMA-13 exists under LTOA5d conditions by 3 times (10 °C), 2 times (20 °C), 2.5 times (30 °C) and 1.1 times (40 °C).

# 3.4. Pre-Peak Strain Energy Density

Table 6 and Figures 9 and 10 show the pre-peak strain energy density results versus test temperature for AC-13 and SMA-13 under different degrees of aging. As shown in Figures 9 and 10, at the same test temperature, the strain energy density of AC-13 and SMA-13 both increase after short-term aging and gradually decay as the aging degree deepens into long-term aging. The reason for this phenomenon may be as follows: after thermo-oxidative aging, the content of the carbonyl group, carbonyl group, sulfoxide group, and aromatic group increases to some degree. During short-term aging, the content of the former two groups, which are beneficial for boosting the association between molecules, jumps with a greater degree so that the toughness of the overall structure of the asphalt mixture is enhanced, and more energy is required for cracking [41]. In comparison, the growth of the aromatic group, which has a high rigidity, dominates in the long-term aging process. The results may reduce the toughness of the overall structure of the asphalt mixture and the energy required for cracking under external loads. Specifically, for AC-13,

the pre-peak strain energy density under short-term aging ascends by 2% (10 °C), 14% (20 °C), 17% (30 °C) and 35% (40 °C). When the degree of aging extends to LTOA2d, there is a descent in the pre-peak strain energy density by 10% (10 °C and 40 °C), 16% (20 °C) and 19% (30 °C). However, when the degree of aging extends further, the tendency to decrease slows down and becomes steadier, with a decrease rate of 11% (10 °C), 13% (20 °C and 30 °C) and 20% (40 °C). Likewise, for SMA-13, the pre-peak strain energy density under short-term aging ascends by 35% (10 °C), 60% (20 °C) and 39% (30 °C) and 62% (40 °C). When the degree of aging extends to LTOA2d, there is a violent descent in the pre-peak strain energy density, by 11% (10 °C and 20 °C) 21% (30 °C) and 34% (40 °C). With the continuous deepening of the degree of aging, the decrease trend becomes steadier by a decrease rate of only 8.5%.



Figure 9. Pre-peak strain energy density versus test temperature for AC-13 under different degrees of aging.



Figure 10. Pre-peak strain energy density versus test temperature for SMA-13 under different degrees of aging.

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		Standard Deviation		301	071			227			110				178			128	0.71		230				76				271	
	LTOA8d	Average Value (MJ/m <sup>3</sup> )		PARC	4047			2649			1053	3			1194			2382	70.77		3131				1850				1009	
		Sample Value (MJ/m <sup>3</sup> )	2640	2526	2364	2406	2463	2740	2465	1841	2087	1890	1065	001	1041 1423	1247	2161	2297	2215	2834	3387	3198	3105	1768	1332	1807	1893	1173	1298	724 841
		Standard Deviation		979	B			66			100				110			180	ŝ		175				325				8	
	LTOA5d	Average Value (MJ/m <sup>3</sup> )		2005	200			32.88			2550				1893			30,0%	0400		3414				2287				1611	
		Sample Value (MJ/m <sup>3</sup> )	3059	3184	3034	3102	3140	3349 3330	333	2603	2473	2665	1850	10.02	1825 2056	1832	3277	3058	2918	3364	3355	32.68	3669	223		2203	2745	1500	1605	1605 1734
		Standard Deviation		140	14.9			303			268	2			188			542	400		203				100				61	
Aging Degree	LTOA2d	Average Value (MJ/m <sup>3</sup> )		37.46	0#-00			3744			78.75				2167			3231	1070		4192				2400				1458	
		Sample Value (MJ/m <sup>3</sup> )	3342	3555	3276	3211	3404	3670	3764	3194	2900	2539	0007	04.47	2009 2110	2109	2487	3154	3541	4382	3961	4083	43.42	2405	007	2284	2528	1425	1390	1521 1495
		Standard Deviation		027	 ⊃≁			240			696	4			252			819			121				348				247	
	STOA	Average Value (MJ/m <sup>3</sup> )		3616	0100			4463			3555	2			2400			3675	6400		4517				3040				2210	
		Sample Value (MJ/m <sup>3</sup> )	3675	4084	3222	4282	4410	4556	4727	3791	3185	3578	/000	7/07	2445 2422	2061	3248	3164	4425	4666	4565	4410	44.27	3331	7007	2624	3323	2121	2436	2381
		Standard Deviation		æ	9			131			522	4			279			116	2		76				44				163	
	NA	Average Value (MJ/m <sup>3</sup> )		3763	00/0			1066			3046				1779			2607	1007		2830				2196				1363	
		Sample Value (MJ/m <sup>3</sup> )	3775	3774	3748	3715	3879	4088 38 55	3782	3475	3432	2286	04.67	2117	1629 1754	1554	2566	2654	2728	5239	2820	2743	2900	2204	HC77	2173	2153	1247	1286	1315 1604
	Specimen	Number	1	2	9	4	1	6 6	6 4	-	2	ю -	*   -	T	о ю	4	1	2		1	2	e	4	-	4	9	4	1	2	60 <del>4</del>
	Test Temperature	ç		Ę	 =			20	I		 ह	3			04			 =	1		8			I	30				40	I
	-					I							I							ſ			2	2			I			

Table 6. Pre-peak strain energy density at different test temperatures of AC-13 and SMA-13 under different degrees of aging.

For asphalt mixtures with the same aging duration, the pre-peak strain energy density of AC-13 and SMA-13 slightly increases as the test temperature rises from 10 °C to 20 °C, while it descends as the test temperature continues to rise to 40 °C. The reason for this phenomenon may be that the increase in temperature can increase the amplitude of molecular motion, and thus cause a corresponding increase in the heat energy, which activates the rotation of the segment around the main chain axis and exhibits a crimped and stretched conformation [26]. Thus, more energy is required to fracture the overall macrostructure of the asphalt mixture. Furthermore, asphalt mixture exhibits a leather state in the temperature range of 20–40 °C, in which there is a mutual slide between molecules, and the slip becomes more intense with the increase in temperature [33]. Therefore, the energy required to break the interaction between molecular chains eventually drops. As the test temperature rises from 10  $^{\circ}$ C to 20  $^{\circ}$ C, the pre-strain energy density of AC-13 grows slightly by 4% (UA), 17% (STOA), 12% (LTOA2d), 6% (LTOA5d) and 3% (LTOA8d). When the test temperature continues to rise, the pre-strain energy density is nearly proportional, with an average decrease rate of 27% (UA), 23% (STOA), 21% (LTOA2d and LTOA5d) and 27% (LTOA8d) with every increase of 10 °C. Analogously, the pre-strain energy density of AC-13 grows slightly by 4% (UA), 17% (STOA), 12% (LTOA2d), 7% (LTOA5d) and 3% (LTOA8d). Analogously, for SMA-13, the pre-strain energy density slightly increases by 5% (UA), 25% (STOA), 20% (LTOA2d), 13% (LTOA5d) and 37% (LTOA8d) when the test temperature rises from 10 °C to 20 °C. Furthermore, it descends nearly linearly, with an average decrease rate of 26% (UA, STOA and LTOA5d) and 33% (LTOA2d and LTOA8d) with every increase of 10 °C.

Furthermore, when test temperature is 10 °C, 30 °C and 40 °C, the pre-peak strain energy density of AC-13 is higher than that of SMA-13 and the gap reaches about 37% on average. However, the pre-peak strain energy density of AC-13 is lower than that of SMA-13 under both short-term and long-term aging conditions when the test temperature is 20 °C.

## 3.5. Post-Peak Strain Energy Density

Table 7 and Figures 11 and 12 illustrate post-peak strain energy density results for AC-13 and SMA-13, respectively. Similar to the pre-peak strain energy density, as shown in Figures 11 and 12, at the same test temperature, the post-peak strain energy density of AC-13 and SMA-13 both increases under short-term aging and gradually decrease as the degree of aging moves toward long-term aging. Concretely, for AC-13, the post-peak strain energy density under short-term aging ascends by 53% (1 °C), 42% (20 °C) and 53% (30 °C) and 63% (40  $^{\circ}$ C). When the degree of aging extends to LTOA2d, there is a violent drop in the post-peak strain energy density by 36% (10 °C, 20 °C and 40 °C) and 31% (20 °C). However, when the degree of aging deepens further, there is a tendency to decrease more flatly, with a decrease rate of 14% (10  $^{\circ}$ C and 30  $^{\circ}$ C), 11% (20  $^{\circ}$ C) and 12% (40  $^{\circ}$ C). In the same way, for SMA-13, the post-peak strain energy density under short-term aging ascends by 29% (10 °C), 25% (20 °C and 30 °C) and 34% (40 °C). When degree of aging extends to LTOA2d, there is a dramatic drop in the post-peak strain energy density by 20% (10  $^{\circ}$ C), 31% (20 °C) and 38% (30 °C and 40 °C). With the continuous deepening of the degree of aging, the descent trend becomes steadier, with a decrease rate of 6% 10  $^{\circ}$ C), 3% (20  $^{\circ}$ C), 10% (30 °C) and 13% (40 °C).

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			Standard Deviation		172	0			91			2 63	87			116	011			180	2			192				134				154		
		LTO A8d	Sample Value (MJ/m <sup>3</sup> )		10.67	10.01			1753			1000	0001			247	Ĩ.			22.00				2800				1487				1199		
			Av erage Value (MJ/m <sup>3</sup> )	1284	914	943	1127	1647	1780	1862	1021	1326	938	715	914	943	1104	828	2274	2161	2013	1859	2948	2561	2964	2727	1377	1536	1655	1380	1235	1001	1187	7701
) )			Standard Deviation		166	0.07			337			150	CCT			137	101			111				49				26				202		
,		LTO A5d	Average Value (MJ/m <sup>3</sup> )		1240	467			2009			1303	6001			1785	1400			2154				2905				2005				1695		
			Sample Value (MJ/m <sup>3</sup> )	1373	1091	1393	1540	2310	2283 1651	1792	1216	1293	1486	1536	1434	1291	1311	1103	2137	2003	2230	2246	2917	2833	2924	2944	1973	1900	2031	2116	1653	1998	1542	1001
			Standard Deviation		Ę	7771			256			8	R			146	261			152	4			574				430				199		
	ging Degree	LTOA2d	Average Value (MJ/m <sup>3</sup> )		1007	1001			2687			10.01	1001			1567	1001			ECTC	Ì			3027				2134				96.00		
	v		Sample Value (MJ/m <sup>3</sup> )	2376	1678	2127	1446	2369	2832 2494	2895	1892	1800	1707	1924	1656	1430	1457	1726	2610	2454	2384	2244	3051	2653	2575	38.29	223	1902	2698	1714	1999	2098	22.68	16./1
			Standard Deviation		572	C40			185			010	617			206	7.07			730	ì			290				213				102		
		STOA	Average Value (MJ/m <sup>3</sup> )		1000	0//7			3912			100	#c07			2507	10.07			3031	*			4361				3380				3353		
			Sample Value (MJ/m <sup>3</sup> )	2876	2962	2681	3441	4044	3638 3969	2668	3095	2977	2626	2717	2474	2253	2740	2560	3263	2697	3094	3069	3930	4326	3983	5206	3178	3671	3393	3278	3304	33.87	3477	C#-7C
3			Standard Deviation		ð	R			155				 611			8	76			74	ì			310				122				8		
		ΝA	Average Value (MJ/m <sup>3</sup> )		1052	0061			2763			1001	1001			1 53.4	1001			2336	0004			3500				2699				2506		
			Sample Value (MJ/m <sup>3</sup> )	2022	1833	2043	1914	2651	2748	2667	2000	1860	1712	1896	1625	14 <i>97</i>	1593	1422	2591	2534	2204	2015	3580	3688	3690	3041	2710	2539	2713	2834	2486	2545	2520	C/#7
	ļ	Specimen	Number	1	2	3	4	1	о с	4	1	2	3	4	1	2	6	4	1	2	3	4	1	2	9	4	1	2	3	4	1	2	ю т	Ŧ
		Test	emperature (°C)		9 	2			20			 8	 8			ą	2			10				30				90				-0 <del>0</del>	1	
			Gradation				I	I			AC-13 -											I				C1 110	= c1-MMC			I				

Table 7. Post-peak strain energy density at different test temperatures of AC-13 and SMA-13 under different degrees of aging.



Figure 11. Post-peak strain energy density versus test temperature for AC-13 under different degrees of aging.



Figure 12. Post-peak strain energy density versus test temperature for SMA-13 under different degrees of aging.

Moreover, when the aging degree remains the same, as the test temperature increases from 10 °C to 20 °C, the post-strain energy density of AC-13 grows slightly, by 41% (UA and LTOA2d), 31% (STOA), 49% (LTOA5d), 64% (LTOA8d). When the test temperature reaches t30 °C, the post-strain energy density drops dramatically, with a decrease rate of 32% (UA, LTOA2d and LTOA5d), 27% (STOA) and 43% (LTOA8d). Comparatively, the descent trend of the post-strain energy density becomes stable, with a decrease rate of 12% (UA and LTOA2d), 17% (STOA) and 22% (LTOA5d LTOA8d). Ulteriorly, the post-strain energy density of SMA-13 grows slightly, by 50% (UA), 44% (STOA), 25% (LTOA2d) and 35% (LTOA8d), as the test temperature climbs from 10 °C to 20 °C. Furthermore, when the test temperature reaches 30 °C, a sudden drop appears in the post-strain energy density of

SMA-13, with a decrease rate of 23% (UA and STOA), 30% (LTOA2d and LTOA5d) and 47% (LTOA8d). Furthermore, when test temperature rises from 30  $^{\circ}$ C to 40  $^{\circ}$ C, it also decreases more steadily, with a decrease rate of 6% (UA) 2% (STOA), 4% (LTOA2d), 11% (LTOA5d and LTOA8d).

When the aging degree and test temperature both remain the same, the post-peak strain energy density of SMA-13 is higher than that of AC-13, and the value of the gap can reach up to 95% (LTOA8d, 10 °C). The causes of the phenomenon can be explained as follows: There are more coarse aggregates in SMA-13, which provides it with a better skeleton action between coarse aggregates than AC-13. Additionally, a favorable skeleton action can produce a certain hoop effect on asphalt mortar and hinder asphalt mortar from peeling from aggregates [35]. Furthermore, due to the addition of fiber with a superior tensile performance, the fiber in SMA-13 acts as a reinforcement to the effective transfer of stress when exposed to an external load, thus delaying cracking propagation [42]. Therefore, more energy is needed to destroy the structure of SMA-13.

# 3.6. Analysis of CRI and Aging Coefficient

Previous analyses have shown that different conclusions may be drawn when different indicators are used to evaluate the cracking resistance of the asphalt mixture. In order to make up for the defects in single-indicator evaluation, the above four indicators are combined to propose a comprehensive indicator. Table 8 shows the weight of each indicator, calculated by the entropy weight method, and Table 9 shows the calculation results of the entropy weight TOPSIS method.

Table 8. Calculation results of entropy weight of four direct tension test indexes.

Index	Entropy	Entropy Weight
Tensile strength	0.942	0.259
Ultimate strain	0.936	0.286
Pre-peak strain energy density	0.958	0.187
Post-peak strain energy density	0.940	0.268

## Table 9. Calculation results of CRI for AC-13 and SMA-13.

Item	$S_i^+$	$S_i^-$	CRI
SMA13-UA (10 °C)	0.162751	0.108509	0.458683
SMA13-STOA (10 °C)	0.155920	0.116939	0.567867
SMA13-LTOA2d (10 °C)	0.167548	0.102847	0.456206
SMA13-LTOA5d (10 °C)	0.173033	0.100674	0.447181
SMA13-LTOA8d (10 °C)	0.176295	0.100589	0.438167
AC13-UA (10 °C)	0.186440	0.093445	0.447045
AC13-STOA (10 °C)	0.166225	0.129966	0.538652
AC13-LTOA2d (10 °C)	0.175259	0.129923	0.438717
AC13-LTOA5d (10 °C)	0.192069	0.144165	0.412537
AC13-LTOA8d (10 °C)	0.209025	0.154525	0.402688
SMA13-UA (20 °C)	0.136039	0.160869	0.587750
SMA13-STOA (20 °C)	0.128158	0.177350	0.686738
SMA13-LTOA2d (20 °C)	0.130483	0.162080	0.575787
SMA13-LTOA5d (20 °C)	0.153985	0.126742	0.502843
SMA13-LTOA8d (20 °C)	0.172785	0.108632	0.487106
AC13-UA (20 °C)	0.159100	0.110554	0.521773
AC13-STOA (20 °C)	0.152127	0.148879	0.602039
AC13-LTOA2d (20 °C)	0.155233	0.136729	0.500042
AC13-LTOA5d (20 °C)	0.178280	0.127625	0.440272
AC13-LTOA8d (20 °C)	0.189027	0.131564	0.393792
SMA13-UA (30 °C)	0.161795	0.162015	0.491779

Item	$S_i^+$	$S_i^-$	CRI
SMA13-STOA (30 °C)	0.141363	0.168257	0.567763
SMA13-LTOA2d (30 °C)	0.162611	0.115018	0.444624
SMA13-LTOA5d (30 °C)	0.177390	0.100384	0.410339
SMA13-LTOA8d (30 °C)	0.213595	0.053093	0.272547
AC13-UA (30 °C)	0.175088	0.097908	0.414888
AC13-STOA (30 °C)	0.146474	0.127872	0.474235
AC13-LTOA2d (30 °C)	0.191802	0.077588	0.322393
AC13-LTOA5d (30 °C)	0.204788	0.083801	0.278172
AC13-LTOA8d (30 °C)	0.216290	0.087031	0.265904
SMA13-UA (40 °C)	0.175162	0.173909	0.478719
SMA13-STOA (40 °C)	0.161526	0.168348	0.545364
SMA13-LTOA2d (40 °C)	0.182497	0.122690	0.419226
SMA13-LTOA5d (40 °C)	0.191950	0.103701	0.355926
SMA13-LTOA8d (40 °C)	0.226150	0.048751	0.197862
AC13-UA (40 °C)	0.191654	0.153199	0.386046
AC13-STOA (40 °C)	0.171434	0.116590	0.399729
AC13-LTOA2d (40 °C)	0.184130	0.095429	0.296814
AC13-LTOA5d(40 °C)	0.207889	0.060709	0.211021
AC13-LTOA8d (40 °C)	0.241313	0.031141	0.143421

Table 9. Cont.

As shown in Table 8, the CRI of SMA-13 is larger than that of AC-13, suggesting that the former has superior cracking resistance to the latter. The main reason for this is that ultimate strain and post-peak strain energy density are given greater weight among the four indexes, as shown in Table 8. Furthermore, the CRI of AC-13 and SMA-13 under STOA conditions increases by 4–20% and 14–24%, respectively, compared with the unaging condition. The results show that STOA improves the cracking resistance of both AC-13 and SMA-13. In addition, the benefit is weakened with the increase in the test temperature. In contrast, the CRI under LTOA conditions is lower than that under unaging conditions for both AC-13 and SMA13, suggesting that long-term aging weakens their cracking resistance. Furthermore, this weakening effect becomes more pronounced as the test temperature increases.

Figures 13 and 14 depict the aging coefficient results versus test temperature for AC-13 and SMA-13 under different degrees of aging. The aging coefficient is defined as the ratio of CRI under aging conditions compared to that under unaging conditions, which can eliminate the impact of CRI under unaging conditions. Figures 13 and 14 illustrate the aging coefficient versus test temperature for AC-13 and SMA-13, respectively. As shown in Figures 13 and 14, the aging coefficient of SMA-13 is higher than that of AC-13 by 1.4–36% when aging degree and test temperature remain the same, which means that SMA-13 is superior to AC-13 in terms of aging resistance. In addition, for both AC-13 and SMA-13, the aging coefficient under STOA condition is above 1, which demonstrates that STOA can have an increasing effect on the cracking resistance of AC-13 and SMA-13. For AC-13, the aging coefficient increases by 20%, 15%, 13%, 4%, respectively, at 10 °C, 20 °C, 30 °C and 40 °C; for SMA-13, this increases by 24%, 17%, 16%, 14%, respectively, at 10 °C, 20 °C, 30 °C and 40 °C. It is apparent that the increase amplitude of the aging coefficient of SMA-13 is bigger than that of AC-13, which demonstrates that the gaining effect of STOA is more prominent on SMA-13. Furthermore, it is not difficult to determine that the gaining effect can be lowered with the elevation of test temperature.

Under LTOA conditions, the aging coefficient is below 1, and the aging coefficient decreases with the deepening of the degree of aging. This shows that LTOA conditions can have a weakening effect on the cracking resistance, and the weakening effect becomes increasingly prominent with the deepening of aging degree. For AC-13, the aging coefficient decreases by 2–23% (LTOA2d), 7–45% (LTOA5d), 10–63% (LTOA8d). For SMA-13, the aging coefficient decreases by 1–12% (LTOA2d), 2–25% (LTOA5d), 4–59% (LTOA8d). Additionally, the decrease amplitude of the aging coefficient of SMA-13 is smaller than that
of AC-13, which indicates that the weakening effect of LTOA is more prominent on AC-13. Similarly, it is not difficult to find that the gaining effect can be lowered by the elevation of test temperature.



Figure 13. Aging coefficient versus test temperature for AC-13 under different degrees of aging.



Figure 14. Aging coefficient versus test temperature for SMA-13 under different degrees of aging.

Meanwhile, a non-linear surface fitting method was applied to better describe the relationship between the aging coefficient and long-term aging duration and test temperature. Figure 15 and Table 10 depict the corresponding fitting result. The correlation coefficient of the fitting result of AC-13 and SMA-13 is 0.95 and 0.94, respectively, which reveals that the formula that is used can describe the relationship between the aging coefficient and the long-term aging duration and test temperature, where c denotes aging coefficient, d denotes long-term aging duration, and T denotes test temperature.



Figure 15. Non-linear surface fitting graph: (a) AC-13; (b) SMA-13.

Table 10. Non-linear surface fitting result.

Item	Fitting Formula	$R^2$
AC-13 SMA-13	$\begin{split} c &= 0.999 - 0.017d + 0.003T + 0.003d^2 - 9.590 \times 10^{-5}T^2 - 0.002dT \\ c &= 0.976 + 0.038d + 7.414 \times 10^{-4}T - 0.003 + 4.200 \times 10^{-7}T^2 - 0.002dT \end{split}$	0.95 0.94

In conclusion, SMA-13 is superior to AC-13 regarding the cracking resistance when considering different aging degrees and test temperatures. However, in practical engineering, economic cost is a necessary factor to be considered, so a brief cost analysis is given in Table 11. Table 11 shows that the annual expenses are 16.5 RMB·m<sup>-2</sup> for AC-13 pavement; however, they are 11.4 RMB·m<sup>-2</sup> on SMA-13. Apparently, the application of SMA-13 can save costs by 44% when compared with AC-13.

Table 11. Cost calculation of AC-13 and SMA-13 [43].

	Item —		
	Height/cm	4	4
Initial cost/RMB·m <sup>-2</sup>	unit cost/RMB·cm <sup>-1</sup> ·m <sup>-2</sup>	10	12
	Total initial cost/RMB·m <sup>-2</sup>	40	48
	Paving times	3	2
Maintenance	paving cost/RMB·m <sup>-2</sup>	120	96
$\cos(RMB \cdot m^{-2})$	Extra maintenance cost/RMB·m <sup>-2</sup>	100	100
	Total maintenance $cost/RMB \cdot m^{-2}$	220	196
Residu	Residue value/RMB·m <sup>-2</sup>		16
Tota	Total cost/RMB·m <sup>-2</sup>		228
Annual	Annual Total cost/RMB·m <sup>-2</sup>		11.4

## 4. Conclusions

A direct tension test was conducted on two kinds of asphalt mixture (AC-13 and SMA-13) with five degrees of aging (UA, STOA, LTOA2d, LTOA5d and LTOA8d) at different test temperatures (10 °C, 20 °C, 30 °C, 40 °C). The objective is to comprehensively investigate

the effect of aging degree/test temperature/gradation on the cracking resistance of the asphalt mixture. The main findings of this paper are as follows:

- For both AC-13 and SMA-13, the tensile strength gradually ascends as the degree of aging progresses further, but descends as test temperature rises. Additionally, AC-13 has a higer tensile strength than SMA-13. The ultimate strain increases as the degree of aging degree progresses further, but decreases as the test temperature increases. SMA-13 can produce a higher ultimate strain compared with AC-13.
- 2. For both AC-13 and SMA-13, the pre-peak strain energy density increases as the degree of aging progresses further, but goes down as the test temperature increases. SMA-13 can produce a higher ultimate strain than AC-13. STOA conditions can boost the pre-peak and post-peak strain energy density, while LTOA conditions can reduce them. Additionally, the pre-peak and post-peak strain energy density both exhibit a tendency to increase first and then decrease, with their maximum occurring at 20 °C. Moreover, the superiority of SMA-13 lies in the post-peak strain energy density rather than the pre-peak strain energy density.
- 3. In the discussed region of aging degree and test temperature, SMA-13 has a higher CRI and aging coefficient value than AC-13 by 3–69%; this means that SMA-13 is endowed with a better cracking resistance whether it is under aging conditions or not.
- 4. STOA can enlarge the aging coefficient of the asphalt mixture, which means that STOA can increase cracking resistance even under aging conditions. Additionally, this positive effect can be weakened by an elevation in test temperature. LTOA can lower the aging coefficient, which indicates that LTOA can weaken the cracking resistance and the lowering effect can be boosted by elevations in the test temperature
- 5. The relationship between aging coefficient and the two factors (aging degree and test temperature) can be reflected by the functional expression of the non-linear surface ( $R^2 = 0.95$  for AC-13 and  $R^2 = 0.94$  for SMA-13).

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Article



# Laboratory Test and Constitutive Model for Quantifying the Anisotropic Swelling Behavior of Expansive Soils

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Abstract: Expansive soils exhibit directionally dependent swelling that traditional isotropic models fail to capture. This study investigates the anisotropic swelling characteristics of expansive soil with a medium swelling potential through the use of modified oedometric testing. Vertical swelling strains can reach up to 1.71 times that of the horizontal movements, confirming intrinsic anisotropy. A nonlinear elastic constitutive model incorporates vertical and horizontal elastic moduli with respect to matric suction to characterize anisotropy. Three elastic parameters were determined through the experiments, and predictive equations were developed to estimate the unsaturated moduli. The constitutive model and predictive techniques provide practical tools to better assess expansive soil pressures considering anisotropy, offering guidelines for utilization and design. The outcomes advance understanding of these soils' directionally dependent behavior and stress–strain–suction response.

Keywords: road engineering; constitutive model; swelling test; expansive soil; support structure

## 1. Introduction

Expansive soils are problematic soils that cause significant damage to infrastructure due to their shrinkage and swelling behavior influenced by changes in moisture content [1]. These soils contain high percentages of clay minerals such as smectite that have the capacity to absorb water into their crystalline structure [2]. Approximately 26 provinces in China contain expansive soils, posing major challenges for transportation and construction projects [3,4].

Expansive soils traditionally excavated from construction sites have been treated as construction and demolition waste and replaced with more engineered fill materials [5]. However, this practice is unsustainable and results in higher costs and environmental impacts from spoil disposal [6]. Recently, there has been a shift towards directly reusing expansive soils as pavement subgrades or engineered fill soils where feasible [7–9]. While this approach offers economic and sustainability benefits, it necessitates a deeper understanding of the mechanical behavior and earth pressure development characteristics of expansive soils, particularly under unsaturated conditions.

When expansive soils absorb moisture, either from rainfall infiltration or rising groundwater levels, they undergo significant volumetric expansion, commonly known as swelling. This process creates vertical swelling pressures that can damage shallow foundations and raise structures from their supporting soils. Additionally, it exerts lateral pressures against

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Copyright: © 2024 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). retaining walls, basements, and other structures, leading to structural cracking and failures if not adequately considered in their design [10]. Conversely, during dry periods, expansive soils shrink, contributing to differential settlement issues [11]. Therefore, there is a need to evaluate the swelling behavior of expansive soil and accurately estimate the earth pressure exerted by expansive soil against retaining structures, which is crucial for analyzing slope stability and designing retaining structures in expansive soil areas.

Previous research has primarily focused on characterizing the swelling behavior and stress–strain response of expansive soils through laboratory testing and constitutive modeling. Various empirical and mechanistic models have been developed to describe the volume change phenomena of expansive clays, capture hydromechanical coupling behavior, and enable numerical analysis and design applications [12–14]. For instance, Fredlund's model [15] is popular due to its simplicity, as it relates stress and strain conditions to net stress and matric suction states. The highlights are also focused on the acquisition and prediction of the elastic modulus [16,17]. However, many traditional models assume that expansive soils exhibit isotropic mechanical properties despite evidence that anisotropy is intrinsic to their fabric and swelling at the microstructural scale. The directional arrangement of clay minerals is known to influence the development and magnitude of swelling strains and pressures.

Recent studies have observed distinct anisotropic characteristics between vertical and horizontal swelling of intact expansive soil specimens [18–20]. From the microstructure analysis, flaky clay particles within expansive soils are inclined to orient horizontally after compaction; this preferred orientation phenomenon becomes more apparent with an increase in static pressure, consequently leading to significant differences in swelling behavior [21]. Several researchers have developed experimental methods for determining lateral swelling pressure by modifying traditional oedometer and hydraulic triaxial apparatus [22–26]. By using the modified oedometer apparatus, researchers have consistently found that measured lateral pressures exceed those in the vertical direction under inundation conditions. Additionally, the ratio of swelling pressure in the vertical and lateral directions varies with the surcharge, moisture, and density of the soil specimens [27,28]. This inherent material anisotropy is not fully considered in common isotropic constitutive formulations. Simplified elastic analysis of earth pressures acting on retaining walls may produce non-conservative estimates if true directional deformation behavior is not properly characterized.

The objective of this paper was to experimentally investigate the anisotropic swelling properties of problem expansive soil from southern China and develop a model that can reliably predict lateral earth pressures during wetting based on laboratory-calibrated parameters. A modified unsaturated consolidation testing method was devised to isolate vertical and horizontal swelling responses under controlled stress states. The test results were then used to determine the parameters for a proposed anisotropic elastic model featuring separate elastic moduli for the vertical and horizontal directions. Simple normalization techniques were applied to extend the model for use under varying degrees of saturation. Finally, the model was validated through a comparison of the estimated and measured lateral pressure development curves from consolidation testing. The proposed approach aims to advance practical analysis and design involving expansive soils considering directionally dependent swelling behavior.

## 2. Materials and Methods

#### 2.1. Materials

The expansive soil used in this study was collected from a site (23°48′11″ N, 106°43′11″ E) along the Longlin–Baise Expressway in Baise, Guangxi Zhuang Autonomous Region, China. Index property tests were conducted to characterize the soil, and the results are shown in Table 1. Atterberg limits testing resulted in a liquid limit of 56.3% and a plastic limit of 21.4%, corresponding to a plasticity index of 34.9%. Particle size analysis revealed that the

soil contained 47.9% clay-sized particles (<0.002 mm). X-ray diffraction analysis quantified the mineralogy as being 16.6% smectite, 22% illite, 24% kaolinite, and 1% chlorite.

Description	$w_L$ (%)	$I_P$	$G_s$	Sand (%)	Silt (%)	Clay (%)	USCS	MDUW (kN/m <sup>3</sup> )	OMC (%)
Expansive soil	56.3	34.9	2.75	0	52.1	47.9	СН	17.2	17.9

Table 1. Index properties of the testing soil.

Note:  $w_L$ : liquid limit;  $I_P$ : plasticity index;  $G_s$ : specific gravity; USCS: unified soil classification system; MDUW: maximum dry unit weight; and OMC: optimum moisture content.

Standard Proctor compaction tests were carried out following the requirement of American Society for Testing Materials (ASTM) [29] to determine the maximum dry unit weight (MDUW) and optimum moisture content (OMC) of the soil. Three specimens were compacted and tested at varying moisture levels, resulting in an MDUW of 17.2 kN/m<sup>3</sup> at an OMC of 17.9%. Free swell index tests indicated that the soil exhibited medium swelling potential according to Highway Engineering Geological Investigation (JTG C20-2011) [30].

#### 2.2. Testing Method

A modified oedometer testing method was developed to capture the directionally dependent swelling behavior of the expansive soil. An automated unsaturated consolidation (UC) apparatus was constructed, incorporating controlled vertical load, lateral confinement, matric suction, and real-time displacement and pressure monitoring capabilities. The apparatus is illustrated in Figure 1.

The apparatus comprised several integrated subsystems within a rigid reaction frame. At the base, a consolidated drained pressure chamber housed a high air-entry value ceramic disk (HAEV disk), which was designed to apply and measure the air and water pressures independently. Digital pressure transducers integrated in the air and water pump with  $\pm 1$  kPa accuracy can regulate the air (0–500 kPa) and water (0–50 kPa) pressures, and a pressure transducer with  $\pm 1$  kPa accuracy was equipped on the loading rod connected to the reaction frame to control the vertical load (0-500 kPa) applied through the reaction frame and the vertical movement of the pressure chamber. Extensive drainage lines and outlet valves facilitated the saturation of the disk and equipment using a Mariotte bottle, as well as water delivery and bubble flushing. A pressure regulator maintained a low upward gradient (<50 kPa) to remove bubbles and ensure the full saturation of the HAEV disk. The saturated HAEV disk then acted as an air-water interface, transmitting pore-water stresses to the specimen above. During testing, the water pressure always remains constant at 40 kPa to accelerate the saturation of the HAEV disk and ensure an unobstructed water supply path. After the vertical load ( $\sigma_v$ ), air pressure ( $u_a$ ), and water pressure ( $u_w$ ) were all applied in the pressure chamber, and the soil specimen was ready to be inundated under the given net normal stress ( $\sigma_v - u_a$ ) and matric suction ( $u_a - u_w$ ). The linear variable displacement transducer (LVDT) for measuring axial strains was mounted on the loading rod and bracketed to the top of the pressure chamber, enabling precise measurements of the axial strains to a precision of  $1 \times 10^{-3}$  mm. Fine threaded rods connected the components and provided adjustability. Signals from the transducers interfaced with a data acquisition system, recording the pressures, vertical displacement, air pressures, and water pressures. Considering the fact that the permeability of expansive soil is extremely small, which results in quite a long period of time to achieve suction equilibrium, the frequency of the recording was set to 5 min intervals. The benchmark for the determination of suction equilibrium was also set as the changes in the readings for lateral pressure and vertical displacement were <1 kPa and 0.010 mm, respectively.

A significant innovation was the integration of a "retractable ring" device for the lateral confinement of the soil specimens during testing. As depicted in Figure 2, it consisted of a stainless steel ring with a 61.8 mm inner diameter and 30 mm height, housing a miniature pressure transducer (0–1000 kPa,  $\pm 1$  kPa accuracy), thin acrylic spacer, and a curved plate.

An adjustable tightening mechanism joined the halves of the ring, enabling it to close down in discrete steps to maintain the laterally confined state. After assembling, the retractable ring, which contained the loading piston, porous stone, specimen, and lateral miniature pressure transducer component, was positioned above the HAEV disk in the pressure chamber, as shown in Figure 1.





Figure 1. A (a) schematic view and (b) photo of the modified UC oedometer.



Figure 2. Schematic view of the retractable ring.

Extensive trials were conducted to calibrate the transducer readings and establish an optimal ring closure protocol. As depicted in Figure 3, the lateral pressure generated during the expansion of the specimen can be simulated by a controlled vertical load. Therefore, the calibration process started with a customized "T"-shaped loading frame, as shown in Figure 3a, which can be connected to the threaded loading head of the force gauge through a threaded hole in its upper part. The pressure would be gradually applied to the loading frame by the force gauge and transmitted through the curved plate and thin acrylic spacer to the miniature pressure transducer. The deformation is then monitored by two displacement gauges placed on both sides of the loading frame. Finally, the real-time readings of deformations and pressures are entered into the software interface (Ver 1.0) via displacement and pressure data loggers, respectively. It was observed that maintaining lateral stresses 2–3 kPa higher than the bulk stress state ensured reliable contact while minimizing boundary effects.



Figure 3. Calibration of the retractable ring for the (a) process and (b) result.

In addition, as shown in Figure 3b, the maximum deformation obtained was 0.021 mm when the miniature pressure transducer reached the full scale of 600 kPa for the force gauge. Based on a specimen diameter of 61.8 mm, it can be calculated that the maximum radial strain is 0.032%, which is less than the requirement of the ASTM standard [31], which states that the maximum radial change in the ring should not be greater than the original diameter of 0.04% to achieve the  $K_0$  condition. In addition, the influence of air pressure on the miniature pressure transducer was also considered. In the subsequent laboratory tests, the maximum value of the applied matric suction was set to 200 kPa; therefore, in the calibration process, the water pressure applied by the pump was always kept constant at 40 kPa, and the air pressure applied by the air pump ranged from 40 to 240 kPa to ensure that the formation of matric suction was in the range of 0–200 kPa. The results show that the readings of the miniature pressure transducer remained unchanged whether the air pressure was reduced from 240 kPa to 0 or increased from 0 to 240 kPa, which indicates that the effect of air pressure on the miniature pressure transducer in this study could be negligible.

Considering the disturbance and loss of moisture content during the transportation of the soil samples retrieved from the field, the specimens prepared in this way can no longer reflect the actual situation in the field. Therefore, remodeled soil samples were used in this study, and the pre-specimens were prepared in the manner of layered static compaction to approximate the layering phenomenon produced via the deposition of the original samples in the field. Specimen preparation involved drying, grinding, and sieving before compacting the samples under predetermined conditions. The expansive soil samples from the field were first dried in the oven at 105 °C, then ground to powder and passed through a sieve with a diameter of 2 mm. Subsequently, the samples were stored in a sealed plastic bag in the shade for at least 24 h. In addition, the expansive soils should be passed through

the 2 mm sieve once more before specimen preparation since expansive soil easily clots after being mixed with distilled water.

The specimens were all prepared at an initial moisture content of 18.0% and a dry unit weight of  $16.0 \text{ kN/m}^3$ . Specimen homogenization entailed the static compaction of the prepared wet soil within a custom cube mold at each 10 mm layer. The compacted "pre-specimens" were extruded and vertically cut or rotated 90° prior to sampling for oedometer vertical swelling (OVS) or horizontal swelling (OHS) tests, respectively. As depicted in Figure 4, the modified preparation approach orientates clay mineral flakes differently to reflect field conditions.





For the OHS tests, the pre-specimens were initially rotated 90° prior to coring. This modification oriented the platy clay structure differently to induce intrinsic anisotropy. The extracted specimens were then carefully positioned within the retractable ring for confinement during testing. Trimming and greasing of sample surfaces were carried out to minimize the effects of side friction.

A consistent test procedure was followed for all series under varying net normal stress conditions (Table 2). The initial matric suction of the specimens was measured as 500 kPa using the filter paper method before being gradually reduced in staged equilibrium steps. Vertical swelling displacements, lateral confining pressures, and equilibrium times were recorded, with pressure transducers monitoring net stresses.

Туре	Test ID	Dry Unit Weight (kN/m <sup>3</sup> )	Moisture Content (%)	Net Normal Stress $\sigma_v - u_a$ (kPa)	Matric Suction $u_a - u_w$ (kPa)
	OVS-0			0 12 5	
OVS	OVS-25			25	
	OVS-50			50	
	OVS-100	16.0	19.0	100	200 \ 100 \ 50 \ 20 \ 10 \ 5 \ 0
	OHS-0	10.0	10.0	0	$200 \rightarrow 100 \rightarrow 50 \rightarrow 20 \rightarrow 10 \rightarrow 5 \rightarrow 0$
	OHS-12.5			12.5	
OHS	OHS-25			25	
	OHS-50			50	
	OHS-100			100	

Table 2. Summary of testing program conditions.

Each test series was conducted under constant net normal stress and followed the same decreasing matric suction path. For instance, OHS-12.5 denoted an OHS test series conducted with a net normal stress of 12.5 kPa, and  $50 \rightarrow 20$  indicated that the controlled matric suction decreased from 50 kPa to 20 kPa. Furthermore, the compressed vertical strain of the specimen manifested once a certain net normal stress was applied, leading to the complete alteration of the initial volume and dry unit weight of the tested specimen. Therefore, the matric suction level of 500 kPa was not included, and the matric suction was initiated at 200 kPa.

Upon the completion of swelling under a given suction, the stresses were adjusted to maintain net stress while further lowering suction. The tests were terminated once specimens were fully saturated. This testing program generated a robust anisotropic stress–strain–suction dataset for characterizing soil behavior and developing constitutive models.

#### 3. Experimental Results

The testing program produced a comprehensive dataset that characterizes the anisotropic swelling behavior of the expansive soil under varying stress conditions. Here, we present the key findings from the analysis of vertical swelling strain and lateral pressure responses measured across a range of controlled suction reductions.

Figure 5a illustrates the variations in the vertical swelling strain with matric suction reduction observed across all net normal stress conditions for the OVS and OHS test series. Several consistent trends were observed. Firstly, the swelling strains increased with decreasing suction as the soil moisture content rose for both test orientations. This behavior is consistent with the typical mechanisms of expansive soils gaining volume as water enters the diffused double layer of smectite clay plates.





Secondly, the strains in the vertical direction were significantly larger compared to the horizontal direction. At full saturation under zero net stress, the maximum vertical swell measured 8.54% in OVS, whereas only 4.99% horizontal swell occurred in the OHS tests. The vertical swelling strain in OVS was about 1.71 times that in OHS. This confirms the presence of intrinsic anisotropy, where clays expand more readily out of the plane of their layered structure due to the influence of depositional packing and consolidation stresses.

Thirdly, higher net normal stresses resulted in reduced vertical swell strains as confinement restricted volume changes. However, strains progressively increased with desaturation across all stress conditions, indicating a complex interaction between the applied stresses and changing suction states.

Figure 5b illustrates the variations in the measured lateral confining pressure with suction reduction. Once again, suction decreases induced growing pressures across all test series as soil expansive forces developed against the constant lateral confinement. Peak pressures often occurred within the initial high suction range above 50 kPa as the volume occupied by the adsorbed water layers increased the thicknesses of the diffused double layers.

Interestingly, lateral pressures exhibited the opposite behavior to vertical strains, with higher initial responses developing under elevated net stresses. For instance, maximum pressures of 44.7 kPa and 70.0 kPa were obtained at full saturation under zero net stress for OVS and OHS tests, yet these grew substantially larger under confinement. This confirms that confinement amplifies both vertical and lateral swelling capacities through stress-suction coupling effects. In addition, it should also be noted that the lateral pressures measured under zero net stress can be seen as pure swelling pressure, where the swelling pressure in the vertical direction (OHS-0) was 1.57 times that in the horizontal direction (OVS-0), also demonstrating an obvious swelling anisotropy as with swelling strain.

Notably, the OHS tests consistently produced higher lateral pressures than OVS runs across all suction–stress conditions, highlighting the greater development of expansive forces in the horizontal direction related to microstructural anisotropy.

In summary, the test results clearly demonstrated that the expansive soil exhibits anisotropic volumetric swelling strongly influenced by the stress state, moisture condition, and orientation of the layered mineral structure. These behaviors have significant implications for properly assessing and accommodating earth and swelling pressures in geostructure designs situated within expansive ground.

#### 4. Developed Constitutive Model

### 4.1. Constitutive Model Expression

In a previous study, it was noted from the experimental results that the relationship between stress and strain could be considered an elastic process when the surcharge ranges from zero to the vertical swelling pressure measured under constant volume conditions [10]. The measured vertical swelling strain and lateral pressure under certain surcharges with saturated conditions were found to be quite close during the loading and unloading process [32]. Additionally, the earth pressure of unsaturated expansive soil would mobilize due to matric suction changes after rainfall. This single swelling process differs from the drying and wetting cyclical process, which can be regarded and assumed to be an elastic behavior. Therefore, to analyze the earth pressure of unsaturated expansive soil acting on a vertical retaining wall and investigate the mobilization of earth pressure distribution from the initial state to the saturation state, the interaction between the unsaturated expansive soil and the vertical retaining wall was simplified and regarded as a two-dimensional elastic problem.

Modifications were made to Fredlund's isotropic elastic model to characterize the anisotropic swelling behavior of expansive soil. The elastic modulus with respect to matric suction (H) was modified to consider two elastic moduli with respect to matric suction ( $H_v$  and  $H_h$ ) in the vertical and horizontal directions, respectively. For simplicity, the elastic modulus with respect to net normal stress E was still considered isotropic. Therefore, the three-dimensional nonlinear elastic model can be further simplified as follows:

$$\begin{cases} d\varepsilon_h = \frac{d(\sigma_h - u_a)}{E} - \frac{\mu}{E} d(\sigma_h + \sigma_v - 2u_a) + \frac{ds}{H_h} \\ d\varepsilon_v = \frac{d(\sigma_v - u_a)}{E} - \frac{\mu}{E} d(\sigma_h + \sigma_h - 2u_a) + \frac{ds}{H_n} \end{cases}$$
(1)

where  $\varepsilon_v$  and  $\varepsilon_h$  are the vertical and horizontal strain, respectively, in %; ( $\sigma_v - u_a$ ) and ( $\sigma_h - u_a$ ) are the vertical and horizontal net normal stress, respectively, in kPa;  $\mu$  is the Poisson ratio; *s* is the matric suction,  $s = u_a - u_w$ , kPa; *E* is the elastic modulus with respect to net normal stress, in kPa; and  $H_v$  and  $H_h$  are the vertical and horizontal elastic moduli with respect to matric suction, respectively, in kPa.

## 4.2. Constitutive Parameters

In comparison with the original model, this modified constitutive model includes three elastic moduli, E,  $H_v$ , and  $H_h$ , all of which can be determined through modified unsaturated consolidation tests. In the modified unsaturated consolidation test, the specimen is subjected to constant net normal stress and gradually reduced matric suction, while always being subjected to lateral confinement, as shown in Figure 6.





Assuming that the direction of the swelling is positive, Stage I demonstrates the stress state changes that occur in the soil elements of the specimen swelled under zero net normal stress from its initial matric suction to a specific matric suction level with lateral confinement. The lateral confining pressure without certain net normal stress is generated in the horizontal direction, and the maximum vertical swelling strain occurs in the vertical direction. The constitutive relationship at Stage I can be derived from Equation (1) and described by Equation (2):

$$\begin{cases} 0 = \frac{\mu - 1}{E} d(\sigma_{h0} - u_a) + \frac{ds}{H_h} \\ d\varepsilon_{mv} = \frac{2\mu}{E} d(\sigma_{h0} - u_a) + \frac{ds}{H_v} \end{cases}$$
(2)

$$d(\sigma_{h0} - u_a) = \frac{E}{(1 - \mu)H_h} ds,$$
(3)

$$\mathrm{d}\varepsilon_{mv} = \frac{2\mu}{1-\mu} \cdot \frac{\mathrm{d}s}{H_h} + \frac{\mathrm{d}s}{H_v},\tag{4}$$

where  $\sigma_{h0}$  is the lateral confining pressure without certain net normal stress, and  $\varepsilon_{mv}$  is the maximum vertical swelling strain.

Equations (3) and (4) are derived by solving the previously derived equations to estimate the lateral confining pressure without certain net normal stress and the maximum vertical swelling strain at Stage I. The lateral confining pressure actually corresponds to the lateral swelling pressure associated with free swelling without certain net normal stress. In Stage II, the stress state changes occur in the soil elements of the specimen swelled under certain net normal stress from its initial matric suction to a specific matric suction level with lateral confinement. The lateral confining pressure under certain net normal stress is generated in the horizontal direction, and the vertical swelling strain under certain net normal stress occurs in the vertical direction. The constitutive relationship at Stage II can also be derived from Equation (1) and described by Equation (5):

$$\begin{cases} 0 = \frac{\mu - 1}{E} d(\sigma_h - u_a) + \frac{\mu}{E} d(\sigma_v - u_a) + \frac{ds}{H_h} \\ d\varepsilon_v = -\frac{d(\sigma_v - u_a)}{E} + \frac{2\mu}{E} d(\sigma_h - u_a) + \frac{ds}{H_v} \end{cases}$$
(5)

$$\mathbf{d}(\sigma_h - u_a) = \frac{\mu}{1 - \mu} \mathbf{d}(\sigma_v - u_a) + \frac{E}{(1 - \mu)H_h} \mathbf{d}s,\tag{6}$$

$$d\varepsilon_{v} = -\frac{(1-\mu-2\mu^{2})d(\sigma_{v}-u_{a})}{(1-\mu)E} + \frac{2\mu}{1-\mu} \cdot \frac{ds}{H_{h}} + \frac{ds}{H_{v}},$$
(7)

Comparing Equation (3) with Equation (6) and Equation (4) with Equation (7), it can be observed that these two pairs of equations have similar forms, with the difference being the presence of vertical net normal stress. In terms of elasticity, it can be understood that a vertical net normal stress ( $\sigma_v - u_a$ ) is further loaded on the top of the specimen at Stage I. Under its influence, the vertical swelling strain decreases from the maximum value to the vertical swelling strain under surcharge, and the horizontal confining pressure generated in Stage I would further experience an increment and increase to ( $\sigma_h - u_a$ ). During this period, the increment of matric suction is zero, namely ds = 0. The constitutive relationships from Stage I to Stage II can be described using Equation (8).

$$\begin{cases} 0 = \frac{\mu - 1}{E} d(\sigma_h - \sigma_{h0}) + \frac{\mu}{E} d(\sigma_v - u_a) \\ d(\varepsilon_v - \varepsilon_{mv}) = -\frac{d(\sigma_v - u_a)}{E} + \frac{2\mu}{E} d(\sigma_h - \sigma_{h0}) \end{cases}$$
(8)

$$E = \frac{(1 - \mu - 2\mu^2) \mathbf{d}(\sigma_v - u_a)}{(1 - \mu) \mathbf{d}(\varepsilon_{mv} - \varepsilon_v)},\tag{9}$$

where  $(\varepsilon_v - \varepsilon_{mv})$  represents the reduction in vertical strain resulting from net normal stress.

Equation (9) is derived from Equation (8) to estimate the elastic modulus (*E*) with respect to the net normal stress. Once the net normal stress is loaded onto the specimen, it remains constant. Thus, the increment in net normal stress is zero, namely  $d(\sigma_v - u_a) = 0$ . The first term on the right-hand side of Equation (7) equals zero, rendering this equation identical to Equation (4). This indicates that the vertical swelling strain of the unsaturated expansive soil is due to a moisture increment consisting of two parts. In addition to the vertical strain resulting from the change in matric suction itself, the lateral swelling strain would also occur if it were not laterally confined. The lateral confinement results in the representation of this part in the vertical direction. However, as mentioned in Section 2.2, the maximum radial strain of the oedometer ring is 0.032%. Therefore, the latter part could be extremely small compared to the previous part and can be ignored. Hence, the vertical swelling strain in OVS ( $\varepsilon_{v,OVS}$ ) and the vertical swelling strain in OHS ( $\varepsilon_{v,OHS}$ ) can be described as shown in Equation (10):

$$\begin{cases}
d\varepsilon_{v,OVS} = \frac{ds}{H_v} \\
d\varepsilon_{v,OHS} = \frac{ds}{H_b}
\end{cases}$$
(10)

$$H_v = \frac{\mathrm{d}s}{\mathrm{d}\varepsilon_{v,OVS}},\tag{11}$$

$$H_h = \frac{\mathrm{d}s}{\mathrm{d}\varepsilon_{v,OHS}},\tag{12}$$

Equations (11) and (12) are derived from Equation (10) to estimate the vertical and horizontal elastic moduli ( $H_v$  and  $H_h$ ) with respect to matric suction, respectively. For the determined unsaturated expansive soil, the change in vertical swelling strain is caused by the coupling effect of the net normal stress and matric suction. These three elastic parameters are all influenced by the changes in net normal stress and matric suction, demonstrating the nonlinear elastic behavior during wetting. However, Equation (9) would be invalid if the soil is inundated without vertical net normal stress, whereas the elastic modulus should be a property of the material itself. Although it may change under the influence of external factors (stress state and boundary conditions, etc.), it should always have an initial value. Equation (9) would need to be further modified based on the test results to estimate the E without the net normal stress.

Furthermore, Poisson's ratio is also essential for the constitutive model. Unsaturated expansive soil undergoes significant volume changes after saturation, leading to substantial changes in dry density. Soils with smaller dry densities are more likely to deform, and those with larger Poisson ratios are more susceptible to this deformation. However, recent standards do not provide methods for measuring the Poisson's ratio of unsaturated soils, nor do they specify the size of specimens and the testing conditions of stress and strain that are required for determining Poisson's ratio. In engineering practice, Poisson's ratio is often assumed to be a constant value. The suggested range of values for Poisson's ratio ranges from 0.2 (dry sand) to 0.5 (saturated clay tested under undrained conditions) [10,33].

## 5. Determination of the Elastic Parameters

## 5.1. Elastic Modulus with Respect to Net Normal Stress

The elastic modulus with respect to the net normal stress (E) characterizes the compressibility of the soil skeleton. It is required as a parameter within the proposed constitutive model relating stress–strain responses under changing net normal stresses or suction conditions.

As mentioned above, both the denominator and the numerator on the right-hand side of Equation (9) would become zero when no net normal stress is loaded, rendering it unable to estimate the elastic modulus *E* in this state. The elimination method can be carried out if there is a certain relationship between the denominator and the numerator. Figure 7 illustrates the variation curves of the denominator ( $\varepsilon_v - \varepsilon_{mv}$ ) with respect to the numerator ( $\sigma_v - u_a$ ).



**Figure 7.** Variation curves of  $(\varepsilon_{mv} - \varepsilon_v)$  to  $(\sigma_v - u_a)$ .

Figure 7 indicates that under the condition of constant matric suction, the increase in  $(\varepsilon_{mv} - \varepsilon_v)$  gradually increased with the increase in  $(\sigma_v - u_a)$ , and the increment gradually decreased, tending to stabilize. The stress–strain relationship can be fitted in the form of a hyperbolic function, as shown in Equation (13). Table 3 shows that parameters *a* and *b* exhibited a strong correlation >0.95, validating the approach.

$$\varepsilon_{mvi} - \varepsilon_{vi} = \frac{a(\sigma_{vi} - u_a)}{1 + b(\sigma_{vi} - u_a)},\tag{13}$$

where *a* and *b* are the fitting parameters.

а	b	$R^2$
0.0008	0.0524	0.9914
0.0014	0.0532	0.9908
0.0020	0.0545	0.9501
0.0039	0.0779	0.9829
0.0052	0.0882	0.9792
0.0067	0.0981	0.9814
0.0088	0.1070	0.9906
	<i>a</i> 0.0008 0.0014 0.0020 0.0039 0.0052 0.0067 0.0088	a         b           0.0008         0.0524           0.0014         0.0532           0.0020         0.0545           0.0039         0.0779           0.0052         0.0882           0.0067         0.0981           0.0088         0.1070

Table 3. Fitting results of Equation (13).

Substituting Equation (13) into Equation (9):

$$E = \frac{(1 - \mu - 2\mu^2)}{(1 - \mu)a/[1 + b(\sigma_{vi} - u_a)]},$$
(14)

Comparing Equation (14) with Equation (9), Equation (14) is still valid in terms of estimating the elastic modulus *E* even in the absence of a vertical net normal stress. A series of elastic moduli E under different net normal stresses and matric suctions was estimated using Equation (14).

Figure 8 shows the variations in the calculated *E* values with changing net normal stress and suction states. Several trends were observed. *E*, with respect to net normal stress, decreased as matric suction decreased, showing a rapid reduction when the matric suction exceeded 20 kPa under a net normal stress of 50–100 kPa, while it gradually slowed down as the soil became increasingly saturated. With the decrease in net normal stress, the rapid reduction in *E* disappeared. Furthermore, under low net normal stress, matric suction had less impact on *E* than net normal stress. With an increase in net normal stress, the elastic modulus *E* under the same matric suction also increased, indicating that the influence of matric suction on *E* became much stronger. At the same matric suction level, a higher net normal stress led to a greater *E*. These results also highlight the fact that unsaturated expansive soil under low matric suction is more prone to deformation under external loads, and higher external loads enhance its resistance to deformation.



Figure 8. Variations in the elastic modulus *E* with different net normal stresses and suction states.

#### 5.2. Elastic Modulus with Respect to Matric Suction

The elastic modulus with respect to matric suction reflects compressibility induced solely by suction changes independent of net stress effects. Both vertical ( $H_v$ ) and horizontal ( $H_h$ ) moduli were estimated to capture swelling anisotropy.

Equations (11) and (12) were applied to OVS and OHS test data to back-calculate  $H_v$  and  $H_h$ , respectively, from the slopes of the swelling strain–suction curves. Figure 9 presents the variations in the calculated  $H_v$  and  $H_h$  with suction reduction over different net normal stress levels.

Matric suction significantly influences the moduli of  $H_v$  and  $H_h$ . As matric suction decreases, both moduli monotonically decrease, with varying degrees of reduction for  $H_v$ and  $H_h$ . The moduli of  $H_v$  and  $H_h$  are relatively large when the matric suction is high, as the change in matric suction during this period does not significantly lead to changes in soil volume. Additionally, net normal stress also affects these moduli. Under the same matric suction, specimens subjected to higher net normal stresses have a larger elastic modulus than matric suction. This indicates that greater net normal stress leads to smaller swelling strain and larger swelling pressure. Consequently, the lateral swelling pressure, like the vertical swelling pressure, increases with net normal stress. The disparity between  $H_v$  and  $H_h$  can be considered a representation of swelling anisotropy on a macro scale.



**Figure 9.** Variation curves of (**a**)  $H_v$  and (**b**)  $H_h$  with different matric suctions.

Notably, the moduli  $H_h$  exceeded  $H_v$  across all conditions, reflective of preferential horizontal restraint against intrinsically weaker lateral swelling. This separation quantifies the microstructural anisotropy manifestation in macroscopic stress–strain terms.

#### 5.3. Prediction Method for Unsaturated Elastic Modulus

All of the elastic moduli calculated above are tangent moduli, regardless of whether they are *E* or *H*, while the calculation of lateral swelling pressure or lateral pressure is based on an incremental method, according to Equations (3) and (6). Therefore, in order to predict the unsaturated elastic modulus under certain net normal stress and matric suction states, the normalization of *E* by saturated *E* magnitude ( $E_{sat}$ ) was subsequently performed, collapsing the data onto consistent power functions of normalized suction (Figure 10). The correlation coefficients exceeded 0.98, allowing predictive Equation (15) to estimate  $E_{unsat}$ from known saturated conditions. The values of the fitting parameters and their correlation coefficients are shown in Table 4. This simple expression captures modulus evolution, which is important for constitutive modeling.

$$E_{unsat} = E_{sat} \left[ 1 + \alpha \left( \frac{s}{s_0} \right)^{\beta} \right], \tag{15}$$

where  $\alpha$  and  $\beta$  are fitting parameters, and  $s_0$  is the initial matric suction of the soil.



**Figure 10.** Normalization fitting curves of  $E_{unsat}/E_{sat}$  to  $s/s_0$ .

The unsaturated modulus with respect to matric suction can be predicted in the same way. To normalize the data, Figure 11 plots  $H_{vunsat}/H_{vsat}$  and  $H_{hunsat}/H_{hsat}$  versus  $s/s_0$ , collapsing onto single best-fit power curves, as per Equation (16). The values of the fitting parameters and their correlation coefficients are shown in Table 5. Very strong correlations (more than 0.99) affirmed the predictability of this expression in terms of estimating the unsaturated elastic modulus  $H_{unsat}$  from the saturated conditions.

$$H_{unsat} = H_{sat} \left[ 1 + \lambda \left( \frac{s}{s_0} \right)^{\eta} \right], \tag{16}$$

where  $\lambda$  and  $\eta$  are the fitting parameters.



**Figure 11.** Normalization curves of (a)  $H_{vunsat}/H_{vsat}$  to  $s/s_0$  and (b)  $H_{hunsat}/H_{hsat}$  to  $s/s_0$ . **Table 4.** Fitting results between  $E_{unsat}/E_{sat}$  and  $s/s_0$ .

Net Normal Stress (kPa)	α	β	$R^2$
0	102.502	0.747	0.9851
12.5	19.224	0.904	0.9983
25	13.227	0.873	0.9986
50	11.047	0.866	0.9982
100	10.640	0.864	0.9960

Net Normal Stress		$H_v$			$H_h$	
(kPa)	λ	η	R <sup>2</sup>	λ	η	$R^2$
0	5050.221	1.648	0.9997	4518.053	1.673	0.9990
12.5	3694.508	1.646	0.9995	3750.679	1.710	0.9991
25	3479.687	1.567	0.9993	3232.893	1.502	0.9999
50	4396.977	1.694	0.9990	4553.960	1.712	0.9994
100	4229.299	1.585	0.9997	3393.036	1.676	0.9989

**Table 5.** Fitting results between  $H_{unsat}/H_{sat}$  and  $s/s_0$ .

Moreover, it was observed that the datasets in Figure 11a,b were quite close to each other after normalization; hence, united fitting based on all of the datasets was further performed, and the fitting results show that the correlation coefficient is 0.9777, where the fitting parameter of  $\lambda$  is 4012.631 and  $\eta$  is 1.639, respectively. For convenient use in practical engineering applications, the united fitting method is recommended in the prediction of the unsaturated elastic modulus  $H_{\text{unsat}}$ .

The implementation of the proposed methods provides a practical means for determining the anisotropic expansive soil compressibility represented by  $H_{unsat}$ , which is a critical parameter within the constitutive framework for improved unsaturated expansive soil analyses.

## 6. Validation of Lateral Pressure Estimation

To evaluate the proposed techniques, lateral pressure estimations using the constitutive model were compared against experimental OVS and OHS test measurements. To further validate the anisotropy consideration, additional predictions were carried out treating  $H_v$  and  $H_h$  as equal (isotropic assumption) rather than directionally dependent, namely Fredlund's nonlinear elastic model. Table 6 summarizes the parameter values obtained for input from the analyses presented in Sections 4 and 5.

Net Normal Stress (kPa)	E <sub>sat</sub> (kPa)	H <sub>vsat</sub> (kPa)	H <sub>hsat</sub> (kPa)	H <sub>isosat</sub> (kPa)	α	β	$\lambda_v$	$\eta_v$	$\lambda_h$	$\eta_h$
0	12	12	20	34	102.502	0.747	5050.221	1.648	4518.053	1.673
12.5	134	24	31	55	19.224	0.904	3694.508	1.646	3750.679	1.710
25	261	47	52	97	13.227	0.873	3479.687	1.567	3232.893	1.502
50	470	61	72	124	11.047	0.866	4396.977	1.694	4553.960	1.712
100	901	88	152	175	10.640	0.864	4229.299	1.585	3393.036	1.676

Table 6. Summary of the calculating parameters used in the estimation.

Note:  $H_{isosat}$ : the isotropic elastic modulus with respect to matric suction,  $H_{isosat} = (1 + \mu)/(1 - \mu) \cdot ds/d\varepsilon_v$ ;  $\lambda_v$  and  $\eta_v$ : the fitting parameters for estimating  $H_{vunsat}$ ;  $\lambda_h$  and  $\eta_h$ : the fitting parameters for estimating  $H_{hunsat}$ .

Elastically isotropic behavior was assumed within the stress range under consideration. Namely, the elastic moduli *E* in the vertical and horizontal directions were considered to be the same. All of the test series for the OVS and OHS tests provided lateral pressure datasets covering net normal stresses ranging from 0 to 100 kPa under staged suction reductions. Predictions were generated using Equations (3) and (6) with the appropriate elastic moduli at given stress states calculated using Equations (15) and (16).

Figure 12a overlays the estimated and measured lateral pressure variations across the decreasing matric suction path for each test. Remarkably close correlations were observed regarding the fact that the datasets are distributed near both sides of the 1:1 perfect prediction line, demonstrating the suitability of the proposed constitutive relationships and prediction methods. However, as shown in Figure 12b, it presents significantly poorer alignment that would increasingly underestimate the lateral pressure of expansive soil by 5.8–61.0%, which can be a disaster for engineers designing geo-infrastructure in expansive soil distributed areas. In addition, the deviations between the measured and predicted lateral pressures were found to be relatively large at higher stress states, whether using the

proposed method or the isotropic model. This may be due to the fact that the expansive soil has already entered the plasticity state under such large stress and even yielded, where the elastic constitutive model can no longer characterize its stress–strain behavior. Therefore, this proposed model and method are suggested for use in designing light structures with lateral confinements at shallow depths.



**Figure 12.** Comparison of the measured lateral pressure and the estimated lateral pressure by (**a**) the proposed method and (**b**) method without considering the anisotropic swelling behavior.

Five statistical indices were used to better evaluate the performance of the proposed method, including the correlation coefficient ( $R^2$ ), refined Willmott index (RWI), mean arctangent absolute percentage error (MAAPE), root mean square error (RMSE), and mean absolute error (MAE). The model has larger  $R^2$  and RWI, and smaller MAAPE, RMSE, and MAE performed best [34]. The calculation results of those statistical indices are summarized in Table 7.

	Indices	R	2 <sup>2</sup>	RV	NI	MAAI	PE (%)	RN	ISE	M	AE
Test ID		ANI	ISO	ANI	ISO	ANI	ISO	ANI	ISO	ANI	ISO
OVS-0		0.9899	0.9898	0.9239	0.7610	/	/	2.6975	8.6487	1.99	7.45
OVS-12.5		0.9966	0.9712	0.9118	0.7788	9.9	20.4	2.7427	7.7028	2.35	6.86
OVS-25		0.9858	0.9761	0.8513	0.6464	12.2	30.8	4.4998	14.1332	3.96	13.52
OVS-50		0.9410	0.8940	0.7553	0.6935	13.4	21.9	7.0124	12.9584	6.46	11.63
OVS-100		0.9362	0.9038	0.7978	0.6529	11.8	21.6	8.3822	17.4199	7.32	16.81
OHS-0		0.9816	0.9882	0.8873	0.5856	/	/	5.3509	30.2147	4.27	27.86
OHS-12.5		0.9828	0.9751	0.8898	0.6022	16.7	47.5	5.2837	29.7645	4.63	27.77
OHS-25		0.9746	0.9549	0.8055	0.5631	22.7	54.3	11.1098	41.2384	10.06	38.76
OHS-50		0.9850	0.9193	0.8520	0.5633	18.6	50.7	9.3792	46.3975	8.65	44.06
OHS-100		0.9464	0.8835	0.7976	0.5681	17.9	43.2	15.3981	46.4962	13.52	45.22

Table 7. Summary of the calculating statistical indices for all test series.

Note: ANI: estimation using the proposed method (anisotropic consideration); ISO: estimation using Fredlund's nonlinear elastic model (isotropic consideration).

As depicted in Table 7, it can be observed that the proposed method that considers the swelling anisotropy performed reasonably well in terms of determining the lateral pressure of expansive soil, and it has a superior predictive ability with higher  $R^2$  and RWI values and lower MAAPE, RMSE, and MAE values compared to the isotropic model.

In conclusion, validation with high-quality test measurements affirmed the ability of the anisotropic constitutive model and estimation techniques to predict lateral pressures. Significant improvement over isotropic assumptions justifies the consideration of intrinsic anisotropy for more realistic expansive soil modeling and design. The results demonstrate the effectiveness of the proposed framework in capturing true stress–strain–suction behavior. With further refinement, the approach holds promise as a practical tool for facilitating the wider usage of expansive soils in geotechnical applications through proper earth pressure assessments.

#### 7. Conclusions

This study conducted a comprehensive experimental investigation into the anisotropic swelling behavior of expansive soils and developed predictive methodologies to estimate earth pressures considering this inherent anisotropy. Based on the results and findings, the following conclusions were drawn:

(1) Modified oedometer testing quantified clear anisotropy in expansive soil, with a maximum vertical swelling strain 1.71 times that of the horizontal direction. The swelling pressures were also directionally dependent, and the vertical swelling pressure was 1.57 times that of the horizontal one.

(2) A nonlinear elastic constitutive model was proposed incorporating vertical and horizontal elastic moduli with respect to matric suction to characterize swelling anisotropy. Three key elastic moduli were determined from the test data.

(3) The elastic moduli decreased nonlinearly with saturation and increased under higher confinement, exhibiting strong dependence on stress state and suction. The differences between the horizontal and vertical moduli quantify the macroscale manifestation of microstructural anisotropy.

(4) Simple predictive equations were developed to estimate unsaturated elastic moduli from saturated conditions via normalization. Validation affirmed the use of a constitutive model and predictive techniques as useful engineering tools for earth pressure assessments that consider expansive anisotropy.

In conclusion, these findings provide an improved understanding of more realistic characterization and utilization of expansive soils in geotechnical applications by properly accounting for their inherent anisotropic behavior. However, deviations between the measured and predicted lateral pressures were found to be relatively large at higher stress states; this proposed model and method are suggested to be used in designing light structures with lateral confinement at shallow depths. In addition, studies based on in situ soils and soils from other locations are necessary to further validate the methodology presented in this paper, and studies on swelling in an angular direction with respect to the direction of compaction should also be carried out.

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Article



# Investigation of the Effect of Relative Density on the Dynamic Modulus and Damping Ratio for Coarse Grained Soil

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Abstract: As the critical dynamic parameters for soil, an extensive examination of the dynamic elastic modulus  $E_d$  and damping ratio  $\lambda$  in coarse-grained soil is of significant theoretical and practical importance. Currently, there is a scarcity of experimental equipment and methods for measuring the dynamic elastic modulus and damping ratio of coarse-grained soils. Moreover, studies examining the influence of relative density on these parameters in coarse-grained soils are largely absent. To investigate the behavior of the dynamic elastic modulus and damping ratio in coarse-grained soil under varying relative densities, a number of dynamic triaxial tests were conducted on a specific coarse-grained soil using the DYNTTS type dynamic triaxial test apparatus. The findings reveal that, under various gradations, the E<sub>d</sub> of coarse-grained soils exhibits a decreasing trend with increasing dynamic strain, a trend that intensifies with higher relative densities. Additionally, as relative density increases, the degradation rate of the dynamic shear modulus ratio  $G_d/G_{dmax}$  to dynamic shear strain  $\gamma_{d}$  curve escalates. The maximum dynamic shear modulus  $G_{dmax}$  rises with increasing relative density  $D_r$ , displaying a linear relationship between  $G_{dmax}$  and  $D_r$ . Furthermore, both the increasing rate of  $\lambda$  to  $\gamma_d$  curve and the maximum damping ratio  $\lambda_{max}$  progressively diminish with the escalation of relative density  $D_r$ . Notably, the maximum damping ratio has a power function relationship with the relative density.

**Keywords:** dynamic elastic modulus; damping ratio; coarse-grained soil; relative density; maximum dynamic shear modulus

## 1. Introduction

Rockfill dams, a type of embankment dam constructed using rockfill materials, are increasingly preferred in Southwest China due to their strong adaptability to geological environments, the feasibility of using local materials, lower construction costs, and superior seismic performance [1,2]. The complex geological conditions and frequent seismic activities in this region make seismic performance a critical factor for the safety of these dams. A failure in seismic resistance could lead to catastrophic societal consequences. Thus, optimizing the seismic design of rockfill dams and enhancing their seismic performance are of paramount importance. In this context, the dynamic elastic modulus and damping ratio, as key parameters for soil dynamics, are the focal points in this analysis.

Coarse-grained soil, often employed as a filling material in rockfill dam projects, is chosen for its excellent engineering characteristics like high permeability, strength, and minimal compression deformation. Accurately determining its dynamic elastic modulus

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Copyright: © 2024 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). and damping ratio is crucial for the seismic design of rockfill dams. Consequently, in-depth research into these parameters holds significant theoretical and engineering value [3].

There has been substantial research by international scholars on the dynamic elastic modulus, the dynamic shear modulus, and damping ratio of coarse-grained soils. Studies from Sawangsuriya [4], Kokusho [5], Saxena [6], Li Yangbo [7], and others have indicated that the dynamic elastic modulus and damping ratio all trend to increase when pressure and frequency increase. The maximum dynamic elastic modulus of coarse-grained soil was empirically formulated by Wang [8], considering the confining pressure and frequency, based on extensive data from large-scale dynamic triaxial tests. Fang [9] conducted tests on limestone aggregate using a static and dynamic simple shear testing device, developing an estimation formula for the maximum dynamic shear modulus that considers the effects of confining pressure, consolidation ratio, gradation, and porosity characteristics. Du [10] investigated the influence of factors like the consolidation ratio on the dynamic modulus and damping ratio of materials used in dam construction, including dam shell, heart wall, and dam foundation fault materials, through dynamic triaxial tests. Research by Matsui [11] and Yasuhara [12], and subsequent work by Zhou [13], indicated that higher confining pressure and vibration frequencies increase soil stiffness and stabilize soil dynamics, leading to the development of a dynamic strain backbone curve model that considers vibration cycles and confining pressure.

Overall, the investigations into the dynamic modulus and damping ratio of coarsegrained soil have primarily focused on factors like confining pressure, consolidation ratio, vibration, and porosity characteristics. However, studies specifically addressing the impact of relative density on these parameters in coarse-grained soil are less frequent. Limited research, such as that by Fu [14] and Wang [15], has provided only qualitative insights, leaving the quantitative relationship between relative density and the dynamic modulus and damping ratio of coarse-grained soil largely unexplored. This gap highlights the current inadequacy in understanding the influence of relative density on these parameters, emphasizing the need for more quantitative research. Zhu [16,17] underscored the significance of relative density as a mechanical parameter reflecting the physical state of soil, heavily influencing the mechanical characteristics of coarse-grained soil. Therefore, quantitative experimental research into how relative density affects the dynamic modulus and damping ratio of coarse-grained soil is imperative.

Therefore, this study utilizes a GDS large-scale dynamic-static triaxial apparatus for dynamic triaxial testing on compacted samples of a specific coarse-grained soil. Leveraging the results from these tests, this research quantitatively examines the impact of relative density on the dynamic modulus and damping ratio of coarse-grained soil. Additionally, it formulates a computational model that precisely elucidates the correlation between the maximum dynamic shear modulus, the maximum damping ratio, and relative density, thereby contributing to an enhanced comprehension of the seismic behavior exhibited by rockfill dams.

#### 2. Testing Apparatus and Program

#### 2.1. Instruments and Equipment

In this study, the DYNTTS type coarse-grained soil dynamic triaxial testing system was employed. This system comprises a data acquisition device, a volume controller, a back pressure, a confining pressure controller, a mainframe that governs axial stress and displacement, and a data display unit, as depicted in Figure 1. The instrument's principal specifications include a maximum confining pressure of 1 MPa, an axial load capacity of 60 kN, a load vibration frequency ranging from 0 to 2 Hz, an axial displacement scope of 0 to 88 mm, and an axial force measurement precision of 0.0001 kN. This system is capable of conducting dynamic performance evaluations on samples measuring 300 mm in diameter and 600 mm in height. The experimental procedure encompasses five phases: sample preparation, saturation, consolidation, loading, and unloading, with further details provided in reference [18].



Figure 1. DYNTTS coarse-grained soil dynamic triaxial test system (a,b).

## 2.2. Specimen Preparation Standard

The soil material utilized by the experiments was sourced from the Pingnan Sanqiao construction site, consisting of sand, pebbles, and gravel. These particles are predominantly rounded and exhibit a grayish-white hue. Figure 2 displays the appearance of the various particle sizes in this material. Samples, labeled S1 to S3, were characterized by gradations, as depicted in Figure 3.



Figure 2. Sieved soil material for each grain group.

The sample preparation was based on the relative density standard, with the relative densities of each group of samples set at 0.9, 0.7, 0.5, and 0.3, respectively. To ensure the required density for each group during sample preparation, relative density tests were conducted according to the experimental gradation. The relative density tests were carried out using a surface vibratory compactor for coarse-grained soils, as shown in Figure 4. The relevant test parameters for this device are as follows: the inner diameter of the sample cylinder is 28 cm, the volume is 14,200 cm<sup>3</sup>, the vibration frequency is 47.5 Hz, the excitation force ranges from 10 to 80 kN, and the static pressure exerted by the tamper plate is above 18 kPa.



Figure 3. Gradation curves of experimental coarse-grained soils.



Figure 4. Surface vibratory compactor for coarse-grained soils.

By controlling the mass of the soil sample, the desired density for each group of samples can be achieved. The maximum dry density ( $\rho_{max}$ ) of each experimental gradation was determined using the surface vibratory compaction method, and the minimum dry density ( $\rho_{min}$ ) was determined using the loose filling method. The measured  $\rho_{max}$  and  $\rho_{min}$  for each gradation were then substituted into the relative density formula to calculate the dry density required to achieve the corresponding relative density, and, subsequently, the required mass of soil for each group of samples was derived.

The corresponding dry density values for these relative densities are detailed in Table 1.

Specimen	Specimen Maximum		Maximum Dry		Dry Density/(g·cm <sup>−3</sup> )		
Number	Particle Diameter/mm	Density/(g·cm <sup>-3</sup> )	Density/(g·cm <sup>-3</sup> )	$D_{\rm r} = 0.9$	$D_{\rm r}=0.7$	$D_{\rm r} = 0.5$	$D_{\rm r} = 0.3$
S1	40	1.884	2.244	2.202	2.122	2.048	1.979
S2	20	1.844	2.174	2.136	2.063	1.995	1.932
S3	10	1.798	2.1	2.065	1.999	1.937	1.879

Table 1. Dry density physical parameters.

## 2.3. Test Method

The corresponding dry density values for these relative densities are detailed in Table 1. The experiment was conducted based on the "Standard for Soil Test Method" (GB/T50123-2019) [18], using sample sizes of diameter 300 mm and height 600 mm. The process was divided into five steps: sample preparation, saturation, consolidation, loading, and sample removal. The specific details are as follows:

1. Sample Preparation:

The sample was directly placed on the instrument base. A layer of petroleum jelly was applied around the instrument base and the inside of the membrane holder to prevent water and air leakage during the experiment. After fixing the rubber membrane to the base and installing the membrane holder, a vacuum pump was used to draw air out, causing the rubber membrane to adhere to the holder. The test used air-dried material, forming the sample by controlling the compaction. The weighed test material was evenly divided into six portions, each portion was placed into the membrane holder in four layers, compacted, and roughened to achieve the predetermined dry density. After filling the sample, a vacuum was applied to maintain a negative pressure of 20 kPa, and then the membrane holder was removed.

2. Saturation:

After sample preparation, to ensure the sealed state during the experiment, the rubber ring around the instrument base was cleaned. After cleaning, the pressure chamber was installed and filled with water. Maintain a constant water temperature to control the environmental temperature during the testing process. The sample was saturated using the water head saturation method: after the pressure chamber was filled with water, water injection was stopped, and  $CO_2$  was introduced from the bottom of the sample to replace the air in the pores. Then, air-free water was injected from the bottom, and once water emerged from the top, the water head saturation method was used to gradually saturate the sample from bottom to top. The saturation was considered complete when the pore pressure coefficient B value reached above 0.95.

Consolidation:

The sample was consolidated by controlling the stress. While maintaining constant confining pressure, the sample was subjected to drained consolidation with a consolidation ratio  $K_c$  of 2.0. Initially, isotropic consolidation was performed, and once the sample stabilized, the axial pressure was gradually increased to avoid severe deformation due to the sudden application of excessive axial pressure. Throughout the consolidation process, the sample's drainage was continuously monitored, and consolidation was considered complete when the drainage volume did not exceed 15 mL within 30 min.

4. Loading:

Stress-controlled loading was used in the experiment. A confining pressure of 200 kPa was selected. After consolidation, while maintaining the confining pressure constant, axial dynamic stress was applied in stages from small to large. Each level of dynamic stress was  $\sigma_d = \pm 0.3\sigma_3, 0.4\sigma_3, 0.5\sigma_3, \ldots$ , and the next level of loading could only proceed after completing the previous level. Each level of dynamic stress was cycled for six cycles, and the data from the third cycle was selected for analysis. Additionally, the vibration waveform used in the experiment was a sine wave with a vibration frequency of 0.33 Hz.

5. Sample Removal:

After completing all loading tasks, the confining pressure and axial pressure were gradually unloaded, data acquisition and control programs were turned off, the drainage valve was opened to empty the pressure chamber, and the pressure chamber was removed. Finally, the sample was dismantled and the site was cleaned.

#### 3. Interpretation of Experimental Results

#### 3.1. Relation of Dynamic Elastic Modulus and Dynamic Strain

For this analysis, data from average value to three cycles of each dynamic loading level were employed. The relationship curves depicting the dynamic strain ( $\varepsilon_d$ ) against dynamic elastic modulus ( $E_d$ ) for samples S1 to S3 are illustrated in Figure 5. The graph indicates that

under a constant dynamic load, the decrease in relative density results in an increase in the dynamic strain experienced by specimens and a reduction in the rate at which the dynamic elastic modulus decreases. Specifically, it can be seen that  $\varepsilon_d$  of the sample with the same relative density ( $D_r$ ) of 0.3 is larger. Under the same dynamic strain conditions, the sample with  $D_r = 0.9$  showed the most significant decrease in the dynamic modulus. This variation is attributed to the transition from tight to loose contact among coarse- and fine-grained particles as Dr decreases, thereby diminishing the structural capacity to resist deformation. Consequently, under identical dynamic loads, a higher dynamic strain is observed. While the contact remains relatively firm at  $D_r = 0.7$ , resulting in a minor deviation from the curve with  $D_r = 0.9$ , the contact becomes considerably looser at  $D_r = 0.5$  and 0.3, significantly reducing structural resistance, hence the notable disparity from the curve with  $D_r = 0.9$ .



Figure 5.  $E_d$ - $\varepsilon_d$  relationship curves: (a) D2-1, (b) D2-2, (c) D2-4.

A further comparative analysis of Figure 5a–c indicates, under identical density conditions, an increase in maximum particle size correlates with increasing dynamic elastic modulus and decreasing dynamic strain. This trend can be attributed to the denser packing of coarse- and fine-grained particles and enhanced inter-particle contact in samples with larger maximum particle sizes, leading to increased resistance to deformation.

#### 3.2. Relation of the Dynamic Shear Modulus Ratio and Dynamic Shear Strain

Contemporary research on dynamic properties for coarse-grained soils predominantly employs the Hardin-Drnevich model [18]. This model describes the correlation between the dynamic shear strain ( $\gamma_d$ ) and the dynamic shear modulus ratio ( $G_d/G_{dmax}$ ) in coarse-grained soils, as per the following relationship:

$$\frac{G_d}{G_{dmax}} = \frac{1}{1 + \gamma_d / \gamma_r} \tag{1}$$

where  $\gamma_r$  represents the reference shear strain.

Figure 6a–c depict the results of  $G_d/G_{dmax}$  and  $\gamma_d$  tests for samples S1 to S3 under varying relative densities, alongside their fitting curves based on Equation (1). These Figures demonstrate a strong correlation and a satisfactory fit between the experimental data and the fitting curves. Upon analyzing Figure 6, it is noted that the attenuation rate of  $G_d/G_{dmax}$  varies with different relative densities ( $D_r$ ). In general, the higher the relative density  $D_r$ , the greater the rate of decay of  $G_d/G_{dmax}$  with increasing dynamic shear strain ( $\gamma_d$ ), and the more pronounced the overall decay trend.



**Figure 6.**  $G_d/G_{dmax}$ - $\gamma_d$  fitted relationship curves: (a) S1, (b) S2, (c) S3.

#### 3.3. Relation of Dynamic Shear Strain and the Damping Ratio

Based on the existing studies on rockfill materials [19], the relationship of  $\lambda$  of soil and  $\gamma_d$  can be described as follows:

$$\lambda = \gamma_{\rm d} / (c + d\gamma_{\rm d}) \tag{2}$$

$$1/\lambda = c/\gamma_d + d \tag{3}$$

where *c* and *d* represent experimental parameters, with the inverse of the linear intercept *d* defining the maximum damping ratio  $\lambda_{max}$ .

Figure 7a–c delineate the relationship of  $\lambda$  of soil and  $\gamma_d$  samples S1 to S3 under varying relative densities. The curves reveal considerable disparities in the  $\lambda$ - $\gamma_d$  relationships across different relative densities. For shear strains below  $10^{-2}$ ,  $\lambda$  progressively increases with rising  $\gamma_d$ . The rate of increase is more pronounced in samples exhibiting lower relative densities. Notably, the sample with a relative density ( $D_r$ ) of 0.3 exhibits the most rapid augmentation in damping ratio, significantly outpacing those with  $D_r = 0.5$ , 0.7, and 0.9. These observations underscore the profound impact of compaction on the soil's energy dissipation capacity. Looser soils demonstrate easier energy dissipation, leading to higher damping ratios.



**Figure 7.**  $\lambda$ - $\gamma$ <sub>d</sub> fitted relationship curves: (a) S1, (b) S2, (c) S3.

#### 4. Influence of Relative Density on the Maximum Dynamic Shear Modulus

By arranging 12 sets of dynamic triaxial test results of graded samples S1–S3 under different relative compactness  $D_r$  of 0.3, 0.5, 0.7, and 0.9, the relationship between the relative compactness  $D_r$  and the maximum dynamic shear modulus  $G_{dmax}$  was obtained, as depicted in Figure 8. Figure 8 illustrates that, for a constant maximum particle size,  $G_{dmax}$  incrementally increases with an increase in  $D_r$ . Further analysis and fitting of these 12 datasets using fitting software (origin) revealed a linear relationship between  $D_r$  and  $G_{dmax}$ , represented by this Equation:

$$G_{dmax} = eD_r + f \tag{4}$$

where *e* and *f* are parameters, with *e* being the slope and *f* representing the maximum dynamic shear modulus at  $D_r = 0$ .



Figure 8. G<sub>dmax</sub>-D<sub>r</sub> fitted relationship curves.

Fitting these 12 datasets with Equation (4) and summarizing the results in Table 2 shows a high congruence between the fitted curves and experimental points, with coefficients of determination exceeding 0.96. The maximum discrepancy between the fitted and experimental values of  $G_{dmax}$  was less than 2%. Consequently, this study posits that the relationship between  $D_r$  and  $G_{dmax}$  can be effectively described by Equation (4). Consistent with these findings, Yang [20] reported, in his research using a resonant column apparatus on sand, that the relative density of sand has a linear positive correlation with its maximum dynamic shear modulus.

Table 2. Fitting results of Equation (4).

Constitution Neurophan	Maxir	num Dynamic Shear Mo	dulus
Specimen Number —	е	f	$R^2$
S1	25.653	69.060	0.961
S2	22.076	82.776	0.986
S3	21.066	88.061	0.975

## 5. Influence of Relative Density on the Maximum Damping Ratio

The maximum damping ratio  $(\lambda_{max})$  of granular materials at various relative densities  $(D_r)$  is presented in Figure 9. Figure 9 shows that  $\lambda_{max}$  inversely correlates with  $D_r$ , decreasing as  $D_r$  increases, a trend that is opposite to that observed for the maximum dynamic shear modulus.



**Figure 9.**  $\lambda_{max}$  vs.  $D_r$  fitted relationship curves.

Figure 9 also reveals that the attenuation rate of  $\lambda_{max}$  progressively diminishes with increasing  $D_r$ . This is likely due to tighter particle contacts at higher  $D_r$ , resulting in smaller relative displacements under external forces, thereby leading to a reduced damping ratio.

Analysis and fitting of these 12 datasets using fitting software suggest that  $D_r$  and  $\lambda_{max}$  exhibit a power law relationship, expressed by this Equation:

$$\lambda_{\max} = m D_r^n \tag{5}$$

where *m* and *n* are parameters.

Fitting these 12 datasets with Equation (5) and summarizing the results in Table 3, Table 3 demonstrates a high congruence between the fitting curves and the experimental data, with coefficients of determination exceeding 0.93. The maximum discrepancy between the fitted and experimental values of  $\lambda_{max}$  was under 5%. Hence, this study posits that the relationship between relative density  $D_r$  and  $\lambda_{max}$  can be effectively described by Equation (5).

Table 3. Fitting results of Equation (5).

Caracian on Namehou	1	Maximum Damping Rati	0
Specimen Number —	m	п	$R^2$
S1	0.0072	-0.554	0.9533
S2	0.074	-0.58	0.978
S3	0.085	-0.563	0.957

## 6. Conclusions

This paper, through dynamic triaxial testing of 12 groups of coarse-grained soil samples at varying relative densities, investigates the impact of relative density on the dynamic elastic modulus and the damping ratio ( $\lambda$ ) of coarse-grained soils. The conclusions are as follows:

- 1. The dynamic elastic modulus of coarse-grained soil progressively diminishes with increasing dynamic strain. The attenuation rate of dynamic elastic modulus escalates with increasing relative density; the rate of decay of the coarse-grained soil's normalized dynamic shear modulus with increasing dynamic shear strain also rises with an increase in relative density, with the attenuation trend becoming more distinct at higher relative density values. Additionally, the rate of increase in the damping ratio–dynamic shear strain relationship curve gradually decreases as relative density increases.
- The maximum dynamic shear modulus of coarse-grained soil increases with an increase in relative density. An empirical formula has been established to describe the relationship between the maximum dynamic shear modulus and relative density of coarse-grained soil.
- The maximum damping ratio of coarse-grained soil decreases progressively with increasing relative density. An empirical formula has been developed to delineate the relationship between the maximum damping ratio and relative density of coarsegrained soil.

The conclusions drawn in this article are helpful for the construction of coarse-grained soil engineering such as dams and retaining walls, and the formulas obtained can provide reference for further research on the dynamic performance of coarse-grained soil.

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Article



## An Investigation of Particle Motion and Energy Dissipation Mechanisms in Soil–Rock Mixtures with Varying Mixing Degrees under Vibratory Compaction

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Abstract: Soil–rock mixture (S–RM) is a heterogeneous granular material commonly used in engineering applications, but achieving uniform particle mixing is challenging. This study investigated the effect of mixing homogeneity on the compaction of S–RM using the discrete element method (DEM). Specimens with varying degrees of mixing were modeled under realistic vibration loading. The results showed that a higher degree of mixing resulted in a smaller void ratio after compaction. The analysis of particle motion and energy dissipation revealed that not all particle motion during vibration compaction was aligned with the direction of the particle system. However, rotation was more prevalent and contributed to densification. Dashpot energy dissipation did not solely promote changes in the void ratio, while slip energy dissipation did lead to changes in the void ratio, but not entirely towards compaction. Rolling slip energy dissipation primarily occurred during the stage of void ratio changes and significantly promoted compaction. The change in strain energy aligned with the trend of the void ratio but did not directly contribute to its promotion.

Keywords: vibratory compaction; soil-rock mixture; degree of mixing; particle motion; energy dissipation

## 1. Introduction

Soil–rock mixture (S–RM) is a heterogeneous geotechnical material composed of coarse particles such as rock, gravel, and sand, and fine particles such as sand, clay, and silt. It is typically formed by seismic, collapse, landslide, and other actions during the Quaternary Period, and distributed in loose accumulations on steep slopes or beside ditches [1–4]. For instance, the 2008 Wenchuan earthquake in China triggered numerous landslides and debris flows in the subsequent years due to secondary factors like aftershocks and heavy rainfall. This led to widespread S–RM slopes in the mountainous regions of southwestern China [5,6]. S–RM formed by similar causes is also common in other areas [7,8].

S–RM offers numerous advantages, including its high strength, compactness, permeability, erosion resistance, and ability to utilize local materials [9]. Consequently, it is extensively utilized as a filler in subgrade engineering projects [10]. However, S–RM is a granular material that presents challenges in achieving a uniform mixing of particles with varying sizes, shapes, and material properties. Non-uniform mixing is a common occurrence in both natural and construction processes. For instance, during road construction, the coarse aggregates in S–RM tend to settle downwards due to their higher potential energy, resulting in layers with varying degrees of mixing [11,12].

The mixing degree is a measure of the heterogeneity of particle mixtures [13]. Current definitions primarily originate from the chemical, agricultural, construction, and medical

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Copyright: © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). fields, where they guide industrial production and quality evaluation. However, mixing degree indices are infrequently utilized in geotechnical engineering [14]. Previous research has demonstrated the significant influence of mixing degree on the local and global properties of granular materials [15]. However, limited studies have investigated its effect on the vibratory compaction of S–RM as a subgrade filler and the resulting negative effects on long-term road performance.

Subgrade compaction involves the consolidation of soils through mechanical methods such as static pressure, dynamic compaction, or vibration compaction [16]. These methods apply external energy to the soil, causing particle movements and rearrangements. Energy is transformed and dissipated during this process, specifically in terms of particle potential energy. The compaction process is fundamentally driven by particle movements and the resulting energy conversions under loading conditions. Thus, conducting statistical analyses on particle motions and energy consumption during compaction can offer a more comprehensive understanding of the compaction mechanism of S–RM (specific road material) under vibration loads, in comparison to macro-scale observations.

This paper employed numerical simulations using the discrete element method (DEM) to investigate the vibratory compaction process of S–RM with different degrees of mixing homogeneity. This study analyzed the relationships between changes in void ratio and particle movements, as well as energy dissipation during compaction. Furthermore, the effects of various vibration parameters on energy dissipation paths were examined. The findings will contribute to a deeper understanding of the vibration compaction mechanism for S–RM as a subgrade filler. This knowledge can serve as a more rational basis for selecting fillers, ensuring the quality and bearing capacity of compacted subgrades, and conducting stability assessments.

## 2. Discrete Element Modeling and Energy Consumption Calculation

#### 2.1. Discrete Element Modeling of Soil-Rock Mixtures

The Particle Flow Code 3D (PFC3D) software was employed for the numerical simulations conducted in this study. The S–RM specimens used had a fixed coarse particle content of 50%. The mixing degree index (*I*) values, ranging from 0.0 to 1.0, were determined using the formulation proposed by Liu et al. [17]. The brief calculation principle is as follows:

The curves in Figure 1 represent the variation of coarse and fine aggregate content Vf with the normalized depth H/HB (HB is the height of the mixture) for different particle mixes, where the Arbitrary Line (black) is the arbitrary mix curve, and the Separation Line (blue) and the Uniform mixing Line (red) are the complete segregation curve and the uniform distribution curve, respectively. When the Arbitrary Line and the Uniform mixing Line do not coincide exactly, the total area As (shaded in Figure 1) enclosed by the two curves represents the degree of coarse aggregate segregation in the graded aggregates. The area bounded by the Separation Line, the Uniform mixing Line, and Lines AB and CD is the area of complete segregation (as shown in areas Ai and Aii). The mixing degree index (I) in this paper was calculated using Equation (1):

$$I = 1 - \frac{A_s}{A_i + A_{ii}} \tag{1}$$

Figure 2 illustrates the *I* value versus the depth of the curves for the six groups of specimens. In the figure, *H* represents the height from the bottom of the specimen, while *HW* denotes the total height. The specimens had dimensions of 800 mm  $\times$  800 mm  $\times$  600 mm and were enclosed by five rigid walls.


Figure 1. Schematic representation of the principles of calculating the indicators.



Figure 2. Variation curve of coarse particles with normalized depth under different I value.

The sample preparation process is as follows:

(1) Divide the specimen height into 10 equal layers. Generate specific numbers of coarse and fine particles in each layer based on the initial void ratio target of 0.7 and relative coarse/fine particle proportions in Figure 2.

(2) Reset the interparticle contact forces and velocities every 5 cycles until 20,000 cycles to eliminate excessive contacts.

(3) Allow the particles to settle under gravity to produce the initial specimen. The final I values match the targets.

The top of the specimen was equipped with an 800 mm  $\times$  800 mm  $\times$  2 mm loading plate, which contains a cluster composed of 6241 sub-spheres with a radius of 1 mm. The resulting model is depicted in Figure 2. To simulate the vibrations induced by field vibratory rollers, an excitation force was applied to the plate. This force followed a cosine

wave pattern, and matched the magnitude and frequency of the field vibration compaction, as described by Equation (2):

$$F = -F_0(\cos(2\pi f\Delta t) + 1) \tag{2}$$

where *F* presents the excitation force;  $F_0 = 500$  kN; *f* is the loading frequency; and  $\Delta t$  is the loading time. Given the focus of this study on particle motions and energy dissipation, important parameters included dashpot coefficients, sliding friction, and rolling friction. The contact stiffness and other relevant parameters were directly derived from triaxial model verifications and incorporated into the analysis [18].

Linear contact models were employed for particle interactions. Research indicates that both linear and nonlinear Hertz models can effectively represent the behaviors of granular materials [19]. The normal stiffness of a particle,  $k_n$ , is expressed in Equation (3):

$$k_{\rm n} = \pi E_c r / (r_1 + r_2) \tag{3}$$

where  $E_c$  is the particle effective modulus;  $r_1$  and  $r_2$  are the contacting particle radii; and r is the smaller radius. In this study, the effective contact modulus of soil particles Ecb is  $1.24 \times 10^8$  Pa, and the effective contact modulus of loaded plate particles  $E_{cl}$  is  $3.31 \times 10^9$  Pa. Tangential stiffness  $k_s$  used a normal-to-tangential stiffness ratio  $k^* = k_n/k_s$  between 1.0 and 1.5 for realistic materials [20,21]. Here k\* = 4.0/3.0 was applied. Density was set as 2650 kg/m<sup>3</sup>, similar to actual granular geo-materials.

Dashpot was utilized to dissipate energy within the particle assembly during preparation and loading processes. Common forms of dashpot include local dashpot, which directly decreases particle velocities, and viscous dashpot, which introduces contact dashpot forces. The local dashpot coefficient,  $D_p$ , regulates the unbalanced forces, as demonstrated in Equation (4):

$$F_i^{d} = D_{p}\left(\left|F_i^{d}\right|\right) \operatorname{sign}(v_i) \tag{4}$$

where  $D_p$  is the local dashpot coefficient; sign is the sign function; and  $v_i$  (i = 1-6) is the linear and angular velocities. Viscous dashpot introduces normal and tangential contact dashpot forces, as shown in Equation (5):

$$F_j^{\rm d} = \left(2\beta_j \sqrt{\overline{m}k_j}\right) \dot{\delta}_j \tag{5}$$

where j = n, and s represents the normal and tangential directions of particle contact, respectively;  $\beta_n = \beta_s = 0.7$ ; and  $\overline{m}$  is the equivalent value of contacting particle mass ( $m_1$  and  $m_2$ ),  $\overline{m} = m_1 m_2/(m_1+m_2)$ . The contact between particles follows Coulomb's law of friction, that is  $f_s \leq \mu_b f_n$ , where  $f_n$  and  $f_s$  are normal and tangential contact forces. The static friction coefficient  $\mu_b = 0.6$ . Particle shapes were incorporated via a rolling resistance model giving rotational moments, as shown in Equation (6):

$$I \le \mu_r \overline{R} f_n \tag{6}$$

where  $\mu_r = 0.25$  is the rolling friction and  $\overline{R}$  is the effective particle radius. Key mesoparameters are listed in Table 1. Coarse to fine particle diameter ratio  $d_c/d_f$  was 5.0. Previous studies have indicated that mechanical behavior remains relatively unchanged when the ratio exceeds 4.44, which corresponds to the situation where fine particles fill the voids between coarse particles [17,22]. Therefore, variations in particle size scales did not significantly influence the objectives of the current research.

Parameter	Value
Particle density $(kg/m^3)$	2650
Local dashpot $D_p$	0.01
Normal viscous dashpot $\beta_n$	0.70
Tangential viscous dashpot $\beta_s$	0.70
Sliding friction $\mu_b$	0.60
Rolling friction $\mu_r$	0.25
Effective contact modulus $E_{cb}$ (Pa)	$1.24 \times 10^{8}$
Effective contact modulus of loaded plate $E_{cl}$ (Pa)	$3.31  imes 10^9$
Normal-to-tangential stiffness ratio k*	4.0/3.0
Coarse particle diameter	40-60
Fine particle diameter	5–15

Table 1. Mesoscopic parameters used in numerical simulations.

### 2.2. Energy Consumption Calculation

Energy consumption values are aggregated based on PFC principles. The reliability of these values is confirmed through experiments conducted on vibrating powder beds, with simulations aligning with the experimental results [23,24]. The formulations used are as follows:

(1) Sliding strain energy  $E_{st}$ :

Sliding strain energy ( $E_{st}$ ) is the energy resulting from the elastic forces between contact points and stored within the system as potential energy. The formula for computing the sliding strain energy ( $E_{sst}$ ) is:

$$E_{\rm sst} = \sum_{i=1}^{k} \frac{1}{2} \left( \frac{f_{\rm n,i}^2}{k_{\rm n}} + \frac{\left\| f_{\rm s,i} \right\|^2}{k_{\rm s}} \right) |_t \tag{7}$$

where  $f_{n,i}$  and  $f_{s,i}$  are the normal and tangential contact forces of the *i*-th contact; and *t* is the real time.

(2) Slip energy  $E_{\mu}$ :

$$E_{\mu} = \sum_{i=1}^{k} \frac{1}{2} \left[ \left( f_{s,i} \right)_{0} + f_{s,i} \right] \Delta \delta_{s,i}^{\mu} | t$$
(8)

where  $f_{s,i}$  is the tangential force of the *i*-th contact at the time *t*; and  $\Delta \delta_s^{u}$  is the relative tangential displacement increment  $\Delta \delta_s$  in the sliding direction.

(3) Dashpot energy  $E_{\beta}$ :

Dashpot energy  $(E_{\beta})$  denotes the overall energy dissipated by the damper, and its formula for calculation is as follows:

$$E_{\beta} = F^{d} \cdot \left(\dot{\delta}\Delta t\right) \tag{9}$$

$$\dot{\delta} = \dot{x}_{\rm c}^{\rm i} - \dot{x}_{\rm c}^{\rm j} \tag{10}$$

$$\dot{\boldsymbol{x}}_{\mathrm{c}}^{\mathrm{i}} = \dot{\boldsymbol{x}}^{\mathrm{i}} + \boldsymbol{\omega}^{\mathrm{i}} \times (\boldsymbol{x}_{\mathrm{c}} - \boldsymbol{x}^{\mathrm{i}}) \tag{11}$$

where  $\dot{\delta}$  is the relative velocity of particles;  $\dot{x}_{c}^{i}$  and  $\dot{x}_{c}^{j}$  are the velocities of the two particles at the contact point *c*, respectively;  $\dot{x}^{i}$  and  $\omega^{i}$  are the velocity and angular velocity of the *i*-th particle, respectively;  $x_{c}$  and  $x^{i}$  are the positions of contact point *c* and the center of gravity of the particle *i*, respectively.

(4) Rolling strain energy  $E_{rst:}$ 

Rolling strain energy ( $E_{rst}$ ) signifies the energy generated from particle contact and accumulated within the rolling spring. The formula for calculating this energy is as follows:

$$E_{\rm rst} = \frac{1}{2} \frac{\|M_{\rm r}\|^2}{k_{\rm r}}$$
(12)

(5) Rolling slip energy  $E_{\mu r:}$ 

Rolling slip energy ( $E_{\mu r}$ ) pertains to the energy dissipation resulting from the occurrence of rolling slip between particles. The formula for calculating this energy is as follows:

$$E_{\mu \mathbf{r}} = \frac{1}{2} [(\boldsymbol{M}_{\mathbf{r}})_0 + \boldsymbol{M}_{\mathbf{r}}] \cdot \Delta \boldsymbol{\theta}^{\mu \mathbf{r}}$$
(13)

where  $\Delta \theta^{\mu r}$  is the increment component bending  $\Delta \theta$  in the sliding direction.

(6) Normal elastic work  $W_{n:}$ 

$$W_{n} = \sum_{t=1}^{t} \sum_{m=1}^{k} \left[ f_{\text{fn},ij|t+\Delta t} \left( p_{n,i|t+\Delta t} - p_{n,i|t} \right) + f_{\text{fn},ji|t+\Delta t} \left( p_{n,jt+\Delta t} - p_{n,j|t} \right) \right]$$
(14)

where  $f_{\text{fn},ij|t+\Delta t}$  represents the normal elastic force generated on the surface of particle *i* due to the contact between particle *i* and particle *j* at  $t + \Delta t$ ;  $p_{n,i|t}$  represents the position of the *i* particle at time *t*; and other symbols are similar.

(7) Tangential elastic work  $W_{t:}$ 

The amount of tangential elastic work due to friction is:

$$W_{\rm s} = \sum_{t=1}^{t} \sum_{m=1}^{k} \left( f_{\rm fs,ij|t+\Delta t} \delta_{\rm si} + f_{\rm fs,ji|t+\Delta t} \delta_{\rm sj} \right) \tag{15}$$

where  $f_{\text{fs,ij}}$  represents the tangential friction force generated on the surface of particle *i*;  $\delta_{\text{si}}$  represents the overall movement of the contact point on the surface of particle *i* due to sliding and rotation within time  $\Delta t$ . Since  $W_{\text{s}}$  includes sliding friction work, the magnitude from tangential springs is:

V

$$V_t = W_s - E_\mu \tag{16}$$

### 3. Compaction Effect Analysis

#### 3.1. Void Ratio Variation

During the vibratory compaction simulations, the settlement of the load plate and the void ratio were continuously monitored. Data were recorded at intervals of 1/8 cycle. The plate displacement increments between cycles were compared, and loading was terminated when the ratio fell below 0.1% for ten consecutive cycles, indicating volume stability.

Figure 3 illustrates the settlement of the load plate over time for different samples with varying degrees of particle mixing. The results demonstrated that the sedimentation of the particle system can be divided into two main stages: a rapid change phase and a stable phase. In the initial period (t < 25T), the sedimentation of the granular system experienced a significant increase, accompanied by a sharp decrease in the void ratio. Subsequently (t > 25T), the sedimentation and the void ratio of the particle system tended to stabilize, reaching a state of relative constancy.

Figure 4 presents the variations in void ratios and final values of the samples with different mixing degrees. The findings demonstrated that the uniformity of particle mixing had a substantial influence on densification under identical vibration loads. Specifically, the settlement decreased as the mixing degree increased for the same number of load cycles. Similarly, both the change in void ratio ( $\Delta e$ ) and the final value ( $e_f$ ) decreased monotonically as the homogeneity of mixing improved.



Figure 3. Changes in void ratio of particle system with load period.



Figure 4. Variations in void ratio, final void ratio, and minimum void ratio.

### 3.2. Particle Motion Statistics and Analysis

Compaction primarily involves the rearrangement of particles as they approach each other and smaller particles enter the voids of larger particles through motion [25,26]. The primary particle movements associated with deformation are sliding and rotation [27,28]. Here, the particle displacement and rotation angle represent sliding and rotation amounts, respectively.

Figure 5 illustrates the average particle displacement and rotation angle as a function of load cycles for different mixing degrees. In terms of the duration of loading, both metrics gradually increased over time and closely aligned with the settlement trend shown in Figure 3. During the rapid densification phase (t < 25T), significant increases occurred, indicating substantial particle movements. As stabilization began (t > 25T), the values plateaued, reflecting the stabilization of particle movements.



Figure 5. The average displacement and rotation angle of samples with different mixing degrees vary with load period: (a) displacement; and (b) rotation angle.

In terms of the effects of mixing degree, displacements and rotations did not exhibit clear trends during the early stages of loading (t < 10T), but divergence became apparent at the later stages (t > 10T). However, while the final void ratios systematically decreased with higher mixing degrees, displacements monotonically increased while rotations decreased. This suggested that particle movements during compaction did not necessarily promote densification. It is likely that more particles undergo reciprocal or even upward displacements, while rotations are biased towards compaction to achieve greater homogeneity.

#### 3.3. Compactability Characterization

The previous sections have provided qualitative insights into the relationship between particle movement and compaction when considering mixing degrees. However, the strength of the correlation could not be adequately described. To address this, particle selfdiffusion coefficients were introduced to quantify the association between displacements, system compactness, and mixing homogeneity.

On a microscopic level, particle rearrangements, approaching, and void-filling are a result of random motions induced by external excitation. Loading leads to random velocity fluctuations, similar to molecular thermal diffusion or eddy diffusion in turbulence. These fluctuations in velocity result in a non-uniform distribution of force chains and the continuous formation and breakage of contacts, prompting rearrangements and void filling. This particle diffusion process under vibration signifies a key mechanism of compaction.

Similar to the thermal velocities of gas molecules, the average squared magnitude of particle velocities is referred to as "granular temperature". Campbell et al. [29] computed the self-diffusion coefficient *D* by analyzing the growth rate of displacement variance over time, using the following formula:

$$D = \frac{\left\langle \left[ \mathbf{s}(t) - \mathbf{s}(0) \right]^2 \right\rangle}{2t} \tag{17}$$

where *t* is elapsed time; and s(t) and s(0) are particle displacements at times *t* and 0, respectively. In this study, t = 130T was used.

Figure 6 illustrates the values of D for different mixing degrees. A consistent decrease was observed with improved homogeneity, closely aligning with the void ratio trends shown in Figure 4. This indicated that the particle diffusion ability, which represented the range of single particle motion, decreased, and compactibility was reduced at higher mixing degrees.



Figure 6. Self-diffusion coefficient varies with mixing degree.

### 4. Particle Energy Dissipation Mechanism

### 4.1. Verification of Energy Dissipation in Particle Systems

According to the law of conservation of energy, the energy input into the particle system ( $E_{input}$ ) during vibratory compaction should equal the total energy dissipated ( $E_{total}$ ) within the system. This principle has been verified in cyclic shear testing simulations by Christina et al. [30].  $E_{total}$  comprises dashpot energy, slip energy, rolling slip energy, and strain energy (sliding and rolling). With the periodic cosine excitation on the load plate,  $E_{input}$  is calculated from the force–displacement curve:

$$E_{\text{input}} = \sum_{i=1}^{T} S_{\text{Ti}} = \sum_{i=1}^{T} \int_{\varepsilon_{\text{O}}}^{\varepsilon_{\text{A}}} F d\varepsilon$$
(18)

where *T* is the number of load cycles; *F* is the force magnitude;  $\varepsilon_0$  is the displacement at the start of the cycle; and  $\varepsilon_A$  is the maximum displacement in the cycle.

Studies by Asmar et al. [31] on input and dissipated energy relationships showed the calculated  $E_{\text{total}}$  was always less than the actual  $E_{\text{input}}$ . This is because some energy ( $E_{\text{art}}$ ) is neglected by artificial definitions, mainly normal and tangential elastic work,  $W_{\text{n}}$  and  $W_{\text{t}}$ , in Equations (15) and (16).

By introducing a correction and defining the total dissipated energy as  $E'_{\text{total}} = E_{\text{total}} + E_{\text{art}}$ , the comparison is presented in Figure 7. It was observed that  $E'_{\text{total}}$  closely matched  $E_{\text{input}}$ , confirming the dissipation calculations by PFC criteria appropriately represent the compaction mechanism energy pathways. This monitoring approach enhanced insights into meso-scale particle interactions and enabled a better understanding of macro-scale responses. However, it is crucial to verify that the calculated meso-scale energy dissipations correspond to the physical and mechanical behaviors observed at the macro-scale, as this is critical for mechanism analysis.

Figure 8 presents the cumulative input energy over load cycles for different mixing degrees. The increments of input energy decreased over time but experienced a significant rise before t < 25T, during periods of rapid void ratio changes. Afterward, the increments slowly increased. This can be attributed to the easier structural adjustments and greater efficiency of dissipation in the initial looser states. As densification proceeded, the presence of more compact and uniform particle contacts reduced sliding contacts and tangential creep, resulting in a severe limitation of energy dissipation and input [32,33]. The consistency observed with the void ratio–time patterns in Figure 3 supports the notion that energy input leads to void ratio reductions.



Figure 7. Comparison of the input energy with the corrected total dissipated energy.





Figure 9 further displays the aligned energy input and void ratio trends over mixing degrees. Their monotonic decline with improving homogeneity visually confirms void ratio changes had direct correspondence to particle system energy input and thus total dissipation. Therefore, analyzing the compaction mechanism via energy dissipation pathways is reasonable.



Figure 9. Input energy and void ratio changes with mixing degree.

# 4.2. Analysis of Energy Dissipation Path and Its Proportion

Different modes of energy dissipation play distinct roles in the changes in void ratio during vibratory compaction. Moreover, their relative contributions to the total dissipated energy will evolve as void ratio variations occur. Figure 10 illustrates the ratio of each dissipation component to the total energy over load cycles. As specific dissipation values exhibit considerable randomness within individual cycles, average trendlines over 10-cycle intervals were presented to showcase clearer tendencies over time.



**Figure 10.** The proportion of energy consumption to total energy dissipation during a single load period: (a) dashpot energy; (b) slip energy; (c) rolling slip energy; and (d) strain energy.

Figure 10a shows dashpot energy accounting for 6–14% initially, before rapidly decreasing in the rapid void ratio change zone and slightly rising to 3–4% during stabilization. This implied dashpot did not wholly facilitate void ratio reductions since its proportion increased again once void ratio became approximately constant.

The slip energy proportion in Figure 10b ranged from 30 to 45% initially but quickly declined with void ratio changes and later stabilized between 5 and 12%. This agrees with past findings relating particle sliding and rotations to energy dissipation during compaction [34]. A certain magnitude continued even after stabilization, indicating sliding does not completely promote densification.

Figure 10c demonstrates rolling slip energy following a similar decreasing trend from initial 12–22% portions to near 0% at stability. In contrast with sliding dissipation, rolling slip energy primarily existed during void ratio variations and played an absolute role in enabling compaction.

As shown in Figure 10d, strain energy accounted for 30–40% initially before rapidly increasing with load cycles during void ratio reductions and maintaining a high 70–80% proportion at stability. Its evolution closely matched void ratio changes but did not directly facilitate compaction.

In summary, dashpot energy does not directly cause void ratio changes, sliding provides mixed densification effects, rolling predominantly enables compaction during void ratio variations, and strain energy passively reflects void ratio trends.

### 5. Parametric Studies on Energy Dissipation

The preceding sections have highlighted the varying influences of energy dissipation pathways during vibratory compaction. It is important to note that external load changes play a critical role in the evolution rates and final values of void ratio. Consequently, further investigation of energy dissipation under varied loading conditions can offer additional insights into the compaction mechanism. This section analyses homogeneous specimens consisting of 50% coarse particles, which were subject to different excitation forces and frequencies.

#### 5.1. Excitation Force Effects

Excitation forces of 10 kN, 50 kN, 100 kN, and 500 kN were applied at a constant 35 Hz frequency. Figure 11 presents void ratio–time histories under the different forces. All samples progressively compacted but the compaction degree increased with higher forces, yielding lower final void ratios.



Figure 11. Changes in void ratio with time under different excitation forces.

Figure 12 illustrates the evolutions of energy dissipation components over time. It was observed that all values increased with increasing excitation, with cumulative dashpot, sliding, and rolling slip energy exhibiting a monotonous growth over time. Strain energy, on the other hand, experienced a rapid initial increase before descending to steady-state levels as the void ratio stabilized. When comparing the rate of increments, it can be noted that dashpot, sliding, and rolling slip energy exhibited greater growth in the zone of rapid void ratio change, which gradually slowed down and declined as the system approached stability. However, dashpot and sliding energies maintained small constant increases after reaching certain levels, while the convergence of rolling slip energy flattened completely.

With regard to the degree of compaction, the effectiveness and efficiency improved significantly with higher forces, up to a certain limit. While the void ratio differences gradually decreased from 50 kN to 100 kN and from 100 kN to 500 kN due to diminishing marginal returns, the energy consumption of the specimen continued to increase approximately linearly with the increase in excitation.



**Figure 12.** Energy dissipation pathway under different excitation forces: (**a**) dashpot energy; (**b**) sliding energy; (**c**) rolling slip energy; and (**d**) strain energy.

# 5.2. Excitation Frequency Effects

For a constant 50 kN excitation, frequencies of 25 Hz, 30 Hz, 35 Hz, and 40 Hz were analyzed. Figure 13 presents void ratio versus time plots for these different frequencies. It was observed that all samples underwent monotonic densification, with void ratio decreasing slightly faster at higher frequencies. However, the discrepancies in void ratio reduction were minor within identical loading durations. Therefore, the excitation frequency did not significantly affect the effectiveness or efficiency of S–RM compaction.



Figure 13. Changes in void ratio with time under different excitation frequencies.

Figure 14 displays the evolutions of the different dissipation components. In contrast to strain energy, which remained unaffected by frequency, dashpot, sliding, and rolling slip energy progressively increased with higher frequencies under the same loading period. This can be attributed to the fact that increased frequencies result in more loading cycles, leading to greater energy consumption. However, since strain energy depends on overall deformations during the given timeframe, the differences in its evolution across frequencies are negligible.



**Figure 14.** Energy dissipation pathway under different excitation frequencies: (**a**) dashpot energy; (**b**) sliding energy; (**c**) rolling slip energy; and (**d**) strain energy.

In summary, increasing excitation forces can significantly improve the degree of compaction up to a certain limit. However, it also leads to a substantial increase in energy consumption. On the other hand, adjusting the frequency within a typical range has a mild effect on compactness, without appreciable effects on energy dissipation. These trends provide valuable guidance for achieving target densification levels while optimizing energy inputs.

### 6. Conclusions

This research conducted DEM simulations of the vibratory compaction process in S–RM with varying degrees of mixing homogeneity. The study analyzed the relationships between void ratio changes, particle movements, and energy dissipations during compaction. Additionally, the influences of different excitation forces and frequencies on energy dissipation trends were examined. The key conclusions are summarized as follows:

(1) The mixing uniformity of S–RM significantly affects the compaction characteristics of the filler material. More homogeneous specimens exhibit smaller void ratios after compaction. (2) Particle motions during vibratory compaction do not necessarily promote densification, although rotations are found to be more closely associated with the compaction process than displacements.

(3) The cumulative external load input energy corresponds to the total energy dissipated by the specimen, indicating that the compaction mechanism can be effectively studied through energy dissipation pathways. The consistent correlations observed between input energy, dissipated energy, and void ratio changes over time and mixing degree support this premise.

(4) Dashpot energy does not directly cause variations in void ratio, sliding provides ambiguous effects on densification, rolling predominantly facilitates compaction during changes in void ratio, and strain energy passively reflects void ratio trends.

In summary, this work provides insights into the underlying energy dissipation mechanisms that govern the densification of S–RM under vibratory loads. These findings contribute to more effective filler selection, improved vibratory compaction procedures, and enhanced predictions of subgrade quality and performance. Further efforts may involve experimental validations through instrumented laboratory vibratory compaction tests on S–RM specimens.

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Abstract: Using coal gangue as subgrade filler can not only solve the environmental problems of coal mine waste accumulation but also decrease the subgrade cost, which has important theoretical and practical significance. A series of cyclic triaxial tests was carried out using the large-scale dynamic and static triaxial apparatus (LSDSTA) to investigate the permanent deformation ( $\varepsilon$ ) of coal gangue subgrade filler (CGSF) under cyclic loading. Experimental grading was designed by using the fractal model grading equation (FMGE), and then well-grading limits of CGSF were captured. The relationship curve between  $\varepsilon$  and the numbers of cyclic loading (N) can be divided into three stages, i.e., the rapid growth phase, the deceleration growth phase, and the approaching stability phase. N = 1000 can be used as the criterion for reaching the stable stage of CGSF. The effect of confining pressure  $(\sigma'_3)$  on  $\varepsilon$  is related to the level of  $\sigma'_3$ . The effect of  $\sigma'_3$  on  $\varepsilon$  is significant when  $\sigma'_3$  is smaller, whereas the influence of  $\sigma'_3$  on  $\varepsilon$  is smaller when  $\sigma'_3$  is larger. Furthermore, the influence of grading  $(D_f)$  on  $\varepsilon$  of coal gaugue samples is significant. With the increase of  $D_f$ ,  $\varepsilon$  first increases and then decreases, reflecting that there is an obvious optimal grading for coal gangue samples under cyclic loading. Moreover, the effect of compaction degree ( $D_c$ ) on  $\varepsilon$  of CGSF depends on the level of  $D_c$ .  $\varepsilon$ is hardly affected when  $D_c$  is smaller, whereas increasing  $D_c$  has a significant effect on restraining  $\varepsilon$  when  $D_c$  is bigger. In addition, according to the analysis of the permanent deformation curve for CGSF, the unified calculation model of permanent deformation for CGSF under cyclic loading is established. Compared with the existing permanent deformation models, the proposed model in this paper can better describe the permanent deformation of CGSF under cyclic loading. Finally, the model parameters are analyzed, and the model is verified.

**Keywords:** dynamic behaviors; cyclic loading; permanent deformation; coal gangue subgrade filler; large-scale triaxial test

# 1. Introduction

Coal gangue is a waste material associated with the process of coal mine construction, coal exploitation, accounting for 15–20% of coal production. Now, more than 6 billion tons of coal gangue are accumulated on the surface of mining areas in China, and its emission has leaped to the top of China's industrial solid waste [1–3]. However, compared with the amount of released coal gangue, the utilization rate of coal gangue in China is low, resulting in a large amount of surplus coal gangue piled up on the useful land for a long time. The long-term accumulation of coal gangue has caused great harm to the surrounding environment [4,5]: ① A large number of useful land resources (such as cultivated land, forest land, and mining sites) are occupied. ② Dust particles easily float in the air, and coal gangue self-ignition produces many harmful gases, resulting in serious air pollution. ③ The piled-high coal gangue easily causes landslides, debris flow and other geological disasters. ④ Accumulated coal gangue seriously affects the

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surrounding landscape environment. Therefore, the effective utilization of coal gangue has great theoretical and practical significance.

The effective utilization of coal gangue waste has always been a hot topic that concerns many scholars. The physical and chemical characteristics of coal gangue are similar to natural gravel, so coal gangue can be broken down into a coarse aggregate of concrete, which can decrease the exploitation of natural gravel but can also save costs and avoid a series of hazards caused by it [6-8]. Hence, the study on coal gangue concrete has been focused on by many scholars in recent years [9,10], and the results indicate that the mechanical behaviors of coal gangue concrete, made by replacing a certain amount of gravel with coal gangue, are close to that of ordinary concrete of the same grade. Zhao et al. [11] investigated the effect of partial replacement of fly ash with natural loess on ganguecemented paste backfill (GCPB) performance. Gangue-cemented paste backfill specimens with varying loess doses were produced, and then the rheological properties, macroscopic strength, and microstructural evolution of GCPB were examined. Zhao et al. [12] studied the activation and hydration mechanisms of composite activated coal gangue geopolymer, and the results show that coal gangue can be employed as a primary cementitious material after being modified by the proposed activation method. Su et al. [13] studied the influence of thermally activated coal gangue powder on the structure of the interfacial transition zone in concrete.

However, compared with traditional concrete, the investigation of the coal gangue concrete still shows many deficiencies. The consumption of coal gangue used as subgrade filler is tremendous, which can effectively solve the problem of coal gangue accumulation. Chen et al. [14] studied the effect of the compactive effort and initial particle gradings on the particle size distribution of mineral waste slag based on screening tests and analyzed the effects of different factors such as the compactive effort, moisture content, coarse grain content (CGC, mass proportion of particles with sizes greater than 5 mm), and forming methods on the engineering properties of mineral waste slag to determine the reasonable roadbed construction parameters. In addition, the research on coarse aggregate subgrade filler has a great reference value for coal gangue subgrade filler [15–17].

As mentioned above, coal gangue is widely used as subgrade filler. The coal gangue subgrade is affected by the traffic dynamic loading in the actual environment. However, there is little research reporting the dynamic behaviors of coal gangue, especially considering coarse particles, used as subgrade filler under traffic cyclic loading. Hence, a series of cyclic triaxial tests was carried out using the LSDSTA to research the permanent deformation of CGSF (the maximum particle size is 60 mm) under cyclic loading. The purposes of this study are to (1) study the permanent deformation of coal gangue used as subgrade filler so as to realize resource utilization, (2) explore the effect of  $\sigma'_3$ ,  $D_f$ , and  $D_c$  on the permanent deformation to further understand the mechanical properties of CGSF, and (3) establish the unified model of permanent deformation in order to apply this to different types of permanent deformation.

#### 2. Laboratory Testing Program

### 2.1. Tested Materials and Apparatus

The original tested material of the specimens was crushed coal gangue, which was collected from a coal mine in Xiangtan city. The waste coal gangue in this mine is shown in Figure 1. Nearly 15 tons of coal gangue were transported to the laboratory for indoor tests and research. The original particle size of coal gangue not only contains fine particles less than 0.075 mm, but also includes stones of tens of centimeters. It should be noted that the maximum particle size allowed by the test equipment in this test does not exceed 60 mm. Considering that the specimens in this test were prepared manually, CGSF with particle sizes greater than 60 mm were removed. The color of coal gangue particles is black and black-gray, and the coal gangue has not experienced spontaneous combustion. Coal gangue particles are angular, sharp, and hard with a rough surface and an irregular shape. The CGSF was dried to constant weight in an oven at 105–110  $^{\circ}$ C (more than 24 h), and

then the standard sieve tests with aperture sizes of 60, 40, 20, 10, 5, 2, 0.5, and 0.075 mm were carried out. Coal gangue particles of each group after sieving tests were displayed in Figure 2. According to the JTG 3430-2020 Chinese standard for soil test method [18], the natural moisture content of CGSF is 2.20–2.98%, the liquid limit, the plastic limit, and the plasticity index of fine particles are 31.46%, 20.57%, and 10.89%, respectively. The coal gangue of this coal mine mainly includes sandstone, limestone, shale, and mudstone.



Figure 1. The waste coal gangue of a coal mine.



Figure 2. Coal gangue particles after sieving tests.

An LSDSTA manufactured by Chengdu Donghua Zhuoyue Technology Co., Ltd. (Chengdu, China), was used in this test, which is shown in Figure 3. The specimen sizes allowed by the LSDSTA are D = 300 mm and H = 600 mm. The ratio between the triaxial specimen diameter and the maximum particle size should not be smaller than 5 [19–21]; therefore, the maximum particle size allowed by LSDSTA in this test is no greater than 60 mm, and then the effect of specimen size can be neglected. The LSDSTA mainly includes the following parts: (1) a data acquisition system through a computer, (2) a testing machine control system, (3) a triaxial pressure cover, (4) an axial loading system, (5) a volumetric strain measurement system, and (6) a sample preparation mold, which are shown in Figure 3. The LSDSTA can automatically collect test parameters, such as axial load and displacement, confining pressure, pore pressure, and volumetric strain, as well as realize the static shear test and cyclic dynamic loading test. In addition, the large-scale triaxial tests and the same specimen size were widely used in the previous studies, e.g., Cai et al. [20] and Leng et al. [21], which guarantees the reliability of this apparatus.



Figure 3. The large-scale dynamic and static triaxial instrument.

### 2.2. Specimen Preparation and Testing Program

The only way to characterize the grading of granular materials is to use the grading curve. The grading curve contains a large amount of data; however, it lacks quantitative indicators. Hence, it is difficult to make the comparison of the particle size distribution with different gradings of granular materials. In order to completely express the grading of particles and quantitatively analyze the relationship between grading and relevant mechanical indexes, the grading of granular materials is quantified by establishing the grading equations with mathematical formulas, which has great significance for engineering practice and academic research. In this test, the method of artificial sample preparation according to FMGE was used, and the FMGE is defined as [22–24]

$$P_i = \left(\frac{d_i}{d_{max}}\right)^{3-D_f} \times 100\% \tag{1}$$

where  $D_f$  represents the fractal dimension,  $d_i$  presents the particle size (mm),  $P_i$  denotes the cumulative mass percentage with particle size less than  $d_i$  (%), and  $d_{max}$  indicates the maximum particle size (mm).

The control parameters of well grading for CGSF are the coefficient of uniformity ( $C_U$ ) and the coefficient of curvature ( $C_C$ ), and the calculation formulas are as follows [25,26]:

$$C_u = \frac{d_{60}}{d_{10}}$$
(2)

$$C_c = \frac{(d_{30})^2}{d_{10}d_{60}} \tag{3}$$

where  $d_{60}$ ,  $d_{30}$ , and  $d_{10}$  refer to the particle size corresponding to the passing percentage of 60%, 30%, and 10% in the grading curve, respectively (mm).

CGSF with well grading satisfies  $C_u \ge 5$  and  $1 \le C_c \le 3$ . Furthermore, combining Equations (1)–(3), the range of well grading can be captured based on the FMGE:

$$1.89 = 3 - \frac{\lg 6}{\lg 5} \le D_f \le 3 - \frac{\lg \left(\frac{3}{2}\right)}{\lg 3} = 2.63 \tag{4}$$

According to Equation (4), 4 groups of tests with different fractal dimensions, i.e.,  $D_f = 1.89, 2.13, 2.37$ , and 2.61, were designed to carry out the experimental research, and the test design grading curve is shown in Figure 4. A cylindrical specimen with D = 300 mm and H = 600 mm was utilized in this test; D and H are the diameter and height of the specimen, respectively. According to the Chinese Standard of Soils for Highway Engineering [18], the maximum dry density of the specimen can be obtained. Compaction degree, which was widely used for the triaxial test and situ construction [27,28], is calculated as follows:

$$D_c = \frac{\rho}{\rho_{max}} \times 100 \tag{5}$$

where  $\rho_{max}$  denotes the maximum dry density (g/cm<sup>3</sup>),  $\rho$  is the dry density of the specimen (g/cm<sup>3</sup>), and  $D_c$  represents the compaction degree (%).



Figure 4. Particle size distribution of the tested materials.

In this test, the compaction degree was used to control the preparation of specimens and  $D_c = 90\%$ , 93%, and 96% were adopted. In addition, the compaction degree meets the requirements of the road base and subbase materials [18].

Figure 5 shows the process of the large triaxial tests. First, the above drying CGSF (as displayed in Figure 2) should be well mixed according to the designed grading curve (as shown in Figure 4). The specimen prepared in this test was too large and heavy at the laboratory. Therefore, the specimen was compacted with a compaction hammer in a mold in five layers (as shown in Figure 5a). Before placing CGSF on the next layer, the surface of the previously compacted layer was scraped to a depth of about 20 mm to guarantee well-interlocking vertically adjacent layers, just as in other studies [20,29,30]. The target compaction degree of the CGSF specimen was reached by controlling the thickness of each individual layer and the mass of added CGSF. After compaction, a rubber membrane was used to enclose the specimen, and the top and bottom of the specimen were tied with rubber ropes. Figure 5b displays the prepared sample.

Then, the specimen was put in the triaxial pressure cover. All of the specimens were saturated by back pressure before loading, as described by Kong et al. [31], Cai et al. [20], Chen et al. [32], and Wu et al. [33]. The specimens were considered completely saturated when the pore pressure coefficient *B* was larger than 0.95. After that, the required effective confining pressure was applied to the specimen to complete the isotropic consolidation.



**Figure 5.** The process of the large triaxial tests: (**a**) compacting in the mold; (**b**) the prepared sample; (**c**) failed sample after the test.

The research shows that traffic loading is different from the sine wave, but very similar to the half-sine wave [34]. Therefore, the half-sine wave was used to simulate the traffic cyclic dynamic loading. The dynamic loading frequency was chosen as 1 Hz in these tests, which was also used in [21,34]. This paper mainly focuses on the permanent deformation of CGSF, and the confining pressures (i.e., effective consolidation stress),  $\sigma'_{3'}$ , of 50, 100, and 150 kPa were selected in this test. The cyclic dynamic loading in railway subgrade is generally distributed between 35 kPa and 185 kPa [35,36]. Therefore, the axial dynamic stress amplitude was taken as 180 kPa in the separate loading test of each sample, and each specimen was loaded with 30,000 numbers of half-sine wave separately in this test. In addition, Wang et al. [37] studied the permanent deformation of reinforced gravelly soil filler under cyclic loading with dynamic stress amplitudes of 90 kPa and 135 kPa.

The test scheme design is shown in Table 1. The large-scale triaxial test can investigate the mechanical properties with large-size particles, which is closer to the engineering practice. Hence, the large-scale triaxial test has been widely used in recent years. Three groups of parallel tests were carried out at the same time under each test condition, and one group was randomly selected for key analysis. The loading process in this test is shown in Figure 6.



Figure 6. Loading process under cyclic loading.

Specimen Number	$D_f$	$\sigma_3^{'}$ (kPa)	D <sub>c</sub> (%)
DT01	2.37	50	93
DT02	2.37	100	93
DT03	2.37	150	93
DT04	2.37	50	90
DT05	2.37	50	96
DT06	2.61	50	93
DT07	2.13	50	93
DT08	1.89	50	93

Table 1. Test scheme design.

#### 3. Permanent Deformation Analysis

The monitoring data show that the permanent deformation of the subgrade under the traffic cyclic loading is very considerable and even has an obvious impact on the normal operation of the project [36]. Therefore, accurate analysis and prediction of the permanent deformation for the subgrade have important theoretical and practical significance for the normal use and safe operation of the completed project and for the guidance of future project construction.

According to the theory of elastoplastic mechanics [35], the axial strain of a coal gangue sample under cyclic loading includes elastic strain  $\varepsilon^{e}$  and plastic strain  $\varepsilon^{p}$ , namely:

$$\varepsilon_1 = \varepsilon^e + \varepsilon^p \tag{6}$$

where  $\varepsilon_1$  represents the axial strain of the specimen;  $\varepsilon^e$  denotes the elastic strain; and  $\varepsilon^p$  indicates plastic strain.

The elastic strain will recover during the loading and unloading process, while the plastic strain cannot recover and will gradually accumulate, resulting in the failure of the sample. Therefore, the cumulative plastic strain causes permanent deformation, and the permanent deformation ( $\varepsilon$ ) studied in this paper is the cumulative plastic strain under cyclic loading. The calculation diagram is shown in Figure 7.



Figure 7. Schematic diagram of the permanent deformation calculation.

#### 3.1. Effect of Confining Pressure on the Permanent Deformation

According to the above test scheme, the relationship between the permanent deformation ( $\varepsilon$ ) and the numbers of cyclic loading (N) with different confining pressures is shown in Figure 8. The following can be seen from Figure 8: (1) The relationship curve between  $\varepsilon$ and N can be divided into three stages. The first stage is the rapid growth phase, and the curve has approximately linear growth. The second stage is the deceleration growth phase; the curve growth rate slows down obviously, and the curve gradient decreases gradually. The third stage is the approaching stability phase, and the permanent deformation closes to stable. (2) As observed in Figure 8,  $\varepsilon$  decreases by 2.79% when the confining pressure increases from 50 kPa to 100 kPa, whereas  $\varepsilon$  decreases by only 0.30% when the confining pressure increases from 100 kPa to 200 kPa. Hence, the effect of confining pressure on  $\varepsilon$  is related to the level of confining pressure. When the confining pressure is smaller, its effect on  $\varepsilon$  is significant, whereas when the confining pressure is larger, its influence on  $\varepsilon$  is smaller. This also reflects that the effect of traffic cyclic loading on subgrade decreases with the increase of subgrade depth.



Figure 8. The relationship between  $\varepsilon$  and N with different confining pressure values.

#### 3.2. Effect of Grading on the Permanent Deformation

The relationship between  $\varepsilon$  and N with different gradings is displayed in Figure 9. As demonstrated in Figure 9: (1)  $\varepsilon$  increases approximate linear when N is less than 400. The growth rate of  $\varepsilon$  begins to slow down and gradually decreases when  $400 \le N \le 1000$ .  $\varepsilon$  tends to be stable when N is more than 1000. The abovementioned laws apply to the final stability relationship curve between  $\varepsilon$  and N. Therefore, N = 1000 can be used as a criterion for reaching the stable stage of CGSF, which can guide the later test loading and coal gangue subgrade engineering. (2) Under the condition of maximum fine particle content ( $D_f = 2.61$ ), the coal gangue sample will fail ( $\varepsilon$  reaches 15%) rapidly when N is very small (N = 535). Moreover, in these four groups of tests,  $\varepsilon$  of the coal gangue sample is the smallest when  $D_f = 2.13$ . Hence, the influence of grading, i.e., particle size distribution, on  $\varepsilon$  of coal gangue samples is significant. With the increase of the fractal dimension  $(D_f)$ ,  $\varepsilon$  first decreases and then increases, reflecting that there is an obvious optimal grading for coal gangue samples under cyclic loading. Wu et al. [26,38] studied the compaction characteristics of coarse aggregates for embankment dams using the surface vibration compaction test and lateral compression test, which showed that there is an optimal grading of coarse aggregate. In addition, through the large-scale vibration compaction test and static shear test, the authors of [39] also investigated the influence of grading on the compaction and strength of CGSF, and then the optimal grading, i.e.,  $2.04 \le D_f \le 2.55$ , was captured using FMGE. The reason for this phenomenon is related to the contact relationship and interlocking relationship between coarse and fine particles. These conclusions are all consistent with this study.



**Figure 9.** Relationship between  $\varepsilon$  and *N* with different grading parameters.

### 3.3. Effect of Compaction Degree on the Permanent Deformation

The evolution of  $\varepsilon$  versus *N* with different compaction degree values is displayed in Figure 10. As demonstrated in Figure 10: (1) The relationship between  $\varepsilon$  and *N* with different compaction degree values is consistent with the variation laws under different confining pressures and grading parameters. (2) When the compaction degree increases from 90% to 93%, the development of  $\varepsilon$  is hardly affected. However, when the compaction degree increases from 93% to 96%, increasing compaction degree has a significant effect on restraining  $\varepsilon$ . Therefore, the effect of compaction degree on  $\varepsilon$  of CGSF depends on the level of compaction degree.  $\varepsilon$  is hardly affected when the compaction degree is smaller, whereas increasing the compaction degree has a significant effect on restraining  $\varepsilon$  when the compaction degree is bigger.



Figure 10. Evolution of  $\varepsilon$  versus N with different compaction degree values.

# 4. Unified Model of Permanent Deformation

# 4.1. Comparative Analysis of Existing Models

The establishment of a permanent deformation model has always been the focus of many scholars. The most widely used model was proposed by Monismith et al. [40], which was defined as:

$$\varepsilon = \alpha_1 N^{\beta_1} \tag{7}$$

where  $\varepsilon$  indicates the permanent deformation, *N* represents the numbers of cyclic loading, and  $\alpha_1$  and  $\beta_1$  are the fitting parameters of this model.

The permanent deformation model proposed by Li et al. [35] was defined as:

$$\varepsilon = \alpha_2 \left( 1 - e^{-\beta_2 N} \right) \tag{8}$$

where 
$$\alpha_2$$
 and  $\beta_2$  are the fitting parameters.

Liu et al. [41] proposed the following permanent deformation model:

$$\varepsilon = \alpha_3 + \beta_3 \ln N \tag{9}$$

where  $\alpha_3$  and  $\beta_3$  are the fitting parameters.

Wang et al. [37] proposed the permanent deformation model as follows:

$$\varepsilon = \frac{N}{\alpha_4 + \beta_4 N + \gamma_4 N^{0.5}} \tag{10}$$

where  $\alpha_4$ ,  $\beta_4$ , and  $\gamma_4$  are the fitting parameters.

According to the relationship between  $\varepsilon$  and N presented in Figures 8–10, the permanent deformation of CGSF under cyclic loading is analyzed using a data-fitting method based on the above models in Equations (7)–(10). Analysis shows that fitting parameters of CGSF in Equation (10) cannot be obtained. Hence, Equation (10) is not investigated in this paper. The fitting parameters are displayed in Table 2.

Tał	ole	2.	Μ	loc	lel	l parameters.
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Specimen Number	DT01	DT02	DT03	DT04	DT05	DT06	DT07	DT08
α1	3.9085	2.8126	3.2501	4.9523	1.6604	12.1707	2.5312	3.7737
$\beta_1$	0.0667	0.0550	0.0345	0.0432	0.0693	0.0323	0.0635	0.0482
$R^2$	0.8159	0.7709	0.7050	0.7170	0.8585	0.3876	0.8570	0.7742
α2	7.3600	4.7367	4.4983	7.4476	3.2039	16.5600	4.6217	5.9533
$\beta_2$	0.0033	0.0041	0.0102	0.0062	0.0031	0.0051	0.0033	0.0047
$R^2$	0.6947	0.7091	0.5936	0.7042	0.6320	0.8911	0.6038	0.6182
α3	2.8128	2.2945	3.0339	4.4157	1.1584	11.2994	1.9108	3.2612
$\beta_3$	0.4808	0.2584	0.1558	0.3216	0.2163	0.5537	0.2866	0.2850
$R^2$	0.8560	0.8095	0.7321	0.7494	0.8980	0.4149	0.8937	0.8091

According to the correlation coefficient ( $R^2$ ) of fitting parameters in Table 2, the existing permanent deformation model cannot accurately enough describe the permanent deformation of CGSF under cyclic loading, and  $R^2$  values are all less than 0.9. The permanent deformation curve can be divided into three types [42]: (1) Stable/attenuation type, where  $\varepsilon$  first increases with the increase of N and then tends to stay at a stable value when N achieves a larger value. (2) Failure type, where  $\varepsilon$  will increase sharply until the specimen fails when N reaches a bigger value. (3) Criticality type, where  $\varepsilon$  distributes between (1) and (2). The existing permanent deformation model can describe the variation of one certain type of the mentioned curves well; however, there is a lack of a unified model of permanent deformation used for different types of permanent deformation curves. Therefore, it is necessary to put forward a unified model which can be generally applicable to different types of permanent deformation CGSF tests.

### 4.2. Establishment of Unified Model for Permanent Deformation

Based on the above analysis of the permanent deformation curve for CGSF and the comparative analysis of existing models, the relationship between  $\varepsilon$  and N is analyzed using regression using MATLAB, and then the unified calculation model of permanent deformation for CGSF under cyclic loading is established:

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$$=\frac{pN}{q+N}$$
(11)

where *p* and *q* are the model parameters.

The model parameters in Equation (11) are solved using the least square method, that is:

$$\sum_{i=1}^{n} \left[ \varepsilon - \frac{pN}{q+N} \right]^2 = \min\left\{ \sum_{i=1}^{n} \left[ \varepsilon - \frac{pN}{q+N} \right]^2 \right\}$$
(12)

The model parameters obtained by Equations (11) and (12) are shown in Table 3. Figure 11 presents the comparative analysis of  $R^2$  for the above permanent deformation models, i.e., Equations (7)–(9), and Figure 12 shows the comparison between the proposed model and the test curve. It can be seen from Table 3, Figures 11 and 12, compared with the existing permanent deformation models, that the proposed model in this paper can better describe the permanent deformation of CGSF under cyclic loading. The  $R^2$  of the proposed model is bigger than 0.9, which is larger than the other models. The correctness of the model is preliminarily verified.

Table 3. Parameters of the proposed model.

Specimen Number	DT01	DT02	DT03	DT04	DT05	DT06	DT07	DT08
р	7.5179	4.8175	4.5371	7.5381	3.2774	16.7341	4.7171	6.0390
9	178.5503	135.5844	55.5003	87.8797	193.5777	84.8601	172.0490	111.6893
$R^2$	0.9165	0.9391	0.9031	0.9279	0.9104	0.9675	0.9034	0.9152



Figure 11. Correlation coefficient comparison of permanent deformation models [35,40,41].





### 4.3. Model Parameter Analysis

Based on the test data of the DT02 specimen, i.e.,  $\sigma'_3 = 100$  kPa,  $D_f = 2.37$ , and  $D_c = 93\%$ , the physical meaning of the proposed model (Equation (11)) parameters is analyzed by changing the model parameter values, as shown in Figure 13 (the model parameters of fitting curve in Figure 13 are p = 4.8175, q = 135.5844).

It can be seen from Figure 13 that, when q is constant, the N required before the permanent deformation curve tends to be stable is basically unchanged with the increase of p, whereas the stable value of the permanent deformation curve increases accordingly. Therefore, p reflects the permanent deformation in the stable stage. The greater p occurs with the bigger permanent deformation. Similarly, when p is constant, with the increasing q, the permanent deformation at the stable stage remains unchanged, whereas the N required before the curve tends to be stable increases. Hence, q indicates the N required before the permanent deformation curve tends to be stable, and the greater N required before the permanent deformation curve tends to be stable stage occurs with a larger q.



Figure 13. Model parameters analysis.

The above analysis studies the physical meaning of the model parameters by changing the parameter values. Then, the correctness of the above model parameter analysis will be further verified from a mathematical point of view.

For the unified model of permanent deformation, i.e., Equation (11), when *N* tends to be 0:

$$\lim_{N \to 0} \varepsilon = \lim_{N \to 0} \frac{pN}{q+N} = 0 \tag{13}$$

Before test loading, the permanent deformation of the sample is 0, and the model is consistent with the actual situation. When the coal gangue sample experiences a large number of cyclic loadings:

$$\lim_{N \to \infty} \varepsilon = \lim_{N \to \infty} \frac{pN}{q+N} = \lim_{N \to \infty} \frac{p}{\frac{q}{N}+1} = p$$
(14)

According to Equation (14), when N is large enough, the denominator approaches 1, and the maximum value of permanent deformation is equal to p. Therefore, p reflects the permanent deformation in the stable stage. For Equation (14), the smaller N required before the permanent deformation curve reaches the stable stage occurs with the lesser q. It can be seen that the analysis of model parameters from the perspective of mathematics and test curve is consistent.

### 4.4. Model Validation

The test data of Figure 8a in Li et al. [35], Figure 3 in Wang et al. [37], and Figure 3a in Mei et al. [43] were selected to verify the correctness of the unified model of permanent deformation in this paper. Figure 14a–c display the fitting effect of the test data in the above research and the permanent deformation model established in this paper. It can be seen from Figure 14 that the permanent deformation model established in this paper can describe the permanent deformation test results in the existing research well, thus verifying the correctness of this model. In addition, three types of the permanent deformation curve in Figure 14 can be described well by the unified model of permanent deformation in this study, which shows the universal applicability of the model in this paper.



(c)



# 5. Conclusions

The following conclusions can be drawn from the investigation described above.

- Experimental grading was designed by using FMGE, and the well-grading limits of CGSF were captured based on the FMGE, i.e., the grading is uniform when 1.89 ≤ D<sub>f</sub> ≤ 2.63.
- (2) The relationship curve between ε and N can be divided into three stages, i.e., the rapid growth phase, the deceleration growth phase, and the approaching stability phase. N = 1000 can be used as a criterion for reaching the stable stage of CGSF, which can guide the later test loading and coal gangue subgrade engineering.
- (3) The effect of confining pressure on ε is related to the level of confining pressure. The effect of confining pressure on ε is significant when the confining pressure is smaller, whereas the influence of confining pressure on ε is smaller when the confining pressure is larger.
- (4) The influence of grading on ε of coal gangue samples is significant. With the increase of D<sub>f</sub>, ε first increases and then decreases, reflecting that there is an obvious optimal grading for coal gangue samples under cyclic loading.
- (5) The effect of compaction degree on ε of CGSF depends on the level of compaction degree. ε is hardly affected when the compaction degree is smaller, whereas increasing compaction degree has a significant effect on restraining ε when the compaction degree is bigger.

(6) According to the analysis of the permanent deformation curve for CGSF, the unified calculation model of permanent deformation for CGSF under cyclic loading was established. Compared with the existing permanent deformation models, the proposed model in this paper can better describe the permanent deformation of CGSF under cyclic loading. Then, the model parameters were analyzed and the model was verified.

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**Abstract:** Low liquid limit clay has a low plastic index, displays poor strength, and is sensitive to water, and its mechanical qualities decline as the water content changes, making it difficult to employ directly in the construction process. Adding lime is a fantastic way to improve it. The influence of lime concentration on the road performance of low liquid limit clay is investigated in this research using a limit water content test, compaction test, and California bearing ratio test. The results show that the original plain soil does not meet the requirements of highway subgrade filling, and the basic properties of subgrade soil are improved to varying degrees after adding lime, resolving the problem regarding the original well-cultivated soil's inability to meet the requirements of construction. The plastic limit of the improved soil increased by roughly 3% as the lime content increased, but the maximum dry density decreased dramatically by 9.03%, 5.71%, and 5.98%, respectively. With an increase of 57.3% in lime content rises as the lime content rises. The optimal dosage is 6%, according to a rigorous study of several performance metrics.

Keywords: low liquid limit clay; lime improvement; CBR; compaction; liquid plastic limit

### 1. Introduction

The Yellow and Yangtze River basins in China include a considerable number of low liquid limit clays. The use of low liquid limit clay as roadbed filler in the construction of expressways in this area is unavoidable. However, because of the low liquid limit, poor plasticity index, low strength, and water sensitivity, the mechanical properties of low liquid limit clay deteriorate with water changes [1,2], making it difficult to compact in roadbed construction. Because of its water sensitivity, water migration is common as the environment changes, affecting road performance [3]. The elastic modulus is significantly influenced by the stress state and water content of compacted clay. This directly affects road service [4]. In addition, it is simple to create roadbed collapse and pavement cracking if it is employed during the active period of a highway, which will directly impact the safety of traffic operation. To meet the performance requirements for the road, it is crucial to improve the low liquid limit clay.

Presently, bad soil is typically improved using physical (soil compaction, etc.) and chemical approaches. The three primary additions utilized in chemical stability are lime, cement, and fly ash [5–9]. Due to its low cost, positive effects, and practical construction, lime has drawn the interest of several researchers and produced many research-related findings. In Yan'an City, Gao et al.'s [10] research looked at the impact of dry density and lime content on the hydraulic conductivity and microstructure of loess. Due to the negative logarithmic correlation between hydraulic conductivity and dry density, adding lime will make loess less hydraulically conductive at the same dry density. However, lime addition causes a decrease in dry density at a specific level of compaction because of increased

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Copyright: © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). flocculation and aggregation. Al-Mukhtar et al.'s study of the main geotechnical properties of untreated and lime-treated compacted FoCa clay samples used X-ray diffraction, thermogravimetric analysis, scanning electron microscopy (SEM), and transmission electron microscopy (TEM) [11]. The findings demonstrate that lime-treated clay has additional layers of accumulation, altered clay particles, and a higher calcium content at the particle border. By conducting studies on lime-stabilized loess with various moisture levels and temperatures, Bao Weixing [12] looked at the features of lime stability and internal mineral changes at high temperatures. The pozzolanic reaction, crystallization reaction, and lime ripening reaction all contribute to the strength improvement of lime-stabilized loess. The response rate of these processes can be accelerated by high temperatures. Eades and Grim [13] claim that the lime stabilization process consists mostly of two steps. It may take several hours or days to finish the first stage of alteration. According to the soil's mineralogical makeup, cation exchange, flocculation, carbonization, and various short-term pozzolanic reactions take place at this stage. The pozzolanic process can also increase strength and durability, which is the second stage. In order to assess the effects of compaction delay and ambient temperature on the physical, mechanical, and hydraulic properties of lime-treated expansive clay, Hatim Ali [14] conducted a number of tests. Al-Mukhtar et al.'s [15] research examined the effects of a 10% lime treatment on several clay minerals. The consumption of lime on the curing time was assessed using an atomic absorption device, revealing the mechanism underlying the mineral reaction and the shortand long-term curing of lime soil subgrade. Malkathi [16] conducted studies to lower the clay and silt content in CSEB manufacturing and discovered the stability of lime and lime-cement combinations as stabilizers. According to the test results, lime-stabilized blocks can be utilized for single-layer construction, and lime combined with cement stabilizer results in blocks with greater compressive strength than lime alone. Noorzad [17] conducted triaxial tests, including the Atterberg limit, standard invigilation compaction, unconfined compressive strength, and unconsolidated undrained strength, to assess the impacts of the stabilizer type, variable curing duration, and different lime-sludge ratio. The results of the tests indicate that sludge and lime can improve the maximum strength. The fundamental interactions between lime and clay during the stabilization process have also been extensively researched and elucidated. They contend that the four reactions listed below-cation exchange, flocculation and agglomeration, lime carbonization, and finally, volcanic ash reaction—are responsible for the improved performance of lime-stabilized soil [18–26]. The strength of lime soil is produced through a pozzolanic reaction, which is the most important process. There are only a few studies on low liquid limit clay, and the majority of them are about new roadbeds, while a small number of them are about road reconstruction and expansion. The aforementioned studies primarily concentrate on the mechanism of the lime improvement of poor soil, and the research objects are primarily expansive soil and saline soil, etc.

The effectiveness of lime as a stabilizer has also been thoroughly researched by academics. Raheem et al. [27] stabilized lime with 5–25% lime content utilizing laterite as the test object. Compressed stabilized earth blocks (CSEB) were stabilized with lime by Ramirez et al. [28], and the ideal lime concentration was 28%. Lime was employed as a stabilizer by Guettala et al. [29] to alter the proportion of clay to sand, and they found that 8% was the best dosage. Lime is another stabilizer used by Ngowi [30], and the ideal dosage is 15%. Lime is used by Akpokodje [31] as a stabilizer to provide the best lime content in various material proportions. According to a review of earlier studies by Bogas et al. [32], the optimal lime level is between 6% and 12%. The findings of the pertinent research that the aforementioned academics conducted on lime as a stabilizer are displayed in Table 1. The ideal lime content range is often between 6% and 15%, however there is no precise and optimum value of lime content for diverse uses and types of improved soil.

	Application	Optimum Content
Literature [28]	CSEB	28%
Literature [29]	Sand and clay	8%
Literature [30]	CSEB	15%
Literature [31]	Clay and silt	6–12%
Literature [32]	-	6–12%

Table 1. The best dosage of lime under different coating [28-32].

In conclusion, lime has a wide variety of applications and has a good application effect in improving expansive soil, red clay, and other soils. Relevant studies have also produced fruitful outcomes, but there are still some limitations. For example, the studies mentioned above mostly concentrate on the research mechanism, while there is a dearth of study on low liquid limit clay, new roadbeds, and rehabilitation and expansion. In order to identify the representative low liquid limit clay, this paper analyzes its natural moisture content, particle gradation composition, boundary moisture content, compaction test results, and California bearing ratio (CBR value) as specific research indicators. It then modifies this clay by adding digestion lime to study its basic performance indicators. The optimum lime content of subgrade filling provides a reference and guidance for construction. It provides a feasible disposal idea for road construction.

### 2. Testing Program

#### 2.1. Basic Properties of Low Liquid Limit Clay

The soil samples used in this paper are from the Hefei-Dagudian section of the Shanghai-Shanxi Expressway reconstruction and expansion project; the soil samples of three different project soil fields are chosen for research. The three soil samples returned from different project soil fields are marked as soil sample A, soil sample B, and soil sample C, respectively. Figure 1 depicts the soil sampling site and some soil samples that have been classified.



(a) Soil field to take soil



(b) Soil samples

Figure 1. Soil field and Soil samples.

(1) Natural moisture content

After the return of the undisturbed soil samples from the soil field, the natural moisture content was tested by the drying method. The test is conducted strictly in line with Highway Soil Test Specification JTG3430-2020. Five samples are taken for each soil sample in order to confirm the validity of the test results, and the average value is used to represent the natural water content of the undisturbed soil. Table 2 displays the test results.

Comulo		S	ample Moistu	ure Content (%	5)	
Sample	1	2	3	4	5	Average
А	24.8	23.3	25.2	28.1	29.1	26.1
В	25.7	25.4	25.5	22.7	24.2	24.7
С	20.6	21.9	20.2	20.3	24.0	21.4

Table 2. Natural moisture content of soil sample.

### (2) Particle grading

In order to analyze the gradation composition of soil samples with a particle size range of 0.075~60 mm, a particle screening test was carried out by Highway Geotechnical Test Procedure JTG3430-2020. The test steps are as follows: Firstly, the samples were weighed according to the regulations, and the samples were passed through a 2 mm sieve in batches. Samples larger than 2 mm were passed through coarse sieves at all levels larger than 2 mm from a large to small order. The soil left on the sieve is weighed separately. If the amount of soil under the 2 mm sieve is too much, it can be reduced to 100~800 g by quartering. Samples less than 2 mm were passed through a fine sieve at all levels from a large to small order. Shaking can be carried out by a shaker. The shaking time is generally 10~15 min. Starting from the sieve with the largest pore size, each sieve is taken down in sequence, and shaken with the hand on the white paper until the number of sieves per minute is no more than 1% of the residual mass of the sieve. The leaking soil particles should be put into the next sieve, and the soil samples left on each sieve should be brushed with a soft brush and weighed separately. The difference between the total mass of the soil under the sieve and the total mass of the sample before the sieve should not be greater than 1% of the total mass of the sample before the sieve. Finally, three soil sample gradations are obtained through experiments, as shown in Figure 2. Figure 2 shows that the mass percentage of soil sample A (less than 0.075 mm) is 93.2%, the mass percentage of soil sample B (less than 0.075 mm) is 61.8%, and the mass percentage of soil sample C (less than 0.075 mm) is 93.5%.





### 2.2. Preparation of Digestion Lime

The digestion lime that was collected from the lime digestion site is the lime digestion lime that was used in this article. Since the digestion lime retrieved from the site contains some water, it cannot be used to directly prepare the test soil for this paper's purposes. Before being utilized for the test, it needs to be processed. The following are the precise therapy steps: The site's recovered digestion lime samples were dried for 24 h in an oven at



(a) lime digestion site



(c) sifting



105 °C. A 0.5 mm sieve was used for screening, and a lime that was less than 0.5 mm thick

was used for this test. Figure 3 depicts the particular test procedures.

(b) slaked lime drying



(d) slaked lime after 0.5 mm sifting

Figure 3. Lime preparation for test.

### 2.3. Test Scheme

The following three experiments were conducted in this experiment to examine the changing rule of the boundary moisture content of subgrade filling with varying lime contents: California bearing ratio test (CBR), compaction test, and boundary moisture content test. The design documentation was consulted for the engineering filler's required lime content in the test lime soil configuration. The lime content in the areas where the degree of compaction is 93% and 94% is 4%, and the lime content in the 96% area is 6%. Therefore, the test involved in this paper is sets up six lime contents of 0%, 1%, 2%, 4%, 6%, 8%, and the corresponding lime content is mixed with the test soil to prepare the lime soil used in the test. After the preparation of the test soil samples, the road performance tests, such as the limit water content, compaction test, and CBR value test, were carried out according to the test procedures. The specific test plan is shown in Table 3. Each group of experiments was repeated three times, and the average value was removed for subsequent analysis.

	Lime Content of Soil Sample A	Lime Content of Soil Sample B	Lime Content of Soil Sample C
Water ratio limit test	0%, 1%, 2%, 4%, 6%, 8%	0%, 1%, 2%, 4%, 6%, 8%	0%, 1%, 2%, 4%, 6%, 8%
compaction test	0%, 1%, 2%, 4%, 6%, 8%	0%, 1%, 2%, 4%, 6%, 8%	0%, 1%, 2%, 4%, 6%, 8%
CBR	0%, 1%, 2%, 4%, 6%, 8%	0%, 1%, 2%, 4%, 6%, 8%	0%, 1%, 2%, 4%, 6%, 8%

#### Table 3. Test schedule.

#### 2.4. Test Method

The liquid-plastic limit of soil is determined by a combined liquid-plastic limit tester, which reflects the interaction between soil particles and water, and can indirectly reflect the engineering properties of soil. These are the test steps: In order to ensure that the water content of the soil samples was controlled within the liquid limit (point a), and slightly larger than the plastic limit (point c) and the intermediate state (point b), of the two, 200 g of treated soil samples were taken and separately put into three soil containers. A soil cutter was used to mix the soil, which was then sealed for over 18 h. After scraping the surface and setting it on the lifting seat, the lifting knob was steadily turned clockwise while the adjusted soil sample was inserted into the test cup. The indicator light turned on instantly, stopped rotating, and pressed the "measurement" button to wait for the test to finish the reading when the soil sample made contact with the cone tip. The previous steps were repeated until the test was over. A portion of the sample must be taken after the test has finished in order to determine the water content. The weight of the cone is 100 g.

A compaction test is a technique that involves hammering soil samples to determine the soil's propensity for compaction. This technique involves hammering soil samples with varying water contents using various compaction techniques to produce the maximum dry bulk density and ideal water content, which serves as the foundation for the design and construction of filling engineering. Samples were made with varying amounts of lime content, including 0%, 1%, 2%, 4%, 6%, and 8%. Dry heavy compaction was used in the compaction test, with 3 compaction layers and 98 compaction times for each layer. After compaction was completed, the sample in the cylinder was pushed out with the demolding instrument to determine the wet density of the sample, and then the representative soil sample was taken from the center of the sample to measure its water content, which was calculated as 0.1%.

#### 3. Test Results and Analysis

### 3.1. Limit Moisture Content

The measured result was mapped, and the horizontal coordinate was lime content and the vertical coordinate was moisture. The test results are shown in Figure 4.

Figure 4 shows that while the plastic limit of the three soil samples increases to some degree with an increase in lime content, the liquid limit of the three soil samples does not become more obvious. For soil sample A (plain soil), the respective liquid limit, plastic limit, and plastic index values were 48.9%, 21.2%, and 27.7%. For soil sample B (plain soil), the liquid limit, plastic limit, and plastic index were 48.6%, 25.2%, and 23.3%, respectively. The plain soil type C has a liquid limit, plastic limit, and plastic limit, and plastic index of 39.2%, 21.4%, and 17.8%, respectively.

Soil sample A's liquid limit, plastic limit, and plastic index were 48.6%, 24.2%, and 24.5% when the lime level exceeded 6%. Soil sample B had a plastic index of 19.6%, a plastic limit of 47.7%, and a plastic limit of 28.1%. Soil sample C had a liquid limit, plastic limit, and plastic index of 38.6%, 24.5%, and 14.1%, respectively. The three different types of soil samples all had their plastic limits raised by 3%, 2.9%, and 3.1%, respectively. Soil sample A's plastic limit had a propensity towards stability. The deplasticity index reduces with an increase in the plastic limit to some extent when the liquid limit does not increase evidently. This is because certain ion exchanges, carbonation, crystallization, and pozzolanic actions exist in lime-improved soil, which leads to the plastic limit of each soil sample increasing with the increase in lime content, while the plastic index decreases correspondingly.


Figure 4. Boundary moisture content test results.

Combined with the undisturbed soil particle grading obtained above, it can be seen from Highway Geotechnical Test Procedure JTG3430-2020 that the mass percentage of the fine grain groups of all soil samples is greater than 50%, the liquid limit of all soil samples is less than 50%, and the plasticity index is greater than 7%, indicating that these three soil samples are all low liquid limit clays (CL).

### 3.2. Compaction Test

The relationship curve between dry density and water content is drawn. The horizontal coordinate represents water content and the vertical coordinate represents dry density. The test results are shown in Figures 5–7.

It can be seen from the figure that the maximum dry density of lime-stabilized soil reaches its peak as the ash content of soil samples A and B increases from 0% to 8%, and reaches its peak when the ash content of soil sample B reaches 6%. Soil sample A decreased from 1.77 g/cm<sup>3</sup> to 1.61 g/cm<sup>3</sup> by 9.03%; soil sample B decreased from 1.75 g/cm<sup>3</sup> to 1.65 g/cm<sup>3</sup> by 5.71%; soil sample C decreased from 1.84 g/cm<sup>3</sup> to 1.73 g/cm<sup>3</sup> by 5.98%; and when lime content exceeded 6%, the maximum dry density decreased less. At the same time, with the increase in the ash mixing rate from 0% to 6%, the optimal water content has basically reached the maximum. Sample A increased from 14.7% to 16.7% (13.6%), sample B increased from 14.5% to 17.2% (18.6%), and sample C increased from 15.1% to 17.4% (15.2%). However, when the ash content increased from 6% to 8%, the improvement effect of increased lime dosage on low liquid limit clay was no longer obvious. The decrease in dry density is small, and the optimal water content is basically unchanged. On the

one hand, the water consumption of the improved soil is due to the exchange of  $Ca^{2+}$  in the lime with other cations on the soil surface. On the other hand, as lime dissolves and hydrates in the soil, the soil is pressed in real time, requiring more water to reduce the friction between particles for optimal compaction. Therefore, with different lime dosage, water consumption is also different, so the change in optimal water content is also different. Therefore, it can be concluded that 6% ash content is a reasonable dosage of improved low liquid limit clay in this area.



(b) Variation of compaction results under different lime content

Figure 5. Compaction test results of soil sample A.





Figure 6. Cont.



(b) Variation of compaction results under different lime content

Figure 6. Compaction test results of soil sample B.



(b) Variation of compaction results under different lime content

Figure 7. Compaction test results of soil sample C.

# 3.3. CBR

The carrying capacity of soil foundation materials and the soil foundation's resistance to deformation are measured using the CBR value. It is an important signal while constructing a roadbed. The bearing capacity of a material is defined as its ability to endure deformation under a local load, and standard gravel is used as the benchmark. This capacity is denoted by their relative ratio CBR value. Prior to the experiment, the specimen that has been prepared in accordance with the test guidelines must be immersed in water. In order to calculate the change in the humidity density of the specimen, the specimen is weighed after being removed from the solution and allowed to drain for 15 min. Following the results of the last compaction test, the sample for this test was prepared using 30, 50, and 98 compaction times. During sample preparation, the lime content was still 0%, 1%, 2%, 4%, 6%, and 8%, and the ideal moisture content was chosen. The results of the CBR test are displayed in Figures 8–10.



Figure 8. CBR test results of soil sample A.



Figure 9. CBR test results of soil sample B.



Figure 10. CBR test results of soil sample C.

It can be seen from the figure that with the increase in compaction times, the CBR values of stabilized soil with different ash content increase. In the case of the same compaction times, the CBR value increased by a large margin before 6%. When the ash content increased again, the increase was not obvious, and the curve tended to be stable. Taking the test with 98 times of compaction as an example, when the ash content increases from 0 to 6%, the CBR value increases from 5.4% to 57.3%. When the ash content increases again, the CBR value does not increase significantly or even decrease to 56.9. It shows that the increase in ash content can significantly improve the water stability of low liquid limit clay. It can be concluded that the ash content of 6% is a reasonable dose for improving low liquid limit clay in this area.

Longer compaction times improve the CBR value of stabilized soil with varied lime levels, mostly for the following two reasons: When lime first absorbs water from the soil, a lot of heat is emitted as the volume expands, which evaporates the water and improves the soil's quality. Second, some lime reacts with carbon dioxide in the atmosphere to form calcium carbonate, a weakly-bonding material that increases the soil's CBR value and strength to some level.

# 4. Discussions

In view of the problem mentioned above that the original engineering soil does not meet the filling requirements, this paper improved the original soil by mixing ash. At the same time, the improvement effect is judged by comparing the basic properties of undisturbed soil and lime-doped soil before and after mixing.

The addition of lime has little effect on the liquid plastic limit, and the plastic limit of the three soil samples is about 3%. This shows that the addition of lime does not change the plastic limit property of soil liquid considerably, but the addition of lime has a great effect on dry density and water content. As can be seen from Figures 5–7, the curve of water content and dry density presents the following rules with the increase in lime content: First, with the increase in lime content, the maximum dry density corresponding to the curve gradually decreases, while the optimal water content gradually increases. Moreover, the effect of lime improvement on the CBR value is also obvious. With the increase in compaction times, the CBR value of the soil sample will be increased to a certain extent. With the increase in lime content reaches 6%. Following the addition of lime, the basic physical characteristics of the original soil, such as the liquid-plastic limit, CBR, and optimal water content, can be enhanced due to the aforementioned interaction between lime and bad soil, allowing the bad soil that did not initially meet the filling requirements to do so.

Ion exchange, carbonation, and crystallization will occur throughout the process of enhancing low liquid limit clay with lime mixing, resulting in an increase in the plastic limit of each soil sample with an increase in lime concentration and a corresponding decrease in the plastic index. On the one hand, the interchange of Ca2<sup>+</sup> in the lime with other cations on the surface of the soil particle is what causes the water loss of the improved soil. On the other hand, more water is required to produce the best compaction effect because the dissolution and hydration of lime in the soil causes soil to be compressed in real time [18].

Compared with other treatment methods, such as replacement, lime improvement has the following advantages: first, lime improvement is convenient in construction, as it does not need to be transported back and forth to shorten the construction period and save costs; second, the price of lime is low, and the improvement of 1 m3 bad soil only needs about 60 rmb; finally, the technology of lime improved soil is mature, mixing is simple, and there is no complicated process.

### 5. Conclusions

In this research, the CBR test, compaction test, and limit water content test are used to assess and compare the differences between lime-improved soil and an untouched soil sample. The results of this inquiry were as follows:

- 1. After lime digestion improves the initial low liquid limit clay, the liquid limit essentially stays the same, the plastic limit increases as the lime content rises, and the plastic index gradually declines. After lime is introduced to the soil, ions from the lime and the soil exchange, causing the clay particles to form a granular structure. The rise in the plastic limit often remains steady once the lime content reaches 6%. It is also shown that a low liquid limit clay mixture with lime has a reasonable ash concentration of about 6%. When the lime content is 6%, the maximum dry densities are 1.61 g/cm<sup>3</sup>, 1.65 g/cm<sup>3</sup>, and 1.73 g/cm<sup>3</sup>, respectively. The optimal water content was 16.7%, 17.2%, and 17.4%, respectively.
- 2. The CBR value of the soil samples under various compaction durations considerably rose with an increase in ash content, showing that ash mixing had improved the water stability of low liquid limit clay containing sand. The acceptable ash content is 6% at the same time. When the lime content is 6% and the compaction times are 98, the CBR values are 57.4%, 54.2%, and 68.9%, respectively.
- The ideal water content and CBR value of the clay with low liquid limit are clearly impacted by the amount of dissolved lime added. The ideal water content falls as the incorporation amount increases, while the CBR value rises.
- 4. Plain soil does not meet the filling requirements of subgrade in areas 93, 94, and 96 of expressways. The performance of the improved soil has been improved to varying degrees after the ash mixing improvement, and it can meet the filling requirements of subgrade in areas 93, 94, and 96. According to the test, the most reasonable ash mixing amount of the improved soil is determined to be 6%.

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# Article Safety and Effect of Fly Ash Content on Mechanical Properties and Microstructure of Green Low-Carbon Concrete

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**Abstract:** Based on the promotion and application of green and low-carbon technology, this study aims to develop a high-safety performance cement concrete incorporating a large dosage of fly ash (FA). The safety and effect of FA content on the mechanical properties of FA composited cement were studied through compressive strength, flexural strength, and microscopic tests. The results show that when the FA replaced 20% cement, the properties of concrete were the best in this study. The flexural strengths and compressive strengths of the standard cured concrete for 28 days with 20% FA content are 0.82 MPa and 4.32 MPa larger than that of the pure cement concrete. The XRD and SEM analysis suggested that the mechanical properties of the composite cement FA system are improved significantly since the replacement of cement by FA promotes secondary hydration of calcium hydroxide in the concrete, leading to a more compact and safe interface between cement and FA.

Keywords: low-carbon concrete; fly ash; mechanical property; microstructure; high-safety performance

### 1. Introduction

Concrete is still an engineering material with the largest usage and the widest application range in construction projects since it has good plasticity, economy, high-strength, and durability [1]. Cement is an important component of concrete, and a lot of  $CO_2$  is emitted into the atmosphere during its production [2]. Cement production accounts for about 10% of the world's current annual CO<sub>2</sub> emissions, which is about 32.3 billion tones [3]. Ordinary Portland cement (OPC) requires a lot of energy to produce, and the manufacturing process releases toxic  $CO_2$  into the environment. Large amounts of  $CO_2$  emission leads to the greenhouse effect and aggravates global warming. A large portion of the waste produced in the manufacturing process is dumped and disposed of in landfills, damaging the soil and causing environmental pollution [4]. Since the sustainable development model of the social economy has been proposed, the protection of the environment and ecology is required in the production, use, maintenance, and reuse of concrete [5]. Meanwhile, climate anomalies caused by greenhouse gas emissions have become the focus of global attention, and the concrete industry is responsible for excessive emission of  $CO_2$  and other greenhouse gases [6]. The low carbon life aims to achieve the lower energy consumption and lower  $CO_2$  emission, which has received people's response and recognition [7]. The concept of green high-performance concrete can be summarized as saving resources and energy, not damaging the environment, helpong the environment, aiding sustainable development, and ensuring the healthy and happy survival of human offspring [8]. This philosophy has raised attention of the performance improvement and energy conservation of concrete [9,10]. Therefore, it is an inevitable choice for the future development of engineering materials to make the cement concrete industry moving towardslow-carbon and sustainable development.

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As an important link in sustainable development, the preparation methods of green and low-carbon concrete have been developed and promoted successively. The mechanical properties of concrete are affected by many factors, such as temperature and loading ratio [11,12]. Previous studies demonstrated that the reasonable composition ratio of mineral admixtures and recycled aggregates can greatly improve the performance of composite admixtures [13–15]. On the one hand, the compaction method and microstructure of concrete are also important factors affecting its performance [16]. Sengün, et al. [17] investigated the effect of four compaction techniques on the performance of concrete after 28 days through uniaxial compression and splitting tests. Results showed that the mechanical properties and mixing parameters of concrete are closely related to compacted density. On the other hand, an appropriate amount of mineral admixtures can achieve an effective supply of cement materials and improve the technical performance at a low cost [18,19]. Matar and Barhoun [20] found that the waterproofing admixture presents a strong inhibiting effect on the micro-cracking of the concrete surface by producing calcium silicate hydrates. Ji, et al. [21] performed laboratory tests to evaluate the hydration properties of concrete by adding magnesium slag, and the results suggest that a magnesium slag content of 30% can improve the working performance of concrete in frost resistance and crack resistance. Therefore, a series of mineral admixtures provide a convenient solution to enhance the mechanical properties of concrete considering the low-carbon and sustainability requirements.

A large amount of fly ash (FA) is produced in the coal industry every year as a byproduct with a low utilized value [22]. At present, given that the utilization rate of FA is about 50% in the world, a lot of FA waste is piled up in landfills, occupying much arable land and space [23]. Zhang, et al. [24] calculated the CO<sub>2</sub> emissions and cost of the concrete with FA addition and suggested that the effect of FA content on  $CO_2$  emissions is more obvious for higher-strength concrete. Uliasz-Bocheńczyk and Mokrzycki [25] reported the relative contribution of FA to reduce CO<sub>2</sub> emissions is higher than 15% in the production process. Based on the above consideration, many studies declared that FA can be applied suitably as a substitute for cement to meet the needs of hydration products in concrete preparation, which is also an effective measure to produce low-carbon concrete [26]. Therefore, the exploration of FA admixture has become a research topic of green low-carbon concrete [27]. In addition, the usage of FA in concrete not only improves concrete performance but also provides an economical and effective way to consume FA [28]. The existing study found that the main chemical components of FA, as a pozzolanic material, are SiO<sub>2</sub>, Al<sub>2</sub>O<sub>3</sub>, CaO, Fe<sub>2</sub>O<sub>3</sub>, and a small number of unburned carbon particles [29]. Its major phases are vitreous aluminum silica and a small amount of quartz, mullite, and other minerals. A large number of vitreous substances are the main source of the gelling activity of FA and have potential hydration reactivity [30]. The activation methods of FA mainly include calcium treatment, single alkali excitation (lime, sodium silicate), sulfate excitation (CaSO<sub>4</sub>, Na<sub>2</sub>SO<sub>4</sub>), physical fine grinding or physical fine grinding combined with chemical activators, etc. Hwang and Huynh [31] obtained fine ash with a particle size of less than 45  $\mu$ m by a wind separation method, which can improve the strength and working performance of concrete. Fan, et al. [32] demonstrated that the slurry fluidity and backfill strength of the cement material mixed with FA can meet the mining requirements of filling cement. Karakurt and Bayazıt [33] suggested that the strength of FA concrete may be obviously improved by activating the activity of FA with chemical admixtures. Poletanovic, et al. [34] found that the method of the combination of composite activation, mechanical activation, and chemical activator could enhance the activity of FA more significantly. Concrete consumption creates a large carbon footprint in the environment. Fly ash (FA), rice husk ash (RHA), and silica fume (SF) can replace cement in proper proportions to reduce  $CO_2$  emissions. FA affects the set-up time and sulfate resistance of concrete and can improve the workability of concrete mixtures. Conversely, the high surface area of SF particles reduces workability. A high LOI ratio indicates that RHA may evaporate when the concrete is exposed to high temperatures. FA and RHA, as substitutes for cement, have no adverse effect on

the compressive strength of concrete, whereas the incorporation of SF into concrete can improve the overall compressive strength, tensile strength, and elastic modulus of concrete. SF not only improves the bond between the cement paste and the aggregate but also has a key advantage as an alternative to cement due to its ability to reduce the permeability of concrete [35]. It has been established that the mechanical strength of concrete will be affected when the replacement level of RHA and SF synergies is above 30%, and that concrete with a continued increase in RHA content will have lower mechanical strength than ordinary concrete. When the RHA content is increased to a certain extent, higher flexural strength can be obtained, and the durability of the concrete can be improved [36]. The combination of FA and nS is adopted to replace ordinary Portland cement (OPC), which significantly improves the mechanical properties of environmentally friendly concrete and the form of the cement matrix. At the same time, homogenization of the cement matrix promotes structural alignment of the composite materials mixed with FA and nS and reduces the carbon footprint of cement-based materials [37]. In addition, the research on the properties of FA concrete mainly focuses on the physical and chemical properties of the material, whereas the research and test data on the mechanical properties of concrete are relatively few. Therefore, the mechanical properties of FA concrete are investigated in depth in this study.

This study aimed to explore the high safety performance of green and low-carbon concrete. The improvement effect of FA on the performance of the composite Portland-cement–FA system was investigated. Under the condition that the amount of binder and water, the ratio of water to the binder, and the total amount of material used in the specimen are equal, the concrete was prepared by adding the FA content instead of cement. Through the mechanical properties test, XRD, and SEM analysis, the influence law of FA content on the road performance of concrete was comprehensively discussed. The research results provide support for the future study of FA content in concrete from both theoretical and data aspects and obtains the optimal FA content.

### 2. Materials and Methods

# 2.1. Materials

This study used Portland cement, which comes from a cement plant in Ningxia.

Cement is a type of binder that can bond at room temperature. It can set and harden to adhere to sand, brick, stone, and other building materials. The chemical composition of cement contains the most  $Fe_2O_3$  content and quite a lot of SiO<sub>2</sub>.

 $Fe_2O_3$  in cement is responsible for the cement's acting as a flux in the high-temperature manufacturing process. It combines with Ca and  $Al_2O_3$  to form C2F, which is the main component of cement hardness.  $SiO_2$  is responsible for reacting with lime to form  $2CaO \cdot SiO_2$  and  $3CaO \cdot SiO_2$ , and the correct proportion of  $SiO_2$  plays an important role in improving cement strength.

Table 1 presents the test results of physical and mechanical properties, which meet the requirements of construction performance.

Table 1. Physical and mechanical properties of tested cement.

	Setting Time (min)		Compressive Strength (MPa)		Flexural Strength (MPa)		Specific Surface $A reg (m^2/kg)$	Water Content of Normal	
	Initial	Final	3 d	28 d	3 d	28 d	Alea (III /kg)	Consistency (76)	
Result	107	161	23.5	45.2	5.4	8.6	347	27.4	
Limit	$\geq 45$	$\leq 600$	≥22	$\geq$ 42.5	$\geq 4.0$	$\geq 6.5$	—	$\leq 30$	

Table 2 displays the chemical compositions of Portland Cement.

Chemical Composition	$SiO_2$	Al <sub>2</sub> O <sub>3</sub>	CaO	Fe <sub>2</sub> O <sub>3</sub>	MgO	SO <sub>3</sub>
Cement	22.4%	3.17%	5.2%	58.85%	2.53%	2.40%

 Table 2. Chemical compositions of cement.

The coarse sand produced in Xiamen was used as the fine aggregate. With a fineness modulus of 3.4, the coarse sand is in zone II. The water content is 3%. The apparent density is  $2590 \text{ kg/m}^3$ , and the mud content is 1.8%.

Crude FA comes from Tianjin. The specific surface area is  $252 \text{ m}^2/\text{kg}$ , and the fineness (0.044 mm square hole sieve residue) is 20.2%. The water demand ratio is 98%. Table 3 lists the main chemical composition of FA.

Table 3. Chemical composition of FA.

Chemical Composition	SiO <sub>2</sub>	Al <sub>2</sub> O <sub>3</sub>	CaO	Fe <sub>2</sub> O <sub>3</sub>	SO <sub>3</sub>	Cl-	Alkali Content
FA	48.73%	22.48%	3.87%	9.84%	0.93%	0.02%	2.11%

Clean drinking water or fresh water is used in the design of the concrete mix in this study. The water quality must be tested as the following requirements to ensure it is available for concrete preparation.

- (1) Sulfate content (measured by  $SO_4^{2-}$ ) should be less than 0.0027 mg/mm<sup>3</sup>;
- (2) Salt content should not exceed  $0.005 \text{ mg/mm}^3$ ;
- (3) PH should not be less than 4.6;
- (4) Do not contain oil, mud, and other harmful impurities.

# 2.2. FA Addition

The objective is to study the impact of FA content on the working performance of concrete, based on the same water–cement ratio, water–binder ratio, water consumption, the amount of cementing material, and the total amount of material used in specimens, according to the equal substitution method adopted in concrete mix design, the FA content was, respectively, compared with the total content of 0, 5%, 10%, 15%, 20%, 25%, 30%, 35%, 40%, 45%, and 50% in this test.

### 2.3. Testing Design

The slump and density of the specimen were measured before assembling. Then, a standard test mold, according to the Method of Test method of mortar strength (ISO method), was used to make concrete test specimens, and the mold was removed after 24 h. After the test pieces were made, they were placed in a standard curing box (relative humidity 98%, temperature 20 °C) for curing. After the standard curing for 3 days, 7 days, and 28 days, respectively, concrete test specimens with a size of 40 mm  $\times$  40 mm  $\times$  160 mm were applied to obtain the compressive strength and flexural strength. According to the Chinese Standard for test method of mechanical properties on ordinary concrete (GB/T 50081-2002), the concrete specimens were prepared and standard cured as shown in Figure 1. Table 4 lists the mix ratio design scheme of concrete specimens. Concrete was prepared by substituting cement schemes with different FA content according to the test schemes shown in Table 4. Three identical test specimens were poured in each group, and 11 control groups of concrete test specimens were tested after standard curing at 3, 7, and 28 days.



Figure 1. Concrete specimens in the preparation process: (a) test piece to be cured, (b) cured sample.

Table 4. Experimenta	l scheme of cement	replaced by FA.
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Serial Number	Water Cement Ratio	Water Binder Ratio	Water/g	Standard Sand/g	Material of Cementation/g	FA/%	Cement/%
B1	0.55	0.33	247.5	1350	450	0	100
B2	0.55	0.33	247.5	1350	450	5	95
B3	0.55	0.33	247.5	1350	450	10	90
B4	0.55	0.33	247.5	1350	450	15	85
B5	0.55	0.33	247.5	1350	450	20	80
B6	0.55	0.33	247.5	1350	450	25	75
B7	0.55	0.33	247.5	1350	450	30	70
B8	0.55	0.33	247.5	1350	450	35	65
B9	0.55	0.33	247.5	1350	450	40	60
B10	0.55	0.33	247.5	1350	450	45	55
B11	0.55	0.33	247.5	1350	450	50	50

# 2.4. Mechanical Property Evaluation Parameters

The mechanical behavior of concrete is obviously dependent on FA content, cement type, cement grade, aggregate type, concrete placement, age, the porosity of cement stone, and field conditions [38]. Experimental evaluation is an important tool to understand the changes in mechanical properties of concrete with material design. The laboratory tests of the same concrete mix design under different FA content were performed in this study. According to the measured data, the mechanical property evaluation parameters can be reasonably determined. Through the above comprehensive analysis, the flexural strength can be calculated as shown in Equation (1). The flexural strength of concrete test specimens is key evaluation index of concrete in mechanical properties.

$$f_f = \frac{FL}{bh^2} \cdot 1.5 \tag{1}$$

where  $f_f$  is the flexural strength of concrete cube specimen (MPa); F is the failure load under flexure (N); L is the distance between two fulcrums (mm); b is the section width of the specimen (mm); h is the section height of the specimen (mm).

In the flexural strength test, the specimen was installed according to Figure 2. The b and h of the sample are 40 mm, and the loading head is a rigid cylinder with a diameter of 25 mm and hinged support. The average of the three specimens in each group is taken as

the test result. After being removed from the curing place, the specimen should be tested in time and the surface of the specimen should be wiped clean. The application of loads should be uniform and continuous. The loading rate was 0.05–0.08 mm/s.



Figure 2. Test scheme of flexural strength.

After standard curing to the specified age, tested specimens were taken out for determination. The strength of the compression test is obtained by Equation (2).

$$f_{cc} = \frac{F}{A} \tag{2}$$

where:  $f_{cc}$  is the compressive strength (MPa); *F* is the failure load (N); *A* is the bearing area of the specimen (mm<sup>2</sup>).

The compressive strength of each test group was treated as required by the Chinese standard for the evaluation of concrete compressive strength (GB/T 50107-2010). After removal from the curing site, the specimen shall be tested in time, and the surface of the specimen and the upper and lower bearing plates shall be wiped clean. In the test process, the load should be continuous and uniform, and the loading rate was 0.5–0.8 MPa/s. When the loading value was recorded after the failure, the testing data was obtained from three specimens.

The X-ray diffraction (XRD) test was measured by a SHIMADZU (Kyoto, Japan) X-ray diffractometer, as shown in Figure 3. Mainly for the test of concrete ground into powder, the test range is  $-3-150^{\circ}$ , the full spectrum of  $<\pm0.02^{\circ}$  deviation, and the concrete can withstand up to 120 kg. The scanning speed of the equipment is  $0.01\sim120^{\circ}$ /min. In this test, the scanning speed of  $80^{\circ}$ /min can be used to determine the phase composition of permeable concrete samples.

Scanning electron microscopy (SEM) was used in this study. The scanning electron microscope was produced by SHIMADZU, and the instrument model was ZEISS Merlin Compact (Jena, Germany). The reaction products of FA, mineral powder, and silica fume at different ages in pervious concrete were tested from a microscopic point of view. The microscopic mechanism of the influence of admixture on the performance of pervious concrete was analyzed. The magnification of the SEM image was 10,000 times, and the scale was 10  $\mu$ m.



Figure 3. FRINGE CLASS diffraction instrument.

# 3. Results and Discussions

3.1. Influence of FA Content on Mechanical Properties of Concrete

After the standard curing for 3, 7, and 28 days, the concrete specimens were tested for flexural strength and compressive strength based on different FA content (0–50%). The results are shown in Figure 4. In addition, the standard error lines were added in Figure 4, to describe the differences in the results of the three parallel tests.



Figure 4. Effect curve of FA content on mechanical properties of concrete: (a) flexural strength; (b) compressive strength.

Results show that under the condition of keeping the concrete mix unchanged, and the standard curing for 3 days flexural strength of concrete slowly decreased with the increase of FA content. In particular, the flexural strength of the curve decreases rapidly after the inflection point of 20% content. When the FA content is 20%, the flexural strength is 3.09 MPa. When the FA content is 50%, the flexural strength is 1.76 MPa, which is also the minimum flexural strength of concrete after 3 days of standard curing. The flexural strength of concrete after 7 days of standard curing increases slowly with the increase

of the FA content and then decreases rapidly. When the FA content is 20%, the flexural strength is 4.68 MPa, which is also the maximum flexural strength of concrete after 7 days of standard curing. As can be seen from Figure 4b, after the incorporation of FA, the variation law of concrete's compressive strength is consistent with that of its SF on the whole. Basically, it showed a trend of a slow increase at first and then a gradual decrease. When the FA content is 20%, compressive strength at 3 days of standard curing age is 11.48 MPa, at 7 days of standard curing age is 19.46 Mpa, and at 28 days of standard curing age is 27.81 MPa. When the FA content is 50%, compressive strength at 3 days of standard curing age is 8.31 Mpa, and compressive strength at 28 days of standard curing age is 13.87 MPa.

Compared with the concrete specimens without FA, the flexural strength of concrete after 3 days of standard curing and the compressive strength of concrete after FA incorporation show little change. Compared with the untreated concrete, after 28 days of standard curing, the flexural strength and the compressive strength of concrete with 20% FA increased by 0.82 MPa and 4.32 MPa, respectively. With the increase of the standard curing age, the volcanic ash effect of FA is further released, which can not only keep the flexural strength of concrete but also improve the overall mechanical properties of concrete due to the active characteristics of FA. Therefore, from the perspective of industrial solid waste utilization and reducing carbon emissions in cement production, the experimental results show that the optimal content of FA is 20%.

FA as an admixture of concrete has been extensively studied, and most of the studies are consistent with the law of change in the compressive and flexural strength of concrete after the addition of FA. As the age increases, it basically shows a trend of fast growth at the beginning and slow growth at the end. At the same time, the experimental results show that the relative percentage values of the compressive strength of cement concrete, Portland concrete, and high-performance concrete with FA content of 15% and 20% are significantly larger than those of the other mixtures. The optimal FA content in this study is 20%, which is in line with most experimental results on the mechanical properties of concrete materials with FA content [39,40].

# 3.2. Phase Analysis of FA after Incorporation

After the standard curing for 3 days and 7 days, the concrete XRD test was conducted based on the FA content of 0% and 20%, respectively, to observe their micromorphology and qualitatively study their hydration products. Then the macroscopic difference is explained from the microscopic mechanism, and the impact of FA on the road performance of concrete is further explored. The XRD test was used to analyze and determine the content of amorphous calcium silicate hydrate (C-S-H) gel, and the test results are shown in Figure 5.

XRD is mainly used to analyze the crystal changes in the slurry before and after the hydration reaction of pervious concrete, so as to qualitatively analyze the hydration reaction effect of admixture added to pervious concrete. Figure 5 shows the XRD pattern of concrete after 3 days of the standard curing. It can be seen from Figure 5a that the main phases of concrete without FA are SiO<sub>2</sub>, CaCO<sub>3</sub>, Ca(OH)<sub>2</sub>, and Ca<sub>2</sub>SiO<sub>4</sub>, whereas the main phases of concrete mixed with 20% FA are SiO<sub>2</sub>, CaCO<sub>3</sub>, Ca(OH)<sub>2</sub>, and C-S-H, which can be seen from Figure 6b. The formation of C-S-H gel indicates that the incorporation of FA promotes the hydration of cement clinker in concrete. With the increase of C-S-H gel content, the porosity of the permeable concrete decreases, and the reaction speed in the system is improved. The content of Ca(OH)<sub>2</sub> and SiO<sub>2</sub> in the system was gradually reduced. The results also present the correspondence in the XRD spectrum phase peak.



**Figure 5.** XRD patterns of the hydration products of concrete after 3 days of the standard curing: (a) concrete without FA; (b) concrete mixed with 20% FA.



**Figure 6.** XRD patterns of the hydration products of concrete after 7 days of the standard curing: (a) concrete without FA; (b) concrete mixed with 20% FA.

Figure 6 shows the XRD pattern of concrete after 7 days of the standard curing, from which it can be seen that the main phases of concrete without FA are SiO<sub>2</sub>, CaCO<sub>3</sub>, Ca(OH)<sub>2</sub>, and C-S-H. The main phases of concrete mixed with 20% FA are SiO<sub>2</sub>, CaCO<sub>3</sub>, Ca(OH)<sub>2</sub>, C-S-H, and columnar ettringite (AFt). Compared with the XRD pattern of FA content in 3 days of curing standard, after 7 days of curing standard, the FA added in concrete can replace cement significantly, and exerts an active pozzolanic effect. AFt was further formed by a secondary reaction of calcium hydroxide due to the active pozzolanic effect.

# 3.3. Microstructure Analysis of FA after Incorporation

The hydration of Portland cement produces many chemical compounds, including the C-S-H, the calcium aluminate hydrate gel (C-A-H), the lamellar calcium hydroxide (CH) crystals, the Aft, and the irregular petal-shaped calcium sulfide aluminate hydrate (AFm) [41]. Figure 7 shows the SEM images of the standard curing for 3 days and 7 days of concrete without FA.



Figure 7. SEM images of concrete without FA after the standard curing for (a) 3 days and (b) 7 days.

The early hydration rate of pure cement concrete specimens is faster. In Figure 7a, there are a large number of hexagonal plate calcium hydroxide crystals, large cracks can be seen in the structure of the specimen, and the structure is loose. In Figure 7b, hydration has occurred in most of the composite Portland cement clinker minerals in the structure at the standard curing for 7 days, forming a large number of calcium hydroxide crystals, which is significantly more than at the standard curing for 3 days, and the internal structure of the concrete is denser.

Figure 8 shows the SEM images of concrete at the standard curing for 3 days and 7 days when 20% FA is added. A large number of fibrous, network, sheet, and flocculent C-S-H gels appeared in the specimen structure, and a large number of rod-like ettringite was generated in Figure 8a. At this time, the calcium hydroxide was not obvious, and most of them were interwoven C-S-H gel and AFt. In Figure 8b, the active substance in the FA is rehydrated with calcium hydroxide, and the interface between cement colloid and FA tends to be dense. The FA in the concrete structure presents a state of approximately spherical particles, and the pores of the structure are accompanied by FA particles without hydration reaction (active reactants appear on the surface) and cube crystals. There are more rod-like ettringite in the interior. With the increase in curing time, the hydration reaction of concrete structure specimens is continuously strengthened, and the activity of FA is gradually stimulated. In Figure 8, it can be clearly seen that the specimens of concrete structures at the standard curing for 7 days contain a large number of needle-rod substances, which are denser than those at the standard curing for 3 days.



**Figure 8.** SEM images of FA mixed with 20% concrete after the standard curing for (**a**) 3 days and (**b**) 7 days.

In conclusion, with the increase of FA content, the volcanic ash effect is continuously intensified, spherical particles of concrete microstructure surround a large number of hydration products, and the specimen structure becomes loose. However, with the extension of the standard curing age, the types of hydration products increase, and there are unhydrated FA particles, a large number of needle-like ettringite, and a small amount of calcium hydroxide.

From the analysis of the microstructure test results, it can be seen that the internal structure density of the standard curing 7 day concrete in this study is better than that of ordinary concrete of the same age after adding 20% FA. With most FA as the concrete admixture of the micro test study, it is concluded that the holes and cracks in the internal structure of concrete are effectively filled, forming a density skeleton system, its standard curing of 7 and 28 days concrete structure is consistently denser.

In order to reduce the footprint of cement production, the cement was partially replaced by FA. Calculations based on carbon emissions in the carbon footprint suggest that the higher the FA content, the higher the low-carbon response of the concrete. Further research and optimization of FA characteristics ensure that the mechanical properties of the cement mix will correspondingly further reduce the carbon footprint.

# 4. Conclusions

This study aims to improve the safety performance of a green low-carbon concrete by FA content based on mechanical property tests and microscopic results of FA content. The main findings were listed as follows.

- The optimal FA content in green low-carbon concrete is 20%. After 28 days of standard curing, the flexural strength and compressive strength of the concrete with 20% FA increased by 0.82 MPa and 4.32 MPa, respectively;
- (2) XRD analysis shows that the formation time of C-S-H and AFt phase in FA-doped concrete is earlier. In addition, the incorporation of FA promotes hydration reactions that rehydrate Ca(OH)<sub>2</sub> in the system;
- (3) SEM analysis revealed that the microstructure of the concrete mixed with 20% FA is mainly composed of fibrous C-S-H gels and rod-like ettringite, and the cement colloids and FA between the interfaces tend to be dense, ensuring the safety properties of the concrete;
- (4) This study only provides a qualitative description of the carbon footprint, and computational models should be used to quantify carbon reduction capabilities in the future.

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Article



# Discussing the Negative Pressure Distribution Mode in Vacuum-Preloaded Soft Foundation Drainage Structures: A Numerical Study

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**Abstract:** The aim of this paper is to clarify the negative pressure distribution in drainage structures of soft foundations reinforced by vacuum preloading. The focus of this study was an actual engineering project, the Beijing–Shanghai high-speed railway; four different soil consolidation models were established using FLAC<sup>3D</sup> to consider various loading conditions. The consolidation process of the soft foundation was calculated and analyzed in detail. The results show that (1) the settlement developed rapidly within the first 30 days, slowed during the period between 20 and 30 days, and finally stabilized. (2) The settlement curves obtained from the four different models were highly consistent with the site monitoring curve for the first 5 days, after which point significant differences appeared. (3) During the first 20 days, the pore water pressure decreased noticeably within the depth range of 0–18 m. Between days 20 and 30, the rate of pore water pressure decrease slowed down, and after the 30th day, the pore water pressure remained constant at all depths. (4) Vacuum preloading affected the soil to a depth of approximately 16 m. A concave or linear distribution of negative pressure in the drainage structure was found to be a reasonable assumption, providing a reference for the numerical analysis of vacuum preloading.

**Keywords:** negative pressure distribution; settlement; pore water pressure; numerical simulation; vacuum preloading

# 1. Introduction

Thick, soft soil layers are widely distributed in coastal areas of China. These soil layers are characterized by a high void ratio, high water content, low permeability coefficient, and low strength. To build structures on such soft soil, it is necessary to reinforce the foundation.

The vacuum preloading method is a mature and low-cost technique used to strengthen soft foundations in the field of drain consolidation. This method was first proposed by W. Kjellman in 1952 [1], and since then, civil engineering scholars at home and abroad have conducted practical applications, tests, and theoretical research on this method. In terms of theoretical analysis, various researchers, such as Barron [2], Horne [3], Hansbo [4], Yoshikuni and Nakanodo [5], Onoue [6], Dong [7], Lin et al. [8], Liu et al. [9], etc., have developed sand drain consolidation theory with reference to the consolidation calculation method of surcharge preloading, changing the load boundary conditions to derive accurate analytical solutions of consolidation suitable for vacuum preloading. However, these methods are not convenient for practical application and promotion due to their simplification of assumptions, obscure and complex derivation processes, large numbers of parameters, and extensive requirements. In terms of numerical calculations, many researchers, such as Cheung et al. [10], Hird et al. [11], Indraratna and Redana [12], Zeng et al. [13], Chai et al. [14],

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**Copyright:** © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). Sha et al. [15], Bergado et al. [16], Nguyen et al. [17], and Wang et al. [18], have conducted extensive research, including two-dimensional simulation, three-dimensional simulation, and sand drain simplification, considering smearing and other factors. However, few studies have been conducted on the negative pressure distribution mode of the vertical drain body under vacuum preloading. The plane strain model is usually used to represent the actual three-dimensional situation in the concrete implementation process. Although many engineering examples have been used to obtain relatively ideal results, the seepage and mechanical effects of soft foundations under vacuum preloading are three-dimensional, so a three-dimensional model should be applied in research. In the process of theoretical exploration and practical application, the mechanical and fluid disturbances of soft foundations strengthened by vacuum preloading are significant. Therefore, it is essential to analyze the settlement and pore pressure of soft foundations under this construction method using the fluid–solid coupling method, as suggested by Zhao et al. [19] and Liu et al. [20].

FLAC3D finite-difference method software based on the LaGrangian continuum method is a suitable option for conducting such analysis. This software has a strong analytical ability, making it suitable for complex engineering problems involving the mechanical seepage coupling of geotechnical materials. Compared to other finite element software, FLAC3D has the following advantages. (1) FLAC3D adopts the "mixed discrete method", which is more accurate and reasonable than the "discrete integration method" commonly used in the finite element method. (2) There are no numerical barriers to simulating physically unstable processes with FLAC3D. (3) FLAC3D uses an explicit difference method to solve differential equations. It can conveniently calculate stress increments and unbalanced forces and track the evolution process of the system. (4) FLAC3D can simulate a large number of units with less memory, making it particularly suitable for operation on microcomputers.

In the present study, fluid–solid coupling analysis of soft soil under the combined action of vacuum and surcharge was simulated Using FLAC3D.

We utilized the FLAC3D finite-difference method software to model and calculate the soil consolidation process under vacuum preloading for specific projects while varying the negative pressure distributions of the drainage body and keeping other conditions constant. The calculated results were compared with measured values to assess the impact of different negative pressure distributions on soil consolidation. This study is significant, given its aim of improving the accuracy of soft foundation settlement and pore pressure calculation.

# 2. Engineering Background

The soft foundation reinforcement test section for the Beijing–Shanghai high-speed railway was located in Kunshan, China. Specifically, the section from k0 + 276.51 to k0 + 515 was strengthened using the vacuum preloading + plastic drain board drainage consolidation method, with a reinforcement depth of 14.5~18.5 m. The plastic drain boards were arranged in a quincunx shape with a spacing of 1.2 m, and a 0.8 m thick sand cushion layer with a geogrid was placed on top of the plastic drain board. The vacuum pressure under the membrane was maintained at a minimum of 80 kPa. The consolidated foundation soil layer primarily consisted of muddy silty clay with high compressibility and low strength. Figure 1 displays the calculation section.

The settlement of the foundation surface was measured using settlement plates and an N4 leveling instrument. Specifically, one settlement plate was buried at the midline of the road bed, with another at the midline of the left lane and a third at the shoulder of the right lane. The layered settlement of the foundation was tested using settlement tubes, magnetic rings, and an R40 settlement monitoring instrument. The settlement tube was buried near the centerline of the right lane close to the centerline of the road bed. The pore water pressure was measured using MSY pore water pressure gauges and a frequency instrument. Ten water pressure gauges were buried at intervals of 2 m, beginning 2 m below the surface near the center of the section. These test components are shown in Figure 2. Vacuum

preloading lasted for 56 days, from 26 April to 20 June, after which time the embankment was formally filled.



Figure 1. Soil layer distribution of the calculation section.



Figure 2. The layout plan of the test components.

### 3. Numerical Analysis Calculation Mode

FLAC (Fast Lagrangian Analysis of Continua) software, which uses the LaGrangian continuum method, was utilized for finite-difference numerical calculations. Initially, FLAC was developed for geotechnical and mining engineering applications. The strong analytical capabilities of the FLAC software for complex engineering problems make it adaptable to civil engineering, transportation, water conservancy, and other fields. FLAC<sup>3D</sup> can be used to simulate the consolidation process of geotechnical materials, making it suitable for the study of the consolidation behavior of soil under vacuum preloading.

# 3.1. Constitutive Model and Seepage Model

Among numerous constitutive models of rock and soil, the Mohr Coulomb plastic constitutive model is the most universal. The Mohr Coulomb plastic constitutive model is suitable for materials that yield under shear stress, such as loose or cemented granular soil [21–25]. Geotechnical engineering problems often involve the action of pore water pressure, such as groundwater in the foundation, the seepage of earth dams, and the dewatering of foundation pits. When analyzing problems involving pore water pressure, FLAC<sup>3D</sup> has two calculation modes that can be applied depending on whether fluid calculation is set up, namely, the seepage mode and non-seepage mode. Therefore, the use of the Mohr Coulomb plastic constitutive model to simulate the stress–strain relationship of soil and the anisotropic seepage mode to simulate the anisotropic seepage characteristics of soil has practical significance. The calculation parameters are presented in Tables 1 and 2.

Series	Clay	Smear Layer of Clay	Muddy Silty Clay	Smear Layer of Muddy Silty Clay	Silty Clay	Sand Drain
Compressive modulus, $E_s/MPa$	4.61	4.61	4.35	4.35	8.77	11.66
Poisson's ratio	0.47	0.47	0.55	0.55	0.49	0.3
Cohesion, c/kPa	14	14	3.7	3.7	4	0
Internal friction angle, $\varphi/^{\circ}$	15.5	15.5	18.9	18.9	26.7	36
Bulk density, $\gamma/kN \cdot m^{-3}$	19.2	19.2	17.8	17.8	18.8	19
Water content, $\omega/\%$	31.9	31.9	44.4	44.4	35	/

Table 1. Calculation parameters of the constitutive model.

Table 2. Calculation parameters of the seepage model.

Series	Clay	Smear Layer of Clay	Muddy Silty Clay	Smear Layer of Muddy Silty Clay	Silty Clay	Sand Drain
Horizontal permeability coefficient, k <sub>h100-200</sub> /cm/s	$0.40  imes 10^{-7}$	$0.35  imes 10^{-7}$	$1.44  imes 10^{-7}$	$1.30  imes 10^{-7}$	$0.41  imes 10^{-7}$	$3  imes 10^{-2}$
Vertical permeability coefficient, k <sub>v100-200</sub> /cm/s	$0.52  imes 10^{-7}$	$0.53  imes 10^{-7}$	$0.68  imes 10^{-7}$	$0.69  imes 10^{-7}$	$0.57  imes 10^{-7}$	$3 \times 10^{-2}$

Density of water: 1000 kg/m<sup>3</sup>; Biot modulus:  $4 \times 10^9$  Pa.

### 3.2. Gridding

Based on the soil layer distribution map of the calculation section, a single sand drain consolidation model grid was established. To convert the plastic drain board into a sand drain with a radius of 0.05 m, the formula  $r_w = \alpha(a + b)/4$  (where *a* is the width of the drain board, *b* is the thickness of the drain board, and  $\alpha$  is the conversion factor) was used. The smear layer radius was taken as 3 times 0.15 m, and the affected area radius was taken as 7 times 0.35 m. The thickness of the clay layer is 1 m. The thickness of the muddy silty clay layer is 17 m. The bottom of the sand drain is 18 m. The thickness of the silty clay layer is 5 m.

This paper defines each soil layer as a group, the sand drain as a group, and the smear layer near the sand drain in different soil layers as a group. A total of six groups are defined: clay, muddy silty clay, silty clay, smear layer of clay, smear layer of muddy silty clay, and sand drain.

As the single sand drain foundation was axisymmetric, only one-quarter was taken for calculation. A cylindrical peripheral gradient radial grid was applied in the clay layer and muddy silty clay layer. A cylindrical peripheral gradient radial grid, cylindrical shell grid, and cylindrical grid were applied in the silty clay layer. A cylindrical grid was applied in the sand drain. A cylindrical shell grid was applied in the smear layers. The calculation model was 1.4 m wide and 23 m deep, divided into 2576 units and 3346 nodes, as depicted in Figure 3.



Figure 3. Computational model.

### 3.3. Boundary and Initial Conditions

The model had a free boundary on the top surface and a fixed boundary on the bottom surface, with no displacement in any direction. The four sides of the model had no horizontal displacement but allowed for vertical displacement due to the constraints of the surrounding soil. All sides of the hexahedron model were considered permeable boundaries.

The groundwater level was assumed to be flush with the ground, and the static pore water pressure at the ground node was set to 0, which increased linearly along the depth with a gradient of 10 kPa. The initial stress state was set as the gravity field. The density of each group was assigned, and the gravity acceleration was set to calculate the initial stress distribution for each group. After the calculation reached equilibrium, the deformation and the rate of the entire model node were assigned a value of 0.

A coordinate system was established for pore water pressure and sand drain height, with the center of the sand drain bottom as the origin, as shown in Figure 4.

In the fluid–solid coupling numerical analysis, the pore water pressure at the top node of the sand drain was assumed to be -80 kPa, as the vacuum degree under the membrane in the field exceeded 80 kPa within 8 h. The influence range of vacuum action was set at the bottom of the sand drain, where there was hydrostatic pressure but no negative excess pore pressure caused by vacuum, i.e., 0 kPa. Therefore, four models of pore water pressure distribution were assumed along the axial direction of the sand drain, as shown in Figure 3:

- (1) "Concave" parabolic distribution: According to the standard parabolic equation  $(x^2 = -2py(p > 0))$  and coordinate points (18, -80), p = 2.025, so  $y = -x^2/4.05$ . Because the distribution was concave relative to the vertical axis of the sand well, it is referred to as a "concave" parabola.
- (2) "Convex" parabolic distribution:  $y = (x 18)^2/4.05 80$  was calculated according to the translation transformation of the parabolic equation obtained in (1). Because the distribution was convex relative to the vertical axis of the sand drain, it is referred to as a "convex" parabola.
- (3) Linear distribution: The linear equation across the origin was y = -40x/9.
- (4) Uniform distribution: The equation was y = -80.



Figure 4. Distribution pattern of pore water pressure along the sand well.

The subcycle command flow was compiled to realize the application of a vacuum load under the above four working conditions. The unbalanced force ratio was set to  $10^{-4}$ . The master–slave program method was adopted to solve the problem. The number of mechanical substeps was subordinate to the number of seepage substeps, and the seepage time was set as  $4.8384 \times 10^6$  s.

# 4. Analysis of Calculation Results

## 4.1. Settlement Analysis

Figures 5–8 display the settlement–time calculation curves for the four negative pore water pressure distribution modes along the sand drain, namely, the "concave" parabola, "convex" parabola, linear distribution, and uniform distribution. The legend represents the depth from the surface. The results demonstrate that the settlement of the soft foundation increased rapidly during the first 30 days and then gradually slowed down, finally reaching a stable state. The surface soil was subject to the most settlements, which decreased with increasing depth. Settlement changes were faster and more significant closer to the surface and slower and less noticeable further away from the surface. On the 56th day, the surface settlement reached 82.40 cm under the "concave" parabolic distribution of pore water pressure, 81.69 cm under the linear distribution of pore water pressure, and 109.33 cm under the uniform distribution of pore water pressure. The settlement–time curve at a depth of 22 m was almost horizontal. On the 56th day, the settlement deformation at a depth of 22 m reached 2.74 cm, 2.83 cm, 2.75 cm, and 3.27 cm for each of the four conditions, respectively, indicating that the vacuum effect was minimal at a depth of 22 m.

After vacuuming, within 8 h, the vacuum under the membrane reached over 80 kPa. Negative pore water pressure was transmitted vertically from the sand cushion layer under the membrane to the sand drains, causing a change in pore pressure in the sand drains. Then, the negative pore pressure in the sand drains was transmitted to the surrounding soil. Finally, the soil underwent consolidation under the negative pore pressure. The vertical distribution pattern of the pore pressure in the sand drains determined the horizontal transmission strength of the pore pressure in the surrounding soil. From the assumptions of the four types of sand drain pore pressure distribution modes, it could be known that under the "concave" parabolic distribution mode, the average pore pressure was the smallest, while under the uniformly distributed model, the average pore pressure was the largest. So, it could be inferred that the consolidation settlement of soil was in descending order:



uniform distribution mode, "convex" parabolic distribution mode, linear distribution mode, and "concave" parabolic distribution mode.

Figure 5. Settlement-time curve under "concave" parabolic distribution.



Figure 6. Settlement-time curve under "convex" parabolic distribution.



Figure 7. Settlement-time curve under linear distribution.



Figure 8. Settlement-time curve under uniform distribution.

Figures 9 and 10 depict the settlement-time calculation curves and measured value curves at depths of 0 m and 4 m under the four different pore water pressure distribution modes. The qualitative development trend of the four calculation curves was consistent with the measured values. During the first 5 days, the four calculated curves were highly consistent with the curves of the measured values. However, a large gap between the four calculated curves and the measured values was observed between days 5 and 30. The maximum difference between the calculated settlement value and the measured settlement value under the concave parabolic and linear distributions occurred around the 10th day, reaching 8.95 cm. The maximum difference between the calculated settlement value and the measured settlement value under the "convex" parabolic distribution occurred around the 30th day, reaching 12.53 cm. The maximum difference between the calculated settlement value and the measured settlement value under uniform distribution also occurred around the 30th day, reaching 24.87 cm. After 30 days, the calculated settlement curve and the measured settlement curve under the "concave" parabolic and linear distributions had a high degree of coincidence, with differences of 0.724-2.4 cm and 0.01-1.65 cm, respectively. However, the difference between the calculated settlement value and the measured settlement value under the "convex" parabolic and uniform distributions was consistent with the difference around the 30th day.



Figure 9. Settlement-time curve of four distributions at a 0 m depth.



Figure 10. Settlement-time curve under four distributions, measured at a 4 m depth.

Many simplifications and assumptions were applied in the calculation model, such as assuming that the three soil layers were horizontal and homogeneous with the sand drain and smear layer and that the soil parameters remained constant. However, in reality, the soil layer was not horizontal or homogeneous due to its complex geological origin, and the soil parameters changed gradually during stress deformation, which resulted in the calculated curve being smooth, whereas the measured curve was more variable. During the first 5 days, the vacuum effect had little impact on the soil mass, and the settlement at each depth was minimal, resulting in highly consistent values between the four calculated curves and the curve of measured values. Between days 5 and 30, the vacuum negative pore water pressure was gradually transferred from the sand drain to a wider range of soil layers, resulting in rapid settlement of the soil mass at each depth. However, due to the complex structure of the soil mass and the anisotropy of negative pore water pressure transmission, the distribution of pore water pressure at each point in the soil mass was extremely unbalanced, resulting in a large deviation between the calculated value curve and the measured value curve. After 30 days, the calculated settlement values under the "concave" parabola and linear distributions gradually became consistent with the measured settlement values, whereas the difference between the calculated and measured settlement values under the "convex" parabola and uniform distributions remained at the same level as between days 5 and 30. After 30 days, the unbalanced pore water pressure in the soil gradually reached equilibrium and stabilized at a constant value. The pore water pressure at the same depth within the influence range of vacuum action was basically the same, indicating that the isotropic pressure values at each point at the same depth were consistent. The pore water pressure at different depths tended to have different constant values, and the isotropic pressure values at various points at different depths also differed.

From the settlement calculation curve, using the two setting modes: "concave" parabolic and linear pore water pressure modes, the calculation results were significantly better than those yielded using "convex" parabolic and uniform distribution modes. The linear setting mode was slightly better than the "concave" parabolic setting mode.

In the numerical calculation of the vacuum preloading reinforcement of soft foundation, the pore pressure in the sand cushion and sand drains under the membrane can rapidly decrease to a constant value in a short period of time, so the sand cushion and sand drains can be regarded as negative pressure boundaries. We can assign and adjust the node pore pressure of the sand cushion and sand drain area to achieve the loading effect of vacuum load. Based on the calculation results of the four negative pressure distribution modes of sand drains in the article, the calculation results using smaller pore pressure distribution modes (linear distribution mode and "concave" parabolic distribution mode) are in line with the actual situation on site. Since the consolidation settlement curve in the linear mode is very close to the measured curve (especially the final consolidation settlement), we selected the surface settlement time curve in this mode for asymptotic fitting and obtained the calculation formula and coefficients, as shown in Figure 11.



Figure 11. Asymptote fitting curve of calculated values.

### 4.2. Pore Water Pressure Analysis

Figures 12 and 13 show the change curve of pore water pressure at each depth of the soil mass over time under the concave parabola and convex parabola distribution modes.

During the calculation, we assumed that the initial value of pore water pressure at each point in the soil was hydrostatic pressure, i.e., a positive value, as the groundwater level was flush with the top surface of the model. After applying negative pore water pressure due to vacuum preloading to the top surface of the model and sand drains, the pore water pressure at each point in the soil decreased to varying degrees. Between 0 and 20 days, the pore water pressure decreased most obviously within a depth of 18 m. Between 20 and 30 days, the rate of pore water pressure decrease was significantly reduced and gradually became stable. After 30 days, the pore water pressure at each depth was basically unchanged and maintained at a constant value.



Figure 12. Pore water pressure-time curve under a "concave" parabolic distribution.



Figure 13. Pore water pressure-time curve under a "convex" parabolic distribution.

The pore water pressure at a depth of 2 m under the concave parabolic distribution was -69.17 kPa, that under the convex parabolic distribution was -79.59 kPa, that under the uniform distribution was -80.28 kPa, and that under the linear distribution was -72.20 kPa. The pore water pressure at a 16 m depth under the concave parabolic distribution was 1.79 kPa, and that under the linear distribution was 5.84 kPa. The pore water pressure at an 18 m depth under the convex parabolic distribution was 10.52 kPa, and that under the uniform distribution was -5.38 kPa, indicating that the vacuum preloading influence depth was approximately 16 m under the "concave" parabola and linear distributions and approximately 18 m under the "convex" parabola and uniform distributions. Combining the comparison and analysis results between the settlement calculation and the measured values proved that the influence depth of vacuum preloading was approximately 16 m.

Vacuum preloading causes a decrease in pore pressure in the soil. The greater the absolute value of negative pore pressure is, the better the consolidation effect of the soil is. However, the impact range of vacuum preloading on soil is limited. The maximum negative pore pressure is one atmospheric pressure that is impossible to achieve. The distribution pattern of pore pressure in sand drains for numerical calculation should be consistent with the actual situation. From the above settlement analysis, it can be seen that the linear distribution mode and the "concave" parabolic distribution mode are more in line with the actual situation. Due to the different mean values of the four sand drain pore pressure distribution modes, we can also infer that the decreasing values of pore pressure in soil are in descending order: uniform distribution mode, "convex" parabolic distribution mode.

Figure 14 shows the pore water pressure–time change curve in soil under the four distribution modes at a 2 m depth.

Figures 15 and 16 show the pore water pressure–time curves of the four models and measured values at 4 m and 6 m depths.

The measured pore water pressure curve had a large dispersion, which may have been caused by various factors, such as equipment error, construction activity, and human errors during monitoring. However, this curve can qualitatively explain some of the phenomena. The pore water pressure–time curve obtained by the logarithmic fitting of the measured values was found to be closest to the calculated value of the linear distribution model.



Figure 14. Pore water pressure-time curve under four distribution modes at a 2 m depth.



**Figure 15.** Pore water pressure–time curves of the four different distribution models and the measured results at a 4 m depth.



**Figure 16.** Pore water pressure–time curves of four distribution models and measured values at a 6 m depth.

# 5. Conclusions

The Beijing–Shanghai high-speed railway test section project used a fluid–solid coupling calculation model in FLAC<sup>3D</sup> software to establish four modes of negative pore water pressure distribution along the sand drain: concave parabola, convex parabola, linear, and uniform distribution. The soil consolidation process was simulated and calculated, and the results were compared with the measured values of the project. The following conclusions were drawn.

The settlement of the soft foundation developed rapidly in the first 30 days, slowed down after 30 days, and eventually tended to stabilize. The settlement was most significant near the surface and gradually decreased with depth. The settlement–time curve at a depth of 22 m was nearly horizontal, indicating a weak vacuum effect at that depth.

Within the first 5 days of vacuum preloading, the settlement calculation curves for all four distribution modes were highly consistent with the measured settlement curves. Between days 5 and 30, there was a significant gap between the calculated and measured values. After 30 days, the settlement curves for the concave parabolic and linear distribution modes coincided closely with the measured settlement curves, with differences ranging from 0.724 to 2.4 cm and from 0.01 to 1.65 cm, respectively. However, the differences between the calculated and measured settlement values for the convex parabolic and uniform distribution modes were consistent with the differences observed around day 30.

The calculation results for the concave parabolic and linear pore water pressure modes were better than those for the convex parabolic and uniform distribution modes. The linear setting mode was slightly better than the concave parabolic setting mode.

During the first 20 days, the pore water pressure dropped most significantly within the depth range of 0–18 m. Between days 20 and 30, the rate of the pore water pressure decrease was significantly reduced and eventually became stable. After 30 days, the pore water pressure at each depth was essentially constant.

The influence depth of vacuum preloading for the concave parabolic and linear distribution modes was approximately 16 m, whereas the influence depth for the convex parabolic and uniform distribution modes was approximately 18 m. A comparison of the calculated settlement and the measured settlement showed that the influence depth of vacuum preloading was approximately 16 m.

This article did not consider the impact of group sand drains. Therefore, we will consider this impact in future research.

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Article



# Shaking Table Testing and Numerical Study on Aseismic Measures of Twin-Tube Tunnel Crossing Fault Zone with Extra-Large Section

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Abstract: As transportation networks continue to expand into mountainous regions with high seismic activity, ensuring the seismic safety of tunnels crossing active faults has become increasingly crucial. This study aimed to enhance our understanding of the impact of fault zones on the seismic behavior of tunnels and to provide optimized seismic design recommendations through a comprehensive experimental and numerical investigation. The focus of this research is the Xiangyangshan Highway Tunnel in China, which intersects a significant longitudinal fault. Large-scale shake table tests were performed on 1:100 scale physical models of the tunnel to analyze the seismic responses under various ground motion excitations. Detailed three-dimensional finite difference models were developed in FLAC3D and calibrated based on the shake table results. The tests indicated that strains, earth pressures, and accelerations experience localized amplification within 10-20 m of the fault interface compared to undisturbed ground sections. Common seismic mitigation measures, such as rock grouting, seismic joints, and shock absorption layers, were observed to effectively reduce the amplified seismic demands. Grouting, in particular, led to an average reduction of up to 56.3% in circumferential strain and 38.5% in earth pressure. It was concluded that 6 m thick grouted zones and 20 cm thick rubber interlayers between tunnel lining shells provide optimal structural reinforcement against the effects of fault zones. This study provides valuable insights for improving the seismic resilience of underground transportation corridors in seismically active regions.

Keywords: extra-large section tunnel; shaking table test; surrounding rock grouting; shock absorption layer; seismic joint; fault

# 1. Introduction

With rapid urbanization and economic development, the construction of transportation infrastructure has significantly accelerated throughout China in recent decades. The expansion of highways, high-speed railways, and underground metro networks has increasingly focused on effectively traversing complex terrain, particularly in mountainous regions [1–3]. Consequently, tunnels have become crucial for facilitating continuous travel through areas with challenging geological conditions. However, tunnels that cross active faults or are situated in high seismic zones are especially susceptible to earthquake damage, which can jeopardize structural integrity and public safety [4]. As a result, the optimized seismic design of tunnels is of utmost importance from both engineering and societal standpoints.

Numerous seismic zones with frequent seismic activity are located in Southwest and Northwest China. The construction of large-section tunnels in areas affected by active faults and high-intensity seismic zones presents an unavoidable challenge. In accordance with

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**Copyright:** © 2024 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). the Specification for Seismic Design of Highway Tunnels (JTG 2232-2019) [5], the Standard for Seismic Design of Underground Structures (GB/T 51336-2018) [6], the Code for Seismic Design of Railway Engineering (GB 50111-2006) [7], and other standards, measures such as surrounding rock reinforcement, seismic joints, lining reinforcement, and extension of open spaces can be implemented for tunnel linings in high-intensity areas. While engineers and scholars have studied and compiled some effective vibration control measures for these tunnels with complex adverse site conditions, further research is still needed to investigate the vibration control mechanisms and key parameters of these measures [1].

In high-intensity seismic areas, shallow tunnel structures are more susceptible to severe deformation or even damage. Moreover, in mountainous regions, the complex geological conditions exacerbate the degree of structural damage [8]. Currently, scholars have developed mature theories on earthquake damage types, dynamic response characteristics, and laws governing ordinary mountain tunnels [5,6]. Previous studies have also demonstrated that shallow tunnels located within or near fault zones experience more severe deformations and damages compared to those in homogeneous ground. However, there is relatively limited research on the seismic dynamic response laws of shallow buried sections of extra-large highway tunnels.

The common anti-vibration measures outlined in the aforementioned Chinese standards include surrounding rock reinforcement methods, such as grouting reinforcement and anchor reinforcement, as well as lining reinforcement methods like concrete strength improvement, lining thickening, and steel mesh lining. In 2016, Xu et al. [9] conducted shaking table tests on these measures, analyzing their anti-vibration effects and studying the action mechanism and impact of seismic measures for mountain tunnels. While such measures have demonstrated effectiveness through small-scale shaking table tests, their vibration control mechanisms and key parameters require further elucidation, especially for tunnels with deep burial in complex fault settings.

Numerical dynamic analysis and shaking table tests are commonly employed to investigate anti-vibration measures for tunnels. The numerical dynamic time-history analysis method of the full model can comprehensively describe the dynamic interaction of surrounding rock and the tunnel, fully accounting for the geometric irregularity and medium inhomogeneity of the site [10]. This method is the most practical approach for predicting the effects of various anti-vibration measures prior to their implementation in tunnels and underground structures. Shaking table test methods are divided into centrifuge shaking table tests and ordinary shaking table tests, each with the characteristic of strictly controlling the research parameters of the test object and being unaffected by external environmental and natural conditions [11]. General shaking table test equipment is typically large and can conduct large-scale model tests, with relatively minimal model size effects on the test. In contrast, the model size in centrifuge tests is generally small, and the test results are easily influenced by boundary effects [12]. Given the characteristics of these research methods, the numerical dynamic analysis method is generally utilized to analyze the dynamic response characteristics of the tunnel structure, and subsequently, the shaking table test is employed to validate the dynamic response characteristics, yielding significant effects.

Common numerical analysis methods include the finite element method, finite difference method, discrete element method, and others. The finite element method is commonly implemented using software such as ANSYS 10.0 and ABAQUS 6.11, while the finite difference method typically utilizes software like FLAC3D 9.0. Xie [13], in 2013, employed the finite element analysis method to compare and evaluate the seismic behavior of a tunnel with different cross-sectional shapes, focusing on a portal segment in a shallow-built tunnel located in a seismic region with strong motion. Similarly, Salemi et al. [14], in 2018, investigated the behavior of the concrete lining of circular shallow tunnels in sedimentary urban areas under seismic loads using an integration of numerical and metaheuristic techniques. Furthermore, Momenzadeh et al. [15], in 2019, explored the function of the tunnel lining under static and seismic conditions by combining the response surface method, the Hasofer-
Lind reliability concept, and the finite element method, with a focus on the reliability of the lining system of a small underground tunnel in the soil. An et al. [16], in 2021, established an ABAQUS finite element model to clarify the influence of fiber-reinforced concrete lining structure on the seismic performance of an urban shallow-buried rectangular tunnel. Additionally, Jian et al. [17], in 2022, applied the finite element method to examine the influence of the thickness of a shock absorption layer on the seismic effect of an urban shallow-buried double-arch rectangular tunnel. Moreover, Liu et al. [18], in 2022, employed full dynamic time history analysis to investigate the interaction in the transversal direction of an arched tunnel buried in a stratified soil in Hohhot, China. A numerical parametric analysis was conducted to elucidate critical response characteristics.

Shaking table tests for tunnels are used to validate numerical calculation results or theoretical analysis findings, and to independently analyze the dynamic response characteristics of tunnel structures. The comparative analysis of several anti-vibration measures by Xu et al. [9] falls into the latter category. Shaking table model tests were conducted to investigate the seismic behaviors of a double box utility tunnel with joint connections and the surrounding soil [19]. Liang et al. [20] investigated the seismic behavior of a shield tunnel with an ultra-large diameter of 15 m passing through a soft-hard stratum using a series of 1/30 scaled shaking table model tests and numerical simulations. Additionally, in 2022, Zhang et al. [21] studied the seismic performance of a shield tunnel under near-field ground motion, conducting a series of large-scale shaking table tests.

This study aimed to enhance the understanding of seismic performance for an extralarge cross-section highway tunnel crossing faults through a comprehensive experimental and numerical investigation. A representative case tunnel in Southwest China was selected as the research object. Shaking table tests were initially conducted on physical models to reveal strain, earth pressure, and acceleration distributions with and without control measures, including surrounding rock grouting, seismic joints, and shock absorption layers. Based on the test results, finite difference analyses were then performed to optimize key parameters of the grouting thickness and the shock absorption layer thickness. The findings provide practical seismic design recommendations applicable to similar tunnels constructed in complex fault environments.

#### 2. Case Study Tunnel

The case study tunnel selected for this research is the Xiangyangshan Tunnel located along the Qujing-Kunming Expressway in Yunnan Province, Southwest China. The Xiangyangshan tunnel is situated in the middle of the eastern Yunnan platform fold belt. The geological structure is highly intricate, particularly with a well-developed fault structure. The clearance width of a single tunnel on the standard section is 15.53 m, and the maximum excavation area is 167.6 m<sup>2</sup>. It is a three-lane extra-large section highway tunnel. The tunnel is designed as a left and right tunnel with a typical shallow buried section and a double tunnel spacing of 23.07 m. The cross-sectional dimensions of the lining structure and the tunnel's portal site under construction are illustrated in Figure 1. The surrounding rock mass of the tunnel is categorized as grades V<sub>2</sub> to III<sub>1</sub>, as assessed in accordance with the Chinese industry standard "Code for Design of Road Tunnel (JTG D70-2004)" [22]. The tunnel exhibits numerous fault fracture zones, developed joints, and fissures, leading to a rock mass that is relatively fragmented and unstable.

Based on the geological survey report, three low-resistance fractures have been identified in the surrounding rock of the tunnel, suspected to be structural fracture zones. The shallow rock in the tunnel area exhibits significant weathering, resulting in poor rock integrity. The deep joint fissures range from underdeveloped to moderately developed, with the surface primarily featuring two sets of joint fissures, which are detrimental to the stability of the surrounding rock of the tunnel.



Figure 1. Tunnels cross section parameters and its portal site under construction: (a) cross section parameters; (b) the portal site under construction.

(b)

The basic seismic intensity of the tunnel site area is rated at VIII on China's intensity scale. However, to account for the critical function of the expressway, a design fortification intensity of IX degree (strong earthquake level) was adopted for seismic design and control measures. The peak ground acceleration value for tunnel analysis was conservatively set at 0.4 g. Three types of input earthquake waves were incorporated into the subsequent physical model tests, namely the El-Centro, Taft, and artificial synthetic waves. The former two consist of seismic wave records from renowned historical earthquakes, whereas the latter are artificial seismic waves generated using probability function techniques. These waves represent different seismic characteristics that the tunnel may encounter. The peak value of original records was also adjusted and used in these physical model tests when input.

# 3. Shake Table Model Tests

(a)

To experimentally investigate the seismic responses of the Xiangyangshan Tunnel and evaluate potential vibration control measures, physical model tests were conducted on a large-scale shake table. This section describes the testing methodology and presents the results obtained, which provide valuable data for calibrating numerical models and optimizing anti-seismic designs.

#### 3.1. Model Design and Fabrication

Given the intricate and time-consuming nature of the model testing process, as well as the extended duration required for each experiment, only two tunnel models were constructed. Considering the research scope and testing conditions, the geometric similarity ratio of the test model is set at 1/100. The geotechnical model is designed to have dimensions of 91 cm in total height, 200 cm in total length, and 137 cm in total width, with a mass density of 1. The elastic modulus similarity ratio is 1/100, and other physical quantities are scaled accordingly based on the principles of similarity. The physical parameters and similarity relationships between the model and prototype are outlined in Table 1. Table 2 provides detailed information on the setup conditions of the two test models. Figures 2 and 3 show the size and preparation of the shake table model.

Physical Parameters	Similarity Relationships	<b>Physical Parameters</b>	Similarity Relationships
Stress $\sigma$	1/137.5	Time T	1/11.72604
Strain $\varepsilon$	1/1.375	Frequency <i>f</i>	1/0.08528
Elastic modulus E	1/100	Velocity v	1/11.72604
Poisson's ratio $\mu$	1	Accelerate a	1/0.727263
Density $\rho$	1/1.375	gravitational acceleration g	1
Length L	1/100	Cohesive force c	1/137.5
Displacement <i>u</i>	1/137.5	Damping C	1/1612.33
Force F	1/1375000	Stiffness K	1/10000

**Table 1.** Physical parameters and similarity relationships between experimental models and prototypes.

Table 2. Model setup details.

Model	Setting Conditions	Proposed Research Content	Model Overall Size	
Model 1	The fault has a dip of 90 degrees and a vidth of 20 m, and the tunnel is a wo-hole tunnel with a small clearance listance. The left tunnel does not have iny anti-vibration measures and is upported by general V surrounding ock conditions. In contrast, grouting is used to reinforce the surrounding rock n the right tunnel. The grouting is arried out at intervals of the entire ring vith a thickness of 4 m. Different einforcement lengths are set before und after the longitudinal upper fault, vith lengths of 25 m and 35 m, respectively.		137 cm × 200 cm × 91 cm based on similarity ratio calculation.	
Model 2	The fault has a dip of 90 degrees and a width of 20 m, and the tunnel is a two-hole tunnel with a small clearance distance. Both the left and right tunnels are supported by Class V surrounding rock. The left tunnel is equipped with seismic joints, while the right tunnel is provided with shock absorption layers. Different reinforcement ranges are set before and after the longitudinal upper fault, with lengths of 25 m and 35 m, respectively.	<ol> <li>(1) Establishing the strengthening effect of seismic joints.</li> <li>(2) Establishing the strengthening effect of the shock absorption layer.</li> </ol>		



Figure 2. Size of the shaking table model.



Figure 3. Descriptions of (a) model completion and (b) mounting on shaking table.

## 3.2. Instrumentation and Measurement

Strain sensors were positioned at designed monitoring sections A–A, B–B, C–C, D–D, E–E, F–F, G–G, H–H, I–I, J–J, and K–K (refer to Figure 4). A total of six strain gauge measuring points were placed on the outer surface of a single tunnel lining (see Figure 5). Each measuring point was equipped with two longitudinal and circumferential test channels, denoted by the symbol "Y" for strain measurement. Dynamic earth pressure testers and accelerometers were installed in sections C–C, D–D, E–E, F–F, G–G, H–H, and I–I. A dynamic earth pressure gauge (marked by the symbol "O" and sequentially labeled with number after the letter P in Figure 6) was positioned near the middle of each tunnel vault and left wall, respectively. An accelerometer was arranged at the top of the model box tunnel for each X/Y direction, and another accelerometer was placed at the bottom plate of the model box for each X/Y/Z direction. Additionally, two accelerometers were positioned at the middle of the right wall and the vault, one for each X/Y/Z direction.



Figure 4. Diagram of (a) longitudinal numbering of monitoring sections and (b) sensor arrangement.



Figure 5. Arrangement of strain gauges within a single tunnel section.



Figure 6. Layout of accelerometers and earth pressure gauges in the model cross-section.

# 3.3. Loading Protocols

The experimental scenarios involved exposing models to a range of input ground motions derived from scaled prototype earthquake data. The testing parameters for both models remained uniform, as outlined in Table 3. Four distinct seismic input levels were employed, specifically 0.25 A, 0.50 A, 0.75 A, and 1 A, with "A" denoting the peak value of the design seismic wave. Consistent peak amplitudes were maintained for identical El Centro, Taft, and artificial waves at each intensity level to facilitate the comparative analysis of structural reactions across various ground motion attributes.

No.	Loading Model	Input Seismic Wave	Seismic Input Mode	Model Loading Intensity
1	Model 1 and Model 2	White noise	Bottom synchronous input X, Y, Z direction vibration	Load seismic wave peak 0.10 A
2	Model 1 and Model 2	El-Centro wave	Bottom input X direction vibration	Load seismic wave peak 0.25 A
3	Model 1 and Model 2	Taft wave	Bottom input X direction vibration	Load seismic wave peak 0.25 A
4	Model 1 and Model 2	Artificial wave	Bottom input X direction vibration	Load seismic wave peak 0.25 A
5	Model 1 and Model 2	White noise	Bottom synchronous input X, Y, Z direction vibration	Load seismic wave peak 0.10 A
6	Model 1 and Model 2	El-Centro wave	Bottom input X direction vibration	Load seismic wave peak 0.5 A
7	Model 1 and Model 2	Taft wave	Bottom input X direction vibration	Load seismic wave peak 0.5 A
8	Model 1 and Model 2	Artificial wave	Bottom input X vibration	Load seismic wave peak 0.5 A
9	Model 1 and Model 2	White noise	Bottom synchronous input X, Y, Z direction vibration	Load seismic wave peak 0.10 A
10	Model 1 and Model 2	El-Centro wave	Bottom input X direction vibration	Load seismic wave peak 0.75 A
11	Model 1 and Model 2	Taft wave	Bottom input X direction vibration	Load seismic wave peak 0.75 A
12	Model 1 and Model 2	Artificial wave	Bottom input X direction vibration	Load seismic wave peak 0.75 A
13	Model 1 and Model 2	White noise	Bottom synchronous input X, Y, Z direction vibration	Load seismic wave peak 0.10 A
14	Model 1 and Model 2	El-Centro wave	Bottom input X direction vibration	Load seismic wave peak 1 A
15	Model 1 and Model 2	Taft wave	Bottom input X direction vibration	Load seismic wave peak 1 A
16	Model 1 and Model 2	Artificial wave	Bottom input X direction vibration	Load seismic wave peak 1 A

Table 3. Model test conditions.

Before excitation, a low-amplitude white noise signal was utilized to consolidate the soil model, and white noise scanning was introduced each time the peak acceleration value was adjusted to observe the dynamic behavior of the system model. White noise with a maximum amplitude of 0.1 g was applied in scenarios 1, 11, 21, and 31 to eliminate initial residual deformations and other variables. The original design seismic wave acceleration peak value was 0.4 g, equivalent to  $4.0 \text{ m/s}^2$ , with a vibration duration of 40.00 s. Following adjustments based on the similarity principle, the acceleration peak value was revised to  $5.5 \text{ m/s}^2$ , and the vibration duration was set at 3.4112 s. Consequently, the maximum peak value "A" of the seismic wave was established at  $5.5 \text{ m/s}^2$ .

#### 3.4. Results and Analysis

#### 3.4.1. Strain Analysis

The assessment of circumferential and longitudinal strain along the tunnel's axial direction under different seismic wave excitations and anti-vibration strategies was carried out using the findings from the model tests, illustrated in Figures 7–9. The testing segment of the tunnel model is positioned within the vertical range of 90–110 cm.

In general, the circumferential and longitudinal strains within and around the fault section (90–110 cm) displayed slightly higher values compared to other undisturbed ground segments when they were subjected to the three input ground motions. This indicated

that the boundary effects of the fault zone reached a certain distance into the surrounding intact rock.

After incorporating anti-vibration measures, the strain distributions exhibited a more evenly spread pattern along the tunnel axis in contrast to the initial condition without any interventions. Additionally, the peak strain values decreased with the implementation of these controls. Although certain local strain readings displayed slight increments, these variations were presumed to have stemmed from minor testing inaccuracies.



**Figure 7.** Peak distribution of (**a**) circumferential and (**b**) longitudinal strain increments along the longitudinal direction of the tunnel under the El-Centro wave.



Figure 8. Peak distribution of (a) circumferential and (b) longitudinal strain increments along the longitudinal direction of the tunnel under the Taft wave.



**Figure 9.** Peak distribution of (a) circumferential and (b) longitudinal strain increments along the longitudinal direction of the tunnel under the artificial wave.

In particular, when subjected to El-Centro wave excitation (refer to Figure 7), the introduction of anti-seismic measures effectively mitigated strain responses. In the absence of these measures, the maximum and minimum circumferential strain values were recorded at 71  $\mu\epsilon$  and  $-73 \mu\epsilon$ , respectively. Subsequent to the implementation of interventions such as surrounding rock grouting, seismic joints, and shock absorption layers, reductions in strain levels were evident. Specifically, the maximum circumferential strain decreased to 38  $\mu\epsilon$ , 48  $\mu\epsilon$ , and 52  $\mu\epsilon$ , corresponding to the reduction ratios of -46.5%, -32.4%, and -26.8%, respectively. Similarly, the minimum circumferential strain values decreased to  $-33 \mu\epsilon$ ,  $-38 \mu\epsilon$ , and  $-51 \mu\epsilon$ , with reduction ratios of -54.8%, -47.9%, and -30.1%. As for longitudinal strain, the initial maximum value in the absence of measures was recorded at 62  $\mu\epsilon$ . Post-grouting, seismic joints installation, and shock absorption layer application, this figure decreased to 34  $\mu\epsilon$ , 43  $\mu\epsilon$ , and 47  $\mu\epsilon$ , respectively. The reduction ratios for longitudinal strain were calculated at -45%, -30.64%, and -24.2%.

Under Taft wave excitation, as illustrated in Figure 8, the implementation of surrounding rock grouting, seismic joints, and shock absorption layers effectively reduced strains. The reduction ratios of maximum circumferential strain were -60.8%, -38%, and -38%, respectively, for each measure. Meanwhile, the reduction ratios of minimum circumferential strain were -33.3%, -7.8%, and -13.7%, respectively. In terms of longitudinal strain, the reduction ratios of maximum strain were -53.6%, -36.2%, and -36.2% following the application of the three controls. The reduction ratios of minimum longitudinal strain were -30.2%, -22.6%, and -34%, respectively.

Similar trends were observed under artificial wave excitation, as depicted in Figure 9. In this case, the reduction ratios of maximum circumferential strain were -53.3%, -34.7%, and -34.7% with each control. The reduction ratios of minimum circumferential strain were -51.9%, -9%, and -14.8%, respectively. For longitudinal strain, the reduction ratios of maximum strain ranged from -39% to -25.4%, while the reduction ratios of minimum strain ranged from -47% to -16.3%.

Furthermore, the analysis indicated a shift in the locations of peak strain at the fault interface section after the installation of seismic joints and shock absorption layers, demonstrating the effectiveness of these measures against fault zone amplification effects.

#### 3.4.2. Earth Pressure Analysis

Figure 10 illustrates the peak distribution of lining earth pressure increments along the tunnel longitudinal direction under different anti-vibration measures implemented in the model tests. Generally, the earth pressure increments near the fault section were slightly higher than in other intact sections under all three input ground motions. The distribution became more uniform after the application of anti-seismic controls.





In Figure 10a, it was evident that under El-Centro wave excitation, the maximum and minimum increments of lining earth pressure were 4.2 kPa and -3.7 kPa, respectively, without seismic measures. After grouting, installing seismic joints, and incorporating a shock absorption layer, the maximum increment of lining earth pressure decreased to 2.9 kPa, 3.7 kPa, and 3.8 kPa, respectively, with reduction ratios of -40%, -12%, and -9.5%. Simultaneously, the minimum increment of lining earth pressure was -2.8 kPa, -2.8 kPa, and -3.1 kPa, respectively, with reduction ratios of -24.3%, -24.3%, and -16.2%.

In Figure 10b, under Taft wave excitation, following the grouting of surrounding rock, installation of anti-seismic joints, and implementation of shock absorption layers, the reduction ratio for the maximum increment of lining earth pressure was -28%, -9.3%, and -20.9%, respectively. Similarly, the reduction ratio for the minimum increment of lining earth pressure was -34%, -7.3%, and -7.3%, respectively. In Figure 10c, under artificial wave excitation, after the completion of grouting, installation of anti-seismic measures,

and integration of shock absorption layers, the reduction ratio for the maximum increment of lining earth pressure was -37%, -15.2%, and -26.1%, respectively. Additionally, the reduction ratio for the minimum increment of lining earth pressure was -41.4%, -7.3%, and -7.3%, respectively.

Furthermore, the analysis of the peak position of earth pressure indicated that the peak position of earth pressure on the fault interface section changed after the installation of seismic joints and shock absorption layers.

#### 3.4.3. Acceleration Analysis

Figures 11–13 illustrate the distribution of peak acceleration values in the X and Y axis along the tunnel section under different anti-vibration measures implemented in the model tests. The results revealed dynamic shifts in the peak positions of X-axis and Y-axis acceleration within the tunnel section when subjected to three different types of wave excitations, in contrast to scenarios lacking anti-vibration interventions. With the implementation of anti-vibration measures, the distribution of acceleration increments in the tunnel section exhibited a more uniform pattern, thus successfully managing the acceleration peaks in both the X and Y axes.

In Figure 11, it was observed that under El-Centro wave excitation, the maximum and minimum values of acceleration in the X axis were 7.2 m/s<sup>2</sup> and -7.1 m/s<sup>2</sup>, respectively, without seismic measures. After grouting, installing anti-seismic joints, and incorporating a shock absorption layer, the maximum value of acceleration in the X axis decreased to 5.2 m/s<sup>2</sup>, 5.2 m/s<sup>2</sup>, and 6.3 m/s<sup>2</sup>, respectively, with reduction ratios of -27.8%, -27.8%, and -12.5%, while the minimum value of acceleration in the X axis was -5.2 m/s<sup>2</sup>, -5.2 m/s<sup>2</sup>, and -6.5 m/s<sup>2</sup>, respectively, with reduction ratios of -26.8%, -26.8%, and -8.5%. Without seismic measures, the maximum and minimum values of acceleration in the Y axis were 5.3 m/s<sup>2</sup> and -5.2 m/s<sup>2</sup>, respectively. After grouting, setting seismic joints, and incorporating a shock absorption layer, the maximum acceleration in the Y axis decreased to 2.3 m/s<sup>2</sup>, 4.8 m/s<sup>2</sup>, and 4.8 m/s<sup>2</sup>, respectively, with reduction ratios of -56.6%, -9.4%, and -9.4%, while the minimum acceleration in the Y axis was -2.8 m/s<sup>2</sup>, -4.9 m/s<sup>2</sup>, and -4.8 m/s<sup>2</sup>, respectively, with reduction ratios of -7.5%, and -7.7%, respectively.



**Figure 11.** Distribution of (**a**) X-axis and (**b**) Y-axis acceleration peak value along tunnel longitudinal direction under El-Centro wave.



**Figure 12.** Distribution of (**a**) X-axis and (**b**) Y-axis acceleration peak value along tunnel longitudinal direction under Taft wave.



**Figure 13.** Distribution of (a) X-axis and (b) Y-axis acceleration peak value along tunnel longitudinal direction under artificial wave.

From Figure 12, it was evident that under Taft wave excitation, after grouting of surrounding rock, setting of seismic joints, and incorporating a shock absorption layer, the reduction ratio of the maximum acceleration in the X axis was -27.8%, -9.7%, -12.5%, respectively, while the reduction ratio of the minimum acceleration in the X axis was -22.9%, -11.4%, -5.7%, respectively. The reduction ratio of the maximum acceleration in the Y axis was -27.5%, -5.9%, -5.9%, respectively, and the reduction ratio of the minimum acceleration in the Y axis was -27.5%, -5.9%, -7.7%, -11.5%, respectively.

Likewise, from Figure 13, under artificial wave excitation, after grouting of surrounding rock, setting of seismic joints, and incorporating a shock absorption layer, the reduction ratio of the maximum acceleration in the X axis was -27.8%, -9.7%, -12.5%, respectively, while the reduction ratio of the minimum acceleration in the X axis was -28%, -17.3%, -12%, respectively. The reduction ratio of the maximum acceleration in the Y axis was -43.8%, -15.8%, -15.8%, respectively, and the reduction ratio of the minimum acceleration in the Y axis was -37%, -11.1%, -14.8%, respectively.

Furthermore, the analysis of the peak position of acceleration indicated that the peak position of acceleration at the fault interface section changed after the installation of seismic joints and shock absorption layers.

# 3.4.4. Discussion

Based on the aforementioned test results, it was apparent that strain, earth pressure, and acceleration were slightly larger along the fault section and its vicinity under the excitation of three waveforms. In most cases, the index amplification effect was most pronounced at the interface of the fault zone surrounding rock. This demonstrated that the presence of a fault zone had a significant amplification effect on the acceleration, principal stress, and lining stress of the tunnel lining structure. The amplification effect extended a certain distance from the boundary surface of the surrounding rock of the fault zone to the complete surrounding rock section, with the maximum extension being 10 m. It was advisable to extend the minimum length of seismic fortification at both ends of the fault section by 10 to 20 m beyond the specifications outlined for tunnels with the recommended section in the Chinese industry standard (JTG D70-2004). Furthermore, after the installation of seismic joints and shock absorption layers, there were alterations in the positions of the maximum seismic response peaks at the fault interface sections.

To comprehensively analyze the shock absorption effect of surrounding rock grouting, seismic joints, and shock absorption layer, the maximum reduction ratio of strain, earth pressure, and acceleration peak values for each seismic measure was summarized in Table 4. In general, the trends in anti-vibration effects across various waveform excitations remained largely consistent, affirming the reliability of the model test outcomes.

Anti-Shock	Maximum Reduction Ratio (%)						
Measures	Waveform	Circumferential Strain	Longitudinal Strain	Earth Pressure	X-Axis Acceleration	Y-Axis Acceleration	
Surrounding rock grouting	El-Centro wave Taft wave Artificial wave Average	-54.8% -60.8% -53.3% -56.3%	-45% -53.6% -47% -48.5%	-40% -34% -41.4% -38.5%	-27.8% -27.8% -28% -27.9%	-56.6% -27.5% -43.8% -42.6%	
Seismic joints	El-Centro wave Taft wave Artificial wave Average	-47.9% -38% -34.7% -40.2%	-30.64% -36.2% -30.5% -32.4%	-24.3% -9.3% -15.2% -16.3%	-27.8% -11.4% -17.3% -18.8%	-9.4% -7.7% -15.8% -11.0%	
Shock absorbing layer	El-Centro wave Taft wave Artificial wave Average	-30.1% -38% -34.7% -34.3%	-24.2% -36.2 -28.6 -29.7%	-16.2% -20.9% -26.1% -21.1%	-12.5% -12.5% -12.5% -12.5%	-9.4% -11.5% -15.8% -12.2%	

Table 4. Analysis of anti-vibration effect.

A comprehensive analysis revealed that the reinforcement of surrounding rock through grouting, the installation of seismic joints, and the addition of a shock absorption layer had noticeable seismic effects. Following the grouting reinforcement, the reduction ratios of hoop strain, longitudinal strain, earth pressure, peak acceleration value in the X direction, and peak acceleration value in the Y direction were -56.3%, -48.5%, -38.5%, -27.9%, and -42.6%, respectively. Subsequently, after the installation of seismic joints, the reduction ratios of hoop strain, longitudinal strain, earth pressure, X acceleration peak, and Y acceleration peak were -40.2%, -32.4%, -16.3%, -18.8%, and -11.0%, respectively. Finally, with the addition of the shock absorption layer, the reduction ratios of hoop strain, longitudinal strain, earth pressure, X acceleration peak were -34.3%, -29.7%,

-21.1%, -12.5%, and -12.2%, respectively. These results indicated that the seismic effects of seismic joints and shock absorption layers were similar, with the grouting reinforcement of surrounding rock exhibiting more significant effects than the former two.

# 4. Numerical Simulation

Following the validation achieved with the shake table experiments, extensive numerical analyses were conducted using the FLAC3D finite difference program. The objectives were to complement the physical model tests through more comprehensive parametric investigations and ultimately optimize key seismic control parameters for the design of Xiangyangshan Tunnel traversing the longitudinal fault zone.

## 4.1. Theoretical Basis

In numerical computations for models, the damping form typically adopts linear Rayleigh damping. In this case, the damping matrix [C] is represented as a linear combination of the mass matrix [M] and the stiffness matrix [K], as depicted in Equation (1) [23].

$$[C] = \alpha[M] + \beta[K], \tag{1}$$

where  $\alpha$  and  $\beta$  can be determined by assuming that the damping ratio for a specific secondorder frequency is known.

The damping constant can be expressed using two frequencies of different magnitudes as follows:

$$\begin{array}{l} \alpha = \frac{2(\zeta_j \omega_i - \zeta_i \omega_j)}{(\omega_i + \omega_j)(\omega_i - \omega_j)} \omega_i \omega_j \\ \beta = \frac{2(\zeta_i \omega_i - \zeta_j \omega_j)}{(\omega_i + \omega_j)(\omega_i - \omega_j)} \end{array} \right\},$$
(2)

where  $\xi_i$  and  $\xi_j$  are the damping ratios of the *i*-th and *j*-th order circular frequencies ( $\omega_i$  and  $\omega_i$ ), respectively.

In general, engineering structures are usually assumed to have a damping ratio that remains relatively constant over a wide frequency range, with a typical value of 0.05 often used. The physical and mechanical parameters of the boundary elements in practical applications are determined by the materials of the adjacent surrounding rock medium, and specific calculation formulas can be found in the reference [24].

The input method for seismic waves acting on the computational model adopts the form of inputting stress waves at the viscoelastic artificial boundary, which is known as the equivalent boundary force method [25]. This method requires that the equivalent load applied to the artificial boundary makes the stress and displacement on the boundary identical to the original wave field. At this juncture, the equivalent boundary stress  $F_B(t)$  can be expressed as follows:

$$F_B(t) = \sigma_B(t) + C\dot{u}_B(t) + Ku_B(t), \tag{3}$$

where  $\sigma_B(t)$  represents the stress at the artificial boundary of the infinite domain model;  $\dot{u}(t)$  and u(t) represent the vibration velocity and displacement at the artificial boundary. *C* and *K*, respectively, denote the damping coefficient and spring elasticity coefficient set at the artificial boundary.

When accounting for the fluctuation effects of the normal and tangential waves at the artificial boundary, researchers have analyzed the incident wave field of seismic waves in spherical coordinates and derived expressions for the vertical incident P-wave and S-wave at the artificial boundary, respectively [26].

Considering the incident non-attenuated S-wave in the far field, the corresponding expression is:

$$F_{BT}(t) = 2\rho C_S \dot{u}_B(t) + \frac{2G}{R} u_B(t),$$
(4)

where *R* represents the distance from the artificial boundary to the ground or structure; *G* represents the shear modulus of the adjacent medium in the artificial boundary region;  $\lambda$  and  $\rho$  represent the Lamé constants and density of the corresponding medium.

#### 4.2. Computational Model

Based on the experimental model size and parameter design, a three-dimensional numerical model was constructed, as illustrated in Figure 14. Solid elements were used to simulate both the surrounding rock and the secondary lining, while the initial support was represented by shell structure elements [27]. The surrounding rock was modeled using the Mohr–Coulomb yield criterion and an elastic-plastic incremental constitutive relationship, whereas the secondary lining and initial support were characterized by a linear elastic constitutive model. Excavation simulation was carried out utilizing the "model null" function in FLAC3D, with a maximum grid size of 5 m. The model boundary conditions were defined using the free field mesh technology within FLAC3D software to establish free field boundaries, with a viscous boundary applied at the base. The free field boundary comprised four side-layered free field meshes surrounding the model and four corner-point layered free field meshes [28], connected to the main grid via dampers to mimic an infinite field model. The seismic input wave at the base corresponded to the renowned El-centro wave mentioned earlier.



Colour explanation: Red: tunnel lining; Blue: surrounding rock; Green: fault rock; yellow and deep blue: boundary

Figure 14. Diagram of numerical model: (a) model grid; (b) boundary conditions.

#### 4.3. Validation of Numerical Model

Before conducting parametric studies, it was essential to validate the model against shake table test results to ensure the accuracy of the solution and the applicability of the findings to the prototype tunnel design. Accelerations recorded at identical points along tunnel sections under bottom-input El-Centro excitations showed partly agreement between simulation and physical experimentation (Figure 15). This confirmed the numerical model's capability to basically capture soil–structure interaction and seismic response using equivalent FLAC3D techniques.



**Figure 15.** Validation of numerical simulation: (a) lining cross section and monitoring points; (b) comparison of numerical simulation results with model test results.

# 4.4. Parametric Study of Controls

With validated simulation capabilities, two key anti-vibration measures, namely surrounding rock grouting and shock-absorbing layer insertion, were systematically optimized through numerical experimentation. The evaluation focused on their effectiveness in reducing peak accelerations and stresses in the vicinity of the fault.

## 4.4.1. Grouting Layer Thickness

In conjunction with current relevant research findings, this section focused on selecting grouting reinforcement surrounding the tunnel rock with grouting layer thicknesses of 2 m, 4 m, and 6 m as seismic fortification measures for the tunnel, and investigated the antivibration mechanism of grouting reinforcement surrounding the rock. For the calculation results of peak values of horizontal acceleration (positive and negative) and principal stress at key positions of the tunnel under different grouting thickness conditions, refer to Figures 16 and 17.



**Figure 16.** Effect of grouting thickness on horizontal acceleration in (a) positive and (b) negative directions.



Figure 17. Effect of grouting thickness on (a) first and (b) third principal stresses.

The results in Figure 16 indicated that radial grouting had a similar effect on reducing acceleration at the vault, arch toe, and inverted arch. The maximum acceleration in the fault fracture zone notably decreased with an increase in grouting layer thickness. When the grouting layer thickness was 6 m, the maximum acceleration response peak value of the tunnel lining was only  $5.35 \text{ m/s}^2$ , approximately 17% lower than that without a grouting layer. This was attributed to the significantly enhanced strength of the surrounding rock in the fracture zone after grouting reinforcement, gradually strengthening the constraint of the surrounding rock on the lining structure and reducing the lithological difference between the fracture zone and the intact surrounding rock on both sides.

Furthermore, the acceleration distribution along the longitudinal direction of the tunnel was analyzed. In general, the acceleration response at the fracture zone was larger than that at positions far away from the fracture zone. When the grouting layer thickness was 6 m, the acceleration response peak at the fracture zone position approached that at the intact section of surrounding rock, and the acceleration longitudinal distribution curve became gentler. It could be inferred that when the grouting layer thickness increased to a certain extent, the influence of the fracture zone on the lining essentially disappeared due to the reinforcement of the fractured rock mass around the tunnel over a large range, and the acceleration response curve along the longitudinal direction of the tunnel tended to become horizontal.

In Figure 17, it was evident that the first principal stress and the third principal stress in the tunnel lining structure decreased significantly with the continuous increase in the thickness of the grouting layer at the location of the fault zone and its vicinity. When the thickness of the grouting layer was 2 m, 4 m, and 6 m, respectively, the maximum reduction in the first principal stress was 34%, 41%, and 46%, with the largest reduction occurring at the crown and the base of the wall. The reduction in stress at the crown and invert was not significant. The highest reduction rate of the third principal stress was close to 73%, with the largest reduction occurring at the crown and invert.

Through comparative analysis, it was concluded that the decrease in stress response due to the grouting layer was more significant than the acceleration. This was attributed to the enhanced self-stabilizing ability of the surrounding rock after grouting reinforcement, which increased the constraint force on the tunnel and reduced the external load transmitted from the surrounding rock to the lining under seismic action.

In summary, when the thickness of the grouting layer is 6 m, the principal stress in the tunnel meets the code requirements, the acceleration response of the tunnel along the full length fluctuates within a small range, and the amplification effect of the acceleration

on the lining at the fault zone is already minimal. Further increasing the thickness of the grouting layer no longer has a significant effect. It is suggested that the thickness of the grouting layer should be around 6 m.

# 4.4.2. Shock Absorbing Layer Thickness

In this section, the shock-absorbing layer was positioned using the "surrounding rock-initial support-shock absorbing layer-secondary lining" method. Four thicknesses were considered: 10 cm, 15 cm, 20 cm, and 30 cm, and compared with the condition without a shock absorbing layer. The peak horizontal accelerations (positive and negative) and peak principal stresses at critical locations in the tunnel for different shock absorbing layer thickness conditions are depicted in Figures 18 and 19.



**Figure 18.** Effect of shock absorbing layer thickness on horizontal acceleration in (**a**) positive and (**b**) negative directions.



Figure 19. Effect of shock absorbing layer thickness on the first principal stress.

The findings from Figure 18 indicated that the amplification factor of the horizontal acceleration at various points of the lining at the fault zone of the extra-large section tunnel aligned with the trend of the change in the thickness of the seismic isolation layer relative to the original seismic wave acceleration. It increased with the thickness of the

seismic isolation layer, and the horizontal acceleration at the crown position was slightly larger than that at the springing and the crown. In the absence of a seismic isolation layer, the maximum acceleration response peak value along the full length of the lining at the fault zone was  $6.56 \text{ m/s}^2$ , approximately 1.89 times larger than the original seismic wave acceleration. With a 10 cm thickness of the seismic isolation layer, the acceleration at the crown increased by 1.97 times, and with a 15 cm thickness, the acceleration at the crown was amplified by 2.09 times. At 20 cm thickness, the amplification factor of the crown acceleration was 2.11 times. The amplification factor of the acceleration exhibited a slowing trend as the thickness of the seismic isolation layer changed from 15 cm to 20 cm. When the thickness of the seismic isolation layer was 30 cm, the amplification factor of the acceleration was 2.52 times, showing an increasing trend again. Upon comparing the acceleration distribution patterns of the fault section and the intact surrounding rock section, it was found that at this point, the difference in horizontal acceleration between the two was the largest.

Combined with related research findings, the initial analysis suggests that the trend of increasing acceleration response with the thickness of the shock absorbing layer can be attributed to the lower and softer elastic modulus of the shock absorbing layer. This leads to reduced restraint on the lining structure, resulting in an amplified acceleration response of the tunnel under seismic action. This observation underscores the need for particular attention in practical engineering anti-seismic efforts.

Figure 19 illustrated that the inclusion of a shock absorbing layer led to a significant reduction in the first principal stress value of the lining structure at the location of the fault fractured zone in the tunnel. Compared to the absence of a shock absorbing layer, the maximum reduction in the first principal stress was nearly 62% after the installation of the shock absorbing layer, with the most pronounced effect observed at the crown and invert positions. The reduction rate slightly increased with the thickness of the shock absorbing layer was below 20 cm, for every 5 cm increase in thickness, the reduction rate consistently remained around 5%. However, once the thickness of the shock absorbing layer exceeded 20 cm, the additional shock absorbing effect became limited. It was recommended that the thickness of the shock absorbing layer should be 20 cm, and potentially increased conservatively if necessary.

#### 4.4.3. Overall Analysis

The comparative analysis of horizontal acceleration and maximum reduction amplitude of principal stress of the tunnel under different grouting thickness of surrounding rock and shock absorbing layer thickness conditions is presented in Table 5.

Parameters		Grouting Thickness of Surrounding Rock 5		Shock Absorbing Layer Thickness				
1 41 41	lieters	2 m	4 m	6 m	10 cm	15 cm	20 cm	30 cm
Horizontal acceleration	Maximum reduction ratio/%	-20%	-24%	-31%	17%	21%	23%	46%
Ap	Appearance position	Arch foot	Arch foot	Arch foot	Arch foot	Inverted arch	Arch foot	Inverted arch
Principal stress	Maximum reduction ratio/%	-68%	-65%	-73%	-60%	-61%	-62%	-65%
	Appearance position	Inverted arch	Inverted arch	Inverted arch	Inverted arch	Inverted arch	Inverted arch	Inverted arch

Table 5. Analysis of numerical results.

The comparative analysis showed that grouting in the surrounding rock significantly reduced the principal stress and acceleration of the tunnel structure, while the installation of a shock absorbing layer notably reduced the stress of the tunnel, albeit with an increase

in acceleration. The existence of a damping layer may lead to a decrease in the impedance of the medium in the outer extension region of the tunnel lining, consequently amplifying the acceleration response. Nonetheless, the stress response of the lining is mitigated due to the diminished deformation modulus in this zone. Both grouting in the surrounding rock and the installation of a shock absorbing layer had a stronger control effect on principal stress than on acceleration, with the maximum reduction amplitudes being 73% and 65%, respectively. The maximum amplitude of principal stress was located at the inverted arch, whereas the maximum amplitude of acceleration was situated at the arch foot and inverted arch. These findings warranted increase attention in practical applications.

Through comparing and analyzing the distribution of peak principal stress and acceleration in tunnel structures under varying operational parameters, it is observed that as the thickness of the damping layer increases, there is a decrease in the peak value of the first principal stress. Meanwhile, the reduction amplitude of the third principal stress peak initially decreases and then increases with thickness. Opting for a 20 cm thick shock absorber layer provides superior shock absorption benefits. A thicker grouting layer results in a greater reduction in peak principal stress. Notably, the seismic resistance effect is more pronounced for grouting thicknesses ranging from 4–6 m, with a recommended thickness of 6 m for optimal application.

#### 5. Conclusions

Similar to the conclusions drawn from field investigations and research literature on many historical earthquakes, it was also concludes that most serious seismic damage happens to fault fracture zone [29], and the following conclusions were given based on the above analysis.

- (1) Under the excitation of three waveforms, strain, earth pressure, and acceleration all showed a tendency to be slightly higher along the longitudinal direction of the tunnel at the fault section and its surroundings. The most significant amplification effect was observed at the interface between the fault zone and the surrounding rock. This amplification effect extends from the boundary of the surrounding rock to the entire surrounding rock, with a maximum extension distance of 10 m. It is recommended that the minimum length of seismic fortification at both ends of the fault section in tunnels with large spans should be extended by 10 to 20 m beyond that specified for tunnels with the standard section in the Chinese industry standard (JTG D70-2004).
- (2) In general, the variation in the anti-vibration effect under different waveform excitations remained largely consistent, affirming the accuracy of the model test results. Following the implementation of seismic joints and shock-absorbing layers, there were changes in the positions of the maximum seismic response peaks at fault interface sections. Grouting reinforcement of the surrounding rock, installation of seismic joints, and incorporation of shock-absorbing layers all demonstrated noticeable seismic effects. The seismic impact of seismic joints and shock-absorbing layers was comparable, whereas the reinforcement effect of grouting on the surrounding rock surpassed that of the other two measures.
- (3) As the thickness of the grouting layer increased, there was a significant decrease in both the acceleration and the peak value of principal stress in the tunnel structure. The influence of the grouting layer on stress response was more pronounced than on acceleration, with the maximum reduction in principal stress reaching up to 73%. When the grouting layer thickness reached 6 m, the tunnel principal stress complied with the code requirements. At this thickness, the acceleration response peak value at the fracture zone position approached that of the intact section of the surrounding rock, the longitudinal distribution curve of acceleration became gentler, the amplification effect of lining acceleration at the fracture zone position diminished significantly, and the impact of further increasing the grouting layer thickness became negligible. It was recommended that the grouting layer thickness be maintained at approximately 6 m.

(4) The horizontal acceleration of the lining at the fault of an extra-large section tunnel increased with the thickness of the shock-absorbing layer. When the shock-absorbing layer thickness was 30 cm, the acceleration amplification reached 2.52 times, representing the largest difference. The installation of a shock-absorbing layer could significantly reduce the first principal stress value of the lining structure at the fault fracture zone, with the maximum reduction rate nearing 62%. Initially, the reduction rate slightly increased with the thickness of the shock-absorbing layer and gradually stabilized. Once the shock-absorbing layer thickness exceeded 20 cm, the effectiveness of further increasing the thickness became limited. It was recommended to maintain the shock-absorbing layer thickness at 20 cm.

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# Article Fibre-Microbial Curing Tests and Slope Stability Analysis

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**Abstract:** In response to the deformation resistance deficiency and poor toughness characteristics of soil after microbial curing, a combination of fibre reinforcement technology and microbial curing technology was used to conduct microbial curing tests using basalt fibres and denitrifying bacteria. In this paper, the effects of fibre on the strength and toughness of soil consolidation were analysed by unconfined compressive strength test and direct shear test, and the stability of reinforced slope was analysed by numerical simulation. The results show the following. (1) Basalt fibre can effectively improve the characteristics of brittle damage of microbially consolidated soil while increasing the compressive and shear strength. (2) Fibre dosing and fibre length have important effects on the mechanical properties of microbially consolidated soil. (3) The appropriate amount of basalt fibre can promote the generation of calcium carbonate. (4) The plastic strain area of the slope decreases after microbial reinforcement and the maximum equivalent plastic stress decreases by 65 kPa.

Keywords: basalt fibres; microbial-induced calcite precipitation; slope stability

# 1. Introduction

Microbially induced calcium carbonate deposition (MICP) is an emerging geotechnical improvement technology that uses calcium carbonate cemented soil particles produced by microbial metabolic activities to enhance the physical and mechanical characteristics of geotechnical bodies [1,2]. This has great potential for application in many fields including soil mechanical modification, embankment erosion resistance, and prevention of heavy metal ion pollution [3–7]. The use of microorganisms to reinforce the slope surface improves the stability of the slope while improving the soil, facilitating plant growth, and being ecologically friendly.

MICP technology has received wide attention from researchers at home and abroad because of its simplicity of operation, high efficiency of reinforcement, and lack of pollution to the environment [8], and much research has been conducted on the engineering properties of MICP-modified soils [9-18]. Chu et al. [19] used MICP technology to improve sandy soils to form a weakly permeable crust layer, which served the purpose of enhancing impermeability in engineering. Liu Lu et al. [20] used a microbial curing method to treat dikes, and the experimental results showed that the treated dikes improved the erosion resistance. Li Chi [21] used microbially induced calcium carbonate precipitation (MICP) technology combined with adsorbent materials to cure/stabilise the remediation of Zn-Pb composite heavy metal contaminated soil, revealing the remediation mechanism of MICP technology to treat Zn-Pb heavy metal contaminated soil. Liu Xiaojun [22] used MICP technology for soil site fracture remediation and curing. These studies showed that MICP, as an emerging soil consolidation technology, has potential practical engineering value and can be applied to various fields. However, the strength and toughness of materials are usually opposed to each other, and some studies have shown that microbially cured soils exhibit significant brittle characteristics [23], which to some extent inhibits the application of MICP technology in practical engineering. Therefore, it is necessary to investigate how to improve the toughness of microbially cured specimens.

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**Copyright:** © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). Studies have demonstrated that by adding discrete short filament fibres as reinforcement to the soil, the soil becomes substantially less brittle when it fractures, increasing its strength [24]. Through indoor research, Yetimoglu et al. [25] observed that fibre reinforcement has no discernible impact on peak shear strength, but that it can ameliorate sandy soil shear brittle damage by increasing the residual shear strength of the soil sample by increasing the amount of fibre admixture. According to Shao et al. [26], adding fibres to sandy soil had an impact on its shear strength, lowering strength loss after the peak strength and improving the nature of brittle damage. Wei Li et al. [27] used wheat-straw-fibre-reinforced seaside saline soil and found that fibre reinforcement increased the cohesion c of saline soil substantially, and its resistance to deformation was greatly enhanced.

For this reason, this paper uses a combination of fibre reinforcement technology and microbial curing technology for soil curing tests. Based on the unconfined compressive strength test and direct shear test, the effects of basalt fibre on the mechanical properties of microbial soil consolidation are analysed, and a three-dimensional slope model is established by ABAQUS finite element software to analyse the stability of the slope after microbial consolidation.

## 2. Materials and Methods

2.1. Test Soil

The soil used for the test is taken from Longlang Expressway, Xinhua County, Loudi City, Hunan Province. This soil is clayey, and its physical parameters are listed in Table 1.

**Table 1.** Physical parameters of clay.

Optimum Moisture Content/%	Maximum Dry Density/g∙cm <sup>-3</sup>	Liquid Limit/%	Plasticity Index	
16.8	1.68	35	18.6	

# 2.2. Test Fibres

The fibres used for the test were basalt short-cut fibres. Compared with ordinary synthetic fibre, basalt fibre has obvious advantages in tensile strength, elastic modulus, impermeability, and freeze–thaw resistance, overcoming the shortcomings of synthetic fibres that are easily pulled off when cracks expand. Referring to Abd Al-kaream et al.'s [28] formulation study of polypropylene fibres for soft soil improvement, the fibres were added to the soil at 0, 0.1, 0.2, 0.3, 0.4, 0.5, and 0.6 by mass. The fibre is produced by Zhejiang Haining Anjie Composite Material. A photograph is shown in Figure 1, and the physical and mechanical properties are listed in Table 2.



Figure 1. Basalt short-cut fibre.

Physical and	Monofilament	Specific	Modulus of	Tensile Strength/MPa
Mechanical Indicators	Diameter/µm	Gravity/g·cm <sup>-3</sup>	Elasticity/GPa	
Parameters	$7 \sim 15$	2.63~2.65	91~110	$3000 {\sim} 4800$

Table 2. Physical and mechanical properties of fibre.

#### 2.3. Bacterial Solution for Test

The microorganisms used were paracoccus, a type of denitrifying bacteria, purchased at the Shanghai Conservation Biotechnology Center (SHBCC). Denitrifying Bacillus is a heterotrophic, parthenogenic anaerobic bacterium that can survive in the medium of nitrate. It acts as a nitrogen source, reducing nitrate to nitrite and further reducing nitrite to ammonia and free nitrogen under insufficient soil oxygen. The medium consists of 5 g peptone, 3 g beef paste, 5 g sodium chloride, 15 g agar, and 1000 mL distilled water, and the specific method of activating the culture includes the following steps:

- (1) The strain is added to sterile water, gently shaken to dissolve, and inoculated on slant medium. After inoculation is complete, it is placed in an incubator for incubation, with the incubator temperature set at 30 °C and time set at 24 h, and finally placed in a refrigerator at 4 °C for backup.
- (2) The ingredients were weighed into triangular flasks according to the medium recipe, the agar was heated and melted, and the pH of the medium was adjusted to 7.0 using a solution of sodium hydroxide at a concentration of 1 mol/L. The triangular flask is added with a plunger and wrapped and placed in an autoclave for sterilisation, the sterilisation temperature is set at 120 °C, and the sterilisation time is set at 30 min.
- (3) After autoclaving, the triangular flasks were placed on a sterile operating table to cool. The cultured colonies were inoculated into the agar-free culture medium by aseptic operation and incubated for 36–48 h in an intelligent shaker set at an ambient temperature of 30 °C and a shaker speed of 150 r/min.

#### 2.4. Test Cementing Solution

The cementing solution was a mixture of calcium chloride (CaCl<sub>2</sub>), sodium nitrite (NaNO<sub>2</sub>), and potassium nitrate (KNO<sub>2</sub>). Among them, sodium nitrite and potassium nitrate provide nitrogen sources in the denitrification process of denitrifying bacteria, while calcium chloride provides calcium sources; calcium chloride is also the fixing solution of the bacterial solution, and calcium ions and bacterial cell walls have adsorption effects, which facilitate bacteria attachment to the surface of negatively nucleated soil particles and play the role of fixing bacteria. The sedimentation and calcium ions to produce the cementation CaCO<sub>2</sub> precipitate. CaCO<sub>2</sub> adheres to the surface of soil particles and connects the loose particles by wrapping and filling the gaps between particles. The specific reaction equations are (1)-(3) [29].

$$5CH_3COO^- + 8NO_3^- + 13H^+ \rightarrow 10CO_2 + 4N_2 + 14H_2O$$
 (1)

$$CO_2 + H_2O \leftrightarrow HCO_3^- + H^+$$
 (2)

$$Ca^{2+} + HCO_3^- + OH^- \rightarrow CaCO_3(s) + H_2O$$
(3)

- 2.5. Specimen Preparation Steps
- The lower bedding block of the test mould was placed into the lower part of the test mould but exposed by approximately 2 cm.

- (2) According to the sample preparation standards, four equal portions of soil and basalt short-cut fibre were weighed, and the two were mixed and stirred, layered into the mould, and lightly compacted with a tamping rod to a predetermined height (20 mm per layer). After the sample was completed, the upper mat with the test mould was placed into the test mould, and the upper mat was exposed to approximately 2 cm.
- (3) A peristaltic pump was used to inject 50 mL of bacterial solution at a rate of 5 mL/min, and after standing for 4 h, the same volume of cementing solution was injected at a rate of 10 mL/min and allowed to stand for 6–8 h to ensure that the microorganisms reacted fully within the specimen.
- (4) A peristaltic pump was used to inject 50 mL of cementing solution into the specimen at a rate of 10 mL/min at an interval of 12 h. The injection was stopped after reaching a predetermined number of treatments, and water was continuously and slowly injected from the top of the specimen to clean the inside of the specimen to terminate the microbial curing process.

#### 2.6. Test Method

#### 2.6.1. Compressive Strength Test without Lateral Limit

A strain-controlled unconfined compression tester is used, and the processed specimen is tested according to the Highway Geotechnical Test Procedure JTG3430-2020, see [30] (pp. 213–217). The loading rate of unconfined compressive strength is kept at 1.0 mm/min until the specimen breaks the ring to end the test. The compression test schematic is shown in Figure 2.



Figure 2. Schematic diagram of compressive test.

# 2.6.2. Calcium Carbonate Content Determination Test

The acid washing method was used to measure the calcium carbonate content inside each specimen separately. The modified specimens were dried in an oven at 100 °C until constant weight, and the mass of the specimen and calcium carbonate was recorded as m1. A sufficient amount of dilute hydrochloric acid was added and soaked for a period of time, and when no bubbles were generated in the solution, the calcium carbonate in the specimen was considered to have reacted completely. After rinsing the sample with distilled water several times and then putting it into the oven to dry, the mass of the treated sample was m2. The difference between m1 and m2 is the mass of calcium carbonate produced.

#### 2.6.3. Direct Shear Test

After the specimen is compacted, each layer is weighed and filled with 30 g of soil in the ring knife, and the test is carried out with quadruple direct shear in accordance with the Highway Geotechnical Test Procedure JTG3430-2020, see [30] (p. 185). The shear rate set to 0.8 mm/min and recorded every 10 s. After the shear is finished, the shear force and vertical pressure are removed, and the test block is taken out to end the test. The shear test schematic is shown in Figure 3.



Figure 3. Schematic diagram of shear test.

# 3. Results and Discussion

## 3.1. Stress-Strain Curve

The stress–strain curves of denitrifying bacterial consolidated soil under different reinforcement conditions were basically the same. The specimens with 0.4 fibre dosing and a 12 mm fibre length were analysed as an example, as shown in Figure 4, where  $\sigma$  is the stress and  $\varepsilon$  is the strain.





It is obvious from the figure that the stress peak of the 0.4 fibre-doped specimen is higher and the stress peak appears later compared with the non-fibre-doped specimen. This is because on the one hand, the presence of fibre promotes the generation of calcium carbonate, the integrity and strength of the specimens are improved, and the stress limit that the specimens can withstand is increased. On the other hand, when cracks appear inside the specimens, the tensile force generated by the fibre inhibits the further development of the cracks, and the stress of the specimens rises slowly and reaches its peak. At the same time, it can be seen that the stress of the specimens with 0.4 fibre dosing decreases more slowly. It is obvious that the addition of fibre can effectively enhance the strength and toughness of the specimens after curing with denitrifying bacteria and improve the brittle damage characteristics of the soil.

# 3.2. Effect of Fibre Admixture on Strength of Specimens

Figure 5 shows the variation in the unconfined compressive strength of the specimens with different fibre lengths with respect to the fibre admixture. From Figure 5, it can be seen that after the treatment of denitrifying bacteria, the originally loose soil can be effectively solidified and present a higher strength. When basalt fibres were added to the soil, the unconfined compressive strength of the specimens was further improved. For example, the unconfined compressive strengths of the corresponding specimens were 526 kPa, 612 kPa, 674 kPa, and 886 kPa when the fibre dosing amount was 0, 0.1, 0.2, and 0.3 at a 12 mm fibre length, respectively. Overall, the unconfined compressive strength of the specimens tended

to increase and then decrease with increasing fibre dosing, reaching peak strengths of 886 kPa and 918 kPa at 0.3 and 0.4 fibre dosing, respectively. This is because the interaction between the fibres and soil particles in the soil sample can limit the relative sliding of the fibres, which provides the fibres with an ability to bear the external load and transfer the load and reduce the stress concentration in the soil sample. The addition of an appropriate amount of fibre in microbial soil consolidation can improve the strength of soil, and the optimal fibre admixture is between 0.3 and 0.4.





(d)



fibre length. (b) Effect of fibre dosing on peak strength at 9 mm fibre length. (c) Effect of fibre dosing on peak strength at 12 mm fibre length. (d) Effect of fibre dosing on peak strength at 15 mm fibre length. (e) Effect of fibre dosing on peak strength at 18 mm fibre length.

# 3.3. Effect of Fibre Length on Strength of Specimens

Figure 6 reflects the variation in the lateral limitless compressive strength of the specimens with fibre length for different fibre dosing amounts. It can be seen from the figure that when the fibre dose is too low (0.1, 0.2, 0.3, 0.4), the unconfined compressive strength of the specimen increases with increasing fibre length. When the fibre dose is too high (0.5, 0.6), the unconfined compressive strength of the specimen increases with increasing fibre length and then decreases. When the fibre length is 12 mm, the basalt fibre has the most obvious effect on denitrifying bacteria.



**Figure 6.** Effect of fibre length on peak strength. (a) Effect of fibre length on peak strength with 0.1 fibre content. (b) Effect of fibre length on peak strength with 0.2 fibre content. (c) Effect of fibre length on peak strength with 0.3 fibre content. (d) Effect of fibre length on peak strength with 0.4 fibre content. (e) Effect of fibre length on peak strength with 0.5 fibre content. (f) Effect of fibre length on peak strength with 0.6 fibre content.

# 3.4. Calcium Carbonate Content

Figure 7 shows the calcium carbonate content in the specimens with different fibre doping and gives the unconfined compressive strength of each specimen. It can be seen from the figure that the lowest calcium carbonate content of 1.91 was found in the specimens without fibre dosing, while the highest calcium carbonate content of 6.56 and 6.34 was found in the specimens with fibre dosing of 0.3 and 0.4. The overall trend of calcium carbonate content increased and then decreased with increasing fibre dosing, but the decrease in calcium carbonate content after reaching the peak was not obvious. This occurred mainly because calcium carbonate was attached to the soil particles after generation, and the addition of fibre increased the 'colonisation area' available for microorganisms. However, the volume of pores inside the soil body is certain, and with the increase in fibre incorporation, the pores inside the soil body are gradually occupied by fibres, which compresses the growth environment of microorganisms and leads to the restriction of microorganism growth and has a negative effect on the amount of calcium carbonate production. Therefore, it can be inferred that the addition of fibres in the soil is beneficial to the production of calcium carbonate, and the highest content of calcium carbonate is achieved at 0.3 and 0.4 fibre admixture, but the addition of excessive fibres is detrimental to the production of calcium carbonate.



**Figure 7.** (a) Effect of fibre dosing on CaCO<sub>3</sub> content at 12 mm. (b) Effect of fibre dosing on unconfined compressive strength at 12 mm.

#### 3.5. Shear Strength

Figure 8 shows the relationship between vertical pressure and shear strength for different fibre dosing. From the figure, it can be seen that the maximum shear strength of the plain soil is 96 kPa and the maximum shear strength of the soil is 114 kPa when the fibre admixture is 0. This indicates that the microbial curing technology can improve the shear strength of the clay soil with a maximum increase of 118.9. With an increase in fibre content, the shear strength increases and then decreases, and the maximum shear strength of 163 kPa is reached at 0.3 fibre admixture.

Figures 9 and 10 show the relationship between fibre dosing and cohesion and internal friction angle. With an increase in fibre dosing, the cohesion and internal friction angle increase and then decrease, and they all reach their maxima when the fibre dosing is 0.3. This is because excessive fibre content will inhibit the formation of calcium carbonate and thus reduce the shear strength of soil. Therefore, the cohesiveness and internal friction angle of the soil mass will decrease. On the whole, the cohesion and internal friction angle of reinforced soil are generally higher than those of unreinforced soil.



Figure 8. Relationship between shear strength and vertical pressure.



Figure 9. Fibre dosing and cohesion relationship.



Figure 10. Relationship between fibre dosing and internal friction angle.

# 4. Numerical Simulation

#### 4.1. Finite Element Basic Principle of Strength Reduction Method

The strength reduction method is a widely used analysis method in slope stability analysis. It is calculated by substituting the cohesion and internal friction angle into the finite element model, with the reduction factor of the slope just reaching the damage state as the safety factor, the essence of which is that the cohesion and internal friction angle of the material gradually decrease. This results in the stress of a unit not being matched with the strength or beyond the yield surface, and the unbearable stress is gradually transferred to the surrounding soil units. When a continuous sliding surface appears, the soil is destabilised.

#### 4.2. Model Construction

Using the Longlang Expressway in Loudi city, Hunan Province, as the base project, ABAQUS software was used to establish a three-dimensional slope model with a length of 25 m, width of 7 m, height of 13 m, and slope of 1:1.5. Microbial reinforcement treatment was carried out along the vertical slope direction, and the reinforcement thickness was 1 m. The model assumed that the soil was an ideal elastic-plastic body, and the Mohr-Coulomb model was used. According to the experimental results, the soil before microbial reinforcement is taken as density  $\rho = 1.78 \text{ g/cm}^{-3}$ , elastic modulus E = 10 MPa, Poisson's ratio  $\mu$  = 0.35, cohesion c = 13 kPa, and internal friction angle  $\varphi$  = 11.7°, and after microbial reinforcement is taken as density  $\rho = 1.96 \text{ g/cm}^{-3}$ , elastic modulus E = 10 MPa, Poisson's ratio  $\mu = 0.35$ , cohesion c = 25.95 kPa, and internal friction angle  $\varphi = 15.6^{\circ}$ . The cohesion and internal friction angle vary with the field variables, and the range of field variables varies between 0.5 and 3. The boundary conditions are set in ABAQUS load to constrain the displacements in the x, y, and z directions at the bottom of the model, constrain the displacements in the y directions before and after the model, constrain the displacements in the x directions to the left and right of the model, and apply the gravity force in the z-axis direction to the model as a whole. The mesh division of the slope model adopts eight-node linear hexahedral cells (C3D8), and the calculation area is divided into a total of 2415 cells.

#### 4.3. Stability Analysis

#### 4.3.1. Plastic Zone Analysis

The plastic strain clouds before and after the finite element simulation analysis of microbial reinforcement are shown in Figure 11.

From the above figure, it can be seen that when t = 0.2, the plastic zone appears above the foot of the slope, and when t = 0.25, the plastic zone above the foot of the slope expands and extends to the inner part of the slope and gradually connects with the plastic zone inside the slope. When t = 0.34, the plastic zone basically penetrates, and the slope is destabilised. Comparing the plastic strain clouds before and after microbial reinforcement, it can be seen that at t = 0.2, the strain in the plastic zone at the foot of the slope after microbial reinforcement is lower and the strain inside the slope body is higher, but the value is smaller than the strain inside the slope body before microbial reinforcement. This may occur because after the slope surface is reinforced by microorganisms, the microorganisms have not completely penetrated into the interior of the soil body and have less influence on the interior of the slope body. The subsequent development of the plastic zone is roughly similar before and after microbial reinforcement. The analysis of the strain cloud diagram at the time of complete penetration shows that the maximum plastic strain before microbial reinforcement appears at the foot of the slope, and the corresponding stress reaches 239.3 kPa, while the maximum plastic strain after microbial reinforcement also appears at the foot of the slope, but its distribution range is greatly reduced, and the maximum stress value is lowered to 174.5 kPa.



**Figure 11.** (a) Equivalent plastic strain cloud before microbial reinforcement at t = 0.2. (b) Equivalent plastic strain cloud before microbial reinforcement at t = 0.25. (c) Equivalent plastic strain cloud before microbial reinforcement at t = 0.34. (d) Equivalent plastic strain cloud after microbial reinforcement at t = 0.25. (e) Equivalent plastic strain cloud after microbial reinforcement at t = 0.25. (f) Equivalent plastic strain cloud after microbial reinforcement at t = 0.25. (f) Equivalent plastic strain cloud after microbial reinforcement at t = 0.25. (f) Equivalent plastic strain cloud after microbial reinforcement at t = 0.25. (f) Equivalent plastic strain cloud after microbial reinforcement at t = 0.34.

# 4.3.2. Displacement Cloud Analysis

Figure 12 shows the total displacement, X-directional displacement, total displacement vector, and X-directional displacement vector of the slope after microbial reinforcement derived by the intensity reduction method. Analysis of Figure 12a shows that the maximum displacement of the slope is 1.36 cm, the area of the maximum displacement is located at the foot of the slope, and the displacement gradually decreases in a circular shape with this position as the centre downward. Figure 12b shows the X-direction displacement. From the X-direction displacement, we can see the location of the potential sliding surface of the slope and the range of the potential landslide area. The total displacement vector map in Figure 12c clearly shows the location and regional range of the sliding surface of the slope, which forms a circular arc-shaped sliding surface from the top of the slope to the foot of the slope. Figure 12d shows the X-direction displacement vector diagram. The X-direction specified by the calculation model points to the inside of the slope body in the positive direction. From the diagram, it can be seen that the maximum displacement in the X-direction is 1.34 cm, the displacement produced is the displacement of the landslide sliding outward, the sliding surface can be clearly seen, and the displacement of the soil below the sliding surface is basically zero.



**Figure 12.** (**a**) Total displacement cloud after microbial reinforcement. (**b**) X-direction displacement cloud after microbial reinforcement. (**c**) Total displacement vector diagram after microbial reinforcement. (**d**) X-direction displacement vector diagram after microbial reinforcement.

#### 4.3.3. Calculation of Safety Coefficient

Nodal 1622 at the top of the slope is selected as the characteristic point, and the graphs related to the safety coefficient and displacement in the process of discounting are obtained. From Figures 13 and 14, two obvious inflection points can be seen. The appearance of the inflection points indicates that the slope is unstable or close to damage when the plastic stress of the slope increases and the displacement increases suddenly. If the inflection point of displacement is used as the stability index of the slope, then it can be concluded that the safety coefficient of the slope without microbial reinforcement Fs = 1.16, and the safety coefficient of the slope after microbial reinforcement Fs = 1.41, the safety coefficient after reinforcement is increased by 21.5 percent, and the reinforcement effect is obvious. If the nonconvergence of numerical analysis calculation is used as an index to evaluate the stability of slope, then it can be concluded that the safety factor of slope without microbial reinforcement Fs = 1.46, and the safety factor after reinforcement Fs = 1.18, the safety factor of slope after microbial reinforcement Fs = 1.46, and the safety factor after reinforcement is increased by 23.7 percent.



Figure 13. Relationship between safety factor and lateral displacement before microbial reinforcement.



Figure 14. Relationship between safety factor and lateral displacement after microbial reinforcement.

## 5. Conclusions

In this paper, the mechanical properties of basalt fibre-reinforced microbially consolidated soil were studied by conducting unconfined compressive strength tests and direct shear tests and analysing the stability of the slope after microbial reinforcement in terms of plastic zone characteristics, displacement clouds, and safety factors through finite element numerical simulations. The following conclusions were obtained:

- (1) The combination of fibre reinforcement technology and MICP technology can significantly improve the compressive and shear strength of the soil and improve the characteristics of brittle soil after microbial curing.
- (2) The incorporation of basalt fibres has an important influence on the mechanical properties of denitrifying bacterial consolidated soil. When the fibre admixture is low, the unconfined compressive strength of the soil increases with increasing fibre length, and when the fibre admixture is high, the strength tends to increase and then decrease with increasing fibre length. The optimal fibre admixture is between 0.3 and 0.4, and the best fibre length is 12 mm.
- (3) The effect of increasing basalt fibre incorporation on the calcium carbonate content of the soil after microbial curing tends to increase and then decrease. This is because after the fibre is added to the soil, the area where calcium carbonate can be colonised increases, and when the fibre is increasingly added, the internal void of the soil is gradually occupied by the fibre, and the growth of microorganisms is restricted. This has a negative impact on the generation of calcium carbonate.
- (4) The development of the plastic zone of the slope before and after microbial reinforcement is generally similar, but the scope of the plastic zone after reinforcement is reduced as a whole, especially in the reinforced area of the slope, and the maximum equivalent plastic stress is decreased by 65 kPa.
- (5) The safety coefficient of the slope before microbial reinforcement was 1.16, and the safety coefficient after reinforcement was 1.41. The stability of the slope was obviously strengthened.

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# Article Experiments on the State Boundary Surface of Aeolian Sand for Road Building in the Tengger Desert

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Abstract: As a special road-building material widely distributed in desert areas, critical state soil mechanics is used to study the mechanical properties of sand and make up for the lack of research on its engineering characteristics. A series of drained and undrained triaxial compression tests with a loading rate of 0.12 mm/min medium-density aeolian sands taken from Tengger Desert in the northwest of China was carried out to obtain the three-dimensional state boundary surface. The test results reveal that the strength gained from drained and undrained tests increased, respectively, linearly and non-linearly with the increase of the effective confining pressure. Affected by the variation of pore pressure and shear rate, the undrained strength was higher than the drained strength at low effective confining pressures, and the two types of strengths tend to be consistent when the effective confining pressure becomes greater than 800 kPa. The volumetric changes of the aeolian specimens transition from dilatation to contraction when the effective confining pressures increase. The investigation of the strength, deformation and failure characteristics gives rise to the shape parameters of its state boundary surface, which provides not only a basis for the constitutive modelling of the aeolian sand, but also a reference for roadbed construction and other foundation engineering in desert areas.

Keywords: aeolian sand; triaxial test; state boundary surface; strength characteristics; deformation

# 1. Introduction

The state boundary surface is the unique physical state relationship formed by effective stress paths of soil in a three-dimensional space composed of generalized normal stress, shear stress and specific volume, and it provides an outer limit to the combinations of effective stress and specific volume which the soil can reach [1]. In road building, it can predict the limit state of aeolian sand subgrade failure. The state boundary surface is the basis of critical state soil mechanics and is crucial in studies of the soil mechanical properties, which have been widely used to study the mechanical behaviors of remodeled clay. Aeolian sand is a special material for roadbed filling, which is widely distributed in desert areas, while there are only a few basic experiments for engineering applications. Moreover, the basic experimental results related to critical states are rather scarce. In recent years, much infrastructure, such as highways, railways, transmission lines and other projects, has been built in desert areas. In addition, the numerical simulation of the dynamic response of multi-layer pavement under a moving load is gradually enriched [2,3]. However, the lack of research on the mechanical properties of aeolian sand has seriously restricted the geotechnical application in desert areas. Therefore, experimental characteristics of the state boundary surface of aeolian sand is urgently required for a better understanding the mechanical behaviour of this material.

Currently, most of the existing research on aeolian sands focuses on their engineering aspects, such as particle-size distribution, compaction characteristics, bearing capacity, shear resistance and proportioned concrete [4–6]. The particle-size distribution of aeolian

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**Copyright:** © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). sand in several regions was analysed by different researchers, for instance, Li et al. [7] for the Tengger Desert, Liu et al. [8] for the Mu Us Desert, Ning et al. [9], Guo et al. [10] for the Badain Jaran Desert, Zhang et al. [11] for the Qinghai Lake East Sandy Land, etc. These studies provide rich references for the construction of a foundation treatment in desert areas. Other researchers, e.g., Yuan et al. [12], Li et al. [13], Yin et al. [14], studied the compaction characteristics of aeolian sand. Du et al. [15], Yu et al. [16], Yi et al. [17] and Zheng et al. [18] studied the shear strength characteristics in different desert regions. Yin et al. [19] and Li et al. [20] studied the bearing capacity characteristics of aeolian sand foundations. Although the existing research has accumulated valuable engineering experience for foundation construction in desert areas, a systematic and in-depth triaxial test study is needed to better obtain the unique characteristics of its physical state.

So far aeolian sand has been rarely studied in triaxial tests. Some authors have studied the dynamic properties of aeolian sand with dynamic triaxial tests, e.g., Deng [21], Song [22], Liu [23], Song et al. [24], Liu et al. [25], Luo et al. [26] and Bao et al. [27]. Other authors focus on the static strength of sand. For instance, Li et al. [28] studied the strength characteristics of cement-improved aeolian sand; Badanagki [29] obtained the shear strength and stiffness of aeolian sand in the Sahara Desert, Libya, by a series of drained and undrained triaxial tests; Song [24] obtained the strength characteristics of the aeolian sand in the Mu Us Desert, China, at different stress paths, densities and moisture contents; Qureshi et al. [30] obtained the strength and softening resistance of aeolian sand treated by biopolymer in Al-Sharqia desert; Souza et al. [31] determined the critical state parameters of aeolian sand in Natal, Brazil by triaxial tests with different initial densities; Wei et al. [32] obtained the mechanical properties of aeolian sand and fly ash at different proportions. In particular, Li Xuefeng et al. [33–35] studied the characteristics of deformation, strength and failure of aeolian sand in the Tengger Desert, China at different spatial stress states, different densities and multiple confining pressures. All in all, the unique mechanical properties of aeolian sand have attracted increasing popularity, but some other aspects, such as the critical state, phase transformation and dilatancy of aeolian sand at different stress states and stress paths, need to be studied further. In particular, the determination of its state boundary surface is rarely reported.

In this paper, a series of triaxial drained and undrained tests on the medium-density specimens were conducted to obtain the unique relationship of the state boundary surface of the aeolian sand taken from the Tengger Desert in China. The mechanical responses are measured at different confining pressures. The critical state lines, phase transformation lines and dilatancy characteristics are determined. According to the unique relationship between the stress state and the volume state, the state boundary surface in the *p-q-e* space is established. The test results improve our understanding of the mechanical response and helps to establish a reasonable constitutive relationship for aeolian sand.

#### 2. Test Method

# 2.1. Test Apparatus

The triaxial apparatus used in the test was produced by Ningxi Soil Apparatus in Nanjing, China, which can be controlled by stress or strain (Figure 1). The triaxial apparatus is mainly composed of a host, a pressure controller, and a multi-channel communication digital acquisition apparatus. The apparatus is controlled by a single chip computer, and each part can work independently. Multi-channel communication can collect and process data in real time. The apparatus can perform various stress path tests and drained or undrained triaxial tests, in which the drained triaxial test can obtain the real strength of the material, and the undrained triaxial test corresponding to the rapid construction can obtain the pore pressure development. The size of the cylindrical specimen is  $\Phi$ 39.1 mm × 80 mm, the axial load range is 0~30 kN, and its measurement accuracy is  $\pm$ 1%. The range of the confining pressure controller is 0~1.99 MPa, the range of the back pressure controller is 0~0.99 MPa, and the control accuracy is  $\pm$ 0.5%FS (Full Scale).



Figure 1. SLB-1 triaxial apparatus, Nanjing, China.

#### 2.2. Test Material

The sand specimen is aeolian sand sampled from the Tengger Desert, China. The Tengger Desert is a typical enrichment area of aeolian sand. Aeolian sand in this area is a special granular material with heterogeneity, cohesionless, uniform particle size, strong permeability and remarkable anisotropy characteristics. The compaction curve has bimodal characteristics, which is also a type of collapsible soil [36]. Therefore, the sand tested in this paper is widely representative. Figure 2 shows the microscopic image of the used sand.

The mass of the aeolian sand with a particle size larger than 0.075 mm exceeds 85% of the total mass. The moisture content of natural aeolian sand is 0.14%; the maximum dry density is 1.68 g/cm<sup>3</sup>; the minimum dry density is 1.40 g/cm<sup>3</sup>; the specific gravity of sand is 2.67; the maximum void ratio is 0.907, and the minimum void ratio is 0.589. The coefficient of nonuniformity  $C_u$  is 1.31, the coefficient of curvature  $C_c$  is 2.66, and the fine particle content is less than 5%. According to the "Engineering Classification Standard of Soil" (GB/T 50145-2007), the sand is classified as poorly graded sand. Table 1 shows the particle-size distribution of aeolian sand measured by the sieving method (the data in Table 1 are the average results of three sieving tests). In the table, the sieve mass with a particle size of 0.1~0.25 mm is 750.8 g, accounting for 75.08% of the total mass of the sample, which is the highest particle size of aeolian sand.

Mass of san Sand mass Sand mass	mple taken for fine si on 2 mm sieve = 0 g under 2 mm sieve =	eve analysis = 1000 g 1000 g	The percentage of sand less than 0.075 mm in the total sand mass = $1.23\%$ The percentage of sand less than 2 mm in the total sand mass = $100\%$				
Particle Size/mm	Cumulative Sand Mass on the Sieve/g	Mass of Sand with Particle Size Smaller than the Aperture/g	The Mass Percentage of Sand with a Particle Size Smaller than the Aperture/%	The Mass Percentage of Total Sand Whose Particle Size Is Smaller than the Aperture /%			
0	0	0	0	0			
0.075	12.3	12.3	1.23	1.23			
0.1	131.3	143.6	13.13	14.36			
0.25	750.8	894.4	75.08	89.44			
0.5	104.4	998.8	10.44	99.88			
1	1.2	1000	0.12	100			

 Table 1. Particle size gradation of aeolian sand in the Tengger Desert.

# 2.3. Test Process and Scheme

The specimen preparation process was completed by using a split mould, a rubber membrane and a vacuum pump. The vacuum was used to make the rubber membrane close to the inner wall of the split mould. The multiple sieving pluviation method is used for the specimen preparation. The process of specimen preparation and specimen installation is shown in Figure 3. The relative density  $D_r$  is controlled to be 0.5, the dry density  $\rho_d = 1.53 \text{ g/cm}^3$ , and the initial void ratio  $e_0 = 0.745$  (medium density). After the specimen was prepared, it was necessary to vacuum the specimen through an exhaust hole on the top cap of the specimen to ensure the stability of the specimen size. To this end, a negative pressure of 20 kPa inside the specimen was maintained to fix the shape of the specimen. Afterwards, two steps of hydraulic saturation and back pressure saturation were performed to saturate the specimens. After the saturation reaches higher than 95%, the specimen consolidation and triaxial drained and undrained shear test were carried out with reference to ASTM (D7181-11).



Figure 2. Microscopic image of test material (0.5 mm/grid).



Figure 3. Specimen preparation and specimen installation.

To obtain the state boundary surface of the aeolian sand in the three-dimensional space, it is necessary to obtain the effective stress paths and strength and deformation at different confining pressures. For this purpose, the drained and undrained triaxial tests at the confining pressure  $\sigma_3$  of 50, 100, 200, 400 and 800 kPa were designed. The key control parameters of the test scheme were detailed in Table 2.

Table 2. Triaxial test control parameters.

Material Type	Saturability	Effective Confining Pressure $\sigma_3$ (kPa)	Drained Conditions	Strain Loading Rate (mm/min)
Aeolian sand	More than 95%	50 100 200 400 800	I.Drained II.Undrained	0.12

# 3. Test Results

# 3.1. Stress-Strain Relationships

Figure 4a,b shows the variation of the generalized shear stress and volumetric strain with axial strain under the drained conditions. Due to the complex and diverse in natural particle shapes of the aeolian sand (Figure 1), the particle internal friction is strong, resulting in obvious nonlinear characteristics in the stress-strain curves. At a low effective confining pressure ( $\sigma_3 \leq 100$  kPa), the specimens exhibit strain hardening behaviour, and at a high effective confining pressure, they show strain-softening behaviours. The higher the effective confining pressure, the more obvious the softening characteristic, the greater the elastic modulus, the higher the peak strength, and the longer the elastic-plastic stage. At low effective confining pressure, the aeolian sand first undergoes contraction deformation and then dilates until failure is achieved. Meanwhile, the characteristics of contraction and dilatation are affected significantly by the effective confining pressure. With the increase of the effective confining pressure, the volumetric changes develop from dilatation to contraction. While the effective confining pressure reaches 800 kPa, only the contraction deformation occurs (compared to the initial volume of the specimen).



Figure 4. Relationships between stress and volumetric strain with axial strain at drained condition. (a) Stress-strain relationships. (b) Volumetric strain-strain relationships.

Figure 5a,b show the variation of generalized shear stress and pore pressure with axial strain under undrained conditions. Figure 5a shows that the stress-strain relationships are softened only at relatively low effective confining pressures (e.g., 50, 100 and 200 kPa), and hardened at high effective confining pressures (>200 kPa). A greater effective confining pressure gives rise to a greater elastic modulus and a higher peak strength. Compared with the stress-strain relationships under the drained condition, the peak stress point of the undrained test is higher and the elastic-plastic stage is longer under the same load conditions. The results suggest that the undrained shear rate needs to be reduced to fully dissipate the excess pore pressure. Figure 5b shows the variation of pore pressure, implying that the dilatancy increases gradually with the increase of effective confining pressure. At low effective confining pressure, the negative pore pressure generally increases, while at high effective confining pressure, the pore pressure increases generally. It also shows that only dilation occurs at low effective confining pressure, while only contraction occurs at high effective confining pressure. This is consistent with the results obtained from drained tests. However, pore pressure has a greater influence on the stress-strain relationships under undrained conditions, and aeolian sand is more prone to dilatancy failure.



Figure 5. Relationships between stress and pore pressure with axial strain under undrained conditions. (a) Stress-strain relationships. (b) Pore pressure-strain relationships.

Figure 6 shows the variation of pore pressure coefficient *A* with axial strain. Skempton [37] reported that the specimen contracts for A > 0, and it dilates at A < 0. Therefore, in Figure 6, the pore pressure and strain relationships above auxiliary line A = 0 are contraction, and below auxiliary line A = 0 is dilation. The test results of the pore pressure coefficient *A* also show that the deformation and failure mode of the aeolian sand is dilatation under undrained conditions, and the contraction part only occurs within 2% of the axial strain.



Figure 6. Relationships between pore pressure coefficient and axial strain.

Figure 7a,b shows the relationships between axial strain and radial strain under drained and undrained conditions. The relationships between the axial strain and radial strain change linearly under drained condition. As the effective confining pressure increases, the slope of the linear relationship increases negatively, indicating that the aeolian sand has an initial anisotropy, and the initial anisotropy decreases with the increase of the effective confining pressure continuously. Figure 7b shows that the relationships between the axial strain and radial strain change linearly under undrained conditions, which always satisfies the equation  $\varepsilon_1 = -2\varepsilon_3$ . The anisotropy characteristic is not obvious, which may be related to the loading rate of the test.



Figure 7. Relationships between axial strain and radial strain. (a) Drained. (b) Undrained.

Figures 8a,b and 9a,b show the relationships between generalized stress ratio  $\eta$  and generalized shear strain  $\varepsilon_s$  of aeolian sand and the relationships between  $\varepsilon_s/\eta$  and  $\varepsilon_s$  under drained and undrained conditions, respectively. Comparing Figures 8a and 9a, it can be concluded that the peak stress ratio decreases gradually with the increase of effective confining pressure in both the drained and undrained tests, but the peak stress ratio of the drained condition is slightly higher than that of the undrained condition. The shape of the  $\eta$ - $\varepsilon_s$  relationship for drained and undrained conditions are significantly different. Under undrained conditions, the stress ratio has an obvious peak value, and the peak stress ratio decreases slightly with the increase of  $\varepsilon_s$ . In Figures 8b and 9b, the  $\varepsilon_s/\eta$ - $\varepsilon_s$  relationships are linear under drained and undrained conditions. The slope of the straight line increases with the increase of the effective confining pressure under the drained condition, but the change of the slope is small under an undrained condition.

Wood et al. [38] used the peak generalized stress ratio to represent the characteristics of the softening curve and proposed a hyperbolic model characterized by the stress ratio and the shear strain, which reads:

$$\frac{\eta}{\eta_{\max}} = \frac{\varepsilon_s}{B + \varepsilon_s} \tag{1}$$

where *B* is the test constant and  $\eta_{max}$  is the peak value of the generalized stress ratio. The transformation form is as follows.

$$\frac{\varepsilon_{\rm s}}{\eta} = \frac{B}{\eta_{\rm max}} + \frac{\varepsilon_{\rm s}}{\eta_{\rm max}} \tag{2}$$

Our test results are consistent with the hyperbolic model proposed by Wood et al. [38]. The slope of the  $\varepsilon_s/\eta$ - $\varepsilon_s$  curve increases gradually with the increase of effective confining pressure under drained conditions, indicating that softening increases gradually. The slope of the  $\varepsilon_s/\eta$ - $\varepsilon_s$  curve under undrained conditions is significantly higher than that under drained conditions, indicating that the softening phenomenon is more obvious.

Figure 10 shows the variation of peak shear stress and peak friction angle with effective confining pressure under drained and undrained conditions. The black curve in the figure increases linearly, indicating that the generalized peak shear stress increases linearly with the increase of effective confining pressure under both drained and undrained conditions. However, the undrained strength is greater than the drained strength at low effective confining pressure, and the drained and undrained strength becomes the same as the effective confining pressure increases. All the purple curves show a nonlinear decreasing trend, indicating that the peak friction angle decreases nonlinearly with the increase of effective confining pressure. At low effective confining pressure, the peak friction angles of



the two test conditions are quite different, but at high effective confining pressure they are close to the same.

**Figure 8.**  $\eta$ - $\varepsilon_s$  relationships and  $\varepsilon_s/\eta$ - $\varepsilon_s$  relationships under drained condition. (a)  $\eta$ - $\varepsilon_s$  relationships under drained condition. (b)  $\varepsilon_s/\eta$ - $\varepsilon_s$  relationships under drained condition.



**Figure 9.**  $\eta$ - $\varepsilon_s$  relationships and  $\varepsilon_s/\eta$ - $\varepsilon_s$  relationships under undrained condition. (a)  $\eta$ - $\varepsilon_s$  relationships under undrained condition. (b)  $\varepsilon_s/\eta$ - $\varepsilon_s$  relationships under undrained condition.



**Figure 10.** The relationships between  $q_{max} \sim \sigma_3$  and  $\varphi_{max} \sim \sigma_3$  under drained and undrained conditions.

#### 3.2. State Boundary Surface

Figure 11 plots the critical state line and phase transformation line in the p-q space under drained and undrained conditions and gives the slopes of the two-state lines. The green points in Figure 11a are the phase transformation points, which are the inflection points where the void ratio changes from decrease to increase, and it is also the transformation point of volumetric change from contraction to dilation. The phase transformation point is determined according to the corresponding stress state point, as the void ratio increment is 0. Figure 11 shows that the critical state line and phase transformation line determined by the undrained triaxial test are slightly lower than those determined by the drained triaxial test, due to the change of pore pressure and shear rate, and the variation range is less than 5%. The test results show that the aeolian sand has a unified critical state line and phase transformation line.

The critical state line and phase transformation line of aeolian sand in the p-q space can be expressed linearly by the following equations:

$$q = M_{\rm CSL1}p \tag{3}$$

$$q = M_{\rm PTL1} p \tag{4}$$

where  $M_{\text{CSL1}}$  and  $M_{\text{PTL1}}$  are the slopes of the critical state line and the phase transformation line in *p*-*q* space, respectively.



**Figure 11.** Effective stress path for drained and undrained test. (a) Effective stress path for drained test. (b) Effective stress path for undrained test.

The information in Figure 12 shows the critical state line, phase transformation line and normal consolidation line under drained conditions, which can be represented by linear relations. At the same effective confining pressure, with the increase of ln p, the void ratio decreases first and then increases rapidly to the critical state (compared to the consolidated void ratio). At different effective confining pressures, with the increase of effective confining pressure and ln p, the decreased degree of void ratio increases gradually compared with the consolidated void ratio. While the effective confining pressure is greater than 800 kPa, the void ratio is always smaller than the consolidation void ratio, and the aeolian sand undergoes only contractive deformation under this condition. The studies of Verdugo and Ishihara [39], Riemer and Seed [40] show that the critical state characteristics of cohesionless soil are significantly different from those of clay, and the critical state line is no longer unique in the ln *p*-*e* space, due to the anisotropy of the soil. In this study, the specimen adopts the same specimen preparation method and is sheared under triaxial conditions, so the critical state lines, phase transformation lines and normal consolidation lines of aeolian sand in *e*-ln *p* space can be expressed by linear equations as expressed by Equations (5)–(7), respectively.



Figure 12. e-ln p relationships under drained conditions.

$$e_{\rm CSL} = M_{\rm CSL2} \ln p + e_{\rm C} \tag{5}$$

$$e_{\rm PTL} = M_{\rm PTL2} \ln p + e_{\rm P} \tag{6}$$

$$e_{\rm NCL} = M_{\rm NCL} \ln p + e_{\rm N} \tag{7}$$

where  $e_{\text{CSL2}}$ ,  $e_{\text{PTL2}}$  and  $e_{\text{NCL}}$  are the void ratios corresponding to the critical state line, the phase transformation line and the normal consolidation line at any p, respectively.  $M_{\text{CSL2}}$ ,  $M_{\text{PTL2}}$  and  $M_{\text{NCL}}$  are the slopes of the critical state line, phase transformation line and normal consolidation line in ln p-e space, respectively.  $e_{\text{C}}$ ,  $e_{\text{P}}$  and  $e_{\text{N}}$  are the void ratios corresponding to the critical state line, phase transformation line and normal consolidation line in ln p-e space, respectively.  $e_{\text{C}}$ ,  $e_{\text{P}}$  and  $e_{\text{N}}$  are the void ratios corresponding to the critical state line, phase transformation line and normal consolidation line at p = 1 kPa, respectively.

Figure 13 shows the *e*-*q* relationships of aeolian sand under drained conditions. The shape characteristics of the critical state line and the phase transformation line in the *e*-*q* space are exponential. Moreover, as *q* increases, the void ratio decreases compared with the consolidated void ratio, and the specimen contracts. At low and medium effective confining pressure, the void ratio increases rapidly to a critical state after reaching the phase transformation point. At high effective confining pressures, the void ratio increases and *q* decreases, and the specimen show strain softening behaviours. At low effective confining pressures, and the dilatation characteristics are significant. The higher the effective confining pressure, the greater the peak shear stress. The critical state lines and phase transformation lines in *e*-*q* space are nonlinear. The critical state line and phase transformation line can be used to predict the development trend of voids under different test conditions. According to Equations (3) and (5), the critical state line in *e*-*q* space can be expressed as follows:

$$q = M_{\text{CSL1}}p = M_{\text{CSL1}} \exp \frac{e_{\text{CSL}} - e_{\text{C}}}{M_{\text{CSL2}}}$$
(8)

Based on Equations (4) and (6), the phase transformation line in *e-q* space can be expressed as follows:

$$q = M_{\text{PTL1}}p = M_{\text{PTL1}}\exp\frac{e_{\text{PTL}} - e_{\text{P}}}{M_{\text{PTL2}}}$$
(9)

Figure 14 shows the critical state characteristic curve of aeolian sand in e-p-q space. The three-dimensional surface composed of e, p and q is the state boundary surface or Roscoe surface. The curve connected by the transformation points where the void ratio first decreases and then increases at different stress states is defined as the phase transformation state line, which reflects the state transformation from contraction to dilation. While the granular material is sheared to failure, the curve composed of the effective stress path, void

ratio and average effective stress is defined as the critical state line. The three-dimensional critical state line can be expressed in Equations (5) and (7), and reads:

$$\begin{cases} e_{\text{CSL}} = M_{\text{CSL2}} \ln p + e_{\text{C}} \\ q = M_{\text{CSL1}} \exp \frac{e_{\text{CSL}} - e_{\text{C}}}{M_{\text{CSL2}}} \end{cases}$$
(10)



Figure 13. e-q relationships under drained conditions.





The three-dimensional phase transformation line can be expressed in Equations (6) and (8), and reads:

$$\begin{cases} e_{\text{PTL}} = M_{\text{PTL2}} \ln p + e_{\text{P}} \\ q = M_{\text{PTL1}} \exp \frac{e_{\text{PTL}} - e_{\text{P}}}{M_{\text{PTL2}}} \end{cases}$$
(11)

The test results take into account the dilatancy characteristics for the establishment of the state boundary surface, so the state boundary surface is quite different from that of remodelled clay proposed by Roscoe [1]. The state boundary surface describes the unique relationship among the stress state, strength and void ratio of aeolian sand. The spatial critical state line and phase transformation line shown in Figure 14 and their descriptive Equations (9) and (10) can better describe and predict the quantitative relationship between stress state characteristics and volume state characteristics in the three-dimensional space.

# 4. Conclusions

In this paper, the state boundary surface and deformation and failure characteristics of aeolian sand in the Tengger Desert, China are studied through a series of drained and undrained triaxial tests. The following conclusions can be drawn from this study:

- (1) The generalized peak shear stress of aeolian sand increases linearly with the increase of effective confining pressure under drained and undrained conditions; the undrained strength is greater than the drained strength at low effective confining pressure, and the strength is close to the same with the increase of effective confining pressure. The peak friction angle decreases nonlinearly with the increase of effective confining pressure. The peak friction angle of the two test conditions is quite different at low effective confining pressure and is close to the same at high effective confining pressure.
- (2) At low and medium effective confining pressures, the dilatancy is obvious. With the increase of effective confining pressures, the dilatancy develops to contraction. At high effective confining pressures, it only contracts. The development of pore pressure under undrained conditions also reflects a similar law.
- (3) The medium-density specimen of aeolian sand obtained by the multiple sieving pluviation method has strong initial anisotropy. With the increase of effective confining pressure, the effect of initial anisotropy gradually weakens. While the effective confining pressure is 800 kPa, the initial anisotropy has almost no effect on the deformation characteristics. The initial anisotropy characteristics of the undrained test are not obvious, and the relationships between axial strain and radial strain always satisfy the relationship  $\varepsilon_1 = -2\varepsilon_3$ .
- (4) The three-dimensional state boundary surface of aeolian sand considering dilatancy is quite different from that of remoulded clay. The study of the state boundary surface and the determination of critical state line and phase transformation line equations in three-dimensional space describe the unique state relationship formed by the generalized normal stress, shear stress and void ratio accurately, which can predict the quantitative relationship between stress state and volumetric state reasonably. The state boundary parameters can provide the basis for the establishment of the constitutive model of aeolian sand and provide basic test support for the geotechnical design, construction and maintenance of foundations, roadbeds and another foundation engineering in desert areas.

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Article



# Performance Assessment of Existing Asphalt Pavement in China's Highway Reconstruction and Expansion Project Based on Coupling Weighting Method and Cloud Model Theory

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Abstract: In China, a substantial portion of highway asphalt pavements are no longer capable of accommodating increasing traffic volumes and necessitate renovation and expansion. Prior to commencing such activities, it is crucial to evaluate the performance of the existing asphalt pavements. This study developed a novel normal cloud framework integrating a comprehensive weighted indicator system for existing asphalt pavement. Five key performance indicators including riding quality index (RQI), rutting area ratio (Rr), cracking area ratio (Cr), patching area ratio (Pr), and pavement structural strength index (PSSI) were selected to holistically represent the pavement condition in highway renovation and expansion projects. Subsequently, a method was proposed to determine the weights of these indicators by integrating the analytic hierarchy process (AHP) and entropy. A normal cloud model was constructed to address data characteristics and representation of indicator fuzziness/randomness through digital cloud modeling. The model was applied to 12 sections of the Jingjintang Expressway (Tianjin section). The results revealed only one section where the normal cloud model differed from the pavement maintenance quality assessment (PQI) model. The 3D ground-penetrating radar detection results of this different section indicated that the normal cloud model more closely aligned with the road structure condition. Compared to absolute pass/fail criteria of the traditional PQI model, the cloud model offered enhanced sensitivity to define graded condition assessments essential for reconstruction planning and decision analysis. Therefore, the normal cloud model is more suitable for assessing the performance of existing asphalt pavements in highway reconstruction and extension projects compared to the PQI model.

Keywords: road engineering; pavement performance; evaluation; weights; normal cloud model

# 1. Introduction

With rapid economic development and the increase in traffic volumes in China, many early-built highways now require renovation and expansion due to deteriorating pavement conditions [1,2]. Highway reconstruction aims to improve transportation efficiency, stimulate economic growth, and enhance quality of life for residents. However, current standards for assessing asphalt pavement performance in China, i.e., the Highway Performance Assessment Standards (JTG 5210-2018), are insufficient to guide reconstruction works [3]. Therefore, developing a performance assessment indicator system and evaluation models for existing asphalt pavements is imperative in highway renovation and expansion projects.

Numerous studies have explored indicator systems and models for assessing existing asphalt pavement in highway renovation and expansion projects in China. Xiong et al. [4] employed non-destructive testing (NDT) systems to establish a decision-making framework for pavement maintenance in renovation and expansion projects. Li et al. [5] utilized artificial field surveys, ground-penetrating radar (GPR), and a falling-weight deflectometer

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**Copyright:** © 2024 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). (FWD) to inspect existing asphalt pavements in highway reconstruction and expansion projects, subsequently developing a corresponding decision-making framework. While these are pioneering detection methods, the main challenge lies in comprehensive analysis and utilization of inspection results. The rapid progress of computer technology has offered a plethora of valuable tools for conducting comprehensive pavement performance evaluations. Notably, fuzzy mathematics [6], grey theory [7], neural networks [8], entropy theory [9,10], and support vector machines [11], among others, were initially applied for the comprehensive evaluation of pavement performance. However, there are still several key issues that require further discussion concerning the proper application of these tools in road surface evaluation [12–15].

Li Deyi, an academician from the Chinese Academy of Engineering, proposed the cloud model theory based on fuzzy mathematics and statistical mathematics to realize the mapping and conversion between uncertain linguistic values and accurate values, better describing the randomness, fuzziness, and relevance of variables [16]. Since their inception, cloud models have achieved success across diverse fields through natural language processing, data mining, decision analysis, and intelligent control [17–19]. Fu [17] and Yang et al. [20] reviewed the generality and flexibility of cloud models in dealing with complex problems and multi-indicator system problems. Cloud models have been preliminarily applied in pavement performance assessment. Xiao and Fan [21] analyzed the fuzziness, randomness, and discreteness in the process of pavement condition evaluation, established a pavement condition evaluation model based on the comprehensive weight and cloud model, and verified the model's correctness through engineering applications. Wei et al. [22] established an entropy weight-cloud model for evaluating pavement performance and compared the calculated results of the model with those of the matter element model, confirming the feasibility of the model. He et al. [23] combined the gray level co-occurrence matrix (GLCM) algorithm and the cloud model theory to construct a damage identification and evaluation model for pavements. However, applications of cloud models in evaluating pavement performance remain limited. Moreover, existing studies neglect reconstruction project particulars by not discussing indicator systems tailored for such work.

This study established an evaluation model based on a comprehensive weighting method and the normal cloud model theory for assessing the performance of existing asphalt pavement in highway renovation and expansion projects, taking into account the fuzziness and randomness inherent in the assessment. The application of the normal cloud model in the performance evaluation of existing asphalt pavement for highway renovation and expansion projects necessitated addressing the following two issues:

- (1) A rational performance assessment indicator system.
- Determination of the weights for the evaluation indicators.

Based on a synthesis of existing research results, and expert experience, this study selected five key indicators to construct a performance assessment indicator system for existing asphalt pavement in highway reconstruction and expansion projects. These five indicators were the riding quality index (RQI), rutting area ratio ( $R_r$ ), cracking area ratio ( $C_r$ ), patching area ratio ( $P_r$ ), and the pavement structural strength index (PSSI). The weights of the evaluation indicators were determined through the analytic hierarchy process (AHP) and entropy. Furthermore, the existing asphalt pavement performance assessment model was established based on the AHP–entropy and normal cloud model. Finally, the feasibility of the method was verified using the detection data from the renovation and expansion project of the Jingjintang Expressway (Tianjin section).

Specifically, this study made the following contributions: It selected indicators suitable for evaluating the performance of existing asphalt pavement in highway renovation and expansion projects and obtained the weights of the indicators through subjective and objective weighting methods. A normal cloud model for evaluating the existing asphalt pavement in highway renovation and expansion projects was established, and the correctness of the model was verified through engineering applications. The applicability of the model for existing asphalt pavement in highway renovation and expansion projects was demonstrated with high confidence when compared with the PQI evaluation results.

#### 2. Comparative Analysis of Old Pavement Evaluation Models

The oldest worldwide model for assessing asphalt pavement performance is the present serviceability index (PSI) established by the American Association of State Highway Officials (AASHO) in the 1960s [24]. The introduction of the PSI marked a significant milestone in the road management sector. The AASHO established threshold indicators for road surface condition, with a PSI of 2.5 for primary roads and 2.0 for secondary roads. If the PSI fell below the specified threshold, remedial technical measures should be considered for maintenance. Subsequently, many countries adopted PSI variations tailored to their contexts, including the ride comfort index (RCI) in Canada, the maintenance condition index (MCI) in Japan, and the pavement quality index (PQI) model in China [25].

While pioneering, these early models primarily relied on limited regression analysis and contemporary expert knowledge, which presents issues when evaluating aged pavements in reconstruction projects. Firstly, evaluation data itself demonstrates randomness, complexity, and fuzziness characteristics difficult to fully capture through single-factor regression. This can induce discrepancies between modeled and actual relationships between factors and outputs. Secondly, the models were mainly developed for maintenance and repair rather than reconstruction, requiring investigation into their suitability given reconstruction's unique demands.

Notably, the widely used PQI model in China incorporates indices like overall cracking, rutting, depression, and others [24]. However, related research shows cracks and ruts, respectively, account for over 60% and 30% of pavement distress on Chinese highways [23]. The PQI model does not sufficiently prioritize these predominant failure modes. Furthermore, the PQI calculation equally weights all indices, which may not optimally guide decisions if a particular problem drastically worsens. Fixed weights cannot flexibly reflect actual priorities and importance levels for reconstruction projects.

In summary, while pioneering works, conventional models exhibit several shortcomings limiting applicability to aged pavement performance appraisal for major reconstruction projects. A new approach considering data characteristics and project requirements is warranted to scientifically guide engineering decision-making. The proposed normal cloud framework addresses the abovementioned issues by enabling holistic representation of indicators, weights, and condition fuzziness.

# 3. Construction of Performance Assessment Indicator System for Existing Asphalt Pavement in Highway Renovation and Expansion Project

The current assessment of asphalt pavement performance in China primarily relies on the PQI evaluation model, with the calculation formula of this model shown in Equation (1).

# $PQI = w_{PCI}PCI + w_{RQI}RQI + w_{RDI}RDI + w_{PBI}PBI + w_{PWI}PWI + w_{SRI}SRI + w_{PSSI}PSSI (1)$

where PQI, PCI, RQI, RDI, PBI, PWI, SRI, and PSSI, respectively, represent the pavement maintenance quality index, pavement surface condition index, riding quality index, pavement rut depth, pavement bumpiness index, pavement wear index, pavement surface skid resistance index, and pavement structural strength index;  $w_{PCI}$ ,  $w_{RQI}$ ,  $w_{RDI}$ ,  $w_{SRI}$ ,  $w_{PBI}$ ,  $w_{PWI}$ , and  $w_{PSSI}$ , respectively, represent the weights of PCI, RQI, RDI, PQI, SRI, PBI, PWI, and PSSI in the PQI model; and  $w_{PSSI}$  takes a value of 0.

According to Equation (1), the PQI model incorporates elements such as surface condition, riding quality, skid resistance, rutting, etc. However, further discussion is needed on the following aspects to evaluate the performance of existing asphalt pavement in highway renovation and expansion projects:

 PSSI is not factored into the PQI calculation, rendering the model unable to reflect the pavement's structural condition.

- (2) Indicators such as PBI, PWI, and SRI, which are associated with pavement safety, are seldom considered in the pavement design of highway renovation and expansion projects, leading to redundant indicators.
- (3) The weights assigned to these indicators are fixed, resulting in a lower PQI evaluation when a particular indicator deteriorates, which may not effectively guide decision-making in the design of the asphalt pavement for highway renovation and expansion projects.

The primary objective of assessing asphalt pavement performance in highway renovation and expansion projects is to gauge the condition of existing asphalt pavement. Thus, when establishing a performance assessment indicator system for existing asphalt pavement in highway renovation and expansion projects, it is crucial to highlight common issues and accurately reflect the pavement's load-bearing capacity. Based on the aforementioned considerations, it is evident that there is a need to develop a new performance assessment indicator system for existing asphalt pavement in highway renovation and expansion projects. Drawing from existing literature [26–28], five asphalt pavement performance evaluation indicators were selected, including RQI, R<sub>r</sub>, C<sub>r</sub>, P<sub>r</sub>, and PSSI, to construct a comprehensive performance assessment indicator system for existing asphalt pavement in highway renovation and expansion projects. These five indicators provide a holistic view of pavement performance across various dimensions, as illustrated in Figure 1.



Figure 1. Performance assessment indicator system of existing asphalt pavement in renovation and expansion projects.

The calculation methods for RQI and PSSI are based on the Chinese standard (JTG 5210-2018) [3]. The calculation methods for  $R_r$ ,  $C_r$ , and  $P_r$  are presented in Equations (2)–(4), respectively.

$$R_{\rm r} = \frac{A_{\rm R}}{A} \times 100\% \tag{2}$$

$$C_{\rm r} = \frac{A_{\rm C}}{A} \times 100\% \tag{3}$$

$$P_r = \frac{A_P}{A} \times 100\% \tag{4}$$

where  $A_R$  represents the pavement surface area with a rutting depth greater than 7 mm, calculated by multiplying the rutting length (m) by 0.4 m;  $A_C$  denotes the crack area, encompassing alligator cracking, block cracking, transverse cracks, and longitudinal cracks, and the area is determined according to the standard JTG 5210-2018 [3];  $A_P$  signifies the patching area; and A represents the survey area.

# 4. Evaluation Model Based on AH-Entropy and Normal Cloud Model

# 4.1. Cloud Model-Related Theories

Academician Li Deyi [29] introduced the theory of the cloud model in 1995. The cloud model serves as a framework for converting qualitative concepts into quantitative data, with the cloud digital features and cloud generator playing pivotal roles in its theoretical application. The cloud generator facilitates the bidirectional transformation between qualitative concepts and quantitative data.

# 4.1.1. Definition of Normal Cloud Model

**Definition 1.** Consider U as the universe of discourse, and let C be a qualitative concept in U. If  $x \in U$  is a random instantiation of concept C, where x follows a distribution  $x \sim N(Ex, En'^2)$ ,  $En' \sim N(En, He^2)$ , then the degree of certainty that x belongs to concept C is satisfied by:

$$\mu(x) = \exp\left\{-\frac{(x - Ex)^2}{2Ex'^2}\right\}$$
(5)

The distribution of x within the universe U is referred to as a normal cloud or a second-order normal cloud.

From Definition 1, it is evident that the normal cloud model can capture not only the fuzziness of concepts through membership functions u(x) but also the randomness associated with these membership functions u(x). This highlights a key distinction between the normal cloud model and type-2 fuzzy sets: the normal cloud model is capable of characterizing both the fuzziness of uncertain concepts and their inherent randomness.

#### 4.1.2. Digital Features of Normal Cloud Model

According to the definition in Section 4.1.1, the normal cloud model encompasses three numerical features: *Ex*, *En*, and *He*. Among these, *Ex* represents the expectation, *En* denotes the entropy, and *He* signifies the entropy of entropy, known as hyper entropy. A degenerate cloud drops into a normal distribution when Ex = 0. If Ex = 0 and En = 0, then x = Ex and  $\mu(x) = 1$ . A larger *He* indicates a heavier tail in the distribution of the random variable *x*. *Ex* serves as the central value of the cloud droplet distribution in the domain space, representing the qualitative concepts most accurately. *En* measures the uncertainty of qualitative concepts, determined by the randomness and fuzziness of the concept. It not only reflects the probability degree of cloud droplets but also mirrors the fuzziness of qualitative concepts. Hyper entropy *He* is an uncertainty measure of entropy *En*, determined by the randomness and fuzziness of entropy, primarily reflecting the aggregation of uncertainty in qualitative concepts [30]. The cloud image comprises a specific number of cloud droplets, as shown in Figure 2. In this study, the number of cloud droplets is set at 3000, determined through a comparison of cloud images composed of varying numbers of cloud droplets.

#### 4.1.3. Positive Cloud Generator

The generator is a specific algorithm employed to convert qualitative concepts and quantitative data in cloud models, with two types: positive cloud generator and backward cloud generator. The positive cloud generator facilitates the transformation from qualitative concepts to quantitative values. The cloud is generated from the cloud parameters (*Ex*, *En*, and *He*), as shown in Figure 3.

Utilizing the cloud drops generated by the positive generator of the cloud model, a normal cloud model for pavement condition evaluation can be established through the following main steps:

Step 1: Obtain the digital feature entropy Ex and hyper entropy He of the cloud model based on the measured data of pavement condition evaluation indicators.

Step 2: Generate a normal random number En' using statistical methods based on the obtained digital features of the cloud model,  $En' \sim N(Ex, He^2)$ .

Step 3: Calculate the uncertainty value  $\mu(x) = \exp\left\{-\frac{(x-Ex)^2}{2Ex'^2}\right\}$  based on the generated normal random number En' to generate a cloud drop  $(x,\mu)$ .

Step 4: Repeat the aforementioned three steps until u cloud drops are

Step 4: Repeat the aforementioned three steps until n cloud drops are generated, and the normal cloud model is depicted by the cloud drops.



**Figure 2.** The cloud image (in the figure, Ex = 50, En = 10, He = 1).



Figure 3. Positive cloud generator.

### 4.2. Determination of Combination Weights

Prior to employing cloud models to assess pavement performance conditions, it is crucial to determine appropriate indicator weights. Weighting methods encompass subjective, objective, and comprehensive approaches. Subjective methods include the AHP [31], the Delphi method [32], and the scoring method [33], among others. Objective methods comprise the entropy method [34], CRITIC method [35], and principal component analysis (PCA) [36], among others. Subjective methods can reasonably establish weights, ensuring alignment with actual importance; however, they may lack objectivity. Objective methods offer clarity in the calculation process and objective weighting but may fail to capture evaluators' varying degrees of importance placed on different indicators, potentially leading to disparities between attribute weights and actual importance. Upon reviewing existing research findings, the AHP method was selected for subjective weighting, entropy weighting for objective weighting, and a combination of both methods to derive comprehensive weights.

### 4.2.1. Deriving Subjective Weights with AHP

The calculation procedure of AHP [37] is outlined as follows:

Step 1: Invite experts to conduct pairwise comparisons of the performance evaluation indicators of the current asphalt pavement in highway renovation and expansion projects, assigning scores based on their relative importance. The specific scores and corresponding scale meanings are detailed in Table 1.

Intensity of Importance	Definition	Explanation
1	Equal Importance	Two indicators contribute equally to the objective
3	Moderate importance	Experience and judgement slightly favor one indicator over another
5	Strong importance	Experience and judgement strongly favor one indicator over another
7	Very strong or demonstrated importance	An indicator is favored very strongly over another; its dominance is demonstrated in practice
9	Extreme importance	The evidence favoring one indicator over another is of the highest possible order of affirmation
2, 4, 6, 8	The median value of the above judgment	—
Reciprocals of above	If indicator <i>i</i> has one of the above non-zero numbers assigned to it when compared with indicator <i>j</i> , then <i>j</i> has the reciprocal value when compared with <i>i</i>	_

Table 1. Fundamental scale of absolute numbers.

Step 2: Construct a judgment matrix based on expert scoring. Assuming there are *n* evaluation indicators, the judgment matrix  $A = (a_{ij})_{n \times n}$  is as follows:

$$A = \begin{bmatrix} a_{11} & a_{12} & \dots & a_{n1} \\ a_{11} & a_{22} & \dots & a_{n2} \\ \dots & \dots & \dots & \dots \\ a_{n1} & a_{n2} & \dots & a_{nm} \end{bmatrix}$$
(6)

where the element  $a_{ij}$  of the judgment matrix is determined from Table 1 based on expert opinions.

Step 3: Compute the maximum eigenvalue  $\lambda_{max}$  of matrix *A* according to Equation (7) and derive the weight matrix *W* accordingly:

$$\lambda_{\max} = \sum_{i=1}^{n} \frac{(AW)}{nW_i} = \frac{1}{n} \sum_{i=1}^{n} \frac{(AW)_i}{W_i}$$
(7)

where:

$$AW = \begin{bmatrix} (AW)_1 \\ (AW)_2 \\ \cdots \\ (AW)_n \end{bmatrix} = \begin{bmatrix} a_{11} & a_{12} & \cdots & a_{1n} \\ a_{21} & a_{22} & \cdots & a_{2n} \\ \cdots & \cdots & \cdots & \cdots \\ a_{n1} & a_{n2} & \cdots & a_{nm} \end{bmatrix} \times \begin{bmatrix} \omega_1 \\ \omega_2 \\ \cdots \\ \omega_4 \end{bmatrix}$$
(8)

Step 4: Consistency verification. This study employed a composite indicator CI for assessing consistency.

# 4.2.2. Deriving Objective Weights with Entropy

In information theory, the definition of information entropy is as follows:

$$H(x) = -\sum_{i} p(x_i) \ln p(x_i)$$
(9)

where, *x* represents a random variable, and p(x) represents the output probability function,  $p(x_i) \in [0, 1], \sum p(x_i) = 1$ .

According to Equation (9), a higher variability of the variable corresponds to a greater entropy, signifying that is carries a larger amount of information. Information entropy primarily indicates the extent of variation in indicators. A high entropy for a specific evaluation indicator suggests that the indicator provides more information in the comprehensive evaluation, resulting in a higher corresponding weight. Conversely, a lower weight is assigned. In cases where the evaluation values of an indicator are identical, it conveys no information and is assigned a weight of 0 in the comprehensive evaluation. The weight calculation process for the entropy method is detailed as follows [34,38]:

Step 1: Construct the original matrix. Assuming the number of evaluation indicators is *n* and the number of evaluation objects is *m*, an original matrix  $B = (b_{ij})_{m \times n}$  can be constructed as follows:

$$B = \begin{bmatrix} b_{11} & b_{12} & \dots & b_{1n} \\ b_{21} & b_{22} & \dots & b_{2n} \\ \dots & \dots & \dots & \dots \\ b_{m1} & b_{m2} & \dots & b_{mn} \end{bmatrix}$$
(10)

where  $b_{ij}$  represents the *j*th indicator detection result of the *i*th evaluation object.

Step 2: The indices  $B_{ij}$  are normalized. The positive indicator is calculated as follows:

$$b'_{ij} = \frac{b_{ij} - \min\{b_{ij}, \dots, b_{nj}\}}{\max\{b_{1j}, \dots, b_{nj}\} - \min\{b_{ij}, \dots, b_{nj}\}}$$
(11)

The negative indicator is calculated as follows:

$$b'_{ij} = \frac{\min\{b_{ij}, \dots, b_{nj}\} - b_{ij}}{\max\{b_{1j}, \dots, b_{nj}\} - \min\{b_{ij}, \dots, b_{nj}\}}$$
(12)

Step 3: Determining the proportion of evaluation indicators in the scheme is achieved as follows:

$$p_{ij} = \frac{b'_{ij}}{\sum\limits_{i=1}^{m} b'_{ij}}, i = 1, 2, \dots, m; j = 1, 2, \dots, n$$
(13)

Step 4: Calculate entropy. The computation of entropy for the evaluation indicators is as follows:

$$H_j = -k \sum_{i=1}^m p_{ij} \ln p_{ij}, j = 1, 2, \dots, n, k = \frac{1}{\ln m}$$
(14)

where  $H_j$  is the entropy of the *j*th indicator. If  $p_{ij} = 0$ , then  $p_{ij} \ln p_{ij} = 0$ , while ensuring  $H_j \in [0, 1]$ .

Step 5: Calculate entropy weights. The calculation of the entropy weights for the evaluation indicators is as follows:

$$\omega_j = \frac{1 - H_j}{n - \sum\limits_{i=1}^n H_j}, j = 1, 2, \dots, n$$
(15)

where  $w_j$  is the entropy weight of the *j*th indicator,  $w_j \in [0, 1]$ ,  $\sum_{j=1}^{n} \omega_j = 1$ .

# 4.2.3. Determination of Comprehensive Weights

The formula for calculating the comprehensive weight is as follows [39]:

$$\omega_i = \frac{\omega 1_i \omega 2_i}{\sum\limits_{i=1}^n \omega 1_i \omega 2_i}$$
(16)

where  $w_i$  is the combination weight, and  $w_1$  and  $w_2$  are the weights calculated by the AHP and entropy method, respectively.

# 4.3. Performance Ratings of Evaluation Indicators for Existing Asphalt Pavement in Highway Renovation and Expansion Projects

The PQI model and its sub-indicators categorize the performance of asphalt pavement into five classifications: excellent, good, average, poor, and failed. This study adopted the PQI level classification approach and also categorized the five evaluation indicators of existing asphalt pavement in highway renovation and expansion projects—namely, RQI, R<sub>r</sub>, C<sub>r</sub>, P<sub>r</sub>, and PSSI—into the same five categories: excellent, good, average, poor, and failed. While the performance ratings for RQI and PSSI can be determined using the Chinese standard JTG 5210-2018 [3], there are currently no relevant references for R<sub>r</sub>, C<sub>r</sub>, and P<sub>r</sub>. This study established the performance ratings of R<sub>r</sub>, C<sub>r</sub>, and P<sub>r</sub>. The specific performance ratings of evaluation indicators are shown in Table 2.

**Table 2.** Performance ratings of evaluation indicators for the existing asphalt pavement in highway renovation and expansion project.

Performance Rating	RQI	R <sub>r</sub>	Cr	Pr	PSSI
Excellent	≥90, <100	≥0, <1	$\geq 0, \leq 0.5$	$\geq 0, \leq 5$	≥90, <100
Good	≥80, <90	≥1,<5	>0.5, ≤3.5	>5, ≤10	≥80,<90
Average	≥70, <80	≥5, <10	>3.5, ≤10	>10, ≤20	≥70,<80
Poor	≥60, <70	≥10, <25	>10, ≤25	>20, ≤50	≥60,<70
Failed	≥0, <60	≥25, <50	>25, ≤50	>50, ≤80	$\geq 0, <60$

#### 4.4. Calculation of Digital Features for Normal Cloud Model

The digital features of the normal cloud model for evaluating the performance condition of existing asphalt pavement in highway renovation and expansion projects can be calculated according to Equations (17)–(19):

$$Ex = (c_{ij}^1 + c_{ij}^2)/2$$
(17)

$$En = (c_{ij}^1 - c_{ij}^2)/2.335$$
(18)

$$He = k \tag{19}$$

where *Ex* is the expectation; *En* is the entropy; and *He* is the entropy of entropy;  $c_{ij}^1$  and  $c_{ij}^2$  are the upper and lower limits of the corresponding performance ratings for each evaluation indicator; and *k* is a constant that can be adjusted according to the degree of ambiguity of the actual problem. The value of *k* in this study uniformly takes 0.1.

The normal cloud model for evaluating the performance condition of existing asphalt pavement in highway renovation and expansion projects is constructed using the positive generator. The calculation procedure for the positive generator is detailed in Section 4.1.3. This study adopted a value of n = 3000.

#### 4.5. Calculation of Membership Degree for Normal Cloud Model

Based on the normal cloud model in Section 4.4, the membership degree  $\mu(x)$  of each evaluation indicator at different performance levels can be calculated. Utilizing Equation

(20), the comprehensive membership degree of the performance evaluation of existing asphalt pavement in highway renovation and expansion projects is determined.

$$F = \sum_{i=1}^{n} u(x_{ij})\omega_i, i = 1, 2, \dots, n$$
(20)

where *F* is the comprehensive membership degree of the performance ratings,  $u(x_{ij})$  is the membership degree of the *i*th indicator at the *j*th evaluation level, and  $w_i$  is the comprehensive weight of the *i*th indicator.

The performance level *S* for the existing asphalt pavement in highway renovation and expansion projects is determined based on the principle of maximum membership degree.

$$S = \max(F_1, F_2, \dots, F_n) \tag{21}$$

#### 4.6. Flow of Evaluation System for Combination Weighting and Normal Cloud Model

The construction process of the evaluation model for existing asphalt pavement in highway renovation and expansion projects, based on AHP–entropy and the normal cloud model, is as follows:

- (1) Determination of the comprehensive weight of evaluation indicators.
- (2) Determination of performance ratings for the indicators.
- (3) Calculation of the comprehensive certainty degree of the normal cloud.
- (4) Determination of the performance rating for existing asphalt pavement.

The flow of the evaluation system for combination weighting and the normal cloud model is shown in Figure 4.



Figure 4. Flow chart of evaluation system for combination weighting and normal cloud model.

# 5. Case Study

# 5.1. Engineering Background

The application project for this model is the renovation and expansion project of the Jingjintang Expressway (Tianjin section). The Jingjintang Expressway, approved as the first expressway by the State Council for construction and the first cross-provincial expressway in China, was fully completed and opened to traffic in September 1993, and has been in operation for nearly 30 years. The Tianjin Municipal Transportation Commission approved the application report for the renovation and expansion project of the Jingjintang Expressway (Tianjin section) on 29 December 2022, signifying the official commencement of the project's implementation phase. However, before the implementation of the renovation and expansion project, it is essential to analyze and evaluate the current performance of the existing pavement, and then systematically formulate the utilization strategy for the existing pavement structure. Against this backdrop, this study selected sections K67 to K70 to conduct pavement performance inspections and verified this model based on the inspection data. The results for RQI,  $R_r$ ,  $C_r$ ,  $P_r$ , and PSSI are shown in Table 3. The measurement and calculation methods of RQI and PSSI are in accordance with Chinese standard (JTG 5210-2018) [3], while the calculation methods for  $R_r$ ,  $C_r$ , and  $P_r$  are based on Equations (2)–(4).

Table 3. Inspection data of sections K67 to K70.

Number	Stake	Direction	Lane	RQI	R <sub>r</sub>	Cr	Pr	PSSI
1	K67–K68	Forward	Light traffic	93.71	0.832	0.311	0.234	99.95
2	K68–K69	Forward	Light traffic	93.06	0.876	0.286	0.167	99.94
3	K69–K70	Forward	Light traffic	93.74	0.756	0.437	0.209	99.99
4	K67–K68	Forward	Heavy traffic	94.01	0.955	0.799	0.289	99.98
5	K68–K69	Forward	Heavy traffic	94.12	0.917	0.741	0.197	99.92
6	K69–K70	Forward	Heavy traffic	94.29	0.866	0.568	0.213	99.98
7	K67–K68	Reverse	Light traffic	94.80	0.452	0.149	0.251	99.73
8	K68–K69	Reverse	Light traffic	94.92	0.291	0.046	0.255	99.82
9	K69–K70	Reverse	Light traffic	95.23	0.856	0.144	0.324	99.81
10	K67–K68	Reverse	Heavy traffic	92.81	0.398	0.091	0.195	99.66
11	K68–K69	Reverse	Heavy traffic	94.50	0.321	0.052	0.312	99.88
12	K69-K70	Reverse	Heavy traffic	93.82	1.672	0.471	0.364	99.89

### 5.2. Evaluation Results of PQI Model

The PQI model, currently the primary pavement performance evaluation approach in China, was applied to the inspection data from section K67 to K70. Table 4 presents the PQI evaluation results. The PQI rating of the forward heavy traffic lane in sections K67 to K68 and K68 to K69 was good, while the rest of the sections were rated as excellent. Overall, the PQI rating of section K67 to K70 is excellent. Among the various sub-indicators, the PBI and PCI indicators are slightly lower, whereas the RQI, PBI, SRI, and PSSI indicators are better.

Table 4. Evaluation results of the PQI evaluation model.

			×	Sub-Indicators							Performance
Number Stake	Stake	Direction	Lane	PCI	RQI	RDI	PBI	SRI	PSSI	PQI	Rating
1	K67–K68	Forward	Light traffic	87.67	93.71	94.28	100.00	94.74	99.95	92.41	Excellent
2	K68-K69	Forward	Light traffic	88.08	93.06	92.97	100.00	93.88	99.94	92.08	Excellent
3	K69–K70	Forward	Light traffic	85.81	93.74	93.87	100.00	92.46	99.99	91.48	Excellent
4	K67–K68	Forward	Heavy traffic	81.82	94.01	89.67	100.00	96.35	99.98	89.93	Good
5	K68-K69	Forward	Heavy traffic	81.73	94.12	89.71	100.00	96.65	99.92	89.95	Good

				Sub-Indicators						POI	Performance
Number St	Stake	Direction	Lane	PCI	RQI	RDI	PBI	SRI	PSSI	rQI	Rating
6	K69-K70	Forward	Heavy traffic	82.49	94.29	91.16	100.00	96.27	99.98	90.46	Excellent
7	K67–K68	Reverse	Light traffic	90.90	94.80	97.41	100.00	96.18	99.73	94.48	Excellent
8	K68-K69	Reverse	Light traffic	92.58	94.92	97.65	100.00	95.65	99.82	95.09	Excellent
9	K69–K70	Reverse	Light traffic	93.96	95.23	98.00	100.00	94.76	99.88	95.63	Excellent
10	K67–K68	Reverse	Heavy traffic	90.18	92.81	95.09	75.00	95.93	99.66	90.76	Excellent
11	K68–K69	Reverse	Heavy traffic	91.16	94.50	94.09	100.00	97.57	99.81	94.13	Excellent
12	K69–K70	Reverse	Heavy traffic	85.50	93.82	95.91	100.00	95.11	99.89	91.97	Excellent

Table 4. Cont.

The measurement and calculation methods of PCI, RDI, PBI, and SRI are in accordance with Chinese standard (JTG 5210-2018) [3]. Among sub-indicators, PCI and PBI values were slightly lower, while RQI, PWI, SRI, and PSSI performed better. PCI reflects surface distresses like cracking and rutting that predominantly impact Chinese highways [23]. The relatively lower PCI scores, thus, provide useful insight regarding pavement distress conditions. However, the PQI model assigns all sub-indicators equal weighting regardless of predominant distresses or reconstruction priorities.

#### 5.3. Evaluation Results of Normal Cloud Model

Based on the calculation steps outlined in Section 4 and the data presented in Table 3, the calculation results of the combination weighting-normal cloud model can be derived, as illustrated in Table 5. Membership degrees at each performance level ("Excellent", "Good", etc.) were calculated using Equation (20) to determine comprehensive membership values.

	Members	hip Degree of	Normal				
Number	Excellent	Good	Average	Poor	Failed	Cloud	PQI Model
1	0.798	0.374	0.042	0.028	0.002	Excellent	Excellent
2	0.815	0.373	0.041	0.028	0.077	Excellent	Excellent
3	0.646	0.399	0.047	0.029	0.002	Excellent	Excellent
4	0.275	0.519	0.062	0.032	0.004	Good	Good
5	0.307	0.500	0.059	0.031	0.002	Good	Good
6	0.449	0.445	0.052	0.030	0.002	Excellent	Excellent
7	0.970	0.254	0.009	0.020	0.001	Excellent	Excellent
8	0.640	0.265	0.033	0.024	0.002	Excellent	Excellent
9	0.734	0.334	0.037	0.027	0.002	Excellent	Excellent
10	0.726	0.283	0.034	0.025	0.002	Excellent	Excellent
11	0.660	0.269	0.033	0.025	0.002	Excellent	Excellent
12	0.093	0.668	0.080	0.037	0.003	Good	Excellent

Table 5. Evaluation results of normal cloud model.

Table 5 shows the membership degrees and resultant model/PQI ratings. Several notable aspects emerged:

- (a) Sections rated "Good" by PQI (forward lanes K67–K68 and K68–K69) exhibited higher membership in the "Good" class using the cloud model (0.519, 0.500).
- (b) Section K69–K70 reverse lane demonstrated higher membership in "Good" (0.668) versus "Excellent" (0.093).

(c) Other sections generally aligned between the two approaches, with membership heavily favoring the identical rating.

These results demonstrate the cloud model's ability to more sensitively represent indicator fuzziness and randomness, generating intermediate membership degrees where conventional methods deliver absolute ratings. This continuous evaluation scale is valuable for reconstruction project planning requiring graded condition assessments.

# 5.4. Results of 3D Radar Detection

To validate the results obtained from the normal cloud model, 3D ground-penetrating radar (GPR) detection was conducted on the reverse heavy traffic lanes of sections K68–K69 and K69–K70. GPR is a well-established nondestructive technique that has seen increasing usage for pavement subsurface investigation to supplement visual condition surveys.

A Malå ProEx 600 MHz shielded antenna system was employed for data collection. This frequency facilitated the necessary 1–1.2 m penetration depth required to evaluate key structural layers like the asphalt–base interface and aggregate base essential for reconstruction decision-making. Continuous profiling was performed at 14 channels spaced 10.5 cm along wheel-paths and between using an integrated positioning console. This configuration ensured collection of high-resolution 3D condition imagery suitable for detailed structural analysis. The 3D radar detection and processing software utilized in this study were provided by Chengdu Guimu Robot Co., Ltd. Chengdu Guimu Robot Co., Ltd. is a supplier of pavement non-destructive testing equipment located in Chengdu, China.

The 3D radar detection results were assessed based on the impact area, with the calculation method for the impact area being the sum of the areas affected by looseness, sub-grade settlement, and cracking. The calculation method for the cracking impact area involved multiplying the cracking length by a width of 0.4 m. All areas represented horizontally projected areas. The data presented in Table 6 were automatically computed using the software provided by Chengdu Guimu Robot Co., Ltd.

Stake	Layer	Looseness (m <sup>2</sup> )	Cracking (m <sup>2</sup> )	Settlement (m <sup>2</sup> )	Total Area (m <sup>2</sup> )
K68–K69	Base layer	1224.6	0.0	/	
	Subbase layer	32.2	46.4	/	1326.0
	Subgrade	0.0	/	22.9	
	Base layer	1667.7	0.0	/	
K69-K70	Subbase layer	10.7	0.0	/	1678.0
	Subgrade	1.5	/	0.0	

Table 6. 3D radar detection results (reverse heavy traffic lane).

Results showed that the reverse heavy traffic lane of section K69–K69 exhibited various types of structural issues, including looseness, cracking, and settlement, whereas there was only one type of issue in the reverse heavy traffic lane of section K69–K70. However, in terms of impact area, the total area affected by internal structural issues in the reverse heavy traffic lane of section K69–K70 was 1678  $m^2$ , while it was 1326  $m^2$  in the reverse heavy traffic lane of section K68–K69. The total area affected by internal issues in the reverse heavy traffic lane of section K68–K69. The total area affected by internal issues in the reverse heavy traffic lane of section K68–K69. Therefore, based on the results of that in the reverse heavy traffic lane of section K68–K69. Therefore, based on the results of the 3D radar detection, the performance rating of the reverse heavy traffic lane in section K68–K69 was better than that of the reverse heavy traffic lane in section K69–K70.

In summary, these subsurface conditions validated the normal cloud model evaluation of the reverse lane in section K69–K70 as "good" versus the PQI assessment of "excellent". GPR objectively verifies increased subsurface impact warranting a lower rating than assigned previously. This reinforces the normal cloud approach's sensitivity in differentiating conditions where conventional methods may overlook subtle deterioration.

# 6. Conclusions

The AHP and entropy methods are utilized to determine subjective and objective weights, respectively, and a combination of these two methods is employed to derive comprehensive weights for evaluating indicators of existing asphalt pavement in highway reconstruction and expansion projects. Building upon the derived indicator weights, a performance assessment model for existing asphalt pavement in highway renovation and expansion projects is established, integrating combination weighting and the normal cloud model. This model is applied and validated in the renovation and expansion project of the Jingjintang Expressway (Tianjin section) highway reconstruction and expansion project. The research findings can be summarized as follows:

- (a) The normal cloud framework addressed limitations of conventional methods by addressing input data characteristics and reconstructing the fuzziness and randomness inherent to pavement evaluation.
- (b) Application to a reconstruction project case study yielded evaluation results demonstrating good consistency with objective 3D GPR detection. The cloud model exhibited an enhanced ability to discern marginal variations in condition and generate continuous membership outputs versus absolute ratings. This improves its utility for reconstruction and extension planning demand of graded condition assessments.

In conclusion, the proposed model establishes an innovative and practical means of appraising existing pavement informed by engineering fundamentals. It provides reconstruction and extension project managements with an effective decision support tool capturing input ambiguities. The cloud theoretic methodology also displays potential for continued refinement and wider pavement management applications

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Abstract: The evaluation of in-service pavements' performance is a complex system that encompasses a variety of uncertain factors. These uncertainties include random, fuzzy, gray, and unascertained information, and their interrelationships are intricate, making comprehensive quantification unachievable. Nonetheless, current highway management organizations rely on a comprehensive indicator, namely, the Pavement Quality Index (PQI), to assess the level of pavement performance. This paper introduces a novel approach that employs blind number theory to evaluate the reliability of pavement performance test data. The proposed method aims to enhance the representativeness of PQI and is demonstrated using detection data from highway asphalt pavements in Hunan Province. The method takes into account the probability distribution characteristics of evaluation metrics and incorporates the blind number representation format of PQI. A confidence model for pavement performance evaluation is established to assess the reliability of pavement detection results. The method also integrates expert empowerment and entropy weight to consider both the subjectivity of evaluation and the objectivity of measured data. The method presented in this study has demonstrated superior performance compared to traditional evaluation index systems. This is attributed to the effective utilization of blind information to accurately characterize the discreteness of pavement performance indexes. Consequently, pavement performance can be quantitatively graded based on anticipated issues and data.

**Keywords:** pavement performance evaluation; reliability study; confidence model; entropy weight method; blind-number theory

### 1. Introduction

In the field of pavement engineering, one crucial aspect that affects the grade of pavement performance is the occurrence of distresses or diseases in asphalt pavements over time [1]. These distresses can manifest in various forms, such as cracks, potholes, rutting, and surface deterioration [2]. The pavement management system (PMS) encompasses a comprehensive range of interconnected activities, including road planning, design, construction, maintenance, evaluation, and research [3]. Its primary objective is to optimize the utilization of various resources such as capital, labor, machinery, materials, and energy [4]. Within the PMS framework, the maintenance management system plays a crucial role. It aims to maximize available resources to maintain optimal pavement performance throughout the entire life cycle [5]. Evaluating the service performance of pavements at different stages of their life cycle is essential to proactively address necessary repairs before they reach critical failure conditions [6]. By implementing maintenance management systems, it becomes possible to reduce maintenance and repair costs while ensuring

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**Copyright:** © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). the safety of transportation networks [7]. The assessment of pavement performance is a key component of maintenance management and directly impacts the quality of highway service [8]. Therefore, accurately evaluating the grade of pavement performance is of paramount importance.

To enhance the objectivity and persuasiveness of the evaluation process, numerous quantitative analysis studies have been conducted to assess pavement performance. Majidifard et al. [9] employed novel machine learning techniques to predict rut depth, thereby enhancing the accuracy of rut curves. Fan and Dai [10] devised a comprehensive pavement performance evaluation method that considers five performance indexes. Olowosulu et al. [11] utilized a fuzzy evaluation method, presenting a novel framework for accurate assessment and analysis of flexible pavement performance. Li et al. [12] proposed an enhanced entropy weight analytic hierarchy process for evaluating pavement maintenance. In recent years, evaluation models have expanded to machine learning models, including the BP neural network [13], NARX neural network [14], and TOPSIS theory [15]. These models employ single or comprehensive evaluation indexes to gain insights into the actual pavement condition, thereby providing a scientific foundation for maintenance decisionmaking schemes and designs [16,17]. However, current research on pavement performance evaluation primarily focuses on single evaluation indexes, with limited consideration given to the weight of individual evaluation indexes, comprehensive evaluation methods, and reliability analysis of comprehensive evaluation indexes.

With the rapid expansion of highway transportation demand in China, there has been significant construction of highway infrastructure, leading to increased research on pavement performance evaluation methods [18]. The Pavement Quality Index (PQI) is a comprehensive indicator that encompasses sub-indexes such as the Pavement Condition Index (PCI), Riding Quality Index (RQI), Rutting Depth Index (RDI), and Skidding Resistance Index (SRI) [19]. These sub-indexes are weighted to derive the comprehensive evaluation index, which provides an overall assessment of pavement condition [20]. In engineering applications, the evaluation of pavement performance often relies on the average value and discrete grade of the performance indexes [21]. The average value approach calculates the mean of the observed data along the entire road section, while the discrete grade approach involves statistical analysis to determine the proportions of excellent, good, fair, poor, and very poor road conditions based on unit pavement performance evaluation results [22]. However, the evaluation method based on the average value tends to compress the information contained in the data, potentially leading to the neglect of important details. Predictions based solely on the average value may result in symmetric dispersion around the average index value, which can misrepresent the actual pavement condition [23]. Moreover, the process of converting continuous unit-kilometer metrics to discrete pavement levels can mask detailed information about pavement performance, further contributing to evaluation inaccuracies [24]. To address these limitations, it is important to consider more advanced evaluation methods that capture the variability and nuances of pavement performance [25]. This may involve incorporating additional factors, such as the weight of individual evaluation indexes, the use conditions of each measuring point, and the reliability analysis of the comprehensive evaluation index [26]. Utilizing more sophisticated techniques can improve the objectivity and accuracy of pavement performance evaluation, providing a solid foundation for maintenance decision-making and design.

In this study, the probability function of each evaluation index parameter is established to gain insights into the probability distribution characteristics of pavement performance evaluation metrics. Fitting tests are conducted to analyze various influencing factors. By utilizing probability distribution methods, it becomes possible to analyze potential indicators per kilometer without losing information due to averaging and discretization of evaluation results [27]. This approach ensures the maximum retention and utilization of all indicator data at the unit kilometer level. However, it is important to note that due to the different distribution forms of variables, a unified equation form cannot be adopted when dealing with each index. Each evaluation index may follow a distinct probability distribution, and therefore, specific distribution functions need to be employed for accurate analysis. Furthermore, pavement performance evaluation often involves uncertain information, including randomness, fuzziness, gray areas, and unascertained factors [28]. Incorporating statistical techniques to handle uncertainty becomes crucial in accurately assessing pavement performance and making informed decisions. By considering the probability distribution characteristics and addressing uncertainties, this study aims to enhance the understanding of pavement performance evaluation and provide a more comprehensive and reliable assessment of the condition of highway pavements.

Therefore, this study presents the concept of blind-number theory and its application in evaluating the performance of pavement surfaces. A reliability framework for the pavement evaluation indicator using blind numbers is proposed. This framework integrates obscured data into the evaluation system, ensuring that it remains unaffected by probability distribution functions. By clearly defining the evaluation grade and its corresponding confidence, the rigor of the evaluation process is enhanced.

### 2. Testing Methods for Pavement Performances

# 2.1. Evaluation Indexes and Data Collection Methods

Accurate assessment of pavement performance is crucial in maintenance management, as it plays a pivotal role in determining the condition of pavements. Various factors such as climate, region, traffic load, and pavement materials contribute to the deterioration of pavements, leading to issues like ruts, cracks, pits, and oil flooding. The Highway Performance Assessment Standard (JTG H20) requires the use of the PQI for evaluating pavement performance in China. The PQI is calculated based on the PCI, RQI, RDI, and SRI, as defined in Equation (1).

$$PQI = w_{PCI}PCI + w_{ROI}RQI + w_{RDI}RDI + w_{SRI}SRI$$
(1)

where  $w_{PQI}$ ,  $w_{RQI}$ ,  $w_{RDI}$ , and  $w_{SRI}$  are the calculated weights of PCI, RQI, RDI, and SRI, respectively.

The data for the test object were collected using a laser-based 3D road intelligent detection vehicle [29]. This vehicle enabled comprehensive coverage of all the pavement performance indexes mentioned in the study. The collection of pavement condition data was carried out on expressways located in plain, hilly, and mountainous terrains of a province in China. These specific sections were carefully chosen to represent a diverse range of engineering geological conditions, variations in traffic load, complexities in pavement structure, and performance characteristics of pavement materials. The outcomes of the investigation provide valuable insights into how different conditions influence the probability distribution of pavement performance evaluation indicators.

## 2.2. Probability Distribution Analyses of Evaluation Indexes

In this study, several probability distributions, including Normal, Log-Logistic, Log-Logistic (3P), Logistic, and Lognormal, were used to analyze the probability distribution characteristics of the evaluation indexes. By employing different probability functions [30], probability distribution characteristics of the pavement performance evaluation indexes were determined.

To validate the appropriateness of the selected probability distributions for the evaluation indexes, fitting tests were conducted using the probability functions. These tests aimed to assess how well the probability distributions fit the observed data for the pavement performance evaluation indicators. Table 1 lists three typical fitting methods of probability results, providing insights into the suitability of the probability distributions for the evaluation indexes.

Туре	Test Method
Kolmogorov-Smirnov Test	$D = \max_{1 \le i \le n} (F(x_i) - \frac{i-1}{n}, \frac{i}{n} - F(x_i))$
Anderson-Darling Goodness Test	$A^{2} = -n - \frac{1}{n} \sum_{i=1}^{n} (2i - 1) \cdot \left[ \ln F(X_{i}) + \ln(1 - F(X_{n-i+1})) \right]$
Chi-Squared Goodness Test	$\chi^2 = \sum_{i=1}^k \frac{(O_i - E_i)^2}{E_i}, E_i = F(x_2) - F(x_1)$

Table 1. Fitting test method of pavement performance evaluation index.

In the context of statistical hypothesis testing,  $H_0$  represents the assumption that the observed data conform to the specified distribution, while  $H_1$  suggests that the data deviate from the specified distribution.

Let  $x_1, ..., x_n$  denote a series of random samples extracted from the theoretical probability density function F(x), with n representing the number of sample sequences. Based on the predetermined significance level (typically 0.05) in the hypothesis test, the critical value is determined by referencing the appropriate table. If the test statistic D exceeds the critical value, the null hypothesis  $H_0$  is rejected; otherwise, it is accepted.

 $F_n(x)$  represents the empirical cumulative probability density function. By comparing the test statistic  $A^2$  with the critical value size of each distribution cluster, it is determined at the given significance level  $\alpha$  (e.g., 0.01, 0.05, etc.) whether to accept or reject the null hypothesis  $H_0$ .

 $O_i$  is the observed frequency of the sample falling in the *i*-th interval, whereas  $E_i$  signifies the expected frequency of the sample falling within the same interval. F(x) denotes the probability density function of the calculated sample, and  $x_1$  and  $x_2$  specify the range of interval *i*.

### 2.3. Analysis Framework Pavement Performance Reliability

# 2.3.1. Principle of Blind-Number Theory

According to the degree of completeness, information can be categorized into two types: deterministic information and uncertain information. Deterministic information refers to information that is known to be complete and certain. On the other hand, uncertain information refers to information that is known to be incomplete and uncertain. Specifically, many factors affect pavement performance, such as pavement structure, traffic volume, pavement and base materials, engineering geological conditions, and environmental factors. All of these influencing factors have uncertainty, and their performance on pavement performance varies.

When dealing with incomplete and uncertain information, mathematical methods are commonly used to process blind information comprehensively. Blind information refers to information that lacks complete knowledge or certainty. To handle blind information, a mathematical tool called a blind number is utilized. A blind number is essentially a gray function that operates on a set of rational gray numbers, with its value varying between 0 and 1.

The study supposes that H(I) represents the set of interval-type gray numbers formed by the gray interval  $a_i$ , where each  $a_i$  belongs to H(I). If  $\alpha_i \in [0, 1]$  for i = 1, 2, ..., n, the gray function in H(I) can be defined as f(x), as shown in Equation (2). If  $i \neq j$ ,  $a_i \neq a_j$ , and  $\sum^n \alpha_i = \alpha \le 1$ , the f(x) should be called a blind number, which can be expressed by Equation (3) [30].

$$f(x) = \begin{cases} \alpha_i, \ x = a_i \ (i = 1, \ 2, \cdots, n) \\ 0, \ other \end{cases}$$
(2)

$$\{[a_1, a_n], f(x)\}\tag{3}$$

where *n* is the order of f(x);  $\alpha_i$  is the confidence of the value  $a_i$  of f(x);  $\alpha$  is the total confidence of f(x). The greater *n*, the greater the accuracy of the blind number f(x).

$$A^{\wedge} = f(x) = \begin{cases} \alpha_i, x = x_i (i = 1, 2, \dots k) \\ 0 \end{cases}$$
(4)

$$B^{\wedge} = g(x) = \begin{cases} \beta_j, x = y_j (i = 1, 2, \dots m) \\ 0 \end{cases}$$
(5)

$x_1$	$x_1 + y_1$	$x_1 + y_2$		$x_1 + y_j$		$x_1 + y_m$
<i>x</i> <sub>2</sub>	$x_2 + y_1$	$x_2 + y_2$		$x_2 + y_j$		$x_2 + y_m$
÷	÷	÷	÷	÷	÷	÷
$x_i$	$x_i + y_1$	$x_i + y_2$		$x_i + y_j$		$x_i + y_m$
÷	•	÷	÷	:	÷	÷
$x_k$	$x_k + y_1$	$x_k + y_2$		$x_k + y_j$		$x_k + y_m$
	$y_1$	<i>y</i> 2		$y_j$		$y_m$

**Table 2.** The possible values of *A*<sup>^</sup> and *B*<sup>^</sup> with edge sum matrix.

Based on the above assumptions, the confidence of the event  $A/B \ge r$ , is shown in Equation (6).

$$P\{A/B \ge r\} = \sum_{x_i - y_j \ge r} f(x_i)g(y_j)$$
(6)

where B can be the classification threshold of a certain evaluation standard, usually a real value; r is a known real number determined according to the requirements of the actual problem.

Construct the confidence matrix with edge product for  $A^{\uparrow}$  and  $B^{\uparrow}$ , where  $f(x_1)$ ,  $f(x_2)$ , ...,  $f(x_k)$  and  $g(y_1)$ ,  $g(y_2)$ , ...,  $g(y_k)$  represent the vertical and horizontal sides of the matrix with an edge, referred to as the confidence sequence of  $A^{\uparrow}$  and  $B^{\uparrow}$ . The horizontal and vertical axes of the matrix with an edge are perpendicular lines. The resulting confidence matrix obtained by performing an edge product on  $A^{\uparrow}$  and  $B^{\uparrow}$  is presented in Table 3.

**Table 3.** The confidence band-edge product matrix of *A*<sup>^</sup> and *B*<sup>^</sup>.

$\begin{array}{ccc} f(x_1) & f\\ f(x_2) & f \end{array}$	$f(x_1)g(y_1)$ $f(x_2)g(y_1)$	$f(x_1)g(y_2) f(x_2)g(y_2)$		$\frac{f(x_1)g(y_i)}{f(x_2)g(y_i)}$		$\frac{f(x_1)g(y_m)}{f(x_2)g(y_m)}$
$\vdots$ $f(x_i)$ f	$\vdots$ $f(x_i)g(y_1)$	$\vdots$ $f(x_i)g(y_2)$	:	$\vdots$ $f(x_i)g(y_i)$	:	$\vdots$ $f(x_i)g(y_m)$
$\vdots$ $f(x_k)$ f	$\vdots \\ f(x_k)g(y_1) \\ g(y_1)$	$\vdots f(x_k)g(y_2)$	:	$\vdots \\ f(x_k)g(y_i) \\ g(y_i)$	:	$ \begin{array}{c} \vdots\\ f(x_k)g(y_m)\\ g(y_m) \end{array} $
	8(91)	8(92)		8(91)		g(gm)

# 2.3.2. Confidence Modeling of Pavement Quality Index

Due to the inherent uncertainty in pavement detection information, all indicators of pavement performance evaluation conform to specific probability distributions. Based on the aforementioned blind number theory, if the PCI, RQI, RDI, and SRI are all considered blind numbers, they can be expressed as follows:

$$PC\hat{I} = \{ [PCI_1, PCI_n], f_1(PCI) \}$$
(7)

$$RQ\hat{I} = \{ [RQI_1, RQI_m], f_2(RQI) \}$$
(8)

$$RDI = \{ [RDI_1, RDI_i], f_3(PCI) \}$$
(9)

$$SR\hat{I} = \left\{ \left[ SRI_1, SRI_j \right], f_4(SRI) \right\}$$
(10)

Therefore, this study uses the blind number representation of the pavement quality index, as shown in Equation (10).

$$PQ\hat{I} = w_{PCI} \otimes PC\hat{I} \oplus w_{ROI} \otimes RQ\hat{I} \oplus w_{RDI} \otimes RD\hat{I} \oplus w_{SRI} \otimes SR\hat{I}$$
(11)

In reliability calculations, the reliability of the representative value is defined as the ratio of the occurrence frequency of a single indicator to the total frequency. The credibility of the representative value can be determined using the traditional probability density function method. In cases where the amount of data is limited, the frequency of data occurrence can also be analyzed. The thresholds for different performance levels in pavement performance evaluation are established: 90 for excellent, 80 for good, 70 for medium, and 60 for bad. According to the blind number theory, the reliability of pavement serviceability for excellent and good grades can be indicated in Equations (12) and (13).

$$R_{PQI}(90) = \frac{1}{90} \otimes PQ\hat{I} \tag{12}$$

$$R_{PQI}(80) = \frac{1}{80} \otimes PQ\hat{I} \tag{13}$$

#### 3. Analysis of Examples

#### 3.1. Statistical Result Analysis

To fulfill the requirements of probability function analysis and fitting tests for pavement performance evaluation metrics, an operational program was developed for analysis and calculation. The statistical results are shown in Table 4. The probability density and fitting analysis results of PCI, RQI, RDI, SRI, and other indicators are presented in Figure 1. The analysis of the results indicated that when comparing PCI, RQI, RDI, and SRI using the Kolmogorov–Smirnov and Anderson–Darling test methods, the Log-Logistic (3P) distribution provided the most suitable fitting results. When using the Chi-Squared method for comparison, the Log-Logistic (3P) distribution yielded the best fitting results for RQI and RDI. The PCI achieved the best result through Logistic fitting method, followed by Log-Logistic (3P) fitting. However, the SRI obtained the best result through Log-Logistic fitting. By comprehensively comparing the calculation results from all three methods, it can be concluded that the probability density distributions of PCI, RQI, RDI, and SRI can be effectively characterized by the Log-Logistic (3P) distribution.


Figure 1. Comparison of probability density of pavement performance indexes and fitting analysis results: (a) PCI; (b) RQI; (c) RDI; (d) SRI.

The cumulative probability density functions of PCI, RQI, RDI, and SRI, as well as the comparison between measured values and fitting values, are presented in Figures 2 and 3. In the case of the PCI, the Log-Logistic (3P) fitting is not effective in the range of [80, 85], meaning that the fitted function does not accurately represent the distribution of the index within this range. However, the fitting becomes stable and reliable in the range of [85, 100], indicating that the fitted function accurately represents the distribution of the PCI within this range. For the RQI, the Log-Logistic (3P) fitting is not effective in the ranges of [82, 87] and [93, 94], suggesting that the fitted function does not accurately represent the distribution of the index within these ranges. However, the fitting becomes stable and reliable in the range of [87, 93], indicating that the fitted function accurately represents the distribution of the RQI within this range. The overall trend of the RDI obtained through Log-Logistic (3P) fitting to the cumulative probability density function is evident. This suggests that the fitted function accurately represents the distribution of the RDI across its entire range. Similarly, the cumulative probability density function of the SRI obtained through Log-Logistic (3P) fitting shows an ideal effect within the range of [84, 92] and is stable and reliable. This indicates that the fitted function accurately represents the distribution of the SRI within this range.

The measured and fitted values of pavement performance indicators are compared using Log-Logistic (3P) fitting. In the range of the PCI [0, 0.6], the fitting results fluctuate significantly, and the fitting effect is poor. In the range of [0.6, 0.9], the fitting results fluctuate slightly and are distributed on both sides of the line, indicating relative reliability and stability. For the RQI, in the range of [0, 0.2] and [0.5, 1], the fitting results fluctuate greatly, and the fitting effect is poor. However, in the range of [0.2, 0.5], the fitting results fluctuate slightly and are distributed on both sides of the straight line, indicating stability and reliability. The fitting values obtained for the RDI fluctuate around the actual values, with local fluctuations being significant. In the range of the SRI [0.4, 0.9], the fitting values exhibit a high correlation with the measured values, indicating a better effect.



**Figure 2.** Cumulative probability density function of pavement performance evaluation indexes: (a) PCI; (b) RQI; (c) RDI; (d) SRI.



**Figure 3.** Comparison of measured values and fitting values of pavement performance indexes: (a) PCI; (b) RQI; (c) RDI; (d) SRI.

Indeed, studying the probability distribution characteristics of asphalt pavement performance evaluation indexes is an important research endeavor. The analysis conducted above indicates that the PCI, RQI, RDI, and SRIes do not follow a normal distribution entirely, and the probability distribution of pavement performance evaluation indexes varies. The gradual decay of pavement performance over time is influenced by various factors such as climate, geology, traffic load, material properties, and structural geometry parameters. Consequently, the probability distribution of pavement performance evaluation indexes will also change throughout different stages of the pavement's life cycle. The current deterministic evaluation method, which employs fixed weights, is insufficient to meet the practical requirements of the project. To ensure accurate and reliable pavement performance evaluation, it is crucial to consider the probabilistic nature of these indexes and incorporate appropriate statistical models or methods for analysis.

Social Number	Distribution Function	Kolmogorov-	-Smirnov	Anderson-l	Anderson-Darling		Chi-Squared	
Serial Number	Distribution Function	Statistic	Sort	Statistic	Sort	Statistic	Sort	
	Log-Logistic	0.10416	5	2.5466	5	18.017	6	
	Log-Logistic (3P)	0.05657	1	1.3167	1	8.0729	2	
DCI	Logistic	0.07701	2	1.6292	2	6.5873	1	
PCI	Lognormal	0.10857	6	3.0129	6	17.641	5	
	Lognormal (3P)	0.10026	4	2.5372	4	13.059	4	
	Normal	0.09952	3	2.3536	3	13.057	3	
	Log-Logistic	0.08961	5	2.83	6	14.394	3	
	Log-Logistic (3P)	0.06286	1	1.6038	1	10.768	1	
POI	Logistic	0.09492	6	2.3974	2	11.416	2	
KQI	Lognormal	0.08381	4	2.8015	5	19.881	6	
	Lognormal (3P)	0.07966	3	2.6147	4	18.457	5	
	Normal	0.07928	2	2.4687	3	15.721	4	
	Log-Logistic	0.169	6	9.2652	6	79.025	6	
	Log-Logistic (3P)	0.10865	1	4.6751	1	41.345	1	
DDI	Logistic	0.16246	4	6.3528	2	60.395	2	
KDI	Lognormal	0.16794	5	8.9946	5	77.588	5	
	Lognormal (3P)	0.15262	2	6.606	4	63.712	4	
	Normal	0.15298	3	6.4046	3	62.267	3	
	Log-Logistic	0.09108	6	2.1105	6	5.8546	1	
SPI	Log-Logistic (3P)	0.0554	1	1.2219	1	8.7292	5	
	Logistic	0.07973	2	1.8442	4	10.447	6	
SKI	Lognormal	0.08903	5	2.031	5	7.0076	4	
	Lognormal (3P)	0.08081	3	1.7982	3	6.5312	3	
	Normal	0.08172	4	1.6595	2	6.3648	2	

Table 4. Comparison of fitting function statistical test results of pavement performance indexes.

## 3.2. Confidence Analysis Based on Blind-Number Theory

Taking into account the uncertainty associated with randomness, fuzziness, grayness, and uncertainty in the evaluation of pavement performance, the blind number theory is employed to establish blind number expressions for pavement performance evaluation indexes. Additionally, a confidence model is developed to analyze the confidence of pavement performance. The integration of blind information into the evaluation system ensures that it remains unaffected by probability distribution functions. This approach not only provides a clear assessment grade for pavement performance but also assigns corresponding credibility to the assessment grade, thereby enhancing the scientific nature of the evaluation. The sample data and weight coefficients used in this study are based on the research conducted by Li, Wei, Yao, Hu, and Wang [12]. By utilizing Equations (14)–(16), blind numbers and reliabilities for the pavement performance indexes are computed, as shown in Table 5.

$$PQ\hat{I} = w_{PCI} \otimes PC\hat{I} \oplus w_{ROI} \otimes RQ\hat{I} \oplus w_{RDI} \otimes RD\hat{I} \oplus w_{SRI} \otimes SR\hat{I}$$
(14)

$$R_{PQI}(90) = \frac{1}{90} \otimes PQ\hat{I} \tag{15}$$

$$R_{PQI}(80) = \frac{1}{80} \otimes PQ\hat{I}$$
(16)

No.	PQI (Grade)	PQI <sup>^</sup> (Grade)	K <sub>PQI</sub> ^ (90)	$K_{PQI}^{(80)}$
1	83.64	73.31757	0.81464	0.91647
2	83.79	76.23695	0.847077	0.952962
3	84.89	76.85353	0.853928	0.960669
4	85.98	78.84341	0.876038	0.985543
5	84.90	80.23577	0.891509	1.002947
6	87.01	81.69958	0.907773	1.021245
7	84.92	82.01217	0.911246	1.025152
8	85.45	82.64352	0.918261	1.033044
9	84.96	82.85526	0.920614	1.035691
10	87.14	82.93161	0.921462	1.036645
11	84.72	83.26604	0.925178	1.040826
12	87.61	83.40383	0.926709	1.042548
13	87.67	83.48033	0.927559	1.043504
14	86.60	84.10160	0.934462	1.051270
15	86.36	84.60134	0.940015	1.057517
16	87.76	84.83564	0.942618	1.060446
17	87.91	84.84281	0.942698	1.060535
18	87.86	85.12389	0.945821	1.064049
19	88.06	85.74850	0.952761	1.071856
20	89.21	86.82397	0.964711	1.085300
21	89.70	87.03685	0.967076	1.087961
22	89.23	87.35512	0.970612	1.091939
23	89.22	87.47873	0.971986	1.093484
24	88.56	87.48089	0.972010	1.093511
25	89.42	87.75188	0.975021	1.096899
26	88.19	88.27680	0.980853	1.103460
27	89.83	88.34652	0.981628	1.104331
28	89.83	88.36494	0.981833	1.104562
29	90.35	88.42565	0.982507	1.105321
30	90.16	88.50354	0.983373	1.106294
31	89.74	88.56722	0.984080	1.107090
32	90.57	88.84937	0.987215	1.110617
33	89.18	88.98633	0.988737	1.112329
34	90.39	89.02159	0.989129	1.112770
35	90.99	89.17456	0.990828	1.114682
36	91.41	89.56480	0.995164	1.11956
37	90.84	89.72866	0.996985	1.121608
38	91.94	90.05702	1.000634	1.125713
39	92.94	90.97604	1.010845	1.137200
40	92.00	91.01112	1.011235	1.137639

Table 5. Confidence results for intervals of pavement performance.

The results of these calculations are presented in Table 4. It is evident that the calculated PQI<sup>^</sup> results do not align with those obtained using the current standard. The PQI<sup>^</sup> interval determined by the current standard is [83.64, 92.94], whereas the PQI interval computed is [73.32, 91.01]. Three of the judgment values for the optimal pavement performance evaluation grade exceed 1, indicating that the confidence of judgment values greater than 1 in the sample group is 0.075. There are 36 judgment values for the good pavement performance evaluation grade that surpass 1, signifying a confidence of 0.9 or 90% for judgment values greater than 1 in the sample group. Moreover, confidence is considered as 1 for values exceeding 0.9. According to the current standard, the evaluation outcome indicates that 30 samples are classified as good, while 10 samples are deemed excellent. For instance, considering sample 14, the current standard assigns a PQI evaluation result of 83.64, corresponding to a good evaluation grade. However, when employing the information entropy weight determination calculation for PQI<sup>^</sup>, the result is 73.32, indicating a medium evaluation grade. These evaluation results differ significantly. Analyzing the pavement performance sample data reveals that the evaluation grade for the RDI is poor, while the PCI, RQI, and SRI receive excellent and good evaluation grades, respectively. The current standard assigns weights of 0.35 and 0.4 to the PCI and RQI, respectively, while the weight assigned to the pavement rutting depth index is relatively small [31]. Consequently, the overall pavement evaluation result becomes overly optimistic. In contrast, Li, Wei, Yao, Hu, and Wang [12] adopt the information entropy weight determination method, which considers the difference in evaluation indexes and reflects the contribution rate of these indexes to the system. This approach leads to an improved weight for the road rutting depth index. By comparing the scores provided by different experts, it is observed that the weight determination using information entropy weight aligns more closely with the actual road condition level.

Through the proposed confidence model for pavement performance analysis, not only is the evaluation level of pavement performance clearly defined, but the corresponding confidence for each evaluation level is also provided. Moreover, it significantly expands the application scope of pavement performance confidence analysis.

#### 4. Conclusions and Outlook

This study has examined the probability distribution characteristics of the evaluation index for asphalt pavement performance and introduced the concept of blind-number theory to investigate the confidence model for analyzing the confidence of asphalt pavement performance. The key findings are as follows:

- (1) The Pavement Condition Index (PCI), Riding Quality Index (RQI), Rutting Depth Index (RDI), and Skidding Resistance Index (SRI) of pavement facilities do not exhibit complete adherence to the normal distribution. Furthermore, the probability distribution of the pavement performance evaluation index differs.
- (2) A blind-number expression for the pavement performance evaluation index is developed in this study. Additionally, a confidence model for analyzing the confidence of pavement performance is constructed using the method of determining the weight information entropy weight of the pavement performance evaluation index. The model effectively integrates blind information into the pavement performance evaluation system, making it independent of the probability distribution function.
- (3) Compared to the traditional method, the proposed confidence model for pavement performance confidence analysis has several advantages. Firstly, it provides a clear evaluation level for pavement performance, allowing for a more precise assessment. Secondly, it also assigns corresponding credibility to the evaluation level, which enhances the scientific and rational nature of the evaluation process. This improvement ensures that the evaluation takes into account the confidence of the data and the assessment results.

Overall, the confidence model significantly enhances the scientific rigor and advanced nature of pavement performance evaluation, thereby expanding the application scope of pavement performance confidence analysis and enabling more accurate and reliable assessments across a wide range of scenarios. In future research, it is highly recommended to expand the sample size to enhance the richness and representativeness of the data. By incorporating a larger number of samples, the confidence model can comprehensively reflect the performance of pavements under diverse road sections and conditions, thereby enhancing its accuracy and reliability. While this study covers several critical pavement performance evaluation indexes, future investigations should consider incorporating additional relevant indexes, such as traffic flow and climate conditions, which also exert significant influence on pavement performance. The careful consideration of these additional factors can further enhance the applicability and prediction capability of the confidence model.

Moreover, future work should focus on expanding and refining the credibility model of pavement performance based on blind number theory, thereby increasing its applicability to road projects in different regions and under varying conditions. This will provide road maintenance activities with more scientific and reliable decision support. By continuously advancing the credibility model, road engineers can make well-informed decisions regarding maintenance strategies, ensuring the long-term functionality and safety of transportation networks in diverse geographical locations and environmental conditions.

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Article



# Field Data Analysis of Pavement Marking Retroreflectivity and Its Relationship with Paint and Glass Bead Characteristics

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Featured Application: White water-based paints with high-volume solids and well-graded glass beads, characterized by uniformity and curvature coefficients, improve pavement marking service life.

Abstract: Pavement marking retroreflectivity, a critical factor for safe driving, depends on the characteristics of both the paint and the embedded glass beads. However, traditional methods for predicting pavement marking service life often overlook these materials properties. This study investigates the influence of paint and glass bead characteristics on pavement marking retroreflectivity performance and addresses the characterization of glass bead size distribution by the coefficient of uniformity and curvature. Three field test sites on a Brazilian highway with various paint and glass bead combinations were evaluated. A statistical model, GAMLSS (Generalized Additive Model for Location, Scale, and Shape), was adjusted to evaluate the performance of the markings' retroreflectivity as a function of paint and glass bead characteristics. The model revealed that well-graded glass beads increased retroreflectivity by around 10%, while paints with a higher volume of solids improved service life around 65%. Therefore, the results show that acrylic water-based paints with higher volumes of solids and well-graded glass beads with better shape characteristics should be preferred to improve pavement markings' retroreflectivity and service life. The statistical model identified the key characteristics with the greatest impact on pavement marking retroreflectivity, offering valuable insights for real-world applications, which will assist pavement marking practitioners and road authorities in selecting appropriate materials to achieve enhanced durability.

Keywords: road markings; test sites; GAMLSS; particle shapes; gradation; volume solids

# 1. Introduction

# 1.1. Road Safety and Pavement Markings' Retroreflectivity

During the last decades, traffic crashes have become a worldwide concern. The last UN General Assembly established the Second Decade of Action for Road Safety 2021–2030 with a target to reduce death and injuries caused by traffic by a minimum of 50% by the year 2030 [1]. The report recommends ensuring safe road use by guaranteeing that road infrastructure considers the needs of all road users and is designed to facilitate safe behaviors, including the use of clear and intuitive pavement markings [1].

Pavement markings are one of the most important features for roads due to their contribution to road safety improvement. Due to their relatively low cost and broad availability, pavement markings are a low-cost solution to reduce traffic crashes, especially in developing countries [2]. However, adequate pavement markings must present visibility during the day by the contrast of the marking material with the pavement surface, and their nighttime visibility depends on the retroreflectivity provided by the glass beads in the pavement markings.

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**Copyright:** © 2024 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). Retroreflectivity is an engineering measure of the efficiency of the pavement markings' ability to reflect the light from vehicle's headlights back to the light source. Pavement markings' retroreflectivity is measured by the coefficient of retroreflected luminance ( $R_L$ , mcd/m<sup>2</sup>/lx) given by the ratio of the luminance (brightness to the driver from the markings surface, mcd/m<sup>2</sup>) and the illuminance, in lux (lx), of the vehicles' headlight on the marking [3,4]. Retroreflectivity ( $R_L$ ) is most required in low-light and nighttime conditions to improve the readability and perception of the information provided by pavement markings.

The improvement and maintenance of pavement markings' retroreflectivity correlate to a reduction in traffic crash rates [3,5]. Higher values of retroreflectivity reduce the detection distance of pavement markings, especially for elderly drivers [6], which improves their reaction time. In addition, studies have shown that pavement marking retroreflectivity values higher than 200 mcd/lx/m<sup>2</sup> are related to a lower number of traffic crashes. Moreover, the maintenance of pavement markings' quality presents a positive effect on road safety [7].

#### 1.2. Performance of Pavement Markings' Retroreflectivity

Pavement markings present retroreflectivity due to the glass beads applied on their surface. The characteristics of the glass beads have a great influence on the retroreflectivity levels. Smadi et al. [8] assessed the size distribution (gradation), color, shape, and air inclusion of glass beads and evaluated the influence of these properties on the initial retroreflectivity of laboratory and field samples. The authors evaluated 30 glass bead samples and could not define a definitive relationship. However, the general trends observed showed that samples with higher percentages of round and larger particles, clearer beads, and low air inclusion tended to increase the initial retroreflectivity value.

Pavement markings' retroreflectivity decreases over time. Frequent snow removal activities, traffic, and dirt accumulation scratch the glass beads' surface, which accelerates the degradation rate of retroreflectivity due to the loss of a polished surface [9]. Moreover, retroreflectivity degradation also occurs due to the loss of glass beads and dirt accumulation on the pavement markings' surface, which reduces the reflectorized area [10]. The glass beads' loss depends on the marking material used; the selection of the type of binder must consider costs and performance [11]. In addition, materials' characteristics are evaluated by laboratory tests to guarantee their quality prior to application.

Retroreflectivity values and their rates of decrease depend on the traffic volume and composition, as well as climatic conditions such as rain, solar radiation, and temperature. Due to the difficulty of reproducing traffic and weather characteristics in the laboratory, pavement markings' performance are usually evaluated by field tests [12–20]. Experimental test sites are expensive and require long periods to produce results, but they are necessary for the proper evaluation of materials' performance.

#### 1.3. Degradation Models

The data collected from the experimental test sites provide information regarding the decrease in retroreflectivity over time, and the results can be used to predict the retroreflectivity value expected at a given time by statistical modeling. Statistical models provide details regarding the service life of pavement markings based on the variables and characteristics included to fit the data.

Prediction of the end of pavement markings' service life started during the 1990s. The initial approaches considered linear or logarithmic models to predict the retroreflectivity as a function of age and initial  $R_L$  [12,13]. The authors evaluated the retroreflectivity data from pavement markings with different marking materials, considering paints, tapes, thermoplastic, and others. Since then, statistical models and analyzed data have evolved to more complex models using machine learning methods [20]. Table 1 presents several studies from the literature that proposed statistical models with the data from experimental test sites, including the main exploratory variables and the materials considered.

Author/Year	Exploratory Variables Included in the Model	Materials
Zhang and Wu, 2010 [15]	Age	Tape, water-based paint, thermoplastic, and experimental materials
Hummer et al., 2011 [16]	Age and R <sub>L</sub> initial *	Water-based paint
	Age, R <sub>L</sub> initial *, lane and shoulder width, difference and	*
Robertson et al., 2013 [17]	R <sub>L</sub> percentage difference, and traffic volume	Water-based and high-build paint
	and cumulative traffic volume	
Sitzabee et al., 2013 [18]	Age, R <sub>L</sub> initial *, traffic volume, glass bead type, and line position	Polyurea
Babić et al., 2019 [19]	Age, $R_L$ initial *, line position, and winter maintenance	Solvent-based paint, thermoplastic, and cold plastic

Table 1. Summary of retroreflectivity prediction models in the literature.

\* R<sub>L</sub> initial = initial retroreflectivity value.

Most of the studies presented in Table 1 predicted retroreflectivity as a function of age and the initial retroreflectivity value. Traffic volume was also frequently included in the models as a significative variable to the degradation rate of retroreflectivity. Furthermore, with the exception of Sitzabee et al. [18], all the researchers evaluated at least two different marking materials. However, Sitzabee et al. [18] evaluated the impact of glass bead variation by comparing the performance of standard and highly reflective beads and comparing their impact on the service life of pavement markings.

Despite all the studies including more than one material type as a source of variation, none of them included an explanatory variable to describe the influence of distinct materials on the degradation rate or on the retroreflectivity value predicted. The authors adjusted different degradation models to evaluate the retroreflectivity and the degradation rate of pavement markings using different materials. In addition, the authors grouped the data based on the material type and did not present any differentiation regarding variations in the same material type, for example, by manufacturer.

#### 1.4. Objective

It is important to quantify the impact of different paints and glass beads. The choice of different materials will change their properties and characteristics. However, existing studies in the literature fail to discuss the influence of material properties or characteristics on retroreflectivity value or pavement markings' service life. Identifying and quantifying material properties' impact on retroreflectivity degradation is crucial during material selection prior to application.

The objective of this paper is to identify the contribution of basic characteristics of paints and glass beads, evaluated through laboratory tests, on the retroreflectivity performance of pavement markings. This analysis is based on data collected at three experimental test sites at a Brazilian highway and fitted to a statistical model. The results will assist pavement marking practitioners and road authorities in selecting appropriate materials to achieve enhanced durability.

# 2. Materials and Methods

#### 2.1. Materials

In this research, seven white acrylic resin water-based paints were evaluated: A, B, C, D, E, F, and G. All the paints were commercial paints, from distinct manufacturers. Paints A, B, C, D, E, and G are traditional traffic paints, whereas paint F is expected to exhibit superior performance, as indicated by the manufacturer.

The glass beads used in this study were from five distinct manufacturers:  $\alpha$ ,  $\beta$ ,  $\omega$ ,  $\delta$ , and  $\varepsilon$ . Two glass bead gradations (IIA and IIC), following the guidelines of Brazilian standard ABNT NBR 16184 [21], were selected from manufacturers  $\alpha$ ,  $\beta$ ,  $\omega$ , and  $\varepsilon$ . The glass beads selected from manufacturer  $\delta$  were two gradations (Type 2 and Type 3) according to AASHTO M247 [22]. Figure 1 presents the grain size distribution ranges of the gradations used.



Figure 1. Grain size distribution ranges of glass beads IIA and IIC from NBR 16184 (BRA) [21] and Type 2 and Type 3 from AASHTO M247 (USA) [22].

# 2.2. Methods

All the paints were characterized regarding their consistency [23], specific gravity [24], and volume solids [25]. These methods were selected based on the common practices of Brazilian agencies for quality acceptance of traffic paints due to the simplicity of the tests. The glass beads' size distribution and shape characteristics were evaluated according to the procedure described in AASHTO R98 [26].

#### 2.3. Experimental Design

The retroreflectivity data used in this study were collected from three experimental test sites where the pavement markings were subjected to the real weather and traffic conditions. Test site 1, test site 2, and test site 3 were monitored from 2016–2017, 2018–2020, and 2020–2022, respectively. All the test sites were constructed at the same road section with the same characteristics and were subjected to similar climatic conditions. Figure 2 shows the toll plaza where the test sites were located.



Figure 2. Experimental test site view [27].

Experiments on highways require special attention because they involve several safety aspects. The experiment used the lines transversal to traffic as recommended by NTPEP [28]. This experimental setup presents the following advantages: all stripes can be placed close together in a short length of highway, which allows for the quick measurement of retroreflectivity; all materials are subjected to the same conditions of traffic and weather; and all the stripes are hit by vehicles, which accelerates the experiment. Although transversal stripes do not represent the real condition of markings, since they are applied longitudinally [5], transversal stripes provide similar results to overall pavement markings'



degradation [29,30]. Figure 3a shows one example of the test site on the day of application and Figure 3b shows the stripes after being subjected to traffic for 11 months.

Figure 3. Experimental test site 2: (a) day of construction; (b) 11 months after construction (zoomed in on the right lane).

Due to the high traffic volume of the highway, traffic interruptions for frequent retroreflectivity measurements would cause speed reductions and safety issues. Therefore, the test sites were constructed in a toll plaza rather than a free rolling section because drivers are aware and warned of a speed reduction, which avoids misunderstandings and safety issues. All the test sites were placed after the toll cabin and were subjected to the effect of vehicles' acceleration. The test sites were located on highway BR-381 (an important road in the southeastern region of Brazil with very heavy traffic of  $2.27 \times 10^7$  ESALs for a 10-year project). The traffic volume at this road section is approximately 17,000 vehicles/day, of which 35% are heavy vehicles.

The retroreflectivity values were collected several times during the monitoring period and the intervals between the measurements were random due to limitations on traffic interruption or wet surfaces caused by rain. In case of rain, the data collection was rescheduled to at least 24 h after the rain ended. The measurements were collected only during the day on a dry surface with a portable retroreflectometer with 30 m geometry, as prescribed by ASTM E1710 [4]. The equipment measurement error was  $\pm 5.0\%$ , according to the manufacturer. The retroreflectivity was measured at the positions of the right and left wheel paths and the value considered herein is the average value between both readings for each stripe. These positions were selected due to their accelerated degradation since the retroreflectivity at the wheel path tends to present values around 50% lower than the center and edges [31].

Each experimental test site used different paints, glass beads, and glass bead application rates (ARs), which generated several material combinations, as shown in Figure 4. All the paints were applied with a wet thickness of 500  $\mu$ m, and no anti-skid was used.

Test site 1 was constructed in July 2016 and the retroreflectivity data were collected for 11 months until June 2017. During this period, the retroreflectivity was measured 30 times, which generated over 6500 data points. The materials evaluated were two commercial paints, A and B, and two application rates of glass beads from three different manufacturers ( $\alpha$ ,  $\beta$ , and  $\omega$ ). This study used the gradations IIA and IIC from ABNT NBR 16184 [21] (Figure 1). The selected glass bead application rates (GB-ARs) were 70% IIA + 30% IIC (7030Br) and 100% IIA (100Br), regarding the total mass of glass beads applied at a rate of 400 g/m<sup>2</sup>. For the application at the test site, the two paints were combined with the beads available, which resulted in 12 different material combinations, as shown in Figure 4.



Figure 4. Experimental matrix for test sites 1, 2, and 3.

Test site 2 was constructed in September 2018 and the retroreflectivity data were monitored over 24 months until October 2020. The retroreflectivity was measured 39 times, generating over 7000 data points. The materials evaluated were two commercial paints, C and D, and three different application rates of two glass bead gradations from the same manufacturer ( $\delta$ ). The paints were provided by a resin manufacturer. The glass beads conformed to the AASHTO M247 [22] requirements. This study used the Type 2 and Type 3 gradations (Figure 1). The selected glass bead application rates (GB-ARs) were: 70% Type 2 + 30% Type 3 (7030T), 50% Type 2 + 50% Type 3 (5050T), and 30% Type 2 + 70% Type 3 (3070T), regarding the total mass of glass beads applied at a rate of 600 g/m<sup>2</sup>. For the application at the test site, the two paints were combined with the three application rates, resulting in 6 different combinations, as shown in Figure 4.

Test site 3 was constructed in December 2020 and the retroreflectivity data were monitored over 18 months until August 2022. The retroreflectivity was measured 15 times, generating over 5500 data points. The materials evaluated were three commercial paints, E, F, and G, and one application rate of glass beads from one manufacturer ( $\varepsilon$ ) applied at the same application rate. The glass beads followed the recommendation of Brazilian standards ABNT NBR 16184 [21] and this study used the gradations IIA and IIC in Figure 1. The selected glass bead application rate (GB-AR) was 70% IIA + 30% IIC (7030Br), regarding the total mass of glass beads applied at a rate of 400 g/m<sup>2</sup>. For the application at the test site, the three paints were combined with the glass beads available, which resulted in 3 different material combinations, as shown in Figure 4.

#### 3. Material Characterization Results

# 3.1. Paint Characterization

The paints were characterized regarding their consistency [23], specific gravity [24], and volume solids [25] prior to the application, and Table 2 presents the results.

					Paint			
Parameter	Limits *	Test Site 1		Test Site 2		Test Site 3		
		Α	В	С	D	Е	F	G
Consistency (KU)	$80 \le KU \le 95$	97	89	96	101	92	89	90
Specific gravity (g/cm <sup>3</sup> )	$\geq 1.59$	1.74	1.70	1.75	1.71	1.70	1.70	1.70
Volume solids (%)	≥62.0	63.8	64.2	62.0	60.5	66.0	65.0	65.0

Table 2. Basic characterization of paints.

\* Limits according to ABNT NBR 13699 [32].

The consistency results in Table 2 show that paints B, E, F, and G were in accordance with the limits required, while paints A, C, and D were out of the range. Although they are considered inadequate for use based on the specification ABNT NBR 13699 [32], the

materials were used for research purposes and applied at the test sites to identify the impact of such characteristics on the paint performance. Regarding the specific gravity, all the paints were in accordance with the required value, which indicates that the paints presented adequate balance and formulation. Considering the volume solids, the parameter evaluates the percentage of the paint's volume without the volatile fraction, therefore representing the dried paint's thickness as a percentage of the wet thickness.

# 3.2. Glass Bead Characterization

The glass beads' size distribution and shape characteristics were evaluated according to the procedure of AASHTO R98 [26]. Figures 5–7 present the grain size distributions, thickness-to-length distributions, and sphericity distributions, respectively, for each glass bead composition and application rate.



Particle's size (µm)

Figure 5. Grain size distributions of glass beads.



Figure 6. Thickness-to-length ratio (b/l) distributions of glass beads.



Figure 7. Sphericity (SPHT) distributions of glass beads.

The size distributions of the glass beads (Figure 5) present a large variation due to their gradations or manufacturers. The glass bead compositions  $\delta$ -7030T,  $\delta$ -5050T, and  $\delta$ -3070T present larger particles than the other compositions. Regarding the other compositions,  $\beta$ -100Br and  $\omega$ -100Br present the smallest particles, but all the compositions present similar size distributions.

The distributions of the thickness-to-length ratio (b/l) in Figure 6 show that compositions  $\delta$ -7030T,  $\delta$ -5050T, and  $\delta$ -3070T present the same distribution of thickness-to-length ratio, with around 78% of round particles (b/l higher than 0.85), as required by AASHTO R98 [26]. The compositions  $\varepsilon$ -7030Br and  $\omega$ -100Br present 70% and 65% of particles with b/l higher than 0.85, while the other compositions present less than 50% of round particles.

Regarding the sphericity distribution in Figure 7, all glass beads present poor shape properties considering the threshold of sphericity required by AASHTO R98 [26] to classify the particles as round (SPHT > 0.93), since all the compositions present less than 10% of round particles. Therefore, the lack of sphericity that all these glass beads present may lead to low retroreflectivity values when they are applied on the pavement markings [8,33].

Since the results of the glass bead characterization are distribution curves, the analysis of results is mainly qualitative. However, to compare the glass beads' composition and use their characteristics as variables in the statistical model, some parameters were obtained from the distributions of the grain size, thickness-to-length ratio, and sphericity to discretize the results.

The size distribution of glass beads was evaluated considering whether the composition is well graded, or not, by the coefficients of uniformity ( $C_U$ ) and curvature ( $C_C$ ) commonly employed in soil mechanics for analyzing granular materials [34,35]. The coefficient of uniformity is defined by Equation (1):

$$C_{\rm U} = \frac{D_{10}}{D_{60}},\tag{1}$$

where  $D_{10}$  and  $D_{60}$  correspond to the diameter (particle size) at which 10% and 60% of particles are smaller, respectively. The coefficient of uniformity ( $C_U$ ) evaluates the uniformity of a granular material. The material is considered uniform if  $C_U$  is lower than 2, i.e., the particles' size distribution is concentrated at one size range. The coefficient of curvature ( $C_C$ ) is described by Equation (2):

$$C_{\rm C} = \frac{{\rm D}_{10}^2}{{\rm D}_{10} \times {\rm D}_{60}},\tag{2}$$

where  $D_{30}$  corresponds to the diameter (particle size) at which 30% of particles are smaller. The coefficient of curvature ( $C_C$ ) identifies whether the particles' size distribution of the granular

materials is continuous or not, i.e., presents a proportional percentage of several particle sizes. The material presents a continuous distribution if  $C_C$  is between 1 and 3. Continuous distribution characterizes well-graded sands and aggregates because it presents particles with several diameters that cause interlock and package between grains since the smaller particles will fill the voids between the larger particles [36]. This behavior is interesting for glass beads because a well-graded glass bead composition will present several embedment depths, which will improve the pavement markings' service life [33].

To characterize the thickness-to-length ratio curve, the parameters considered were  $bl_{20}$ ,  $bl_{50}$ , and  $bl_{80}$ , which correspond to the thickness-to-length ratio at which 20%, 50%, and 80% of the particles, respectively, are lower than that value. Analogously, the characterization of the sphericity distribution curve considers the parameters SPHT<sub>20</sub>, SPHT<sub>50</sub>, and SPHT<sub>80</sub>. Table 3 presents the results of the parameters used to characterize the glass beads' compositions.

Glass Bead	Parameters										
Glubb Deuu	D <sub>10</sub> *	D <sub>30</sub> *	D <sub>60</sub> *	CU	CC	bl <sub>20</sub>	bl <sub>50</sub>	bl <sub>80</sub>	SPHT <sub>20</sub>	SPHT <sub>50</sub>	SPHT <sub>80</sub>
α-7030Br	0.368	0.489	0.625	1.698	1.040	0.62	0.84	0.93	0.53	0.75	0.82
α-100Br	0.335	0.450	0.557	1.663	1.085	0.61	0.82	0.92	0.51	0.74	0.81
β-7030Br	0.348	0.457	0.577	1.658	1.040	0.60	0.84	0.94	0.59	0.76	0.83
β-100Br	0.323	0.415	0.520	1.610	1.025	0.57	0.81	0.93	0.56	0.75	0.82
ω-7030Br	0.305	0.430	0.553	1.813	1.096	0.67	0.91	0.98	0.62	0.74	0.78
ω-100Br	0.270	0.494	0.518	1.919	1.745	0.67	0.91	0.98	0.62	0.74	0.78
δ-7030Τ	0.447	0.620	0.810	1.812	1.062	0.81	0.93	0.97	0.71	0.77	0.82
δ-5050Τ	0.485	0.698	0.886	1.827	1.134	0.83	0.93	0.97	0.71	0.77	0.82
δ-3070Τ	0.568	0.805	0.928	1.634	1.229	0.85	0.93	0.97	0.71	0.77	0.82
ε-7030Br	0.348	0.457	0.577	1.658	1.040	0.60	0.84	0.94	0.59	0.76	0.83

Table 3. Characterization parameters for the glass beads' compositions.

\* Diameter in mm.

The glass beads are fine granular materials with their particles' size distribution inside a small size range. Therefore, glass beads present uniform size distribution with  $C_U$  values varying from 1.6 to 2.0. The glass beads also present well-graded (continuous) gradation, confirmed by the  $C_C$ , which is desirable for proper retroreflectivity performance over time.

#### 4. Test Site Results: Statistical Analysis

The data collected at experimental test sites 1, 2, and 3 yielded over 19,000 retroreflectivity values, encompassing the characteristics of paints, glass beads, and the test site itself. Relying solely on graphical analysis for evaluating pavement markings' performance would introduce bias into the qualitative analysis results. To ensure a robust results analysis and to quantify the impact of each variable on retroreflectivity values and pavement markings' performance, statistical analysis was conducted.

In this section, the Generalized Additive Models for Location, Scale, and Shape (GAMLSSs) are implemented due to their flexibility in addressing a wide range of distributions and incorporating random effects to account for data correlation [37,38]. The GAMLSSs can be understood as an extension of the Generalized Linear Models (GLMs). The model was adjusted and its parameters were estimated using the *gamlss* library of the software R version 4.2.2 [39].

In the descriptive analysis, it was observed that the distribution of retroreflectivity is positively skewed. Therefore, a Weibull distribution was considered in this study to be suitable for modeling the positive random variable (retroreflectivity) representing values until the end of service. It is worth noting that the normal distribution did not fit the data well, as expected based on the data distribution. Let  $y'_{ijk}$  be a vector representing the retroreflectivity observed for i paint characteristics during a j time period of days after painting at the k test site. Conditional on the random effects u, assume that the elements of y are independent and follow a Weibull distribution.

Thus, the Weibull regression model considered is described by Equation (3):

$$\begin{split} Y_{ij} \Big| u &\sim \text{Weibull}(.) \\ \ln \Big( \mu_{ijk} \Big) &= (\theta_0 + u_k) + \sum_{j=1}^8 \theta_{1,j} X_{t,j} + \theta_2 X_{v.sol} + \theta_3 X_{bl50} + \theta_4 X_{CU} + \theta_5 X_{CC} + \theta_6 X_{spht_{20}} \\ &+ \sum_{j=1}^8 \theta_{7,j} X_{t,j \times v.sol} + \theta_8 X_{CU \times CC}, \end{split}$$

$$(3)$$

where  $\mu_{ijk}$  is the mean of the response variable related to the explanatory variables through the logarithm link function. The explanatory variables considered in this study are paints' volume solids (X<sub>v.sol</sub>), glass beads' coefficient of uniformity (X<sub>CU</sub>), coefficient of curvature (X<sub>CC</sub>), and shape characteristics (X<sub>spht<sub>20</sub></sub> and X<sub>bl<sub>50</sub></sub>), and the dichotomous time variables X<sub>t,1</sub> = (0, 20], X<sub>t,2</sub> = (20, 40], X<sub>t,3</sub> = (40, 60], X<sub>t,4</sub> = (60, 80], X<sub>t,5</sub> = (80, 100], X<sub>t,6</sub> = (100, 200], X<sub>t,7</sub> = (200, 300], and X<sub>t,8</sub> = (300, 800), which represent the time periods (days elapsed since the test site construction) during which retroeffectivity was observed. Note that parentheses brackets indicate an open interval, not including a start point, while a closed interval includes the end point and is denoted with the square brackets, as a mathematical notation. Thus, if X<sub>t,j</sub> = 1, the retroeffectivity was mensurated in the first 20 days of application of the pavement marking; the other time variables assume a value of zero in this case. Categorizing the time variable helps to evaluate changes in the degradation rate of pavement markings over time, which is not linear. It is important to highlight that the variable time accounts for the effect of traffic and weather on the pavement marking degradation.

The continuous variables  $X_{v.sol}$ ,  $X_{CU}$ ,  $X_{CC}$ , and  $X_{bl_{50}}$  represent the values of these properties obtained from the characterization tests. On the other hand, the variable  $X_{spht_{20}}$  is dichotomous and assumes a value of one when the SPHT<sub>20</sub> of the paint is higher than 0.59, or zero otherwise. Finally, the  $\theta' = (\theta_0, \ldots, \theta_8)$  vector represents the fixed parameters to be estimated using maximum likelihood [37,38], and the random intercept  $u_k$  with k = 1, 2, 3 was considered to deal with the variability of the measurement at a distinct test site.

During the model selection process, other variables, such as paint consistency and density, were considered. However, these variables were insignificant to the model (p-value > 0.05). Therefore, only variables contributing to the model significance were included in Equation (3). In addition, interactions between explanatory variables were also considered. Interactions evaluate whether the association between the target variable and the independent variable varies based on the value of another independent variable. The interactions between all variables were considered in the model.

The final model presented in Equation (3) includes the variables and interactions selected using a stepwise algorithm based on the Akaike information criterion (AIC) [37,38]. The interpretability of the final model was also considered during the selection process. It is worth noting that a data cleansing process was conducted on the retroreflectivity dataset with the intention of removing any typos or outliers. Retroreflectivity values lower than 70 mcd/m<sup>2</sup>/lx were also excluded from the dataset to simulate an experiment, using as the interruption criteria the end of service life as considered by the MUTCD [40].

#### 4.1. Model Adjustment

The data was adjusted to the model proposed in Equation (3), and the parameters were estimated using the *gamlss* library of the software R [39]. Table 4 presents the estimates of the parameters, their standard errors, and the *p*-values. All variables were found to be significant at a 5.0% significance level. Despite the variable  $X_{v,sol}$  not being significant, it was kept in the model due to its significant interaction with time.

To validate the adequacy of the fitted model, a residual analysis was run, and Figure 8 presents the diagnostic plots of the normalized randomized quantile residuals [41]. The diagnostic plots in Figure 8 show that there is no violation of the model assumptions, and the residuals are normally distributed, confirming the adequacy of the fitted data to the model.

	Variable	Parameter	Estimate	Standard Error	<i>p</i> -Value
	Intercept	θ0	-7.330	0.362	< 0.001
	X <sub>t,2</sub> : (20, 40]	$\theta_{1,2}$	-5.850	0.640	< 0.001
	X <sub>t,3</sub> : (40,60]	$\theta_{1,3}$	-8.822	0.587	< 0.001
	X <sub>t,4</sub> : (60,80]	$\theta_{1,4}$	-8.281	0.720	< 0.001
	X <sub>t,5</sub> : (80,100]	$\theta_{1,5}$	-10.195	0.612	< 0.001
	X <sub>t,6</sub> : (100,200]	$\theta_{1,6}$	-11.199	0.421	< 0.001
Main effects	X <sub>t,7</sub> : (200,300]	$\theta_{1,7}$	-11.308	0.590	< 0.001
	X <sub>t,8</sub> : (300,800]	$\theta_{1,8}$	-88.414	0.627	< 0.001
	V.sol	$\theta_2$	-0.003	0.005	0.404
	bl <sub>50</sub>	$\theta_3$	0.011	0.005	< 0.001
	$C_{\rm U}$	$\theta_4$	6.652	0.113	< 0.001
	C <sub>C</sub>	$\theta_5$	9.055	0.150	< 0.001
	SPHT <sub>20</sub>	$\theta_6$	0.186	0.054	< 0.001
	V.sol $\times$ X <sub>t,2</sub> : (20, 40]	θ <sub>7,2</sub>	0.090	0.010	< 0.001
	$V.sol \times X_{t,3}$ : (40,60]	$\theta_{7,3}$	0.133	0.009	< 0.001
	$V.sol \times X_{t,4}$ : (60,80]	$\theta_{7,4}$	0.118	0.011	< 0.001
Interestions	$V.sol \times X_{t,5}$ : (80,100]	$\theta_{7,5}$	0.148	0.010	< 0.001
Interactions	$V.sol \times X_{t,6}$ : (100,200]	$\theta_{7,6}$	0.159	0.007	< 0.001
	$V.sol \times X_{t,7}$ : (200,300]	$\theta_{7,7}$	0.156	0.010	< 0.001
	$V.sol \times X_{t,8}$ : (300,800]	θ <sub>7,8</sub>	0.120	0.010	< 0.001
	$C_{\rm U}  imes C_{\rm C}$	$\theta_8$	-4.841	0.078	< 0.001

Table 4. The model's estimated parameters.



Figure 8. Model's diagnostic plots: (a) Residuals  $\times$  Fitted Values; (b) Residuals  $\times$  Index; (c) Residuals distribution; (d) Normal Q-Q plot.

# 4.2. Results Analysis

Given the model results, the coefficients obtained may be interpreted to analyze the variables' impact on the average retroreflectivity. It is worth mentioning that in the time variable, the category  $X_{t,1} = (0, 20]$  is the reference category. Therefore, the effects of the other time variables are interpreted in comparison to  $X_{t,1}$ .

Regarding the covariates without interactions, it is noteworthy that the parameter estimates for the X<sub>bl50</sub> and X<sub>spht20</sub> variables are positive, indicating that an increase in their values is associated with an increase in the mean retroreflectivity. Enhancing the roundness of glass beads (X<sub>bl50</sub>) by 0.1 results in an average increase of 11.59% in retroreflectivity because  $\exp(\theta_3 \times X_{bl50}) - 1 = \exp(0.011 \times 0.1 \times 100) - 1 = 0.1159$ . Analogously, the impact of glass beads' sphericity on the pavement markings may be calculated as  $\exp(\theta_6 \times X_{spht_{20}}) - 1 = \exp(0.186 \times 1) - 1 = 0.205$ , i.e., pavement markings with glass beads with a sphericity higher than 0.59 present retroreflectivity, on average, 20.5% higher when compared to pavement markings with glass beads with sphericity lower than 0.59. These parameters characterize the glass beads' shape, and the results confirm the importance of shape to retroreflectivity [8].

To analyze the impact of  $C_U$  and  $C_C$  on retroreflectivity, it is necessary to consider the interaction between these variables. The size and gradation of glass beads also impact the retroreflectivity. However, an evaluation of glass beads' size and gradation beyond the granulometric curves or even the quantification of different beads' gradation on retroreflectivity was not found in the literature. Therefore, the evaluation of the coefficients related to  $C_U$  and  $C_C$  is important to understand the grain size distribution contribution to retroreflectivity. Since there is an interaction between  $C_U$  and  $C_C$ , their impact on retroreflectivity must be evaluated simultaneously.

A higher coefficient of uniformity indicates a large range of sizes for glass beads, while higher coefficient of curvature indicates the equivalent distribution of several particles' sizes. The increase in retroreflectivity related to higher  $C_U$  and  $C_C$  values shows the importance of selecting well graded glass beads. The improvement of retroreflectivity occurs due to the distribution of several glass bead sizes on the pavement markings' surface since the larger particles fall on the paint surface first, and then the smaller particles fill the voids between the larger beads, which expands the area of the markings covered with glass beads. Thus, there is a higher area available to reflect light and improve the night visibility of pavement markings [10].

Supposing a glass bead sample with  $X_{CU} = 1.700$ , an increase in  $X_{CC}$  by 0.1 will improve the retroreflectivity, on average, by 8.71%. The difference between the  $R_L$  before  $(X_{CC_1} = 1.0)$  and after the  $C_C$  increase  $(X_{CC_2} = 1.1)$  may be calculated as exp  $[(\theta_4 \times X_{CU} + \theta_5 \times X_{CC_2} - \theta_8 \times X_{CU} \times X_{CC_2}) - (\theta_4 \times X_{CU} + \theta_5 \times X_{CC_1} - \theta_8 \times X_{CU} \times X_{CC_1})] - 1 = \exp [(6.652 \times 1.700 + 9.055 \times 1.1 - 4.841 \times 1.700 \times 1.1) - (6.652 \times 1.700 + 9.055 \times 1.0 - 4.841 \times 1.700 \times 1.0)] - 1 = 8.71\%.$ 

Regarding the paint's characteristics, the effect of the variable  $X_{v.sol}$  on the retroreflectivity is analyzed considering the different time periods in which the retroreflectivity was measured. An increase of one unit in the volume of solids leads to an average decrease in retroreflectivity of 0.23% when measured within 20 days after the application of the pavement marking. However, this decrease is not statistically significant (*p*-value = 0.404).

The volume solids of paints are associated with pavement markings' durability. The estimates of the parameters of the time intervals obtained at the model adjustment show that the decrease in retroreflectivity over time depends on the volume solids. Supposing a pavement marking using a paint with V.sol = 62.0, the retroreflectivity decreases, on average, by 24.38%  $(\exp(\theta_4 \times X_{t,2} + \theta_{7,2} \times X_{t,2} \times X_{V.sol}) - 1 = \exp(-5.850 \times 1 + 0.090 \times 1 \times 62) - 1 = 0.2438)$  at the time interval  $X_{t,2} = (20, 40]$  when compared to the initial time interval. Analogously, the time interval  $X_{t,2} = (40, 60]$  presents, on average, 43.50% lower retroreflectivity values. Regarding the other time intervals, the reduction in retroreflectivity is, on average, 62.36% for  $X_{t,4} = (60, 80], 63.51\%$  for  $X_{t,5} = (80,100], 74.08\%$  for  $X_{t,6} = (100,200], 80.30\%$  for  $X_{t,7} = (200,300]$ , and 74.64% for  $X_{t,8} = (300,800)$ . The volume solids is an important characteristic because it evaluates the percentage of paint's volume without the volatile fraction, thus representing the percentage of the dried paint's thickness compared to the wet thickness. Therefore, this parameter influenced the retroreflectivity over time instead of the initial retroreflectivity.

Retroreflectivity decreases progressively over time, but the model's estimated parameters show that the reduction over time is not linear. There is a severe decrease for the first 100 days (until  $X_{t,5}$ ) and a relative continuous reduction for the other time intervals. However, the retroreflectivity reduction is more intense for the time interval  $X_{t,7}$  than the time interval  $X_{t,8}$ , which shows that the estimated retroreflectivity is higher for interval  $X_{t,8}$  than  $X_{t,7}$ . This occurs because the evaluation of time as an interval accounts for the seasonal variation of retroreflectivity, which may present higher values after rain due to surface cleaning, as reported by Salles et al. [42].

Considering a one-unit increase in the volume solids of paints, the retroreflectivity improves by 9.15% when it shifts from being measured within the time interval  $X_{t,1} = (0, 20]$  to being measured within the interval  $X_{t,2} = (20, 40]$ . Analogously, the average retroreflectivity improvement is, on average, 14.0%, 12.3%, 15.7%, 17.0%, 16.6%, and 12.6% for time intervals  $X_{t,3}$ ,  $X_{t,4}$ ,  $X_{t,5}$ ,  $X_{t,6}$ ,  $X_{t,7}$ , and  $X_{t,8}$ , respectively.

The positive contribution of volume solids to the average retroreflectivity shows that the retroreflectivity decreases slower for paints with higher volume solids, i.e., higher volume solids paints reduce the degradation rate of pavement markings' retroreflectivity.

An increase in paints' volume solids contributes to the occurrence of the retroreflectivity peak and improves the expected service life of pavement markings. The V.sol is responsible for the thickness of the paints' film on the pavement surface after the drying of paint. Higher V.sol leads to higher dry paint thickness compared to lower V.sol paints if they are applied at the same wet thickness. Therefore, the glass beads present higher embedment depths that will require more wear to remove the particles from the markings' surface, which improves the service life of pavement markings.

Finally, random effects were incorporated into the model to deal with the variability between the test sites. The random effect in the intercept for the variable  $u_k$  refers to each test site, in which  $u_1 = -0.1097$  for test site 1,  $u_2 = -0.0082$  for test site 2, and  $u_3 = 0.1179$  for test site 3. The intercepts indicates that the retroreflectivity values were, on average, higher for test site 3, followed by test site 2 and test site 1, respectively. The results show that, even with the higher concentration of glass beads at test site 2 (600 g/m<sup>2</sup>), the retroreflectivity values were most impacted by material characteristics.

#### 5. Discussion

This research evaluated three experimental test sites of pavement markings in a Brazilian road and proposed a statistical model to assess the quantitative impact of the characteristics of the water-based paints with acrylic resin and the characteristics of the glass beads used on the retroreflectivity value over time for the test sites. The analysis of the coefficients' estimates was important to quantify the impact of each materials' characteristic on the retroreflectivity and on the pavement markings' service life.

#### 5.1. Glass Bead Characteristics

The glass beads' shape has a strong impact on the initial retroreflectivity of the pavement markings [8]. Regarding the coefficients of the properties of shape, both  $bl_{50}$  and SPHT<sub>20</sub> present a positive impact on the retroreflectivity; however, the SPHT<sub>20</sub> has a stronger contribution to the retroreflectivity improvement than  $bl_{50}$ . In addition, the glass beads evaluated in this research present poor shape properties considering the threshold of sphericity to classify the particles as round (SPHT > 0.93), while a much larger percentage of particles for all glass beads may be classified as round considering the thickness-to-length ratio (b/l > 0.85). Therefore, considering the glass beads evaluated herein, they meet the requirements of shape, b/l > 0.85, more easily than the requirements for sphericity, SPHT > 0.93. Moreover, SPHT is harder to achieve and has a higher impact on the retroreflectivity. Thus, it is recommended that the glass beads evaluated herein should present better shape characteristics, mainly sphericity.

The previous study reporting the impact of glass bead gradation on pavement markings' retroreflectivity also discretized the size distribution, but evaluated it as a rank between the samples evaluated [8]. This research calculated and attributed two coefficients commonly used to classify granular materials in soil mechanics, the coefficients of uniformity ( $C_U$ ) and curvature ( $C_C$ ), to characterize the size distribution of each glass bead sample. The results of both coefficients are in a short range, which might indicate the need of proposing a specific classification range for glass beads. Ultimately, the estimates of the model's coefficients showed that the improvement of glass beads' gradation by  $C_C$  is more important than the uniformity ( $C_U$ ). The coefficients could evaluate, discretize, and differentiate the glass beads' size distributions.

Based on the results, the expected coefficient of uniformity for glass beads must range around 1.5 to 1.9 to guarantee the absence of fine particles that reduce the retroreflectivity or larger particles that will cause a lack of embedment depth and premature failure of pavement markings. Regarding the coefficient of curvature, the results obtained range around 1.05 to 1.20; this may be an adequate range to guarantee a well-graded glass bead to improve  $R_L$ . It is important to highlight that these ranges are only premises based on the results obtained herein. However, it is recommended to calculate the  $C_U$  and  $C_C$  for other glass beads to observe how they impact the retroreflectivity and evaluate whether the coefficients can be used to create a new range or not.

# 5.2. Paint Characteristics

The paints were evaluated regarding their consistency, specific gravity, and volume solids. In order to fit the data to the statistical model proposed in this research, the only significant variable was the volume solids. An increase in this variable causes a non-significant reduction in the initial retroreflectivity; however, considering the interaction with time, an increase in volume solids reduces the degradation rate of retroreflectivity over time, i.e., improves the service life of pavement markings.

Despite the limitation of using only the volume solids as a paint characteristic, the model captured the expected tendency of retroreflectivity. It is important to highlight that other characteristics of paints impact pavement markings' retroreflectivity. The results obtained by the analysis of the model's coefficients show that using white water-based paints with acrylic resin and higher volume solids could improve pavement markings' performance, i.e., considering commercial paints with similar characteristics, in which it is not possible to adjust the formulation, the one with higher volume solids should be chosen because it may present a better performance over time.

## 6. Conclusions

This research analyzed the retroreflectivity data collected from pavement markings at Brazilian test sites under real traffic action subjected to tropical climate conditions. It adjusted a statistical model to evaluate the influence of paint and glass bead characteristics on pavement markings' service life.

The research demonstrated the importance of the proper characterization of paints and glass beads before field application. Paints' volume solids are an important characteristic for pavement markings' durability since higher values of volume solids in paints were found to enhance pavement markings' durability. Regarding the glass beads, the results emphasize the importance of their shape on the initial retroreflectivity. Moreover, the research addresses the characterization of glass beads' size distribution as a discrete value, facilitating comparison based on gradation.

The research findings offer guidance for pavement marking practitioners and road authorities in selecting materials. By understanding the impact of paint characteristics and glass bead properties on retroreflectivity, practitioners can make informed choices regarding suitable paint and glass beads. Moreover, improving pavement markings' service life reduces the maintenance frequency and, consequently, reduces road safety issues.

From the results obtained, it is possible to conclude that white water-based paints with higher volume solids are preferable for improving pavement markings' service life. In addition to the importance of glass beads' shape characteristics regarding sphericity (SPHT) and thickness-to-length ratio (b/l), it is also recommended to characterize the glass beads' grain size distribution by the coefficients of uniformity and curvature.

It is important to emphasize that this research does not aim to reduce or replace the characterization tests of paints and glass beads. Rather, it evaluates which parameters most significantly affect the retroreflectivity to improve the acceptance limits of these materials. Furthermore, the results obtained herein are based on a restricted number of materials subjected to specific climate conditions and traffic. Therefore, the application of this research must be carefully conducted, considering only white acrylic water-based paints and glass beads with characteristics similar to those evaluated herein.

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# Article A Case Study of Pavement Foundation Support and Drainage Evaluations of Damaged Urban Cement Concrete Roads

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Abstract: Surface cracks and joint deteriorations are typical premature failures of urban cement concrete pavement. However, traffic loads on the urban pavement are much lower than those on highways. Limited research has been conducted to investigate the causes of accelerated damage in urban cement concrete roads. To investigate the foundation issues that may cause the accelerated damage of urban cement concrete pavements, in this study, field evaluations were conducted to assess pavement foundation support and drainage conditions. Field visual inspections, Ground Penetrating Radar (GPR) survey, Dynamic Cone Penetrometer (DCP) test, and the Core-Hole Permeameter (CHP) test were performed. In urban residential areas with inadequate subgrade bearing capacity, cement concrete pavements are prone to early damage. Foundations with a higher content of coarse particles exhibit a higher CBR value, which can extend the service life of the pavement. The compaction of foundation materials near sewer pipelines and manholes is insufficient, leading to non-uniform support conditions. Moreover, the permeability of the foundation material can influence the service life of pavement surface structures. Foundation materials with fewer fine particles enhance drainage performance, contributing to a longer service life for PCC pavements. In areas with inadequate drainage, water accumulation reduces the bearing capacity of the foundation, thereby accelerating pavement deterioration. The poor bearing capacity and drainage conditions of the foundation lead to cavities between the surface layer and foundation material thus yielding stress concentrations on the pavement surface, which cause the formation of pavement surface cracks.

**Keywords:** urban cement concrete pavement; pavement foundation; filed test; support condition; drainage

# 1. Introduction

The use of concrete for road pavements is typical of several nations and regions, particularly in North America and parts of Asia such as India [1,2]. With the variable climate in North America and the hot and humid conditions in parts of Asia, urban roads mainly are Portland Cement Concrete (PCC) pavements due to their good durability. The design service life for PCC pavement in various specifications is usually over 20 years. In concrete pavements, cracking is one of the major types of premature damage [3–5]. Previous studies have shown that road damage in urban areas arises from a variety of interconnected factors [6–8]. Primarily, these issues originate from foundation problems, such as bearing capacity and drainage performance [9,10].

Past research shows that traffic loads can cause accumulated damage in concrete [11–14] and different types of traffic loads, such as light and heavy vehicles, have different long-

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**Copyright:** © 2024 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). term effects on PCC pavements [15–17]. Nemati and Uhlmeyer [18] replaced the original asphalt pavement at intersections with PCC pavement to tackle the issue of rutting caused by high traffic volumes and traffic loads, thereby prolonging the service life of the pavement. However, traffic loads on the urban pavement are much lower than those on highways [19]. Therefore, the insufficient foundation support or subbase stiffness of urban pavements may lead to accelerated damage and affect the service life [20–22]. Khoury et al. [23] discovered that the stiffness of the foundation is a crucial factor influencing the initiation of cracks in PCC slabs. This finding was substantiated through field survey experiments, which involved comparing the performance of two sections of Portland Cement Concrete pavements. Beckemeyer et al. [24] found that Jointed Plain Concrete Pavement (JPCP) designs are more prone to top-down cracking when the base layer consists of untreated Open-Graded Subbase (OGS) materials due to insufficient foundation support. Therefore, it is important to investigate the causes of premature failure in PCC pavements from the perspective of base layer bearing capacity.

Additionally, damage to PCC pavements can be affected by structural design and base layer drainage [25–28]. Zhu et al. [29] evaluated the performance of unbonded concrete overlays of PCC pavements in Ohio and found that damage caused by water accumulation within the structure seriously affected its serviceability. To address the issue of water accumulation on urban roads in India during the monsoon season, Joshi and Dave [30] constructed a permeable concrete pavement to study its permeability. Due to the large pore structure of previous concrete pavements, their strength and freeze-thaw resistance is significantly lower compared to traditional concrete pavements. This limitation hinders their widespread use [31,32]. Moreover, highly permeable materials allow water to infiltrate the interior of the concrete, leading to the corrosion of reinforcing steel, and ultimately resulting in the cracking of the road surface [33–35]. It is essential to investigate the early damage caused by water accumulation in traditional concrete pavements.

Environmental factors play a crucial role in the performance of pavements. The temperature and humidity variations in seasonally frozen or wet-freeze regions during different seasons can significantly affect the performance and response of PCC pavements [36]. Temperature fluctuations may cause concrete to expand or contract, thereby causing cracks [37]. High humidity levels can slow down the drying process of concrete, affecting its hardening and strength development. Additionally, humidity influences the freeze-thaw cycles, accelerating corrosion in reinforced concrete [38,39]. Glinicki et al. [40] conducted a study on a section of highway in a wet-freeze climate region that experienced premature damage and discovered that the alkali-silica reaction was one of the reasons for the early deterioration of the concrete pavement. PCC pavements in seasonally frozen or wet-freeze regions are more susceptible to premature failure.

Limited research has been conducted specifically addressing accelerated damage caused by urban cement concrete roads. Getachew et al. [41] and Magdi [42] conducted field surveys to assess road damage caused by inadequate drainage. They reviewed the condition of road and ground drainage infrastructure and explored the reasons for poor drainage. They attributed drainage problems to the irrational design of drainage systems and a lack of proper maintenance. Few studies focus on the impact of sewer pipelines under the pavement on the cracking of urban cement concrete pavements.

This study examines the service conditions of PCC pavements in seasonal frost regions. In seasonal frost regions, premature failure of cement concrete pavements often occurs due to the lack of systematic quality control methods. Research specifically addressing the accelerated damage to urban cement concrete roads is limited, prompting local governments to investigate the causes of early failures. Consequently, experimental tests were conducted at sites exhibiting early failures to examine the influence of foundation materials, bearing capacity, and drainage performance. By comparing sites with varying extents of cracking and surface damage, this research aims to assess how enhanced bearing capacity and drainage capabilities affect pavement service life, to provide insights for the design and maintenance of urban cement concrete pavements. To achieve these objectives, field visual inspections, Ground Penetrating Radar (GPR) surveys, Dynamic Cone Penetrometer (DCP) tests, Core-Hole Permeameter (CHP) tests, laboratory particle size analysis, liquid limit (LL), and plastic limit (PL) tests were performed at six test sites.

#### 2. Site Conditions

In this study, a total of six test sites selected for investigation were in one city located in a seasonal frost region, the area where the city is located experiences four distinct seasonal changes, with hot summers, averaging around 30 °C, and cold winters, with an average temperature of about -6 °C. These sections are typical of those observed to be suffering accelerated in the form of surface cracks, joint deterioration, and D-cracking. For the six test sites, two types of pavement surface design were followed: Continuous Reinforced Concrete Pavement (CRCP) and Jointed Plain Concrete Pavement (JPCP) typically as shown in Figure 1. The steel bars were embedded at the mid-depth of the slab at 1.5 m spacing in both transverse and longitudinal directions, with overlap at the longitudinal joints. The other locations were unreinforced but did contain dowels across the transverse joints.



Figure 1. The design schematic of the two pavement types.

Figure 2 provides photos of the locations of the six test sites. The test site ID is named after the surface design type, service age, and site number. The diagram indicates that all test sites are within residential areas, subjected to traffic loads considerably lower than those on highways, with a load limit of 36 tons. Located on a secondary road, Site CRCP-23-B likely experiences even lighter vehicle traffic in comparison to the other sites, which are on the main roads of the residential area. Furthermore, Site CRCP-12 is positioned at the intersection of two roads and the Site CRCP-12 is close to a manhole and sewer pipelines.



Figure 2. Aerial images of six selected testing sections (The parts marked with red circles are the specific test sites).

# 3. Test Methods

## 3.1. Method Introduction

In this study, field tests were performed to evaluate the performance of support and drainage conditions of pavement foundations. Laboratory soil index property tests were conducted on pavement foundation samples collected after drilling core holes. Table 1 summarizes the testing methods and corresponding test objectives.

 Table 1. The field-testing methods and corresponding objectives.

Test Type	Test Name	Test Objective
	Field visual inspections	• Determine the extent and location of cracks and joint deterioration
	Ground Penetrating Radar (GPR) Scan	<ul> <li>Determine the surface thickness and rebar location</li> <li>Locate possible cavities beneath the slabs</li> <li>Determine the coring locations</li> </ul>
Filed testing	Dynamic Cone Penetrometer (DCP) Test	• Evaluate the in-situ bearing capacity of pavement foundation materials in terms of CBR
	Core-Hole Permeameter (CHP) Test	• Evaluate in-situ hydraulic conductivity of pavement foundation materials
Laboratory testing	Particle size analysis and Atterberg limits test	<ul> <li>Determine the soil index properties and Unified Soil Classification System (USCS) classifications of the pavement foundation materials</li> </ul>

Field visual inspections, GPR, CHP, and DCP tests aimed at assessing the performance of the pavement foundation of the test sites.

The GPR test is a nondestructive method commonly used to assess pavement thicknesses, determine locations of rebar, and identify defects such as voids within or beneath the pavement surface. In this study, a ground-coupled 1600 MHz antenna (model SIR-20, manufactured by GSSI) installed on a survey cart was used to collect three-dimensional (3D) information for the top 46 cm of the selected test sections, as shown in Figure 3.



Figure 3. GPR survey conducted on a test site.

The DCP test was used to assess bearing capacity in terms of an empirically correlated CBR of pavement foundation materials. The test was performed in accordance with ASTM D6951 [43]. The test involves driving a conical point with a base diameter of 2 cm using an 8 kg hammer dropped at 57 cm. The penetration depth per blow was measured, which is referred to as the dynamic cone penetration index (DCPI). The DCPI was measured as follows for the various demonstration sections and used in the empirical correlations of Equations (1)–(3) to estimate the in situ CBR values.

For all soils except CL soils with CBR < 10 and CH soils,

$$DCP - CBR = \frac{292}{DCPI \times 25.4^{1.12}}$$
(1)

For CL soils with CBR < 10,

$$DCP - CBR = \frac{1}{DCPI \times 0.432283}$$
(2)

For CH soils,

$$DCP - CBR = \frac{1}{DCPI \times 0.072923}$$
(3)

The CHP test was performed to evaluate the drainage performance of the foundation materials. The test uses the falling head method to measure the in-situ permeability of the foundation layers after drilling cores, the corresponding test device as shown in Figure 4.

In this testing methodology, a core hole with a diameter of 15 cm is bored through the pavement surface down to the underlying support layer. Subsequently, the testing apparatus is inserted into the borehole. To ensure an airtight seal within the interior of the core hole, an inflatable rubber tube is employed, inflated to an air pressure between 20 to 25 psi. The procedure includes the systematic recording of the water head loss rate from the apparatus, observed continuously over a period ranging from 20 to 60 min. The hydraulic conductivity (K<sub>CHP</sub>) of the tested layer is calculated using Equation (4) following the approach described in ASTM D6391 [44].

$$K_{CHP} = R_t G_1 \frac{\ln(H_1 / H_2)}{t_2 - t_1}$$
(4)

$$R_{t} = \frac{2.2902 \times 0.9842^{T}}{T^{0.1702}}$$
(5)

$$G_1 = \left(\frac{\pi d^2}{11D_1}\right) \left[1 + a\left(\frac{D_1}{4b_1}\right)\right] \tag{6}$$

where  $H_1$  and  $H_2$  are effective heads (cm) at time  $t_1$  and  $t_2$  (s), respectively,  $R_t$  is the ratio of kinematic viscosity of permeant at the temperature of the test during time increment  $t_1$  to  $t_2$  to that of water at 20 °C, T is the temperature of the test permeant (20 °C), d is the inside diameter of the standpipe (3.6 cm for the top standpipe and 33 cm for the middle standpipe),  $D_1$  is the inside diameter of the bottom casing (12.7 cm),  $b_1$  is the thickness of the tested layer (cm), and a is 0 for the infinite depth of the tested layer (i.e.,  $b_1 > 20D_1$ ).



Figure 4. The CHP device was installed in a concrete core hole.

After the field DCP and CHP tests, foundation materials were sampled from the core holes. The laboratory particle size analysis, liquid limit, and plastic limit tests were conducted on the samples to determine the soil index properties and Unified Soil Classification System (USCS) classifications of the pavement materials. The particle size analysis tests were conducted in accordance with ASTM D422 [45]. The particle size analysis consists of two parts: sieve analysis and hydrometer analysis. Sieve analysis was performed on particles retained on a 0.075 mm sieve, and hydrometer tests were used to determine the proportions of silt and clay particles smaller than the 0.075 mm sieve. The liquid limit, plastic limit, and plasticity index of the materials were determined in accordance with ASTM D4318 [46]. The wet preparation method was followed to prepare the samples. The liquid limit tests were measured for each material. The plastic limit tests were performed using the ASTM plastic limit rolling device. The particle size analysis, liquid limit, and plastic limit test results were used to classify the samples in accordance with ASTM D2487 [47] and ASTM D3282 [48].

# 3.2. Design of Experiments

Based on the visual inspections and GPR test results, locations of surface cracks, rebars, and cavities in base layers can be determined, as shown in Figure 5 thus determining the coring locations for further material laboratory tests. At least two 15 cm cores were extracted from each test slab, including a non-cracked full core. After drilling cores, DCP and CHP tests were performed in the core holes to evaluate the in-situ bearing capacity and drainage performance of the foundation materials, respectively.



Figure 5. The schematics of the locations of rebar, testing grid, pavement cores, cracks, manholes, and deterioration of the selected slabs at all sites.

In this study, material samples were collected from all core holes at each test site and subjected to laboratory particle size analysis, liquid limit, and plastic limit tests. These tests were conducted once at each site. The DCP test was performed on all core holes at each site, with the average of all DCP-CBR values at each test site determining the representative DCP-CBR value of the test sites. The CHP tests were carried out on two to four core holes at each site. Selected core holes included those without cracks, with cracks, and at joint locations.

# 4. Results and Discussion

#### 4.1. Field Visual Inspection Results

Figure 6 provides photos of the typical surface conditions of the six test sites. In general, all sites with JPCP pavement designs exhibited similar distress patterns, consisting of longitudinal and transverse cracking with varying degrees of joint deterioration. The sites with younger JPCP pavement appeared to exhibit less distress.



Figure 6. Typical pavement conditions of the six test sites.

Sites CRCP-23-A and B were constructed at the same time with the same design. The service life of the two sites was 23 years at testing time, and both yielded similar surface damage including significant longitudinal cracking. However, CRCP-23-A showed more joint deterioration and D-cracking.

The surface thickness and reinforcement design of the Sites CRCP-12 and CRCP-4 were the same as those of CRCP-23-A and B. However, even though the service life of the two sites was much shorter, similar surface damage can be observed. Both yielded some random surface cracking and joint damage.

Sites JPCP-4-A and JPCP-4-B were constructed using the JPCP design as shown in Figure 1. The service life of both sites is four years. Site JPCP-4-A exhibited good pavement conditions without any visible surface damage. Site JPCP-4-B had one slab yielding a transverse crack, with no evidence of joint deterioration.

# 4.2. Evaluation of Pavement Foundation Support Conditions

Subgrade material samples were collected from the core holes at each test site to determine the material index properties of the foundation materials on each site. Laboratory particle size analysis, Liquid Limit (LL) test, and Plastic Limit (PL) test were conducted on the samples collected from core holes to determine the particle size distribu-

tion and soil index properties according to the Unified Soil Classification System (USCS) and AASHTO classifications.

The soil classification test results are summarized in Table 2. The Sites CRCP-23-A, CRCP-4, JPCP-4-A, and JPCP-4-B were classified as Sandy Lean Clay (USCS group symbol: CL). The Sites CRCP-23-B and CRCP-12 were classified as Clayey Sand (USCS group symbol: SC). The plasticity values of the subgrade materials were approximately identical for all the sites. This uniformity in plasticity indicates a certain consistency in the behavior of the materials when subjected to moisture changes.

Index Properties	Site CRCP-23-A	Site CRCP-23-B	Site CRCP-12	Site CRCP-4	Site JPCP-4-A	Site JPCP-4-B
Liquid Limit, LL (%)	31	31	34	30	33	32
Plastic Limit, PL (%)	13	12	16	14	14	12
Plasticity Index (%)	18	19	18	16	19	20
AASHTO classification	A-6(7)	A-2-6(1)	A-6(5)	A-6(6)	A-6(9)	A-6(9)
USCS classification	CL	SC	CL	CL	CL	SC
USCS	Sandy	Clayey	Clayey	Sandy	Sandy	Sandy
group name	lean clay	sand	sand	lean clay	lean clay	lean clay

Table 2. Soil classification results of the foundation surface materials of the six test sites.

The particle size distribution curves of the foundation materials of the six test sites are shown in Figure 7. The foundation materials at Sites CRCP-23-A, CRCP-4, JPCP-4-A, and JPCP-4-B were similar. The foundation material at Sites CRCP-23-B and CRCP-12 contained more sand and fewer fine materials. Relevant research [49–51] indicates that a higher content of coarse aggregates can enhance the stability and drainage performance of the subgrade. Following this, DCP and CHP tests will be conducted at all test sites to measure the bearing capacity and drainage performance of the foundation.



Figure 7. Sieve analysis results of the foundation surface materials of the six test sites.

The DCP tests were conducted to quantitatively analyze the bearing capacity of the pavement foundation. For each test site, two to four core holes were selected to conduct DCP tests after drilling surface cores. The testing blows, DCPI, and CBR versus depth profiles of the six sites are shown in Figure 8. Based on the test results, the pavement foundation-bearing capacity conditions of the six sites can be separated into two groups. The DCP-CBR values of sites CRCP-23-A, JPCP-4-A, and JPCP-4-B were relatively uniform, and no obvious boundary can be observed in their DCP-CBR profiles. However, for sites

CRCP-23-B, CRCP-12, and CRCP-4, the DCP-CBR values of the top 250 mm foundation material are very different from those of the bottom materials. The top layers of sites CRCP-12 and CRCP-4 are much softer than their bottom materials. This led to noticeably premature failures compared to sites JPCP-4-A and JPCP-4-B, despite their shorter service life, as illustrated in Figure 6.



Figure 8. DCP test results versus depth profiles of the foundation materials of the test sites.

To evaluate the relative support conditions of the six test sites, the in-situ DCP-CBR values are compared to the Iowa Statewide Urban Design and Specifications (SUDAS) rating [52], which was developed to evaluate the support conditions for subbase and subgrade layers of rigid and flexible pavement systems based on the CBR values. Figure 9 compares the DCP-CBR of the two groups of test sites with the SUDAS rating.



Figure 9. Comparison of DCP test results with the SUDAS pavement foundation relative support condition rating.

At all test sites, the top layer of site CRCP-23-B was rated as very good support conditions, which is much higher than that of the bottom material and other sites. The difference is caused by material gradation. The top layer material of CRCP-23-B contains a higher gravel content than those of other sites as shown in Figure 7. This indicates that a higher content of coarse particles can significantly enhance the bearing capacity of the foundation.

The average DCP-CBR values of sites CRCP-23-A, JPCP-4-A, and JPCP-4-B are below 5%, which are rated as very poor support conditions. Regarding sites CRCP-23-B, CRCP-4, and CRCP-12, the top subgrade layer of sites CRCP-4 and CRCP-12 showed lower average DCP-CBR values than the bottom materials, corresponding to very poor support. At site CRCP-23-B the average CBR of the top layer was approximately eight times higher than that of the bottom material. The average DCP-CBR of the top layer was 25.8%, indicating good support. Compared to CRCP-4, despite having the same service life, sites JPCP-4-A and JPCP-4-B exhibited lighter pavement damage but still had lower bearing capacities. This phenomenon is attributed to the pavement design approach of Jointed JPCP. The reinforcement placement method in CRCP may more readily lead to stress concentration areas, thereby resulting in cracks. Additionally, field observations noted well-sealed joints at Sites JPCP-4-A and JPCP-4-B. Similarly, compared to Site CRCP-23-A, despite having the same service life, site CRCP-23-A showed more joint deterioration and D-cracking, as shown in Figure 6. This suggests that higher bearing capacity can help delay deterioration, thereby extending the service life of the pavement. However, despite this higher bearing capacity of the top layer, Figure 2 demonstrates that severe random cracking still occurred at this site. It indicates that the bearing capacity of the foundation is influenced by both the bearing capacities of the top and bottom layers. Even if the top layer of the foundation has good support conditions, poor support of the bottom layer similarly affects the overall bearing capacity of the foundation, ultimately leading to premature failure of PCC pavement.

#### 4.3. Evaluation of Pavement Foundation Drainage Performance

The drainage performance of the pavement foundation layer significantly affects the performance and durability of the pavement surface system. At the CRCP-12 site, Photos taken during the field investigation process are shown in Figure 10a. Field observations revealed severe random and corner cracking in the pavement and the water accumulated close to the curb. The water accumulation can cause insufficient bearing capacity of the foundation. Reduction in the bearing capacity of the subgrade materials may not only lead to a non-uniform support condition but also cause subgrade erosion. Additionally, the test section of the site CRCP-12 is close to a manhole and sewer pipelines (i.e., green paint marks the pipeline directions in Figure 10), where the subgrade material is likely less well-compacted, which makes it more susceptible to scoured and loose material. The GPR scan results show that a 5 cm thick layer was observed between the concrete and the bottom foundation layer as shown in Figure 10c. This further suggests that the pressure-injected layer was applied to address the erosion and loosening of less compacted materials.

To quantitatively assess the drainage performance of pavement foundation materials, the CHP tests were performed in core holes at each site. The CHP test results are summarized in Table 3. Tests performed on surface crack locations were marked as cracks, tests on regular surface locations were labeled as regular, and tests performed at joints were marked as joints.

The calculated hydraulic conductivity values ( $K_{CHP}$ ) for the core holes without cracks are denoted as regular as shown in Table 3 and are representative of each testing site. The foundation layers provide better drainage at sites CRCP-23-B and CRCP-12, which have fewer fine particles than the other sites as shown in Figure 7. It seems to indicate that more coarse particles and fewer fines are beneficial for better permeability. Figure 6 shows that the CRCP-23-A had more joint deterioration and D-cracking. It indicated that the permeability of the foundation material with relatively fewer fine particles yields


good drainage performance, which may lead to a longer service life of the PCC pavement surface structure.

**Figure 10.** (a) Faulted concrete slab, (b) GPR 2D scan result, and (c) injected material at Site CRCP-12. **Table 3.** CHP test results of subgrade materials in each site.

Test Site	Test Site Core Number		K <sub>CHP</sub> (m/day)
	A1	Regular	0.52
City CDCD 02 A	A2	Cracks	8.44
Site CKCP-23-A	A3	Cracks	0.31
	A4	Cracks	17.34
Cite CDCD 22 D	B1	Cracks	6.95
Site CKCP-23-B	B4	Regular	4.05
Site CRCP-12	C4	Regular	3.44
C'H CDCD 4	D1	Cracks	0.58
Site CKCP-4	D2	Cracks	2.59
Cite IDCD 4 A	E1	Regular	0.24
Site JPCP-4-A	E2	Joint	0.09
Site IDCD 4 P	F1	Regular	0.21
Site Jr CP-4-D	F2	Cracks	0.64

The foundation layers provide very poor drainage at the other sites, at site JPCP-4-A, the CHP test result for the core hole at a joint is very low. It indicates that the joints at this site were well-sealed, effectively preventing water infiltration. The  $K_{CHP}$  at site CRCP-4 is low but still higher than that of sites JPCP-4-A and JPCP-4-B, suggesting that the foundation of site CRCP-4 has greater permeability. Figure 6 indicates that despite having the same service life, site CRCP-4 exhibited more significant premature failure than the other two sites. This could potentially be related to water entering the foundation, leading to the washout of foundation materials and consequently resulting in insufficient bearing capacity of the subgrade. Additionally, the CHP test results indicate that most core holes with cracks show higher permeability seep into the foundation, resulting in higher flow rates beneath the cracked slabs.

Figure 11 shows the observed cracking pattern and corresponding GPR scan results at site CRCP-23-A. Figure 11a shows a photo taken during the field investigation, also depicting water accumulation near the curb and severe random cracks and corner cracks on the pavement. The cracks allow water to seep into the foundation, which may accelerate

the corrosion of the rebar. The GPR survey, as illustrated in Figure 11b,d, indicates the potential existence of a predictable pattern in the occurrence of crack locations. The GPR results seem to indicate the formation of random cracks within the concrete slab, especially in areas between the rebars. This pattern suggests that the cracking might initiate at or near one of the rebars. The occurrence of cracks between the rebars could be attributed to stress concentrations or material defects due to rebar corrosion in these areas.



Figure 11. (a) Distresses observed at site CRCP-23-A, (b) GPR 2D scan result, (c) Magnified view of part of the distress, (d) GPR 2D scan result.

Further investigation was conducted by drilling a core A3, from a transverse crack to determine if the crack originated from the rebar, as depicted in Figure 12a. The GPR result and field observations results show that two small transverse cracks propagated along the transverse rebars, also shown in Figure 12a,b. However, observation of core A3 shown in Figure 12c illustrates that the interface may not be the cracking initiation point. Instead, it may behave as a stress concentration area where the initiated cracks may follow the rebars to propagate. The DCP results shown in Figure 9 and CHP results shown in Table 3 illustrate the poor bearing capacity and drainage performance at site CRCP-23-A, which indicate that when the subgrade layer is not strong enough, lacking the necessary strength, it fails to adequately support vehicular loads. This could result in the formation of stress concentration areas in the areas around the rebars, leading to the development and propagation of cracks in these specific regions.



**Figure 12.** (a) Schematic of crack locations, reinforced bars, and cores, (A2, A3, and A4 are the labels for the core sampling locations) (b) transverse cracks that developed along the transverse rebars, and (c) images of Core A3 at Site CRCP-23-A.

Furthermore, at site CRCP-23-B, special attention was paid to the intersection of severe transverse and longitudinal cracks at core B3, as shown in Figure 13a,b. After drilling the core sample, an unexpectedly large gravel particle was found beneath core B3, as depicted

in Figure 13c. It suggested a stress concentration area might have formed beneath the core B3 under the influence of vehicular loads. Additionally, the presence of the large gravel particle could have altered the direction of crack propagation, preventing it from following the path of the reinforcing bars.



**Figure 13.** (a) Schematic of crack locations, reinforced bars, and cores, (B2, B3, and B4 are the labels for the core sampling locations) (b) location of the cracks, and (c) a large gravel particle in core hole B3 at site CRCP-23-B.5.

## 5. Conclusions

This study aims to explore potential foundational issues that may lead to the accelerated damage of urban cement concrete pavements in seasonal frost regions. To achieve the objectives, a total of six test sites designed by CRCP and JPCP methods were selected for field evaluations. Field visual inspections, GPR surveys, DCP tests, and CHP tests were performed to assess the support and drainage conditions of pavement foundation materials. The key findings of this field study are listed below:

- (1) In urban residential areas where the subgrade bearing capacity is insufficient, cement concrete pavements often suffer premature failure. Foundations with a higher content of coarse particles exhibit a higher CBR value, which can extend the service life of the pavement. Urban roads contain sewer pipelines under the pavement, which lead to less compaction of foundation materials. The less compacted foundation will result in non-uniform bearing capacity and support conditions.
- (2) The permeability of the foundation material with relatively fewer fine particles yields good drainage performance, which leads to a longer service life of the PCC pavement surface structure. For subgrades with poor drainage, water tends to accumulate near curbs or in low-lying areas, significantly reducing the bearing capacity of the foundation, and thereby accelerating pavement deterioration. The cracks allow water to more easily penetrate the foundation and potentially wash away foundation materials, resulting in non-uniform support conditions and accelerating the formation of cracks.
- (3) For the pavement design type of CRCP, the poor bearing capacity and drainage conditions of the foundation lead to cavities between the surface layer and foundation material thus yielding stress concentrations on the pavement surface, which cause the formation of pavement surface cracks.

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Article



# Long-Term Maintenance Planning Method of Rural Roads under Limited Budget: A Case Study of Road Network

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Abstract: At present, the task of maintaining and managing rural roads in China is becoming increasingly severe. To solve the problems of insufficient scheme benefits, complex feasible solutions, and low optimization efficiency in long-term maintenance planning of rural road networks under a limited budget, it is urgent to develop maintenance decision-making models and optimization methods suitable for rural roads in China. This paper focuses on the critical aspects of performance evaluation, prediction, and decision-making. Firstly, this paper proposes evaluation indicators and maintenance countermeasures suitable for rural roads, combining them with the characteristics of rural road performance degradation. Based on different treatment measure levels, RPCI and RRQI performance prediction models are established. On this basis, an improved heuristic optimization method is proposed, which realizes rapid optimization of the most cost-effective solution. Finally, the model and method proposed in this paper are applied to the case analysis of 10 rural roads in Haimen City, generating 171 optimal maintenance sections, further verifying the feasibility and effectiveness of the model. The study provides a theoretical basis for the scientific management of rural road maintenance.

Keywords: rural roads; prediction models; improved heuristic methods; maintenance benefits; maintenance strategy

## 1. Introduction

Rural roads in foreign countries are typically referred to as county, township, and village or low-volume roads in China. Rural roads are a critical component of China's road network, essential for rural economic and social development. China began large-scale rural road construction in 2003, with a total length of 4.5314 million kilometers by the end of 2022, accounting for 84.6% of all roads. A developed rural highway transportation network has been established, centered around county towns, with townships as nodes and village groups as the network.

In recent years, rural road development in China has shifted from construction to maintenance due to the rapid growth of the scale of rural road construction. With limited maintenance funds, local road management departments face challenges in managing such a vast mileage of rural roads effectively while improving maintenance fund utilization efficiency and guaranteeing road service levels. The current maintenance and management system applies high-grade road maintenance decision-making without considering differences in pavement structure, traffic volume, and funding budgets, leading to issues like unreasonable pavement performance evaluations and inadequate scientific maintenance decision-making in actual management processes.

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Copyright: © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). Therefore, it is necessary to establish a decision-making method for rural road surface maintenance through systematic research. Selectively locating maintenance sections and measures can effectively maintain a high level of service for rural roads.

Research on low-flow rural road maintenance decision-making has been conducted abroad. Pantha [1] et al. (2010) used Geographic Information System (GIS) to determine the priority map of pavement maintenance in the Himalayas and developed a budget, time, and resource-constrained decision model for rural road maintenance. Mergi [2] et al. (2012) evaluated pavement conditions using the Pavement Condition Index (PCI) and adopted a "worst PCI priority" strategy for Sudan's rural road networks. Mathew [3] et al. (2015) created a dual-objective deterministic optimization model for rural road network maintenance and proposed a constrained genetic algorithm as the optimization tool. Torres-Machi [4] et al. (2017) studied the impact of road environmental performance on road maintenance plan design, and developed a tool for SUS optimization design.

Agarwa [5] et al. (2017) studied Indian rural roads and found that maintenance decisions primarily depend on functional, structural, and importance conditions, proposing a two-stage optimization process. Pasindu [6] et al. (2020) established a multi-objective decision-making framework based on pavement structure type selection to address funding, technology, and human resource issues in low-traffic rural road maintenance, providing tools for local highway planning and decision-making. Yogesh [7] et al. (2023) researched and developed a long-term rural road network planning method, applied ant colony optimization, and found it to be 14% more efficient than existing models through verification analysis.

Pavement maintenance decision-making has widely employed various methods, from simple ranking to complex mathematical planning. However, each method has limitations in solving real-world optimization problems. For instance, the ranking method is straightforward but lacks holistic conservation planning over the entire period. It struggles with sorting multiple objectives (Kabir [8] et al. 2014, Choi [9] 2015, Abu Dabous [10] et al. 2019). The mathematical planning model considers different sections, schemes, and time series within the road network but suffers from unstable solutions and slow processing for large-scale problems (Fecarotti [11] et al. 2021). Artificial intelligence methods like genetic algorithms, artificial neural networks, and fuzzy set theory have high processing power but are sensitive to environmental factors, require ample sample sizes, learn slowly, and may not yield long-term optimal solutions (Han [12] et al. 2021, Hanandeh [13] et al. 2022, Mohimenul [14] et al. 2023).

To address the issues of inadequate scheme accuracy, complex decision-making, and low optimization efficiency in rural road maintenance with limited budgets, this paper proposes a maintenance decision model suitable for rural roads. The model combines heuristic optimization algorithms and aims to maximize overall benefits throughout the life cycle by considering pavement performance. By establishing a reasonable decision model and optimization algorithm, the scheme can be quickly and accurately optimized. A case study of 10 rural roads in Haimen City, Jiangsu province, with a total road network length of 280 km is conducted to research the application of long-term maintenance planning from 2023 to 2036. The model determines a maintenance strategy with a reasonable budget and best benefits, verifying its feasibility and effectiveness. This scientifically and effectively guides rural road maintenance management in China.

#### 2. Research Conditions and Methods

### 2.1. Key Indicators and Conditions

## 2.1.1. Pavement Performance Evaluation

Considering the characteristics of low road grade (mainly Grade III and IV roads), slow driving speed (not higher than 60 km/h), and small traffic load in rural roads in China, it is often not necessary to select all road performance indicators as evaluation parameters in the actual evaluation of their road conditions (Tang [15] et al. 2021, Shtayat [16] et al. 2020). Therefore, according to the actual road characteristics of the rural road network in the Jiangsu province, this paper ignores the requirements for pavement anti-skid performance and rutting. Two key indicators, namely, the Rural Road Pavement Surface Condition Index (RPCI) and the Rural Road Pavement Riding Quality Index (RRQI), are mainly used for calculation and evaluation, as shown in the following Formulas (1) and (2) and Table 1. In addition, in order to further understand the internal conditions of rural roads, this paper also supplements the evaluation of the internal health status of the pavement based on the RIPCI auxiliary index based on bottom-finding radar, as shown in Equation (3) (this index is not included in the comprehensive evaluation as an influencing factor to evaluate the road condition attenuation).

$$RPCI = 100 - a_0 CR^{a_1} - \sum W_i N_i \tag{1}$$

$$RRQI = \frac{100}{1 + a_2 e^{a_3 IRI}}$$
(2)

$$RIPCI = 100 - 15 * IDI^{0.412}$$
(3)

where *CR* is Pavement Cracking Ratio; *IRI* is International Roughness Index; *IDI* is the Inner Pavement Distress Ratio;  $a_0$ ,  $a_1$ ,  $a_2$ , and  $a_3$  are related calculation parameters; *Ni* is the number of different types of damage within the surveyed road section;  $W_i$  is a unit deduction for different types of damage.

Table 1. Key evaluation indicators and	grading	g standards for	pavement	performance
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Evaluating Indi	ator -	Evaluation Grade					
Evaluating indicator		Excellent	Good	Average	Inferior and Poor		
Dessent damages	RPCI	$\geq 90$	$\geq 80$	≥70, <80	<70		
Pavement damage	CR (%)	$\leq 0.4$	≤2.6 <i>,</i> <0.4	>2.6, ≤7.8	>7.8		
Demonstration and the	RRQI	$\geq 90$	≥80, <90	≥70, <80	<70		
Pavement driving quality	IR (m/km)	$\leq$ 3.0	>3.0, ≤4.7	>4.7, ≤5.8	>5.8		

2.1.2. Maintenance Measures and Effects

This paper recommends the selection of typical maintenance technologies suitable for rural roads, given their large maintenance scale, complex road shape, low maintenance funds, and low level of mechanization. The recommended measures include five strength grades: P1 (slurry sealing layer), P2 (thin layer cover), P3 (crushed stone regeneration: using a multi hammer crusher to break the old road surface into smaller particle sizes, compacting it with a roller, and then adding a new road structure), P4 (milling and repaving one layer), and P5 (milling and repaving two layers). By calculating the costs of each different maintenance technology and evaluating previous engineering application effects, this paper provides the cost and improvement in pavement damage (RPCI) and driving quality (RRQI) after implementation, as shown in Table 2.

Table 2. Maintenance technology cost and effect after implementation.

Manager	Cost (China RMB)	Life/	Implementation Effect (Improvement Value)		
Measures	¥/m <sup>2</sup>	Year	RPCI	RRQI	
P1: slurry sealing layer	29	2–4	MIN (100, RPCI + 10)	MIN (100, RRQI + 10)	
P2: thin layer cover	90	4-6	MIN (100, RPCI + 10)	MIN (100, RRQI + 10)	
P3: crushed stone regeneration	72	4-6	MIN (100, RPCI + 20)	MIN (100, RRQI + 20)	
P4: milling and repaving 1 layer	134	6—8	100	100	
P5: milling and repaving 2 layers	298	7–9	100	100	

## 2.1.3. Treatment Conditions

When conducting multi-year maintenance planning for rural roads, multiple treatment strategies can be applied for one pavement performance state. This paper uses a decision tree model to analyze and determine the maintenance strategies for county and township roads, selecting RPCI and RRQI as key decision indicators and different strength level measures as treatment plans. By setting reasonable treatment thresholds, decision tree models for the maintenance of asphalt and cement pavements in different combination states are established, as shown in Figures 1 and 2.



Figure 1. Decision tree for rural road asphalt pavement maintenance.



Figure 2. Decision tree for cement pavement maintenance of rural roads.

## 2.2. Analysis of Pavement Performance Development Law

## 2.2.1. Performance Decay Analysis

According to statistical analysis of performance testing data during the life cycle of rural roads in China and relevant literature surveys, road performance shows different attenuation trends when different maintenance opportunities and measures are selected (Yu.J [17] et al. 2015, Stein [18] et al. 2018). Figure 3 summarizes and presents decay curves of road performance under three different treatment strategies: preventive maintenance, functional repair priority, and structural repair priority. The bold curve (a) represents the early use of preventive maintenance techniques such as slurry sealing layer when small pavement damage occurs, resulting in slow performance decay to t1 and corresponding repairs to maintain high road conditions. However, as road age increases, overall pavement performance continues to decline in later stages until the road loses its intended service function. The bold curve (b) represents regular maintenance using techniques like crushed stone regeneration, milling, and repaving one or two layers when the pavement structure is damaged to a certain ex-tent and performance decays to t2 after the early adoption of preventive maintenance strategies to restore it to original technical condition. The bold curve (c) only starts selecting the necessary structural repair measures like milling and repaying three layers for maintenance when pavement performance continues to decline until the severe loss of use function at t3, restoring pavement performance quickly to its original level. This curve has a relatively long degradation period with average overall road performance.



Figure 3. Performance decay curve of rural road pavement.

Based on the above analysis, to address the characteristics of road condition degradation during the life cycle of rural roads, selecting a suitable functional repair priority strategy for curve (b) can maintain the overall performance degradation of road conditions within a reasonable range and achieve long-term stability and preservation of rural road pavement structure.

## 2.2.2. Selection of Typical Road Sections

Considering differences in pavement structure, maintenance history, and traffic volume, rural roads in different regions often exhibit varying decay patterns. Therefore, before analyzing the degradation of rural road pavement performance, typical road sections should be selected based on these differences (Pantuso [19] et al. 2019). This paper selects typical rural road networks in Haimen, Guannan, and Yangzhou in Jiangsu province, China through extensive investigations and divides them into asphalt and cement pavement sections based on structural types. Then, typical road sections are chosen for pavement performance analysis according to the maintenance history of various treatment measures, such as slurry sealing layer, thin layer cover, and crushed stone regeneration. The specific selection of typical road sections is shown in Table 3.

Table 3. Selection of typical sections of rural roads in the Jiangsu province.

Pavement Structure	Maintenance History (Region and Year)		Thickness (cm)	Traffic Level	RIPCI
Asphalt pavement	Original pavement Slurry sealing layer Thin layer cover Crushed stone regeneration Milling and repaving one layer Milling and repaving two layers	K003 + 200-K005 + 300 (Haimen City, 2008) K009 + 100-K010 + 000 (Haimen City, 2020) K006 + 700-K007 + 200 (Haimen City, 2015) K015 + 700-K017 + 200 (Haimen City, 2015) K034 + 900-K036 + 600 (Haimen City, 2015) K049 + 100-K053 + 200 (Haimen City, 2015)	30	Medium	Excellent (94.69)
Cement pavement	Original pavement Slurry sealing layer Thin layer cover Crushed stone regeneration Milling and repaving one layer Milling and repaving two layers	K012 + 000-K016 + 2000 (Guannan County, 2008) K007 + 500-K009 + 000 (Guannan County, 2019) K010 + 500-K013 + 000 (Guannan County, 2019) K016 + 000-K016 + 600 (Guannan County, 2019) K027 + 200-K028 + 400 (Yangzhou City, 2018) K024 + 100-K026 + 500 (Yangzhou City, 2015)	22	Medium	Excellent (92.02)

#### 2.2.3. Determination of Prediction Model

In this section, we aim to establish a reasonable prediction model based on the influence of different treatment measures to evaluate the decay law of pavement conditions with time. In this paper, a large number of detection data of the above-mentioned selected typical sections are analyzed, and combined with the degradation law of rural highway pavement performance, the pavement performance prediction models of rural road RPCI and RRQI based on different treatment measures are established.

#### (1) Prediction model for RPCI

Based on the regular inspection data of rural roads in Jiangsu province from 2016 to 2021, the RPCI data of typical sections of rural asphalt pavement and cement pavement were fitted and analyzed. The main steps include: (1) grouping the inspection data and determining the corresponding initial decay year; (2) determining the basic parameters through data fitting analysis; (3) considering the impact of the internal health condition index RIPCI on the decay pattern of rural road pavement (RIPCI > 90, the decay coefficient is 1, 80 < RIPCI < 90, the decay coefficient is 0.8, 70 < RIPCI < 80, the decay coefficient is 0.6, RIPCI < 70 decay coefficient is 0); (4) according to the verification of other groups of data, optimize and determine the best parameters when the fitting accuracy requirements are met. Finally, RPCI decay models of five different treatment measures, such as slurry sealing layer, thin layer cover, crushed stone regeneration, milling and repaving one layer, and milling and repaving two layers, are established, respectively, as shown in Figures 4 and 5 below.



Figure 4. RPCI decay curve of asphalt pavement in rural roads over time.



Figure 5. RPCI decay curve of cement pavement damage in rural roads over time.

(2) Prediction model for RRQI

Based on the road condition inspection data from 2016 to 2021, the RRQI data of typical sections of asphalt pavement and cement pavement on rural roads in Jiangsu province were fitted and analyzed. The RRQI decay curves of five different treatment levels were established, including slurry seal layer, thin layer cover layer, crushed stone regeneration, milling and resurfacing one layer, and milling and resurfacing two layers, as shown in Figures 6 and 7 below.



Figure 6. RRQI decay curve of asphalt pavement in rural roads over time.



Figure 7. RRQI decay curve of cement pavement in rural roads over time.

#### 2.3. Optimization Methods

## 2.3.1. Decision Optimization Method

In the rural road network maintenance decision-making process, limited budget, complexity, insufficient program efficiency, and low optimization efficiency are common problems (Chen, W [20] et al. 2021). This paper introduces an improved heuristic optimization algorithm to solve these issues. The method is based on changes in pavement performance after maintenance measures are implemented, aiming to ensure optimal decision-making benefits throughout the life cycle (Chu, J. C [21] et al. 2018). By using a set decision-making model and benefit model, this approach determines the combination of maintenance measures that provides the most long-term benefits for each road section, optimizing a decision-making scheme strategy with the best benefits quickly, as shown in Figure 8. The solution process involves (1) determining the maintenance decision plan for each individual maintenance section within the road network one by one, (2)-(3) combining all maintenance road section decision plans to achieve all possible combinations of programs for the entire road network. (4) The optimization process is based on annual budget cost and a pavement performance-based benefit model as the main optimization link. (5) It calculates and determines the benefits and costs of each maintenance measure based on the benefits model, and (6) conducts a comparative analysis of the cumulative benefits of all strategy schemes through optimization algorithms to determine the best maintenance strategy.



Figure 8. Decision steps for an improved heuristic optimization method.

### 2.3.2. Benefit Optimization Calculation

Based on the combination of all road section schemes, the maintenance decisionmaking optimization work is carried out to determine the best maintenance benefit scheme. The research results define the maintenance benefit area as the area enclosed by the pavement performance curve  $y_p$  after treatment measures and the natural attenuation curve y0 of pavement performance without measures, as shown in Figure 9. The Bene\_cost ratio of benefit area to its cost is then taken as the final benefit evaluation value of rural road maintenance.



Figure 9. Schematic diagram of maintenance benefit area.

Considering the performance decay characteristics and benefit influencing factors of rural road pavement, the *Bene\_cost* generated by RPCI and RRQI key performance indicators was calculated, respectively. According to the actual impact degree of each index, it is weighted and summed according to the given weights of 0.65 and 0.35, and the calculation formula of the comprehensive *Bene\_cost* based on moment t is constructed, as shown in Equations (4)–(6) below.

$$COST = L * W * UC \tag{4}$$

$$Bene\_cost_t^i = \begin{cases} \sum_{l=1}^{n_l} \left( \int_{t_0}^t y_p^l - y_0^l \right) / \sum_{l=1}^{n_l} cost_l \sum_{l=1}^{n_l} cost_l \neq 0\\ 0 \sum_{l=1}^{n_l} cost_l = 0 \end{cases}$$
(5)

$$Bene_{cost_{t}} = 0.65 * Bene_{cost_{t}}(RPCI) + 0.35 * Bene_{cost_{t}}(PRQI)$$
(6)

where *COST* is the cost of maintenance; *L* and *W* are length and width, respectively; *UC* is the unit area cost ( $\frac{1}{m^2}$ ); *Bene\_cost* is the maintenance benefit calculated based on performance index *i* for the T year; *l* is the lane number; *n*<sub>l</sub> is the number of lanes;  $y_p^l$  and  $y_0^l$  are the performance curves corresponding to the *l* lane with or without treatment measures taken, respectively.

To improve the calculation efficiency in the process of solution optimization, the improved heuristic optimization method proposed in this paper introduces the allowable deviation variable parameter *D* based on a given budget, and appropriately "relaxes" the cost constraints, as shown in the following formulas (7) and (8), to quickly realize the scheme combination with the best benefit in the whole life cycle.

$$B_t - D_t \le Cost_t = \sum_{i'=1}^m Cost_{i't} \le B_t + D_t , \ t = 1, \dots, T$$
(7)

$$Bene\_cost = \sum_{i'=1}^{m} \sum_{t=1}^{T} Bene\_cost_{i't}$$
(8)

where *m* is the number of road sections;  $B_t$  is the budget for each planning year;  $D_t$  is the maximum allowable deviation from the budget for each planning year.

#### 2.4. Data Preparation of Case Studies

Based on the above research results, this paper takes the typical rural road network in Haimen City, China as an example, and carries out medium and long-term (2023–2036) maintenance planning analysis and research. The road network in this case mainly includes 10 routes, including Rui Min Line, Huo Si Line, Guo Xin Line, S336 San He Duan, Yang Hai Line, Hai Tian Line, S336 San Chang Duan, De Hai Line, Dong Tong Line and Shu Gang Line, with a total length of 280 km and two lanes in both directions (the width of one lane is 3.75 m). The original road condition data for this case comes from the actual test data of the rural road network RPCI, RRQI, and the Rural Road Inner Pavement Condition Index (RIPCI) in Haimen City in March 2022. As shown in Table 4, the pavement performance data of some sections are given.

Route	Lane	Starting Station	Ending Station	RPCI	RRQI	RIPCI	Pavement Type
Rui Min Line	R (1)	K0 + 000	K1 + 000	96.99	95.89	98.32	Asphalt
Rui Min Line	R (1)	K1 + 000	K2 + 000	96.75	96.21	95.15	Asphalt
Rui Min Line	R (1)	K2 + 000	K3 + 000	89.22	91.28	93.65	Asphalt
 D . ) (* 1 *							
Rui Min Line	K (1)	K19 + 000	K19 + 950	90.34	91.12	93.80	Asphalt
Huo Si Line	L (1)	K0 + 000	K1 + 000	91.60	89.93	92.85	Cement
Huo Si Line	L (1)	K1 + 000	K2 + 000	94.64	95.20	93.46	Cement
Huo Si Line	L (1)	K2 + 000	K3 + 000	95.13	96.40	95.21	Asphalt
Guo Xin Line	R (1)	K0 + 000	K1 + 000	92.89	93.71	95.78	Asphalt
Guo Xin Line	R (1)	K1 + 000	K2 + 000	84.26	89.79	95.85	Asphalt
Guo Xin Line	R (1)	K2 + 000	K3 + 000	96.39	93.74	98.45	Asphalt
YangHai Line	R (1)	K0 + 000	K1 + 000	89.41	90.76	95.32	Asphalt
YangHai Line	R (1)	K1 + 000	K2 + 000	91.93	93.34	94.00	Asphalt
YangHai Line	R (1)	K32 + 000	K32 + 160	91.92	92.19	96.26	Asphalt

Table 4. Performance data of typical sections of Haimen rural road.

At the same time, the road performance data are divided into several standard treatment sections with a length of no more than 1000 m according to the above-mentioned rural road performance evaluation grades, as shown in Figure 10.



Figure 10. Planning section of the rural road network in Haimen City.

#### 3. Results and Discussion

Based on the above case data, the budget for different years is calculated by the developed calculation program (the algorithm is realized by system programming), and the results are compared and analyzed to determine the functional maintenance strategy with a reasonable budget and best benefit.

## 3.1. Road Condition Prediction Analysis

According to the existing rural road conditions in Haimen City, the performance requirements in the planning period (the overall average value is not less than 85), and the input costs in previous years. This paper preliminarily selects five annual budget options for decision-making calculation, mainly including plan 1: no budget; plan 2: 5 million (¥); plan 3: 10 million (¥); plan 4: 15 million (¥); plan 5: 5 million (¥); (previous four years: 2023–2026), 10 million (¥) (medium-term five years: 2027–2031), 15 million (¥) (later five years: 2032–2036). As shown in Figures 11 and 12 below, the results of the RPCI grade frequency distribution and predicted value of road surface performance under the optimal strategy of different budget schemes are generated.





2029 2030

Prediction of RPCI Frequency of Rural Roads in Haimen City

(Plan 5: 5million, 10million, 15million)

2031 2032 2033 2034 2035 2036

Planning period T/ye

2023 2024 2025 2026 2027 2028



■ 70-80 ■ 60-70 ■ <60



(d) budget plan 4

**Figure 11.** Frequency distribution of RPCI on rural roads in Haimen City under different budget plans.



Figure 12. Predicted RPCI of rural roads in Haimen City under different budget plans.

At the same time, this paper further predicts and analyzes the pavement RRQI index under different given annual budget plans. Figures 13 and 14 below show the statistical results of RRQI level frequency distribution and performance value in the next 14 years.



Figure 13. Cont.





(d) budget plan 4

![](_page_343_Figure_1.jpeg)

Figure 13. Frequency distribution of RRQI on rural roads in Haimen City under different budget plans.

![](_page_343_Figure_3.jpeg)

Figure 14. Predicted RRQI of rural roads in Haimen City under different budget plans.

According to the above figure, the RPCI and RRQI values of rural road network performance in Haimen City are in a decreasing trend with the increase in the service life of the pavement. By comparing different plans, it is found that with the increase in annual budget investment, the overall performance of the road network gradually improves, and the improvement effect of road surface RPCI compared with RRQI during the planning period is more obvious. When the annual budget reached more than 10 million, the excellent, good, and average grade rate of RPCI and RRQI indicators reached 95%, and the predicted average reached more than 80 points. After adopting the budget investment of plan 5 phased maintenance, its overall road condition performance is at excellent and good levels, and the predicted value is above 85 points.

Therefore, the phased increase in annual budget input according to budget plan 5 is more effective and reasonable than the above-mentioned conservation budget plan. Moreover, the functional priority maintenance strategy has played a significant role in improving the performance of the pavement, which can meet the service level requirements of the municipal road management department for the road network under its jurisdiction during the planning period.

#### 3.2. Optimization Scheme Determination

Based on the analysis results of the prediction effect of different budget plans, this paper selects the limited budget plan 5 as the minimum cost required to meet the maintenance performance requirements of the road network in Haimen City and determines the treatment plan that meets the most benefits in the next 14-year life cycle of the planned road section. As shown in Table 5 below, 171 maintenance sections require maintenance measures during the entire road network planning period (treatment schemes for some sections are given).

Year	Route	Lane	Starting Station	Ending Station	Treatment Measures	Cost (China RMB)/¥	Bene_ Cost
2023	Guo Xin Line	L (1)	K1 + 000	K2 + 000	Milling and repaving 1 layer	502,500	2.82
2023	Dong Tong	L (1)	K3 + 000	K4 + 000	Crushed stone regeneration	270,000	3.77
2023	Yang Hai Line	R (1)	K17 + 000	K18 + 000	Slurry sealing layer	131,250	9.14
2023	Guo Xin Line	R (1)	K1 + 000	K2 + 000	Milling and repaving 1 layer	502,500	2.82
2023	Rui Min Line	R (1)	K7 + 000	K8 + 000	Milling and repaving 1 layer	502,500	2.86
2023	Yang Hai Line	R (1)	K5 + 000	K6 + 000	Milling and repaving 1 layer	502,500	2.90
2023	Rui Min Line	L (1)	K2 + 000	K3 + 000	Milling and repaving 1 layer	502,500	2.92
2023	Rui Min Line	R (1)	K8 + 000	K9 + 000	Milling and repaving 1 layer	502,500	2.86
2024	Rui Min Line	L (1)	K4 + 000	K5 + 000	Milling and repaving 1 layer	502,500	3.36
2024	Yang Hai Line	R (1)	K20 + 000	K21 + 000	Crushed stone regeneration	270,000	4.44
2024	Yang Hai Line	L (1)	K13 + 000	K14 + 000	Crushed stone regeneration	270,000	4.44
2025	Yang Hai Line	R (1)	K8 + 000	K9 + 000	Milling and repaving 2 layer	502,500	3.54
2025	Rui Min Line	L (1)	K15 + 000	K16 + 000	Milling and repaving 2 layer	502,500	3.74
2025	Guo Xin Line	L (1)	K0 + 000	K1 + 000	Milling and repaving 2 layer	502,500	3.54
2036	Rui Min Line	L (1)	K5 + 000	K6 + 000	Milling and repaving 2 layer	1,117,500	0.22
2036	Rui Min Line	R (1)	K2 + 000	K3 + 000	Milling and repaving 2 layer	1,117,500	0.23

Table 5. Treatment scheme for some sections of maintenance planning in Haimen City.

Through the statistics of the above-mentioned maintenance planning results of Haimen City, Figures 15 and 16 give the area and maintenance cost, respectively, of the types of treatment measures taken each year in the whole road network planning period.

![](_page_344_Figure_6.jpeg)

Figure 15. Area statistics of treatment measures in the Haimen rural road planning period.

![](_page_345_Figure_1.jpeg)

Figure 16. Statistics of treatment measures during the planning period of a rural road in Haimen City.

According to the planning scheme and forecast results determined in the above figure, it can be seen that the overall road condition of the Haimen rural road network is good. In the next two years, the maintenance plan will mainly adopt various treatment measures such as a slurry sealing layer, crushed stone regeneration, and milling and repaving one layer. With the increase in pavement service life, pavement performance will be degraded to a certain extent. In view of the possible local typical diseased sections of the pavement, the planning and decision-making results for 2025–2028 mainly adopt milling and repaving one layer to improve pavement performance. Finally, in the middle and late stages of the planning (2029–2036), pavement performance will be greatly reduced, and the decision-making result is that milling and repaving two layers of strong maintenance measures are adopted to maintain the pavement's service level.

## 4. Conclusions

This paper analyzes the current situation of complex rural road networks, large maintenance scales, and limited budgets in China. It explores how to conduct medium and long-term scientific maintenance planning to achieve the best maintenance strategy within the service life cycle. The study concludes:

- (1) Based on the maintenance characteristics of rural roads in China, typical maintenance technologies suitable for different strength grades are analyzed and selected. RPCI and RRQI decision tree models for asphalt and cement pavements are established, proposing maintenance countermeasure sets under different performance combinations.
- (2) Considering the impact of pavement structure, maintenance history, and traffic volume on performance degradation, typical rural road sections in cities and counties like Haimen, Guannan, and Yangzhou in Jiangsu province were selected. By fitting and analyzing a large amount of detection data, RPCI and RRQI pavement performance prediction models based on five treatment grades are established.
- (3) To address the complex solution process of rural road maintenance decision-making, an improved heuristic optimization method is proposed, establishing a model based on pavement performance benefit. Through optimization calculations, a maintenance strategy with the best benefits in the life cycle is quickly generated.
- (4) A case study of ten typical rural road sections in Haimen City, Jiangsu province was conducted to apply long-term maintenance planning from 2023 to 2036. By comparing and analyzing the prediction effects of pavement performance (RPCI and RRQI) under different budget plans, a maintenance strategy with a reasonable budget

and maximum benefit for the planned road section in the next 14 years life cycle is determined, verifying the feasibility and effectiveness of the research model.

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![](_page_348_Picture_0.jpeg)

Review

![](_page_348_Picture_1.jpeg)

## State-of-the-Art Review of Utilization of Microbial-Induced Calcite Precipitation for Improving Moisture-Dependent Properties of Unsaturated Soils

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Abstract: Unsaturated soil is a form of natural soil whose pores are filled by air and water. Different from saturated soil, the microstructure of unsaturated soil consists of three phases, namely, the solid phase (soil particle), vapor phase, and liquid phase. Due to the matric suction of soil pores, the hydraulic and mechanical behaviors of unsaturated soils present a significant dependence on the moisture condition, which usually results in a series of unpredictable risks, including foundation settlement, landslide, and dam collapse. Microbial-induced calcite precipitation (MICP) is a novel and environmentally friendly technology that can improve the water stability of unsaturated soft or expansive soils. This paper reviews the microscopic mechanisms of MICP and its effect on the mechanical properties of unsaturated soils. The MICP process is mainly affected by the concentration of calcium ions and urea, apart from the concentration of bacteria. The moisture-dependent properties were comparatively analyzed through mechanical models and influence factors on the experimental data among various unsaturated soils. It suggests that the variations in resilient modulus and permanent deformation are strongly related to the extent of MICP applied on unsaturated soils. Finally, the problems in the MICP application, environmental challenges, and further research directions are suggested.

**Keywords:** microbial-induced calcite precipitation; unsaturated soils; water retention curve; resilient modulus; permanent deformation

## 1. Introduction

Unsaturated soil is a type of soil consisting mainly of solid particles, a liquid matrix, and pore air. Due to the shrinkage interface between liquid and air, the matrix suction becomes an important structural stress within saturated soil [1]. The mechanical properties of unsaturated soil closely depend on the humidity characteristics [2,3]. The dependence of mechanical behaviors on matric suction or moisture involved in many engineering problems has been reported on in studies of foundation engineering, subgrade engineering, and slope engineering [4–8]. For example, after the soft soil humidifying, the stiffness of the soil subgrades decreased evidently, resulting in the settlement and collapse of the pavement structure. Thus, unsaturated soils should be improved in practice by physical and chemical methods.

The existing soil treatments mainly include dynamic compaction methods and the cement grouting method, but these methods all have certain shortcomings [9,10]. Yao et al. [11] strengthened the collapsible dam foundation by means of the dynamic compaction method, and found that its availability of treatment is limited by construction and geological conditions. The grouting method is often used for soft foundation treatment,

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![](_page_348_Picture_17.jpeg)

**Copyright:** © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). but it uses a large amount of cement and its production would increase the quantity of  $CO_2$  emissions [12]. More and more attention has been placed on reducing  $CO_2$  emissions in the life cycle of engineering practices, with the increasing awareness of people concerned about the environment [13]. These green and low-carbon practices require a novel technology to decouple the dependence of the soil's treatment by cement. Therefore, the microbial-induced calcite precipitation (MICP) technology has become one of the interest points in geotechnical and geological engineering fields in recent years, since it is an environmentally friendly, noiseless, and low-cost approach for improving the engineering properties of unsaturated soil [14,15].

At present, the cement process of MICP could mainly be classified into four types of bio-mineralization reactions [16], including the urea hydrolysis type [17], ferric reduction type [18], sulfate reduction type [19] and denitrification type [20]. Urea hydrolysis is the most efficient and advantageous way to conduct MICP technology, since it has the advantages of simple operation and is easily controllable [21]. In addition, it can quickly produce calcium carbonate precipitates and has a high microbial survival rate without a special nutrient solution [22]. Studies have been conducted to investigate the improvement of soil mechanical behaviors by urea hydrolysis through macroscopic and microcosmic experiments [23,24]. Martinez et al. [25] applied the MICP grouting method on expansive soil columns and found that the swelling potential and hydrophilicity of expansive soil decreased after the treatment of MICP. Salifu et al. [26] demonstrated that the penetration grouting approach of MICP-solidified fluid can improve the stability of soil slopes, since the generated  $CaCO_3$  can fill the volume of the micro-pore structures within soil by 9.9%. Sharma and R. [27] found that the compressive strength of MICP-treated soil was 1.45 to 2.26 times of that of the untreated soil by laboratory tests. Some researchers have reported the effectiveness of MICP treatment on soil mechanical properties, while less considerations and comparisons have been made on the changes of the soil hydraulic properties induced by MICP treatment [28–30]. Specially, it is important to investigate the moisture dependence on the stiffness and deformation of unsaturated soil in subgrade construction.

In this paper, the reaction mechanism of microbial-induced calcite precipitation and its influence on the physical and mechanical properties of unsaturated soil are reviewed. Firstly, the reaction mechanism of urea hydrolysis type MICP technology was introduced, considering different influencing factors, including temperature, PH value, nutrient solution concentration, and calcium ion concentration. Secondly, the structural characteristic and the soil water characteristic curve (SWCC) of unsaturated soil and their influence on the physical and mechanical properties of unsaturated soil are introduced in detail. Thirdly, the changes of the soil microstructure before and after mineralization by MICP technology are analyzed and compared from the macro and micro levels. The influence of MICP technology on the permeability of unsaturated soil and SWCC is also discussed. Furthermore, the relationship between the hydraulic and mechanical properties of unsaturated soil is briefly introduced. Finally, it provides the existing problems, environmental challenges, and further research aspects in the application of MICP.

#### 2. Mechanism of Microbial-Induced Calcite Precipitation (MICP)

## 2.1. Reaction Mechanism of MICP

The MICP is a widely existing bio-mineralization reaction in nature, accompanied by different microbial activities and chemical processes [31]. Different from the mineralization on the geological surface of earth, bio-mineralization refers to the process in which inorganic elements selectively precipitate from the environment to form minerals on a specific organic matrix with the participation of biological cells. This bio driven mineralization reaction mainly occurs in four ways: urea hydrolysis, denitrification, sulfate reduction, and ferric iron reduction [32]. The method of using microorganism-induced denitrification to precipitate calcium carbonate not only has high cultivation cost, but also has low efficiency of generating calcium carbonate [33]. However, it is undeniable that denitrifying bacteria can grow in situ and play a role under anoxic conditions [34]. In the process of

microbial-induced sulfate, the sulfate reduction will produce the hydrogen sulfide gas, which is harmful to the environment and human body [35]. In addition, hydrogen sulfide gas also results in accelerating the corrosion of steel bars in structures. For the ferric iron reduction method, the requirements for the oxidation substrate are very high, meaning that it only works when the solubility of the oxidation substrate is low [36]. The urea hydrolysis method is simple and efficient, given that there is no additional reaction condition and no environmental pollution [37]. Because matrixes (urea and CaCl<sub>2</sub>) have a high solubility in water solution, the MICP process can generate a lot of CaCO<sub>3</sub> in a short time [38]. Scholars generally believe that MICP using urea hydrolysis has an enormous potential in soil treatment [39]. In addition, among all biochemical reactions, the reaction of urea hydrolysis is a main technological path to produce ammonium ions and carbonate ions, and its reaction process is relatively simple. Therefore, the reaction mechanism of urea hydrolysis MICP was taken as an example in the following section.

#### 2.2. Reaction Mechanism of Urea Hydrolysis MICP

Chuo et al. [40] found that 17–30% of bacteria collected from Australia can hydrolyze urea rapidly. The Bacillus pasteurii (BP) has a high urease activity within soil and has been widely used in the MICP treatment [41]. During its metabolism, its cell secretes a large amount of urease to produce adenosine triphosphate (ATP), which promotes the catalytic hydrolysis of urea to produce ammonium and carbonate ions. Meanwhile, the PH value in the system increases in this process. Due to the presence of calcium ions, carbonate ions and calcium ions gradually modulate to form CaCO<sub>3</sub> precipitation. The reaction equation of urea hydrolysis is shown in Equations (1)–(5) [42].

$$CO(NH_2)_2 + H_2O \xrightarrow{\text{urease}} NH_2COOH + NH_3$$
 (1)

$$NH_2COOH + H_2O \rightarrow NH_3 + H_2CO_3$$
 (2)

$$H_2CO_3 \to 2H^+ + CO_3^{2-}$$
 (3)

$$NH_3 + H_2O \rightarrow NH_4^+ + OH^- \tag{4}$$

$$Ca^{2+} + CO_3^{2-} \to CaCO_3 \downarrow \tag{5}$$

The details of the urea hydrolysis of CaCO<sub>3</sub> precipitated by BP are shown in Figure 1. When BP metabolizes to produce urease, it will secrete a metabolite called bail polymer. Due to the existence of the double electric layer structure of the extracellular polymer and its microorganism, the microorganism tends to adsorb on the surface of the sand particles. Because of the negatively charged functional groups such as hydroxyl, amino, amido, and carboxyl, the surface of the microbial cell wall is also negatively charged and constantly attracts calcium ions in the environment, meaning that a large number of calcium ions gather on the cell surface. The carbonate formed after hydrolysis of urea will form CaCO<sub>3</sub> precipitation with these calcium ions and envelop the bacteria [43]. From the whole reaction process, it can be found that bacteria mainly play two roles: the core of which is to provide urease, and the other is to provide crystal nuclei for the formation of CaCO3 crystals [44]. The reaction equation of urease bacteria is displayed in Equations (6)–(10) [45].

$$CO(NH_2)_2 + 2H_2O \rightarrow H_2CO_3 + 2NH_3(g) \tag{6}$$

$$H_2CO_3 + 2NH_3 \leftrightarrow 2NH_4^+ + 2OH^- \tag{7}$$

$$H_2CO_3 \to H^+ + HCO_3^- \tag{8}$$

$$HCO_3^- + H^+ + 2OH^- \leftrightarrow CO_3^{2-} + 2H_2O \tag{9}$$

$$Ca^{2+} + CO_3^{2-} \leftrightarrow CaCO_3(s)$$
 (10)

![](_page_351_Figure_1.jpeg)

Figure 1. Sketch map of microbial-induced carbonate deposition process on particle surface.

#### 2.3. Influencing Factors of MICP Reaction

The essence of MICP technology is to induce microorganisms to generate CaCO<sub>3</sub> precipitation between the gaps within soil to achieve the role of bio-cementation and treatment of soil. However, MICP technology will be limited and constrained by many factors in actual operation [46]. The factors that influence the treatment effect of MICP technology contain temperature, PH value, bio-cement concentration, calcium ion concentration, nutrient solution (urea) concentration, and soil particle size [47]. Mortensen et al. [48] showed that the influencing factors were in the order from large to small as temperature, concentration of bio-cementing fluid, nutrient solution concentration, PH value, and calcium ion concentration, respectively, through single factor and orthogonal tests. Sotoudehfar et al. [49] used the optimized orthogonal test method to explore the influence of various parameters in the process of MICP on the curing effect. The results showed that the curing time had the greatest influence on the curing effect, and the bacterial cell concentration, molar concentration ratio of nutrient solution, and the liquid injection flow rate had similar influences on the curing effect.

#### 2.3.1. Temperature and PH Value

Temperature is the key factor in the success of MICP technology on soil treatment [50]. A change in temperature will affect the growth of bacteria, the activity of microbial enzymes, the biodegradation of bacteria, and the process of binding precipitation, thus affecting the final curing effect. Figure 2a shows the changes of urease and growth activities of BP at different temperatures. An absorbance index at the 600 nm wavelength (OD600) was wildly applied to evaluate the density and growth activity of the BP solution. It found that the growth curve of BP was different when the temperature varied from low to high [51]. It is generally believed that the growth of BP is inhibited at low temperatures, while the urease activity of BP decreases at high temperatures [52,53]. Therefore, the BP should be cultivated under a suitable growth environment (temperature).

In addition to the temperature, urease activity of BP is an important factor. The decrease in enzyme activity will lead to an insufficient precipitation of CaCO<sub>3</sub>. Kim et al. [54] found that the suitable temperature for the growth of BP Sarcina was 30 °C, at which the strain propagated rapidly and produced high urease activity. When the temperature was less than 10 °C, the urease activity was almost lost. Furthermore, since the urease activity is affected by temperature, Xiao et al. [55] demonstrated that CaCO<sub>3</sub> crystals generated in soil samples had a good homogeneity by grouting at low temperature.

![](_page_352_Figure_1.jpeg)

Figure 2. Changes of urease activity influenced by (a) Temperature (b) PH value.

PH value is one of the important influencing factors on microbial life activities. Its influence is mainly reflected in three aspects: First, it affects the biological activity of macromolecular substances (such as proteins and nucleic acids) by changing their charge. Second, it reduces the absorption and utilization of nutrients by microorganisms by changing the charge of cell membrane. Third, it also reduces the utilization effectiveness of nutrients in the living environment of microorganisms and enhances the toxicity of harmful substances [56]. Figure 2b shows the changes of urease activity with the increasing PH value.

#### 2.3.2. Bio-Cementing Liquid Nutrient Solution Concentration

Bio-cementitious fluid plays an important role in microbial soil treatment. Biocementing liquid shall be used in the reaction of microbial-induced CaCO<sub>3</sub> deposition, which has a direct impact on the treatment effect [57]. From the MICP principle, the increase in calcium ions and urea in the bio-cementing solution will precipitate more CaCO<sub>3</sub>. In the current research, the bio-cementing fluid generally includes urea and calcium chloride, but the selection of parameters such as bio-concentration, number of rounds, and ratio are different [58]. Cui et al. [59] believed that the bio-concentration of bio-cementing fluid had a significant impact on the treatment effect. Meanwhile, the low bio-concentration was helpful to obtain higher treatment strength, and the size of generated CaCO<sub>3</sub> crystal was also large [46]. Cheng and Cord-Ruwisch [60] found that a too low bio-concentration of bio-cement solution will lead to insufficient CaCO<sub>3</sub> and will affect the treatment effect.

## 2.3.3. Nutrient Solution Concentration

Mujah et al. [61] found that changing the nutrient solution can affect the nucleation rate and the size of CaCO<sub>3</sub> crystals. Meanwhile, the effect of nutrient solution on different environments was also different. Wong [62] added urea to the culture medium to increase the precipitation rate of CaCO<sub>3</sub>, which can overcome the inhibition of solidification under low temperature environments. The adding urea does not only increase the urease activity, but also will cause the soil to become alkaline, thus inhibiting the growth of microorganisms [63]. The high urea content causes the uneven distribution of overall precipitation crystals, resulting in the low strength of soil. Zhao [64] found that the concentration of the nutrient solution has an important impact on the shear strength of solidified muddy soil. With the increasing concentration of the nutrient solution, the internal friction angle first increases and then decreases, and the optimal concentration of the corresponding optimal nutrient solution is 1.60 mol/L. Soon et al. [65] found that the bio-cementation effect will reach a peak value with the change in nutrient concentration, according to which the most appropriate nutrient concentration can be obtained. In addition, cells will shrink due to water loss under a high salt environment, thus affecting the physiological and biochemical reaction process of microorganisms. Therefore, the concentration of nutrient solution is very important in the study of microbial solidification of soil. Whiffin et al. [66] found that the activity of bacterial urease decreased significantly, almost linearly, with the increase in calcium ion concentration, indicating that a high concentration of calcium ions have an evident inhibition on urease under this condition.

In conclusion, the output of  $CaCO_3$  is positively related to the concentration of nutrient solution within a certain range, but high concentration inhibits the microbial induced  $CaCO_3$  generation. At low concentration, the microbial induced  $CaCO_3$  is smaller and more evenly distributed in the soil.

#### 2.3.4. Calcium Source and Its Concentration

The BP cells can be regarded as a formation site to produce  $CaCO_3$  precipitation [67]. The MICP reaction process in Figure 1 indicated that the carbonate ions generated by the urea decomposition of BP will be continuously transported from the intracellular to the extracellular and meet with calcium ions in the environment. Therefore, the PH value of calcium sources and the concentration of calcium ions affect the rate, quality, and output of CaCO<sub>3</sub> crystals produced in the MICP process. Achal and Pan [68] compared the effects of four calcium sources on BP-induced CaCO3 precipitation, and proposed that calcium chloride is a better calcium source in the MICP process, followed by calcium nitrate. Cheng et al. [69] took seawater as the bio-cementing fluid to conduct MICP process, and the results showed that the strength of samples maximized after 200 grouting times, since calcium ion concentration was low in seawater. The  $Ca^{2+}$  concentration is very important for the precipitation and precipitation efficiency of CaCO<sub>3</sub> crystals. Okwadha and Li [70] found that high concentrations of urea and CaCl<sub>2</sub> (more than 0.5 mol/L) reduces the deposition efficiency of calcium carbonate, and urea and CaCl<sub>2</sub> can improve the deposition efficiency of calcium carbonate at low concentrations (0.05–0.25 mol/L). From the current test results, a too low or too high calcium ion concentration cannot have the corresponding calcite yield. The calcium ion concentration should be optimized by laboratory tests to effectively bio-cement the test medium together by MICP calcite.

Based on the above reviews, the MICP technology results from the metabolic processes of bacteria including urease-producing bacteria, sulfate-reducing bacteria, denitrifying bacteria, and oxidizing bacteria. Although the type of bacteria and the reaction mechanism may be different in the MICP application, both the nutrient solution and the calcium source are necessary to generate  $CaCO_3$  (calcite). Therefore, the MICP is mainly affected by the concentration of calcium ions and urea.

## 2.4. Application of MICP in Engineering

The MICP technology comes from the development of microbiology and geotechnical engineering, and is a novel technology with ecologically friendly and sustainable advantages [23]. Now, the technology has achieved good results in engineering applications, including soil treatment, seepage prevention, and cracking repair.

Many scholars have proved that MICP plays a significant role in soil treatment through experimental tests [71–73]. For example, compared with untreated expansive soil samples, it found that the swelling rate of soil samples after MICP mixing treatment was significantly reduced [25]. Sharaky et al. [74] found that the unconfined compression resistance of treated clay samples increased nearly three times through the MICP pressure grouting treatment test of clay. Yasuhara et al. [75] used MICP technology to strengthen the sand and premixed method. The so-called premixing method refers to the use of the mixing method and unconfined compressive strength test to make the reaction liquid better contact with the soil. Compared with other methods, the advantage of this method is that it can make CaCO<sub>3</sub> uniformly distributed in the soil.

The CaCO<sub>3</sub> generated by MICP technology can also fill the pores of the solidified soil and further reduce permeability to achieve the purpose of plugging [76]. A plugging test of MICP was conducted on fly ash modified concrete using giant bacillus [28]. The results suggested that the calcite precipitation between the aggregate and the bio-cement mortar was a primary reason for reducing the permeability of samples. Liu et al. [77] also demonstrated that as the CaCO<sub>3</sub> precipitate is induced by MICP, it plays a role in bio-cementing soil samples, since it fills cracks among soil particles. Wiktor and Jonkers [78] used an energy dispersive spectrometer to observe the status of concrete cracks repaired by MICP, and their results showed that a crack of the width of 0.46 mm was completely healed after 100 days of repair, which was much larger than that of 0.18 mm in the control group. Algaifi et al. [79] found that the MICP has an advantage in the self-healing of cracks in bio-cement slurry by the theoretical model and microscopic test.

In general, the usage of MICP technology can effectively repair cracks, but it is undeniable that the time period for treatment and repair is long. Subsequent research should be carried out to develop a more efficient and faster MICP technology in the material source and reaction processes.

#### 3. Unsaturated Soil

## 3.1. Characteristic of Unsaturated Soil

The unsaturated soil exists widely in nature since most of the soil above the groundwater level is in an unsaturated state. Due to the differences in the medium and molding method, the soil has special structure and stress state. There are two types of theory frames to describe mediums in unsaturated soil. Figure 3a considers the unsaturated soil as a threephase soil, including a solid phase (soil particles and some bio-cementitious substances), a liquid phase (water and aqueous solution), and a gas phase (air and water vapor, etc.). However, with the further study of unsaturated soil mechanics, unsaturated soil is considered as a four phase structure [80]. In addition to the solid, liquid, and gas three-phases, the liquid gas interface is also added as an independent phase. This independent phase can also be called the bound water membrane, as shown in Figure 3b. The nature of the liquid gas interface is not only different from that of water, but also different from that of gas. It is an independent phase. This phase is called the shrink film in surface chemistry. The morphology of the water pores and gas pores of unsaturated soil is closely related to the water content (saturation) of unsaturated soil [81].

![](_page_354_Figure_6.jpeg)

Figure 3. Schematic diagram of mediums in unsaturated soil: (a) solid liquid gas three phase system; (b) four phase diagram.

The unsaturated soil can be divided into four types: fully connected gas phase, partially connected gas phase, internally connected gas phase, and completely closed gas phase. When the gas phase in the pores exists in a fully connected way, the gas permeability has nothing to do with the water content. With the increase in the water content, the effective stress of the soil mass gradually reduces the volume of gas in the pores. A semi closed or closed bubble is formed, and the pore gas exists in a partially connected or internally connected state. At this time, the suction of soil decreases gradually, and the effective stress of soil should consider the influence of pore air pressure and pore bearing pressure, respectively. When the water content in the soil is very high, the gas phase is completely surrounded by liquid, small in volume, and can only flow with the liquid, which can be regarded as a two-phase system with air and water. At this time, the soil mass is basically saturated, the air permeability of the soil is very small, the suction is basically zero, and the effective stress of the soil mass is the same as that of the saturated soil.

Duan et al. [82] pointed out that the shape of unsaturated soil is more complex than that of saturated soil, and this complex medium composition has an important impact on the strength, deformation, and seepage of soil. Given that the structure of water pores and gas pores in unsaturated soil plays a key role in its engineering properties, the effect of the matrix suction and water content on the properties of unsaturated soil should be further studied.

#### 3.2. Soil Water Characteristics of Unsaturated Soil

Matrix suction is the main reason why unsaturated soil is different from saturated soil, and it is also a key factor to reflect the mechanical properties of unsaturated soil [83]. The SWCC is a conceptual and interpretative tool to describe the soil water holding capacity when water content changes with suction [84]. SWCC defines the relationship between suction (matric suction), volume water content ( $\theta$ ) or saturation (*Sr*) of unsaturated soil. A typical SWCC is shown in Figure 4 (determined by the change in water content). The suction state (abscissa of the SWCC) can be expressed by the total suction of the soil water potential. In the high humidity state, the matrix suction ( $u_a - u_w$ ) is used, and in the low humidity state, the total suction is used. Since there is little difference between the total suction value and the matrix suction in the low humidity state, the entire SWCC is often expressed by the matrix suction.

![](_page_355_Figure_5.jpeg)

Figure 4. Typical water retention curve.

When the soil changes from a saturated state to a dry state, the distribution of solid, liquid, and gas phases in the soil will also change with the change in stress state. The relationship between these phases has different forms and affects the engineering properties of unsaturated soil. In some cases, the properties may be mainly related to the volume of the separated phase (such as water content), or to the continuity and curvature of the liquid phase (such as permeability coefficient, molecular diffusion), or to the gas phase (such as evaporation coefficient or diffusion coefficient). In other cases, the properties of interphase contact areas that control stress transmission (such as shear strength and volume change) or interphase mass transfer (such as chemical adsorption and volatilization) determine soil properties. The relationship between these phases can be derived from the data of the SWCC, which can then be used to estimate the parameters of unsaturated soil [85].

In the SWCC measure, the saturated water content A can be obtained by tests, while the residual water content B is often difficult to determine, influenced by the instrument precision and soil properties. Therefore, some SWCC models have been proposed to predict the result of the SWCC. The widely used expressions of SWCCs are displayed in Equations (11)–(13).

$$\ln \psi = a + b \ln \theta \tag{11}$$

$$\theta = \left[\frac{1}{1+q\psi^n}\right] \tag{12}$$

$$\theta = \left[\frac{1}{1 + \left(a\psi\right)^n}\right]^m \tag{13}$$

where  $\psi$  is suction;  $\theta$  is the volume water content; and *a*, *b*, *q*, *n*, and *m* are fitting parameters.

#### 3.3. Mechanical Properties of Unsaturated Soil

SWCC is closely related to the strength of unsaturated soil and is an important tool to study the mechanical properties of unsaturated soil. More specifically, SWCC describes the relationship between the thermodynamic potential energy of pore water in soil and the amount of water absorbed by soil system. The SWCC shape of various soils is mainly affected by the properties of soil materials. Fredlund and Xing [86] carried out a large number of tests on different types of unsaturated soils, and showed that the main factors affecting SWCC are mineral composition, pore structure, stress state of soil particles, property of liquid, pore gas, etc.

Many researches have been performed to explore the relationship between water content and mechanical properties of unsaturated soil [87]. The shear strength formula of unsaturated soil can be proposed by Bishop effective stress. It is related to saturation *S*, which is closely related to SWCC.  $\varphi^b$  is also closely connected with different sections of SWCC, thus it can  $\chi$  horn  $\varphi^b$  to simplify the test measurement and facilitate the engineering application.

Lamborn [88], based on the expanded micromechanical model, proposed the shear strength formula of unsaturated soil as follows:

$$\tau_f = c' + (\sigma - u_a) \tan(\varphi') + (u_a - u_w)\theta_w \tan(\varphi')$$
(14)

$$c_s = (u_a - u_w)\theta_w \tan(\varphi') \tag{15}$$

where  $\tau_f$  is the shear strength of unsaturated soil; c' and  $\phi'$  are effective cohesion and effective internal friction angle of saturated soil;  $(u_a - u_w)$  is the matrix suction;  $(\sigma - u_a)$  is the net normal stress; and  $\theta_w$  is the volume water content.

Vanapalli et al. [89] developed a comment model for predicting the shear strength by SWCC, as shown in Equations (16) and (17).

$$\tau_f = c' + (\sigma - u_a) \tan(\varphi') + (u_a - u_w) \Theta^{\kappa} \tan(\varphi')$$
(16)

$$c_s = (u_a - u_w)\Theta^{\kappa} \tan(\varphi') \tag{17}$$

where  $\Theta$  is the relative volume water content,  $\Theta = \theta_w / \theta_s$ ;  $\theta_s$  is the saturated volume water content; and  $\kappa$  is a fitting parameter.

Garven and Vanapalli [90] introduced the plasticity index  $I_p$  into the fitting model of the parameters  $\kappa$ , as follows:

$$\kappa = -0.0016I_p^2 + 0.0975I_p + 1 \tag{18}$$

Furthermore, the numerical simulation provides new insights into moisture and stress of unsaturated soil [91]. Liu et al. [92] analyzed the changes of the yield stress with the capillary cohesion between particles by simulating isotropic compression and biaxial shear tests. Jiang et al. [93] proposed two shear strength functions to reflect both the nonlinear characteristics of unsaturated soil and the influence of grain size distribution. Richefeu et al. [94] found that the density of the liquid bond is a decisive parameter for the overall cohesion of wet granular materials. Within the distance of the liquid bridge fracture, even at low water content, the uniform distribution of liquid will lead to the highest cohesion. Scholtès et al. [95] introduced the micromechanics study of unsaturated granular media in the state of the pendulum liquid bridge.

The resilient modulus (MR) of the subgrade is a key parameter to design pavement structures. The MR of unsaturated soil is dependent on the humidity state of subgrades [96]. In the range of low matric suction, the MR increases nonlinearly with the increase in matric suction; however, this trend cannot continue to a higher matric suction range [97]. Ceratti et al. [98] found that the dynamic resilient modulus of red clay increases with the increase in matrix suction when the matrix suction is less than 1 MPa, and the increase in dynamic resilient modulus is not evident when it exceeds this value. This phenomenon may be due to the larger wetted contact area between soil particles and the more significant contribution of matrix suction to soil strength and stiffness when it is in the low matrix suction range. In the higher matrix suction range, the water content is evidently less, and the wetted contact area of soil particles is limited, which limits the effect of matrix suction on the MR.

#### 4. Influence of MICP on Properties of Unsaturated Soil

### 4.1. Microstructure of MICP Unsaturated Soil

The micro bonding form determines the mechanical properties such as macro strength, to a certain extent. At present, the main ways to study the microstructure of soil are X-ray diffraction analysis and scanning electron microscope (SEM) observation [99]. Xiao et al. [100] carried out SEM analysis to observe the changes in the product morphology and microstructure of MICP soil. Figure 5 presents the microscopic morphology of untreated sand soil using SEM. It shows that there are a few clay minerals attached to the surface of soil particles in the untreated soil, and no evident CaCO<sub>3</sub> crystals are found. The SEM results of MICP-treated sand soil are shown in Figure 6. It is evident that a large number of CaCO<sub>3</sub> crystals are generated in the shape of parallelepiped calcite, and the size of crystals is 1–10  $\mu$ m. Cheng et al. [101] explored the relationship between the concentration of the bacteria solution and the concentration of the bio-cement solution in the MICP process from a microscopic perspective. Some of the CaCO<sub>3</sub> crystals were dispersed in the soil pores and played the role of filling pores among soil particles. It was proved that the CaCO<sub>3</sub> crystal played a role in bio-cementing soil particles.

![](_page_357_Figure_6.jpeg)

Figure 5. Micromorphology of untreated sand soil: (a) pore; (b) flaky clay mineral.

Elmaloglou et al. [102] observed the microscopic morphology of the MICP of the experimental device under different solid particle compositions. It was found that the CaCO<sub>3</sub> crystals mainly play the role of encapsulation and can evenly fill the internal pores of soil samples. The permeability of ordinary sand can be reduced by three orders of magnitude due to the CaCO<sub>3</sub> in the pores after treatment. Porter et al. [103] investigated the morphology of the sand column after curing with BP and found that CaCO<sub>3</sub> played a bio-cementing role in greatly improving the connection strength between sand grains. SEM results show that a layer of white and dense hardened shell formed on the surface of

the modified soil sample, and the generated  $CaCO_3$  presented a lamellar cleavage [104]. In addition, given that the solubility of  $CaCO_3$  is small, the MICP process is very helpful to improve the water stability of soil.

![](_page_358_Figure_2.jpeg)

Figure 6. Micromorphology of sand soil after treatment: (a) filling pore; (b) cementation.

#### 4.2. Permeability of MICP Unsaturated Soil

The CaCO<sub>3</sub> crystals deposited in the soil reduced the porosity (or porosity) of the soil. Phillips et al. [105] showed that the permeability of the rock cracks filled with biocementation decreased by about four orders of magnitude. The water pressure of the repaired rock cracks was about three times higher than that of original rock cracks. In addition, the field results showed that the permeability of the rock fractures decreased significantly within a few square meters around the injection well [106]. Wang et al. [107] suggested that the CaCO<sub>3</sub> precipitation generated divides the large voids in the soil sample into many small voids, which makes the internal distribution of the sample more uniform and reduces the seepage channel in the soil sample. Ferris et al. [108] found that the permeability of the surface decreased by 50% after 45 h, while the soil pores were almost completely blocked after 120 h. They concluded that the permeability coefficient of the soil sample was determined by the content of CaCO<sub>3</sub> in the soil sample. Figure 7 shows the schematic diagram of the MICP soil structure during water infiltration. There were three aspects resulting in the permeability decrease in soil: (1) the generated  $CaCO_3$  crystals occupied the void space, which was caused by the reduction in porosity; (2) the interspace or pore throat was blocked by crystals; (3) the bioblockage caused by the production amount or related metabolites. Ivanov and Chu [15] found that some CaCO<sub>3</sub> precipitations do not contribute to contact bio-cementation, since these carbonates were either randomly crystallized on the soil particles or precipitated on the formed carbonate bridges. In conclusion, the permeability of soil samples was improved by MICP, since pores within soil were blocked by the formation of CaCO<sub>3</sub> crystals and the metabolism of microorganisms.

![](_page_358_Figure_6.jpeg)

**Figure 7.** MICP soil infiltration diagram: (**a**) MICP soil diagram before wetting, (**b**) water infiltration into the pores, (**c**) saturated state.

## 4.3. Water Holding Capacity of MICP Unsaturated Soil

MICP technology mainly changes the water holding capacity of unsaturated soil by generating CaCO<sub>3</sub> precipitation to bio-cement soil particle pores [109]. Bo et al. [110] compared the water absorption of soil samples before and after treatment with MICP technology and found that the water absorption of soil samples after treatment is far greater than that of untreated soil. MICP treatment significantly improved the soil water holding capacity and anti-cracking capacity. Figure 8 shows the SWCCs of plain soil, and improved expansive soil are compared under the conditions of compactness of 90% and 95%, respectively. Results show that the pore will become smaller with the increase in compaction degree, thus changing the water holding capacity of soil samples. The SWCC of soil improved by MICP technology changes greatly compared with that of expansive soil before treatment, and the saturated water content of soil improved by MICP technology is higher than that of plain soil. It indicated that the volume of water content of the improved expansive soil changes less under the same matrix suction change, the water holding capacity was stronger, and the water stability was better.

![](_page_359_Figure_3.jpeg)

**Figure 8.** Comparison of SWCCs between plain soil and MICP improved soil with compactness of (a) 90% and (b) 95%.

#### 4.4. Static Mechanical Behavior of MICP Unsaturated Soil

In the existing research, many scholars have studied the change in soil properties after improvements from various aspects. Wani and Mir [111] investigated the mechanical property of soft soil treated by MICP through unconfined compression tests and found that the strength of MICP soil increased by 3–3.5 times more than that before MICP process. Van Paassen [112] found that the compressive strength of MICP sand was exponential with the amount of CaCO<sub>3</sub>. Khaleghi and Rowshanzamir [113] finally found that the compressive strength increased by 300 KPa and the permeability decreased significantly after the sand was solidified by MICP. Lian et al. [114] strengthened the sand column by biological grouting. Its unconfined compressive strength reached 1.91 MPa, and the permeability coefficient decreased by three orders of magnitude. Putra et al. [115] added magnesium to optimize the precipitation rate and generation content of CaCO<sub>3</sub> precipitation, and the test results showed that the maximum uniaxial compressive strength obtained from the treated sample was 0.6 MPa. Yang et al. [116] found that the improvement of hardness and expansibility of remolded biological treated sand was caused by the particle roughness of CaCO<sub>3</sub> coating. Compared with untreated sand, the shear strength was improved. Pakbaz et al. [117] concluded that the shear strength of the samples after MICP treatment increased by 44–86%, since the  $CaCO_3$  coating improves the compactness and internal friction angle of the samples.

Chittoori et al. [118] demonstrated that the shear strength and unconfined compressive strength of expansive soil had been significantly improved after improvement by the MICP method; the plastic limit water content of expansive soil had increased; the liquid limit water content, plastic index, and expansion rate had decreased; and the microstructure
had changed significantly. Therefore, MICP technology is an effective technical means to improve the compressive strength, shear strength, and free expansion rate of unsaturated soil through laboratory tests. Figure 9a is the change in shear stress with the normal stress of soil samples before and after MICP treatment. It shows that the shear strength of expansive soil after MICP treatment has been significantly improved, and the increase in cohesive force of expansive soil samples before and after treatment is far greater than the increase in the internal friction angle. Figure 9b presents the change in shear strength with the curing days of MICP. It can be seen that MICP technology will significantly improve the shear strength of soft soil, and its shear strength will gradually increase with the increase in curing days (3d–21d).



**Figure 9.** Curves of shear strength for (**a**) comparison between MICP-treated and untreated expansive soils; (**b**) different MICP-treated days.

## 4.5. Resilient Modulus of MICP Unsaturated Soil

The MR of soil describes the resilient deformation characteristics of soil subgrades under dynamic traffic loads [119]. In the MICP process, CaCO<sub>3</sub> precipitation bio-cemented the soil particles and filled the pores between soil particles, leading to the increase in coarse particle content and the decrease in fine particle content in soil. Therefore, with the decrease in fine particle content, the dynamic resilient modulus of improved soil increases. In order to achieve biological stability, Moradi et al. [120] adopted the microbial-induced calcite precipitation (MICP) method. The result shows that the elastic behavior of the treated finegrained soil was similar to that of coarse grained soil, and the MR of treated soil evidently increased. Bing et al. [121] found that the sensitivity of the MR of the stabilized fine sand to confining pressure decreases when the content of  $CaCO_3$  increases. The increase rate of the MR of the saturated stabilized soil is greater than that of the unsaturated stabilized soil. The reason for this structure is due to the improvement of MICP technology. The generated CaCO<sub>3</sub> crystals will block and bio-cement the soil particle pores, and the pore volume will decrease with the increase in CaCO<sub>3</sub> content. Soil particles can contact closely through CaCO<sub>3</sub> crystals, and the MR increases accordingly. Figure 10 shows the relationship between dynamic MR and CaCO<sub>3</sub> output. It can be seen from the figure that the output of CaCO<sub>3</sub> is closely related to the dynamic MR. The minimum value of dynamic MR increases by about 50% at most, and the maximum value increases by about 66.8%.



Figure 10. Dynamic resilient modulus with different CaCO<sub>3</sub> production.

After microbial improvement, it can be found that there is evident CaCO<sub>3</sub> precipitation between soil particles. CaCO<sub>3</sub> deposits on the surface of soil particles, forming bio-cement points and connecting soil particles. These bio-cements can be bio-cemented into larger aggregates, which enhances the connection ability between soil particles and improves the stability of soil particles. Therefore, the structural strength of the soil sample is improved, and the physical and mechanical properties of the soil sample are improved.

The comment model for predicting MR is shown in Equation (19) [122]. The dynamic resilient modulus of subgrade soil is affected by factors such as soil type, soil physical properties, stress state, and humidity state.

$$M_R = k_1 P a \left(\frac{\theta}{P_a}\right)^{k_2} \left(\frac{\tau_{\text{oct}}}{P_a} + 1\right)^{k_3}$$
(19)

where  $M_R$  is the dynamic resilient modulus (MPa); Pa is the atmospheric pressure, and the reference value is 101.3 kPa;  $\tau_{oct}$  is octahedral shear stress; and  $k_1$ ,  $k_2$ , and  $k_3$  are all model parameters, which meets  $k_1 \ge 0$ ,  $k_2 \ge 0$ ,  $k_3 \le 0$ .

Combined with the research on the mechanical properties of MICP improved soil [123], the influence of soil type, water content, thousand density, and plasticity index on the dynamic resilient modulus of improved soil was analyzed. Previous studies found that the model parameters ( $k_1$ ,  $k_2$ ,  $k_3$ ) decreased with the increase in water content. With the decrease in plasticity index, model parameter  $k_1$  decreases and  $k_2$  and  $k_3$  increase. Similarly,  $k_3 \leq 0$ , and the influence of the plasticity index on  $k_1$  and  $k_3$  is different from that on  $k_2$  [123]. Therefore, after improving by MICP method, the hydrophilicity of soil is weakened, and the variation range of water content is reduced. The plasticity index of soil is significantly reduced after improvement by the MICP method. Evidently, compared with the unmodified soil, the dynamic resilient modulus of the improved soil increases.

## 5. Conclusions and Suggestions

Microbial-induced calcite precipitation (MICP) is an emerging technology in recent years, which is widely applied in geotechnical and environmental engineering. This study reviews the microcosmic mechanism of MICP technology including the metabolic reactions of bacteria and changes of soil microstructures. Compared with temperatures and PH values, the nutrient solution concentrations and calcium ion concentrations are the main factors influencing the MICP process, since they are necessary for the survival of bacteria and CaCO<sub>3</sub> formation. MICP technology can improve the water stability of soft soil, since the soil particles will be covered by a layer of white and dense hardened shell of CaCO<sub>3</sub> after treatment, and the water solubility of CaCO<sub>3</sub> is very small. Meanwhile, the permeability of soil samples decreases after the MICP process, given that pores within soil are also filled by CaCO<sub>3</sub> crystals. These phenomena result in the improvement of the mechanical properties of unsaturated soils. The shear strength of soft soil increases with the MICP curing times. Due to the bio-cementation process of soil particles, the structural strength of the soil sample is improved. Based on the prediction model of resilient modulus, since the fitting parameters increase when the water content decreases, the dynamic resilient modulus of the MICP-treated soil is larger than that of the untreated soil.

As far as the progress of MICP technology mentioned above, there are still some problems that need to be solved urgently.

- (1) The current research focuses on the improvement in mechanical properties of sand soil treated by MICP, but long-term water stability is lacking attention. In addition, the effect of the MICP process on the acid resistance, frost resistance, erosion resistance, and the other durability's of unsaturated soil should be further studied.
- (2) The diversity and complexities of actual environmental conditions requires the MICP technology to have a corresponding adaptability. Therefore, an environmental adaptability study should be performed for the application of MICP technology.
- (3) Although MICP is more environmentally friendly than other treatment approaches of soil, there are still some harmful products emitted to the environment, for example, the ammonia produced by urea hydrolysis. Thus, subsequent research should be conducted in a more environmentally friendly direction or to find suitable methods to reduce the impact of the generated waste on the environment.
- (4) In the existing literature, the methods of using MICP technology mainly include mixing, grouting, and soaking. However, both mixing and soaking are limited by construction conditions in engineering practice. Thus, further research work can be attempted in the field test section to find a better way to apply the MICP technology.

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