



Article The Subadult Virtual Anthropology Database (SVAD): An Accessible Repository of Contemporary Subadult Reference Data

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Abstract: The Subadult Virtual Anthropology Database (SVAD) is the largest available repository of contemporary (2010–2019) subadult reference data from around the world. It is composed of data collected from individuals aged between birth and 22 years. Data were collected from skeletal remains (n = 43, Colombia) and medical images (n = 4848) generated at medical examiner's offices in the United States (full-body Computed Tomography (CT) scans), hospitals in France, The Netherlands, Taiwan (region-specific CT scans), and South Africa (full-body Lodox Statscans), a private clinic in Angola (region-specific conventional radiographs), and a dental practice in Brazil (panoramic radiographs). Available derivatives include individual demographics (age, sex) with standardized skeletal and/or dental growth and development indicators for all individuals from all samples, and segmented long bone and innominate surfaces from the CT scan samples. Standardized protocols for data collection are provided for download and derivatives are freely accessible for researchers and students.

Keywords: identified collections; biographical data; growth; development; skeletal data; dental data; human variation; medical imaging

1. The Need for Contemporary Subadult Reference Samples

With a few exceptions [1,2], contemporary skeletal reference collections often present with few or no subadult specimens. The handful of osteological collections that do have subadult specimens present numerous issues that are not unexpected, but are problematic when developing or validating subadult methods, especially for use in forensic contexts. These include one or several of the following limitations: relatively small samples [3,4], uneven age distributions [1], anatomically incomplete or taphonomically damaged skeletons, historic samples that do not accurately reflect contemporary growth and development or health [5,6], samples truncated to one type of indicator [7], and/or incomplete or inaccurate information on demographics, population affinity, or socio-economic status [1,6,8,9]. Therefore, the subadult material to use as reference material in forensic anthropology or for ontogenetic studies of modern populations is limited, if not questionable [10]. As evident with the Granada Collection [1] where infants younger than the age of one year old make up 80% of the subadult sample, available skeletal collections also often have unequal age distributions because of differential mortality risks in subadults. Very young individuals, such as infants and perinates, are often over-represented compared to children and juveniles; mortality increases again with age and therefore adolescents are also usually over-represented compared to children and juveniles [10-12]. Unbalanced age groups can potentially bias results built with these samples, such as the negative impacts of age mimicry in regression models [13,14].

When skeletal content is available, there are still obstacles associated with access to skeletal collections. Using the material is dependent on the policies of the laboratories or



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Copyright: © 2022 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/). museums that house them as well as governmentally emplaced and linked to employers. Open access repositories of complete subadult osteological reference data are rare, if in existence at all, even though biological anthropologists have been urging for opensource approaches and discussions about open science is standard in many fields [15,16]. When sample information is available through publications, data are often limited to summary statistics. The limitations pertaining to documented skeletal collections have been consistently brought to the attention of anthropological researchers and forensic practitioners over the past few decades [8,17–19], and illustrates the material, logistic, political, and ethical complexities preventing from effectively increasing accessibility.

Most of the practical limitations of subadult osteological collections can be alleviated with the use of digital or virtual data and specimens obtained from two-dimensional or three-dimensional medical imaging. Virtual data are now more commonly used in biological and forensic anthropology, as they have become easier to access through ethical collaborative research [20]. The most common two-dimensional and three-dimensional advanced imaging techniques used in biological and forensic anthropology include radiography (conventional or other), computed tomography (CT) scans, and magnetic resonance imaging (MRI). Stacks of two-dimensional images, such as CT scans and MRIs, have the advantages of radiography (i.e., the ability to see beyond the external surfaces), but the additional benefit of alleviating orientation, position ambiguity, magnification, and super-imposition issues that are inherent to two-dimensional radiograph imaging. The possibility for visualizing internal structures and high image resolution have proven time and again that the rendered image series [21–25] and the specific derivatives, such as segmented bone surfaces and the skeletal and dental variables collected directly from the image series or the virtual reconstructions, are reliable and accurate [26–31].

While there are an increasing number of available virtual resources [20], they are also not without their respective limitations. De Tobel and collaborators [32] have an extensive review on skeletal imaging in forensic age estimation and discuss some of these considerations including, sample sizes are often small and lack diversity, medical images are region-specific and often include a single or a limited number of indicators, and the protocols for data collection are not always standardized or transposable to other imaging modalities. The New Mexico Decedent Image Database (NMDID) is a new and remarkable resource that has made full body CT images of over 15,000 individuals, of which a little over 1000 are subadults, available for researchers [33]. The full body image series offer a unique opportunity to collect a wide variety of data from the entire skeleton, mimicking the ability of working with dry bone from a cadaveric or donated collection. Yet, there are two major limitations with NMDID. First, the variation captured in the sample is constrained to Albuquerque, New Mexico, United States (U.S.). This is not unlike most donated and cadaveric skeletal collections, but important for interpretations gleaned from the sample. Second, virtual data collection is at the intersection of computer science, medical imaging, and social and biological sciences. Its multidisciplinary nature requires a particular skillset that are not commonly incorporated into the higher education coursework or commonplace for faculty/practitioners to have familiarity with software and virtual data types. In contrast to NMDID, Patricia is an online radiographic repository of over 9000 individuals, all of which are less than 20 years of age [34]. This database has a wider representation of biological and geographic variation in the sample because most images were generated at medical examiner's offices around the US, and it has more individuals less than 20 years compared to the NMDID. Yet, the primary data source is conventional radiographs, which restricts the variety of data types to just those that can be collected from two-dimensional images (i.e., skeletal and dental maturation stages). Even with the limitations of these repositories, the extraordinary pro for each is that they are freely available resources that enable researchers to access large samples of contemporary data.

The Subadult Virtual Anthropology Database (SVAD) is a new, open-source resource that includes myriad data from contemporary subadults, incorporates a wide range of human variation, includes all developmental ages with substantial sample sizes throughout ontogeny, and has known demographics. This unique combination of features overcome limitations associated with other virtual resources. The SVAD is an outcome of three federally funded projects dedicated to improving the subadult biological profile (National Institute of Justice Award 2015-DN-BX-K409 and 2017-DN-BX-0144 and the National Science Foundation BCS-1551913). Data are required to improve methodology and because of that, the SVAD was created. The database contains an extraordinary amount of data for future research that could easily involve questions extending beyond the boundaries of biological and forensic anthropology. The composition of the database, its derivatives, and how to access the material is described below.

2. The SVAD

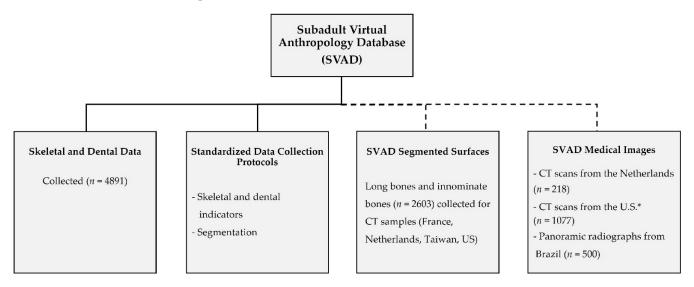
The SVAD constitutes a repository of medical images, standardized osteological data, and other derivatives of 4891 contemporary subadults (n = 2077 females and n = 2814 males). Individuals are aged between birth and 22 years and stem from eight different countries located around the world, namely Angola, Brazil, Colombia, France, The Netherlands, South Africa, Taiwan, and the U.S. (Table 1). The available derivatives include: (1) segmented surfaces of long bones (humerus, radius, ulna, femur, tibia, fibula) and/or innominate bones of 2603 individuals and (2) skeletal and dental growth and development indicators, including diaphyseal dimensions, epiphyseal fusion stages, dental development stages, and vertebral neural canal measurements (Figure 1). The standardized protocols used to collect these data on medical images or 3D bone surfaces are also available (Figure 1). While the derivatives are freely available for future research, not all collaborating institutions allow sharing of the medical images that the data were collected from. However, 1795 medical images are available for future research and some of those are housed in the SVAD (panoramic radiographs from Brazil and CT scans from The Netherlands) and some in NMDID (CT scans from the U.S.) (Figure 1). The acquisition of the medical image series and biological data was done retrospectively in compliance with the Declaration of Helsinki for the protection of data privacy. The project descriptions and research designs were reviewed by the University of Nevada, Reno Research Integrity office who considered the research to collect the derivatives was exempt from IRB review since it did not comprise any personal identifiable information. This is consistent with the ethical principles described in the Belmont Report [35] and in compliance with applicable U.S. federal, state, and local laws.

| Continent Country | | Sample Size (by Sex) | Age Range (Years) | Deceased/Living | |
|-------------------|-------------------------------|-------------------------|-------------------|-----------------|--|
| | Angola | N = 186 (99 F, 87 M) | 0–15 years | Living | |
| Africa | South Africa | N = 1352 (531 F, 821 M) | 0–12 years | Living | |
| | Colombia | N = 31 (5 F, 26 M) | 0–22 years | Deceased | |
| South America | Brazil | N = 500 (248 F, 252 M) | 0–15 years | Living | |
| Europe | France | N = 578 (260 F, 318 M) | 0–15 years | Living | |
| | The Netherlands | N = 218 (109 F, 107 M) | 0–15 years | Living | |
| Asia | Taiwan | N = 730 (306 F, 424 M) | 0–16 years | Living | |
| NT 41 4 | United States (Maryland) | N = 244 (96 F, 148 M) | 0–20 years | Deceased | |
| North America | United States (New Mexico) | N = 1077 (441 F, 636 M) | 0–21 years | Deceased | |

Table 1. Demographics of the SVAD samples.

2.1. Collaborations, Contributions, and Imaging Modalities

Each collaboration provided previously generated medical images and all data were cross-sectional (Tables 1 and 2). The composition of the samples varies and depends on the institution. The unique parameters per collaborator include: data source (hospital versus medical examiner's office), image modality (CT scan, Lodox Statscan, dry bone, panoramic or conventional radiograph), and type of image (element/region specific versus full body). While there are eight countries represented, some countries have more than one collaborator and/or city. As such, each unique combination of these parameters and



the specific policies and procedures for data sharing, and the type of medical image, impacted what was collected and/or what is available for future researchers.

Figure 1. The SVAD contents and available derivatives. Solid lines indicate derivatives directly available through the SVAD Zenodo Community; dashed lines indicate derivatives available upon request, either through SVAD or collaborators (* U.S. CT scans are available through NMDID).

The data were collected from four types of anonymized medical images: CT scans, Lodox Statscans, conventional radiographs, or panoramic radiographs (Figure 2). The CT scan and Lodox Statscan images follow the Digital Imaging and Communications in Medicine (DICOM) Standard for facilitated storage (.dcm format), transfer, and visualization of the images without any loss of information and data [36]. DICOM images require medical imaging visualization software for data collection. The two-dimensional conventional (Angola, Colombia) and panoramic (Brazil) radiographs are stored in other formats common to digital images (e.g., .JPG, .TIFF formats). Other medical imaging databases composed of .JPG files have been set up and studies have shown that loss of information is minimal and image resolution is preserved after conversions from .dcm files [34,37]. However, because of the possibility of distortion and/or magnification associated with these three radiographic samples, only ordinal data (i.e., developmental stages), not continuous data (i.e., measurements), were collected on them. The collaborators from hospitals and/or dental practices usually contributed element- or region-specific images of living individuals. This was true for the Brazilian radiographic sample, the Dutch CT scan sample, the French CT scan sample, the Taiwanese CT scan sample, and the Angolan radiograph sample. The South African sample stemmed from a hospital (living individuals) and a medical examiner's office (deceased individuals) that used Lodox Statscan to produce full-body images [31]. The Lodox Statscan is an imaging device that can generate high quality radiographic images of up to 1.8 m in length at high speed, with minimal radiation or distortion, and is routinely used in trauma and forensic cases [38]. The U.S. sample is comprised of deceased individuals and therefore the full body CT scans were generated at medical examiners' offices in Baltimore, Maryland and Albuquerque, New Mexico. The CT scans of the individuals from Albuquerque, New Mexico are part of the NMDID virtual repository and accessible via the NMDID website (https://nmdid.unm.edu/ accessed on 1 November 2021). The only SVAD sample that had data collected from skeletal remains was Colombia. Individuals in this sample died between the 1990s and early 2000s and were exhumed from public cemeteries in Medellin and housed at the Universidad de Antioquia [39].

| Country | Partner Institution | Context | Modality | Derivatives | Availability |
|--------------------|---|------------------|--|---|---|
| Angola | Departamento de Ciências da Vida, University of Coimbra and private medical cabinets from Luanda, Angola | Private practice | Conventional radiograph | Epiphyseal fusion stages Dental development stages | Derivatives |
| South Africa | Red Cross War Memorial Children's Hospital, Cape Town Hospital | Hospital | Lodox Statscan | Dental development stagesEpiphyseal fusion stages Long bone dimensions | Derivatives |
| | Forensic Pathology Services, Salt River, Cape Town | Forensic | Lodox Statscan | Long bone dimensions | Derivatives |
| Colombia | Universidad de Antioquia, Medellin | Forensic | Dry bone (long bone dimensions and epiphyseal fusion) Conventional radiograph (dental development and epiphyseal fusion) | Long bone dimensions VNC diameters Epiphyseal fusion stages Dental development stages | Radiographs and derivatives |
| Brazil | Universidade de São Paulo (FOUSP) | Dental Practice | Panoramic radiograph | Dental development stages | Panoramic radiographs and derivatives |
| France | Public hospital services of Marseille (AP-HM) | Hospital | CT scan | Long bone dimensions VNC diameters Epiphyseal fusion stages Dental development stages Segmented bone surfaces | Derivatives |
| The Netherlands | Amsterdam Medical Center (Hospital) | Hospital | CT scan | Long bone dimensions VNC diameters Epiphyseal fusion stages Dental development stages Segmented bone surfaces | CT scans and derivatives |
| Taiwan | National Taiwan University Hospital, Taipei City | Hospital | CT scan | Long bone dimensions VNC diameters Epiphyseal fusion stages Dental development stages Segmented bone surfaces | Derivatives |
| | Office of the Chief Medical Examiner, Baltimore, Maryland | Medico-legal | CT scan | Long bone dimensions Epiphyseal fusion stages | Derivatives |
| United States * | University of New Mexico Health Sciences Center, Office of the Medical Investigator, Albuquerque, New Mexico | Medico-legal | CT scan | Long bone dimensions VNC diameters Epiphyseal fusion stages Dental development stages Pelvic landmarks Segmented bone surfaces | CT scans ** and derivatives |

Table 2. Context and availability of SVAD images and derivatives.

* For the two U.S. samples, age, sex, population affiliation/social race, manner of death and cause of death are also known. ** The University of New Mexico CT scans can be downloaded via the NMDID website and linked to the derivatives we have available (https://nmdid.unm.edu/ accessed on 1 November 2021).

As mentioned above, the available data varied across collaborating institutions. Generally, region/anatomic-specific images were associated with living individuals and hospital samples, most likely in an effort to minimize unnecessary exposure to radiation [40]. In contrast, a full body image was standard for the medical examiner's office and therefore the deceased samples do not have notable amounts of missing data, if any. The differing contexts of origin for the SVAD samples and the fact that it is comprised of data from deceased and living individuals do not seem to influence the range of values for indicators in each population. A recent study showed no differences in long bone lengths and dental development between the deceased (medical examiner's office context) and living (hospital/clinical context) individuals from the U.S. and South African samples [10]. Although these findings should be verified on the other SVAD samples, they suggest there is no bias in skeletal and dental indicators that is related to the type of collaborating institution, the context of origin of the individuals (forensic or clinical), or the type of medical image (CT scan or radiograph), and that these indicators could be compared across samples for anthropological research [28].

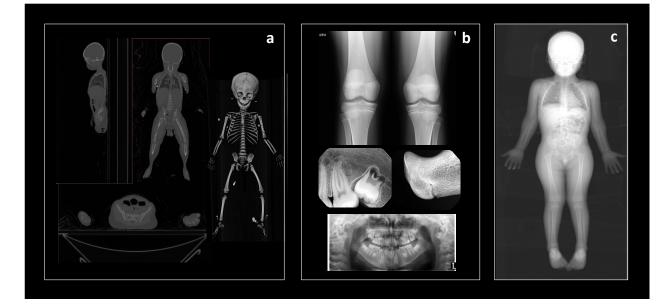


Figure 2. Types of medical images used for data collection in the SVAD. (**a**) full-body CT scan (sagittal, frontal, transverse views) and volume rendering of the skeleton; (**b**) conventional radiographs, examples herein of the knees (**top**), teeth and proximal radius (**middle**), and teeth (**bottom**); and (**c**) full-body Lodox Statscan.

2.2. Sample Demographics

Age and sex are known for all individuals in the SVAD and are the only two variables provided by each institution. The full age range represented in the SVAD is birth to 22 years. There are minimally 200 individuals per chronological age in the SVAD, up until the late teens; there are approximately 100 individuals per chronological age from the ages of 16 to 20 years (Figure 3).

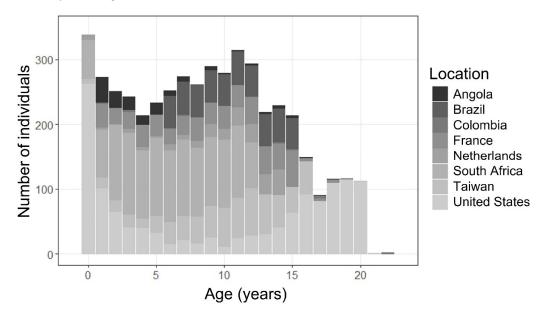


Figure 3. Cumulative age distribution of the SVAD samples by country of origin.

The sampling distribution varies at the institution level (Figure 4, Table 1). In general, subadult mortality patterns are bimodal with a high mortality rate for infants, a reduction in mortality in early to mid-childhood, and another increase in mortality during adolescence [10,34]. In comparison, a living sample from a hospital/clinical setting will likely show a more uniform age distribution for most age groups except for infancy (Figure 4).

The youngest individuals are usually less represented in clinical contexts because ionizing medical imaging is scarcely used unless absolutely necessary [40]. However, the cumulative distribution in the total SVAD sample is somewhat equal across the ages (Figure 3).

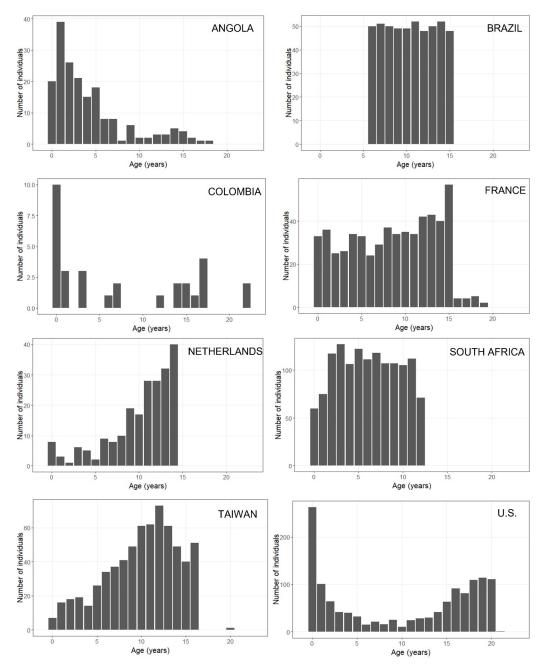


Figure 4. Age distributions of the SVAD samples by country.

An age distribution separated by sex (n = 2077 females and n = 2814 males) reveals a larger number of males compared to females per chronological age (Figure 5). Numerous clinical studies have shown the existence of sex disparities in pediatric hospital admissions, with a predominance of male patients over female patients both in emergency and long-term care, independently of the country or healthcare system involved [41–45]. A slight sex bias towards males has been observed in the medico-legal context, although it is less significant for pre-teen subadults than it is for adolescent and young adults [46,47]. Although care was taken to avoid substantially unbalanced sex distributions, the opportunistic, or convenience, sampling approach used to select individuals generally reflects the sex ratios at each collaborating institution (Figure 5).

Additional demographic derivatives varied for each institution and depended not only on the policies of the institution but also if the individuals were deceased or living. For deceased individuals (the U.S. sample only), manner of death (MOD) and cause of death (COD) were known. Population affinity is only known for the U.S. and South African samples, as that parameter was not recorded by the additional collaborating institutions in the SVAD.

Sampling variability can be quite complex and level of details to consider can vary depending on the scale and research question. Country and city level statistics (i.e., human development index, Gini coefficient) could provide a snapshot of the broad population, but nuanced information at the institution level will provide the most accurate reflection of the sample. One component to consider is the type of institution. Researchers have illustrated different sectors of society may visit different types of doctors at different frequencies even when there is equity in healthcare [41–45]. Therefore, countries with public healthcare like Brazil, France, and South Africa, may present greater diversity in their hospital samples, compared to the samples that may populate medical examiner's offices [46,47] and dental practices.

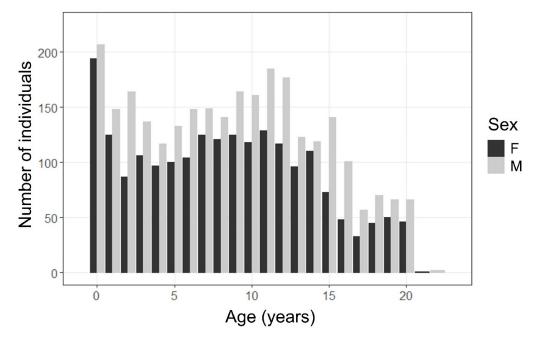


Figure 5. Sex distribution of the combined SVAD samples.

2.3. Derivatives

Skeletal and dental growth and development indicators were collected on images, dry bones, or virtual bone surfaces (Table 2, Figures 6–8). Each country's complete dataset (.CSV format) and the protocols developed to standardize the collection of the indicators on medical images (.PDF format) are available for download via the SVAD Zenodo Community [44]. Virtual bone surfaces of the long bones and coxal bones (in .PLY format) for the French, Dutch, Taiwanese, and U.S. samples were segmented per their availability using a standardized protocol based on the AmiraTM (AmiraTM v.6.5.0, Thermo Fisher Scientific, Waltham, MA, USA) imaging visualization software [23,48]. Segmented surfaces are also available for research but require one to contact the authors for access.

The specific skeletal and dental variables that comprise the datasets are detailed below. Long bone measurements, epiphyseal fusion, and dental development stages were collected following standardized protocols [49] using the KScollect Graphical User Interface (GUI) [50]. The variable levels used in KSCollect are compatible with the KidStats GUI. Both KScollect and KidStats are referenced and available for download in the SVAD Zenodo Community (https://zenodo.org/record/5601936#.YZgRJC-B3z8 accessed on 1 November 2021).

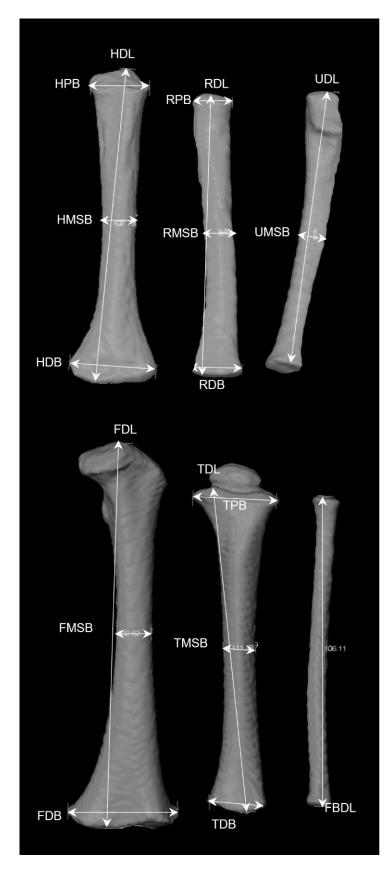


Figure 6. Long bone dimensions taken on virtual surfaces reconstructed from CT scans.

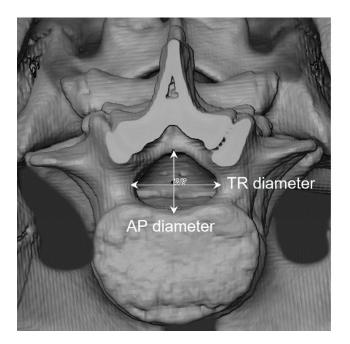


Figure 7. Antero-posterior (AP) and transverse (TR) vertebral neural canal (VNC) diameters taken on virtual surfaces reconstructed from CT scans.

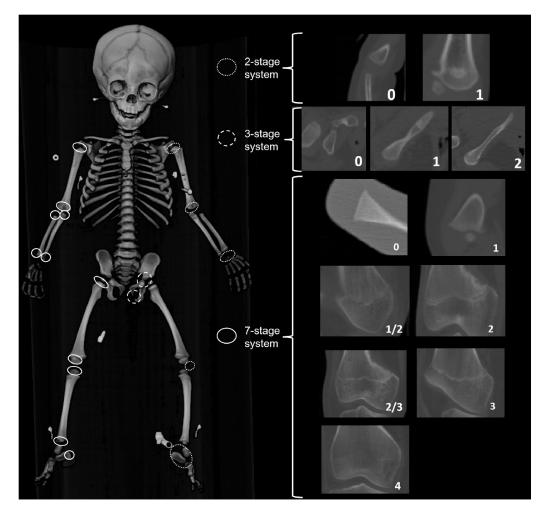


Figure 8. Three staging systems used to score the ossification of secondary centers, carpals, and tarsals (2-stage system) and epiphyseal fusion of the long bones and pelvis (7-stage system).

Eighteen diaphyseal length and breadth measurements of the six long bones (femur, tibia, fibula, humerus, radius, and ulna) were collected per individual (Figure 6). They follow the definitions presented by Stull, L'Abbé, & Ousley in 2014 [31], which were based on Fazekas and Kosa [51] and Moore-Jansen et al. [52]. Left-sided elements were measured by default and their right antimere were measured if unavailable or broken. Length measurements were taken only from unfused long bones. Therefore, the age range for each measurement varies and is dependent on the fusion age, though data for the long bones were mostly unavailable after 13 years of age. Long bone data were measured on segmented bone surfaces in the four CT samples (France, The Netherlands, Taiwan, the United States). The South African long bone data were previously collected by Stull [25,53] from Lodox Statscan images using DVS (2.9.6), the Lodox imaging software. Measurements were taken directly on the dry bones in the Colombian sample using a digital caliper (0.01 mm precision). Previous publications document the high repeatability and accuracy of Lodox Statscan measurements [25,53] and high precision, accuracy, repeatability, and reproducibility of measurements collected on virtual reconstructions of skeletal elements [21,22,26,27,30,31,49,54].

2.3.2. Vertebral Neural Canal Measurements (VNC)

Antero-posterior (AP) and transverse (TR) diameters of vertebrae thoracic 10 to lumbar 5 were collected following definitions by Watts [55,56]. The data were measured on the virtually reconstructed surfaces in the four countries that provided CT images (France, The Netherlands, Taiwan, the United States) (Figure 7) and collected directly on the dry vertebrae in the Colombian sample.

2.3.3. Dental Development

Dental development was collected for the 32 permanent teeth following AlQahtani, Hector, and Liversidge [57] 13-stage revision of the Moorrees, Fanning and Hunt [58] mineralization stages for mono-radicular and pluri-radicular teeth (Table 3). The data collection team used a numerical adaptation of the 13 stages rather than the abbreviations that were associated with the original and modified stage definitions used. For example, 1 was used rather than Ci (Table 3). Teeth were scored directly from CT slices, panoramic and conventional radiographs generated at the original institutions, and from radiographs generated on site in Colombia using a portable Nomad Pro 2 handheld X-ray system (Patterson Dental). In the South African sample, dental development of only the first and second molars was scored because of the insufficient visibility and superimposition.

2.3.4. Epiphyseal Fusion (EF)

Epiphyseal fusion stages for proximal and distal long bone epiphyses, the calcaneal tuberosity, the ischiopubic ramus, the ilium and ischium, and ossification of the patella were recorded for both left and right-sided elements. Ossification of carpals and tarsals were scored binary absent (0)/present (1), and then the component score was recorded to indicate the number of elements present on either the left or right side. Three different staging systems were employed (Figure 8): a seven-stage system was used for the long bone epiphyses and the calcaneal tuberosity; a three-stage system was used for the pelvic epiphyses; and a binary absent/present was used for the carpals and tarsals, the ossification of the elements of the proximal and distal humerus (e.g., humeral head, lesser tubercle, greater tubercle, capitulum, trochlea, composite epiphyses), and the patella. Epiphyseal fusion was scored on CT slices for France, The Netherlands, Taiwan, and the United States samples, and on radiographs taken for the Angolan, Colombian, and South African samples.

| Stage | Monoradicular Teeth | Pluriradicular Teeth | Description |
|-------|---------------------|---|---|
| 1 | No. | C: | Initial cusp formation |
| 2 | P | D | Coalescence of cusps |
| 3 | C) | A | Cusp outline complete |
| 4 | | and a | Crown half completed with dentine formation |
| 5 | Q. | Ì | Crown three quarters completed |
| 6 | Ø | Ì | Crown completed with defined pulp roof |
| 7 | Ð | ۲ | Initial root formation with diverge edges |
| 8 | 6 | (a) | Root length less than crown length |
| 9 | 5 | , dis | Root length equals crown length |
| 10 | M | <c-< td=""><td>Three quarters of root length developed with diverge ends</td></c-<> | Three quarters of root length developed with diverge ends |
| 11 | | and the | Root length completed with parallel ends |
| 12 | R. | Sec. | Apex closed (root ends converge) with wide periodontal ligament |
| 13 | 1º | | Apex closed with normal periodontal ligament width |

Table 3. Stages used to score development of permanent teeth.

2.4. Observer Error and Agreement

Intra- and inter-observer errors for continuous data (Table 4) were calculated using technical error of measurement (TEM) and relative TEM (%TEM). Intra- and inter-observer agreement rates for ordinal data (Table 5) were assessed using quadratic weighted Cohen's Kappa. The original presentation of the agreement rates [28] used linear weighted Cohen's Kappa; the authors have since recognized that quadratic coefficients are more appropriate. Essentially, the quadratic approach put more weight on a difference in ordinal scores of

two or more increments (e.g., a difference between a score of 1 and a score of 3 for dental development) than a difference in ordinal scores of one increment (e.g., a difference between a score of 1 and a score of 2), which limits the risk of overestimating the resulting Cohen's kappa values [59]. All TEM, %TEM and Cohen's Kappa values for each indicator are available in the SVAD data collection protocol stored in the SVAD Zenodo Community [49].

Table 4. Observer errors of continuous data: minimum, maximum, and average values of technical errors of measurement (TEM) and percent TEM.

| | | Intra-Observer Error | | | | Inter-Observer Error | | | | | | |
|------------------------|--------|----------------------|-------|----------------|-------|----------------------|--------|-------|---------|-------|-------|-------|
| |] | TEM (mm) | | TEM (%) | | TEM (mm) | | | TEM (%) | | | |
| | MIN | MAX | AVG | MIN | MAX | AVG | MIN | MAX | AVG | MIN | MAX | AVG |
| Long Bone Dimensions | 0.0426 | 0.364 | 0.156 | 0.069 | 1.723 | 0.502 | 0.0354 | 0.34 | 0.133 | 0.098 | 0.877 | 0.453 |
| Vertebral Neural Canal | 0.024 | 0.178 | 0.103 | 0.161 | 1.104 | 0.589 | 0.118 | 0.358 | 0.193 | 0.672 | 2.117 | 1.127 |

| Table 5. | Observer | agreement o | f ordinal dat | a using c | uadratic | weighted | Cohen's Kappa. |
|----------|----------|-------------|---------------|-----------|----------|----------|----------------|
| | | | | | | | |

| | Intra-Observer Error Cohen's Kappa | | | Inter-Observer Error Cohen's Kappa | | | |
|---|---------------------------------------|--------------|----------------|---------------------------------------|--------------|----------------|--|
| - | | | | | | | |
| - | MIN | MAX | AVG | MIN | MAX | AVG | |
| Epiphyseal fusion stages * Dental development stages * | 0.545 0.687 | 1.00 1.00 | 0.974 0.939 | 0.501 0.774 | 1.00 1.00 | 0.930 0.965 | |

* Values updated from [28]; the original publication employed linear weighted Cohen's Kappa.

3. Access and Expansion

Each partner institution has indicated their preferred conditions for data sharing and access of the medical images and/or their derivatives (Table 2, Figure 1). While all derivatives (segmented bone surfaces, demographic data, and biological data) from each sample are freely accessible and available for download on the SVAD Zenodo Community, it is more uncommon to share the anonymized images. The radiographs from Brazil and the CT scans from The Netherlands can be accessed via a secure server hosted by the University of Nevada, Reno. Prior to providing access to these images, users will need to read and sign a Data Use and Sharing Agreement form and fill out a Research Form describing the purpose and use of the images for a given research project that will need to be submitted to the SVAD curators. Both forms are available via the SVAD University of Nevada, Reno webpage (https://www.unr.edu/anthropology/research-and-facilities/subadult-database accessed on 1 November 2021). The CT scans for the U.S. UNM sub-sample are available for download via the NMDID website; their NMDID ID has been linked for efficient merging of data.

Along with fellow forensic and biological anthropology colleagues [28,32,33,60–66], we recognize the need to standardize and "optimize" data collection and ease the access to samples, medical images, and skeletal derivatives, and the resulting anthropological methods. The SVAD is substantial in size and diversity and the derivatives are freely available via the SVAD Zenodo Community for fellow researchers to use for their own research questions. Since it is a living repository, it is built to welcome contributions from other researchers whether that be biological and demographic derivatives or anonymized medical images. Open-access derivatives will foster collaborations among researchers at the professional and graduate student levels and allows for new research on various projects exploring ontogeny, variation, methodology, and many others in anthropology and various sister fields. The SVAD Zenodo Community can host links to the various publications and presentations using part or all its content, thus acting as a primary information sharing point on subadult research and reinforcing collaborative efforts and networking. New collaborations will allow it to continue to increase in size and diversity, and collectively will positively increase accessibility to large reference datasets and vertically advance

research in our field. If you are interested in contributing and have inquiries, please contact the authors.

4. Conclusions

The SVAD is a new and exceptional resource for researchers interested in virtual data more broadly and subadult research more specifically. Additionally, the data have potential in various fields of research relying on medical images or skeletal and dental variables and elements. Visit https://zenodo.org/communities/svad/?page=1&size=20 accessed on 1 November 2021 for more information and https://www.unr.edu/anthropology/ research-and-facilities/subadult-database accessed on 1 November 2021 to apply for access to the available medical images. By developing the open-access platform, we hope to steer the culture of forensic anthropological research specifically and forensic science research more generally towards open science, which leads to greater collaboration and mutual gains, ensures scientific integrity through transparency, and improves the overall quality of research [66]. With this platform established, the SVAD will allow for the inclusion of additional data via new collaborations so that samples can increase in size and diversity. Ultimately, the SVAD can host and provide access to derivatives from various projects and individual and country-specific demographic information, including entire datasets, medical images, segmented bone surfaces, data collection protocols, automated segmentation tools, resulting methods, novel R packages and scripts, and GUIs. The end goal is to facilitate access to large-scale anthropological data, avoid costs of traveling, and limit the effects of missing data/structures that are common with physical skeletal collections.

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Institutional Review Board Statement: The study was conducted according to the guidelines of the Declaration of Helsinki and has been determined exempt or not human subjects research according to United States federal regulations by the Institutional Review Board (or Ethics Committee) of the Research Integrity Office of the University of Nevada, Reno.

Informed Consent Statement: Patient consent was waived because of the retrospective research design.

Data Availability Statement: The data mentioned in this this study are openly available in the "Subadult Virtual Anthropology Database" Zenodo community (https://zenodo.org/communities/ svad/?page=1&size=20 accessed on 1 November 2021) at Datasets: [doi:10.5281/zenodo.5193208] Data collection protocol: Amira [doi:10.5281/zenodo.5348411] Data collection protocol: Indicators [doi:10.5281/zenodo.5348392].

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