Seasonal Variability in Chlorophyll and Air-Sea CO\textsubscript{2} Flux in the Sri Lanka Dome: Hydrodynamic Implications

Wentao Ma\textsuperscript{1,2,•}, Yuntao Wang\textsuperscript{1}, Yan Bai\textsuperscript{1}, Xiaolin Ma\textsuperscript{3}, Yi Yu\textsuperscript{1,2}, Zhiwei Zhang\textsuperscript{1,4} and Jingyuan Xi\textsuperscript{1}

\textsuperscript{1} State Key Laboratory of Satellite Ocean Environment Dynamics, Second Institute of Oceanography, Ministry of Natural Resources, Hangzhou 310012, China; yuntao.wang@sio.org.cn (Y.W.); baiyan@sio.org.cn (Y.B.); yiyyu@sio.org.cn (Y.Y.); zhiweizhang@sjtu.edu.cn (Z.Z.); xijy@sio.org.cn (J.X.)
\textsuperscript{2} Southern Marine Science and Engineering Guangdong Laboratory (Zhuhai), Zhuhai 519000, China
\textsuperscript{3} State Key Laboratory of Loess and Quaternary Geology, Institute of Earth Environment, Chinese Academy of Sciences, Xi’an 710061, China; maxl@ieecas.cn
\textsuperscript{4} School of Oceanography, Shanghai Jiao Tong University, Shanghai 200240, China

\* Correspondence: wtma@sio.org.cn

Abstract: Multiple upwelling systems develop in the Indian Ocean during the summer monsoon. The Sri Lanka dome (SLD), which occurs in the open ocean off the east coast of Sri Lanka from June to September, is distinct from those near the coast. The SLD is characterized by uplifted thermocline and increased chlorophyll concentration. Mechanisms of the upwelling and its biogeochemical response are not well understood. Here, we explored the dynamics of the chlorophyll and sea-to-air CO\textsubscript{2} flux in the SLD using ocean color and altimetry remote sensing data, together with other reanalysis products. We found that the occurrence of high chlorophyll concentration and sea-to-air CO\textsubscript{2} flux happens along the pathway of the southwest monsoon current (SMC). The annual cycle of chlorophyll in the SLD has a one-month lag relative to that in the southern coast of Sri Lanka. The positive wind stress curl that forms in the SLD during the summer does not fully explain the seasonal chlorophyll maximum. Transport of the SMC, eddy activity, and associated frontal processes also play an important role in regulating the variability in chlorophyll. In the SLD, upwelled subsurface water has excess dissolved inorganic carbon (DIC) relative to the conventional Redfield ratio between DIC and nutrients; thus, upwelling and sub-mesoscale processes determine this region to be a net carbon source to the atmosphere.

Keywords: chlorophyll; air–sea CO\textsubscript{2} flux; upwelling; Sri Lanka dome; southwestern Bay of Bengal

1. Introduction

The Indian Ocean has a unique land–sea distribution characterized by the vast landmass located to the north of the ocean. Differential heating of land and sea results in a prominent monsoon climate [1,2]. The seasonal reversal of wind produces important upwelling systems in several parts of the Indian Ocean boundaries ranging from the west to the east [3,4] (Figure 1). The southwesterlies during boral summer are favorable for upwelling along the western boundary of the Arabian Sea, near the coast of Somalia and Oman [5–9]. In the eastern boundary of the Arabian Sea, the southwesterly winds turn mainly into onshore equatorward winds along the southwest coast of India, generating offshore Ekman transport and coastal upwelling [10,11]. In the eastern equatorial Indian Ocean, the southeasterlies along the southern coast of Java and Sumatra islands induces upwelling off the coast [12,13]. These boundary upwelling systems are mainly characterized as offshore transport of surface water where the subsurface water upwells to the surface. Subsequently, upwelled water with higher nutrients supports the high primary productivity and pelagic fisheries [14,15].
A seasonal upwelling also appears off the east coast of Sri Lanka (5–10°N, 83–87°E) during the southwest (SW) monsoon (June–September), known as the Sri Lanka dome (SLD) [16,17]. The SLD is a unique upwelling system that occurs in the open ocean. It starts in May, matures in July, and disappears in September [18]. The mechanism is different from other upwelling systems in the western Arabian Sea, the southeast coast of India, and the eastern equatorial Indian Ocean. The SW summer monsoon produces positive wind stress curl above the region of SLD and favors the upwelling via Ekman pumping [16]. A previous study using numerical model found that the existence of Sri Lanka island forces a strong surface current, namely, the southwest monsoon current (SMC) [17] which flows eastward from the eastern Arabian Sea to the Bay of Bengal (BoB) and finally turns northwestward after passing the south of Sri Lanka [19]. The anticlockwise turning of the SMC favors the occurrence of a cyclonic eddy (CE) to the east of Sri Lanka (Figure 1) [17,20]. Therefore, it is considered that the island mass effect, a phenomenon of increased chlorophyll near an island [21], and wind-driven Ekman pumping are thought to determine the existence and strength of the SLD, respectively. The dissipation of the SLD is attributed to the westward propagation of Rossby (downwelling) waves, which are associated with the reflection of the spring Wyrtki jet at the eastern boundary of the Indian Ocean [18,22,23].

The formation of the SLD introduces a prominent impact on the biogeochemical tracers as well. Remote sensing of ocean color shows increased chlorophyll in the surface waters of the SLD during the SW monsoon [24]. This is mainly because the upwelling breaks the strong stratification (the existence of a barrier layer) during summer and provides more nutrients to the surface [24–28]. However, the Bay of Bengal Boundary Layer Experiment (BoBBLE) showed a very low nutrient concentration in the SLD via ship-bound measurements [25,29]. This discrepancy was assumed due to the upwelled nutrient being rapidly consumed by phytoplankton in the surface [25]. Additionally, SMC is considered to transport water with high-chlorophyll to the SLD region from the south of Sri Lanka [20,24]. Due to the corresponding Ekman pumping, there are also prominent deep chlorophyll maxima (DCM) at intermediate depths (20–50 m) in the region of the SLD and the SMC [30]. Outside the dome, the DCM is weaker. Seasonal variations in chlorophyll in surface and subsurface
waters have been linked to monsoon-regulated upwelling [31]. However, the detailed interaction between the region of SLD and south of Sri Lanka is still not well understood.

Following the high chlorophyll concentration and net primary productivity (NPP), the biogenic CO$_2$ uptake is enhanced as well. Numerical studies indicate that the enhanced NPP overcomes the upwelled water with high pCO$_2$, resulting in a net carbon sink in the SLD [26,32]. However, the recent observation argues that the strong upwelling makes the SLD a net carbon source [25]. In recent years, the application of seawater pCO$_2$ remote sensing provides a novel means to estimate the global and regional air–sea CO$_2$ flux with higher spatial and temporal resolution than the conventional shipboard observation [33–37]. Relative to the upwelling system of the western Arabian Sea, physical and biological governing factors controlling seawater pCO$_2$ in the SLD are not well understood.

In this study, we revisited the dynamics of the high chlorophyll concentration in the SLD. In addition to the wind stress curl induced upwelling, the strengthening and transport of SMC, a cyclonic–anticyclonic eddy dipole, and associated frontal process also play important roles. Furthermore, by calculating the seasonal variability of the sea-to-air CO$_2$ flux in the southwestern BoB using the remote sensing and reanalysis products, our data support that the SLD is a net carbon source to the atmosphere.

2. Data and Methods

2.1. Datasets

(a) Monthly and 5-day gridded data of chlorophyll-a concentration in the SLD provided by the Ocean Colour Climate Change Initiative (Ocean Color CCI) v5.0 over the period from 1998 to 2020 were obtained from European Space Agency (ESA; https://www.oceancolour.org, accessed on 30 January 2022). The Ocean Color CCI is producing long-term multi-sensor timeseries of satellite ocean-color data with a horizontal resolution of 4.5 km [38]. Meanwhile, the monthly remote-sensing reflectance (Rrs) at the 443 nm, 488 nm, and 555 nm bands were also used to calculate the air–sea CO$_2$ flux described in Section 2.4.

(b) The monthly reanalysis product of sea surface salinity (SSS) and mixed layer depth (MLD) were obtained from the E.U. Copernicus Marine Service (https://www.marine.copernicus.eu, accessed on 30 January 2022) to calculate the air–sea CO$_2$ flux described in Section 2.4.

(c) Daily and monthly sea surface height anomaly (SSHA) and surface geostrophic current data, with a horizontal resolution of 0.25° over the same period as the chlorophyll-a data, were obtained from the E.U. Copernicus Marine Service. The product is processed by the DUACS data processing system from all altimeter missions: Jason-3, Sentinel-3A, HY-2A, Saral/AltiKa, Cryosat-2, Jason-2, Jason-1, T/P, ENVISAT, GFO, and ERS1/2.

(d) Mesoscale Eddy Trajectory Atlas products (META3.1exp DT) over the same period with chlorophyll-a concentration, processed by Centre National D’Etudes Spatiales/Collecte Localisation Satellites (CNES/CLS) in the DUACS system, were obtained from AVISO+ (https://www.aviso.altimetry.fr, accessed on 30 January 2022). All eddies with a lifetime greater than 8 days were extracted.

(e) The six-hourly near-surface (10 m) wind speed over the same period with chlorophyll-a concentration was obtained from the fifth-generation European Centre for Medium-Range Weather Forecasts (ECMWF) reanalysis (ERA5) dataset (http://cds.climate.copernicus.eu, accessed on 30 January 2022). The wind stress and its curl are derived from the wind speed. Here, wind stress is calculated as the function $\tau = C_d \times \rho \times u_{10}$, where $\tau$ is the wind stress, $C_d$ is the drag coefficient, $\rho$ is the density of air, and $u_{10}$ is the wind speed at 10 m. $C_d$ and $\rho$ were set to $1.25 \times 10^{-3}$ and 1.225 kg m$^{-3}$, respectively. Wind stress curl is calculated as $\partial \tau_y / \partial x - \partial \tau_x / \partial y$, where $\tau_x$ and $\tau_y$ denote the wind stress in the x and y directions, respectively, that induces the vertical movement of the water mass via Ekman pumping [39].

(f) Daily sea surface temperature (SST) data with a horizontal resolution of 4.5 km for the period of 2003–2020 were obtained from NASA’s Moderate Resolution Imag-
ing Spectroradiometer (MODIS) on Aqua (http://oceandata.sci.gsfc.nasa.gov, accessed on 30 January 2022) to perform the front detection.

(g) HYCOM reanalysis products of expt_57.2 (https://www.hycom.org, accessed on 10 February 2022), which has a horizontal resolution of ~0.08° (9 km) and 41 vertical layers, were obtained for the summer of 2016 with a time interval of 3 h. The HYCOM model uses the Navy Coupled Ocean Data Assimilation (NCODA) system for data assimilation. As most of the available satellite altimetry observations are assimilated in the NCODA, the modeled sea surface height and eddy locations are consistent with altimetry observations.

2.2. Lagrangian Particle Tracking

The motion of particles was tracked using the HYCOM current field. This method was used for the backward tracking of settling particles collected by the timeseries sediment trap in the South China Sea [40]. The motion of a particle is described by its position vector, \( \mathbf{X}(t) \), at time \( t \). The velocity of the particle is interpolated from the HYCOM velocity outputs by setting the velocity in the Lagrangian frame equal to the velocity \( \mathbf{U}(x,t) \) in the Eulerian frame when \( \mathbf{X}(a,t) \) is crossing the point \( x \):

\[
\left( \frac{\partial \mathbf{X}(a,t)}{\partial t} \right)_a = \mathbf{U}(x,t) \text{ where } \mathbf{X}(a,t) = x, \quad (1)
\]

When the virtual particle is located at point \( \mathbf{X}(n)(t) = x \), we can update its position by a time step, \( \Delta t \), to estimate the displacement:

\[
\mathbf{X}(t + \Delta t) = \mathbf{X}(t) + \int_t^{t+\Delta t} \mathbf{v}(x,\tau)d\tau \quad (2)
\]

We simulated the general trajectory \( \mathbf{X}(t) \) of particles by combining the Brownian motion, the drift following the current:

\[
d\mathbf{X}_i(t) = a_i(X,t) + \sigma_{ij}(x,t)dW_j(t) \quad (3)
\]

where \( \mathbf{X}_i(t) \) is the trajectory vector of a specific particle "i", and \( d\mathbf{X}_i(t) = \mathbf{X}_i(t + dt) - \mathbf{X}_i(t) \) is the stochastic particle displacement during the time interval \([t, t + dt]\). The term \( a_i(X,t) \) is a deterministic drift, \( \sigma_{ij}(x,t) \) is related to a diffusion tensor, and \( W_j(t) \) is a Wiener process to represent the random walk realized by applying a perturbation to the velocity field. The horizontal and vertical diffusivity was set to 50 and \( 10^{-4} \) m² s⁻², respectively. The vertical water velocity is derived using the continuity equation. The particle itself does not have an active settling velocity in this study.

2.3. Front Detection

The SST front was detected using the gradient-based edge-detection method following refs. [39,41]. In the first step, the local maximum gradient was calculated. A patch was marked as frontal pixels if they had the gradient greater than a defined threshold of \( T_1 \). In the next step, the position of the front filament was identified if the value of the gradient for adjacent pixels was larger than a threshold of \( T_2 \) in the direction perpendicular to the gradient. This procedure repeated until the entire front filament was completed when the gradients for all surrounding pixels were smaller than \( T_2 \). In this study, the thresholds of 2.8 °C and 1.4 °C per 100 km for \( T_1 \) and \( T_2 \), respectively, were adopted from the former study conducted in the Arabian Sea [41]. Different values of thresholds of \( T_1 \) and \( T_2 \) were tested to ensure the robustness of the detection. After the daily SST front was obtained, the frontal probability (FP) at each pixel was calculated in each month. The FP was defined as the ratio between the total number of times the pixel was identified as a front within the month and the number of times the pixel was cloud-free during the same time.
2.4. Remote Sensing of Sea-to-Air CO$_2$ Flux

The remote sensing of seawater pCO$_2$ is derived from satellite products including the remote-sensing reflectance (Rrs at 443 nm, 488 nm and 555 nm bands) and chlorophyll, as well as other reanalysis products such as the SST, SSS, and MLD (Table 1). Extreme gradient boosting (XGBoost) [42], a machine learning algorithm, was applied to create monthly sea surface pCO$_2$ maps with a spatial resolution of 4.5 km for the period of 2003–2019 over the global ocean. Observed pCO$_2$ data from the Surface Ocean Carbon Atlas (SOCAT) database [43] were used for training and validation. In this study, the SOCAT v3 data for the period of 2000–2015 was used for training, and the period of 2016–2018 was applied for validation. There are 792 stations in the central and eastern Indian Ocean used for training (Figure S1). After the seawater pCO$_2$ was derived, we computed the air-to-sea CO$_2$ flux using the approach of ref. [33]. The input variables to calculate the flux are described in Table 1.

Table 1. Input variables for the sea-to-air CO$_2$ flux.

<table>
<thead>
<tr>
<th>Variables</th>
<th>Source</th>
<th>Spatial Resolution</th>
<th>Time Resolution</th>
</tr>
</thead>
<tbody>
<tr>
<td>Rrs</td>
<td>Ocean Color CCI</td>
<td>4.5 km</td>
<td>Monthly</td>
</tr>
<tr>
<td>Chlorophyll</td>
<td>Ocean Color CCI</td>
<td>4.5 km</td>
<td>Monthly</td>
</tr>
<tr>
<td>SST</td>
<td>OISSTv2.1</td>
<td>0.25°</td>
<td>Monthly</td>
</tr>
<tr>
<td>SSS</td>
<td>GLOBAL_REANALYSIS_PHY_001_031</td>
<td>0.083°</td>
<td>Monthly</td>
</tr>
<tr>
<td>MLD</td>
<td>GLOBAL_REANALYSIS_PHY_001_031</td>
<td>0.083°</td>
<td>Monthly</td>
</tr>
<tr>
<td>pCO$_2^{Air}$</td>
<td>CarbonTracker CT2019B</td>
<td>3° × 2°</td>
<td>Monthly</td>
</tr>
<tr>
<td>Atm. pressure</td>
<td>CarbonTracker CT2019B</td>
<td>3° × 2°</td>
<td>Monthly</td>
</tr>
<tr>
<td>Wind speed</td>
<td>WIND_GLO_WIND_L4_REP_OBSERVATIONS_012_006</td>
<td>0.25°</td>
<td>Monthly</td>
</tr>
<tr>
<td>pCO$_2^{Seawater}$</td>
<td>This study</td>
<td>4.5 km</td>
<td>Monthly</td>
</tr>
</tbody>
</table>

3. Results

3.1. Chlorophyll

The remote sensing chlorophyll in the southwestern BoB shows a clear seasonal variability with high concentration during the SW summer monsoon and low value in the northeast winter monsoon (Figure 2). The summer high value occurs around the coast of south India and Sri Lanka (Figure 2b). There exists an offshore high chlorophyll patch distributed along the wind direction off the east coast of Sri Lanka. Meanwhile, this patch can be traced upstream to the south of Sri Lanka (SSL). In comparison, high chlorophyll during winter is only limited to the coastal regions around India and Sri Lanka, and the channel between them (Figure 2a). Monthly climatology of chlorophyll and wind stress curl averaged in the SLD and SSL also show prominent seasonal variability with high values during SW monsoon (Figure 3). The chlorophyll in SSL is persistently larger than that in SLD. The chlorophyll in SSL is increasing by almost four times from its lowest value to the largest value; in comparison, the increase is only twice in the SLD (Figure 3a). Consistently, the change in wind stress curl is also more prominent in SSL than that in SLD (Figure 3b). The monthly climatology of chlorophyll in the SLD and SSL shows that their maxima both occur during the SW monsoon, but the SSL leads SLD for one month (Figure 3a).
The wind stress curl in the SSL box shows positive values in summer (with a peak in July) and negative values in winter. In the SLD box, the value of the wind stress curl is positive during summer (Figure 4a). The result is consistent with that of the cross-calibrated multiplatform (CCMP) wind product [45] (Figure S2). The position of the high chlorophyll patch (blue contour) generally matches the core of the positive wind stress curl happens during summer (Figure 4a). However, the monthly climatology of the wind stress curl in the SLD box shows significantly less seasonality than in the SSL box (Figure 3b). The wind stress curl in the SSL box shows positive values in summer (with a peak in July) and negative values in winter. In the SLD box, the value of the wind stress curl is positive throughout the year. The SLD box has two positive peaks in both winter and summer, but the summer peak in July is not significantly higher than the winter peak in December. The chlorophyll in the SLD box, however, is significantly lower in winter.
Figure 4. (a) Wind stress curl (units: N m$^{-3}$) and (b) sea surface height anomaly (SSHA) (units: m) during the SW monsoon (June–September). Arrows are geostrophic currents derived from the altimetry data. The green and white boxes denote the region of SLD. Blue contours denote the chlorophyll concentration of 0.35 mg m$^{-3}$ in Figure 2b.

3.3. Sea Surface Height

The distribution of sea surface height anomaly (SSHA) in the SLD box shows a negative center in the northwest and a positive anomaly in the southeast (Figure 4b). This pattern is consistent with the result of the dome tracing result in which the dome is developed on the lee side of Sri Lanka, to the northwest of the SMC [46]. The counterclockwise pattern of the geostrophic current is consistent with the negative SSHA that usually favors upwelling in the coastal ocean [47–49]. However, the summer high chlorophyll patch does not match the negative SSHA region. Instead, a high chlorophyll patch occurs at the boundary between the negative and positive anomalies of SSHA, which denotes the maximum slope of SSHA and matches the position of the SMC.

The timeseries of SSHA in the SLD box show a long-term increasing trend (Figure S3), which is removed as the detrended SSHA ($SSHA_{detrend}$) before comparing with the chlorophyll. Most chlorophyll peaks in each year correspond to a negative $SSHA_{detrend}$ and the R between them is $-0.34$. However, the $SSHA_{detrend}$ shows variability with a higher frequency than the chlorophyll (Figure 5).

Figure 5. Timeseries of mean chlorophyll versus detrended SSHA in the SLD box.
We applied the empirical orthogonal function (EOF) analysis to the monthly mean SSHA_{detrend} data in the region of 5–15°N, 75–90°E. The first principal component (PC1) interprets ~30% of the total variance and its distribution shows a dipole with the boundary near the SMC (Figure 6a). PC2 accounts for ~20% of the total variance (Figure 6b). It shows the antiphase of the core of the high chlorophyll patch in the SLD and the east coast of south India relative to other regions. PC3 shows a dipole pattern in the region off the east coast of Sri Lanka (Figure 6c). PC4 also shows a dipole in the SMC region and its northwestern side (Figure 6d). The timeseries of the PCs show that PC1 and PC2 have an annual cycle with the peak of the latter leading 2 months to the former (Figure 7). Both PC3 and PC4 show intra-seasonal variabilities.

Figure 6. Principal components (PCs) of the first four leading EOF modes (a–d) for monthly mean SSHA_{detrend}. Lower panels show the timeseries of the four modes. Contours in upper panels denote the chlorophyll concentration of 0.35 mg m⁻³ in Figure 2b.
Figure 7. Timeseries of first four leading PCs; (left panel) monthly timeseries; (right panel) monthly climatology. Shaded denotes the range of the standard deviation of PCs.

3.4. Eddy Distribution

The eddy distribution and its effect on the chlorophyll in the BoB was studied by ref. [50]. Here, we census eddies near the region of SLD from the Mesoscale Eddy Trajectory Atlas product. The snapshots of all eddies with a lifetime greater than 8 days were censused in the southwestern BoB during the SW monsoon. The SLD box is a hotspot of eddy activities comparing surrounding areas. The majority of cyclonic eddies (CE) occur in the northwest of the SLD box (Figure 8a), while anticyclonic eddies (ACE) are in the southeast (Figure 8b). The area with higher CE activities is consistent with the negative SSHA (Figure 4b) and the dome tracing result of ref. [46]. Usually, upwelling and dowelling happen in the center of a cyclonic and anticyclonic eddy, respectively [51], associating with negative SSHA in CE and positive in ACE. However, the high chlorophyll patch matches better with the region that has higher frequency of ACEs.

Figure 8. Number of eddy snapshots of (a) cyclonic and (b) anticyclonic eddies occurring in the 1° × 1° bin during the SW monsoon for the period of 1998–2020. Red boxes denote the region of SLD. White contours denote the chlorophyll value of 0.35 mg m⁻³ in Figure 1b.

Snapshot of eddies and SSHA during the period of SW monsoon show the dipole (a pair of ACE and CE) pattern in this region (Figure 9). The eddy pair is divided by the SMC
which intensify in June, mature and move northward in July–August, and decay at the end of September as shown by the surface geostrophic current (Figure 9). A CE and an ACE usually occur on the northwestern and southeastern sides of the SMC, respectively. The core of SLD can be represented by the CE, which moves northward gradually from June to September. This process is more clearly shown in the summer of 2014. At the end of September, an ACE usually covers the region near the east coast of Sri Lanka and the SLD is dismissed. It also shows clear interannual variation, such as the ACE was not shown off the east coast of Sri Lanka at the end of September 2016.

Figure 9. Snapshots of eddy dipole in the SLD region during June–September 2013–2016. Shaded areas show SSHA. Arrows denote geostrophic current. Blue and red contours denote the size of CEs and ACEs, respectively. Blue and red points denote the center of the CEs and ACEs, respectively. Note: only eddies occurring in the box of 4–12°N, 83–87°E are shown.

3.5. Frontal Probability

The FP during the SW monsoon is high around the coast of south India and Sri Lanka (Figure 10b), which matches well with the region of high chlorophyll (Figure 2b). The high FP region in the southeast coast of Sri Lanka extends to the SLD, following the pathway of SMC. During the northeast monsoon, the region with high FP near the coast is much smaller (Figure 10a). It shows relatively high FP on the pathway of the East India Coastal Current off the east coast of India and Sri Lanka as shown by the geostrophic current [23]. In the SLD, the FP during winter is also much lower than that of summer.
Takahashi2009 [53] show the strongest outgassing of CO$_2$ during the SW monsoon with a maximum (0.82 mol m$^{-2}$ yr$^{-1}$) in August. Among these products, JENA-MLS [52] and Takahashi2009 [53] show the strongest outgassing of CO$_2$ during the SW monsoon with ~100% higher flux than the other algorithms.

3.6. Sea-to-Air CO$_2$ Flux

The remote sensing of sea-to-air CO$_2$ flux is positive in the SLD box during the SW monsoon (Figure 11a), implying a net carbon source. The high flux region corresponds to the high chlorophyll patch and is consistent with the observation-based SeaFlux dataset by Fay et al. [52] (Figure 11b). The SeaFlux is an ensembled dataset that includes six global observation-based seawater pCO$_2$ mapping products and three wind products with a horizontal resolution of one degree [52]. The algorithm of SeaFlux contains three artificial neural-network-derived products (CMEMS-FFNN, MPI-SOMFFN, NIES-FNN), a mixed layer scheme product (JENA-MLS), a multiple linear regression (JMA-MLR), and a machine learning ensemble (CSIR-ML6) [52]. Our data has a higher spatial resolution than the SeaFlux dataset. Timeseries results also show that the seasonal variability of sea-to-air CO$_2$ flux calculated in this study is consistent with most of the ensemble members of the SeaFlux dataset and the shipboard observation data by Takahashi, et al. [53] (Figure 12).

The sea-to-air CO$_2$ fluxes of the SLD region are persistently positive all year round with a maximum (0.82 mol m$^{-2}$ yr$^{-1}$) in August. Among these products, JENA-MLS [52] and Takahashi2009 [53] show the strongest outgassing of CO$_2$ during the SW monsoon with ~100% higher flux than the other algorithms.
4. Discussion

4.1. Lateral Advection from the SSL to the SLD

The regional dynamics of the chlorophyll in the SLD region were largely attributed to the positive local wind stress curl which generate upwelling and doming of the nutricline during the SW monsoon [24]. However, the correlation between chlorophyll and wind stress curl is relatively weak, with a R value of 0.35. On the contrary, the R value is 0.65 in the SSL box. Moreover, the chlorophyll in the SLD box has a one-month lag relative to the one in the SSL box (Figure 2a). It was proposed that chlorophyll and/or nutrients are advected from the SSL to the SLD region [3,24]. Similar offshore transport was also found in the South China Sea [54,55] and western Arabian Sea [41] upwelling systems. The concept of delayed island mass effect was recently proposed to describe how nutrients from upwelled water near islands are advected and trigger remote blooms in the open ocean [56].

To test this hypothesis, we applied the forward Lagrangian particle tracking method, which was used in the South China Sea [40]. Each day, 1000 particles were released uniformly in surface waters within the SSL box from 1 to 30 July 2016. The position of every particle was tracked for 30 days unless it hit the boundary of the BoB (75°E in the west and 0°N in the south). Most particles move eastward and are distributed in the entire southwestern BoB in 30 days (Figure 13a). Near the equator, a small fraction of particles moves westward to the Arabian Sea. We censused the fraction of particles that enter the SLD box during the tracking period. In total, >80% of the total released particles entered this region, especially during 10–25 July (Figure 13d). On average, most particles entered the SLD box in the first 10 days (Figure 13b) and left the box 15–30 days after releasing (Figure 13c). Therefore, they stay in the SLD box for about 10–20 days. The tracking result explains the one-month lag of chlorophyll in the SLD box by indicating that chlorophyll and, more likely, nutrients remain in the SLD box for 10–20 days after being advected laterally from the SSL box. If high-nutrient water is transported from the coastal upwelling region to the open ocean via the SMC, it needs additional time delay (3–5 days) for chlorophyll in response to the supply of nutrients, as was noted by refs. [57,58]. However, the high chlorophyll patch does not occur as wide as the region with particles being distributed. It requires nutrients to be consumed out in the SLD box. The tracking result support that the mechanism of delayed island mass effect [56] works in this region.

Figure 12. Monthly climatology of sea-to-air CO2 flux (units: mol m⁻² yr⁻¹) in the SLD box. Gray dashed lines denote ensemble members of the SeaFlux dataset [52] and Takahashi2009 [53] data. Shaded denotes the range of standard deviation of each month in this study.
Figure 13. (a) Position distribution of particles released during 1–30 July 2016. The shaded areas denote the days after each particle is released. (b) Time distribution of particles entering the SLD box. The X-axis denotes the days after the particles are released. (c) The same as (b), but for days of particles moving outside of the SLD box. (d) Fraction of particles released each day can enter the SLD box.

4.2. Impact of Sea Surface Height, Eddy, and Front on the Chlorophyll

The variability of SSHA in the SLD box shows a higher frequency than that of chlorophyll (Figure 5). EOF analysis reveals that the peak of the PC1 occurs in July (Figure 7), corresponding to the wind stress curl. This probably reflects the local forcing of the monsoon. The timeseries of the PC2 also shows one peak each year, but leads the wind stress curl for 2 months. We interpret this as the mode of inter-monsoon which occurs in May and November. Both PC3 and PC4 show a dipole pattern with intra-seasonal variability (Figures 6 and 7), probably reflecting the westward-propagated eddy activities [59]. The monthly mean SSHA data limit is used to discuss the intra-seasonal variability in detail. However, it was already found that the cycle of SSHA in this region has the cyclicity of 30–60 days [60]. The reflection of equatorial Kelvin waves from the eastern boundary of the Indian Ocean produces a sequence of cyclonic and anticyclonic eddies passed through the box of SLD [23,60]. Therefore, the intra-seasonal variability of SSHA in the SLD region is mainly determined by the far-field oceanic forcing, rather than the local wind forcing. Furthermore, the dipole distribution of CE and ACE (Figures 6 and 7) reflects the westward propagation of upwelling and downwelling Rossby waves. A similar eddy dipole also occurred in the summer upwelling near the coast of Vietnam and the western Arabian Sea [61,62]. However, a recent observation and modeling study suggested that the ACE–CE dipole is generated by topographically trapped Rossby waves near the Sri Lankan coast [63], but both hypotheses emphasized the interaction between oceanic waves and the SMC [63,64]. The region with co-occurrence of frequent ACE and high chlorophyll patch may imply the contribution of ACEs. We analyzed the mean chlorophyll concentration inside each eddy that occurred in the SLD box during the SW monsoon (Figure 14). The chlorophyll extremes (>0.75 mg m\(^{-3}\)) in the CE are higher than that in ACE, implying that the CE-induced upwelling would increase the chlorophyll concentration. However, the mean concentration of all CEs (0.34 mg m\(^{-3}\)) does not have a significant difference from that of all ACEs (0.34 mg m\(^{-3}\)). Therefore, the occurrence of ACE in the high-chlorophyll patch has a neglected or weak-negative impact on the chlorophyll.
Both the BoBBLE observation and modeling results showed that the SLD region develops prominent deep chlorophyll maxima (DCM) at intermediate depths (20–50 m) [30]. The DCM is stronger in the region of the SLD and the SMC due to the corresponding Ekman pumping [30], but weaker outside the dome. Therefore, another possibility is that the effect of CE increases the concentration of DCM that is not observed by satellite. However, the model result showed that the SMC region features the strongest DCM as well as the highest depth-integrated chlorophyll [30]. Thus, the change in surface chlorophyll observed by satellite can represent the subsurface condition. We suggest eddy activities have limited direct influence on the distribution of chlorophyll in the SLD box.

In the coastal upwelling system, FP is an effective indicator of hydrodynamics [39,41,65]. When the along-shore wind forces off-shore Ekman transport, cold water from the subsurface is forced to upwell to the surface and fronts subsequently develop around the boundary of water masses, associating with a strong SST gradient [17,66]. The cold water near the coast further reduces the wind aloft and produces a positive wind stress curl [67–69]. Both the wind stress curl and FP in the SSL box show the same seasonality and are highly correlated with chlorophyll (Figures 3b and 15). The peak of FP in winter can interpret the winter chlorophyll maximum in the SSL. The wind stress curl, however, does not have the winter maximum (Figure 3b). FP also reveals the sub-mesoscale process, which produces strong vertical mixing/convection and provides nutrients to the surface layer [66,70,71]. In the SLD box, the maxima of FP occur in August, the same month as the occurrence of chlorophyll maximum. In terms of the spatial distribution, the high FP occurs on the pathway of SMC (Figure 10b). The Arabian Sea high-salinity water enters the southern BoB with the SMC [72]. It is proposed that the advection of high-salinity water decreases stratification [25]. CE in the northwest side can upwell the high-salinity water from the subsurface to the surface. Therefore, the interaction between the SMC and mesoscale eddies can produce fronts and strong mixing along the SMC [63,73,74]. The current and surface wind are oriented in the same direction, which may also trigger instabilities and sub-mesoscale fronts [75]. In addition, the region of SLD usually receives less precipitation during the SW monsoon [76,77], but some extreme precipitation events can result in frontal filament and strong sub-mesoscale mixing in this region [78]. The match of phases

Figure 14. Scatterplot of chlorophyll averaged inside eddy and the associated eddy’s amplitude for all eddies’ snapshots in the SLD box during the SW monsoon over the period from 1998 to 2020. ACEs and CE have positive and negative amplitudes, respectively. Chlorophyll concentration of the 5-day mean from the Ocean Color CCI product is used here.

Remote Sens. 2022, 14, x FOR PEER REVIEW 14 of 20

433 Figure 14. Scatterplot of chlorophyll averaged inside an eddy and the associated eddy’s amplitude for all eddies’ snapshots in the SLD box during the SW monsoon over the period from 1998 to 2020. ACEs and CE have positive and negative amplitudes, respectively. Chlorophyll concentration of the 5-day mean from the Ocean Color CCI product is used here.

Both the BoBBLE observation and modeling results showed that the SLD region develops prominent deep chlorophyll maxima (DCM) at intermediate depths (20–50 m) [30]. The DCM is stronger in the region of the SLD and the SMC due to the corresponding Ekman pumping [30], but weaker outside the dome. Therefore, another possibility is that the effect of CE increases the concentration of DCM that is not observed by satellite. However, the model result showed that the SMC region features the strongest DCM as well as the highest depth-integrated chlorophyll [30]. Thus, the change in surface chlorophyll observed by satellite can represent the subsurface condition. We suggest eddy activities have limited direct influence on the distribution of chlorophyll in the SLD box.

In the coastal upwelling system, FP is an effective indicator of hydrodynamics [39,41,65]. When the along-shore wind forces off-shore Ekman transport, cold water from the subsurface is forced to upwell to the surface and fronts subsequently develop around the boundary of water masses, associating with a strong SST gradient [17,66]. The cold water near the coast further reduces the wind aloft and produces a positive wind stress curl [67–69]. Both the wind stress curl and FP in the SSL box show the same seasonality and are highly correlated with chlorophyll (Figures 3b and 15). The peak of FP in winter can interpret the winter chlorophyll maximum in the SSL. The wind stress curl, however, does not have the winter maximum (Figure 3b). FP also reveals the sub-mesoscale process, which produces strong vertical mixing/convection and provides nutrients to the surface layer [66,70,71]. In the SLD box, the maxima of FP occur in August, the same month as the occurrence of chlorophyll maximum. In terms of the spatial distribution, the high FP occurs on the pathway of SMC (Figure 10b). The Arabian Sea high-salinity water enters the southern BoB with the SMC [72]. It is proposed that the advection of high-salinity water decreases stratification [25]. CE in the northwest side can upwell the high-salinity water from the subsurface to the surface. Therefore, the interaction between the SMC and mesoscale eddies can produce fronts and strong mixing along the SMC [63,73,74]. The current and surface wind are oriented in the same direction, which may also trigger instabilities and sub-mesoscale fronts [75]. In addition, the region of SLD usually receives less precipitation during the SW monsoon [76,77], but some extreme precipitation events can result in frontal filament and strong sub-mesoscale mixing in this region [78]. The match of phases

Figure 14. Scatterplot of chlorophyll averaged inside eddy and the associated eddy’s amplitude for all eddy’s snapshots in the SLD box during the SW monsoon over the period from 1998 to 2020. ACEs and CE have positive and negative amplitudes, respectively. Chlorophyll concentration of the 5-day mean from the Ocean Color CCI product is used here.

Both the BoBBLE observation and modeling results showed that the SLD region develops prominent deep chlorophyll maxima (DCM) at intermediate depths (20–50 m) [30]. The DCM is stronger in the region of the SLD and the SMC due to the corresponding Ekman pumping [30], but weaker outside the dome. Therefore, another possibility is that the effect of CE increases the concentration of DCM that is not observed by satellite. However, the model result showed that the SMC region features the strongest DCM as well as the highest depth-integrated chlorophyll [30]. Thus, the change in surface chlorophyll observed by satellite can represent the subsurface condition. We suggest eddy activities have limited direct influence on the distribution of chlorophyll in the SLD box.

In the coastal upwelling system, FP is an effective indicator of hydrodynamics [39,41,65]. When the along-shore wind forces off-shore Ekman transport, cold water from the subsurface is forced to upwell to the surface and fronts subsequently develop around the boundary of water masses, associating with a strong SST gradient [17,66]. The cold water near the coast further reduces the wind aloft and produces a positive wind stress curl [67–69]. Both the wind stress curl and FP in the SSL box show the same seasonality and are highly correlated with chlorophyll (Figures 3b and 15). The peak of FP in winter can interpret the winter chlorophyll maximum in the SSL. The wind stress curl, however, does not have the winter maximum (Figure 3b). FP also reveals the sub-mesoscale process, which produces strong vertical mixing/convection and provides nutrients to the surface layer [66,70,71]. In the SLD box, the maxima of FP occur in August, the same month as the occurrence of chlorophyll maximum. In terms of the spatial distribution, the high FP occurs on the pathway of SMC (Figure 10b). The Arabian Sea high-salinity water enters the southern BoB with the SMC [72]. It is proposed that the advection of high-salinity water decreases stratification [25]. CE in the northwest side can upwell the high-salinity water from the subsurface to the surface. Therefore, the interaction between the SMC and mesoscale eddies can produce fronts and strong mixing along the SMC [63,73,74]. The current and surface wind are oriented in the same direction, which may also trigger instabilities and sub-mesoscale fronts [75]. In addition, the region of SLD usually receives less precipitation during the SW monsoon [76,77], but some extreme precipitation events can result in frontal filament and strong sub-mesoscale mixing in this region [78]. The match of phases
between FP and chlorophyll in the SLD implies that the front-related sub-mesoscale mixing contributes to the increase of chlorophyll.

Figure 15. Monthly climatology of FP in the SLD and SSL box. Shaded denotes the range of standard deviation of each month.

4.3. Dynamics of the Air–Sea CO₂ Flux

It is well known that the persistent upwelling systems such as the Humboldt upwelling in the East Pacific and equatorial upwelling in the eastern equatorial Pacific are significant sources of atmospheric CO₂ [79–81]. However, the physical and biological control of seawater pCO₂ in the southwestern BoB is not well understood. The first-order mechanism of the SLD is wind-induced Ekman pumping rather than the Ekman transport in the coastal upwelling system. Most biogeochemical models reproduced a weak source or even a sink during the SW monsoon in the SLD [26,82]. However, the observational CO₂ flux during the SW monsoon period reveals that it is a moderate–strong source of CO₂ with a flux of 1.79 mol m⁻² yr⁻¹ [53]. The bias of models is due to overestimated primary productivity [82]. Our calculated air–sea CO₂ flux based on remote sensing products has higher temporal and spatial resolution than the shipboard observations. The seasonal variability in CO₂ flux is consistent with the result of Takahashi et al. (2009), but has a smaller amplitude (Figure 12). Because of the scarcity of observation data, the flux must be validated further in future studies. Recent observation results from BoBBLE showed that the upwelled subsurface water from SMC has a higher dissolved inorganic carbon (DIC)-to-nitrate ratio than the conventional Redfield ratio (106:16) [25]. It is assumed that the upwelled nutrient is consumed by phytoplankton because the nitrate concentration is extremely low in this region. The excess of DIC can act as the source to the atmosphere [25]. As discussed above, the high wind stress curl and FP occurred on the pathway of SMC, suggesting the strongest upwelling and/or sub-mesoscale process in this region. The highest CO₂ flux also matches the pathway of SMC (Figure 11a). Our results support that the advection of high-salinity water via the SMC decreases stratification, combining with the frontal process to favor deeper mixing and ventilation in the SLD during SW monsoon.
5. Conclusions

In this paper, we studied the controlling factors for the formation of the SLD during the SW monsoon. The positive wind stress curl is the first-order forcing. The plateau of the positive wind stress curl was quickly established from May, which interprets the onset of increasing in chlorophyll. There is a one-month lag of chlorophyll in the SLD region relative to the SSL region, indicating the role of the lateral advection of nutrients from coastal upwelling waters of SSL via the SMC.

Cyclonic eddies introduce a limited increase of chlorophyll in the SLD. The more frequent occurrence of anticyclonic eddies in the high-chlorophyll patch indicates that eddy activities have a weak impact on the chlorophyll variability.

Higher FP in the SLD region corresponds to the SMC, implying the occurrence of fronts and strong mixing on the pathway of SMC.

The subsurface water of the SLD has a higher DIC-to-nutrients ratio than the conventional Redfield ratio. The wind-driven upwelling and/or sub-mesoscale process make the surface waters have excess DIC and, hence, establish them as a carbon source to the atmosphere.

Supplementary Materials: The following supporting information can be downloaded at: https://www.mdpi.com/article/10.3390/rs14143239/s1, Figure S1: Seawater pCO$_2$ observation data used for training in the Indian Ocean; Figure S2: Wind stress curl of ERA5 vs. CCMP wind product; Figure S3: Timeseries of mean SSHA in the SLD region from 1998 to 2020.

Author Contributions: Conceptualization: W.M.; methodology: W.M., Y.W., Y.B., Y.Y., Z.Z. and J.X.; writing—original draft preparation: W.M.; writing—review and editing: Y.W., Y.B. and Y.Y.; visualization: W.M. and X.M.; funding acquisition: W.M. All authors have read and agreed to the published version of the manuscript.

Funding: This research was funded by the Strategic Priority Research Program, Chinese Academy of Sciences, China, Grant No. XDB42000000; Global Change and Air–Sea Interaction Program Phase II (“Joint Advanced Marine and Ecological Studies in the Bay of Bengal and the Eastern Equatorial Indian Ocean (JAMES)”, Grant No. GASI-01-EIND-STwin); the National Natural Science Foundation of China, Grant No. 41876123; SOED research program, Grant No. SOEDZZ2104.


Acknowledgments: We thank Siqi Zhang for helping to prepare the CO$_2$ flux data for the BoB. The open-source Climate Data Toolbox for MATLAB [83] helped us to implement data analysis. We are grateful to the academic editor and reviewers for constructive suggestions.

Conflicts of Interest: The authors declare no conflict of interest.
Abbreviations

ACE Anticyclonic eddy
BoB Bay of Bengal
BoBBLE Bay of Bengal Boundary Layer Experiment
CE Cyclonic eddy
DCM Deep chlorophyll maxima
NPP Net primary productivity
MLD Mixed layer depth
Ocean Color CCI Ocean Colour Climate Change Initiative
Rrs Remote-sensing reflectance
SCS South China Sea
SLD Sri Lanka dome
SMC Southwest monsoon current
SSHA Sea surface height anomaly
SSS Sea surface salinity
SST Sea surface temperature

References

47. Chen, Y.; Shi, H.; Zhao, H. Summer Phytoplankton Blooms Induced by Upwelling in the Western South China Sea. *Front. Mar. Sci.* **2021**, *8*, 740130. [CrossRef]


76. Keshtgar, B.; Alizadeh-Chooobari, O.; Irannejad, P. Seasonal and interannual variations of the intertropical convergence zone over the Indian Ocean based on an energetic perspective. *Clim. Dyn.* 2020, 54, 3627–3639. [CrossRef]


