

The effect of seasonally and spatially varying chlorophyll on Bay of Bengal surface ocean properties and the South Asian monsoon

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Abstract. Chlorophyll absorbs solar radiation in the upper ocean, increasing the mixed layer radiative heating and sea surface temperatures (SST). Although the influence of chlorophyll distributions in the Arabian Sea on the southwest monsoon has been demonstrated, there is a current knowledge gap regarding how chlorophyll distributions in the Bay of Bengal influence the southwest monsoon. The solar absorption caused by chlorophyll can be parameterized as an optical parameter, h_2 , which expresses the scale depth of the absorption of blue light. Seasonally and spatially varying h_2 fields in the Bay of Bengal were imposed in a 30-year simulation using an atmospheric general circulation model coupled to a mixed layer thermodynamic ocean model in order to investigate the effect of chlorophyll distributions on regional SST, the southwest monsoon circulation, and precipitation. There are both direct local upperocean effects, through changes in solar radiation absorption, and indirect remote atmospheric responses. The depth of the mixed layer relative to the perturbed solar penetration depths modulates the response of the SST to chlorophyll. The largest SST response of 0.5 °C to chlorophyll forcing occurs in coastal regions, where chlorophyll concentrations are high $(> 1 \text{ mg m}^{-3})$, and when climatological mixed layer depths shoal during the inter-monsoon periods. Precipitation increases significantly (by up to 3 mm d^{-1}) across coastal Myanmar during the southwest monsoon onset

and over northeast India and Bangladesh during the Autumn inter-monsoon period, decreasing model biases.

1 Introduction

The strong coupling of the Indian Ocean to the atmosphere is a major factor in South Asian monsoon seasonal variability (Ju and Slingo, 1995). During the boreal summer, strong southwesterly winds transport heat and moisture from the Indian Ocean surface to sustain deep convection over the Indian subcontinent. The South Asian summer monsoon provides up to 90% of the annual rainfall for the Indian subcontinent (Vecchi and Harrison, 2002), so it is important to accurately predict the seasonal variability of monsoon rainfall given its economic importance to agriculture and other water-intensive industries.

The South Asian monsoon is initiated when lowertropospheric winds, transporting heat and moisture, begin to flow northward from the Equator to the Asian continent in response to increasing summer insolation and increasing land-sea thermal and pressure gradients (grey arrows in Fig. 1; Webster et al., 1998). Mid-tropospheric heating from the elevated Tibetan Plateau increases the land-sea thermal and pressure contrast, further regulating the seasonal reversal of the large-scale circulation (Li and Yanai, 1996). From June to September (June–July–August–September, JJAS),



Figure 1. The Bay of Bengal (BoB) and the surrounding region of interest. The average JJAS chlorophyll-*a* concentration climatology measured from MODIS-Aqua at a 4 km horizontal resolution is shown. The locations of major rivers are represented as blue lines. The Sri Lanka dome (SLD) is shown as a cyclonic (anticlockwise) black circle, and the Southwest Monsoon Current (SMC) is shown using a solid black arrow. Southwesterly monsoon winds are shown using solid grey arrows. Missing chlorophyll concentration data are shown in grey. The locations of missing h_2 grid points in MC-KPP are shown using black hatching.

high climatological precipitation rates (> 20 mm d^{-1}), associated with the South Asian southwest monsoon, are anchored to three locations across the Indian subcontinent: the western Ghats of southwestern India, the Myanmar coast, and from Bangladesh north into the Himalayan foothills (Fig. 2f, g, h, i). Coupled ocean-atmosphere general circulation models (GCMs) have improved their representations of the seasonal variability and spatial distribution of South Asian southwest monsoon precipitation, but substantial biases remain. Lin et al. (2008) found that 12 out of 14 coupled GCMs from the Coupled Model Intercomparison Project Phase 3 (CMIP3) captured the South Asian southwest monsoon seasonal-mean precipitation rate reasonably well. However, most GCMs simulated excessive precipitation at the Equator and insufficient precipitation across the northern Bay of Bengal (BoB) and Bangladeshi region from May to October. Sperber et al. (2013) compared 25 CMIP5 models with 22 CMIP3 models. CMIP5 models have higher vertical and horizontal resolutions in the ocean and atmosphere and include additional Earth system processes compared with CMIP3 models. CMIP5 multi-model means have a better representation of precipitation rates over the western Ghats, Myanmar, and Bangladesh than CMIP3 multi-model means from June to September. However, both the CMIP5 and CMIP3 models underestimate precipitation over the BoB and India at 20° N. There is also a consistent dry bias of up to 4 mm d^{-1} over central India at 25–30° N and a delay to the summer monsoon onset and peak over most of India in both CMIP5 and CMIP3 models. The significant biases from JJAS show that state-of-the-art coupled GCMs still struggle to capture the basic seasonality of summer monsoon precipitation across the BoB and the wider Indian subcontinent.

Chlorophyll significantly affects the Indian Ocean sea surface temperature (SST) and the South Asian monsoon through the absorption of sunlight (Nakamoto et al., 2000; Wetzel et al., 2006; Turner et al., 2012; Park and Kug, 2014). Nakamoto et al. (2000) used an ocean isopycnal GCM, with a two-band solar absorption scheme from Paulson and Simpson (1977), to investigate SST modulation in the Arabian Sea. Imposing a monthly climatology of chlorophyll concentrations, measured by the Coastal Zone Color Scanner (CZCS), decreased the mixed layer depth (MLD) and the solar radiation penetration depth during the inter-monsoon and increased the SST by 0.6 °C. Wetzel et al. (2006) used a biogeochemistry model coupled to an ocean-atmosphere GCM to show that spring chlorophyll blooms in the western Arabian Sea increased the SST by 1 °C at 20° N; this led to a $3 \,\mathrm{mm}\,\mathrm{d}^{-1}$ increase in rainfall over western India during the southwest monsoon onset. Turner et al. (2012) showed similar results when they imposed seasonally varying chlorophyll concentrations from SeaWiFS in a coupled ocean-atmosphere GCM. The spring chlorophyll blooms in the western Arabian Sea reduced the MLD biases by 50 %, increased the SST by 0.5-1.0 °C, and increased rainfall by $2 \,\mathrm{mm}\,\mathrm{d}^{-1}$ over southwestern India during the southwest monsoon onset. Park and Kug (2014) used a biogeochemistry model coupled to an ocean GCM to investigate the biological feedback on the Indian Ocean Dipole (IOD). The response to interactive biology enhanced both warming during a positive IOD (cooling in the eastern equatorial Indian Ocean) and cooling during a negative IOD (warming in the eastern equatorial Indian Ocean), thereby dampening the IOD magnitude, which could have a significant impact on the South Asian summer monsoon.

The thermal and saline surface properties of the Bay of Bengal (BoB; Fig. 1), in the northeastern Indian Ocean, are strongly forced by the monsoonal winds and large freshwater flux. In the northern BoB, the large freshwater flux from river discharge and precipitation leads to strong salinity stratification and barrier-layer formation above the thermocline and below the mixed layer (Vinayachandran et al., 2002; Jana et al., 2015; Sengupta et al., 2016). The barrier layer inhibits vertical mixing (Sprintall and Tomczak, 1992; Rao and Sivakumar, 2003) and isolates the mixed layer above from cooling by entrainment (Duncan and Han, 2009), modulating the seasonal MLD and its temperature (Girishkumar et al., 2011; Shee et al., 2019).

The BoB SST rapidly responds to variations in the net surface heat flux, which, in turn, are primarily controlled by variations in winds speed (Duncan and Han, 2009). Although



Figure 2. Monthly climatological precipitation rate measured from the Tropical Rainfall Measuring Mission (TRMM) 3B42 satellite product from January to December.

the BoB SST decreases with increasing wind speed during the southwest monsoon (JJAS), the SST remains high enough (> 28 °C) to sustain high precipitation rates across the Indian subcontinent, consequently strengthening the salinity stratification and further reinforcing convection across the basin (Shenoi et al., 2002). The salinity stratification is weaker in the southern BoB, allowing monsoonal winds to primarily control the upper-ocean thermal structure (Narvekar and Kumar, 2006). Hence, the southern BoB MLD and SST display larger seasonal variability compared with the northern BoB (Narvekar and Kumar, 2006).

The strong BoB salinity stratification reduces biological productivity by inhibiting the vertical transport of nutrients to the sunlit surface layers (Kumar et al., 2002; McCreary et al., 2009). Biological productivity during JJAS is also inhibited by cloud cover and by the infiltration of river sediments, which reduce the incoming solar radiation at the ocean surface and the in-water penetration depth of solar radiation respectively (Gomes et al., 2000; Kumar et al., 2010). However, in certain regions of the BoB, localized seasonal physical forcing breaks the strong stratification and increases the vertical transport of nutrients to the sunlit surface layers, increasing biological productivity. Chlorophyll concentrations in the coastal regions are high (> 1 mg m⁻³; Fig. 1), especially near large rivers such as the Ganges, Brahmaputra, Mahanadi, and Irrawaddy, due to the nutrients supplied by these

rivers from June to October (Amol et al., 2019). Chlorophyll concentrations in the northern coastal region typically peak in October (Fig. 3j; Lévy et al., 2007), when river discharge and nutrients also peak (Rao and Sivakumar, 2003). High chlorophyll concentrations are then transported along the northeast coast of the BoB (Amol et al., 2019).

In the southern BoB, strong southwesterly winds across the southernmost tip of India and Sri Lanka initiate coastal upwelling and, thus, biological productivity, leading to a maximum in the chlorophyll concentration there in August (Fig. 1; Lévy et al., 2007). The Southwest Monsoon Current (SMC), a shallow, fast current, advects these high chlorophyll concentrations to the southwestern BoB (Fig. 1; Vinayachandran et al., 2004). High chlorophyll concentrations are sustained east of Sri Lanka by the cyclonic (anticlockwise) eddy of the Sri Lanka dome (SLD), where openocean Ekman upwelling transfers nutrients to the near surface during JJAS (Fig. 1; Vinayachandran and Yamagata, 1998; Vinayachandran et al., 2004; Thushara et al., 2019). In the western and southwestern BoB in winter, northeasterly winds induce open-ocean Ekman upwelling, leading to increased chlorophyll concentrations peaking in December and January (Fig. 31, a; Vinayachandran and Mathew, 2003; Lévy et al., 2007). Chlorophyll concentrations in the open BoB also show sub-seasonal and mesoscale variability. Surface chlorophyll concentrations are periodically enhanced



Figure 3. Monthly chlorophyll-*a* concentration climatology measured from MODIS-Aqua at a 4 km horizontal resolution from January to December. The BoB domain is outlined using a black dashed box (77–99.5° E, 2.5–24° N) that shows the location of the imposed annual cycle of chlorophyll concentrations for the perturbation simulation. Missing data are shown in grey.

by transient cold-core eddies and post-monsoon cyclones, where the strong salinity stratification is briefly eroded and nutrients are transported to the near surface in the western and central BoB (Vinayachandran and Mathew, 2003; Kumar et al., 2007; Patra et al., 2007).

A few studies have briefly analysed the effect of seasonally varying chlorophyll concentrations on the BoB upper-ocean dynamics and SST, whilst also speculating on how this may affect the South Asian monsoon (Murtugudde et al., 2002; Wetzel et al., 2006). Although the effect of chlorophyll on the BoB SST has been demonstrated by these previous studies, the effect of chlorophyll on monsoon rainfall remains a vital knowledge gap. Without this knowledge, missing biophysical interactions in the BoB could lead to inaccuracies in simulated air-sea interactions that are crucial for representing accurate monsoon behaviour and, thus, rainfall timing, location, and duration over the Indian subcontinent. This study analyses the direct effect of the BoB seasonally varying chlorophyll concentrations on the South Asian monsoon in an atmospheric GCM that is coupled to a mixed layer thermodynamic ocean model. A description of the experimental design, model, and observed datasets used in this study is presented in Sect. 2. Section 3 presents the results of the control and chlorophyll-perturbed model outputs. Section 4 discusses the results from the chlorophyll-perturbed experiment and provides conclusions.

2 Methods and data

2.1 MetUM-GOML

This study uses the Global Ocean Mixed Layer 3.0 configuration of the UK Met Office Unified Model (MetUM-GOML3.0), which comprises the Multi-Column K Profile Parameterization (MC-KPP version 1.2) ocean coupled to the MetUM Global Atmosphere 7.0 (Walters et al., 2019). The atmospheric and oceanic horizontal resolution is N216 (0.83° longitude $\times 0.56^{\circ}$ latitude), which corresponds to a horizontal grid spacing of approximately 90 km. There are 85 vertical levels in the atmosphere, with approximately 50 vertical levels in the troposphere. MetUM-GOML3.0 is configured similarly to MetUM-GOML2.0 (Peatman and Klingaman, 2018) and MetUM-GOML1.0 (Hirons et al., 2015), except that the atmospheric model is updated to GA7.0 and the airsea coupling routines are updated to couple the models via the Ocean-Atmosphere-Sea Ice-Soil (OASIS) Model Coupling Toolkit (Valcke, 2013).

MC-KPP consists of a grid of independent onedimensional columns, with one column positioned under each atmospheric grid point at the same horizontal grid spacing as MetUM GA7.0. The ocean columns are 1000 m with 100 vertical points, with 70 points in the top 300 m; the near-surface resolution is approximately 1 m. This improves the representation of the MLD and SST, which has been shown to improve tropical convection and circulation on sub-seasonal scales when coupled to an atmospheric GCM (Bernie et al., 2005; Bernie et al., 2008; Klingaman et al., 2011). Each column is subject to surface forcing from freshwater, heat, and momentum fluxes; vertical mixing is parameterized using the KPP scheme from Large et al. (1994). The MLD is defined as the depth where the bulk Richardson number equals the critical Richardson number of 0.3 (Large et al., 1994). The coastal region in MC-KPP is represented with columns that are part ocean and part land. The surface properties for ocean and land are computed separately in MC-KPP, and the mean grid point temperatures are computed in the atmospheric model by combing the ocean and land surface temperatures from MC-KPP.

Solar radiation absorption is represented as a wavelengthdependent penetration depth, with blue wavelengths penetrating deeper than red wavelengths. The decay of solar irradiance through the water column is represented as a simple two-band double-exponential function (Paulson and Simpson, 1977):

$$\frac{I(z)}{I_0} = Re^{-\frac{z}{h_2}} + (1-R)e^{-\frac{z}{h_2}},$$
(1)

where I(z) is the solar irradiance at depth z, I_0 is the solar irradiance at the ocean surface, R is the ratio of red light to the total visible spectrum, and h_1 and h_2 are the scale depths of red and blue light respectively. The scale depth, or *e*-folding depth, is defined as the depth where solar irradiance is approximately 63 % less than its surface value $(1 - e^{-1})$. Paulson and Simpson (1977) determined the optical parameters based on each of the five Jerlov water types that categorize open-ocean turbidity (Jerlov, 1968). Water type IB represents the average open-ocean turbidity, where chlorophyll concentrations are $\sim 0.1 \,\mathrm{mg \, m^{-3}}$ (Morel, 1988); h_1 and h_2 are 1 m and 17 m respectively. Increasing the upperocean turbidity to water type III, where chlorophyll concentrations exceed 1.5–2.0 mg m⁻³ (Morel, 1988), yields h_1 and h_2 of 1.4 and 7.9 m respectively. The scale depth for red light $(h_1 \sim 1-1.4 \text{ m})$ for all water types is much less than the typical MLD (>10 m). Hence, all red light is absorbed at the top of the mixed layer. However, the scale depth for blue light $(h_2 \sim 8-17 \text{ m})$ is comparable to the typical MLD; a significant fraction of blue light will penetrate below the mixed layer. Hence, the reduction of h_2 with increasing turbidity controls the radiant heating of the mixed layer and, thus, the SST (Zaneveld et al., 1981; Lewis et al., 1990; Morel and Antoine, 1994).

MC-KPP uses the Paulson and Simpson (1977) scheme (Eq. 1) for the absorption of red and blue light with depth through the upper ocean. In this study, a h_2 of 17 m from Jerlov water type IB is used to represent the global average solar penetration depth in MC-KPP. Chlorophyll and biogeochemical processes are not included. The effect of chlorophyll on the ocean is modelled by specifying h_2 .

MC-KPP does not represent horizontal or vertical advection. The ocean temperature and salinity correction method of Hirons et al. (2015) is used to constrain the MC-KPP mean state to account for missing advection and biases in atmospheric surface fluxes. The method uses a separate 10-year MetUM-GOML relaxation simulation in which temperature and salinity are relaxed with a 15 d timescale to an observed seasonal cycle, here the 1980-2009 climatology of Smith and Murphy (2007). A relaxation timescale of 15 d is optimal to produce temperature and salinity tendency terms that minimize biases in the free-running simulations (Hirons et al., 2015). A mean seasonal cycle of daily temperature and salinity tendencies that is computed from this relaxation simulation is applied to the 30-year chlorophyll perturbation simulations. The spin-up time is small (1 year), as the ocean is adjusted to a mean state after the relaxation simulation. The absence of ocean dynamics means that MetUM-GOML does not represent coupled modes of variability (e.g. ENSO or IOD) which rely on a dynamical ocean (Hirons et al., 2015). The benefit of not representing these modes of variability is that the signal from the chlorophyll perturbation experiment will not be obscured by the "noise" of these interannual climate variations. The absence of full ocean dynamics also reduces the computational cost and allows the model to be used for climate-length coupled simulations with shorter spin-up periods (Hirons et al., 2015).

We directly impose a seasonally varying h_2 value (representative of chlorophyll concentration) to selected columns within the BoB region, whilst the global ocean outside the BoB region has a constant h_2 value. This set-up enables us to investigate the direct impact of chlorophyll on BoB surface ocean properties, atmospheric surface fluxes, and the regional climate. Furthermore, the absence of biological and physical feedbacks on chlorophyll development means that a consistent seasonally varying h_2 value is directly imposed on columns within the BoB throughout the simulation.

2.2 Chlorophyll-a data

To produce a temporally and spatially varying field of h_2 for MC-KPP, a monthly climatology of chlorophyll-*a* concentration, measured from the Moderate Resolution Imaging Spectroradiometer (MODIS) on the Aqua satellite, was used. MODIS-Aqua chlorophyll-*a* concentration (available from NASA's Ocean Color database; https://oceancolor.gsfc. nasa.gov, last access: 9 August 2020) is available as a 17-year climatology (2002–2018) at a spatial resolution of 4 km. The backscattered solar radiation from the ocean surface

(water-leaving radiance) in nine spectral bands between 412 and 869 nm measured by MODIS-Aqua were used to calculate the chlorophyll-a concentration (Hu et al., 2012b). Chlorophyll-a concentration retrievals below 0.25 mg m^{-3} were calculated using the "color index" (CI) three-band reflectance algorithm (Hu et al., 2012b). Chlorophyll-a retrievals above 0.3 mg m^{-3} were calculated using the "ocean color 3" (OC3) algorithm, which is a fourth-degree polynomial relating three wavelengths of water-leaving radiance (433, 490 and 550 nm) to the chlorophyll-a concentration (O'Reilly et al., 2000). Chlorophyll-a retrievals from 0.25 to $0.3 \,\mathrm{mg}\,\mathrm{m}^{-3}$ were calculated by merging the CI and OC3 algorithms to create the "ocean color index" (OCI) algorithm (Wang and Son, 2016; Hu et al., 2019). Chlorophyll-a concentration retrievals above 5 mg m^{-3} reduce the effectiveness of the OC3 algorithm (Morel et al., 2007). Organic and terrestrial material, introduced by rivers or mixed by tidal currents in coastal regions, change the scattering of visible light, affecting the water-leaving radiances (Boss et al., 2009) and leading to an overestimate of the chlorophyll-a concentration (Morel et al., 2007). Hence, remotely sensed chlorophyll-a concentrations were not determined in the eutrophic coastal regions of the Ganges and Irrawaddy river deltas due to the large amount of suspended organic and terrestrial material (grey shading in Fig. 1; Tilstone et al., 2011). MODIS sensor degradation on the Aqua satellite has been small (Franz et al., 2008), and all ocean colour products have since been corrected and improved after cross-calibration with the Sea-WiFS climatology (Meister and Franz, 2014). Chlorophyll a will henceforth be referred to as "chlorophyll" for convenience.

2.3 Experiment set-up

To investigate the impact of the seasonal and spatial variability of chlorophyll-induced heating in the BoB, two 30-year simulations with differing prescribed h_2 (representative of chlorophyll concentrations) were completed: a control run using $h_2 = 17$ m globally and a perturbation run using an annual cycle of h_2 at a daily resolution for the BoB region (defined below) and $h_2 = 17$ m over the rest of the global ocean. In both simulations, R and h_1 were kept constant, at 0.67 and 1.0 m respectively, which are values representative of water type IB. The first year of both simulations was discarded due to spin up; the analysis was carried out on the remaining 29 years.

The control simulation used an effective constant global chlorophyll concentration of ~ 0.15 mg m⁻³, which corresponds to $h_2 = 17$ m (Jerlov water type IB; Morel, 1988). Some previous studies have used control simulations with zero chlorophyll concentrations to see the full impact of chlorophyll on physical and dynamical processes (e.g. Gnanadesikan and Anderson, 2009), whereas other studies have used constant scale depths determined from parameterizations of the lowest chlorophyll concentrations encountered

(e.g. Shell et al., 2003; Turner et al., 2012). Satellite observations show that the global average chlorophyll concentration for oceans deeper than 1 km is 0.19 mg m^{-3} (Wang et al., 2005), similar to the value in our control simulation.

For the perturbation simulation, the BoB region was defined as the area from 77 to 99.5° E and from 2.5 to 24° N (black dashed box in Fig. 3). The region extends far enough south and west to incorporate the high surface chlorophyll around the southernmost tip of India and Sri Lanka, but it excludes the relatively low near-equatorial surface chlorophyll concentrations (Fig. 3f, g, h, i, j). The Kra Isthmus and Myanmar to the east and India and Bangladesh to the north and west form a natural boundary to the defined BoB region (Fig. 1). An annual cycle of daily chlorophyll concentration for MetUM-GOML was derived by linearly interpolating the monthly climatology to daily values and then regridding from the resolutions of the observations (4 km) to MetUM-GOML (~ 90 km).

Satellite-derived chlorophyll concentrations were converted to h_2 using a fifth-order polynomial parameterization from Morel and Antoine (1994) (Fig. 4a, b, c). This high-order polynomial relationship relates blue light from a two-band solar absorption scheme to surface chlorophyll concentrations that are assumed to have a Gaussian vertical profile in the upper ocean. The relationship shows the scale depth varying as a power law function of the surface chlorophyll concentration with the largest variability in the scale depth (> 18 m) at the lowest concentrations (< 0.1 mg m⁻³).

Missing h_2 data were common in regions such as the Ganges River delta due to undetermined remotely sensed chlorophyll concentrations from highly turbid coastal waters. Missing h_2 data in this delta extend further out onto the continental shelf during JJAS as floodwaters drain into the BoB transporting finer silt and clay further offshore (Kuehl et al., 1997). The missing h_2 data were typically associated with regions where the land fraction was less than one, which includes the narrow Kra Isthmus and the low-lying land of the Ganges River delta (black hatching in Fig. 1). A minimum of two h_2 values from two neighbouring data points were required to find an average h_2 value to fill in the missing data point. To avoid sharp gradients at the boundary of the BoB domain, the seasonally varying h_2 values within the BoB domain were smoothly transitioned (linearly) to the constant $h_2 = 17 \text{ m}$ outside the BoB domain, over a buffer region of three grid points.

Vertically integrated moisture fluxes (VIMF) were used to evaluate the water vapour transport sourced from the chlorophyll-forced BoB to the surrounding Indian subcontinent. The VIMF was calculated as follows:

$$VIMF = \frac{1}{g} \int uq \,\mathrm{d}p,\tag{2}$$

where u is the horizontal wind velocity, q is the specific humidity, g is the acceleration due to gravity, p is pressure, and the integration was between 1000 and 100 hPa. Note that uq



Figure 4. Monsoon onset season (April to June). (**a**–**c**) Monthly average h_2 (m) in the perturbation run. Monthly 29-year average difference (perturbation minus control) of (**d**–**f**) the SST (°C), (**g**–**i**) the 1.5 m air temperature (°C), (**j**–**l**) the upward latent heat flux (W m⁻²) and 10 m wind velocity (m s⁻¹), and (**m**–**o**) the precipitation rate (mm d⁻¹). The magenta line shows the 10 % significance level, and the black stippling shows the 5 % significance level.

was output directly by the model as monthly mean values. VIMF divergence was used to evaluate the precipitation rate changes that are due to changes in water vapour divergence. The VIMF divergence was calculated as follows:

$$\text{VIMFD} = \frac{1}{g} \int \frac{\partial \boldsymbol{u}q}{\partial x} + \frac{\partial \boldsymbol{v}q}{\partial y} \mathrm{d}p, \qquad (3)$$

where the integration was between 1000 and 100 hPa.

The observed monthly 18-year (1998–2015) climatological precipitation rate measured from the Tropical Rainfall Measuring Mission (TRMM) 3B42 satellite product (Huffman et al., 2007) was used to diagnose the bias in the model precipitation rate. An area-weighted re-gridding scheme was used to reduce the 0.25° horizontal resolution of the observed monthly climatological precipitation rate to match the horizontal resolution of MetUM-GOML.

3 Results

3.1 Southwest monsoon onset (April to June)

The BoB surface ocean responds to the imposed annual cycle of h_2 in the perturbation run during the onset of the southwest monsoon. In the central BoB, values of h_2 increase above the global constant of 17 m, as observed surface chlorophyll concentrations are low during the southwest monsoon onset (Fig. 4a, b, c). Along the northern BoB coast, values of h_2 are as low as 5 m, as observed surface chlorophyll concentrations in coastal areas are higher than those in the central BoB (Fig. 4a, b, c). During May and June, the values of h_2 decrease and mixed layer solar absorption increases in the northwestern BoB, as observed high coastal chlorophyll concentrations extend oceanward across the continental shelf (Fig. 4b, c). In the southwestern BoB, the imposed h_2 decreases to 14 m in May and June, as the strengthening SMC advects high chlorophyll concentrations from the southern coast of India and Sri Lanka (Fig. 4b, c).

The imposed annual cycle of h_2 directly affects coastal SST. During April, the increase in solar absorption by chlorophyll along the northern and western coastal regions significantly (at 5% level) increases the monthly average SST by 0.5 °C (Fig. 4d). Correspondingly, the monthly average 1.5 m air temperature increases by 0.5 °C in the perturbation run (Fig. 4g). The strengthening alongshore wind over the warmer western coast results in a large increase of $20 \,\mathrm{W}\,\mathrm{m}^{-2}$ in the upward latent heat flux (Fig. 4j). This increase in atmospheric moisture leads to an anomaly of $30 \text{ kg m}^{-1} \text{ s}^{-1}$ in the VIMF (Fig. 5a) that is in the same direction as the mean VIMF in the control run (Fig. 6a). The increase in the VIMF converges over northeast India and Bangladesh as shown by the negative VIMF divergence (Fig. 5a), supplying the extra moisture needed for the 2 mm d^{-1} increase in the precipitation rate (significant at the 5 % level; Fig. 4m).

The increase in solar absorption in the mixed layer due to high chlorophyll concentrations persists during May and June along the coasts (Fig. 4b, c). Low h_2 along the northern and western BoB coastal regions acts to increase the monthly average SST by 0.5 °C (Fig. 4e, f). The upward latent heat flux increases (Fig. 4k, l) due to an increase in the specific humidity at the surface, which is associated with the higher SST. Thus, this increase in SST is offset by the negative feedback from the latent heat flux increase.

In June, the precipitation rate over the Myanmar coast increases by $3 \text{ mm } d^{-1}$ (significant at the 5% level; Fig. 4o). The monthly average 1.5 m air temperature increases by 0.4°C (Fig. 4i), which is caused by an increase in the SST (Fig. 4f) where h_2 along the western BoB is low (Fig. 4c). The upward latent heat flux increases by 10 W m⁻² (Fig. 4l) and the VIMF increases by 20 kg m⁻¹ s⁻¹ (Fig. 5b) in addition to a strengthening southwesterly moisture transport during the southwest monsoon onset (Fig. 6b). The enhanced convergence of the VIMF over the Myanmar coast (Fig. 5b)

supplies the moisture for the increase in the precipitation rate (Fig. 4o). Thus, we have demonstrated that high coastal chlorophyll concentrations perturb the absorption of solar radiation that increases air temperature and SST, which, in turn, significantly increases spring inter-monsoon precipitation rates in the northern and eastern BoB.

3.2 Southwest monsoon (July to October)

The values of h_2 continue to decrease in the BoB open ocean into July and August (Fig. 7a, b), as high chlorophyll concentrations off the continental shelf and SMC encroach further into the central BoB. The lowest monthly average h_2 in the SMC region and the central BoB occurs in August with a value of 12 and 15 m respectively (Fig. 7b). During September and October, the SMC weakens and the observed high chlorophyll concentrations retreat back to the coast, increasing the average h_2 in the SMC region and the central BoB to around 16 m (Fig. 7c, d). Meanwhile, along the northwestern BoB during October, the monthly average h_2 decreases to 13 m, as observed high chlorophyll concentrations retreat back onto the continental shelf (Fig. 7d).

BoB surface ocean and regional climate respond to the above changes in h_2 during JJAS. Higher coastal SSTs (significant at the 10 % level) are co-located with the high coastal chlorophyll concentrations, whereas open-ocean SST is largely unchanged by BoB chlorophyll forcing (Fig. 7e, f, g). In July, an increase in the SST and a slight increase in the alongshore wind speed over the western BoB increase the upward latent heat flux (Fig. 7m), but this does not significantly change the precipitation rate (Fig. 7q). In August, a further increase in the alongshore wind speed increases the magnitude and spatial extent of the upward latent heat flux across the northern BoB (Fig. 7n). During September, an increase in wind speeds over the northern Myanmar coast increases surface ocean evaporation (Fig. 7o). The VIMF increases in magnitude and remains approximately in the same direction as the mean VIMF in the control run (Figs. 5c, 6c). The negative VIMF divergence over the northern Myanmar and Bangladeshi coast in the perturbation run (Fig. 5c) supplies moisture for the increase in the precipitation rate in this region (significant at the 5% level; Fig. 7s).

By October the combined atmospheric moisture sourced from the warmer western BoB and Andaman Sea leads to an increase in the precipitation rate of up to 3 mm d^{-1} over western Bangladesh and northeastern India (significant at the 5 % level; Fig. 7t). The spatial extent of the increased precipitation rate is considerably larger than in previous months, extending further west over the Indo-Gangetic Plain and encompassing megacities such as Kolkata and Dhaka. An areaweighted 29-year monthly average precipitation rate over western Bangladesh and northeastern India (20–25° N, 85– 90° E; black dashed box in Fig. 7t) shows a rainfall maximum in August in both simulations (Fig. 8a). The precipitation rate differences gradually increase from July to August and peak



Figure 5. Monthly 29-year average difference (perturbation minus control) of VIMF (vector arrows) and VIMF divergence (shaded) for (a) April, (b) June, (c) September, and (d) October.

in at 2 mm d⁻¹ October (Fig. 8b). Alongshore winds over the warmer Kra Isthmus and the coast of Myanmar further increase atmospheric moisture transport to the northern BoB (Fig. 6d). The upward latent heat flux increases by 13 W m^{-2} (Fig. 7p) and the VIMF increases by $30 \text{ kg m}^{-1} \text{ s}^{-1}$ over the coast of Myanmar (Fig. 5d). The negative VIMF divergence over western Bangladesh and northeastern India supplies moisture for the increase in the precipitation rates in this region (Fig. 5d). As in the spring inter-monsoon, the increase in the precipitation rate during the autumn inter-monsoon in the northern BoB is primarily attributed to high coastal chlorophyll concentrations and an increased SST extending from the Andaman Sea to the Ganges River delta along the chlorophyll-perturbed BoB coastal region.

The enhanced convective activity over western Bangladesh and northeastern India during October is associated with an increase the vertical wind velocity at the 500 hPa pressure level (Fig. 9a). At the 200 hPa pressure level, enhanced westerly winds converge over eastern China (Fig. 9b), which leads to increased subsidence (Fig. 9a). This subsidence reduces precipitation and increases the surface temperature over eastern China (significant at the 5% level; Fig. 9c, d). This indirect remote response resembles the effect of the "Silk Road" pattern; a stationary Eurasian–Pacific Rossby wave train that occurs during the Northern Hemisphere summer and produces significant air temperature and rainfall anomalies in East Asia (Ding and Wang, 2005).

3.3 Mixed layer radiant heating and SST modulation

The hypothesized direct link between a change in h_2 and a resultant change in SST is examined in more detail in this subsection. The radiant heating rate of the mixed layer and the resultant change in SST depend not only on h_2 but also on changes in the surface flux of shortwave radiation, which is dependent on cloud cover, and changes in the depth of the mixed layer. Here, we assess which of these three factors is



Figure 6. Monthly 29-year average VIMF from the control run for (a) April, (b) June, (c) September, and (d) October.

primarily responsible for the changes in the radiant heating rate of the mixed layer.

We assume that the red-light radiative flux is absorbed within approximately the top 1 m and entirely within the mixed layer, and only the blue-light radiative flux can partially penetrate below the mixed layer. The radiant heating rate of the mixed layer is calculated as follows:

RHR =
$$\frac{dT}{dt}\Big|_{Q} = \frac{Q_{sw}(0) - (1 - R)Q_{sw}(0)e^{-\frac{H}{h_{2}}}}{\rho c_{p}H},$$
 (4)

where *T* is the temperature of the mixed layer, *t* is time, $Q_{sw}(0)$ is the monthly 29-year average downward shortwave radiation flux incident at the ocean surface, $\rho = 1025 \text{ kg m}^{-3}$ is the density of the mixed layer, $c_p = 3850 \text{ J kg}^{-1} \text{ K}^{-1}$ is the specific heat capacity of sea water, R = 0.67 is the ratio of red light to total visible light for Jerlov water type IB, *H* is the monthly 29-year average MLD, and h_2 is the monthly average h_2 that was imposed in the control and perturbation run. Within the BoB, the largest imposed change in h_2 is 13 m. Assuming that the other variables remain constant, a change in h_2 of 13 m changes radiant heating rates by 0.4 °C per month. The largest model change in downward shortwave radiation is 14 W m⁻², which changes radiant heating rates by 0.3 °C per month, comparable to the change from h_2 variations. The largest model MLD change is 3 m, which changes radiant heating rates by 0.4 °C per month, also comparable to the change from h_2 variations.

We compare the mixed layer radiant heating rates of the control and perturbation runs during June and October (Fig. 10a, b). We focus on two regions: the open-ocean region of the SMC (83–86° E, 5–8° N; black boxes in Fig. 10) and the coastal region of the Irrawaddy Delta (95–98° E, 14–17° N; black boxes in Fig. 10). These two regions are an important source of heat and moisture for the June and October precipitation rate perturbations and display distinctive chlorophyll regimes. The SMC is an open-ocean region that displays large seasonal changes in h_2 , whereas the Irrawaddy Delta is a coastal region that displays continuously