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Asymmetric response of South Asian summer monsoon rainfall in a carbon dioxide removal scenario

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The reversibility of South Asian summer monsoon (SASM) precipitation under the CO₂ removal scenario is critical for climate mitigation and adaptation. In the idealized CO₂ ramp-up (from 284.7 to 1138.8 ppm) and symmetric ramp-down experiments, SASM precipitation is largely reversible while exhibiting strong asymmetry: it may overshoot the unperturbed level when CO₂ recovers. Such asymmetric response is mainly due to the enhanced El Niño-like and Indian Ocean dipole-like warming during the ramp-down period. The uneven sea surface warming weakens Walker circulation, with anomalous sinking over the SASM region. Meanwhile, the warming also affects the rainfall over the Maritime Continent and tropical western Indian Ocean. The suppressed rainfall over the Maritime Continent triggers the equatorial Rossby wave, which weakens the ascent over the SASM region; the increased rainfall over the tropical western Indian Ocean excites the equatorial Kelvin wave, which reduces moisture transport. Additionally, tropic-wide warming reduces the land-sea thermal contrast and weakens monsoonal circulation. Consequently, the combined effects of the weakened ascent and moisture transport lead to the overshooting of SASM rainfall. Our results suggest that symmetric CO₂ removal, although unlikely in the foreseeable future, may result in a risk of local drought over the SASM region.

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INTRODUCTION

The concentration of Carbon Dioxide (CO₂) in the atmosphere has been increasing since the Industrial Revolution. It exerts severe, widespread, and irreversible influences on climate and human society¹. To avoid or lower these influences, the Paris Agreement proposed a strict target, i.e., holding the increase in the global average temperature to well below 2 °C above pre-industrial (PI) level and pursuing efforts to limit the temperature increase to 1.5 °C above PI. Such long-term temperature goals call for reaching the global peak of greenhouse gas emissions as soon as possible to achieve a climate-neutral world by the middle of the 21st century. Achieving this target requires Carbon Dioxide Removal (CDR) methods to decrease atmospheric CO₂ concentration in the future^{1–6}. Due to its huge heat capacity, the ocean acts as heat storage which absorbs most of the redundant energy arising from the CO₂ concentration increases^{1,7}. In particular, the response of the ocean is much slower, with a timescale of decades to millennia^{8–10}. If CDR methods are applied, the excess heat accumulated in the ocean would affect the climate response during the CO₂ ramp-down period^{11–13}. At present, the climate effect of CDR is still inconsistent and inadequately understood in the scientific community^{14,15}.

The South Asian summer monsoon (SASM), a crucial component of the global monsoon system, directly affects the lives of more than one billion people. Slight changes in SASM precipitation can cause tremendous socioeconomic impacts, including impacts on agricultural production, water resources, and basic human needs^{16,17}. Hence, understanding the response of SASM precipitation to climate change is of great importance. Under a global warming scenario where the CO₂ concentration increases monotonically, SASM precipitation is projected to increase in

nearly all models, despite a weakening of SASM circulation^{18,19}. Previous studies have reported that enhanced atmospheric water vapor content and the larger moisture convergence into the SASM region^{20–23} are responsible for the increased rainfall, which is consistent with the “wet-get-wetter” mechanism^{24–26}. However, the positive contribution of the thermodynamic effect is partially offset by the dynamic effect due to the weakened circulation, which results in a lower increase in SASM precipitation than water vapor content^{27,28}. The enhanced upper-tropospheric warming over the tropical Indian Ocean²⁹, as well as the mean advection of the stratification change mechanism³⁰, may all contribute to the weakened SASM circulation.

Under the CDR scenario, SASM precipitation displays an overshooting relative to that during the CO₂ ramp-up period³¹, namely, SASM precipitation may fully recover and exhibit drought when the CO₂ concentration recovers. This is significantly different from that of the global hydrological cycle^{12,13,32–35}. In the idealized experiment in which the CO₂ rise is followed by a symmetric decline, global precipitation continues to rise for decades after CO₂ peaks and cannot return to the initial level when CO₂ recovers. Such an asymmetric response of global precipitation originates mainly from the ocean, and precipitation on land is nearly symmetrical^{11,36}. The response of rainfall at the regional scale has a similar response to global precipitation, including the Intertropical Convergence Zone (ITCZ)³⁷, East Asia³⁴, and the Korean Peninsula³⁵. For example, the location of the ITCZ changes minimally during the CO₂ ramp-up period; in contrast, it shifts rapidly to the south during the CO₂ ramp-down period and resides in the south when the CO₂ concentration recovers to the initial level, leading to the asymmetric responses of the ITCZ-related precipitation³⁷.

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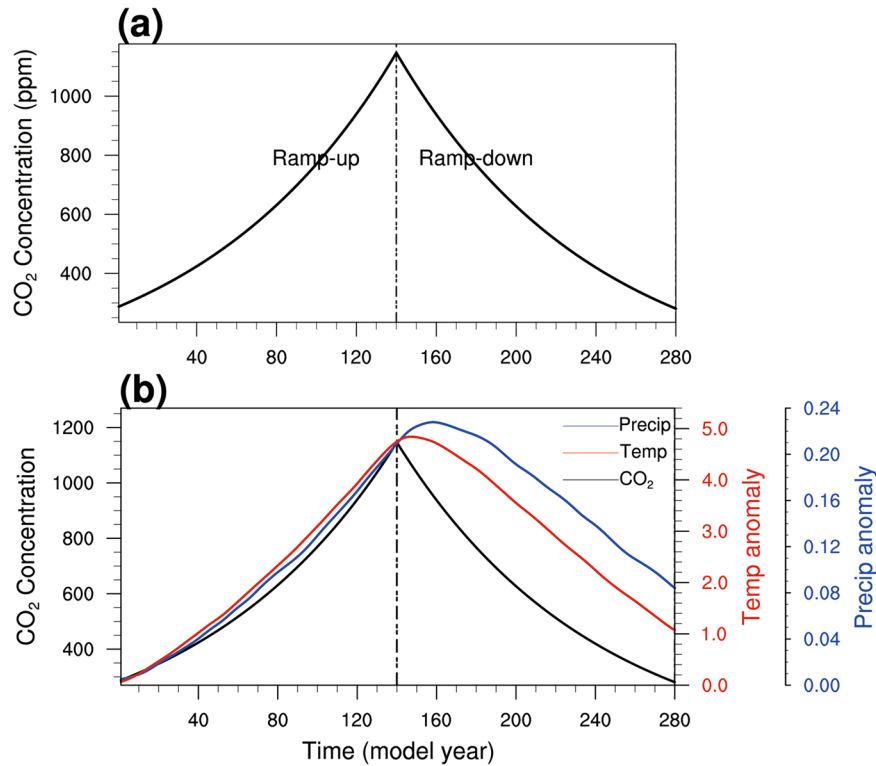


Fig. 1 The global mean surface temperature and precipitation changes in the idealized CO₂ ramp-up and ramp-down experiments. **a** The evolution of the atmospheric CO₂ concentration (unit: ppm) in CDR experiments. **b** The global mean surface temperature (GMST; unit: K) and precipitation (GMP; unit: mm day⁻¹) responses in CO₂ ramp-up and ramp-down experiments relative to the PI from the MME. Time series of the CO₂ concentration (black line; unit: ppm), annual GMST (red line), and GMP (blue line) anomalies. A 3-point (1/4,1/2,1/4) filter with 40 times is used to remove interannual variability. The vertical dashed line denotes Year 140 when CO₂ peaks.

Researchers have inferred that both the accumulated heat in the deep ocean during the CO₂ ramp-up period^{11,13} and the rainfall sensitivity to CO₂ forcing through tropospheric adjustment processes³³ are responsible for such asymmetric responses. For the distinct response of SASM precipitation, the HadCM3 output suggested that it may result from the lag recovery of Pacific and Indian Ocean Sea Surface Temperature (SST)³¹. The weakened moisture flux convergence related to the southward ITCZ shift during the CO₂ ramp-down period compared to the ramp-up period also plays a role³⁸. As a part of Coupled Model Intercomparison Project phase six (CMIP6), the Carbon Dioxide Removal Model Intercomparison Project (CDRMIP) was sponsored¹⁵. To date, eight models have participated in this project and have conducted CDR experiments (see “Methods”). The evolution of CO₂ concentration of these experiments is presented in Fig. 1a, which increases for 140 years and then gradually decreases to the initial level. It is a good opportunity to verify the robustness of the response of SASM precipitation under the CDR scenario. Moreover, there is the possibility of uncovering other process responsible for the asymmetric response. Therefore, this study aims to address the following two scientific questions: (a) How does SASM rainfall respond to CDR in multiple models? How is the inter-model consistency? (b) What major processes are responsible for this response?

RESULTS

Asymmetric response of temperature and rainfall

The global mean surface temperature (GMST) and precipitation (GMP) responses during the CO₂ ramp-up and ramp-down experiments from the Multi-Model Ensemble (MME) are presented in Fig. 1b. Both the GMST and GMP respond asymmetrically and

show hysteresis concerning symmetric CO₂ forcing, which is consistent with previous studies^{33,35,37}. The GMST and GMP increase consistently with CO₂ but continue to increase for about 10 and 20 years, respectively, after CO₂ peaks and show significant positive anomalies after CO₂ recovers. Such GMST and GMP hysteresis can be interpreted by the release of heat stored in the deep ocean^{11,13,31}. The brief increase in GMP after CO₂ peaks is a consequence of rainfall sensitivity to CO₂ forcing through tropospheric adjustment processes³³.

However, compared to the GMP, SASM precipitation evolves quite differently. SASM precipitation is the area average of land rainfall over the domain (7.5–30.5°N, 73–90°E; see the red rectangles in Fig. 3). It increases during the CO₂ ramp-up period; after CO₂ peaks, it continues to increase for approximately a decade before diminishing rapidly; it overshoots an unperturbed level before CO₂ recovers to the PI (Fig. 2). We select two 40-year periods with the same CO₂ concentration to analyze the reversibility of SASM precipitation: year 21–60 in the CO₂ ramp-up period (hereafter RU) and year 220–259 in the CO₂ ramp-down period (hereafter RD; gray bands in Fig. 2). Precipitation increases consistently across the SASM region relative to the PI during the RU period (Fig. 3a), which agrees with the results under the global warming scenario^{18,19,39}. During the RD period, precipitation over South Asia (SA) displays a “decreased-increased-decreased” tripolar response from southwest to northeast relative to the PI (Fig. 3b). Overall, despite the CO₂ concentration being the same in both periods, SA is significantly drier in the RD period than in the RU period (Fig. 3c). If we change the length of the two periods with equivalent CO₂ concentration levels to 30 years and 50 years, the asymmetric response of precipitation is still significant (Supplementary Fig. 1). Thus, the model simulations imply that if CDR is applied, SASM precipitation may gradually decline to a level below the unperturbed level when CO₂ recovers to the PI.

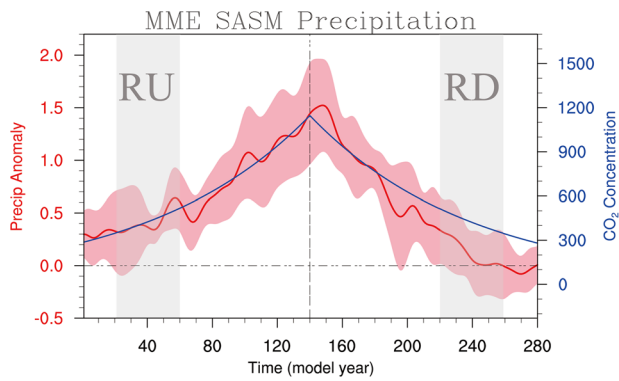


Fig. 2 The evolution of SASM precipitation in the idealized CO₂ ramp-up and ramp-down experiments. Time series of the CO₂ concentration (blue line; unit: ppm) and rainfall (red line; unit: mm day⁻¹) anomaly compared to PI. Pink shadings indicate the ensemble spread of the seven models. A 3-point (1/4,1/2,1/4) filter with 40 times is used to remove interannual variability. The vertical dotted line denotes the CO₂ peak year (Year 140). Two gray shadings in Year 21–60 (RU) and Year 220–259 (RD) indicate the two 40-year periods with the same average CO₂ concentration during the ramp-up and ramp-down periods.

Under global warming scenario, the precipitation change mainly comes from the contribution of the dynamic term related to the circulation and the thermodynamic term related to the moisture according to the moisture budget. To understand the asymmetric response of SASM precipitation, the simplified moisture budget equation is employed⁴⁰:

$$\Delta P \sim -(\Delta\omega \cdot q + \Delta q \cdot \omega) \quad (1)$$

Where Δ represents the departure from the PI; P , ω and q are precipitation, pressure velocity at 500 hPa, and surface specific humidity, respectively. Horizontal moisture advection and quadratic (nonlinear processes) terms were omitted because they are insignificant compared with the thermodynamic and dynamic components in the tropics^{25,40,41}. The sum of the thermodynamic and dynamic terms (Fig. 4c) resembles the contemporary precipitation distribution (Fig. 3c) with a small difference in magnitude, which indicates that the linear approximation of the moisture budget (Eq. 1) can well represent the total precipitation change. The thermodynamic component ($-\Delta q \cdot \omega$, Fig. 4a) shows increased precipitation over the region where ascent prevails climatologically. This can be explained by the “wet-get-wetter” mechanism. According to the Clausius–Clapeyron equation, a higher GMST may lead to more water vapor in the atmosphere during the RD period than during the RU period (Fig. 1; Fig. 4d). Supposing that the ascent remained fixed, more water vapor may contribute to a wetter SA during the RD period (Fig. 4a). The results of the dynamic component ($-\Delta\omega \cdot q$, Fig. 4b) indicate that the weakening of the ascent (Fig. 4e) in SA leads to less precipitation during the RD period relative to the RU period, which is partly offset by the thermodynamic effect. Moreover, the spatial pattern of the dynamic component (Fig. 4b) resembles the contemporary precipitation change (Fig. 3c; Fig. 4c). This indicates that the asymmetric response of SASM precipitation is mainly the result of the dynamic component, which is dominated by changes in vertical motion.

Atmospheric circulation change and its driving mechanisms

We found that the asymmetric response of SASM precipitation mainly comes from the contribution of vertical circulation; therefore, the causes of change in vertical velocity are further explored. Figure 5 displays the difference in upper-level (200 hPa) velocity potential and divergence winds between the RU and RD periods. The large-scale circulation features a weakened Walker

circulation. Over SA and MC, anomalous upper-level convergence favors local precipitation suppression (Fig. 3c). Divergence anomalies exist over the tropical central Pacific. The TWIO has increased rainfall (Fig. 3c) due to anomalous rising motion, and the delayed response of moisture (Fig. 4d) further strengthens such positive rainfall anomalies.

In the lower troposphere, an anomalous anticyclone is evident with its center in the northeastern part of SA during the RD period relative to the RU period (Fig. 6a). Via the effect of Ekman downwelling, the anomalous anticyclone contributes to a weakened ascent on the top of the planetary boundary layer, which also favors rainfall suppression over the SASM region. In addition, the anomalous easterlies (Fig. 6a) over southern SA hinder local southwesterly water vapor transport. Since the moisture is mainly confined in the lower troposphere, the pattern of the vertically integrated moisture flux (vectors in Fig. 6b) highly resembles the horizontal wind pattern at 850 hPa. The responses of atmospheric horizontal wind and vertical velocity over the SASM region are well coupled, which corresponds to the divergence of moisture flux suppressing rainfall (shadings in Fig. 6b).

What causes the asymmetric response of the SASM horizontal circulation? As shown in Fig. 3c, the decreased precipitation over the MC and the enhanced precipitation over the TWIO are hypothesized to be responsible. The suppressed precipitation over the MC induces an equatorial Rossby wave response with an anomalous anticyclone over SA^{21,42}. The positive rainfall over the TWIO may induce an equatorial Kelvin wave response with easterly anomalies over southern SA. To test these hypotheses, we employed the LBM, which is widely used in studying tropical dynamics^{43,44}. The climatology of the RU period is set as the model basic state since we focus on the asymmetric response between the RU and RD periods. The LBM is forced by (1) cooling over the MC (−10°S–0°, 90–130°E, Fig. 7a), with a maximum cooling rate of −2.67 K day⁻¹, and (2) heating over the TWIO (−10°S–10°N, 50–70°E, Fig. 7c), with a maximum heating rate of 2.67 K day⁻¹. The vertical profiles of atmospheric diabatic heating (cooling) follow the gamma distribution, and their maximum (minimum) is at $\sigma = 0.45$ (Fig. 7b, d).

The forced results of the LBM reproduced the key features of lower-level horizontal wind over SA well in the CMIP6 results (Fig. 7e). The cooling over the MC excites an equatorial Rossby wave response to its northwest. Over northeastern SA, a pronounced anomalous anticyclone occurs (Fig. 7a). The Rossby wave response is substantially stronger north than south of the equator due to the effects of monsoon easterly vertical shear mean flows^{45,46}. The warming over the TWIO triggers an equatorial Kelvin wave response to its east. Easterly anomalies as part of the Kelvin wave response exist over southern SA (Fig. 7c). According to the theories of Matsuno⁴⁷ and Gill⁴⁸, in a resting basic state without mean flow, the Kelvin wave response is confined to the vicinity of the equator and shows remarkable symmetry with respect to the equator. However, because of the strong monsoon circulation, the low-level circulation shows a stronger response north of the equator, with a remarkable asymmetry⁴⁹. Equatorial symmetry strengthens in the upper level (Supplementary Fig. 2). Therefore, the two numerical experiments support the hypothesis that the rainfall responses over the MC and TWIO induce weakened SASM circulation, including the anomalous anticyclone and easterly winds, which leads to drier condition over SA.

In addition to the forcings over the equatorial regions, the land–sea contrast may be responsible for the asymmetric responses of SASM precipitation during the two periods. Previous studies suggested that the land–sea thermal contrast plays a crucial role in SASM circulation changes^{21,50}. Following their definitions, we use thicknesses between 200 and 500 hPa to represent the thermal conditions. The thickness anomalies center over the tropical western and central Indian Ocean (Fig. 8a). The stronger warming over the Indian Ocean leads to a weaker

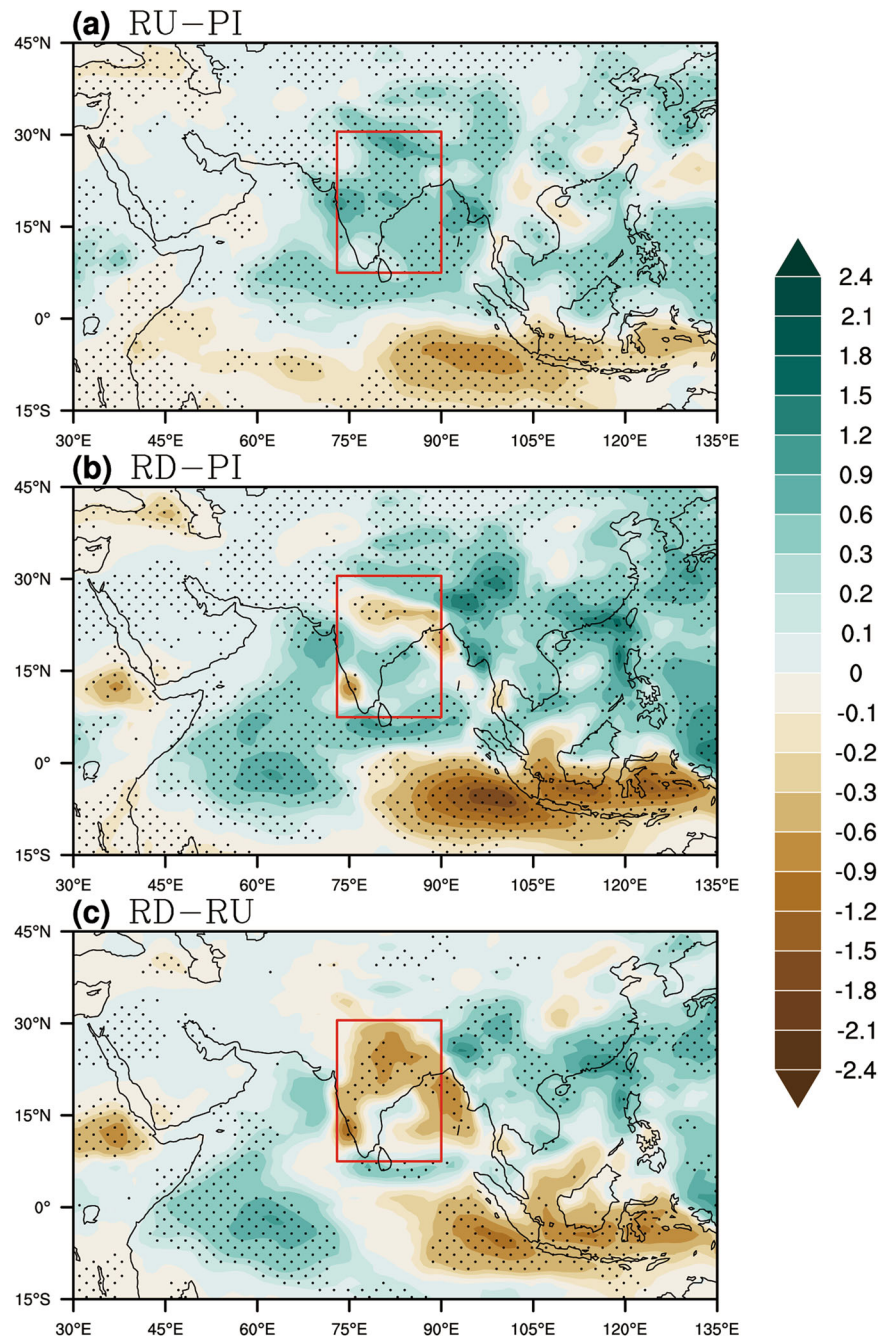


Fig. 3 The rainfall response (unit: mm day^{-1}) to the CO_2 forcing. The RU (a) and RD (b) periods rainfall anomalies compared to PI. c Difference in rainfall between the RU (20–60) and RD (220–259) periods. Black dots in (a, b) denotes the regions where more than 70% ensemble members agree with the sign of the MME. The regions denoted by the black dots in (c) indicate where the rainfall difference between the RU and RD periods are statistically significant at a 90% confidence level and more than 70% ensemble members agree with the sign of the MME. The red rectangles highlight the SASM region.

land–sea thermal contrast over the Indian Ocean and SA sector. We defined the land–sea thermal contrast index (TC_{upper}) as the difference of 200–500 hPa thickness between northern SA (20.5–40.5°N, 55–100°E; northern box in Fig. 8a) and the TWIO (10.5°S–10.5°N, 40–85°E; southern box in Fig. 8a). TC_{upper} decreases as the CO_2 concentration increases and shows noticeable inertia after CO_2 peaks (Fig. 8b). The inertia may be due to the strong warming over the TWIO during the RD period led by local enhanced latent heating (Fig. 3c). TC_{upper} during the RD period is markedly weaker than that in the RU period. The weaker land–sea thermal contrast decreases the baroclinicity in the troposphere

and decreases the low-tropospheric westerly (Fig. 6a) and the upper-tropospheric easterly⁵¹. Finally, the weakened circulation leads to drier conditions over the SASM region during the RD period relative to the RU period.

The tropical SST response in the CO_2 ramp-up and ramp-down experiments

Under global warming scenario, the rainfall change over the Asian monsoon regions mainly consists of two components: the rapid adjustment associated with CO_2 radiative forcing and the slow

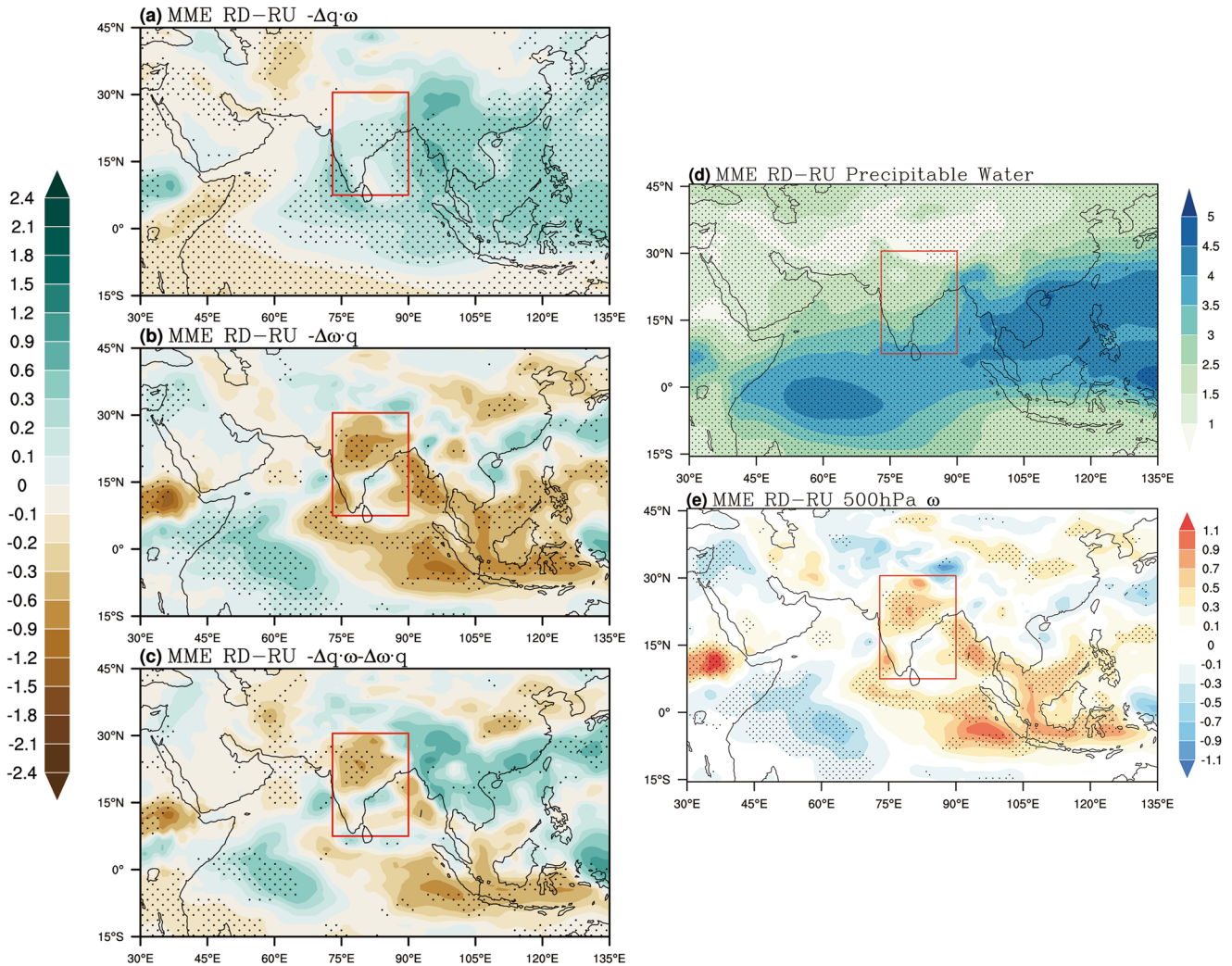


Fig. 4 The decomposition of the rainfall response. The difference in thermodynamic term (a), dynamic term (b), and both of them (c) between the RU and RD periods (unit: mm day^{-1}). **d, e** The same as in (a–c), but for the integration of specific humidity from the surface to 1 hPa (unit: kg m^{-2}) and pressure velocity at 500 hPa (unit: 10^{-2}Pa s^{-1}). The black dots denote the region in which at least 70% of models agree on the sign of the MME. The red rectangles highlight the SASM region.

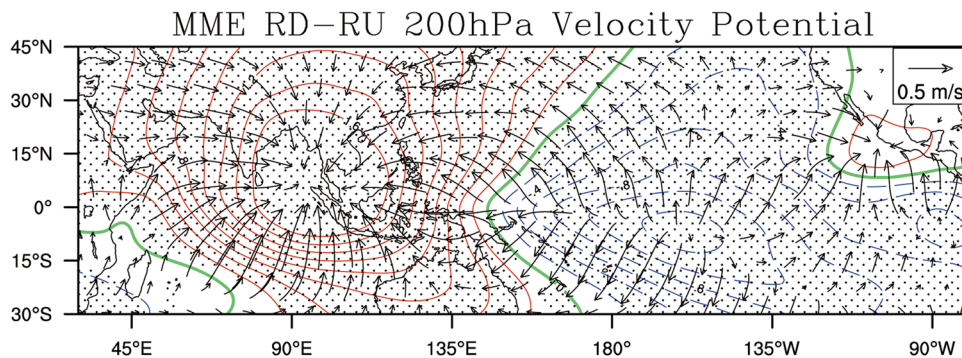


Fig. 5 The response of the velocity potential and divergence winds at 200 hPa. The difference in the velocity potential (color lines; unit: $10^6 \text{m}^2 \text{s}^{-1}$) and divergence winds (vectors; unit: m s^{-1}) at 200 hPa between the RU and RD periods. The black dots denote the region in which at least 70% of models agree on the sign of the MME.

response associated with the SST changes^{52,53}. The rapid adjustment has a timescale of less than one year and the slow response has a timescale of decades to millennia^{1,8,54}. Under the scenario that the CO_2 concentration evolves symmetrically (1% CO_2 and 1% CO_2 -CDR experiments), the rapid adjustment largely

follows the evolution of the CO_2 concentration¹⁰, making it difficult to produce the asymmetric response of SASM precipitation. In contrast, the contribution of the slow response lags the evolution of CO_2 concentration remarkably and dominates the total climate response during the CO_2 ramp-down period¹⁰.

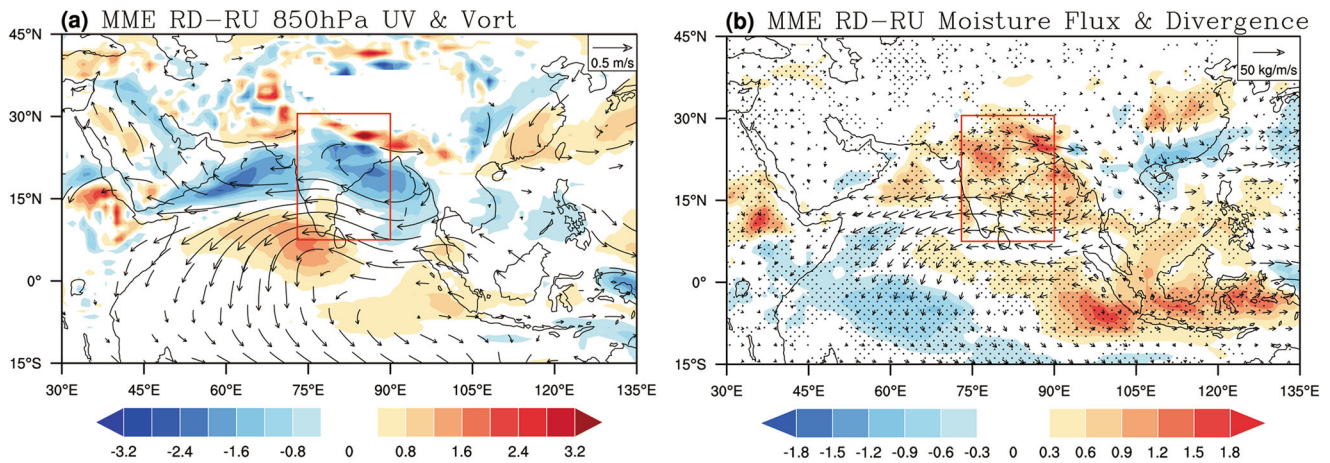


Fig. 6 The response of the low-level circulation and the moisture transport. **a** The difference in the pattern of the 850 hPa wind (vectors; unit: m s^{-1}) and vorticity (shadings; unit: 10^{-6} s^{-1}) between the RU and RD periods. **b** The same as in (a), but for vertically integrated moisture fluxes from the surface to 1 hPa (vectors; unit: $10^2 \text{ kg m}^{-1} \text{ s}^{-1}$) and their divergence (shadings; unit: $10^{-5} \text{ kg m}^{-2} \text{ s}^{-1}$). The black dots denote the region in which at least 70% of models agree on the sign of the MME. Vectors only exceeding 70% of model consistency are shown. The red rectangles highlight the SASM region.

In particular, the ocean continues to absorb heat after the CO_2 peaks^{11,13}. Therefore, to understand the asymmetric response, it is necessary to analyze the SST response in the CO_2 ramp-up and ramp-down experiments.

The tropical Pacific and Indian Ocean SSTs all warmed (left panel in Fig. 9) and featured El Niño-like and Indian Ocean dipole (IOD)-like warming patterns (right panel in Fig. 9), respectively, in the RU and RD periods. Furthermore, the magnitude of SST warming over the tropics, as well as El Niño-like and IOD-like warming, is larger during the RD period than during the RU period (Fig. 9c, f). This indicates that the tropical SST displays an asymmetric response in the CO_2 ramp-up and ramp-down experiments, consistent with previous studies^{12,55–57}.

For the asymmetric response of El Niño-like warming in the tropical Pacific Ocean, the continued accumulation of heat in the ocean after the CO_2 peaks plays an important role^{11,13}. During the RU period, the Walker circulation weakens due to temperature and precipitation constraints, accompanied by the decrease in upwelling intensity, which ultimately results in an El Niño-like warming in the tropical Pacific^{25,26}. In addition, the upper ocean warms faster than the deep ocean (Fig. 10), resulting in a sharp increase in vertical temperature stratification; it transmits heat downward by thermal diffusion or other ocean dynamic processes, allowing the deep ocean to warm and accumulate heat. The faster warming in the upper ocean and the climatological upwelling contribute to a cooling in the central and eastern Pacific. But this effect is overwhelmed by the warming effect led by Walker circulation (its slowdown leads to anomalous westerlies and results in an anomalous warm horizontal advection)³⁴. Thus, an El Niño-like warming occurs in the tropical Pacific. After the CO_2 peaks, the upper ocean continues to warm for about a decade and then begins to cool. In contrast, the deep ocean response is much slower, which continues to warm for about 70 years before it begins to cool. During the RD period, the deep ocean continues to warm and warms stronger than the upper (Fig. 10), which generally weakens the vertical temperature gradient and hence reduces the cooling effect led by the climatological upwelling in the central and eastern Pacific⁵⁸. It contributes to an enhanced El Niño-like warming pattern during the RD period compared to the RU period.

The asymmetric response of the tropical SST affects the SASM rainfall via atmospheric circulation, showing drought in the RD period. During the RD period, the warmer SST (Fig. 9c) leads to more water vapor in the atmosphere (Fig. 4d) and a larger

contribution of the thermodynamic component (Fig. 4a). Following an approximately moist adiabatic lapse rate, tropic-wide warming increases with height in the atmosphere^{30,59,60}, which leads to the enhanced warming center in the middle-to-upper troposphere over the Indian Ocean (Fig. 8a). Meanwhile, the enhanced El Niño-like and IOD-like warming patterns (Fig. 9f) cause the Walker circulation to weaken during the RD period (Fig. 5). Therefore, on the one hand, the decreased Walker circulation directly weakens the ascent in SA; on the other hand, it influences the rainfall in the MC and TWIO through anomalous convergence and divergence motion, thereby indirectly affecting SASM circulation. The contribution of the weakened circulation is stronger than the positive contribution of the thermodynamic component, which leads to the drier condition over the SASM region during the RD period compared to the RU period.

DISCUSSION

We investigated the response of SASM precipitation based on CO_2 ramp-up (1% CO_2) and ramp-down (1% CO_2 -CDR) experiments in CMIP6. The results show that if CDR is applied, SASM precipitation is largely reversible although it exhibits asymmetry about symmetric CO_2 forcing. Despite the CO_2 concentration being the same in the RU and RD periods, precipitation over the SASM region is significantly reduced during the RD period relative to the RU period. The diagnosis reveals that thermodynamic and dynamic components contribute oppositely: the thermodynamic effect favors the increased rainfall, while the dynamic effect favors the decreased rainfall. The asymmetric response of SASM precipitation in the CO_2 ramp-up and ramp-down experiments mainly originates from the dynamic effect (i.e., atmospheric circulation) rather than the thermodynamic effect (i.e., moisture change), which is different from that under the global warming scenario.

Subsequently, the possible mechanisms of anomalous atmospheric circulation are revealed. Figure 11 is a schematic diagram illustrating the key processes. Owing to the continued accumulation of heat in the ocean after the CO_2 peaks, which feedback to the surface ocean causing the asymmetric response of the SST^{12,56,58}. Relative to the RU period, the tropical Pacific and Indian Ocean show stronger warming during the RD period, featuring an enhanced El Niño-like and IOD-like warming pattern, respectively. Following the moist adiabatic lapse rate, tropic-wide warming increases with height. The enhanced warming

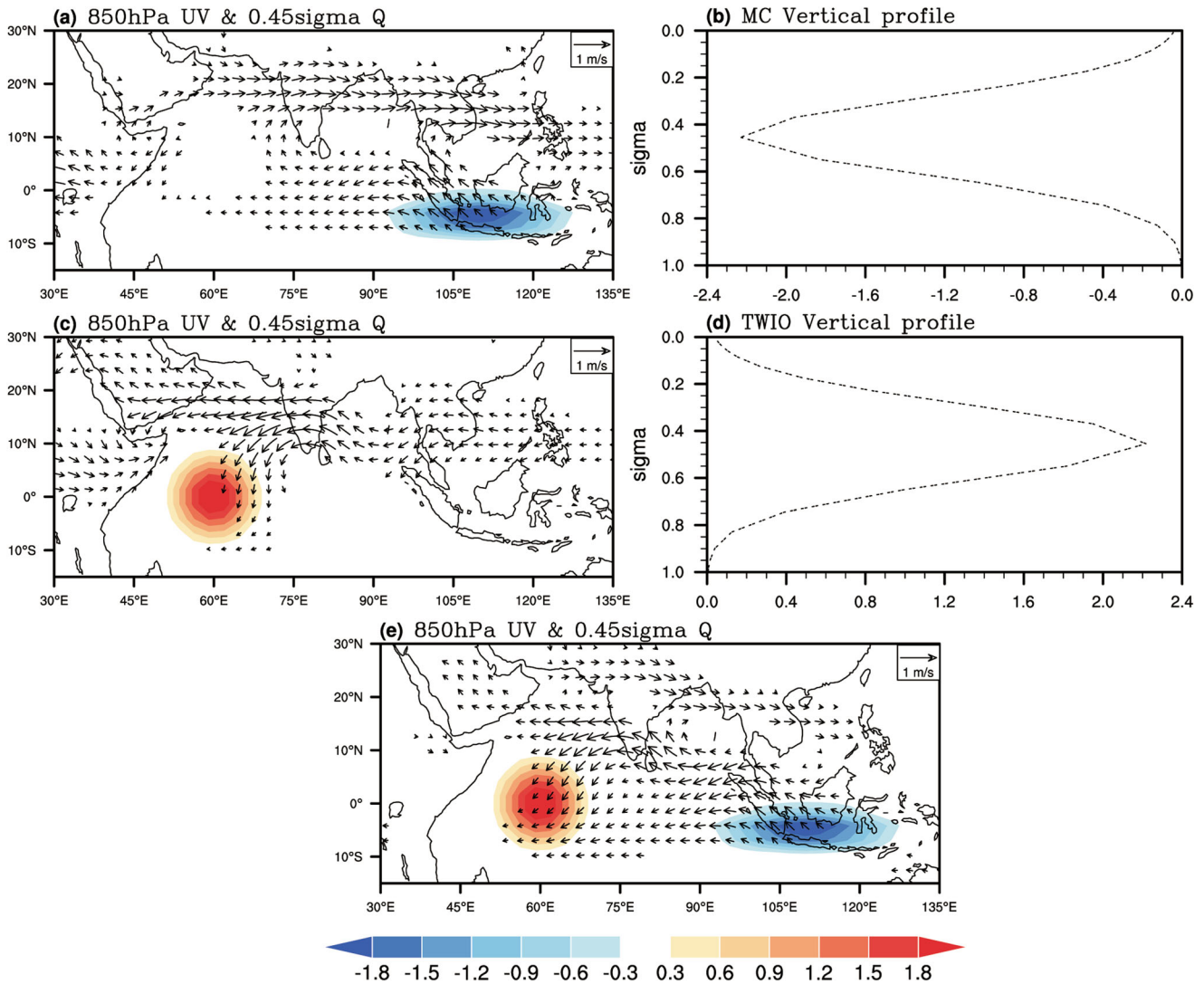


Fig. 7 The response of the LBM to the diabatic forcing. The response of the 850 hPa wind (vectors; unit: m s^{-1}) in the LBM, which is forced by the atmospheric diabatic heating (shadings; unit: K day^{-1}) over the MC (a), TWIO (c) and the sum of the two (e). b, d The vertical distribution of atmospheric diabatic heating over the TWIO and atmospheric diabatic cooling over the MC (unit: K day^{-1}). Wind speed changes less than 0.095 in (a), 0.075 in (c), and 0.085 in (e) are omitted.

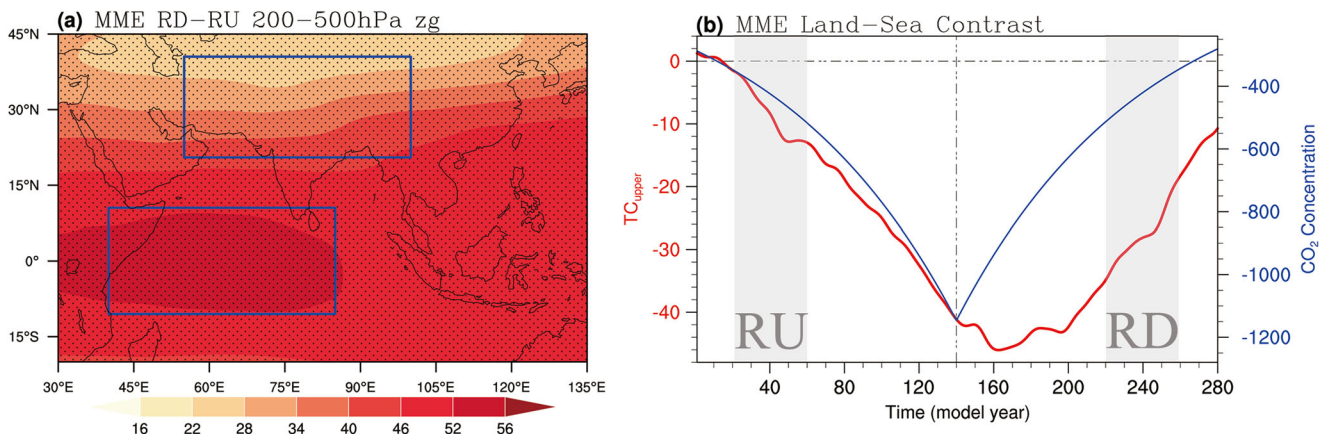


Fig. 8 The response of the thermal contrast. a The difference in 200–500 hPa thickness (shadings; unit: m) between the RU (21–60) and RD (220–259) periods. b Time series of the land–sea thermal contrast (TC_{upper} ; red line; unit: m) and CO_2 concentration (blue line; unit: ppm). The 200–500 hPa thickness difference between the land (northern blue box in (a), $20.5^\circ\text{--}40.5^\circ\text{N}$, $55^\circ\text{--}100^\circ\text{E}$) and ocean (southern blue box in (a), $-10.5^\circ\text{--}10.5^\circ\text{N}$, $40^\circ\text{--}85^\circ\text{E}$) is defined as the land–sea contrast index. A 3-point (1/4, 1/2, 1/4) filter with 40 times is performed on the land–sea contrast index. The atmospheric CO_2 concentration is multiplied by -1 to facilitate comparison.

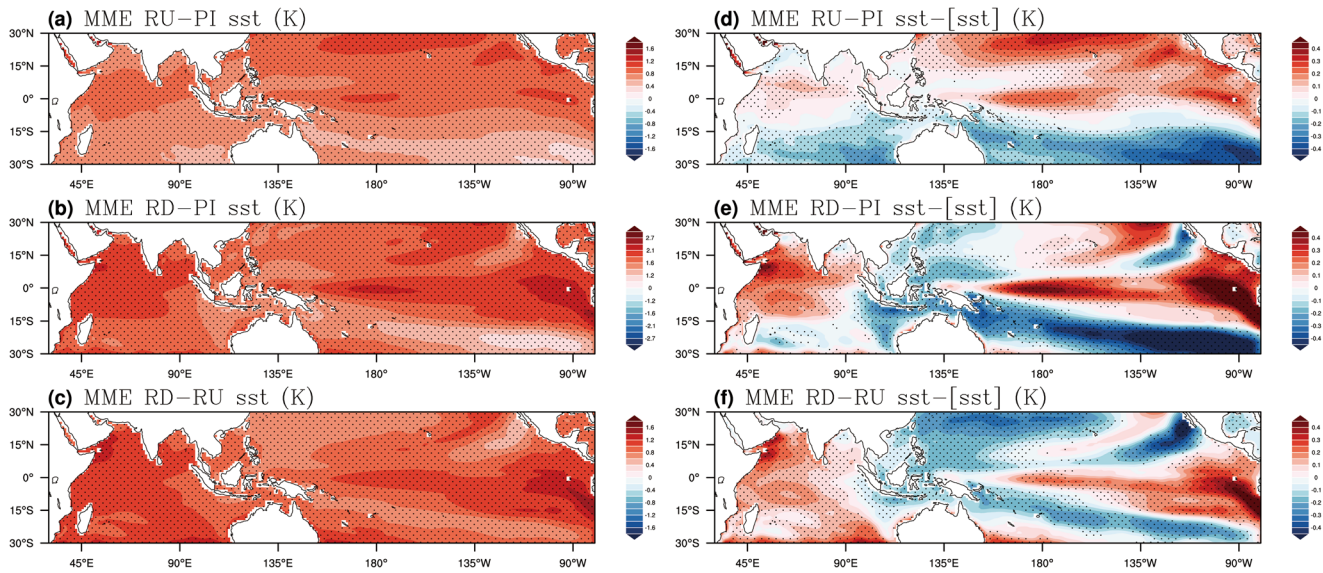


Fig. 9 The responses of SST (unit: K) in the CO₂ ramp-up and ramp-down experiments. **a, b** The SST anomalies during the RU (**a**) and RD (**b**) periods compared to PI, respectively. **c** The difference between the RU and RD periods. The right panel (**d–f**) is the same as the left panel, but with the tropical mean SST removed. The black dots denote the region in which at least 70% of models agree on the sign of the MME.

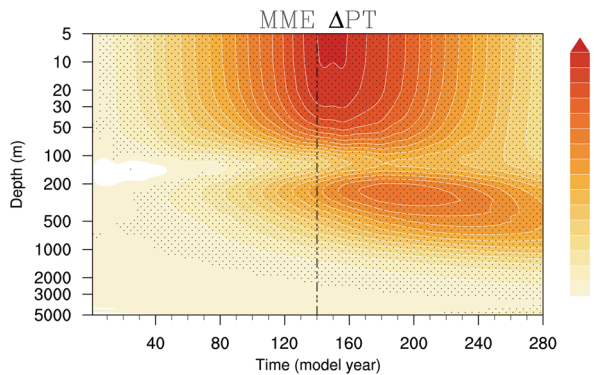


Fig. 10 The response of the oceanic potential temperature. Time evolution of tropical Pacific Ocean mean (–10.5°S–10.5°N, 180°–100°W) potential temperature change (ΔPT ; unit: °C) profile in CO₂ ramp-up and ramp-down experiments at all depths, based on repeated application of 3-point (1/4, 1/2, 1/4) filter with 40 times. ΔPT is relative to the PI. The black dashed line indicates the CO₂ peak year (Year 140). Black dots indicate more than 70% ensemble members agree with the sign of the MME. Note that the vertical depth coordinate is logarithmic.

center over the Indian Ocean weakens the SA-Indian Ocean thermal and thus SASM circulation. The uneven enhanced warming leads to anomalous sinking, as well as decreased precipitation over the SASM region directly. Additionally, over the Pacific and Indian Ocean sectors, the weakened Walker circulation affects SASM circulation indirectly. It suppresses the rainfall over the MC and increases the rainfall over the TWIO. The suppressed precipitation over the MC triggers an equatorial Rossby wave response to generate an anomalous lower-level anticyclone, which weakens the ascent on the top of the planetary boundary layer, via the effect of Ekman downwelling. The increased rainfall over the TWIO triggers an equatorial Kelvin wave response to hinder water vapor transport to SA. The enhanced IOD-like warming pattern may reinforce the anomalous easterly over the tropical Indian Ocean and further weaken water vapor transport. The combination of the weakened ascent and water vapor transport caused by the enhanced uneven SST warming leads to the asymmetric response of SASM precipitation.

In the present study, our results are mainly based on the MME of seven models participating in the 1%CO₂ and 1%CO₂-CDR experiments. Compared to studies based on a single model, the MME analysis can partially exclude the model-dependent response and the role of internal variabilities in the climate system, indicating the robustness of the asymmetric response to SASM precipitation. This study systematically reveals the prominent dynamic processes (e.g., equatorial waves) in the formation of the asymmetric response of SASM precipitation. In particular, we highlight the role of atmospheric thermal forcings on SASM circulation induced by uneven tropical SST warming. These important thermal forcings, including rainfall anomalies over the MC and TWIO, have not been mentioned by previous studies concerning the asymmetric response of SASM precipitation. However, we cannot completely eliminate model dependence due to the limited number of models, which may disturb the response of SASM precipitation under the CDR scenario. The internal variabilities of the climate system, such as the Interdecadal Pacific Oscillation and Atlantic Multidecadal Oscillation, are associated with the SASM^{61–63}. Despite this, it is necessary to understand the sources of model uncertainty and the effects of internal variabilities in future studies. In addition to this, the detailed processes leading to an enhanced IOD-like warming pattern during the RD period compared to the RU period remain to be understood. We infer that this may be related to the slow recovery of Walker circulation and the enhanced El Niño-like warming pattern during the RD period.

Although the scenario used in this study is idealized, it is useful for exploring the reversibility and hysteresis of the climate system, especially in providing insight into the CDR scenario. It is noteworthy that SASM precipitation overshoots the unperturbed level before the CO₂ concentration returns to PI. This indicates that the symmetric CDR may increase the risk of drought and may affect water management in the SASM region. This gives us a hint that one should consider the side effects of climate mitigation when making climate change policies.

METHODS

Observation and reanalysis datasets

The observational and reanalysis data used in the present study include (1) the Global Precipitation Climatology Project (GPCP)

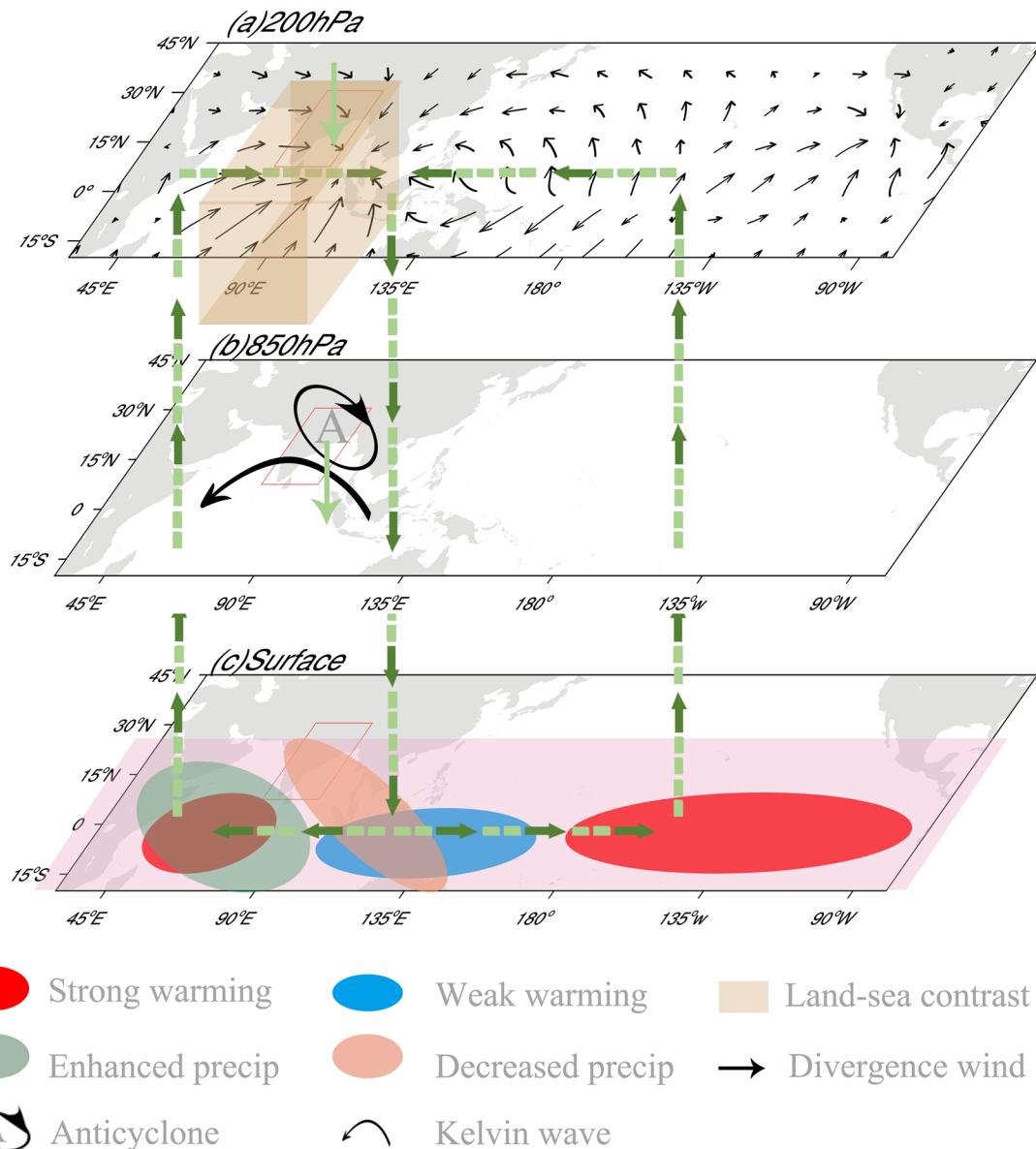


Fig. 11 Schematic diagram showing the key processes involved in the asymmetric response of SASM precipitation under the CDR scenario. The processes at the 200 hPa (a), 850 hPa (b), and surface (c), respectively.

monthly precipitation dataset⁶⁴; (2) the National Centers for Environmental Prediction-Department of Energy (NCEP-DOE) reanalysis⁶⁵; and (3) the Hadley Center Global Sea Surface Temperature (HadISST) dataset⁶⁶. All the above datasets cover 1979–2014.

CMIP6 model datasets

The present study is mainly based on the monthly outputs of the following experiments (Supplementary Table 1) of CMIP6: (1) historical experiment, in which time-dependent observed anthropogenic and natural forcings are specified to reflect observational estimates valid for the historical period (i.e., 1850–2014)⁶⁷; (2) pre-industrial control (piControl) experiment (global mean atmospheric CO₂ concentration of 284.7 ppm), started from initial conditions obtained from a spin-up with the same, which should ideally represent a near-equilibrium state of the climate system under imposed year 1850 conditions⁶⁷; (3) 1%CO₂ experiment, in which the climate (including CO₂ concentration) initiates from the end of the piControl experiment and the CO₂ concentration

gradually increases at a rate of 1% per year for 140 years until it quadruples (i.e., 1138.8 ppm; all other forcing is kept at that of the year 1850)⁶⁷, which is named the ramp-up period; and (4) 1%CO₂-CDR experiment, in which the climate (including CO₂ concentration) initiates from the end of the 1%CO₂ experiment and the evolution of CO₂ concentration is the mirror of that in the 1%CO₂ experiment (all other forcing is kept at that of the year 1850), which is named the ramp-down period¹⁵. The evolution of the CO₂ concentration in the 1%CO₂ and 1%CO₂-CDR experiments is displayed in Fig. 1a. The total time of these two experiments is 280 years (140 years for ramp-up and 140 years for ramp-down). Seven models (ACCESS-ESM1-5, CanESM5, CNRM-ESM2-1, GFDL-ESM4, MIROC-ES2L, NorESM1-LM, and UKESM1-0-LL) participated in the present study (Supplementary Table 2). CESM2 is excluded because the differences between ramp-down and ramp-up periods are exaggerated (Supplementary Fig. 3). If it is involved in the calculation, the MME is dominated by the results of CESM2. UKESM1-0-LL does not participate in vertical-velocity-associated calculations due to data unavailability.

To obtain the MME, the outputs are regridded to a common $1^\circ \times 1^\circ$ grid. We consider the results to be robust when more than 70% of the models (5 out of 7) agree on the sign of the MME. For convenience, we defined the 1st year of the 1%CO₂ experiments as Year 1. To examine the reversibility of SASM precipitation, we select two periods during which the mean CO₂ concentration is identical: CO₂ ramp-up (year 21–60; RU) and ramp-down (year 220–259; RD) periods. It is reasonable to choose the periods at the beginning of the CO₂ ramp-up and the end of the CO₂ ramp-down. However, to increase the magnitude of the response signal, we shift these two periods to the middle by 20 years. A repeated application of the 3-point filter is used to remove interannual variability, and the results do not fundamentally change when the 21-year running mean is applied. The two-sided Student's *t*-test is used to evaluate the statistical significance of the difference. The climatology of the last 100 years in the piControl experiment is defined as the baseline (PI). The analysis focuses on the average boreal summer (June–August) because the precipitation over South Asia is mainly concentrated in summer⁶⁸.

Model evaluation

Before analyzing the response of SASM precipitation to CO₂ forcing, we examine the performance of models based on the CMIP6 MME. SASM precipitation and its associated variables are compared and examined (Supplementary Fig. 4). The CMIP6 MME can grasp the spatial distribution of variables, but with slight differences in magnitude. The spatial correlation coefficients of the individual models with reanalysis all exceed 0.71, and those of the CMIP6 MME all exceed 0.84 (Supplementary Fig. 5). Overall, the CMIP6 MME is capable of investigating the SASM response to CO₂ forcing.

The Linear Baroclinic Model

To investigate the effects of heat forcing on the atmosphere, the Linear Baroclinic Model (LBM) is employed. This model has 20 vertical levels based on the sigma coordinate system and a horizontal resolution of T42. The horizontal diffusion has an e-folding decay time of 6 h for the largest wavenumber. The Rayleigh friction and Newtonian damping have a time-scale of 1 day⁻¹ for sigma levels below 0.9, 5 day⁻¹ for sigma levels of 0.89, 15 day⁻¹ for sigma levels of 0.83, 30 day⁻¹ for sigma levels between 0.83 and 0.03, and 1 day⁻¹ for sigma levels above 0.03. Further information on the model is given in Watanabe and Kimoto (2000)⁶⁹. In the present study, the model is integrated for 36 days, and the average from 25 to 35 days is displayed.

DATA AVAILABILITY

The CMIP6 outputs are available online at <https://esgf-node.llnl.gov/projects/cmip6/>. The observational and reanalysis data that examine the performance of models are openly available at <https://psl.noaa.gov/data/gridded/data.gpcp.html> (GPCP), <https://psl.noaa.gov/data/gridded/data.ncep.reanalysis2.pressure.html> (NCEP-DOE) and <https://www.metoffice.gov.uk/hadobs/hadisst/data/download.html> (HadISST). The LBM is available online at https://ccsr.aori.u-tokyo.ac.jp/~lbm/sub/lbm_4.html.

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AUTHOR CONTRIBUTIONS

S.Z.: Investigation, data Curation, formal analysis, drafted the manuscript, writing review, and editing. X.Q.: Conceptualization, methodology, formal analysis, writing review, and editing. G.H.: Conceptualization, supervision, funding acquisition, project administration. P.H.: Methodology, formal analysis, writing review, and editing. All authors contributed to the discussion.

COMPETING INTERESTS

The authors declare no competing interests.

ADDITIONAL INFORMATION

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