

A stronger versus weaker Walker: understanding model differences in fast and slow tropical Pacific responses to global warming

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Abstract

The tropical Pacific response to radiative forcing remains uncertain as projected future changes to the Walker circulation and SST patterns vary substantially among climate models. Here, we study what sets the magnitude and timescales of the response and why they differ across models. Specifically, we compare the fast and slow responses of the tropical Pacific to abrupt CO_2 increases $(2, 4, 8, 16 \times CO_2)$ in two configurations of the same model family (CESM) that differ in horizontal resolution and mean biases. We find that the model with a higher resolution shows a transient ocean thermostat-like response to CO_2 -forcing, with a stronger Walker cell and lack of warming in the eastern Pacific trade wind belts. This fast response lasts for about 50 years and is followed by a slight Walker cell weakening and equatorial warming. The second model, with a coarser resolution, shows a weak and short-lasting ocean thermostat response, followed by pronounced Walker cell weakening and eastern equatorial Pacific warming, similar to the long-term pattern noted in previous studies. These fast and slow responses also manifest in experiments where CO_2 is gradually increased. We relate the magnitude of the fast ocean-thermostat response to the structure of the equatorial thermocline, setting the strength of the Bjerknes feedback. The magnitude and timing of the delayed eastern equatorial Pacific warming are related to the competition of positive feedbacks amplifying the ocean thermostat against the effect of ocean subsurface warming eroding the thermostat. The latter effect is further amplified by the slowdown of oceanic subtropical cells and enhanced extra-tropical warming. Different balances between these effects could explain the large spread in the model future projections for the tropical Pacific.

1 Introduction

The mean zonal structure of the tropical Pacific climate system is maintained by coupled ocean—atmosphere interactions that depend on the Bjerknes feedback (Bjerknes 1969), connecting the surface winds of the Walker circulation and the zonal SST gradient along the equator (Dijkstra and Neelin 1995; Jin 1996; Lui and Huang 1997). In turn, the mean state of the tropical Pacific controls a variety of climate phenomena including interannual fluctuations associated with ENSO (Collins et al. 2010; Dijkstra and Neelin 1995; DiNezio et al. 2012; Fedorov and Philander 2000; Jin 1996) and variations

in global ocean heat uptake on decadal timescales scales (England et al. 2014; Hu and Fedorov 2017; Kosaka and Xie 2013). Understanding how the zonal mean structure of the tropical Pacific will change with global warming has direct implications for society on a range of scales (Ashok and Yamagata 2009; Griffiths et al. 2005; McPhaden et al. 2020; Pierrehumbert 2000), yet a robust understanding of its response to atmospheric radiative forcing remains elusive due to uncertainties associated with the key mechanisms controlling changes to the tropical Pacific mean state (Cai et al. 2015; DiNezio et al. 2012), pervasive model biases (Burls and Fedorov 2014) and discrepancies between models and the observations (Kociuba and Power 2015). Thus, gaining a fundamental and robust understanding of how the tropical Pacific will change (and has changed in the past) is a crucial challenge for climate sciences, and one of the goals of the present paper is to compare and contrast such changes in a suite of simulations with abrupt and gradual CO₂ increases within two different models of the same GCM family (CESM, see Model set-up).

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Predicting robust changes to the zonal structure of the tropical Pacific using state-of-the-art global climate models has proven challenging, both for historical simulations and projections for the twenty-first century. Kociuba and Power (2015) and Coats and Karnauskas (2017), among other studies, have shown that the models of the Coupled Model Intercomparison Project, phase 5 (CMIP5) are unable to capture the decadal strengthening of the Walker circulation of the past 3 decades described in multiple studies (England et al. 2014; Ma and Zhou 2016; Meng et al. 2012; Tokinaga et al. 2012; Zhang et al. 2019). Overall, the majority of GCMs, but not all, predict an eastern equatorial Pacific warming pattern developing over the twenty-first century and the corresponding weakening of the Walker circulation (e.g. DiNezio et al. 2009; Xie et al. 2010; Ying et al. 2016), but the magnitude of this pattern and the Walker cell weakening vary strongly across models. Consequently, Plesca et al. (2018) questioned the robustness of weakening of the Walker circulation in CMIP5 future projections because of the large spread of simulated trends. These findings suggest that in order to achieve robust GCM projections for the future tropical climate, we need to understand what causes the large spread among CMIP models, as well as why they are unable to capture the observed trend.

While the details of climate model projections of the tropical Pacific vary across models, progress has been made in understanding interactions between different components of the tropical climate system that are important for the response of the tropical Pacific to global warming. In a series of papers, Clement et al. (1996), Cane et al. (1997) and Seager and Murtugudde (1997) proposed that the equatorial Pacific east—west SST gradient could increase in response to CO₂ due to enhanced warming of surface waters in the western Pacific contrasted by continuous upwelling of cold water in the east. Seager et al. (2019) also highlighted the role of trade wind strengthening off the equator, which drives the basin-wide shoaling of the thermocline and thus contributes to the ocean thermostat.

Conflicting the thermostat hypothesis, Held and Soden (2006), Vecchi et al. (2006) and Vecchi and Soden (2007) argued that the Walker circulation should weaken as a result of the reduced vertical mass flux in the tropical circulation; the latter reduction should occur as specific humidity increases at faster rates in a warming atmosphere than precipitation. In addition, enhanced evaporative cooling over the warm pool has been also proposed as a mechanism that reduces warming in the western tropical Pacific (Knutson and Manabe 1995; Merlis and Schneider 2011) and thus weakens the Walker cell by reducing the zonal SST gradient. Other studies focused on the role of shallow meridional overturning circulation, arguing that the temperature of water upwelled in the eastern Pacific is ultimately controlled by the temperature of extra-tropical source waters and the

intensity of the ocean subtropical cells—STCs (Burls and Fedorov 2014; Gu and Philander 1997; McCreary Jr and Lu 1994; Seager and Murtugudde 1997). These mechanisms were dubbed 'the ocean tunnel' (or 'the oceanic bridge' on occasions).

More recently, these diverging theories have been investigated, and reconciled to some extent, in a range of studies using a hierarchy of model experiments (Luo et al. 2017; Seager et al. 2019; Heede et al. 2020). Heede et al. (2020) used idealized experiments with box models and comprehensive GCM simulations to show that the ocean thermostat (OT) and the eastern equatorial Pacific warming (EP)/Walker circulation weakening are both robust responses to CO2 forcing in the fully coupled tropical Pacific ocean-atmosphere system, depending on the timescales considered. Their simulations exhibited a transient response first, characterized by an Indo-Pacific thermostat with stronger equatorial winds over the Pacific Ocean, and warming over the Maritime continent and the Indian Ocean (a modified version of the original ocean thermostat mechanism proposed by Clement et al. 1996). This fast response generally resembles the observed trends in the Indo-Pacific between the 1990s and 2010s (Luo et al. 2012; Lee et al. 2015; Ma and Zhou 2016; Hu and Fedorov 2019). The importance of the dynamical ocean in driving the transient Pacific cooling in response to CO₂ forcing has been also illustrated by Luo et al. (2017).

Another important feature of the fast response is a west-ward shift of the Walker cell towards the Maritime continent (Heede et al. 2020 and the results in this paper), which was not considered in Clement et al. (1996). The link between Indian Ocean warming and Pacific cooling is confirmed by Zhang et al. (2019) who show that imposing the observed SST changes over the Indian Ocean in GCM pacemaker experiments causes cooling over the equatorial Pacific, by shifting the Walker cell westward and strengthening central equatorial winds, creating an inter-basin warming contrast similar to the observed.

The fast OT-type response is eventually replaced by a slow, gradually evolving response characterized by weakening of the Walker circulation, and a corresponding eastern equatorial Pacific warming (EP). This EP warming pattern dominates the multi-model-mean GCM projections for the late twenty-first century Pacific (DiNezio et al. 2009; Xie et al. 2010; Ying et al. 2016). To investigate the development of this pattern, Heede et al. (2020) have used one of the GCMs of the present study (T31, see methods) and compared simulations with and without a full dynamic ocean. They find that on longer timescales, the tropical Pacific response in this particular model is in large part driven by enhanced extra-tropical warming and the slowdown of the oceanic subtropical cells (STCs) in addition to stronger evaporative cooling of the western Pacific relative to the eastern Pacific. The respective roles of the tropics and



extra-tropics in driving warming patterns over the Pacific has been also investigated by Stuecker et al. (2020). Similarly, they find that extra-tropical warming is key for driving enhanced tropical warming by slowing down the Hadley cell as well as the oceanic subtropical cells, thereby reducing poleward heat transport. Kang et al. (2020) similarly find in reversed experiments that the Walker cell strengthens in response to extra-tropical cooling for simulations including a dynamic ocean.

In addition to these ocean tunnel effects, Heede et al. (2020) also find that the weakening of the tropical atmospheric circulation implied by the thermodynamic scaling arguments of Held and Soden (2006) is indeed observed for the mid-troposphere vertical mass flux, but its surface manifestation is not robust across the experiments and ocean—atmosphere interactions appear to be more important in controlling the overall Walker cell and SST response in the tropical Indo-Pacific.

In summary, multiple studies indicate that the tropical Pacific is capable of two fundamentally different types of responses (OT and EP) with timescales and magnitude depending on the interplay of various factors, including how abruptly the system is perturbed and the rate of extratropical warming relative to the equatorial band. A related question is whether the inability of GCMs to capture the observed recent temperature and wind trends is indeed caused by an inaccurate representation of the transient Indo-Pacific OT response, which may be linked to persistent GCM biases affecting the cold tongue/warm pool complex, equatorial wind stress, the equatorial undercurrent and the ITCZ (e.g. Bellenger et al. 2013; Burls et al. 2017; Karnauskas et al. 2020; Li and Xie 2014) as well as extra-tropical biases (Burls and Fedorov 2014; Kang et al. 2020; Thomas and Fedorov 2017). To investigate the impacts of GCM biases, Seager et al. (2019) use a simpler model based on thermodynamic atmosphere-ocean coupling linearized around the tropical mean state. The Pacific Ocean response to historical forcing within this model involves a strengthening of the zonal SST gradient and the Walker cell, which is more consistent with the observed changes than those seen in GCMs. Seager et al. (2019) argue that GCMs are unable to describe this strengthening due to the cold bias of their equatorial cold tongues with too high relative humidity and too low local wind speed, resulting in a high local SST sensitivity to radiative forcing.

The goal of the present paper is to analyze the roles of the two types of tropical Pacific responses (OT and EP) in, respectively, the fast and slow evolution of the coupled ocean-atmosphere system within two different coupled models and investigate the causes of the model differences. By conducting a comparative analysis of two GCMs with different Walker cell responses, we aim to gain further insights into why models are different in their estimates of projected changes to the Walker circulation, and, in particular, which physical processes are key for setting the balance between the ocean thermostat and eastern Pacific warming responses.

The results presented here are complementary to, and expanding on the findings of Heede et al. (2020). While the previous work was aimed at reconciling several proposed mechanisms and combining them into a coherent framework, the present study applies this framework to explore the causes of model differences. The ultimate motivation for this comparison is to understand the key physical drivers behind the large inter-model spread in how the tropical Pacific responds to global warming—a critical issue affecting the robustness of future projections for the region.

The paper is structured as follows: Sect. 2 describes the two GCMs used in the comparitive analysis and the experimental set-up. Section 3 contrasts the two models focusing on five areas: Sect. 3.1: the development and characteristics of the fast OT-type response, Sect. 3.2: the link between the mean state ocean stratification and the strength of the OT, the roles of Sect. 3.3: mean state winds and Sect. 3.4: wind feedbacks in the response, and Sect. 3.5: the role of the ocean tunnel effects in driving the slow eastern Pacific warming response. Section 4 discusses these findings and their implications for future warming patterns in the tropical Pacific.

2 Model set-up

In this study, we use two different configurations of the Community Earth System Model (CESM). One set of simulations are carried out using the T31 gx3v7 configuration of CESM v. 1.0.4. and therefore essentially CCSM4 at the given resolution see Gent et al. (2011). This configuration has a nominal ~3.75° atmospheric resolution and an oceanic latitudinal resolution of about 2° increasing to 0.5° near the equator. An identical set of simulations are then performed with a medium resolution version of CESM $(1.9 \times 2.5 \text{ gx}1\text{v}6)$ v. 1.2.1, or f19_g16) with a nominal ~ 2° atmospheric resolution and an oceanic latitudinal resolution of about 1° increasing to 0.3° near the equator. Hereafter, we refer to the coarse-resolution model as T31 and to the medium resolution model as f19. Note that a part of the analysis using the T31-model also appeared in Heede et al. (2020). Here, we use those results as well as additional analysis to facilitate a comparison between two models from the same family, yet with different resolution and mean state biases.

The two selected configurations of CESM have pronounced differences in their zonal Pacific response to radiative forcing in a range of warming scenarios. By choosing these two models, we can investigate what causes the stronger or weaker Walker cell responses, which will help



understand the large spread of model estimated changes in the tropical Pacific.

We conduct a series of abrupt CO₂ rise experiments with 2, 4, 8 and 16 times CO₂ increase relative to the preindustrial level. The abrupt CO2 experiments are useful for detecting changes directly resulting from greenhouse gas forcing as opposed to natural variability. As the rapid forcing increase might not accurately reflect realistic warming scenarios, we additionally conduct ramp experiments for each model where CO2 is increased linearly from preindustrial level (280 ppm) to $4 \times CO_2$ (1120 ppm) over 200 years and compare them to the abrupt CO₂ rise experiments. In order to ensure that the experiments reach $4 \times$ CO₂ after 200 years, we use a linear CO₂ ramp rather than the more conventional 1% forcing experiments. However, the forcing magnitudes of linear and 1% CO₂ increases are similar in the first 100 years of the simulation where the bulk of the fast response takes place, thus making the two approaches generally comparable.

The abrupt experiments are run for 400 years (200 years for the ramp experiment), and an ensemble approach is used to reduce the signature of natural variability, for instance associated with ENSO. Different ensemble members are generated following Kay et al. (2015) by adding random temperature anomalies with magnitude of 10⁻¹⁴ K to the same initial conditions. Five ensemble members are produced for T31 and three ensemble members for f19. All experiments are initiated from the same start date and from two baseline simulations (called b.40), each corresponding to the given model resolution, made available by the National Center for Atmospheric Research (NCAR) with the 1850 radiative forcing that has been spun up for 507 years. Year zero in our simulations is the year at which CO₂ is added to the atmosphere (instantaneously or ramped) in all experiments, except the control, which continues the baseline experiments but with added ensemble members.

As part of our analysis, we will use several temperature gradient metrics. To best capture the magnitude of the fast ocean thermostat type response (including its westward Walker cell shift), we define the Indo-Pacific SST gradient as the SST difference between the Indo-Pacific warm pool (80° E-130° E) and the central-eastern Pacific (180°E-280° E). To best capture long term changes in ocean dynamics associated with the oceanic tunnel in the Pacific Ocean, we use two additional metrics: the zonal Pacific gradient defined as the upper ocean (50 m) temperature difference between the West Pacific (5° S-5° N; 120°-150° E) minus that in the East Pacific cold tongue region (5° S-5° N; 205°-280° E). The meridional gradient is defined as the difference between the mean upper-ocean (50 m) temperature of the tropical Pacific (5° S-5° N) and an average of the northern and southern Pacific. The southern Pacific is defined as 50° S-20° S and 200° – 280° E. The northern Pacific is defined as 20° – 50° N and 160° to 240° E. These regions are considered the main source regions for equatorial upwelling (e.g. Thomas and Fedorov 2017).

3 Results

3.1 The strength and the zonal and meridional structure of the ocean thermostat

Responding to the abruptly increased CO_2 concentration in the atmosphere, both models show a characteristic fast evolution that includes an initial strengthening of the zonal east—west SST gradient and zonal winds integrated across the Pacific (relative to the control simulation), followed by a weakening of this SST gradient and zonal winds when the system moves toward equilibrium (Fig. 1). However, the timescales and magnitude of changes varies substantially between the two models. As expected, the magnitude of changes also varies across different CO_2 forcings, yielding the most subdued signal in the $2 \times \mathrm{CO}_2$ experiments.

The initial fast response seen in the two models, characterized by stronger gradients and a generally stronger Pacific Walker cell relative to the control simulation, has been described previously by Heede et al. (2020) as a transient Pacific Ocean thermostat (or more generally, the Indo-Pacific thermostat, also see Zhang et al. 2019), with a characteristic westward shift of the Walker cell, driven both by wind-evaporation feedbacks and ocean dynamics.

The T31 model shows a relatively weak initial strengthening of the zonal SST gradient and integrated wind stress lasting 20–30 years, as compared to the f19 model whose initial response is stronger and lasts about 50 years (Fig. 1). As evident from Fig. 2, the initial equatorial response is accompanied by strong "cooling" anomalies (relative to the mean tropical warming) in the trade wind belts, especially pronounced in the f19 model (Fig. 2), which coincide with the strengthening of the northeasterly and southeasterly winds. Along the equator, the initial response is characterized by the strengthening and westward displacement of wind stress, indicative of a stronger and westward shifted Walker circulation over the Pacific (Fig. 3). These Walker cell changes are driven in part by enhanced warming over the Indian Ocean and the Maritime continent, inducing a Gill-type response (Matsuno 1966; Gill 1980; recently Hu and Fedorov 2019) with stronger winds over the central and western Pacific. Thus, the initial system response resembles an ocean thermostat mechanism, albeit with a zonal and meridional structure different from that originally proposed by Clement et al. (1996). The thermostat effect, including the strengthening of the east-west equatorial SST gradient and the Walker cell amplified by the Bjerknes feedback,



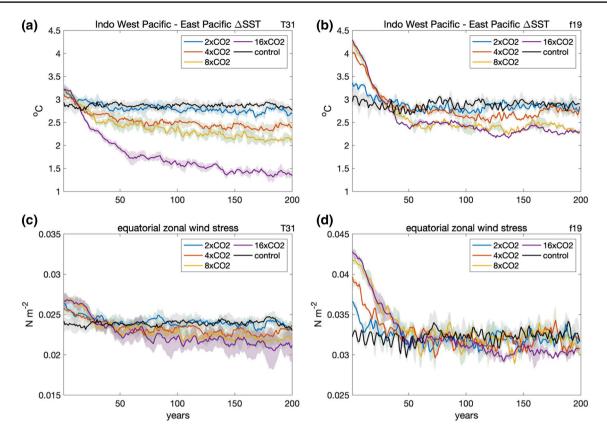


Fig. 1 Variations in key variables describing the Walker circulation in the control and abrupt ${\rm CO}_2$ increase experiments for the two model configurations: **a, b** the SST gradient between the Indo-Pacific warm pool (80° E–130° E) and the Central-Eastern Pacific (180°E–280° E); **c, d** zonal wind stress integrated over the equatorial Pacific basin from 130° E to 280° E. 10-year running means averaged between 5° S to 5° N and further averaged across 5 (T31) or 3 (f19) ensemble members are shown; shading indicates ensemble spread. The running

mean window-size is adjusted to available data (5 years at endpoints). The left column corresponds to the T31 model; the right column to f19. Note that the initial strengthening of the Walker cell is especially strong in the higher-resolution model (f19) and the equilibrium weakening of the Walker cell is more pronounced in the T31 model. The results from the T31 model in Figs. 1–3 also appear in Heede et al. (2020)

turns out to be significantly stronger in the higher-resolution model (f19), the reasons for which we will analyze in subsequent sections.

Our ramp experiments show a generally similar fast response, even though for the gradual CO₂ increase the thermostat response is slower to emerge and lasts for about 70–100 years (Fig. 4). The spatial pattern of the OT response is generally similar to that in the abrupt experiments. After 100 years, the SST gradient becomes weaker than that in the control experiment, and the induced changes to the SST gradient gradually converge to the slow, quasi-equilibrium response of the abrupt experiments. While the transient ocean-thermostat type response appears slightly stronger and longer lasting in the f19 model, compared to the T31 model, the differences between the two models are somewhat smaller in the ramp experiments, compared to the abrupt experiments.

3.2 The ocean thermocline structure and the Bjerknes feedback

The effect of the westward shift of the Walker cell on the ocean thermal structure along the equator is a cold subsurface anomaly in the central and eastern equatorial Pacific, which reflects the local shoaling of the thermocline, illustrated in the schematic in Fig. 5. In turn, this cold anomaly causes a colder central equatorial Pacific SST, which strengthens the Walker cell via the Bjerknes feedback.

The difference in the strength and position of the initial response between the two models can in part be traced to the structure of mean winds and upper ocean stratification simulated by the models along the equator. The T31 model has weaker mean easterly winds with a broader zonal profile (Fig. 3a). The corresponding upper-ocean thermal structure shows a less stratified thermocline (Fig. 6a). The f19 model, in contrast, has a sharper wind stress profile, stronger winds (Fig. 3b) and a more stratified thermocline (Fig. 6b). Thus,



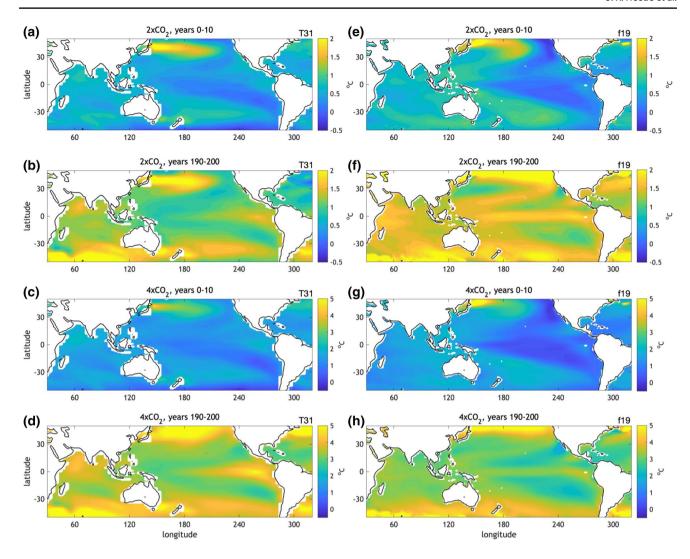


Fig. 2 Examples of mean SST anomalies relative to the control, in $^{\circ}$ C, for the $2 \times \text{CO}_2$ and $4 \times \text{CO}_2$ abrupt CO_2 -rise experiments. Left: the T31 model. Right: the f19 model. The top and third rows, i.e. **a**, **c**, **e**, and **g**, show averages for the first 10 years of each simulation.

The second and bottom rows, i.e. \mathbf{b} , \mathbf{d} , \mathbf{f} , \mathbf{h} , are averaged for years 190–200. Ensemble means are shown. Note that different temperature scales are used in the two bottom versus two top rows

due to the stronger stratification in the f19 model, any displacement of the thermocline will lead to larger upper-ocean temperature anomalies, which in turn will create a stronger ocean thermostat effect in response to an initial perturbation in wind stress from atmospheric forcing. This is illustrated in Fig. 6c and d, where the upper ocean cold anomaly is generally consistent with the shape and strength of the mean state thermocline profile.

Thus, the higher sensitivity of SST to thermocline displacement can account for a stronger Bjerknes feedback in the f19 model. To illustrate this, we plot Hovmöller diagrams showing the joint temporal evolution of the changes in SST and wind stress (Fig. 7). As expected, a strong correlation between the wind stress and SST changes is observed. Importantly, the f19 model shows much stronger variation in central Pacific wind stress than the T31, which in turn can

be related to the shaper thermocline in Fig. 6. Consequently, a stronger Bjerknes feedback in the f19-model facilitates a stronger OT-type response to forcing due to the stronger upper-ocean temperature anomalies associated with initial wind changes.

3.3 The mean state and the wind-evaporation-SST (WES) feedback

In addition to the upper-ocean stratification, the mean state winds also affect the fast response by controlling latent heat fluxes. In a model with stronger mean state surface winds, a radiative forcing can be offset by increased latent heat fluxes more efficiently than in a model with weaker mean state surface winds. To investigate the extent to which model differences in the mean wind field influence



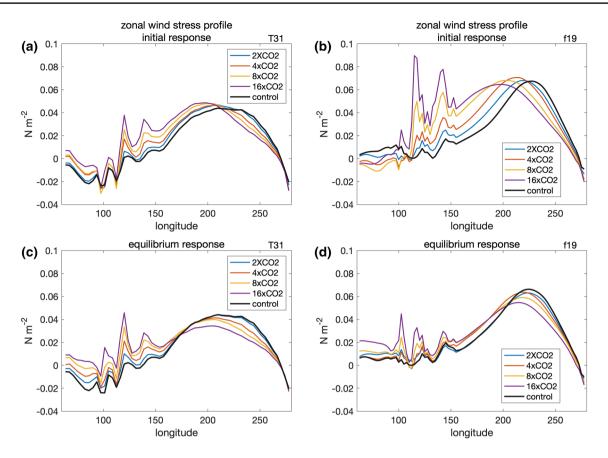


Fig. 3 Mean zonal wind stress profiles along the equator for each CO_2 perturbation experiment and the control experiment. Left: the T31 model. Right: the f19 model. The top row, **a** and **c**, shows the initial response averaged over the first 10 years. The bottom row, **b** and

d, shows the equilibrium response averaged between the years 190–200 of the simulation. Ensemble means, further averaged between 5° S– 5° N, are used. Here, positive values indicate easterly winds

the differences in the latent heat flux responses in the two GCMs, we analyze the linearized latent heat flux response to a uniform 1 K forcing using a conventional bulk formula for latent heat fluxes due to evaporation from the ocean surface, *E*:

$$E = LC_L \rho_{air} W(1 - \mathcal{H}) q_s$$

where L is latent heat of evaporation, ρ_{air} is an average density of air near the surface, W is windspeed, \mathcal{H} is relative humidity, C_L is the latent heat transfer coefficient (here we use $C_L=10^{-3}$) and q_s is saturation specific humidity. We can further approximate $q_s \approx \frac{0.622}{P_{air}} e_s$ where e_s is saturation vapor pressure and P_{air} is standard atmospheric pressure at sea level. Considering a linearized response to a temperature change ΔT around the mean state, we can express changes in latent heat fluxes ΔE as:

$$\Delta E = LC_L \rho_{air} W_0 (1 - \mathcal{H}_0) \left(\frac{0.622}{P_{air}} \right) \frac{de_s}{dT} \Delta T$$

$$= LC_L \rho_{air} W_0 (1 - \mathcal{H}_0) \left(\frac{0.622}{P_{air}} \right) \frac{Le_{s0}}{R^{\nu} T_0^2} \Delta T$$

where W_0 , \mathcal{H}_0 , e_{s0} , and T_0 denote mean state fields—windspeed, relative humidity, saturation vapor pressure and temperature, respectively, and R^{ν} is the gas constant for water vapor.

Figure 8 shows the fast and slow latent heat flux responses from the fully coupled models alongside the linearized latent heat flux response based on the mean state fields and $\Delta T = 1 \text{ K}$.

Let us first consider the system's fast response (Fig. 8e, f). In the fully coupled models, along the equator there is a general increase in the western-central equatorial Pacific consistent with wind strengthening there. The stronger latent heat loss reinforces the Indo-Pacific SST gradient that drives the ocean thermostat-type response. Differences between the patterns along the equator in the fully coupled models and



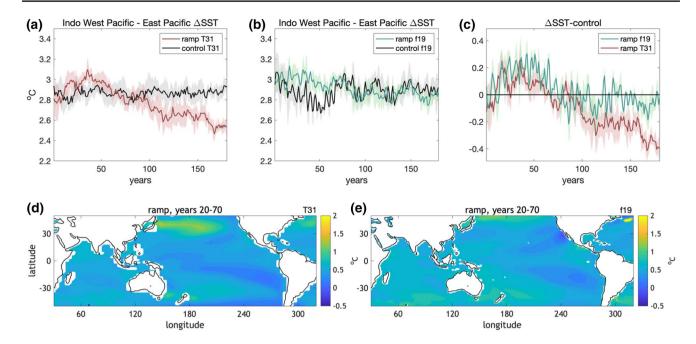


Fig. 4 Evolution of the zonal SST gradient, Δ SST, between the Indo-Pacific warm pool (80° E–130° E) and the Central-Eastern Pacific (180°E–280° E) in the ramped-CO₂ simulations and in the control experiment for **a** the T31 and **b** f19 models. **c** Shows anomalies in this SST gradient relative to the control for each model. The ramp experiments are conducted by linearly increasing CO₂ from the preindustrial level (280 ppm) to $4 \times \text{CO}_2$ (1120 ppm) over 200 years. 10-year running means averaged between 5° S to 5° N and further

averaged across 5 (T31) or 3 (f19) ensemble members are shown; shading indicates ensemble spread. **d** and **e** show mean SST anomalies relative to the control, in °C, averaged between years 20–70 of the ramp experiment. The transient ocean thermostat response is evident in both models and persists for 70–80 years. T31 shows a slightly weaker ocean thermostat, and a faster and more prominent transition to the weaker Walker regime

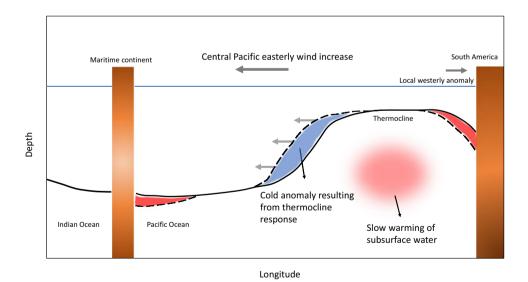


Fig. 5 A schematic of the tropical ocean response to atmospheric GHG forcing. Warming over the Indian Ocean and the Maritime continent creates a westward shift of the Walker cell, which results in a westward shift of the thermocline with a resultant transient cold anomaly in the central Pacific. The anomaly is amplified by the Bjerknes feedback as the easterly winds strengthen in the central Pacific. Meanwhile, local westerly wind anomalies in the far east

Pacific cause a depression of the thermocline close to South America. The system gradually transitions to the equilibrium response following the warming of subsurface waters in the central and eastern equatorial Pacific caused by the warming of extra-tropical waters feeding equatorial upwelling. The effect is further amplified by the slowdown of the ocean subtropical cells



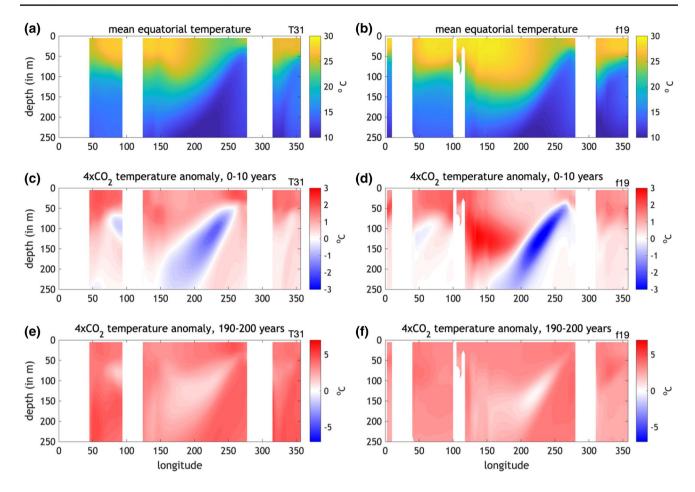


Fig. 6 (Top) mean temperature in the control experiments and (middle, bottom) temperature anomalies relative to the control in the upper ocean in the abrupt $4 \times CO_2$ experiments. \mathbf{c} and \mathbf{d} year 1–10 average; \mathbf{e} and \mathbf{f} year 190–200 average. The plot illustrates the initial thermocline response, with a cold anomaly in the central and eastern

Pacific due to the shoaling of the thermocline caused by the westward shift of easterly winds, followed by the gradual warming of subsurface waters. Left: the T31 model. Right: the f19 model. Ensemblemeans are used

the linearized computations confirm the importance of the dynamical factors driving the OT response. Off the equator, especially in the southeasterly trade wind belt, winds strengthen and latent heat loss increases, which coincides with the cooling in this region (Fig. 2a, e). Altogether these three factors indicate the importance of the wind-evaporation-SST feedback (WES, e.g. Xie et al. 1994) in shaping the spatial pattern of the system response. Consistent with a stronger ocean thermostat the f19 model shows a stronger latent heat response compared to the T31 model.

While the fast response's main feature is cooling or/and suppressed warming across the equatorial Pacific and in the trade wind belts, the slow response, starting to emerge after 20–50 years, is characterized by enhanced equatorial Pacific warming evident in both models (Fig. 2). For the T31 model, this warming anomaly appears strictly in the eastern part of the basin, while the f19 model exhibits a narrower tropical warming extending to the central Pacific with a less pronounced east—west gradient (Fig. 2). We can account for

these differences and, more generally, for the transition from the fast to slow response by the effects of the oceanic tunnel, and the off-equatorial evaporative cooling patterns and wind changes, discussed in the next sections.

3.4 The role of wind-evaporation-SST and meridional wind convergence feedbacks in the slow response

For the slow response, it is important that the ability of the ocean surface to balance the CO₂-induced increase in the downward radiation flux with upward latent heat fluxes is most effective in areas that have strong mean state winds and relatively warm SSTs, i.e. in the trade wind belts off the equator (i.e. Seager and Murtugudde 1997). This enhanced cooling by evaporation may in turn affect the SST gradient towards other areas of the ocean, for example towards and along the equator, where weaker winds and/or colder temperatures means that evaporative cooling is less effective.



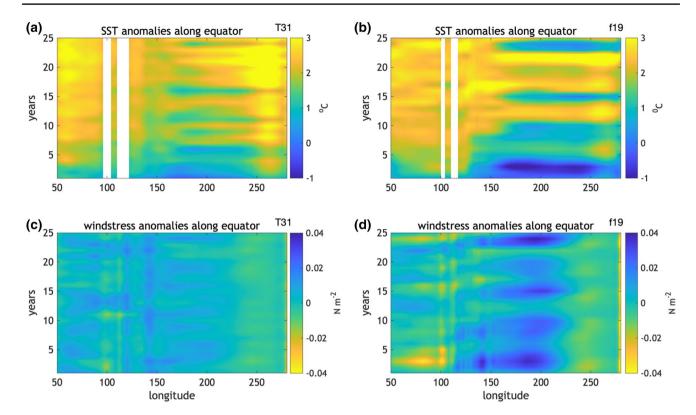


Fig. 7 Hovmöller diagrams showing the annual-mean changes in **a**, **b** SST and **c**, **d** zonal wind stress relative to the control experiment along equator averaged from 5° S to 5° N for the first 25 years of abrupt $4 \times CO_2$ experiments. 3 ensemble members for each model are used. Note the initial strengthening of the Walker circulation as part

of the thermostat response especially pronounced in the f19 model. This strengthening is consistent with a stronger Bjerknes feedback operating in f19 as the anomalous zonal SST gradient between the Indo-Pacific warm pool and the central/eastern equatorial Pacific codevelops with strong easterly wind stress anomalies

After 200 years, as the system has moved towards equilibrium, the two models still exhibit stronger southeasterly and northeasterly winds in the eastern and central Pacific between 5 and 10° N/S, and enhanced latent heat loss on both sides of equator (Fig. 8g, h) accompanied by reduced warming. This enhanced latent heat loss off the equator is well reproduced by the linearized approach (Fig. 8c, d). These results confirm that the WES feedback is a robust feature of the Pacific warming pattern, and is stronger in the f19 model.

Following the same argument as in Sect. 3.3, the model difference can in part be explained by comparing the mean state surface winds and latent heat fluxes between the two models (Fig. 8a, b): the f19 model's cold tongue is narrower in meridional extent, and mean latent heat fluxes and winds are stronger just off-equator, especially in the northern hemisphere, compared to the T31 model. While the slow response somewhat differs from the linearized prediction based on mean state fields, which is expected, given that surface winds may change significantly after 200 years, the strength of the off-equatorial latent heat response in the eastern Pacific in the models can still be traced to their mean winds: stronger mean winds in the f19-model generate a

stronger latent heat response, which in turn sets up a stronger SST gradient in the direction of the southeasterly and north-easterly winds.

In addition, the anomalous meridional wind convergence towards the equator in the eastern and central Pacific (Fig. 8g, h) appears to help shape the eastern equatorial warming pattern via a positive feedback. These anomalous winds cool the off-equatorial regions but warm the cold tongue by increasing relative humidity there, and hence reducing evaporative cooling (Seager et al. 2019), which strengthens the meridional SST gradient on both sides of the equator, further strengthening the meridional wind convergence (Fig. 9).

3.5 Transition from the fast to slow response and the role of the ocean tunnel

The gradual warming of the tropical Pacific upper ocean leads to the dissipation of central Pacific cooling anomalies, which weakens the effectiveness of the ocean thermostat, so that after 25–50 years the Walker circulation returns to its initial strength (Fig. 1a, b). Over this timeframe, as the extra-tropical ocean warms, the subtropical cells (STCs)



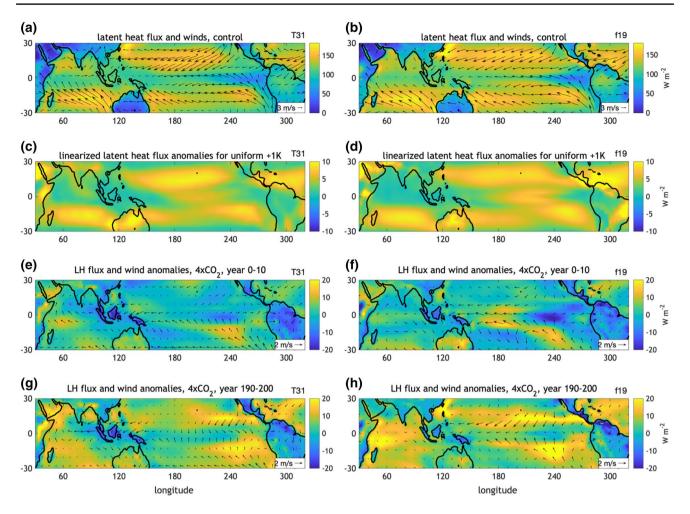


Fig. 8 a, b Mean latent heat (LH) fluxes (colors, in W/m²) and surface winds (arrows, in m/s) in the control experiments. **c**, **d** Predicted linearized latent heat flux anomalies induced by a 1 K surface warming as computed from the mean state winds, SST and relative humidity (see main text). **e-h** Anomalies in surface latent heat flux (colors, in W/m²) and surface wind (arrows)in the fully coupled 4 × CO₂ experiments in the two models initially (years 1–10) and after

190 years (years 190–200). Left: the T31 model. Right: the f19 model. Note the strengthening of the trade winds off the equator during the fast response, especially in the southeasterly trade wind belt, indicative of the wind-evaporation-SST (WES) feedback. Also note the anomalous meridional wind convergence that develops as part of the slow response (c.f. Fig. 9)

start bringing this warmer water to the equatorial region, which increases the temperature of the upwelled water. As reflected in the zonal SST gradient, the Walker circulation continues weakening on longer timescales as well. From an ocean dynamics perspective, the magnitude and timescales of this subsequent transition towards equilibrium are determined by two processes: the weakening of the STCs that reduces the supply of cold water to the equatorial region and the enhanced warming of extra-tropical waters relative to the tropics that further increases the temperature of the upwelled water.

The T31 model exhibits an overall weakening of the of STCs in both hemispheres (see Fig. 10 for $2 \times CO_2$ and $4 \times CO_2$). The f19 model, however, shows more complicated changes with a narrowing of the STCs in both hemispheres, a weakening at the equator but a strengthening off-equator.

This strengthening can, again, be related to the strengthening of winds on both sides of the equator described in Sect. 3.4.

Given nonuniform changes in STCs, to demonstrate the effect of STC slowdown in the equatorial band, we calculate changes in vertical velocity averaged below the mixed layer down to a 500 m depth, between 5° S and 5° N, and from the western (150° E) to the eastern (280° E) Pacific. By considering this broad average, we can track the slowdown of the large-scale STCs, which transport colder water from extra-tropical source regions, as opposed to the smaller tropical cells that primarily re-circulate water within the equatorial band (i.e. Brown et al. 2007). We see that in both models there is a slowdown of net vertical transport associated with STCs during the first decades of the experiments (Fig. 11), which lasts throughout the 400-year simulation. The almost immediate STC slowdown in



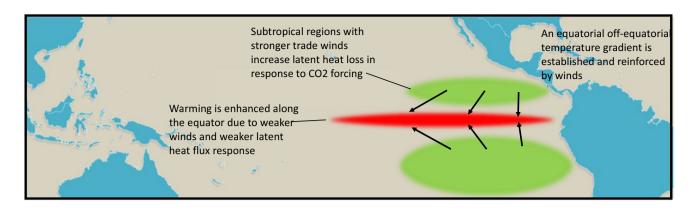


Fig. 9 A schematic of the positive meridional-wind convergence feedback linking off-equatorial and equatorial SST anomalies, which helps shape the warming pattern in the eastern equatorial Pacific. Initially, the subtropical regions with stronger winds (green areas) balance more CO₂-induced radiative forcing via latent heat fluxes than the equatorial region, which has generally weaker winds and

colder SST (red area). This sets up a differential warming pattern in response to CO_2 -forcing where the equatorial region warms more than the subtropics. The meridional temperature gradient is in turn reinforced by the anomalous meridional wind convergence (arrows), which leads to a stronger latent heat loss off the equator but weaker along the equator

T31 is probably contributes to the quicker demise of the ocean thermostat in this model. The computed differences in the vertical velocity between the models are consistent with Fig. 10, showing that the STC slowdown is more drastic in the T31 model, as the changes in the f19 model are partially compensated by the strengthening of trade winds as part of the WES feedback.

To trace the effect of extra-tropical warming on the equatorial dynamics, we calculate changes in stratification between the mixed layer (0–50 m) and the upper ocean below the mixed layer, defined as 50-500 m, which covers the vertical extent of the subtropical cells in the equatorial band (Fig. 10). Figure 12 shows the changes in stratification with time. Initially, the equatorial stratification increases as the mixed layer warms faster than the deeper layers of the ocean. After 200 years, this increase is greatly reduced as the STCs brings warmer water from the extra-tropics to equator, and after 350 years, the ocean stratification finally weakens relative to the control state as the extra-tropics warm more than the tropical regions. The stratification changes are greater in the high CO_2 scenarios and small in the 2 \times CO₂ experiment. Furthermore, the subsurface ocean warms faster and to a larger degree in the T31 model as compared to the f19 model.

The warming of extra-tropical waters relatively to the equatorial band can be also measured by changes in the meridional upper-ocean temperature gradient (Fig. 13). We observe that in both models this temperature gradient generally reduces during the slow response, except in the $2 \times CO_2$ experiment, meaning that the extra-tropical oceans are gradually warming more than the equator in these experiments. This factor, due to the effect of the oceanic tunnel, should lead to a reduced zonal-upper ocean gradient (Burls

and Fedorov 2014; Fedorov et al. 2015). From Fig. 13 we indeed see that a linear positive relationship between the zonal and meridional temperature gradients develops after about 50-100 years. However, despite the fact that both models have a reduction in the meridional temperature gradient with CO_2 forcing, the slope of the linear relationship between the meridional and zonal temperature gradients is much steeper for the T31 model than for the f19 model (Fig. 13). Higher rates of STC slowdown in T31 can account for this difference.

4 Discussion

The results of our analysis comparing the responses of two models to abrupt CO₂ forcing show that in both cases, the coupled ocean-atmosphere system undergoes a fast transient adjustment in the first decades of the simulation, followed by a slow adjustment that eventually allows the system to reach equilibrium. The fast response is ocean thermostat-like (OT), while the slow response leads to the establishment of the eastern equatorial Pacific (EP) pattern with a weaker Walker circulation. However, the T31 model displays only a weak ocean thermostat but a strong EP warming. In contrast, the f19 model shows a strong OT but a very weak eventual reduction in the zonal SST gradient and the Walker cellthose changes are particularly small in the $2 \times CO_2$ experiment. The OT-type response is clearly evident in the abrupt CO₂-forcing experiments, but it also appears as a robust feature of the experiments with a ramped CO₂ increase. In the gradual forcing experiments the OT response, while slower to emerge, can persist longer, up to 100 years.



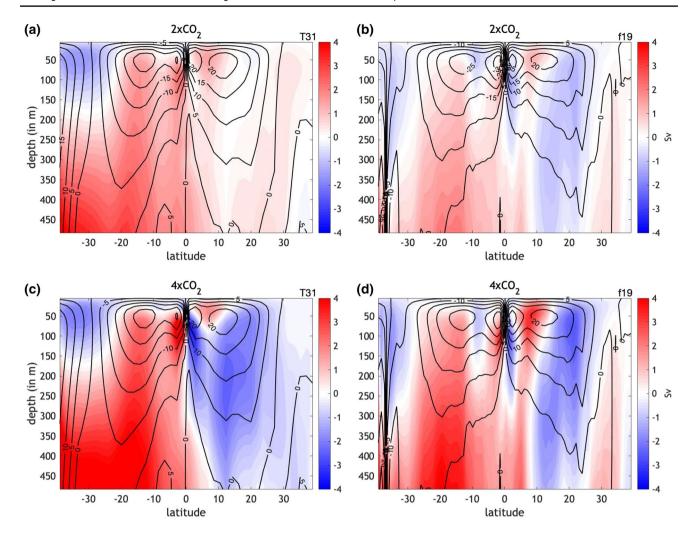


Fig. 10 Anomalies (colors) and control mean values (contours) of the stream function (in units of Sv) in the Indo-Pacific for each $\rm CO_2$ experiment. Left: the T31 model; right: the f19 model. A time average across 400 years is used. The T31 plots show a substantial weakening of the upper 300 m meridional overturning within the northern subtropical cells (STC) while the southern cell becomes slightly

stronger. The f19 plots show a strengthening but narrowing of the northern hemisphere STC with stronger circulation between 0° and 15° N. The results from the T31 model also appear in Heede et al. (2020). Temporal changes in the STCs are further highlighted in Fig. 11

During the fast response, differences in evaporative cooling within the trade wind belts appear to play a key role in the spatial patterns and temporal evolution of changes to the Walker circulation and the zonal SST gradient. The f19 models exhibits a strong increase in wind and latent heat fluxes in the trade wind belts and the central equatorial Pacific, which is linked to stronger climatological winds and wind convergence in the central and western Pacific, driving a strong ocean thermostat type response along the equatorial Pacific. The climatological winds are weaker in the T31, and so is the ocean thermostat response. Even though the OT response is eventually replaced by the EP warming on the equator, a strong signature of enhanced evaporative cooling over the regions of southeasterly and northeasterly trade winds persist off the equator, in particular in the f19 model.

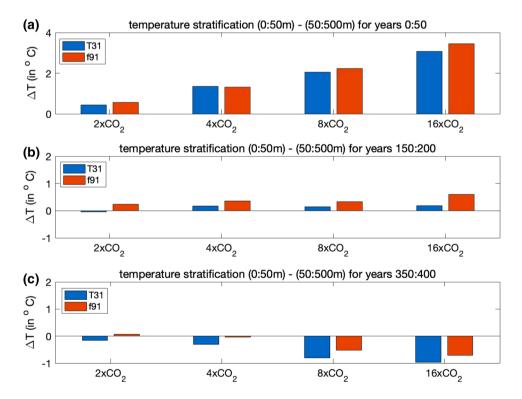
Another key difference between the two models that sets the strength of the ocean thermostat is related to the profile of upper-ocean stratification. As initial wind changes force the thermocline to shift westward and shoal in the central and eastern equatorial Pacific, the resultant effect on the equatorial SST depends on the magnitude of upper-ocean temperature anomalies associated with this thermocline displacement, which in turn depends on ocean background stratification. A stronger stratification means a higher SST sensitivity to thermocline displacement. As such, a more strongly stratified thermocline in the f19 model explains a higher SST sensitivity to thermocline displacement, a stronger Bjerknes feedback in response to wind changes, and hence a stronger ocean thermostat response.



Fig. 11 Changes in the vertical velocity averaged over the equatorial band in the Pacific Ocean below the mixed layer for a years 0-50, b years 150-200, c years 350:400 in each of the abrupt CO2 increase scenarios. Blue is the T31 model and red is the f19 model. Velocity is averaged between 50 and 300 m, west to east 150° to 280° E, and between 5° S to 5° N. This broad averaging allows tracking the slowdown of the STCs. Ensemble means are used. Changes are relative to the control experiment. Note the weakening of STCs that starts in the first decades of the perturbation experiments but becomes progressively stronger later on. The weakening is greater for the T31 model

(a) $_{1} \times 10^{-5}$ equatorial vertical velocity anomalies 50:300 m, years 0:50 T31 -2 f91 -3 4xCO₂ 8xCO 16xCO₂ 2xCO2 **(b)** $_{1} \times 10^{-5}$ equatorial vertical velocity anomalies 50:300 m, years 150:200 T31 f91 2xCO₂ 4xCO₂ 8xCO₂ 16xCO₂ (c) $_{1} \times 10^{-5}$ equatorial vertical velocity anomalies 50:300 m, years 350:400 cm/s T31 -2 2xCO₂ 4xCO₂ 16xCO₂ 8xCO₂

Fig. 12 As in Fig. 11 but for changes in the mean upperocean temperature stratification. The temperature stratification is defined here as the difference between the mixed layer (0-50 m) and the upper ocean below the mixed layer (50-500 m), averaged west to east 150°-280° E, and between 5° S and 5° N. This definition allows integrating over local changes in stratification due to wind-induced changes in the thermocline slope (see Fig. 6). Note the strong initial increase in stratification followed by a gradual reduction indicative of the ocean tunnel effect



The timescales at which the stronger equatorial winds and OT response subside, giving way to the EP warming, appear to depend critically on the magnitude and the timing of the net slowdown of the STCs and the warming of waters subducted in the extra-tropics and then upwelled at the equator. The arrival of this warmer (but still relatively cold) water gradually reduces the initial increase in vertical stratification along the equator that occurs in the



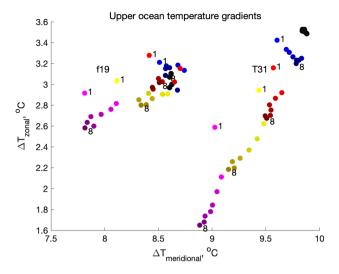


Fig. 13 The zonal temperature gradient plotted against the meridional temperature gradient in the Pacific upper-ocean (in °C) for the two models. Mean values over the upper 50 m are shown. Dots represent 50-year averages from each simulation: color darkness represents progression in time. The first 50 years are denoted with 1 and the last 50 years (350-400 years) are denoted with 8. Each CO₂ scenario is plotted in a different color, consistent with Fig. 1. Black=control simulation, blue = $2 \times CO_2$ red/brown = $4 \times CO_2$, yellow = $8 \times CO_2$, pink/purple = $16 \times CO_2$. The temperature gradients are defined in the methods section. The two big clusters of dots correspond to the two models considered. The results for the T31 model first appeared in Heede et al. (2020). That the data within each cluster eventually fall onto one line connecting the meridional and zonal temperature gradients confirms the importance of the ocean tunnel for the quasi-equilibrium response (Fedorov et al. 2015), especially for the T31 model and higher magnitudes of CO₂

first decades after the forcing was imposed, while the STC slowdown reduces the amount of cold water feeding the equatorial upwelling.

On longer timescales, as the system approaches the equilibrium, the enhanced warming of the extra-tropics relative to the equatorial belt, and the corresponding reduction of the meridional temperature gradient between the equator and the extra-tropics, together with the continuing slowdown of the STCs, may further contribute to the strength of the EP pattern, especially in T31 model. These results highlight the fundamental relationship between equatorial and offequatorial ocean dynamics, as suggested by previous studies (McCreary and Lu 1994; Gu and Philander 1997; Seager and Murtugudde 1997; Liu and Huang 1997; and more recently Burls and Fedorov 2014; Fedorov et al. 2015) arguing that the mean east-west tropical temperature gradient should be tightly related to the tropical extra-tropical gradient (e.g. Fedorov et al. 2015). However, our results show that relationship between extra-tropical warming and tropical zonal SST gradients is not universal across the models because changes in the strength and structure of STCs also may play an important role, setting a different slope of the relationship between the zonal and meridional gradient.

A related important point is that changes in oceanic and atmospheric circulation patterns cannot be simply classified as weakening or strengthening, but they may also change spatially. For example, in both models the Walker circulation exhibits a characteristic westward shift, and the STCs can exhibit an equatorward narrowing, in particular in the f19 model, which may in turn change the make-up of the source waters upwelled at equator (Zeller et al. 2020). Thus, both the magnitude of changes and changes in the spatial structure should be considered when analyzing the tropical-extra-tropical connection with regard to the tropical Pacific response to warming.

In the context of mechanisms responsible for weakening of the Walker cell, it is also important to keep in mind that the effects of local atmospheric processes such as evaporative damping, cloud feedbacks and thermodynamic constraints on atmospheric circulation (e.g. Erfani and Burls 2019; Merlis and Schneider 2011; Vecchi and Soden 2007) can be superimposed on the ocean thermostat and oceanic tunnel mechanisms discussed here. For example, Heede et al. (2020) investigated the slowdown of the ascending branch of the Walker cell in the T31 model and found that pressure velocity (omega) in the mid-troposphere decreased over the Pacific warm pool at a rate of 5-6% per degree of warming, yet it increased over the Maritime continent, contributing to a westward shift rather than a slowdown of the Walker cell. A further comparison between slab-ocean and fully coupled simulations revealed a much more pronounced reduction in the zonal SST gradient in the fully coupled simulations, confirming the important role of the dynamical ocean and ocean-atmosphere interactions in setting the magnitude of the Walker cell weakening as part of the system's slow response.

It is noteworthy that while we are comparing two models within the same CESM family, several major characteristics of how these models respond to radiative forcing are also found among a much broader model selection in the CMIP archives. Specifically, an analysis of abrupt $4 \times CO_2$ experiments in CMIP6 shows that a large majority of the models exhibit similar fast and slow responses in the zonal SST gradient, albeit with a large spread (Heede and Fedorov 2021, [in review, pre-print available]). Likewise, for the CMIP5 data, DiNezio et al. (2012) documented a time mean change in the upper-ocean temperature profile after CO₂ doubling, which resembles the patterns observed in these two models. This suggests that the strengthening of zonal winds in the central or western equatorial Pacific, leading to the westward shift of the thermocline structure, is a common response in GCMs.

Furthermore, the lack of, or suppressed warming over the Pacific trade wind belts is a feature observed in other



models as well, albeit to varying degrees. While virtually all models show a clear lack of warming in the subtropics of the southern hemisphere stretching from the coast of South America towards the equator, the models are much more uncertain in the Pacific trends in the northern hemisphere (Ceppi et al. 2018; Ying et al. 2016; Zheng et al. 2016). This indicates that another potential source of uncertainty and large model spread of the projections for the mean zonal SST gradients in the Pacific is related to the strength and position of winds in the northern hemisphere, and the associated response of latent heat fluxes in the subtropics.

Overall, the different responses between the two models in this study can be linked to their different mean states: T31 has a weaker stratified upper ocean and weaker winds compared to the f19 model, which appears to reduce the strength of the OT type response but increase the strength of the subsequent EP warming. This is an important point in the context of understanding why CMIP models are unable to capture recent decadal trends in the region, given that the mean CMIP model wind stress along the equator is underestimated at peak strength in the central Pacific but overestimated in the western Pacific compared to the observations (Bellenger et al. 2014; Lee et al. 2013) thus possibly more prone to a diffuse ocean thermostat response, analogous to the T31 model. This potential key link between the wind stress/cold tongue biases and the inability of models to capture the recent trends should be a point for further investigation. Likewise, which model parameters are responsible for mean state differences, such as the model resolution, subgrid parameterizations, or the representation of clouds and convection, is an important question for future studies.

Our additional ramp experiments, where CO_2 rises linearly at a rate in the range of projected future scenarios, show the same type of the transient ocean-thermostat and the subsequent EP warming/weaker Walker regimes as the abrupt experiments, though the OT response is more muted but longer lasting in the ramp experiments. This similarity between the abrupt and gradual CO_2 experiments brings further confidence to the possibility that the transient ocean thermostat type response may be playing an important role in shaping the ongoing changes in the tropical Pacific.

In summary, this paper illustrates the key differences between the fast and slow tropical Pacific responses to CO_2 forcing and how these differences are related to the relative strength of the ocean thermostat mechanism versus the ocean tunnel and other mechanisms that cause eastern equatorial Pacific warming. The ocean thermostat mechanism is understood as involving the entire tropical Indian Ocean in addition to the Pacific as well as the regions of the Pacific southeasterly and northeasterly trade wind belts. The oceanic tunnel mechanism includes both the weakening of the subtropical cells (STCs) and the warming of water subducted

and transported by these cells to the equator. The balance of these mechanisms is intimately linked to the subtropical warming patterns and atmospheric and oceanic circulation changes, which vary between the models. Whether the failure of GCMs to capture the recently observed trend of stronger easterly winds in the Pacific is connected to an inaccurate representation of the CO₂-induced ocean thermostattype response will be investigated in the future studies.

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Availability of data and material The datasets generated during and/or analysed during the current study are available from the corresponding author on reasonable request.

Code availability The code files used to generate figures for this study are available from the corresponding author on reasonable request.

Declarations

Conflict of interest The authors declare no competing interests.

Ethics approval N/A.

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