

# Circus tents, convective thresholds and the non-linear climate response to tropical SSTs

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## Key Points:

- Contrary to assumptions made in previous work, we find that the climate response to tropical SSTs is highly non-linear.
- These non-linearities are most stark in the Central Pacific, and manifest even for very small perturbation magnitudes.
- Non-linearity is a fundamental consequence of tropical dynamics, with important implications for prior work using linear Green's functions.

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## Abstract

Using model simulations, we demonstrate that the climate response to localized tropical sea surface temperature (SST) perturbations exhibits numerous non-linearities. Most pronounced is an asymmetry in the response to positive and negative SST perturbations. Additionally, we identify a ‘magnitude-dependence’ of response on the size of the SST perturbation. We then explain how these non-linearities arise as a robust consequence of convective quasi-equilibrium and weak (but non-zero) temperature gradients in the tropical free-troposphere, which we encapsulate in a ‘circus tent’ model of the tropical atmosphere. These results demonstrate that the climate response to SST perturbations is fundamentally non-linear, and highlight potential deficiencies in work which has assumed linearity in the response.

## Plain Language Summary

Previous work has highlighted that Earth’s energy balance is sensitive to the precise distribution of sea-surface temperatures (SSTs), particularly in the tropical Pacific, with important implications for inferring climate sensitivity from the historical record. To quantify this ‘SST pattern effect’, many studies have adopted a linear framework where the climate response to an SST anomaly is assumed to be a linear function of the sign and size of the anomaly. Here, we show that this assumption is not applicable in many parts of the tropics, particularly the Central Pacific. We classify these non-linearities into two classes and explain why they arise in terms of simple tropical dynamics. To summarize our findings we use a conceptual model of the tropical atmosphere which we term the ‘circus tent’ model, which represents the dynamics behind these non-linearities in an intuitive way. Our work suggests that previous work which has assumed linearity in the climate response to tropical SSTs may be suffering from compensating biases in their response.

## 1 Introduction

The spatial pattern of tropical sea-surface temperatures (SSTs) exerts a strong influence on Earth’s climate, particularly on the radiative fluxes at the top-of-atmosphere (TOA). First recognized in the context of the El Niño–Southern Oscillation (ENSO) (Bjerknes, 1969; Trenberth et al., 2002; Park & Leovy, 2004), in recent years, this dependence of TOA fluxes on the spatial pattern of SST changes has been re-framed into the broader concept of the ‘SST pattern effect’ (Stevens et al., 2016). The SST pattern effect has received considerable attention within the community due to its implications for reconciling the anomalously low climate sensitivity inferred from historical energy budget constraints (Otto et al., 2013; Knutti et al., 2017) with the climate sensitivity calculated by equilibrating climate models (Rugenstein et al., 2020; Andrews et al., 2018).

Both modelling (Andrews & Webb, 2018; Zhou et al., 2016; Dong et al., 2019) and observational (Mackie et al., 2021; Fueglistaler, 2019) studies have suggested that the primary mechanism mediating the SST pattern effect is its influence on low clouds in regions of climatological subsidence, and such explanations typically proceed as follows:

- Regions with a high climatological low-cloud amount are generally associated with cold SSTs and a strong inversion (Wood & Bretherton, 2006), thus when SSTs in these regions are warmed the inversion weakens and there is a decrease in low-level cloudiness. This leads to a positive shortwave TOA ( $SW_{TOA}$ ) anomaly through reduced low-level reflection of incoming solar radiation. The reverse-argument also holds, namely that isolated cooling in these regions strengthens the inversion and increases low-level cloudiness. We term this the ‘local stability-inversion’ mechanism.

- On the other hand, warming in regions of deep convection is communicated vertically throughout the free-troposphere by deep convection (Y. Zhang & Fueglistaler, 2020) and then horizontally across the tropics through the action of gravity waves (Charney, 1963; Neelin & Held, 1987; Bretherton & Smolarkiewicz, 1989; Pierrehumbert, 1995). This causes a remote warming of the free-troposphere over the aforementioned low-cloud regions which again strengthens the inversion and increases the low-cloud amount. We term this the ‘non-local stability-inversion’ mechanism.

This explanation has gained significant traction in explaining the SST pattern effect, to the point of appearing in the latest IPCC report (Forster et al., 2021), and is qualitatively supported by analysis of coupled climate model experiments (Ceppi & Gregory, 2017). To put the SST pattern effect on a more quantitative footing some studies have framed the problem in terms of Green’s functions (Li & Forest, 2014; Zhou et al., 2017; Dong et al., 2019; Baker et al., 2019) by assuming there exists some operator,  $\mathcal{G}$ , which maps the spatial pattern of SST anomalies onto TOA anomalies. In this framework,  $\mathcal{G}$  can be estimated using ensembles of isolated ‘SST patch’ experiments in an atmosphere only model and then used to reconstruct the TOA response to arbitrary SST patterns. Although this is an appealing concept, a potential issue is that the Green’s function approach is fundamentally linear (Riley et al., 1999) and requires assuming that the TOA response is linear with respect to the sign and magnitude of the imposed SST anomaly, and also that SST anomalies in different regions *combine* linearly. Previous studies have made these assumptions (Barsugli & Sardeshmukh, 2002; Li & Forest, 2014; Zhou et al., 2017; Baker et al., 2019; Dong et al., 2019), but given the well-appreciated ‘threshold’ behaviour of deep convection (C. Zhang, 1993; Emanuel, 2007; Johnson & Xie, 2010; Xie et al., 2010; I. N. Williams & Pierrehumbert, 2017; Y. Zhang & Fueglistaler, 2020) (see Section 2), along with the observed asymmetry in the atmospheric response to positive and negative ENSO phases (Hoerling et al., 1997, 2001; Johnson & Kosaka, 2016), it seems likely that the linear assumption is not valid.

As such, our goal in this paper is to evaluate the linear assumptions made by previous studies, and to explain why non-linearities arise from the perspective of basic tropical dynamics. We begin by reviewing the theoretical basis for the ‘threshold’ behaviour of deep convection, and then use atmosphere-only model experiments to show that the TOA response to isolated SST anomalies is in fact non-linear. To explain these findings we then introduce a simple conceptual picture of the tropical atmosphere’s response to SST perturbations, which we term the ‘circus tent’ model, which builds on previous work in the tropical dynamics community. Finally, we show that in regions of deep convection the change in TOA flux associated with a positive SST anomaly can be explained simply by the change in low-level moist static energy and examine to what extent these changes are predictable purely from the SST changes.

## 2 Theory

To link the dynamics of deep convection to the free-tropospheric temperature profile, we will frequently make use of the moist static energy in this paper, defined as:

$$h = c_p T + L_v q + gz, \quad (1)$$

where  $c_p$  is the heat capacity of dry air,  $T$  is temperature,  $g$  is gravitational acceleration,  $z$  is height,  $L_v$  is the latent heat of vaporization of water, and  $q$  is the water vapour specific humidity. The moist static energy is useful as it is approximately conserved under moist, adiabatic motion.

A central pillar of our understanding of the tropical atmosphere is the assumption of convective quasi-equilibrium (Betts, 1982; Raymond, 1995; Emanuel, 2007), which holds

that deep convection relaxes the free-tropospheric temperature profile to a moist adiabat set by the properties of the subcloud layer. As a moist adiabat is associated with constant saturated moist static energy, this is another way of saying that in regions of deep convection the saturated moist static energy (that is, Eq. 1 but with  $q$  replaced by its value at saturation,  $q^*$ ) of the free-troposphere,  $h_{\text{FT}}^*$ , should approximately equal the moist static energy of the subcloud layer,  $h_0$ .

As mentioned before, gravity waves are efficient at communicating this local temperature profile imposed by convection (or equivalently,  $h^*$  profile) across the tropics. This means that deep convection in one region can communicate high values of  $h_{\text{FT}}^*$  across the local free-troposphere, establishing a ‘convective threshold’ which inhibit the formation of deep convection if the subcloud  $h_0$  is not sufficient in these regions to overcome the imposed  $h_{\text{FT}}^*$ .

Using this observation, we follow previous work (e.g., I. N. Williams and Pierre-humbert (2017)) in defining a ‘convective instability index’,  $h_0 - h_{500}^*$ , (taking the 500hPa level to be representative of the free-troposphere). In regions unstable to deep convection, we expect this quantity to be positive, whereas in regions stable against deep convection (e.g., subsiding regions) we expect this to be negative and to act as a measure of the inversion strength (similar to Wood and Bretherton (2006), but also accounting for moisture differences as in Koshiro et al. (2022)).

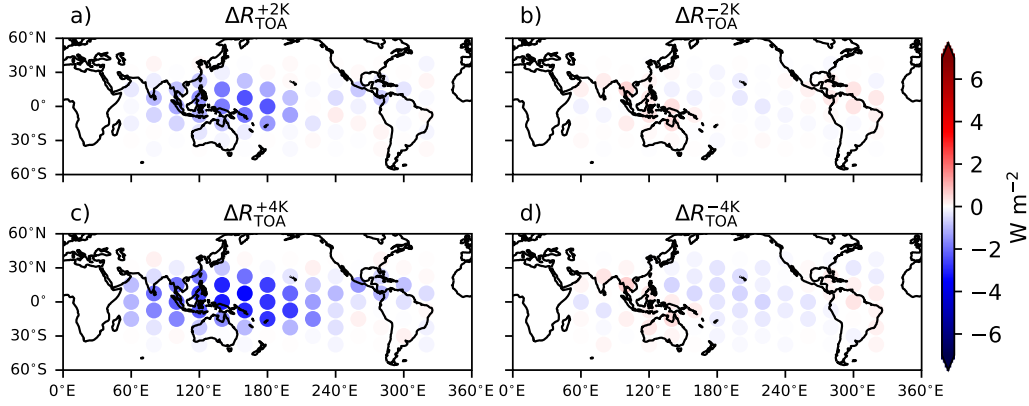
A further simplifying assumption which is frequently made assumption is that  $h_{500}^*$  is uniform across the free-troposphere (the ‘weak temperature gradient’ assumption, WTG), which allows one to replace  $h_{500}^*$  with its tropical average value (establishing a single value for the convective threshold). However, as we will show later, this assumption is misleading in the context of the pattern effect, where changes in  $h_{500}^*$  are comparable to the variations in baseline  $h_{500}^*$  arising from non-zero zonal temperature gradients (Fueglistaler et al., 2009; Bao & Stevens, 2021; Bao et al., 2022). This means that there are actually a spectrum of values for the convective threshold, depending on the local value of  $h_{500}^*$ , and to fully understand the pattern effect we cannot assume a single value for  $h_{500}^*$ .

### 3 Methods

We performed a series of atmosphere-only simulations using the ICON (ICOSahedral Non-hydrostatic) general circulation model. The model is run on a triangular grid, at R<sub>2</sub>B<sub>4</sub> specification, corresponding to an approximately uniform grid-spacing of 160km on a Cartesian grid. The model uses a terrain-following vertical sigma-height grid with 47 levels between the surface and the model top at 83km. Radiation is parameterized using PSrad scheme (Pincus & Stevens, 2013), and other parameterizations include a bulk mass-flux convection scheme (Tiedtke, 1989), a relative-humidity based cloud cover scheme (Sundqvist et al., 1989) and a single-moment microphysics scheme (Baldauf et al., 2011). In our experiments all greenhouse gases and ozone are fixed at their 1979 levels (A. I. L. Williams et al., 2022).

The control simulation was run for 20 years with a prescribed monthly climatology of SSTs and sea-ice concentrations derived from the Atmospheric Model Intercomparison Project (AMIP) (Neale & Hoskins, 2000) boundary conditions over 1979–2016. Then additional simulations were conducted for 10 years each with an additional ‘cosine patch’ SST perturbation (following Barsugli and Sardeshmukh (2002)) covering different locations throughout the tropics (locations indicated in Fig. 1). For all simulations, we discard the first year as spin-up and conduct analysis using time-averages over the rest of the simulation period.

The subcloud moist static energy ( $h_0$ ) was calculated using values at the lowest model level, and the saturated free-tropospheric moist static energy was approximated by its value at 500hPa ( $h_{500}^*$ ). Our conclusions are insensitive to the precise choice of levels,



**Figure 1.** Change in global-mean TOA flux ( $\Delta R_{\text{TOA}}$ ) associated with each of the SST perturbation experiments. a) Changes for +2K patches. b) Changes for -2K patches. c,d) as in a,b) but for 4K.

and similar results were obtained when either calculating the subcloud moist static energy as the average moist static energy over the lowest 1km (lowest 5 model levels) or calculating the saturated free-tropospheric moist static energy as a bulk average over 700hPa-300hPa. Also note that because  $h_0$  is defined at a given height level, changes in  $h_0$  are only due to changes in temperature and humidity at that level.

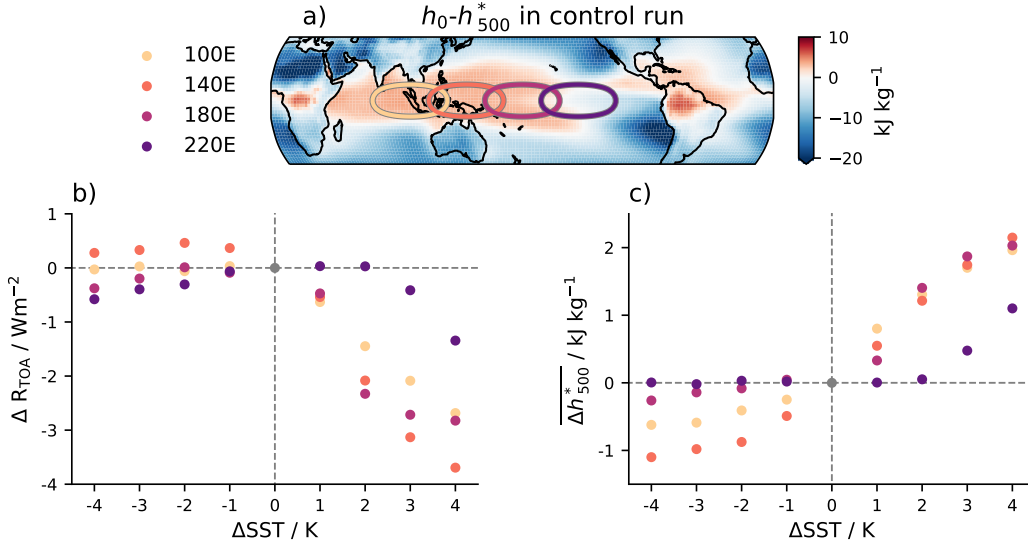
We also define two averaging operators which make the presentation clearer. An overbar  $\langle \cdot \rangle$  indicates an average over tropical latitudes ( $\pm 30^\circ$ ), and angle brackets  $\langle \langle \cdot \rangle \rangle$  indicates a ‘patch-average’ over the region covered by the SST patch perturbation in that experiment (i.e., where  $|\Delta \text{SST}| > 0$ ). For sub-cloud changes, the patch-averages exclude land grid-points, and all spatial averages include area-weighting. For example,  $\langle \Delta h_0 \rangle$  is the change in low-level moist static energy in a particular patch experiment, over all ocean grid-points where  $|\Delta \text{SST}| > 0$ . Similarly,  $\langle \Delta h_{500}^* \rangle$  is the change in saturated free-tropospheric moist static energy at 500hPa, over all grid-points where the underlying  $|\Delta \text{SST}| > 0$  (irrespective of land or ocean).

## 4 Results

### 4.1 Non-linearities in the TOA response to tropics SSTs

In Fig. 1 we plot the globally-averaged change in net radiation at the top of the atmosphere ( $\Delta R_{\text{TOA}}$ ) for each of the tropical SST perturbation experiments, relative to the control. In agreement with previous work Fig. 1a,c show that warming in the Western tropical Pacific (a region of climatological deep convection), is associated with strong negative changes in the global-mean  $R_{\text{TOA}}$  flux via the ‘non-local stability-inversion’ mechanism<sup>1</sup>. Additionally, in subsiding regions the  $\Delta R_{\text{TOA}}$  is slightly positive for the +2K and +4K patches, indicating the ‘local stability-inversion’ mechanism is at work. However, if we compare these results to the cooling patch experiments in Fig.1b,d we can see there is a marked asymmetry in the  $\Delta R_{\text{TOA}}$  response between the warming and cool-

<sup>1</sup> Note that although stability changes over low-cloud regions influence the TOA primarily through SW changes, we use net TOA fluxes to minimize the influence of deep convective clouds, which show up strongly in both the SW and LW but tend to cancel in the net. The results are similar if we focus on the SW (Fig. S1).



**Figure 2.** a) Set-up for the equatorial sensitivity experiments, overlaid on top of the ‘convective instability’ parameter ( $h_0 - h_{500}^*$ ) in the control run. b) The changes in global-mean  $R_{TOA}$  for each of the sensitivity experiments at  $\pm 1K$ ,  $\pm 2K$ ,  $\pm 3K$ ,  $\pm 4K$ . c) as in b) but showing the change in tropical-average  $h_{500}^*$ , denoted  $\overline{\Delta h_{500}^*}$ . To account for the varying amounts of land in different patches, in panels b and c the  $\Delta R_{TOA}$  and  $\overline{\Delta h_{500}^*}$  have been divided by the  $\Delta SST$  weighted land-fraction before plotting.

ing experiments. Notably, whereas warming in convective regions generates a strong negative  $\Delta R_{TOA}$ , cooling in convective regions only yields a weakly positive  $\Delta R_{TOA}$  (Fig. 1b), which doesn’t increase with further cooling (Fig. 1d). The spatial patterns of  $\Delta R_{TOA}$  are presented in Fig. S2 for a representative patch in the West Pacific and confirm these findings.

Alongside this ‘asymmetry’ in the  $\Delta R_{TOA}$  between warming and cooling patches, there is also another, more subtle, non-linearity that appears in our experiments. To spot this, compare the  $\Delta R_{TOA}$  responses in the Central Pacific between the +2K experiments in Fig. 1a and +4K experiments in Fig. 1c. Although the  $\Delta R_{TOA}^{+4K}$  response is generally around twice the  $\Delta R_{TOA}^{+2K}$  response, in the weakly stable regions of the Central Pacific there are numerous experiments where the  $\Delta R_{TOA}$  either changes sign or becomes much more negative at +4K compared to +2K. We term this the ‘magnitude-dependence’ of the SST pattern effect, to convey that the strongly negative  $\Delta R_{TOA}$  only kicks in for  $\Delta SST$  above a certain magnitude in these moderately stable regions.

To dig into this more, we have performed additional simulations at  $\pm 1K$  and  $\pm 3K$  for a subset of four patches along the equatorial Pacific (Fig. 2a). As indicated by the shading in the background of Fig. 2a, these four patches cover distinct convective regimes (as  $h_0 - h_{500}^*$  is a measure of convective instability, see Theory). The patches at 100E and 140E are in strongly convective regions (where  $h_0 - h_{500}^* > 0$ ), whereas the patch at 220E is in a region which is stable to deep convection (where  $h_0 - h_{500}^* < 0$ ) and the patch at 180E is in a transition region. In Fig. 2b we have plotted the global-mean  $\Delta R_{TOA}$  for each of the four patches at  $\Delta SST = \pm 1K, \pm 2K, \pm 3K, \pm 4K$ . Again, the asymmetry in the TOA response between positive and negative perturbations is evident. Taking the 140E patch as an example, positive  $\Delta SST$  perturbations induce a negative  $\Delta R_{TOA}$  which scales quasi-linearly with the  $\Delta SST$  magnitude, but for negative  $\Delta SST$  the TOA



response quickly saturates. It is a similar story for the 100E patch, but the signal is weaker for negative  $\Delta\text{SST}$ , however if we subset the TOA response only over subsiding regions we recover the same behaviour (Fig. S3).

This asymmetry is also evident in how the  $\Delta\text{SST}$  perturbations impact on the saturated moist static energy of the free-troposphere,  $\overline{h_{500}^*}$  (Fig. 2c), which makes sense as a higher  $\overline{h_{500}^*}$  indicates a warmer and more stable free-troposphere which tends to increase the inversion over low-cloud regions. Looking again at the 140E patch confirms our suspicion that greater  $\overline{\Delta h_{500}^*}$  is associated with greater  $\Delta R_{\text{TOA}}$  for positive values of  $\Delta\text{SST}$ . Conversely, for negative  $\Delta\text{SST}$  there is an initial decrease in  $\overline{h_{500}^*}$ , which quickly saturates. For other ‘convective’ patch at 100E it is a similar story.

Previously we also noted a ‘magnitude dependence’ of  $\Delta R_{\text{TOA}}$  on the magnitude of positive  $\Delta\text{SST}$  changes in moderately stable regions (Fig. 1a,c) and this is again present in Fig. 2. Looking at the 220E patch results in Fig. 2b, we can see that the sharp decrease in  $R_{\text{TOA}}$  does not occur until  $\Delta\text{SST} \gtrsim 2\text{K}$ , whereas for the other patches the quasi-linear decrease occurs for all  $\Delta\text{SST} > 0\text{K}$ . A similar picture exists for the  $\overline{\Delta h_{500}^*}$ , which is unaffected until  $\Delta\text{SST} \gtrsim 2\text{K}$  for the 220E patch (Fig. 2c).

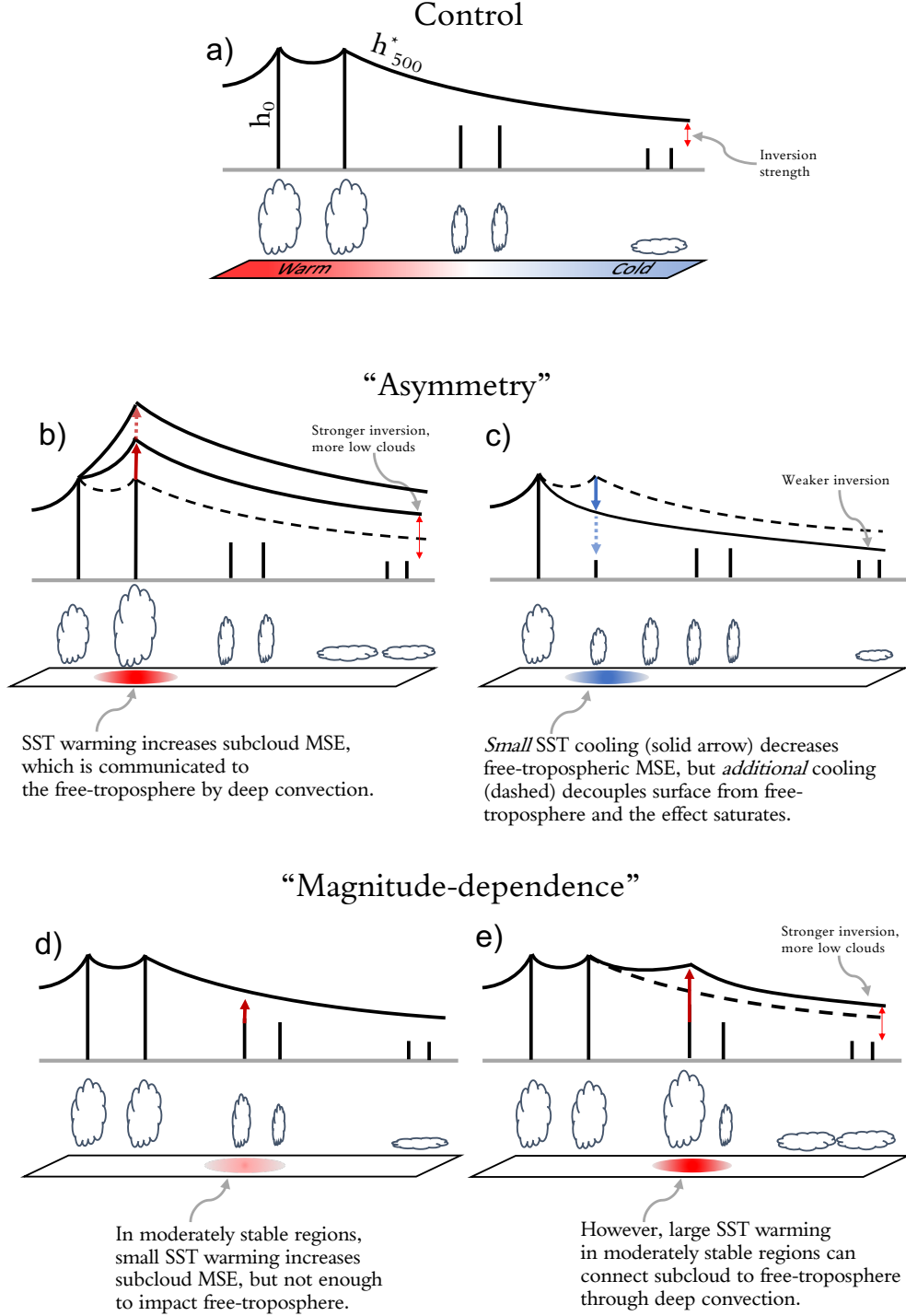
## 4.2 A conceptual for the non-linear response

To understand this behaviour, it is helpful to introduce a conceptual picture which builds on our earlier discussion of convective quasi-equilibrium and weak (but non-zero) temperature gradients in the free-troposphere. We call this the ‘circus tent’ model<sup>2</sup> and it is sketched in Fig. 3a. In this model, the temperature of the tropical free-troposphere (or equivalently, its  $h^*$ ) can be thought of as being a stiff fabric supported by ‘convective tent poles’ of different ‘heights’ corresponding to their subcloud  $h_0$ . Where there is deep convection, convective quasi-equilibrium ensures the height of the fabric ( $h_{500}^*$ ) is roughly equal to  $h_0$ , and as one moves away from the convective center the  $h_{500}^*$  profile relaxes somewhat until it comes under the influence of a different tent pole. The ‘stiffness’ of the fabric is related to the efficient homogenization of  $h^*$  anomalies by gravity waves, and the pattern of  $\Delta h_{500}^*$  appears to be related to the Matsuno-Gill response to tropical heating (e.g., Fig. 1 of Gill (1980)), with an equatorially-confined lobe extending to the East and two off-equatorial maxima slightly to the West of the heating. This pattern can be seen in our maps of  $\Delta h_{500}^*$  (Fig. S4).

Using this model we can now understand the impact of warming and cooling in convective regions we saw in Fig. 2. The case of positive  $\Delta\text{SST}$  in convective regions is sketched in Fig. 3b. In this case, because the region is already convecting, we are increasing the height of a tent pole which is already ‘in contact’ with the tent fabric, which raises the  $h_{500}^*$  throughout the free-troposphere, including over regions of low-clouds where it strengthens the inversion. Because the tent fabric is stiff, this also explains why the changes in  $h_{500}^*$  and  $R_{\text{TOA}}$  are approximately linear (Fig. 3b). On the other hand, Fig. 3c illustrates how for negative  $\Delta\text{SST}$  in convective regions the tent pole may be lowered sufficiently to lose contact with the fabric. At this point, further decreases in SST are not communicated to the free-troposphere, which explains the ‘saturation’ of  $\overline{\Delta h_{500}^*}$  and  $\Delta R_{\text{TOA}}$  at negative  $\Delta\text{SST}$  (Fig. 2b, Fig. S2, Fig. S5).

The circus tent model of the tropics is also useful for understanding the ‘magnitude dependence’ we have noted earlier, where even for positive  $\Delta\text{SST}$ , the relationship between  $\Delta\text{SST}$  and  $\overline{\Delta h_{500}^*}$  or  $\Delta R_{\text{TOA}}$  can be highly non-linear. This phenomena is most pronounced in moderately stable regions such as the Central Pacific, which correspond to the middle tent poles in Fig. 3a which are not quite tall enough to make contact with

<sup>2</sup> This conceptual model was originally suggested by Isaac Held in a 2011 blog post entitled ‘Atlantic Hurricanes and Differential Tropical Warming’.



**Figure 3.** Schematic representation of the processes controlling the non-linear TOA response to SST perturbations in different convective regimes. a) Illustrates the ‘circus tent’ model of the tropical atmosphere in the presence of an SST gradient, where deep convection occurs over the warmest SSTs with highest  $h_0$  and is able to perturb the free-tropospheric temperature structure (as measured by  $h_{500}^*$ ). b) and c) conceptually illustrate how a tropical circus tent responds ‘asymmetrically’ to warming and cooling in convective regions. d) and e) illustrate how a tropical circus tent responds non-linearly with respect to the magnitude of the SST perturbation in moderately stable regions.



the  $h_{500}^*$  fabric (i.e., they sit below the local convective threshold). In this situation, small SST warming raises the subcloud  $h_0$ , but may not raise it sufficiently to overcome the convective threshold and make contact with the tent fabric (Fig. 3d). For the SST warming to be able to substantially alter the  $\overline{\Delta h_{500}^*}$  or  $\Delta R_{\text{TOA}}$ , it must be strong enough to raise this tent pole (increase the  $h_0$ ) enough to make contact with and subsequently raise the height of the tent fabric, as in Fig. 3e. When this condition is met, the local increase in  $h_{500}^*$  results in a stronger inversion over low-cloud regions due to the stiffness of the fabric. This explains the sudden decrease in  $\Delta R_{\text{TOA}}$  for the 220E patch at  $\Delta \text{SST} > 2\text{K}$ .

### 4.3 A linear model for the TOA response to positive $\Delta \text{SST}$ changes in convective regions

Given the non-linearities we have highlighted in the previous section, a natural question is: “Why do previous Green’s function methods still work at all?”. One possibility is that the regions of strongest sensitivity in Green’s function studies tends to be strongly convective, such as the West Pacific (Dong et al., 2019). Our own analysis shows that the relationship between TOA and  $\Delta \text{SST}$  is reasonably linear in convective regions (e.g., compare Fig. 2b and Fig. 2c), and in this section we explore this link in more detail. To do this, in Fig. 4a we first plot the change in patch-averaged  $h_0$  against the patch-averaged changes in  $h_{500}^*$  for positive  $\Delta \text{SST}$  changes<sup>3</sup>. This acts as a test of the convective quasi-equilibrium hypothesis mentioned earlier, and confirms that changes in subcloud  $h_0$  are efficiently transported into the local free-troposphere in regions of deep convection. Next, in Fig. 4b we check to what extent these local changes in  $h_{500}^*$  relate to broader changes across the tropics. In the limit of zero horizontal temperature gradients (perfect WTG) the points in Fig. 4b would lie on the one-to-one line, but we actually find that they lie on a line of constant, but shallower, slope. The shallow slope indicates that the changes in  $h_{500}^*$  are not spread uniformly across the tropics (motivating our conceptual model which includes horizontal  $h^*$  gradients), and the fact that the slope is constant with increasing local forcing indicates that the fabric of the free-troposphere is indeed ‘stiff’ as opposed to ‘stretchy’ (if it was stretchy, we would expect the points to level off at sufficiently high  $\langle \Delta h_{500}^* \rangle$ ). To confirm the role the changes in  $h_{500}^*$  play in the ‘non-local stability-inversion’ mechanism, in Fig. 4c we scatter the changes in  $\overline{\Delta h_{500}^*}$  against  $\Delta R_{\text{TOA}}$  and the strong linear relationship indicates that larger changes in free-tropospheric temperature do indeed alter the inversion strength and TOA radiation. Taken together, these results suggest that  $\Delta R_{\text{TOA}}$  should be linearly related to the  $\Delta h_0$  in regions of deep convection, which we find holds reasonable well in our experiments (Fig. 4d).

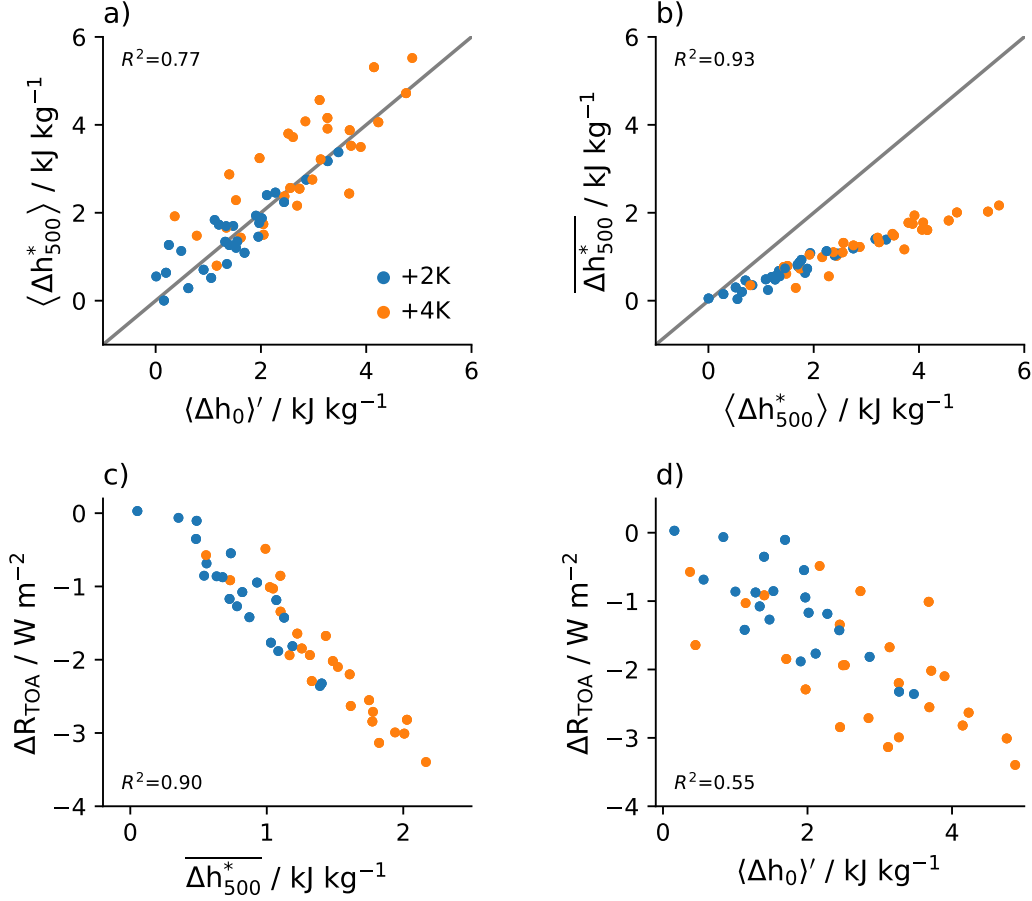
Since local  $\Delta h_0$  accounts for much of the scatter in  $\Delta R_{\text{TOA}}$  for positive  $\Delta \text{SST}$  in convecting regions (Fig. 4d), a natural question is: can we relate  $\Delta h_0$  to the  $\Delta \text{SST}$  perturbation more directly? As we defined the subcloud moist static energy at a given geopotential height, we can write the changes in patch-averaged  $h_0$  as :

$$\langle \Delta h_0 \rangle = \langle c_p \Delta T_0 + L_v \Delta q_0 \rangle.$$

Writing  $q_0 = \text{RH } q_0^*$  and linearizing, we can further approximate this as:

$$\langle \Delta h_0 \rangle \approx \left\langle \left( c_p + L_v \text{RH}_0 \frac{dq^*}{dT} \right) \Delta T_0 + L_v q_0^* \Delta \text{RH} \right\rangle.$$

<sup>3</sup> Note that for all of the analysis in Fig. 4, we have only plotted experiments where the patches are locally ‘convecting’ (i.e.,  $\langle h_0 \rangle > \langle h_{500}^* \rangle$ ) either in the control run or in the perturbed run. For the case where the patch ‘convects’ in the perturbed run but not the control (indicating a situation as in Fig. 3e), we subtract the absolute value of  $\langle h_0 - h_{500}^* \rangle$  from the calculated  $\langle \Delta h_0 \rangle$  and denote this by  $\langle \Delta h_0 \rangle'$  to adjust for the fact that the tent fabric only ‘feels’ the amount by which the convective threshold is exceeded.



**Figure 4.** Evaluating the canonical model of the SST pattern effect for warming in convective regions. a) shows a scatter plot of  $\langle \Delta h_0 \rangle'$  vs  $\langle \Delta h_{500}^* \rangle$ , as a test of convective quasi-equilibrium.  $\langle \Delta h_0 \rangle'$  is equal to  $\langle \Delta h_0 \rangle$  except for if that local patch region does not ‘convect’ in the control climate (i.e.,  $\langle h_0 \rangle < \langle h_{500}^* \rangle$ ), in which case we subtract the absolute value of  $\langle h_0 - h_{500}^* \rangle$  to adjust for the fact that the tent fabric only ‘feels’ the amount by which the convective threshold is exceeded. b) shows a scatter plot of  $\langle \Delta h_{500}^* \rangle$  vs  $\overline{\Delta h_{500}^*}$ , as a test of WTG. c) shows  $\overline{\Delta h_{500}^*}$  vs the global-mean  $\Delta R_{\text{TOA}}$ , with the strong correlation indicating support for the ‘non-local stability-inversion’ mechanism. Finally, d) shows a scatter plot of the global-mean  $\Delta R_{\text{TOA}}$  vs  $\langle \Delta h_0 \rangle'$ . Numbers indicate the Pearson coefficient of determination,  $R^2$ .

296

If we also assume Clausius-Clapeyron scaling of  $q^*$  (i.e.,  $\frac{dq^*}{dT} = \frac{L_v q^*}{R_v T^2}$ ), we arrive at:

$$\langle \Delta h_0 \rangle \approx \left\langle \left( c_p + \frac{RH_0 L_v^2}{R_v T_0^2} q_0^* \right) \Delta T_0 + L_v q_0^* \Delta RH \right\rangle. \quad (2)$$

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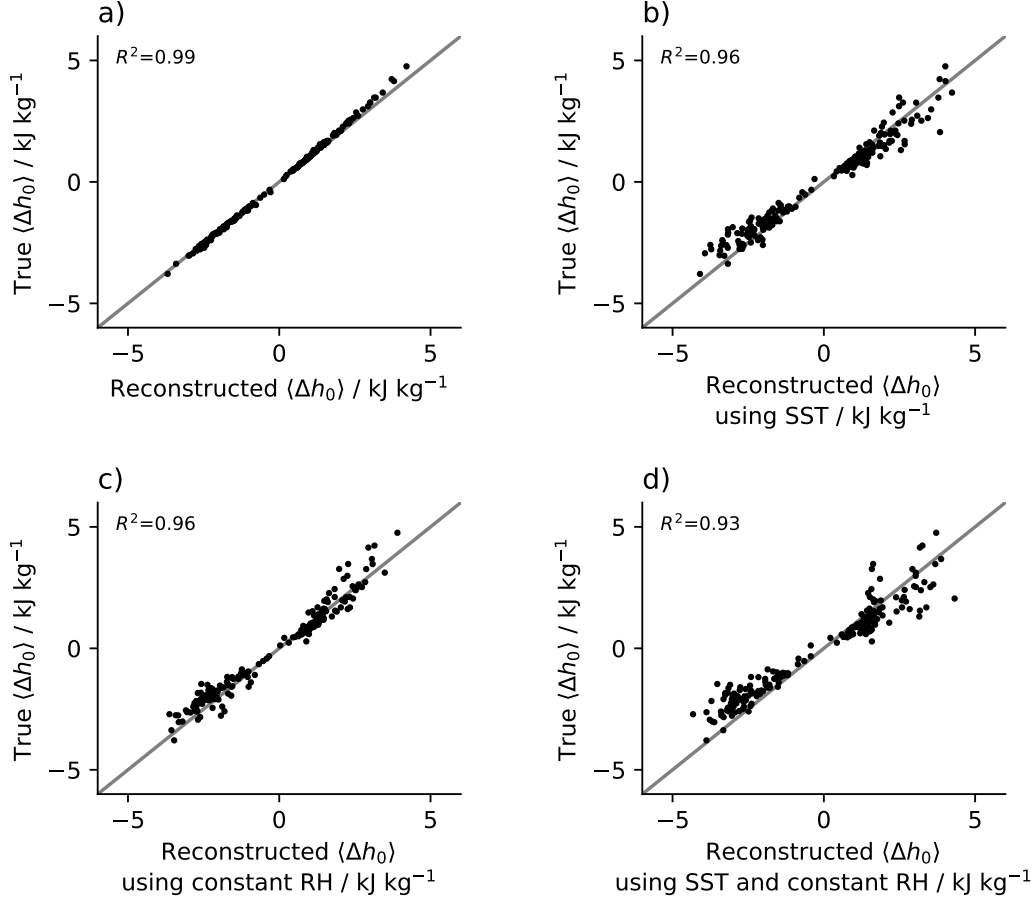
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In Fig. 5a, we show that Eq. 2 can capture most of the variations in  $\langle \Delta h_0 \rangle$  for our patch experiments, although there are slight errors at large, positive  $\Delta \text{SST}$  due to the assumption of linearity. If we assume the surface temperature is perfectly communicated across the sub-cloud layer, we can replace  $T_0 = \text{SST}$ , which also reproduces the modeled  $\langle \Delta h_0 \rangle$  well (Fig. 5b), with a slight overestimate at higher  $\langle \Delta h_0 \rangle$ . We get similar levels of skill if we assume constant relative humidity but include  $\Delta T_0$  (Fig. 5c). This is



**Figure 5.** Estimating the true  $\langle \Delta h_0 \rangle$  in each of the SST patch experiments using: a) Eq. 2. b) Eq. 2 with  $\Delta T_0$  replaced by  $\Delta \text{SST}$ . c) Eq. 2 with  $\Delta \text{RH}=0$ . d) Eq. 2 after making both approximations. Numbers indicate the Pearson coefficient of determination,  $R^2$ .

equivalent to assuming no changes in moisture convergence into the convecting region (i.e. a purely ‘thermodynamic’ scaling), which also becomes less valid at strong, positive forcing. Finally, if we combine both of these approximations ( $\Delta \text{RH} = 0$  and  $T_0 = \text{SST}$  in Eq. 2) we can still reconstruct changes in subcloud  $h_0$  reasonably well (Fig. 5d), even though we are only using information about the SST distribution. This provides support for work which has used SST as a proxy for changes in  $h_0$ , however for +4K perturbations we only achieve  $R^2 = 0.49$  in this case, which suggests caution should be taken when using SST as a proxy for subcloud MSE at large, positive  $\Delta \text{SST}$ .

## 5 Discussion and Conclusions

In this work we have shown that the climate response to isolated tropical SST perturbations exhibits strong non-linearities with respect to their sign, magnitude and location. We argue that these non-linearities arise primarily due to the fact that identical SST perturbations do not necessarily perturb the saturated moist static energy of the tropical free-troposphere equally, which is important for setting the inversion strength over low-cloud regions. For example, in moderately stable regions such as the Central Pacific negative SST anomalies have little impact on the global-mean TOA radiation or

tropical  $h_{500}^*$ , and positive SST anomalies only have a strong effect when the  $\Delta$ SST magnitude exceeds a certain value determined by the local convective threshold.

To understand these results, we have introduced the ‘circus tent’ model of the tropical atmosphere, which brings together the twin pillars of convective quasi-equilibrium and weak (but non-zero) temperature gradients in the tropical free-troposphere. In this model, local  $\Delta$ SST perturbations only alter the  $h_{500}^*$  if the subcloud  $h_0$  exceeds a local ‘convective threshold’, and then proceeds to perturb the  $h_{500}^*$  quasi-linearly for positive perturbations. Negative  $\Delta$ SST can also decrease the  $h_{500}^*$  (Fig. 2c), generating positive  $\Delta R_{\text{TOA}}$  as a result of low-cloud changes, however the effect saturates for sufficiently negative  $\Delta$ SST because eventually the subcloud layer becomes decoupled from the free-troposphere (Fig. 2b, Fig. 3c). These concepts are understood implicitly in the tropical dynamics community (Zhao et al., 2009; Fueglistaler et al., 2009; Flannaghan et al., 2014; Fueglistaler et al., 2015), but to our knowledge this is the first time they have been *explicitly* invoked to understand the pattern effect.

Our work has implications for studies which construct SST Green’s functions by demonstrating that the TOA response is not always linear in  $\Delta$ SST, even for a given sign, and that the character of the non-linearity varies depending on the convective regime being perturbed. Preliminary work as part of the Green’s Function Model Intercomparison Project (GFMIP, Bloch-Johnson et al., 2022, in prep) has also demonstrated similar non-linearities in five other GCMs, suggesting our results are not model-specific. This does not mean the Green’s function approach is without merit, but suggests that future work should focus on mapping the TOA response across multiple  $\Delta$ SST values for each location and understanding the responses in isolation before combining them so as to minimize the risk of introducing compensating errors. This is currently being undertaken in a multi-model context as part of the GFMIP project (Bloch-Johnson et al., 2022, in prep). A particular focus of future work should be on understanding how SST perturbations alter the distribution of subcloud moist static energy, particular over the perturbed region, and understanding what factors set the shape of the tropical ‘circus tent’ and its response to forcing.

Finally, our work has focused on the climate response to *isolated* SST perturbations and we have not addressed whether these isolated SST perturbations combine in an additive or non-additivity way. Dong et al., (2019) show that when simultaneously perturbing the East and Western Pacific, the response is linear, however our results suggest that this is a fortuitous outcome of perturbing one region already ‘in contact’ with the tent fabric, and another which sits well-below it (Fig. 3a). Indeed, preliminary experiments as part of GFMIP have shown that non-linearities are stark when simultaneously perturbing two convecting regions, and understanding this non-*additivity* will be the subject of a future paper.

## 6 Open Research

The climate model simulations in this study are freely available at [doi.org/10.5281/zenodo.7139180](https://doi.org/10.5281/zenodo.7139180).

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