Modulation of Tropical Convection-circulation Interaction by Aerosol Indirect Effects in a Global Convection-permitting Model

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Abstract

Observations suggest tropical convection intensifies when aerosol concentrations enhance, but quantitative estimations of this effect remain highly uncertain. Leading theories for explaining the intensification are based on the dynamical response of convection to changes in cloud microphysics independently from possible changes in the environment. Here, we provide a new perspective on aerosol indirect effects on tropical convection by using a global convection-permitting model that realistically simulates convection-circulation interaction. Simulations of radiative-convective equilibrium show that pollution facilitates the development of deep convection in a drier environment, but cloud condensates are more likely to be exported from moist clusters to dry areas, impeding the large-scale moisture-convection feedback and limiting the intensity of maximum precipitation (30 vs. 47 mm h⁻¹). Our results emphasize the importance of allowing atmospheric phenomena to evolve continuously across spatial and temporal scales in simulations when investigating the response of tropical convection to changes in cloud microphysics.
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Key Points:
\begin{itemize}
  \item Simulations of the global convection-permitting model provide a new perspective on aerosol indirect effects.
  \item Pollution facilitates the development of deep convection in a drier environment.
  \item The response of large-scale circulation to pollution limits the intensity of maximum precipitation.
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Abstract

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Plain Language Summary

How does air pollution affect thunderstorm intensity over the tropical ocean? Past studies have proposed different opinions but generally neglect the interplay between the development of thunderstorms and the long-range movement of air that redistributes the Earth’s thermal energy and moisture. Here, we address this question by investigating results from numerical experiments in which the global domain is used to simulate the response of individual thunderstorms and large-scale air motion to pollution. Our results show that tropical thunderstorms with given moisture are more vigorous under the polluted scenario. However, pollution makes the thunderstorms keep less moisture in their surroundings, limiting the maximum intensity of thunderstorms and weakening the large-scale air motion that supplies moisture to thunderstorms. Our results suggest that the interplay between the development of thunderstorms and the long-range movement of air is crucial in determining the effects of pollution in the tropical atmosphere.

1 Introduction

Deep convective clouds (DCCs) play a critical role in the global climate system via their role in the Earth’s energy budget (Arakawa, 2004; Hartmann et al., 2001). They can aggregate into organized convective systems that span hundreds to a thousand kilometers (Houze, 2004) and contribute significantly to tropical rainfall (Chen et al., 2021; Houze et al., 2015; Nesbitt et al., 2006; Tao & Cherr, 2017; Yuan & Houze, 2010). Observations suggest that updrafts of tropical DCCs can be invigorated by enhanced aerosol concentrations that arise from human activities and natural sources (Andreae et al., 2004; Koren et al., 2008; Niu & Li, 2012; Pan et al., 2021; Storer et al., 2014). By acting as cloud condensate nuclei (CCN) or ice nuclei (IN), aerosols change cloud properties by influencing cloud microphysics and dynamics, meanwhile influencing cloud-radiation feedbacks (i.e., aerosol indirect effects (AIEs); see reviews of Fan et al. (2016) and Tao et al. (2012)). A deeper understanding of AIEs on tropical DCCs and organized convective systems could improve the prediction of extreme precipitation events in global weather and climate models. However, the underlying mechanisms of how the updrafts are invigorated remain elusive and are often debated (Fan et al., 2018; Fan & Khain, 2021; W. W. Grabowski & Morrison, 2020, 2021; Igel & van den Heever, 2021). A particular challenge of understanding AIEs using observations is that the observed aerosol concentrations in the environments of DCCs often covary with other meteorological factors, such as convective available potential energy and vertical wind shear (W. W. Grabowski, 2018; Nishant & Sherwood, 2017; Varble, 2018), and the influences of meteorological and aerosol variability are difficult to disentangle from one another. Further, there is evidence from simulations that AIEs on DCCs vary as a function of meteorological conditions such as shear
and humidity (Fan et al., 2009; van den Heever & Cotton, 2007; Khain et al., 2008; Koren et al., 2010; Z. Lebo, 2018), which further complicates our ability to isolate the aerosol effects from other meteorological processes. AIEs are underrepresented in global climate models because of these knowledge gaps, which contributes to considerable uncertainty in estimating human climate forcing (Forster et al., 2021).

To investigate the aerosol indirect effects on DCCs that interact with their surrounding environment, Abbott and Cronin (2021) carried out simulations using a small domain (128x128 km$^2$) three-dimensional cloud-resolving model (3-D CRM) with parameterized large-scale dynamics under the weak temperature gradient (WTG) approximation (Sobel et al., 2001). Abbott and Cronin (2021) suggested that enhanced CCN concentrations produce clouds that mix more condensed water into the surrounding air. This enhances the environment favorably for subsequent convection by moistening the free troposphere and reducing the deleterious effects of entrainment. The humidity-entrainment mechanism they proposed is distinct from past work, which linked stronger updrafts with latent heat released by cloud condensation (Fan et al., 2018) or freezing (Rosenfeld et al., 2008) independently from possible changes in the environment. Anber et al. (2019) also used a small domain (192x192 km$^2$) 3-D CRM with parameterized large-scale dynamics to carry out simulations with different number concentrations of CCN but found a contrasting result. In their simulations, convection and mean precipitation get weaker when the CCN concentration increases. They suggested that the changes are associated with the modulation of coupling between convective processes and large-scale motions that overall reduces surface enthalpy fluxes.

Using a large domain (10000 km) two-dimension CRM configured in radiative-convective equilibrium (RCE; Manabe & Strickler, 1964), van den Heever et al. (2011) found a weak response of the large-scale organization of convection and the domain-averaged precipitation to enhanced CCN concentrations. They suggested that AIEs on the tropical cloud modes are opposite in sign, offsetting each other, thus producing a weak domain-wide response. In contrast, a more recent study by Beydoun and Hoose (2019) that used a large channel-shaped domain (2000x120 km$^2$) 3-D CRM found a comparatively large decrease in domain-averaged precipitation in their RCE simulations with enhanced CCN concentrations. They suggested that enhanced CCN concentrations lead to the weakened large-scale organization of convection, increased midlevel and upper-level clouds, decreased radiative cooling, and decreased domain-averaged precipitation.

The difference in the above findings is likely influenced by the representation of large-scale dynamics and the geometry of the simulation domain, which could modulate convection-circulation interaction hence affect the overall AIEs. For example, a horizontal scale of the model domain larger than 5000 km was suggested to be large enough to represent the natural scale of large-scale organization of convection (Matsugishi & Satoh, 2022; Patrizio & Randall, 2019; Yanase et al., 2022). Advances in computational resources have allowed for global model simulations that explicitly simulate deep convection (Stevens et al., 2019). These global convection-permitting models have been applied to investigate how clouds and convective processes couple to large-scale circulation and determine cloud feedbacks and climate sensitivity (Wing et al., 2020). However, how is the coupling of DCCs and large-scale circulations affected by enhanced aerosol concentrations has not been fully understood.

This study aims to investigate the modulation of tropical convection-circulation interaction by AIEs in global simulations that simultaneously resolve the dynamical response of convection to changes in cloud microphysics and allow large-scale circulations to naturally develop since the horizontal scale is not artificially constrained by the domain size or shape. The modulation of tropical convection-circulation interaction by AIEs is demonstrated by analyzing the responses of moisture distribution, convection structures, and large-scale circulation to pollution. Section 2 introduces more details about
the model and the experiment design. Section 3 describes the results, and the summary and discussion are presented in section 4.

2 Model Description and Experiment Design

We use the Central Weather Bureau Global Forecast System (CWBGFS; Su et al., 2021a, 2021b; SU et al., 2022), which is a global convection-permitting model run at the horizontal resolution of 15 km, to carry out our experiments. Deep convection in the CWBGFS is represented by the unified relaxed Arakawa-Schubert scheme (URAS; Su et al., 2021b) in which the representation transitions from the parameterization to the explicit simulation as the diagnosed convective updraft fraction increases (Arakawa & Wu, 2013; Wu & Arakawa, 2014). Hence, the CWBGFS with the URAS can explicitly but efficiently simulate deep convection and convection-circulation interaction on the global scale. This model partially resolve circulations in organized convective systems and reproduce the observed feature of convective systems that stronger extreme precipitation occurs in horizontally larger systems (Hamada et al., 2014; SU et al., 2022).

The CWBGFS uses the two-moment Predicted Particle Properties bulk microphysics scheme (P3; Morrison & Milbrandt, 2015) to represent cloud microphysical processes, including cloud-aerosol interaction. The aerosol concentration prescribed in P3 is fixed throughout the integration and acts as CCN. Cloud-aerosol interaction is not included in the URAS. In our simulations, the averaged percentage of precipitation produced by explicitly simulated convection is more than 93 % over precipitation events stronger than 5 mm h$^{-1}$, indicating that most of the cloud-aerosol interactions associated with deep convection are resolved. The rest of the descriptions regarding physics suites and the dynamic core of the CWBGFS can be found in Su et al. (2021a).

Two idealized non-rotating aqua-planet simulations configured in RCE are carried out. Simulations in RCE have been extensively used to investigate feedback among clouds, environmental moisture, radiation, and precipitation (Bretherton et al., 2005; Coppin & Bony, 2015; Cronin & Wing, 2017; Emanuel et al., 2014; Holloway & Woolnough, 2016; Pendergrass et al., 2016; Popke et al., 2013; Singh & O’Gorman, 2013, 2015; Wing & Emanuel, 2014; Wing et al., 2020), and therefore provide an ideal experimental setting to study AIEs. Under certain circumstances, convection in RCE spontaneously self-organizes into one or more moist ascending clusters surrounded by dry subsiding convection-free areas in simulations configured in non-rotating RCE (convective self-aggregation (CSA); C. Muller et al., 2022; Wing et al., 2017). We note that CSA occurs in the simulations of van den Heever et al. (2011) and Beydoun and Hoose (2019).

The simulations are initialized with an analytic sounding (Wing et al., 2018) that approximates the moist tropical sounding of Dunion (2011), and the initial horizontal winds are set to zero. The initial surface pressure of all grid columns is 1014.8 hPa. The incoming solar radiation (409.6 W m$^{-2}$), the sea surface temperature (300 K), and the surface albedo (0.07) are spatially uniform and constant in time. The simulations are run for 120 days, and the random perturbation of temperature from 0.1 to 0.02 K is added to the five lowest model levels in the first 20 days to speed up convection initiation. The only difference between the two simulations is the prescribed spatially uniform aerosol number mixing ratio set in P3. They are set at $3 	imes 10^8$ kg$^{-1}$ and $3 	imes 10^{10}$ kg$^{-1}$, representing the pristine and polluted scenarios, respectively. The scenarios here are referred to the marine environment (Andreae, 2009) and the urban environment (Chang et al., 2021) and are used to evaluate the upper bound of AIEs on convection-circulation interaction. In the following section, 30 days of hourly output (days 90 to 120) are analyzed when the simulation is in an RCE state.

The overall results of the pristine run are showcased in Fig. 1, demonstrating that our simulations resemble the global model simulations in the RCE model intercompar-
ison project (Wing et al., 2018, 2020), in which convection self-organizing into multiple moist clusters (Fig. 1a). Fig. 1b shows the spatial distribution of column water vapor (CWV) of a moist cluster, indicating high heterogeneity that is coupled to spatial convection structures. Precipitation stronger than 30 mm h$^{-1}$ (Fig. 1c) is found in a convective system with intense resolved updrafts ($>1$ m s$^{-1}$) (Fig. 1d). Fig. 1 with more detail will be introduced in the following section.

Figure 1. A snapshot of moist clusters smaller (light blue shaded) and larger (navy shaded) than 1000 km of horizontal scale, convective systems (orange shaded), and distance to the nearest convective system (green contours of 375, 1125, 1875 km) of the pristine run on day 106.5 (a). Column water vapor (mm) and convective systems (black contours) in a moist cluster (b), which the domain is demonstrated by the black dashed lines in (a). Precipitation intensity (mm h$^{-1}$) of a convective system (c), which the domain is demonstrated by the white dashed lines in (b). The vertical profiles of mixed-phase cloud condensates (shaded) and vertical velocity (green contours of 0.1, 0.5, 1 m s$^{-1}$) (d) along the red dashed line in (c). See the context for the definition of moist clusters and convective systems. The horizontal scale is determined by the square root of the cluster’s horizontal area.

3 Results

We start from demonstrating the response of moisture probability distribution to enhanced CCN concentrations. In both runs, the distribution of CWV is bimodal (Fig. 2). The bimodality suggests the presence of an aggregated state (Arnold & Randall, 2015; Tsai & Wu, 2017) which is maintained by large-scale circulation. The difference between the two local maxima of the bimodality is smaller in the polluted run, suggesting AIEs
drive columns away from both moist and dry equilibria in the pristine run. We use the CWV value that corresponds to the smallest value along the curve in Fig. 2 between the local maxima at dry and moist CWV values as the threshold to define moist clusters (i.e., 43 mm in both runs). The difference in area coverage percentage of moist clusters in the global domain between the two runs is less than 3%. The moist clusters in the polluted run are notably drier than that in the pristine run. Further, the number of moist clusters in the polluted run is 23% more than that in the pristine run. Sixty-five percent of moist clusters are smaller than 1000 km of horizontal scale in the polluted run, and there are 45% of them in the pristine run.

Figure 2. Probability distribution of column water vapor (black) and distance to the nearest convective system conditional sampled by column water vapor (red) from days 90 to 120. The gray line labels 43 mm of column water vapor, which is set as the criteria for defining a moist cluster.

We evaluate AIEs by first identifying the updraft regions of convective systems as laterally connected columns of vertical velocity >0.1 m s$^{-1}$ in any level between 700 to 400 hPa (Fig. 1a-b). A critical characteristic of tropical deep moist convection is the rapid intensification of precipitation once CWV has exceeded a critical value, which characterizes the effect of water vapor on the buoyancy of clouds through entrainment (Bretherton et al., 2004; Neelin et al., 2009; Peters & Neelin, 2006). Hence, we investigate the influence of pollution on this precipitation-CWV dependency. Analyses among all updraft regions with a given CWV indicate that both of our simulations mimic the precipitation-CWV dependency seen in nature, with a rapid increase in mixed-phase cloud condensate, updraft intensity (Fig. 3a-b), and precipitation (Fig. 3c) occurring in both simulations above a certain threshold in CWV. However, a distinct difference of the polluted run from the pristine one is that the threshold CWV which heralds the increase in con-
vective intensity occurs at a lower CWV value (57 mm) than it does in the pristine run (62 mm).

Fig. 3a-b show that the vertical profiles to the right of the CWV thresholds resemble the convection structures of deep convection at the developing and mature stage, and the profiles to the left resemble deep convection at the dissipating stage, in which mixed-phase cloud condensates concentrate at mid-level free atmosphere beneath which weak downdrafts due to water loading take place. In the dissipating stage, moisture in the polluted run is more heavily distributed over the mid-to-low free atmosphere (Fig. 3d). The water vapor mixing ratio there is 1.5 g kg\(^{-1}\) more than that in the pristine run. The difference may be caused by the stronger evaporation of raindrops as we found there is more mass but nearly the same number of falling raindrops beneath clouds in the polluted run leading to two times stronger surface precipitation (figure not shown). These raindrops could be from the melting of graupel and hail since the warm-rain process is suppressed due to pollution.

Past studies have shown that humidity in the lower free atmosphere is critical to the onset of tropical deep convection (Derbyshire et al., 2004; Holloway & Neelin, 2009, 2010; Schiro et al., 2016; Tompkins, 2001). The enhanced moisture in the lower free atmosphere increases the buoyancy of entraining plumes, leading to an increased chance of deep convection. The signal of the exceeding moisture in the mid-to-low free atmosphere in the polluted run extends to the CWV regimes of developing and mature convection (Fig. 3d), in which the increase in moisture in the mid-to-high atmosphere reflects the prevalence of convection (Fig. 3a-b). The modulated moisture distribution, originating from the response of dissipating stage of convection to changes in cloud microphysics, enhances conditional instability, potentially contributing to the development of subsequent convection. Further investigations on the mechanism will be carried out in the future.
Figure 3. Mass mixing ratio of cloud water and cloud ice (shaded) and vertical velocity (contours at 0, 0.1, 0.2, 0.5, 1, 2 m s\(^{-1}\)) within the updraft regions of convective systems conditional sampled by column water vapor of the pristine (a) and the polluted (b) run from days 90 to 120. Precipitation intensity of the two runs (c) and the difference of water vapor mixing ratio (polluted run minus the pristine run) (d) sampled by the same method. The red dotted line in (d) shows the contour of 0 g kg\(^{-1}\). The red sticks along the x-axis show the CWV value of 57 and 62 mm. However, the highest CWV environment over the updraft regions (>67 mm) in the pristine run is absent in the polluted run (Fig. 3). The polluted run has notably drier moist clusters (Fig. 2), leading to the weaker maximum intensity of updraft and precipitation (30 vs. 47 mm h\(^{-1}\)). As the moisture distribution is maintained by large-scale circulation, we investigate the influence of pollution on large-scale circulation by sorting the distance to the nearest convective system and projecting horizontal winds in the direction pointing to the nearest system (green contours in Fig. 1a). Large-scale circulation has often been visualized with a streamfunction in moisture space when analyzing self-aggregated runs to RCE (Arnold & Putman, 2018; Bretherton et al., 2005; Holloway & Woolnough, 2016; C. Muller & Bony, 2015; C. J. Muller & Held, 2012). The streamfunction analyzed in past studies is designed to investigate the energy transport between dry areas and moist clusters but it does not represent circulation in physical space. It is natural to analyze large-scale circulation in physical space when using a global convection-permitting model with an appropriate choice of the source of momentum and energy transport. The result shows that both runs exhibit typical structures of tropical circulation, including low-level inflow, mid-level outflow, and deep convection outflow (Johnson et al., 1999), but every component of the circulation is weaker in the polluted run (Fig. 4).

We trace the cause of the weaker large-scale circulation down to the influence of pollution on the geographical distribution of convective systems (i.e., updraft regions). In the polluted run, convective systems develop geographically closer to the meandering margin (i.e., 43 mm) of moist clusters, because CWV increases monotonically from dry areas toward moist clusters (Fig. 1b), and convection strength enhances more rapidly.
as CWV increases in the polluted run (Fig. 3b). Fig. 2 shows that the average distance from the edges of moist clusters to the nearest convective system in the pristine run is 1.5 times longer than that in the polluted run. Meanwhile, inhibiting the warm-rain process by pollution could increase the mid-level static stability as a result of a latent heating dipole associated with the freezing water and melting ice above and below the freezing level. Previous studies suggested that an increase in mid-level static stability promotes detrainment (Johnson et al., 1999; Patrizio & Randall, 2019; Posselt et al., 2008, 2012). Overall, cloud condensates in the polluted run are more likely to be exported from moist clusters to dry areas rather than stay in moist clusters and then re-evaporate. The export of clouds impedes the moisture-convection feedback in which moistening environment by convection plays a key role in favoring subsequent development of convection (W. Grabowski & Moncrieff, 2004; Holloway & Neelin, 2009). The above inference is supported by Fig. 4b, which shows that the exceeding cloud condensates in the polluted run coincide with the mid-level outflow of the large-scale circulation.

Figure 4. Water vapor flux (shaded) and horizontal winds (contours from -4 to 4 m s\(^{-1}\) with an interval of 1 m s\(^{-1}\) using a color scale from maroon to white to navy) projected to the direction of pointing to the nearest convective system in the pristine (a) and the polluted (b) run from days 90 to 120. Positive values are vectors toward the system. The black and red dots in (b) show where the ratio of cloud water mixing ratio in the polluted run over the pristine one larger than 1 and 2, respectively

4 Summary and Discussion

This study investigates the response of tropical convection-circulation interaction to enhanced CCN concentrations using non-rotating RCE simulations of a global convection-permitting model run at 15 km horizontal resolution. Deep convection in the model is represented in a way that the explicit simulation of convection seeds cloud-aerosol interaction and is responsible for strong precipitation events. The simulations allow for the large-scale organization of convection realistically inducing circulation without artificial constraints of scale separation assumption, domain size, or domain shape. The novel finding in this study is that pollution facilitates the development of deep convection in a drier environment, while the response of large-scale circulation limits the intensity of maximum precipitation. Our results emphasize the importance of allowing atmospheric phenomena to evolve continuously across spatial and temporal scales in simulations when investigating the response of tropical convection to changes in cloud microphysics.

Connecting our result to the existing driving and maintaining mechanisms of CSA could inspire future investigation on the response of global warming to varied CCN con-
centrations since CSA is known to modulate climate sensitivity (Cronin & Wing, 2017).

The possible connections include:

1. The export of mid-level cloud condensates could weaken the radiatively driven subsidence over the dry areas that drives CSA (Beydoun & Hoose, 2019; Bretherton et al., 2005; C. J. Muller & Held, 2012; Wing & Emanuel, 2014; Holloway & Woolnough, 2016).

2. The response of cold pool dynamics to cloud microphysics has received considerable attention in the literature (Z. J. Lebo & Morrison, 2014; Seigel et al., 2013; Storer et al., 2014; Su et al., 2020; Tao et al., 2007; van den Heever & Cotton, 2007). Cold pools associated with the closer-to-edge convective systems in the polluted run could mix low-level dry areas and moist clusters more effectively, weakening the CSA (Jeevanjee & Romps, 2013; C. Muller & Bony, 2015).

Past studies (Arnold & Randall, 2015; Khairoutdinov & Emanuel, 2018) indicated that the large-scale organization of convection (i.e., CSA) in non-rotating RCE simulations and MJO-like (i.e., Madden-Julian Oscillation; Madden & Julian, 1971) disturbance in rotating RCE simulations share the same driving mechanism (i.e., cloud-radiation feedbacks) in which AIEs can be critical. One of the characteristics of MJO propagation is that MJOs suffer from a barrier effect when it propagates over the Maritime Continent (MC) (Kim et al., 2014; Zhang & Ling, 2017). The development of convective systems over the water in the MC region plays a crucial role in carrying the MJO signal through the MC (Ling et al., 2019). Around the globe, MC is a major source of different types of aerosol (Reid et al., 2012; Salinas et al., 2013; Shpund et al., 2019). The modulation of the size of moist clusters and the geographical distribution of convective systems by enhanced CCN concentrations potentially provides a new perspective on the existing MJO theories (Jiang et al., 2020; Zhang, 2013). A possible approach for the investigation is to evaluate sub-seasonal hindcasts of an active MJO event with different aerosol emission scenarios.

5 Open Research

The model output data of a temporal snapshot, the Fortran program that computes vertical atmospheric profiles conditional sampled by column water vapor and the distance to the nearest convective system, and the GrADS plotting scripts in this study are available at https://doi.org/10.6084/m9.figshare.22149617.v1.

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1 Introduction
 Deep convective clouds (DCCs) play a critical role in the global climate system via their role in the Earth’s energy budget (Arakawa, 2004; Hartmann et al., 2001). They can aggregate into organized convective systems that span hundreds to a thousand kilometers (Houze, 2004) and contribute significantly to tropical rainfall (Chen et al., 2021; Houze et al., 2015; Nesbitt et al., 2006; Tao & Chern, 2017; Yuan & Houze, 2010). Observations suggest that updrafts of tropical DCCs can be invigorated by enhanced aerosol concentrations that arise from human activities and natural sources (Andreae et al., 2004; Koren et al., 2008; Niu & Li, 2012; Pan et al., 2021; Storer et al., 2014). By acting as cloud condensate nuclei (CCN) or ice nuclei (IN), aerosols change cloud properties by influencing cloud microphysics and dynamics, meanwhile influencing cloud-radiation feedbacks (i.e., aerosol indirect effects (AIEs); see reviews of Fan et al. (2016) and Tao et al. (2012)). A deeper understanding of AIEs on tropical DCCs and organized convective systems could improve the prediction of extreme precipitation events in global weather and climate models. However, the underlying mechanisms of how the updrafts are invigorated remain elusive and are often debated (Fan et al., 2018; Fan & Khain, 2021; W. W. Grabowski & Morrison, 2020, 2021; Igel & van den Heever, 2021). A particular challenge of understanding AIEs using observations is that the observed aerosol concentrations in the environments of DCCs often covary with other meteorological factors, such as convective available potential energy and vertical wind shear (W. W. Grabowski, 2018; Nishant & Sherwood, 2017; Varble, 2018), and the influences of meteorological and aerosol variability are difficult to disentangle from one another. Further, there is evidence from simulations that AIEs on DCCs vary as a function of meteorological conditions such as shear
and humidity (Fan et al., 2009; van den Heever & Cotton, 2007; Khain et al., 2008; Koren et al., 2010; Z. Lebo, 2018), which further complicates our ability to isolate the aerosol effects from other meteorological processes. AIEs are underrepresented in global climate models because of these knowledge gaps, which contributes to considerable uncertainty in estimating human climate forcing (Forster et al., 2021).

To investigate the aerosol indirect effects on DCCs that interact with their surrounding environment, Abbott and Cronin (2021) carried out simulations using a small domain (128x128 km$^2$) three-dimension cloud-resolving model (3-D CRM) with parameterized large-scale dynamics under the weak temperature gradient (WTG) approximation (Sobel et al., 2001). Abbott and Cronin (2021) suggested that enhanced CCN concentrations produce clouds that mix more condensed water into the surrounding air. This enhances the environment favorably for subsequent convection by moistening the free troposphere and reducing the deleterious effects of entrainment. The humidity-entrainment mechanism they proposed is distinct from past work, which linked stronger updrafts with latent heat released by cloud condensation (Fan et al., 2018) or freezing (Rosenfeld et al., 2008) independently from possible changes in the environment. Anber et al. (2019) also used a small domain (192x192 km$^2$) 3-D CRM with parameterized large-scale dynamics to carry out simulations with different number concentrations of CCN but found a contrasting result. In their simulations, convection and mean precipitation get weaker when the CCN concentration increases. They suggested that the changes are associated with the modulation of coupling between convective processes and large-scale motions that overall reduces surface enthalpy fluxes.

Using a large domain (10000 km) two-dimension CRM configured in radiative-convective equilibrium (RCE; Manabe & Strickler, 1964), van den Heever et al. (2011) found a weak response of the large-scale organization of convection and the domain-averaged precipitation to enhanced CCN concentrations. They suggested that AIEs on the three tropical cloud modes are opposite in sign, offsetting each other, thus producing a weak domain-wide response. In contrast, a more recent study by Beydoun and Hoose (2019) that used a large channel-shaped domain (2000x120 km$^2$) 3-D CRM found a comparatively large decrease in domain-averaged precipitation in their RCE simulations with enhanced CCN concentrations. They suggested that enhanced CCN concentrations lead to the weakened large-scale organization of convection, increased midlevel and upper-level clouds, decreased radiative cooling, and decreased domain-averaged precipitation.

The difference in the above findings is likely influenced by the representation of large-scale dynamics and the geometry of the simulation domain, which could modulate convection-circulation interaction hence affect the overall AIEs. For example, a horizontal scale of the model domain larger than 5000 km was suggested to be large enough to represent the natural scale of large-scale organization of convection (Matsugishi & Satoh, 2022; Patrizio & Randall, 2019; Yanase et al., 2022). Advances in computational resources have allowed for global model simulations that explicitly simulate deep convection (Stevens et al., 2019). These global convection-permitting models have been applied to investigate how clouds and convective processes couple to large-scale circulation and determine cloud feedbacks and climate sensitivity (Wing et al., 2020). However, how is the coupling of DCCs and large-scale circulations affected by enhanced aerosol concentrations has not been fully understood.

This study aims to investigate the modulation of tropical convection-circulation interaction by AIEs in global simulations that simultaneously resolve the dynamical response of convection to changes in cloud microphysics and allow large-scale circulations to naturally develop since the horizontal scale is not artificially constrained by the domain size or shape. The modulation of tropical convection-circulation interaction by AIEs is demonstrated by analyzing the responses of moisture distribution, convection structures, and large-scale circulation to pollution. Section 2 introduces more details about
2 Model Description and Experiment Design

We use the Central Weather Bureau Global Forecast System (CWBGFS; Su et al., 2021a, 2021b; SU et al., 2022), which is a global convection-permitting model run at the horizontal resolution of 15 km, to carry out our experiments. Deep convection in the CWBGFS is represented by the unified relaxed Arakawa-Schubert scheme (URAS; Su et al., 2021b) in which the representation transitions from the parameterization to the explicit simulation as the diagnosed convective updraft fraction increases (Arakawa & Wu, 2013; Wu & Arakawa, 2014). Hence, the CWBGFS with the URAS can explicitly but efficiently simulate deep convection and convection-circulation interaction on the global scale. This model partially resolve circulations in organized convective systems and reproduce the observed feature of convective systems that stronger extreme precipitation occurs in horizontally larger systems (Hamada et al., 2014; SU et al., 2022).

The CWBGFS uses the two-moment Predicted Particle Properties bulk microphysics scheme (P3; Morrison & Milbrandt, 2015) to represent cloud microphysical processes, including cloud-aerosol interaction. The aerosol concentration prescribed in P3 is fixed throughout the integration and acts as CCN. Cloud-aerosol interaction is not included in the URAS. In our simulations, the averaged percentage of precipitation produced by explicitly simulated convection is more than 93 % over precipitation events stronger than 5 mm h$^{-1}$, indicating that most of the cloud-aerosol interactions associated with deep convection are resolved. The rest of the descriptions regarding physics suites and the dynamic core of the CWBGFS can be found in Su et al. (2021a).

Two idealized non-rotating aqua-planet simulations configured in RCE are carried out. Simulations in RCE have been extensively used to investigate feedback among clouds, environmental moisture, radiation, and precipitation (Bretherton et al., 2005; Coppin & Bony, 2015; Cronin & Wing, 2017; Emanuel et al., 2014; Holloway & Woolnough, 2016; Pendergrass et al., 2016; Popke et al., 2013; Singh & O’Gorman, 2013, 2015; Wing & Emanuel, 2014; Wing et al., 2020), and therefore provide an ideal experimental setting to study AIEs. Under certain circumstances, convection in RCE spontaneously self-organizes into one or more moist ascending clusters surrounded by dry subsiding convection-free areas in simulations configured in non-rotating RCE (convective self-aggregation (CSA); C. Muller et al., 2022; Wing et al., 2017). We note that CSA occurs in the simulations of van den Heever et al. (2011) and Beydoun and Hoose (2019).

The simulations are initialized with an analytic sounding (Wing et al., 2018) that approximates the moist tropical sounding of Dunion (2011), and the initial horizontal winds are set to zero. The initial surface pressure of all grid columns is 1014.8 hPa. The incoming solar radiation (409.6 W m$^{-2}$), the sea surface temperature (300 K), and the surface albedo (0.07) are spatially uniform and constant in time. The simulations are run for 120 days, and the random perturbation of temperature from 0.1 to 0.02 K is added to the five lowest model levels in the first 20 days to speed up convection initiation. The only difference between the two simulations is the prescribed spatially uniform aerosol number mixing ratio set in P3. They are set at $3 \times 10^6$ kg$^{-1}$ and $3 \times 10^{10}$ kg$^{-1}$, representing the pristine and polluted scenarios, respectively. The scenarios here are referred to the marine environment (Andreae, 2009) and the urban environment (Chang et al., 2021) and are used to evaluate the upper bound of AIEs on convection-circulation interaction. In the following section, 30 days of hourly output (days 90 to 120) are analyzed when the simulation is in an RCE state.

The overall results of the pristine run are showcased in Fig. 1, demonstrating that our simulations resemble the global model simulations in the RCE model intercompar-
ison project (Wing et al., 2018, 2020), in which convection self-organizing into multiple moist clusters (Fig. 1a). Fig. 1b shows the spatial distribution of column water vapor (CWV) of a moist cluster, indicating high heterogeneity that is coupled to spatial convection structures. Precipitation stronger than 30 mm h$^{-1}$ (Fig. 1c) is found in a convective system with intense resolved updrafts (>1 m s$^{-1}$) (Fig. 1d). Fig. 1 with more detail will be introduced in the following section.

Figure 1. A snapshot of moist clusters smaller (light blue shaded) and larger (navy shaded) than 1000 km of horizontal scale, convective systems (orange shaded), and distance to the nearest convective system (green contours of 375, 1125, 1875 km) of the pristine run on day 106.5 (a). Column water vapor (mm) and convective systems (black contours) in a moist cluster (b), which the domain is demonstrated by the black dashed lines in (a). Precipitation intensity (mm h$^{-1}$) of a convective system (c), which the domain is demonstrated by the white dashed lines in (b). The vertical profiles of mixed-phase cloud condensates (shaded) and vertical velocity (green contours of 0.1, 0.5, 1 m s$^{-1}$) (d) along the red dashed line in (c). See the context for the definition of moist clusters and convective systems. The horizontal scale is determined by the square root of the cluster’s horizontal area.

3 Results

We start from demonstrating the response of moisture probability distribution to enhanced CCN concentrations. In both runs, the distribution of CWV is bimodal (Fig. 2). The bimodality suggests the presence of an aggregated state (Arnold & Randall, 2015; Tsai & Wu, 2017) which is maintained by large-scale circulation. The difference between the two local maxima of the bimodality is smaller in the polluted run, suggesting AIEs
drive columns away from both moist and dry equilibria in the pristine run. We use the CWV value that corresponds to the smallest value along the curve in Fig. 2 between the local maxima at dry and moist CWV values as the threshold to define moist clusters (i.e., 43 mm in both runs). The difference in area coverage percentage of moist clusters in the global domain between the two runs is less than 3%. The moist clusters in the polluted run are notably drier than that in the pristine run. Further, the number of moist clusters in the polluted run is 23% more than that in the pristine run. Sixty-five percent of moist clusters are smaller than 1000 km of horizontal scale in the polluted run, and there are 45% of them in the pristine run.

We evaluate AIEs by first identifying the updraft regions of convective systems as laterally connected columns of vertical velocity $>0.1 \text{ m s}^{-1}$ in any level between 700 to 400 hPa (Fig. 1a-b). A critical characteristic of tropical deep moist convection is the rapid intensification of precipitation once CWV has exceeded a critical value, which characterizes the effect of water vapor on the buoyancy of clouds through entrainment (Bretherton et al., 2004; Neelin et al., 2009; Peters & Neelin, 2006). Hence, we investigate the influence of pollution on this precipitation-CWV dependency. Analyses among all updraft regions with a given CWV indicate that both of our simulations mimic the precipitation-CWV dependency seen in nature, with a rapid increase in mixed-phase cloud condensate, updraft intensity (Fig. 3a-b), and precipitation (Fig. 3c) occurring in both simulations above a certain threshold in CWV. However, a distinct difference of the polluted run from the pristine one is that the threshold CWV which heralds the increase in con-

Figure 2. Probability distribution of column water vapor (black) and distance to the nearest convective system conditional sampled by column water vapor (red) from days 90 to 120. The gray line labels 43 mm of column water vapor, which is set as the criteria for defining a moist cluster.
vective intensity occurs at a lower CWV value (57 mm) than it does in the pristine run (62 mm).

Fig. 3a-b show that the vertical profiles to the right of the CWV thresholds resemble the convection structures of deep convection at the developing and mature stage, and the profiles to the left resemble deep convection at the dissipating stage, in which mixed-phase cloud condensates concentrate at mid-level free atmosphere beneath which weak downdrafts due to water loading take place. In the dissipating stage, moisture in the polluted run is more heavily distributed over the mid-to-low free atmosphere (Fig. 3d). The water vapor mixing ratio there is 1.5 g kg\(^{-1}\) more than that in the pristine run. The difference may be caused by the stronger evaporation of raindrops as we found there is more mass but nearly the same number of falling raindrops beneath clouds in the polluted run leading to two times stronger surface precipitation (figure not shown). These raindrops could be from the melting of graupel and hail since the warm-rain process is suppressed due to pollution.

Past studies have shown that humidity in the lower free atmosphere is critical to the onset of tropical deep convection (Derbyshire et al., 2004; Holloway & Neelin, 2009, 2010; Schiro et al., 2016; Tompkins, 2001). The enhanced moisture in the lower free atmosphere increases the buoyancy of entraining plumes, leading to an increased chance of deep convection. The signal of the exceeding moisture in the mid-to-low free atmosphere in the polluted run extends to the CWV regimes of developing and mature convection (Fig. 3d), in which the increase in moisture in the mid-to-high atmosphere reflects the prevalence of convection (Fig. 3a-b). The modulated moisture distribution, originating from the response of dissipating stage of convection to changes in cloud microphysics, enhances conditional instability, potentially contributing to the development of subsequent convection. Further investigations on the mechanism will be carried out in the future.
Figure 3. Mass mixing ratio of cloud water and cloud ice (shaded) and vertical velocity (contours at 0, 0.1, 0.2, 0.5, 1, 2 m s\(^{-1}\)) within the updraft regions of convective systems conditional sampled by column water vapor of the pristine (a) and the polluted (b) run from days 90 to 120. Precipitation intensity of the two runs (c) and the difference of water vapor mixing ratio (polluted run minus the pristine run) (d) sampled by the same method. The red dotted line in (d) shows the contour of 0 g kg\(^{-1}\). The red sticks along the x-axis show the CWV value of 57 and 62 mm. However, the highest CWV environment over the updraft regions (>67 mm) in the pristine run is absent in the polluted run (Fig. 3). The polluted run has notably drier moist clusters (Fig. 2), leading to the weaker maximum intensity of updraft and precipitation (30 vs. 47 mm h\(^{-1}\)). As the moisture distribution is maintained by large-scale circulation, we investigate the influence of pollution on large-scale circulation by sorting the distance to the nearest convective system and projecting horizontal winds in the direction pointing to the nearest system (green contours in Fig. 1a). Large-scale circulation has often been visualized with a streamfunction in moisture space when analyzing self-aggregated runs to RCE (Arnold & Putman, 2018; Bretherton et al., 2005; Holloway & Woolnough, 2016; C. Muller & Bony, 2015; C. J. Muller & Held, 2012). The streamfunction analyzed in past studies is designed to investigate the energy transport between dry areas and moist clusters but it does not represent circulation in physical space. It is natural to analyze large-scale circulation in physical space when using a global convection-permitting model with an appropriate choice of the source of momentum and energy transport. The result shows that both runs exhibit typical structures of tropical circulation, including low-level inflow, mid-level outflow, and deep convection outflow (Johnson et al., 1999), but every component of the circulation is weaker in the polluted run (Fig. 4).

We trace the cause of the weaker large-scale circulation down to the influence of pollution on the geographical distribution of convective systems (i.e., updraft regions). In the polluted run, convective systems develop geographically closer to the meandering margin (i.e., 43 mm) of moist clusters, because CWV increases monotonically from dry areas toward moist clusters (Fig. 1b), and convection strength enhances more rapidly...
as CWV increases in the polluted run (Fig. 3b). Fig. 2 shows that the average distance from the edges of moist clusters to the nearest convective system in the pristine run is 1.5 times longer than that in the polluted run. Meanwhile, inhibiting the warm-rain process by pollution could increase the mid-level static stability as a result of a latent heating dipole associated with the freezing water and melting ice above and below the freezing level. Previous studies suggested that an increase in mid-level static stability promotes detrainment (Johnson et al., 1999; Patrizio & Randall, 2019; Posselt et al., 2008, 2012). Overall, cloud condensates in the polluted run are more likely to be exported from moist clusters to dry areas rather than stay in moist clusters and then re-evaporate. The export of clouds impedes the moisture-convection feedback in which moistening environment by convection plays a key role in favoring subsequent development of convection (W. Grabowski & Moncrieff, 2004; Holloway & Neelin, 2009). The above inference is supported by Fig. 4b, which shows that the exceeding cloud condensates in the polluted run coincide with the mid-level outflow of the large-scale circulation.

Figure 4. Water vapor flux (shaded) and horizontal winds (contours from -4 to 4 m s$^{-1}$ with an interval of 1 m s$^{-1}$ using a color scale from maroon to white to navy) projected to the direction of pointing to the nearest convective system in the pristine (a) and the polluted (b) run from days 90 to 120. Positive values are vectors toward the system. The black and red dots in (b) show where the ratio of cloud water mixing ratio in the polluted run over the pristine one larger than 1 and 2, respectively.

4 Summary and Discussion

This study investigates the response of tropical convection-circulation interaction to enhanced CCN concentrations using non-rotating RCE simulations of a global convection-permitting model run at 15 km horizontal resolution. Deep convection in the model is represented in a way that the explicit simulation of convection seeds cloud-aerosol interaction and is responsible for strong precipitation events. The simulations allow for the large-scale organization of convection realistically inducing circulation without artificial constraints of scale separation assumption, domain size, or domain shape. The novel finding in this study is that pollution facilitates the development of deep convection in a drier environment, while the response of large-scale circulation limits the intensity of maximum precipitation. Our results emphasize the importance of allowing atmospheric phenomena to evolve continuously across spatial and temporal scales in simulations when investigating the response of tropical convection to changes in cloud microphysics.

Connecting our result to the existing driving and maintaining mechanisms of CSA could inspire future investigation on the response of global warming to varied CCN con-
centrations since CSA is known to modulate climate sensitivity (Cronin & Wing, 2017).

The possible connections include:

1. The export of mid-level cloud condensates could weaken the radiatively driven subsidence over the dry areas that drives CSA (Beydoun & Hoose, 2019; Bretherton et al., 2005; C. J. Muller & Held, 2012; Wing & Emanuel, 2014; Holloway & Woolnough, 2016).

2. The response of cold pool dynamics to cloud microphysics has received considerable attention in the literature (Z. J. Lebo & Morrison, 2014; Seigel et al., 2013; Storer et al., 2014; Su et al., 2020; Tao et al., 2007; van den Heever & Cotton, 2007). Cold pools associated with the closer-to-edge convective systems in the polluted run could mix low-level dry areas and moist clusters more effectively, weakening the CSA (Jeevanjee & Romps, 2013; C. Muller & Bony, 2015).

Past studies (Arnold & Randall, 2015; Khairoutdinov & Emanuel, 2018) indicated that the large-scale organization of convection (i.e., CSA) in non-rotating RCE simulations and MJO-like (i.e., Madden-Julian Oscillation; Madden & Julian, 1971) disturbance in rotating RCE simulations share the same driving mechanism (i.e., cloud-radiation feedbacks) in which AIEs can be critical. One of the characteristics of MJO propagation is that MJOs suffer from a barrier effect when it propagates over the Maritime Continent (MC) (Kim et al., 2014; Zhang & Ling, 2017). The development of convective systems over the water in the MC region plays a crucial role in carrying the MJO signal through the MC (Ling et al., 2019). Around the globe, MC is a major source of different types of aerosol (Reid et al., 2012; Salinas et al., 2013; Shpund et al., 2019). The modulation of the size of moist clusters and the geographical distribution of convective systems by enhanced CCN concentrations potentially provides a new perspective on the existing MJO theories (Jiang et al., 2020; Zhang, 2013). A possible approach for the investigation is to evaluate sub-seasonal hindcasts of an active MJO event with different aerosol emission scenarios.

5 Open Research

The model output data of a temporal snapshot, the Fortran program that computes vertical atmospheric profiles conditional sampled by column water vapor and the distance to the nearest convective system, and the GrADS plotting scripts in this study are available at https://doi.org/10.6084/m9.figshare.22149617.v1.

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