

# Modeling dust sources, transport, and radiative effects at different altitudes over the Tibetan Plateau

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## Abstract

Mineral dust plays an important role in the climate of the Tibetan Plateau (TP) by modifying the radiation budget, cloud macro- and microphysics, precipitation, and snow albedo. Meanwhile, the TP with the highest topography in the world can affect intercontinental transport of dust plumes and induce typical distribution characteristics of dust at different altitudes. In this study, we conduct a quasi-global simulation to investigate the characteristics of dust source contribution and transport over the TP at different altitude by using a fully coupled meteorology-chemistry model (WRF-Chem) with a tracer-tagging technique. Generally, the simulation reasonably captures the spatial distribution of satellite retrieved dust aerosol optical depth (AOD) at different altitudes. Model results show that dust particles are emitted into atmosphere through updrafts over major desert regions, and then transported to the TP. The East Asian dust (mainly from Gobi and Taklamakan deserts) transports southward and is lifted up to the TP, contributing a mass loading of  $50 \text{ mg/m}^2$  at 3 km height and  $5 \text{ mg/m}^2$  at 12 km height over the northern slope of the TP. Dust from North Africa and Middle East are concentrated over both northern and southern slopes below 6 km, where mass loadings range from 10 to  $100 \text{ mg/m}^2$  and 1 to  $10 \text{ mg/m}^2$  below 3 km and above 9 km, respectively. As the dust is transported to the north and over the TP, mass loadings are  $5\text{-}10 \text{ mg/m}^2$  above 6 km.

The imported dust mass flux from East Asia to the TP is  $7.9 \text{ Tg/year}$  mostly occurring at the heights of 3–6 km. The North African and Middle East dust particles are transported eastward following the westerly jet, and then imported into the TP at West side with the dust mass flux of  $7.8$  and  $26.6 \text{ Tg/year}$ , respectively. The maximum mass flux of the North African dust mainly occurs in 0–3 km ( $3.9 \text{ Tg/year}$ ), while the Middle East within 6–9 km ( $12.3 \text{ Tg/year}$ ). The dust outflow occurs at East side ( $-17.89 \text{ Tg/year}$ ) and South side ( $-11.22 \text{ Tg/year}$ ) of the TP with a peak value ( $8.7 \text{ Tg/year}$ ) in 6–9 km. Moreover, the dust mass is within the size range of  $1.25\text{--}5.0 \mu\text{m}$  and dust number is concentrated in the size range of  $0.156\text{--}1.25 \mu\text{m}$ . Compared with other aerosols, the dust contributes more than 50% to the total AOD over the TP. The direct radiative forcing induced by the dust is  $-1.28 \text{ W/m}^2$  at the top of the atmosphere (cooling),  $0.41 \text{ W/m}^2$  in the atmosphere (warming) and  $-1.68 \text{ W/m}^2$  at the surface (cooling). Our quantitative analyses of the dust contribution from different source regions and the associated radiative forcing can help better understand the role of dust on the climate over the TP and surrounding regions.

50 **1 Introduction**

Mineral dust, emitted from the deserts such as Sahara, Arabian, Gobi and Taklamakan, is a major contributor to the global aerosol burden (e.g., Uno et al., 2009; Yu et al., 2012; Hu et al., 2016; Chen et al., 2018). Dust aerosols can be lifted into upper-troposphere by the strong frontal/postfrontal convection from major desert source regions, and then transported to downwind regions following westerlies (Zhao et al., 2006; Hu et al., 2019a, 2019b), with parts of the dust even being transported for one full circuit around the globe (Uno et al., 2009). During the intercontinental transport, dust has a significant effect on the regional and global climate system (Lau et al., 2006; Jin et al., 2015, Pu et al., 2018; Chen et al., 2018). For instance, previous studies showed that dust could change the atmospheric heating and affect atmospheric circulation patterns in the mid- and upper-troposphere (Lau et al. 2006; Lau and Kim 2006; Alizadeh-Choobari et al., 2014). Further, dust could spur anomalous water cycle feedback and alter the rainfall distribution over East Asia (Lau et al., 2016; Liu et al., 2011) and South Asia (Lau and Kim 2006; Kim et al., 2017; Jin et al., 2014, 2017). Dust particles were also found to change regional radiation budget (Huang et al., 2005, 2006; Zhao et al., 2014; Bi et al., 2017) by scattering and absorbing the solar radiation, and modify the properties of cloud (Li et al., 2017, 2018) by serving as cloud condensation nuclei and ice nuclei. Dust aerosols also exacerbate air quality (Chin et al., 2007; Hu et al., 2016) and reduce regional visibility (Watson, 2002). When deposited on snow/ice surface, dust could accelerate the snowmelt and glacier retreat, and change the hydrological cycle (Qian et al., 2009; Painter et al., 2010; Huang et al., 2011; Zhao et al., 2014); when deposited into rainforests and ocean, dust could provide nutrients to ecosystems and influence carbon cycle (Mahowald et al., 2008; Yu et al., 2015).

70 As the highest plateau (averaged elevation about 4000 m) in the world, the Tibetan Plateau (TP) has received extensive scientific attentions in the past decades due to its unique topographic characteristics (Ma et al., 2014; Yao et al., 2012). The TP exerts profound influences on the climate system in the Northern Hemisphere by modulating the thermodynamics of the atmosphere (Yeh et al., 1957; Ye and Wu et al., 1998; Wu et al., 2007). Generally, the TP serves as a huge heat source in mid- and upper-troposphere that largely affects the Asian summer monsoon in summer, while in winter the TP as a giant wall across the Eurasian continent can block cold outbreaks from the north and confines the winter monsoon to the eastern and southern Asia (Wu et al., 2012). Recent studies have indicated that the climate of the TP is warming rapidly (e.g., Duan and Wu et al., 2008; Wang et al., 2008; Xu et al., 2009; Kang et al., 2010)

and the glacier retreat is accelerating (Yao et al., 2007). These changes over the TP are primarily attributed  
80 to increasing greenhouse gases (e.g., Duan et al., 2006; Ren et al., 2006), but other major factors could  
also contribute to these changes, such as absorbing aerosols (e.g., dust and black carbon), which can heat  
atmosphere and reduce the snow albedo (Kang et al., 2000; Lau et al., 2006, 2010; Xu et al., 2009). The  
intercontinental transport of dust aerosols originated from surrounding major deserts, i.e., Gobi and  
Taklamakan deserts on the northern side and Sahara and Arabian deserts on the western side, frequently  
85 attacks the TP (Huang et al., 2008; Liu et al., 2008) and greatly influences the regional climate over the  
TP (Lau et al., 2006; Wu et al., 2007). Meanwhile, the TP plays an important role in the dust global-scale  
transport through dynamical and thermal forcing in the mid-latitude (Xu et al., 2018). When dust plumes  
arrive at the TP, they are split into two branches and stack up around the slopes of the TP (Lau et al.,  
2006; Qin et al., 2016; Hu et al., 2019a); then dust particles climb to the TP due to the topographic  
90 uplifting. Because of the strong ability to absorb and scatter solar radiation, dust can heat up the air in  
the mid-to-upper troposphere (Lau et al., 2006; Lau and Kim, 2006; Nigam and Bollasina, 2010; D'Errico  
et al., 2015), which provides cyclonic conditions in the lower layer and induces dry convection over the  
TP (Ma et al., 2011; Xu et al., 2018). Under these conditions, dust particles can be more easily elevated  
into upper-troposphere and lower stratosphere, and then continue the long-range transport with a  
95 relatively longer lifetime in upper troposphere and lower stratosphere (Huang et al., 2008; Xu et al.,  
2018). Also, because of the rising of hot air induced by absorbing aerosol (e.g., dust, black carbon) over  
the TP, more warm and moist air is draw in Indian sub-continent, leading to an earlier onset of the South  
Asia summer monsoon and an intensification of the summer rainfall over the Indian subcontinent (Lau  
et al., 2006).

100 Although the long-range transport dust aerosols play an essential role in a rapid climate change over  
the TP, the characteristics of dust vertical distribution are not well studied, which are crucial to  
understanding the dust intercontinental transport (Bourgeois et al. 2015, Xu et al., 2018). Using the  
Cloud-Aerosol Lidar and Infrared Pathfinder Satellite Observation (CALIPSO) retrievals, Xu et al. (2018)  
shown that the dust particles were uplifted to the mid-tropospheric over the source region, and then  
105 transported eastward. When reached the TP, they were uplifted to the upper-troposphere with dust mass  
flux of about  $10^{10}$  g by dry and deep convections, which were prevailing in spring. Chen et al. (2013)  
addressed a dust storm occurred in Taklimakan Desert during 26–30 July 2007. They pointed out that a  
value of 6.6 Gg/day mass flux was brought into the TP and  $-5.58$ ,  $1.61$ , and  $-3.97$  W/m<sup>2</sup> of dust radiative

forcing were produced at the surface, in the atmosphere and at the top of the atmosphere, respectively.

110 However, we are not aware of studies on the dust source contributions at different altitudes over the TP.

In generally, many studies focused on dust events over the TP (Uno et al., 2004; Huang et al., 2007, 2008; Yumimoto et al., 2009, 2010; Chen et al., 2013). They showed that the dust could made an important impact on aerosol mass loading through all year with the largest efficiency in spring and summer (Uno et al., 2004; Huang et al., 2007, 2008; Chen et al., 2013). For example, Middleton (1986) 115 showed that the dust coupled with locally generated pollution aerosols from the Arabian Peninsula and Indian sub-continent was transported and loaded into the TP over the southern slop. The strength of the North African and Arabian Peninsula dust had significantly seasonal variability and it was observed to peak in summer (Liu et al., 2008; Alizadeh-Choobari et al. 2014; Jin et al., 2016). Huang et al. (2007) indicated that dust plumes originated from the nearby Taklimakan desert were lifted to a very high 120 altitude (7–10 km) over the northern slop. Chen et al. (2017) pointed that a dust storm occurred in 18–23 March 2010 brought dust aerosols from Taklimakan Desert dust (up to 0.8 ton/day) and Gobi Desert (up to 3.7 ton/day) into the TP. So far, however, few studies described the dust plumes transported into the TP on a climatological view. Moreover, although the dust global-scale transport has been studied using both observations and model simulations, the spatiotemporal characteristics of dust particle size and 125 number and their associated climatic impact are poorly understood (Zhao et al., 2013). The dust number could be used to determine the cloud condensation nuclei and/or ice nuclei (e.g., Liu and Penner, 2005; DeMott et al., 2010) and dust particle deposition (Zhao et al., 2013). Consequently, this could affect the precipitation through modifying the cloud formation and distribution over the TP (Huang et al., 2014; Li et al., 2016), and further change the hydrological cycle and influence the lives of people in South and 130 East Asia (Xu et al., 2009; Yao et al., 2012).

In this study, we implement a newly developed tracer-tagging method in Weather Research and Forecasting model with chemistry (WRF-Chem) to characterize the intercontinental transports of dust emitted from different major desert sources and quantify their contributions to the total dust mass loading over the TP (Wang et al., 2014; Hu et al., 2016, 2019a). A 6-year (2010-2015) quasi-global simulation is 135 conducted in the updated version of WRF-Chem. Hu et al. (2016, 2019a, 2019b) has shown that model results could well represent the dust intercontinental transport over East Asia and the Pacific Ocean compared with multiple observations. Here, our purposes are to (1) explore the transport characteristics of dust particles from different major deserts at different altitudes over the TP; (2) describe the dust

particle size distributions at different altitudes over the TP; (3) analysis the dust radiative forcing over  
140 the TP; (4) compare dust mass and number concentrations with other aerosols at different altitudes over  
the TP.

The model setup and satellite retrievals will be described in Section 2 and Section 3, respectively.  
In Section 4, we will evaluate the WRF-Chem simulated dust aerosol optical depth (AOD) at different  
altitudes over the TP against satellite observations. In Section 5, the main results will be presented,  
145 including the transport characteristics of dust from different source regions, the contribution of different  
major deserts to the dust mass and number at different altitudes over the TP, the dust mass flux import  
into and outflow from the TP and the dust radiative forcing. The conclusion is summarized in Section 6.

## 2 Model

### 2.1 WRF-Chem

150 In this study, the WRF-Chem model is updated at the University of Science and Technology of  
China (USTC) based on v3.5.1 (Zhao et al., 2013b, 2014; Hu et al., 2016), particularly, including the  
capability of quasi-global simulation and tracer source tagging (Hu et al., 2019a, 2019b). It incorporates  
Model for Simulation Aerosol Interactions and Chemistry (MOSAIC) aerosol scheme (Zaveri et al., 2008)  
and the Carbon Bond Mechanism (CBM-Z) photochemical mechanism (Zaveri and Peters, 1999) for  
155 simulating the complex photolysis rates and aerosol radiative properties (Fast et al., 2006). Eight size  
bins are used in the MOSAIC aerosol scheme to describe the aerosol size distributions by using the bin  
approach (Fast et al. 2006), which could better represent the spatial distribution of dust number and dust  
size loading than 3-mode and 4-bin approaches (Zhao et al., 2013b). Meanwhile, all major aerosol  
components including mineral dust, sulfate ( $\text{SO}_4^{2-}$ ), ammonium ( $\text{NH}_4^+$ ), nitrate ( $\text{NO}_3^-$ ), organic matter  
160 (OM), black carbon (BC) and sea-salt are simulated in the model to represent the sophisticated chemistry  
during the long-range transport. The aerosol physical and chemical processes in MOSAIC include  
coagulation, condensation, nucleation, water uptake, and aqueous phase chemistry. The approach of  
aerosol dry deposition including gravitational settling and turbulent diffusion follows Binkowski and  
Shankar (1995). Wet removal of aerosols induced by grid- precipitation and resolved stratiform clouds is  
165 simulated by the approach of Easter et al. (2004) and Chapman et al. (2009). The function of wavelength  
is used for aerosols optical properties of each model grid box. The aerosol longwave (LW) and shortwave

(SW) refractive indices use the Optical Properties of Aerosols and Clouds (OPAC) data set, except the dust SW refractive index, which is defined as  $1.53+0.003i$  following Zhao et al. (2010, 2011). Zhao et al. (2013a) implemented the aerosol radiative feedback for LW and SW radiation into WRF-Chem, which had been coupled with the Rapid Radiative Transfer Model (RRTMG) (Mlawer et al., 1997; Iacono et al., 2000).

## 2.2 dust emission

The dust emissions are simulated by the Goddard Chemistry Aerosol Radiation and Transport (GOCART) model (Ginoux et al., 2001), which has been fully coupled with the MOSAIC in WRF-Chem (Zhao et al., 2010). Zhao et al. (2010) and Hu et al. (2016, 2019a, 2019b) pointed that the model could well represent the dust emission distributions and long-range transport processes over the Northern Hemisphere. In GOCART, the dust emission flux  $G$  is calculated as:

$$G = CSs_p u_{10m}^2 (u_{10m} - u_t),$$

where  $C$  ( $\mu\text{g s}^2 \text{m}^{-5}$ ) is defined as a dimensionless empirical proportionality constant with the value of  $1.0 \mu\text{g s}^2 \text{m}^{-5}$  provided by Ginoux et al. (2001),  $S$  is soil erodibility calculated by a potential dust source function,  $s_p$  is a fraction of mass of each size bin of dust emissions,  $u_{10m}^2$  (m/s) is the horizontal wind speed at 10 m above the surface, and  $u_t$  is the wind speed threshold under which dust emissions do not occur and is a function of surface moisture, air density, and particle size. To match the particle size distribution in the aerosol scheme, the dust mass fractions are set to 45%, 26%, 6%, 1.5%, 0.2%, 0.02%,  $10^{-4}\%$ , and  $10^{-6}\%$ , respectively. The dust emissions within the research area are indicated in Figure 1a. Clearly, dust emission from the TP is much smaller than that of the Gobi and Taklamakan deserts, so the East Asian dust defined here is mainly contributed by that emitted from Gobi and Taklamakan deserts.

## 2.3 other emissions

The Hemispheric Transport of Air Pollution version-2 (HTAPv2) is used in the simulations as anthropogenic emissions with a monthly temporal resolution and  $0.1^\circ \times 0.1^\circ$  horizontal resolution (Janssens-Maenhout et al., 2015). The Fire INventory from NCAR (FINN) supplies biomass burning emissions with 1 km horizontal resolution and hourly temporal resolution (Wiedinmyer et al. 2011), and the vertically distribution is followed the injection heights suggested by Dentener et al. (2006). The Sea-salt emission is obtained from Jaeglé et al. (2011) depended on sea surface temperature and Gong et al.

195 (2003) based on the correction of particles with radius less than  $0.2 \mu\text{m}$ .

## 2.4 Numerical experiments

Following Hu et al. (2016), a quasi-global WRF-Chem simulation is performed at  $1^\circ$  horizontal resolution with  $360 \times 145$  grid cells ( $180^\circ \text{W}$ – $180^\circ \text{E}$ ,  $67.5^\circ \text{S}$ – $77.5^\circ \text{N}$ ) and 35 vertical layers up to 50 hPa over the period of 2010–2015 (Figure 1b). The lateral meridional boundary conditions and meteorological initial are obtained from the National Center for Environmental Prediction final analysis (NCEP/FNL) data at 6 h temporal and  $1^\circ$  horizontal resolution. In order to better modeling aerosol long-range transport, the nudged method is used to provide a more realistic atmospheric temperature and wind components (Stauffer and Seaman, 1990). In addition, a tracer-tagging method is used to tag and explicitly track dust particles during the intercontinental transport. In the model, four dust source regions are selected, i.e., East Asia ( $25^\circ \text{N}$  –  $50^\circ \text{N}$  and  $75^\circ \text{E}$  –  $150^\circ \text{E}$ ), North Africa ( $0^\circ \text{N}$  –  $40^\circ \text{N}$  and  $20^\circ \text{W}$  –  $35^\circ \text{E}$ ), North America ( $15^\circ \text{N}$  –  $50^\circ \text{N}$  and  $80^\circ \text{W}$  –  $140^\circ \text{W}$ ), and the elsewhere in the world (dominated by the Middle East in the Northern Hemisphere,  $0$  –  $50^\circ \text{N}$  and  $35^\circ \text{E}$  –  $75^\circ \text{E}$ ). The dust particles emitted from the four source regions are tagged and explicitly tracked using additional model variables within a single simulation in the model following Hu et al. (2016, 2019a, 2019b) and Mao et al. (2019). During the model simulation, the physical and advective tendencies of all tagged dust variable are treated in the same way. Therefore, the contribution of a dust source to the dust property in a receptor region is defined by the ratio of the dust property in the receptor region from the dust source to the dust property of all sources combined. This direct tagging technique neither introduces aerosol source perturbations to the model nor employs assumptions for aerosol sources/sinks along the transport pathways (Hu et al., 2019a; Mao et al., 2019). Zhao et al. (2013b) pointed that the updated model could better simulate the distribution of aerosol size and number and gave more detailed information about the horizontal and vertical distribution of aerosols and the aerosol intercontinental transport process. More detailed information on numerical experiment, included physical and chemical schemes, can be found in Hu et al. (2016).

## 3 Satellite retrievals

### 220 3.1 MODIS

The AOD datasets obtained from Moderate Resolution Imaging Spectroradiometer (MODIS)

instrument onboard the NASA EOS Terra satellite is used to evaluate model simulations. It provides datasets with daily and  $1^\circ \times 1^\circ$  resolution for a period of 2010–2015. In order to qualify better presumably AOD, the “dark target” algorithm is used to retrieve aerosol size parameters and AOD over vegetated and waters lands (Kaufman et al., 1997; Remer et al., 2005), and the “deep blue” algorithm is used to retrieve the AOD over vegetated land and bright targets (Hsu et al., 2006, 2013). The uncertainties in the merged AOD (at 550 nm) from MODIS collection 6 are about 0.11 over global and 0.069 over the North-East Asia (Sayer et al., 2014) when compared with AEROSOL ROBOTIC NETWORK (AERONET) observations. In this study, the “dark target” AOD over ocean and “deep blue” AOD over land are merged in MODIS collection 6.

### 3.2 MISR

The AOD from Multi-angle Imaging SpectroRadiometer (MISR) aerosol Level 2 version 23 is also used. MISR instrument onboard the Terra spacecraft is designed to view the Earth using nine separate cameras. Four spectral bands (centered at 446, 558, 672 and 866 nm) are measured along the orbital track angles with the ranging from  $\pm 70.5^\circ$  (Diner et al., 1998). They can provide well retrieval AOD daily products (Level 2) with a spatial resolution of  $0.5^\circ \times 0.5^\circ$ , especially over highly reflective surfaces such as deserts (Martonchik et al., 2002). The uncertainties in MISR AOD (version 23) is about 0.049, which is more realistic than 0.003 uncertainty in version 22 products (Witek et al., 2017). Here, we compare the MISR AOD at 550 nm from Level 2 with the model results. It is noticed that the model results are sampled in the same time of MISR overpass.

### 3.3 CALIPSO

The aerosol extinction profiles retrieved by the Cloud-Aerosol Lidar with Orthogonal Polarization (CALIOP) are used in this study. It was launched into a Sun-synchronous orbit onboard CALIPSO satellite on 28 April 2006. The vertical profiles of attenuated backscatter can be acquired during both night and day phase (Winker et al., 2007). The CALIPSO Level-3 profile products, which are retrieved from Level-2 aerosol profile datasets through a quality-screened, are used to evaluate the model. For the CALIPSO aerosol extinction retrievals, the uncertainties are mainly determined by the lidar ratio and the misclassification of aerosol type (Winker et al., 2009). Yu et al. (2010) reported that the fraction uncertainty of the lidar ratio is about 30%, which could result in an AOD fraction uncertainty

250 of about 50% (for the AOD is about 0.5). Moreover, the dust extinction at 532 nm with the vertical resolution of 60 m (from -0.5 to 12 km) and the spatial resolution of  $5^\circ \times 2^\circ$  (longitude  $\times$  latitude) is used. In this study, the CALIOP nighttime observations are used to compared with the dust extinction profiles of model in cloud-free condition, because the CALIOP are influenced by less noises during nighttime than daytime (Winker et al., 2010).

#### 255 **4 Evaluation of AOD and dust AOD simulated by WRF-Chem**

Figure 2 illustrates the spatial distributions of the observed (MODIS and MISR onboard Terra) and modeled (WRF-Chem simulation) seasonal AOD at 550 nm for the period of 2010–2015. The simulated AOD is interpolated at 550 nm by using the Ångström exponent from 400 nm and 600 nm results due to the wavelength discrepancy between simulations and observation. Also, we extract and average the simulated AOD at 10:30 LT (local time) to match the MISR and MODIS retrievals. Because of the missing values of satellite retrievals, there are blank areas over the ocean, which are relatively larger in JJA (Hu et al., 2016). The MODIS retrievals show a higher AOD over anthropogenic polluted regions (i.e., Eastern China and Southern India) and the major desert regions (i.e., Sahara, Arabian, Gobi and Taklamakan desert) than the MISR retrievals and model simulations. This is partly because the MODIS retrievals overestimate the AOD magnitude in semi-arid regions due to the large uncertainties associated with the assumed surface reflectance (Remer et al., 2005; Levy et al., 2013). Relatively, the MISR characterizes a better land surface reflectance and retrieves better quality presumably. Moreover, the simulation overestimated the AOD over the North African deserts and the northern Pacific with the peak value (about 0.16) in spring (MAM) (Fig. S1). Over the TP, the simulation AOD is smaller than that of MISR and MODIS, and the difference is about -0.08. Overall, the WRF-Chem simulated mean AOD shows consistent spatial pattern when compared with MISR and MODIS retrievals. The spatial correlation coefficients of AOD are about 0.65 and 0.79 for MODIS and MISR, respectively. The seasonal variabilities of spatial correlation coefficients between the simulation and MODIS (MISR) are 0.55 (0.62), 0.63 (0.66), 0.63 (0.68), and 0.67 (0.75) for winter (DJF), MAM, JJA, and autumn (SON), respectively. Over the dust source regions, the simulated results are closer to the MISR retrievals with the largest AOD (more than 0.6) with the correlation coefficient of about 0.87. The trans-Pacific transport of East Asian aerosols and trans-Atlantic transport of Saharan dust are also well simulated, which is

consisted with the studies of Hu et al. (2016) and Yu et al. (2010, 2012). The model also captures the seasonal variabilities of AOD over the major desert regions shown in the satellite retrievals. The maximum AOD over North Africa and Middle East appears in JJA, while that over East Asia is in MAM .

Globally, the dust emissions often occur over source regions with the terrain elevation generally below 3 km and then they can be lifted into upper-troposphere (Yu et al., 2008). By using the CALIPSO retrievals, Xu et al. (2018) studied the dust transport at different attitude and found that the TP had an important impact on global dust long-range transport on the upper-troposphere. In order to evaluate the model results, we compare the spatial distribution of annual dust AOD from WRF-Chem between 0–3 km, 3–6 km, 6–9 km, and 9–12 km with the CALIPSO results (Figure 3). It shows that the model simulations reasonably reproduce the spatial distributions of dust AOD at different altitudes with correlation coefficients of 0.71 (0-3 km), 0.86 (3-6 km), 0.49 (6-9 km), and 0.32 (9-12 km), respectively. The maximum dust AOD appears around the dust sources between 0–3 km with a peak value of 0.6, in which the overestimate of simulation (more than 0.06) is over the North African deserts and the underestimate (less than -0.06) is over Middle East and India (Fig. S2). Between 3-6 km, the difference have similar spatial distributions in 0-3 km. The positive difference is about 0.02 over the North African deserts, and the negative difference is about -0.02 over southern Arabian Peninsula, Somali Peninsula and the northern slop of the TP (Fig. S2). Between 6–9 km and 9–12 km, the modeled AOD are higher than CALIPSO with the positive difference of 0.001~0.01 (Fig. S2). Between 6–9 km and 9–12 km, the modeled DOD are higher than CALIPSO, which is possibly induced by model biases, such as those related to circulation condition.

## 5 Result

### 5.1 Characteristics of dust transport from different source regions

The TP is surrounded by several large deserts in the world. On the northern side, the major deserts of Taklimakan and Gobi emit mineral dust particles that can be transported into the TP and elevated to a very high altitude, i.e., approximately 4–7 km (Huang et al., 2007) in most years and up to 12 km during some extreme conditions (Liu et al., 2008). Also, the dust particles from deserts on the western side (i.e., Thar desert, Middle East desert) could be brought into the TP by the westerlies (Jin et al., 2016; Lau et al., 2016). Hu et al. (2019a) has pointed out that the North African dust mixes with the Middle East dust

before importing into East Asia. In order to better describe the impact of dust from different sources over the TP, the horizontal spatial distributions of annual mean dust mass loading emitted from East Asia (Figure 4a), North Africa (Figure 4b) and Middle East (Figure 4c) are illustrated. Clearly, The East Asian dust dominates the northern slope of the TP and even extends to the southern TP. Meanwhile, the dust mass loading decreases with altitude. In 0–3 km, the maximum dust mass loading occurs over the source regions with the value more than 200 mg/m<sup>2</sup>. In 3–6 km, dust can climb up to the TP and even reach the southern edge of the TP. Over the northern slope, the dust mass loading is about 50 and 10 mg/m<sup>2</sup> in 3–6 km and 6–9 km, respectively. In 9–12 km, the dust (5 mg/m<sup>2</sup>) appears over the TP due to the effect of the TP orography. Compared with other sources, the East Asian desert contributes more than 90% in 0–3 km over the northern slope of the TP. In 3–6 km, the contribution from East Asian dust is dominated the north of 35° N with the contribution of about 80%. However, the contribution decreases to 40% above 6 km because of the mixing of dust particles from North Africa and Middle East (Figure 4b and 4c). It is worth noting that there are significant dust plumes over the TP (Figure 3), especially the northeast region. This dust transport can be attributed to the effect of the TP, which could provide more favorable conditions (i.e., cyclonic and dry convection) to make dust uplift into upper-troposphere (Xu et al., 2018).

The North African dust can be transported westward across Atlantic Ocean by African Easterly Waves, which is the major global dust long-range transport, and has been addressed by many studies (e.g., Liu et al., 2008; Su and Toon, 2011; Nowotnick et al. 2011; Ben-Ami et al., 2012; Yu et al., 2013). Beyond that, the North African dust could be transported into Europe (Park et al., 2005; Lee et al., 2010) and Middle East (Hu et al., 2019a). Hu et al. (2019a) pointed out that the North African dust mixed with the Middle East dust could be transported eastward and imported into East Asia. During the eastward transport, the TP stands on the way and plays an important role to affect the dust transport and vertical distribution over the TP. Clearly, the TP can affect the dust intercontinental transport and split it into two branches below 6 km (Figure 4b). When above 6 km, the major transport dust appears over the northern branch and this can be attributed to the easterlies northward shift (Yu et al., 2008). Meanwhile, more wet deposition induced by Indian summer monsoon rainfall over the southern branch can reduce the dust transport. The North African dust brought 10 mg/m<sup>2</sup> mass loading over the southern slope below 3 km, but the dust can reach the northern slope with the value of 10 mg/m<sup>2</sup> in 6–9 km. Compared with the East Asia, North Africa dominates the contribution above 6 km with the value of 40%.

Similar to the North African dust eastward transport, the Middle East dust can also be transported

into East Asia (Hu et al., 2019a). Over the TP, the dust mass loading is about  $50 \text{ mg/m}^2$  in 3–6 km, which are concentrated in both southern and northern slopes (Figure 4c). In the higher altitude, the dust can overpass the TP with  $10 \text{ mg/m}^2$  in 6–9 km and  $5 \text{ mg/m}^2$  in 9–12 km. Also, the Middle East dust is transported over the  $30^\circ \text{ N}$  to north and this is similar with the North African dust above the 6 km.

340 Different with North Africa and East Asia, the contribution from Middle East dust is concentrated over the southern slope of the TP, and the value decreases with the altitude. Below 3 km, the maximum contribution value occurs over the source region (more than 90%). In 3–6 km, the contribution is about 80% over the southern slope, and the value reduces to 60% in 6–12 km.

Figure 5 illustrates the annual mean wind field in the horizontal (denoted by arrows) and vertical directions (indicated by the colors) at various altitudes from WRF-Chem simulations for the period of 2010–2015. The positive (negative) value of vertical wind velocity is shown as an updraft (downdraft). In 0–3 km, the updrafts appear over major dust source regions, i.e., Sahara desert, Arabian desert, Thar desert, and Gobi and Taklamakan desert. Because of the updrafts, dust particles emit into the atmosphere over the sources and then transport to downwind regions (Figure 4a, 4b, and 4c). In 3–6 km, a significant updraft occurs around the TP, especially over the southern slope. Therefore, the dust from Middle East and North Africa accounts for more fraction contribution than the northern slope. In 6–9 km and 9–12 km, the updraft wind over the TP reaches  $0.012 \text{ m/s}$ , which is greater than the vertical wind velocity over the surrounding areas. The reason could be attributed to the dynamical (Huang et al., 2008, Liu et al., 2008) and thermal forcing due to the TP (Lau et al., 2006) on the atmospheric flows. Under these updraft conditions, the dust particles can be brought into the upper-troposphere ( $\sim 12 \text{ km}$ ), which is consistent with the results from CALISPO observation (Liu et al., 2008). Also, the horizontal and vertical wind has significant seasonal variability (Fig. S3). In the 0–3 km, the maximum updrafts appear in JJA over major dust source regions, followed by MAM. Over the TP, the updrafts are clearly in JJA, while the downdrafts are dominated in DJF. In MAM and SON, the updrafts and downdrafts occur in a spatially uniform way.

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360 Additionally, the vertical wind is ascending at 3–6 km in the south fringe of the TP across all seasons, while the vertical wind is descending above 6 km in the DJF, MAM and SON.

To describe the transport characteristics of dust from various deserts, we analyze the vertical cross-sections of meridional circulation and zonal dust mass concentration at  $75^\circ \text{ E}$ ,  $90^\circ \text{ E}$  and  $102^\circ \text{ E}$ , respectively (Figure 6). The three longitudes crossed the TP are denoted by purple solid lines in figure 4a. Clearly, strong dust mass from East Asia and Middle East is accumulated over the northern and

365

southern slope of the TP, then lifted up to the TP due to the orographic lifting. The East Asian dust lifts up to the TP from its northern slope, and the Middle East dust is major from the southern slope. Also, the strong northwesterly can transport the East Asian dust continuously eastward (Liu et al., 2015) and the dust mass concentration increases significantly from 75° E to 102° E. The Middle East dust imports into the TP along with the westerly wind, but the dust mass concentration decreases from 75° E to 102° E. The vertical-latitude cross-section of the modeled dust mass concentration centered at 90° E suggests that the dust particles can lift up to 9 km with the concentration value of 2  $\mu\text{g}/\text{m}^3$ , especially for the Middle East dust (higher than 10 km). Different from the East Asian and Middle East dust, the North African dust has a peak mass concentration ( $\sim 4 \mu\text{g}/\text{m}^3$ ) in the 3–8 km (at 90° E) after imported into the TP.

Figure 7 shows the vertical-longitude cross-section at 24° N, 36° N and 38° N of zonal circulation and meridional dust mass concentration from the WRF-Chem simulation for the period of 2010–2015. These latitudes are the same as Xu et al. (2018) (Figure 4b), which can well represent the dust zonal transport over the TP. The maximum East Asian dust mass concentration is located in the 80° E – 120° E, and the North African and Middle East dust are in 20° W – 40° E and 30° E – 80° E, respectively. These distributions are consistent with their source regions. The dust emitted from East Asia lifts up to the TP at 38° N with the peak mass concentration of 40  $\mu\text{g}/\text{m}^3$ , then arrives over the TP (at 36° N) with a value of 2–10  $\mu\text{g}/\text{m}^3$ . After passing through the TP, there are very few dust particles over the southern slope of the TP. Because the dust from North Africa and Middle East is mainly concentrated over 30° N to north, the eastward transport of dust particles is not significant. At the 36° N and 38° N, the dust eastward transport is larger with two peaks on both sides of 100° E. These peak values are attributed to the updraft wind on the western side and downdraft on the eastern side in the westerly circulation.

Overall, the East Asian dust is lifted up to the TP over the northern slope and the Middle East dust is over the southern slope (Figure 4a and 4b). However, the North African dust is important into the TP in a higher altitude (Figure 5). Above 3 km, the westerly wind is affected by the TP, which results in that the major transport pathway of dust is over the north of 30° N (Figure 4a, 4b and 4c). In the higher altitude (above 6 km), the major contributor of dust over the TP is the Middle East dust with a value of 60%. Obviously, the dust particles can be brought to 9 km under the TP orographic effect (Figure 5).

## 5.2 Dust mass flux inflow and outflow from the TP

The annual dust mass flux imported into or outflowed from the boundaries of the TP at various

395 altitudes is shown in Figure 8. In order to better describe the dust mass flux imported into or outflow  
from the TP, we use meridional wind to calculate the dust mass flux at West (75° E) and East (104° E)  
side with the latitude range of 27° N - 38° N, and use zonal wind to calculate the dust mass flux at North  
(38° N) and South side (27° N) with the longitude range of 75° E - 104° E, respectively. The annual dust  
mass imported into the TP from the West side is dominated by the Middle East dust (26.6 Tg/year),  
400 followed by the North African dust (7.8 Tg/year). The Middle East dust mass flux decreases from 12.3  
Tg/year (0–3 km) to 1.2 Tg/year (9–12 km) with the altitude. The North African dust mass flux increases  
from the surface to 9 km with a peak value of 3.3 Tg/year. In 9–12 km, the North African dust mass flux  
(1.4 Tg/year) is greater than Middle East (1.2 Tg/year). At East side, the dust is mainly outflowed from  
the TP with a peak value (8.7 Tg/year) in 6–9 km. Impacted by East Asian dust, the dust mass flux at  
405 North side is dominated by the East Asian dust with a peak value (6.2 Tg/year) in 3–6 km, followed by  
0–3 km (3.1 Tg/year). In 6–9 km, the North Africa contributes about 1.1 Tg/year, while the East Asia is  
–0.9 Tg/year (outflow) due to the westerly wind shift to north (Figure 5). In 9–12 km, the East Asian dust  
mass flux is –0.5 Tg/year. At South side, the dust is mainly outflow from the TP with the maximum value  
from Middle East (–10.4 Tg/year) below 6 km. The Middle East (North Africa) mass flux is about –5.0  
410 (–0.5) Tg/year in 0–3 km and –4.2 (–0.6) Tg/year in 3–6 km.

Although most case studies of dust aerosols have been focused on the late spring and early summer  
over the TP (Huang et al., 2008; Chen et al., 2013; Liu et al., 2015), seasonal variabilities of long-range  
transport dust at different altitude are not well understood. Figure 9 shows the model-based estimation  
of dust annual mass flux between 0–3 km, 3–6 km, 6–9 km and 9–12 km over the TP for the period of  
415 2010–2015. **It should be noted that the TP is defined as 27° N – 38° N and 75° S – 103° S (Fig. S4), which  
shows that some areas within the TP domain have altitude of smaller than 3 km.** Clearly, the dust mainly  
imports into the TP below 6 km. In 0–3 km, the peak inflow and outflow are in JJA and MAM, with the  
flux of 7.2 Tg and 2.1 Tg, respectively. The weakest inflow (outflow) is in DJF, with a magnitude of 0.82  
Tg (0.6 Tg) of the mass flux. In 3–6 km, the inflow and outflow is the greatest in MAM. The maximum  
420 value is 8.9 Tg and 4.4 Tg, respectively. Differently, the second greatest inflow is in JJA (5.6 Tg), but the  
outflow is in DJF (2.7 Tg). The minimum season is SON, with the mass flux of 2.0 Tg (inflow) and 1.5  
Tg (outflow). In 6–9 km, the peak value is in MAM with a mass flux of 4.6 Tg (inflow) and 5.3 Tg  
(outflow), followed by DJF (2.2 Tg for inflow and 2.4 Tg for outflow). In 9–12 km, the peak value occurs  
in MAM with the inflow mass flux of 1.8 Tg and the outflow mass flux of 2.7 Tg, which accounts about

425 50% and 54% of the annual flux, respectively. Moreover, we can see that the outflow is greater than the inflow above 6 km while the inflow is greater than the outflow below 6 km especially in 9–12 km due to the effect of the TP topographic.

### 5.3 Characteristics of size distribution of dust over the TP

Dust size representation can significantly influence dust mass balance in the atmosphere and dust  
430 dry/wet deposition (Zhao et al., 2013b). In order to better understanding the dust particle characteristics over the TP, the vertical distribution of dust mass vs. dust particle size from 0.039 to 10.0  $\mu\text{m}$  over the TP is analyzed in Figure 10a. Obviously, dust mass vertical distribution vs. dust size has significant seasonal and altitudinal variabilities. The East Asian dust is dominated in the size range of 1.25–10.0  $\mu\text{m}$  above 1 km, in which the maximum dust mass concentration (up to 4  $\mu\text{g}/\text{m}^3$ ) ranges in the size of 2.5–5.0  
435  $\mu\text{m}$  with a peak in MAM, followed by the JJA. This is consistent with previous studies that Taklimakan Desert has a peak emission rate of dust in MAM (i.e., Huang et al., 2008, 2013; Chen et al., 2013; Liu et al., 2015). The North African dust mass is mainly in the range of 1.25–5.0  $\mu\text{m}$ , which is smaller than that of East Asia and Middle East. This is likely attributed to the larger particles scavenged easier by dry/wet deposition during dust intercontinental transport, and fine particles can be more easily transported and  
440 reside in the atmosphere. Also, the maximum dust mass concentration is centered at 2.5  $\mu\text{m}$  and these particles can reach about 9 km in the MAM, followed by the DJF. Similar with the East Asian dust, the Middle East dust mass is concentrated in the size range of 1.25–10.0  $\mu\text{m}$  below 3 km, in which the maximum mass concentration ranges in the size of 1.25–5.0  $\mu\text{m}$  with a peak (up to 10  $\mu\text{g}/\text{m}^3$ ) in MAM, followed by the JJA. Above 3 km, the Middle East dust has similar seasonal and vertical distribution in  
445 different particle size to the East Asian dust, both of which can reach 12 km.

Beside dust mass and AOD, dust number is another critical factor to influence the ice nuclei concentration number (e.g., Phillips et al., 2008; DeMott et al., 2010), and determines the distribution of cloud, radiation, and precipitation (Zhao et al., 2013a). By comparing dust number loading from three different approaches of representing dust size distribution (8-bin, 4-bin, and 3-mode), Zhao et al. (2013b)  
450 pointed that 8-bin approach could better represent the dust number distribution in different size. In this study, we use the MOSAIC aerosol scheme with 8-bin to simulate long-range transport of dust particles. Figure 10b shows the vertical distribution of dust number vs. particle size from 0.039 to 10.0  $\mu\text{m}$  over the TP. It suggests that dust number has similar seasonal variability with the dust mass vs. dust particle

size. However, the size range is different for the dust from various sources over the TP. The East Asian  
455 and North African dust number are dominated in the range of 0.156~1.25  $\mu\text{m}$ , but the Middle East dust  
number is fell in a broader range of 0.078~2.5  $\mu\text{m}$ . Compared with the dust mass, dust number loading  
over the TP is mainly in smaller particle size. This is likely due to easier suspension and long-range  
transport of smaller dust particles (Chin et al., 2007). The East Asian dust number concentration over the  
TP is mainly in 2~8 km with a peak ( $\sim 0.4 \text{ mm}^{-3}$ ) in MAM, and has the smaller dust number concentration  
460 compared with other sources. While the North African and Middle East dust number concentration have  
a broader vertical distribution, even reach to 12 km. For the Middle East dust number, there is a  
significant peak value occurred (more than  $1 \text{ mm}^{-3}$ ) below 4 km, which is larger than other sources. This  
result implies that the dust from Middle East could contribute more particles in the dust number, which  
could influence the regional cloud and precipitation.

465 Figure 11 shows the spatial distribution of dust number loading between 0–3 km, 3–6 km, 6–9 km  
and 9–12 km. Clearly, the dust number concentration reduces from west to east, but the gradient is smaller  
than that of dust mass due to a faster removal rate of mass in general (Zhao et al., 2013b). Between 0–3  
km, the greatest dust number appears over the source regions (i.e., Sahara desert, Arabian desert, Thar  
desert, Gobi and Taklamakan desert) with a value of  $0.08 \mu\text{m}^{-2}$ . Between 3–6 km, dust number loading  
470 reduces and a value of  $\sim 0.008 \mu\text{m}^{-2}$  appears over the TP. The dust number loading increases ( $\sim 0.02 \mu\text{m}^{-2}$ )  
due to the orographic effect, which is consistent with the dust AOD distribution in 6–9 km (Figure 3).  
In 9–12 km, there is a peak in dust number over the north of the TP with a value of  $\sim 0.008 \mu\text{m}^{-2}$ .

#### 5.4 Dust radiative forcing over the TP

475 Figure 12 shows the spatial distribution of annual mean SW, LW, and net (SW + LW) direct radiative  
forcing of dust at the TOA, in the atmosphere (ATM) and at the surface (SFC) from the WRF-Chem  
simulations averaged for 2010–2015. Over the TP, the dust SW radiative forcing is negative at TOA with  
a value around  $-0.5 \text{ W/m}^2$ , which is far less than the value over the desert regions due to the high dust  
albedo and absorbing capability (Zhao et al., 2011). Because of dust LW absorption, the dust LW radiative  
480 forcing at TOA is warming with a positive value of  $0.5 \text{ W/m}^2$ . Overall, the dust net radiative forcing at  
TOA have a cooling effect. In the atmosphere, the dust warms the atmosphere through absorbing SW and  
cools the atmosphere by increasing atmospheric outgoing LW radiation. Dust produces a net warming

effect with a value of  $0.5 \text{ W/m}^2$  over the TP. At the surface (SFC), the dust induces a cooling effect by reducing downward SW radiation and a warming effect by trapping the LW radiation emitted from surface. Moreover, the dust net radiative forcing is negative and cooling the surface. The seasonal and annual mean SW, LW, and net radiative forcing of dust simulated by WRF-Chem over the TP are summarized in Figure 14. The dust significantly cools the TOA and SFC, and warms the atmosphere with a peak effect in MAM, because of larger dust mass concentration in this season over the TP (Hu et al., 2019a). Also, the annual dust SW radiation forcing is  $-1.40 \text{ W/m}^2$  (TOA),  $0.67 \text{ W/m}^2$  (ATM) and  $-2.08 \text{ W/m}^2$  (SFC), which is far larger than dust LW radiation forcing ( $0.13 \text{ W/m}^2$  (TOA),  $-0.26 \text{ W/m}^2$  (ATM) and  $0.39 \text{ W/m}^2$  (SFC)). Overall, the dust-induced change of net radiation forcing is  $-1.28 \text{ W/m}^2$  at the TOA,  $0.41 \text{ W/m}^2$  in the ATM and  $-1.68 \text{ W/m}^2$  at the SFC over the TP. The annual mean radiative effect of dust is less than the results from Chen et al. (2013), which investigated the dust radiative forcing under an intense dust storm event.

## 5.5 Comparison between dust and other aerosols at different altitudes over the TP

Figure 14 shows the vertical distribution of seasonal AOD, aerosol mass and aerosol number over the TP. Significantly, AOD, aerosol mass and aerosol number decrease with the altitude. In 0–3 km, the peak AOD (0.24) is in JJA, but the peak aerosol mass ( $88 \mu\text{g/m}^2$ ) and number ( $7.2 \mu\text{m}^{-2}$ ) are in MAM. While, above 6 km, the effect of aerosols has a peak in MAM. Also, the aerosol mass and number have a larger decrease from surface to 6 km. In the 6–12 km, the weaker decreasing indicates that dust and sulfate particles have less decrease, which account for more than 50% in total aerosols (Figure 15). In the higher altitude (9–12 km), there is no obvious seasonal changes for the aerosols.

In order to explore the relative contribution of dust, the fraction from dust and other components is shown in Figure 15. Clearly, the fraction of dust AOD shows an increasing trend with altitude. The dust AOD fraction has significant seasonal variabilities in different altitude with a peak in MAM. For aerosol mass, the dust fraction is more than 50% in MAM (57%) and JJA (65%) due to the maximum dust intercontinental into the TP in 0–3 km. Above 3 km, the dust mass contribution fraction is more than 55%. The maximum contribution value occurs in 6–9 km in all seasons, except JJA (occurred in 3–6 km). However, the dust number contribution can be ignored. The major components for aerosol number are sulfate, OM and other aerosols. The sulfate number contribution increases with the altitude, but the OM decreases. In 0–3 km, the OM contributes the greatest number with the value more than 40%. In 3–9 km,

other aerosols contribute about 40% number. In 9–12 km, the sulfate contributes more than 45% number.

## 6 Conclusions and Discussion

In this study, we conduct a quasi-global WRF-Chem simulation and implement a newly developed  
515 tracer-tagging method, which divide the global deserts into four source regions and explicitly on-line  
track the emission, transport and deposition of the dust particles. Using this method, we investigate dust  
source, intercontinental transport and radiative forcing at the different altitudes over the TP for the period  
of 2010–2015. The main conclusions are summarized below:

1. The spatial and seasonal variability of AOD can be well capture by the model simulation. The  
520 observation and simulated results show that the maximum AOD appeared over North Africa,  
Middle East and Central Asia in JJA, but in MAM over East Asia. Also, the model has a reliable  
representation of spatial distribution of dust AOD at different altitudes compared with the  
CAIPSO retrievals. The maximum dust AOD appears around the dust sources with a peak value  
of 0.6.
2. Lifted by updrafts, dust particles are emitted into the atmosphere over the major desert regions,  
525 and then transport to downwind regions. The East Asian dust transports southward and climbs  
up to the TP over the northern slop with the mass loading from 50 (at 3 km) to 5 (at 12 km)  
mg/m<sup>2</sup>. The North African dust transports eastward under the westerly wind, mixes with the  
Middle East dust, and then imports into East Asia. However, the TP stands on the way and splits  
530 the dust plumes into two branches. The North African dust imports into the TP over the northern  
slop with the mass of 10 mg/m<sup>2</sup> below 6 km. While, the Middle East dust concentrates over the  
southern slop with the dust mass loading of ~50 mg/m<sup>2</sup> below 6 km, and overpasses the TP with  
mass loading of 5–10 mg/m<sup>2</sup> above 6 km. Overall, the East Asia contributes more dust mass  
over the northern slop, and the Middle East contributes more dust mass over the southern slop.  
535 In the higher altitude (above 6 km) over the TP, the major contributor is Middle East with a  
value of 60%.
3. On an annual basis, the Middle East dust and North African dust mainly imports into the TP at  
the West side with the mass flux of 26.6 and 7.8 Tg/year, while the East Asian dust imports into  
the TP at North side with the mass flux of 8.0 Tg/year. The mass flux of different source dust

540 outflow the TP from the East and South side is  $-5.4$  (East Asia),  $-6.2$  (North Africa),  $-6.4$   
(Middle East) Tg/year, and  $-0.2$  (East Asia),  $-1.3$  (North Africa),  $-9.7$  (Middle East) Tg/year,  
respectively. The greatest dust mass flux imported into and outflowed from the TP is in 3–6 km.  
Also, the imported and outflowed dust mass flux are mainly occurs in MAM. The peak values  
are 8.9 Tg (inflow) and 4.4 Tg (outflow) in 3–6 km, and 6.4 Tg (inflow) and 8.0 Tg (outflow)  
545 above 6 km.

4. The dust can be brought into 9 km under the effect of the TP orography. Inside, the East Asian  
dust mass is dominated in the size range of  $1.25\sim 10.0\ \mu\text{m}$  in spring (MAM), followed by the  
JJA. While, the North African and Middle East dust mass are mainly in the range of  $1.25\sim 5.0$   
 $\mu\text{m}$  and the dust particles can reach to 12 km, but the Middle East dust take more mass fraction.  
550 For the dust number, the East Asian and North African dust are dominated in the range of  
 $0.156\sim 1.25\ \mu\text{m}$ , but the Middle East dust number is fell in  $0.078\sim 2.5\ \mu\text{m}$ . Relatively, the East  
Asian dust number over the TP is mainly in 2–8 km, while the North African and Middle East  
dust number are broader, even reaches to 12 km.

5. For the radiative forcing, dust produces the annual mean SW, LW and net (SW + LW) radiation  
555 forcing is  $-1.40$ ,  $0.13$ , and  $-1.27\ \text{W/m}^2$  at the TOA,  $0.67$ ,  $-0.26$  and  $0.41\ \text{W/m}^2$  in the atmosphere,  
and  $-2.08$ ,  $0.39$  and  $-1.69\ \text{W/m}^2$  at the surface over the TP, respectively. For the aerosol mass,  
the dust contribution fraction more than 50% in MAM (57%) and JJA (65%) due to the  
maximum dust intercontinental into the TP in 0–3 km. Above 3 km, the dust mass contribution  
fraction more than 55% with a peak contribution in 6–9 km. However, there is smaller  
560 contribution for total aerosols dust number compared with sulfate, OM and other aerosol  
particles in the column. For the aerosol optical characteristics, the fraction of dust AOD has an  
increasing trend with altitude, while the dust AOD is decreasing.

The WRF-Chem quasi-global simulation not only captures the spatial and seasonal variabilities of  
dust long-range transport but also tags the dust particle loading into the TP from different major deserts  
565 over North America, East Asia, North Africa and the elsewhere in the world (mainly for Middle East).  
The dust from Gobi and Taklimakan and desert transport southward and is lifted up to the TP from  
northern slop. While, dust from North Africa and Middle East transports eastward and then lifts up to the  
TP from both the northern and southern slops. Under the effect of TP and strong Indian summer monsoon,  
the dust particles can reach the upper-troposphere (above 8 km) and even lower-stratosphere. This study

570 proposes a pathway for dust transport into the upper-troposphere, and provides a climatological view  
about the intercontinental transport characteristics of dust from different source regions over the TP. Also,  
this study explores the dust particle size and number distribution over the TP, and shows that the dust  
number has smaller contribution for total aerosols number compared with sulfate, OM and other  
anthropogenic aerosols in the column. Our results are important to understand the source contribution of  
575 the dust over TP and the dust belt formation over the Northern Hemisphere. However, the impact of dust  
aerosols on cloud properties and precipitation, and the diabatic heating of dust over the TP are not  
discussed, which will be investigated in future studies.

580 **Code availability**

The release version 3.5.1 of WRF-Chem can be download from [http://www2.mmm.ucar.edu/wrf/users/download/get\\_source.html](http://www2.mmm.ucar.edu/wrf/users/download/get_source.html). The updated model is available to contact the first author ([huzy@lzu.edu.cn](mailto:huzy@lzu.edu.cn)). Also, the code modifications will be incorporated the release version of WRF-Chem.

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**Author contributions**

Zhiyuan Hu and Chun Zhao conducted the quasi-global simulations. Zhiyuan Hu performed the analyses, wrote the paper and coordinated the paper. All authors contributed to the final version of the paper.

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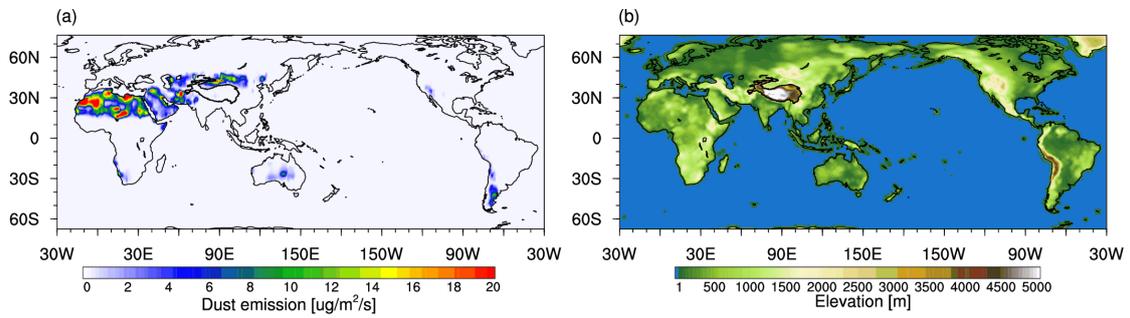
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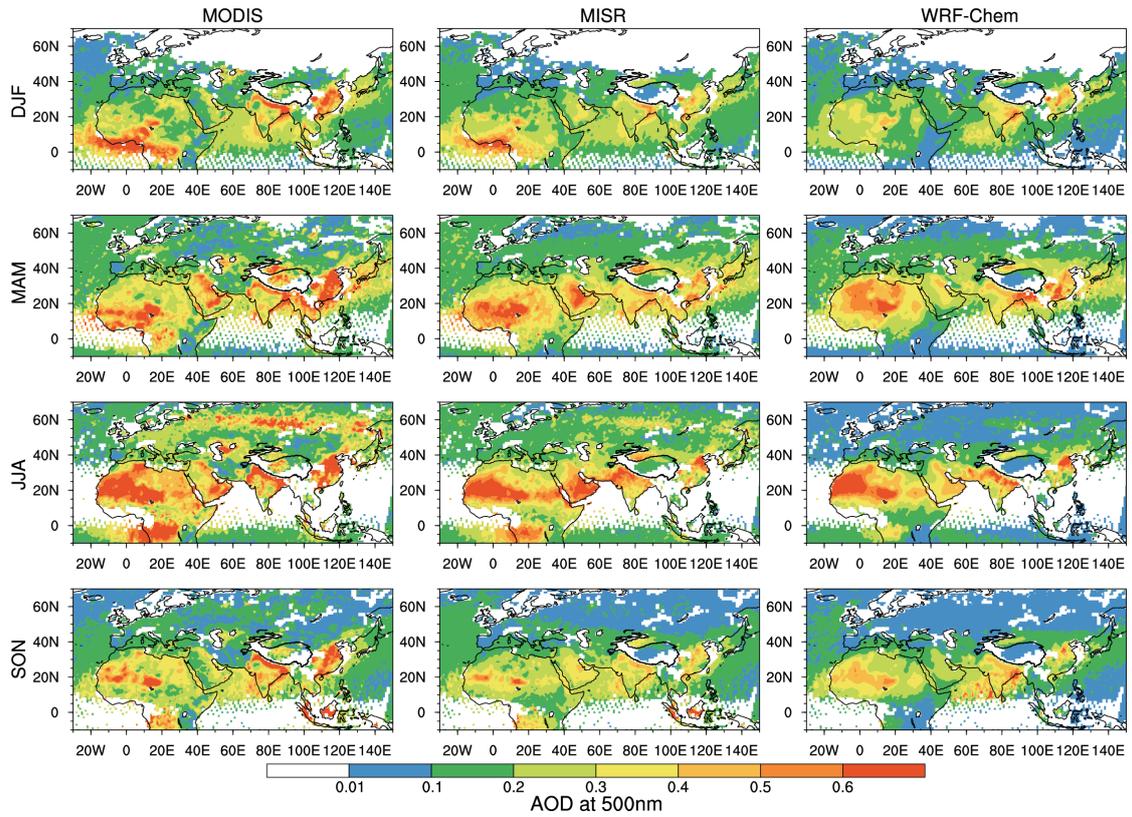
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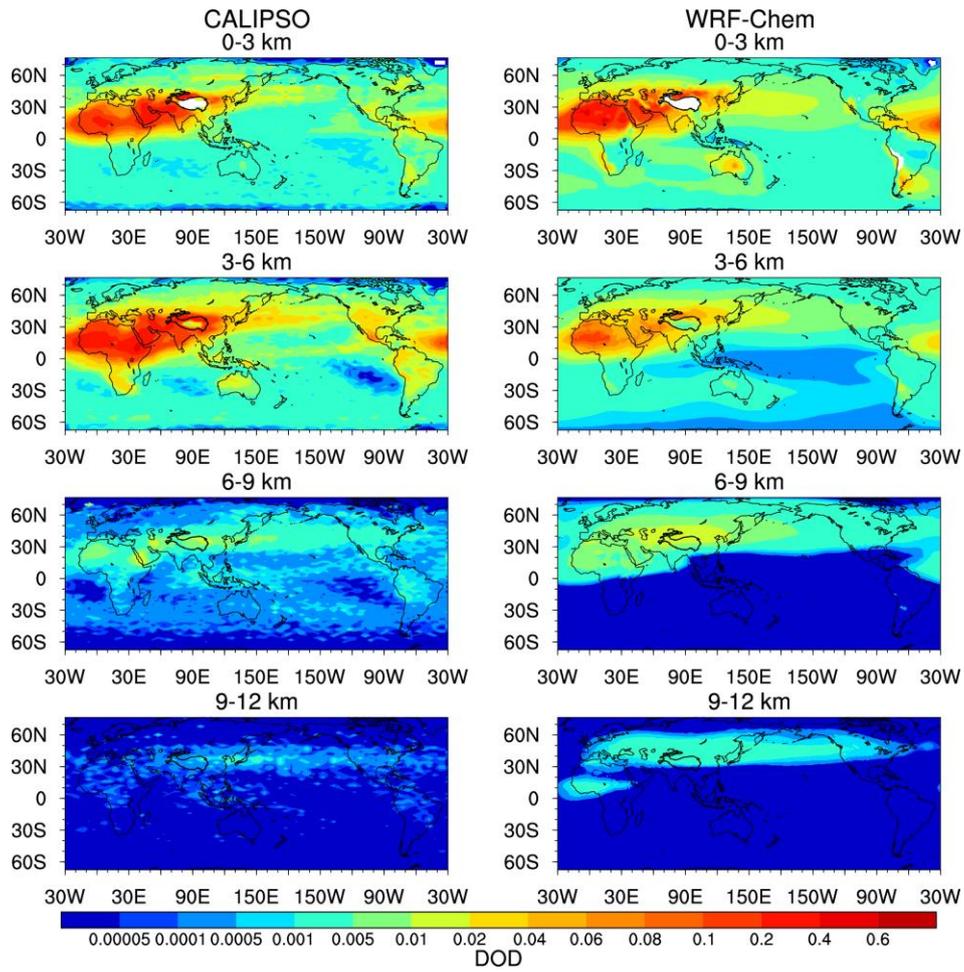
**Figure 1.** Spatial distribution of annual mean (a) dust emission ( $\mu\text{g}/\text{m}^2/\text{s}$ ) and (b)

930 elevation (m) simulated in WRF-Chem for the period of 2010–2015.



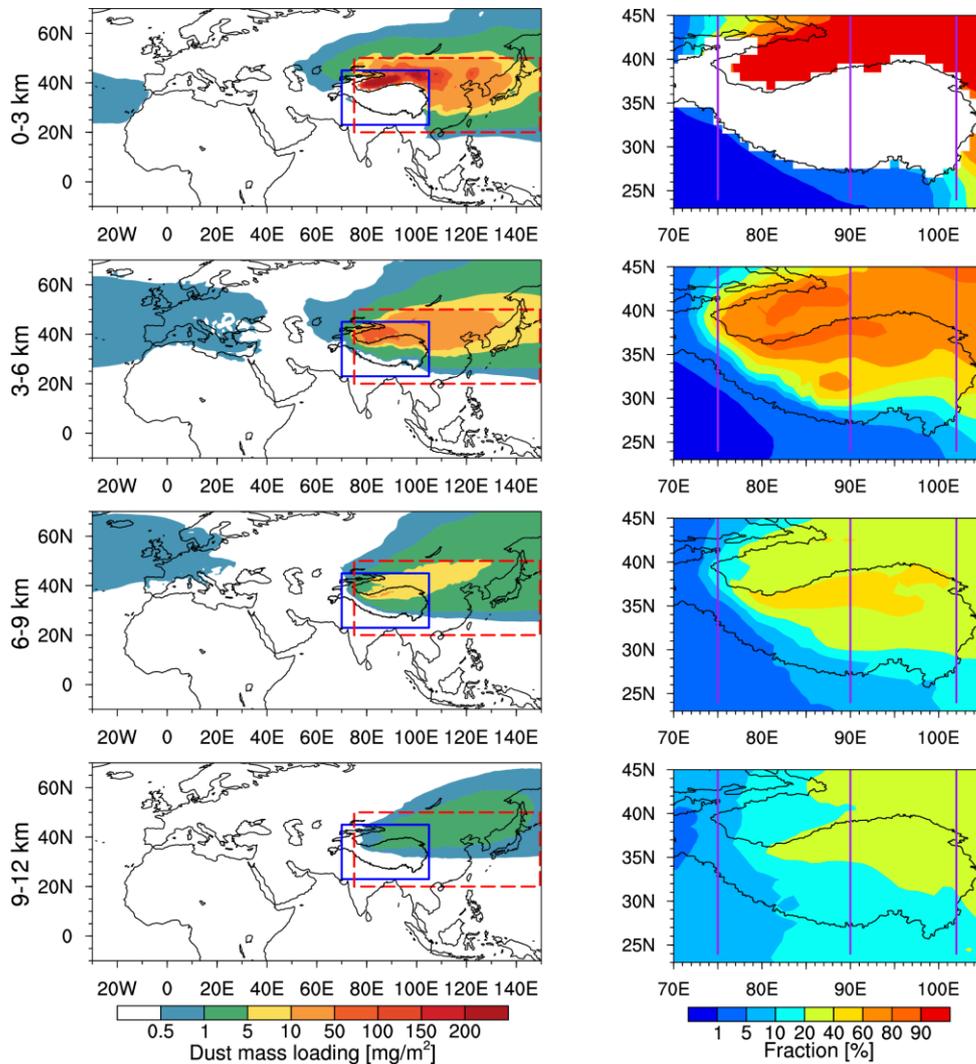
935 **Figure 2.** Spatial distributions of seasonal mean AOD at 550 nm from the retrievals of  
 MODIS and MISR onboard Terra and the WRF-Chem simulation for the period of  
 2010–2015. The daily results from MISR, MODIS, and WRF-Chem are only sampled  
 for averaging when all of them have valid values at the same location and time.

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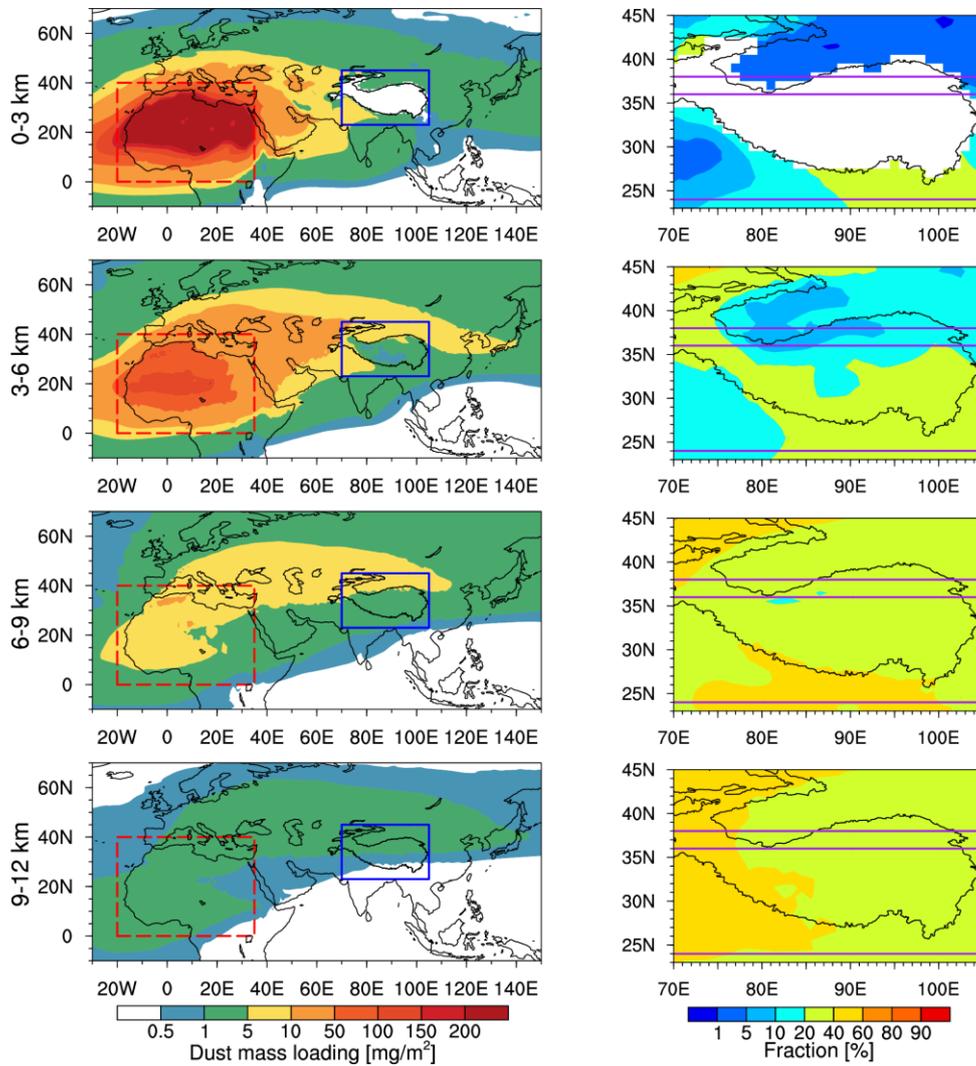


**Figure 3.** Spatial distributions of annual mean dust AOD from CALIPSO (left) and WRF-Chem (right) between 0–3 km, 3–6 km, 6–9 km, and 9–12 km for the period of 2010–2015.

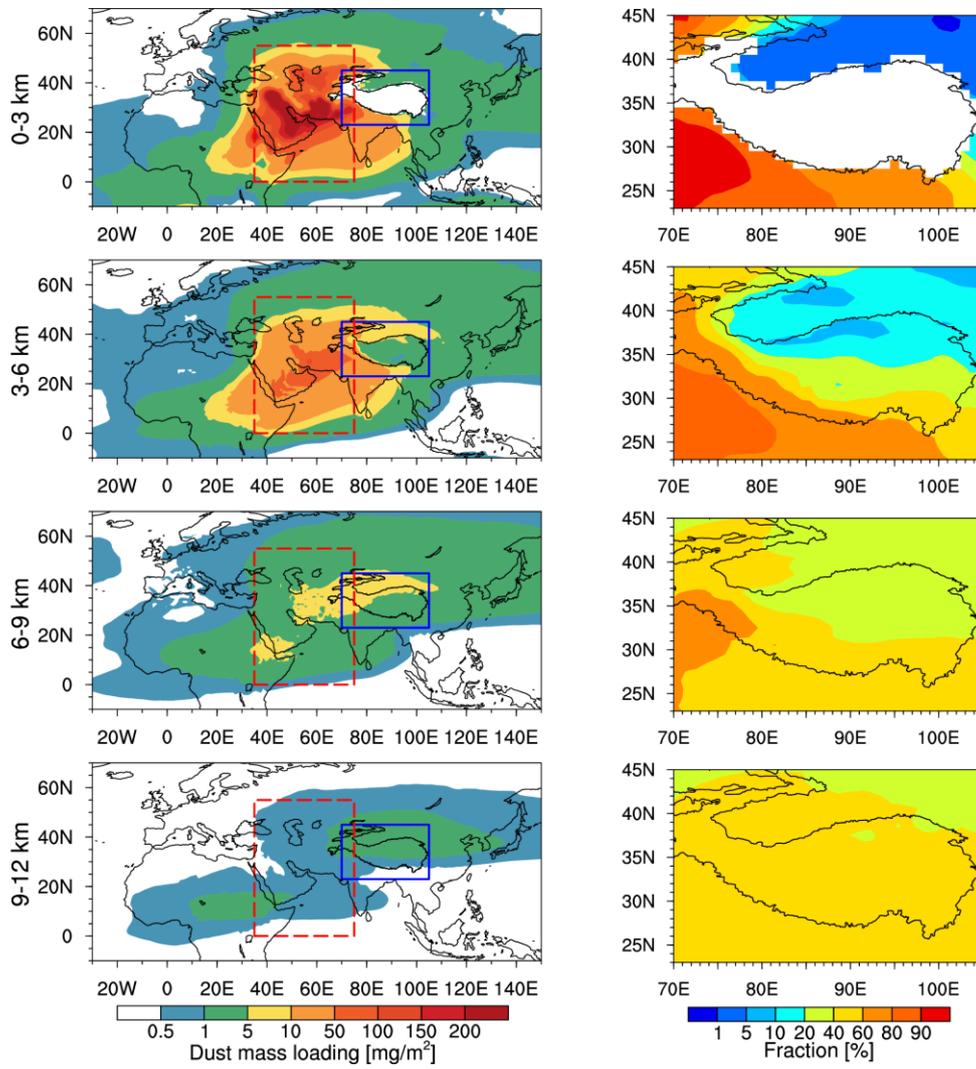
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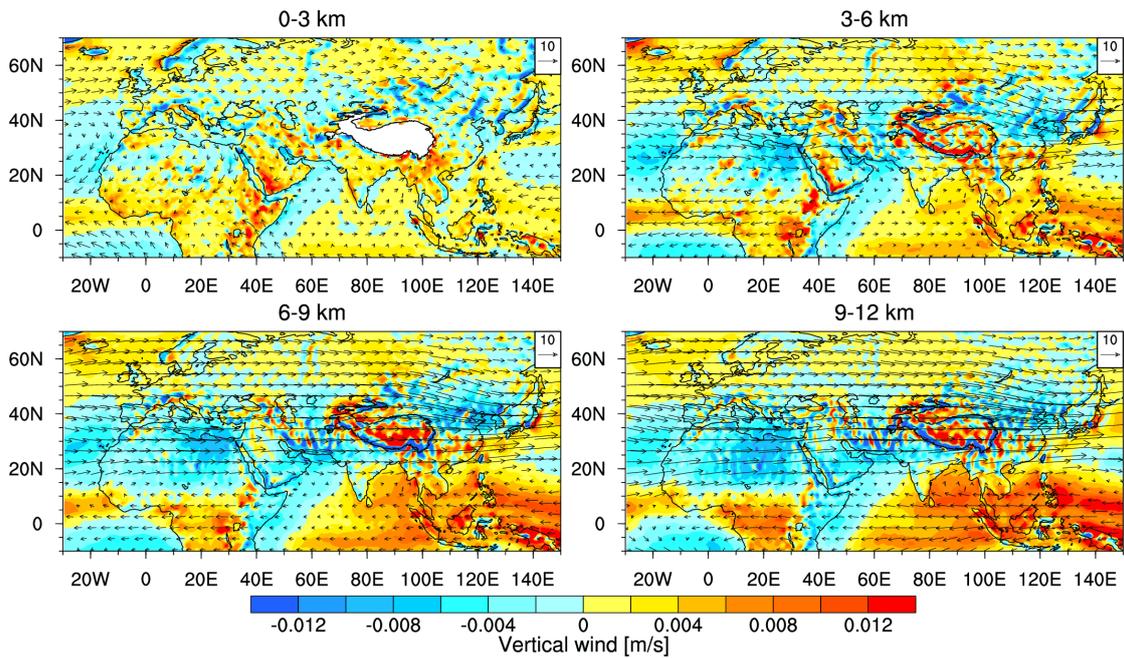
950 **Figure 4a.** Spatial distributions of (Left) annual mean dust mass loading ( $\text{mg}/\text{m}^2$ )  
emitted from East Asia between 0–3 km, 3–6 km, 6–9 km, and 9–12 km and (Right)  
the corresponding fractions compared with total dust mass loading over TP. The box  
in red dotted lines shows the dust source regions, while the box in blue solid lines  
shows the TP regions in this study. The purple solid lines are at 75° E, 90° E and 102°  
955 E for the dust height–latitude cross sections.



960 **Figure 4b.** Same as figure 4a, but for dust emitted from North Africa. The purple solid lines are at 24° N, 36° N and 38° N for the dust height–longitude cross sections.



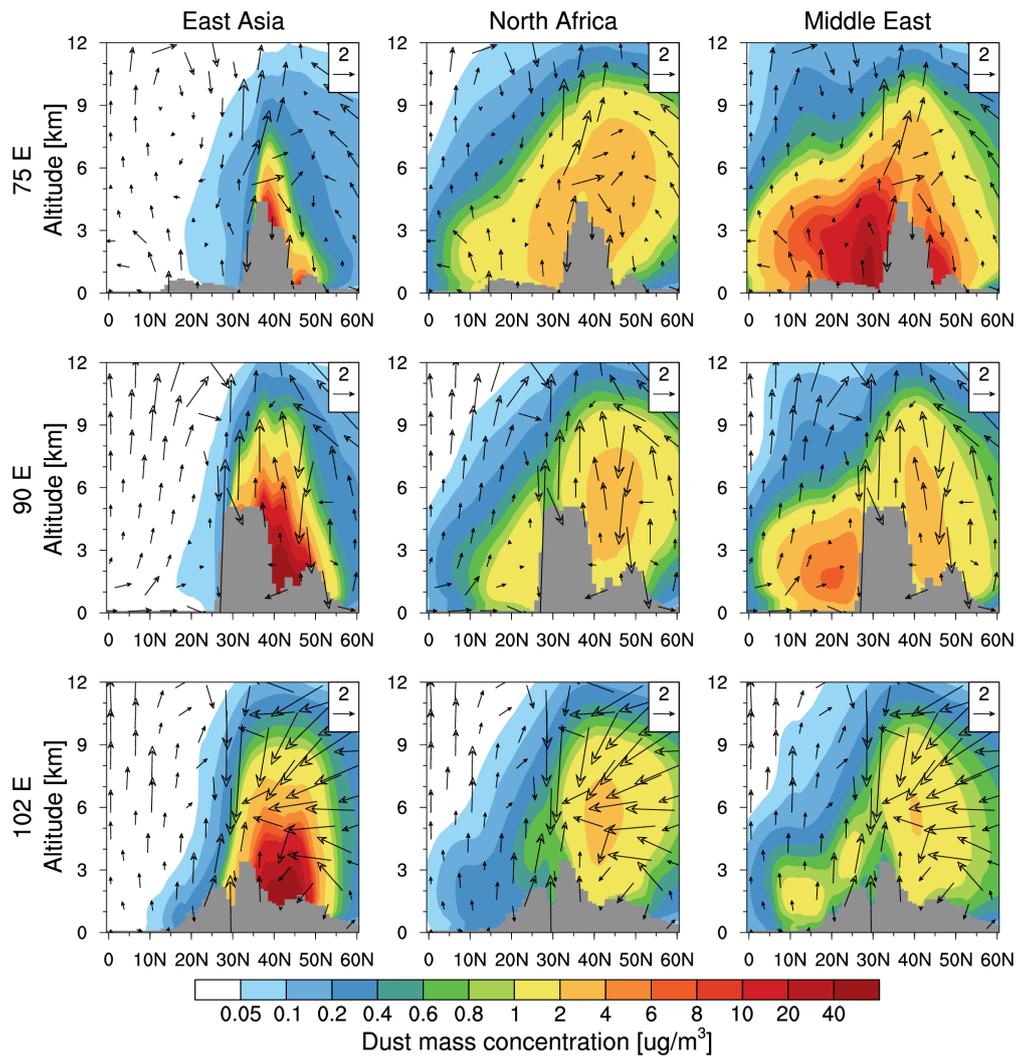
**Figure 4c.** Same as figure 4a, but for dust emitted from the Middle East.



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**Figure 5.** Annual mean wind field between 0–3 km, 3–6 km, 6–9 km, and 9–12 km from WRF-Chem simulations for the period of 2010–2015. The arrows indicate the horizontal wind (m/s). The colors indicate the vertical wind velocity (m/s) and positive values are for updrafts and negative values are for downdrafts.

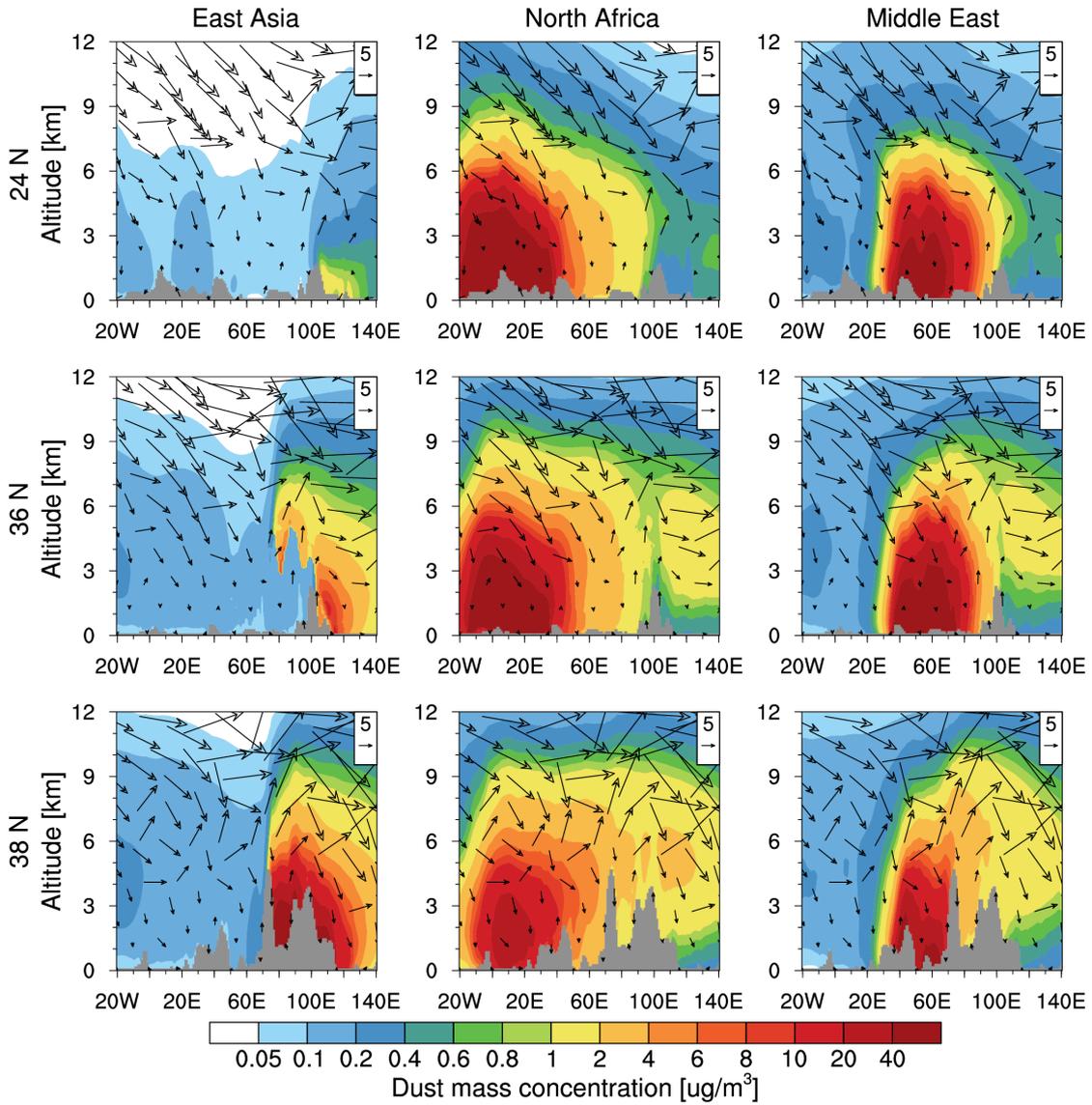
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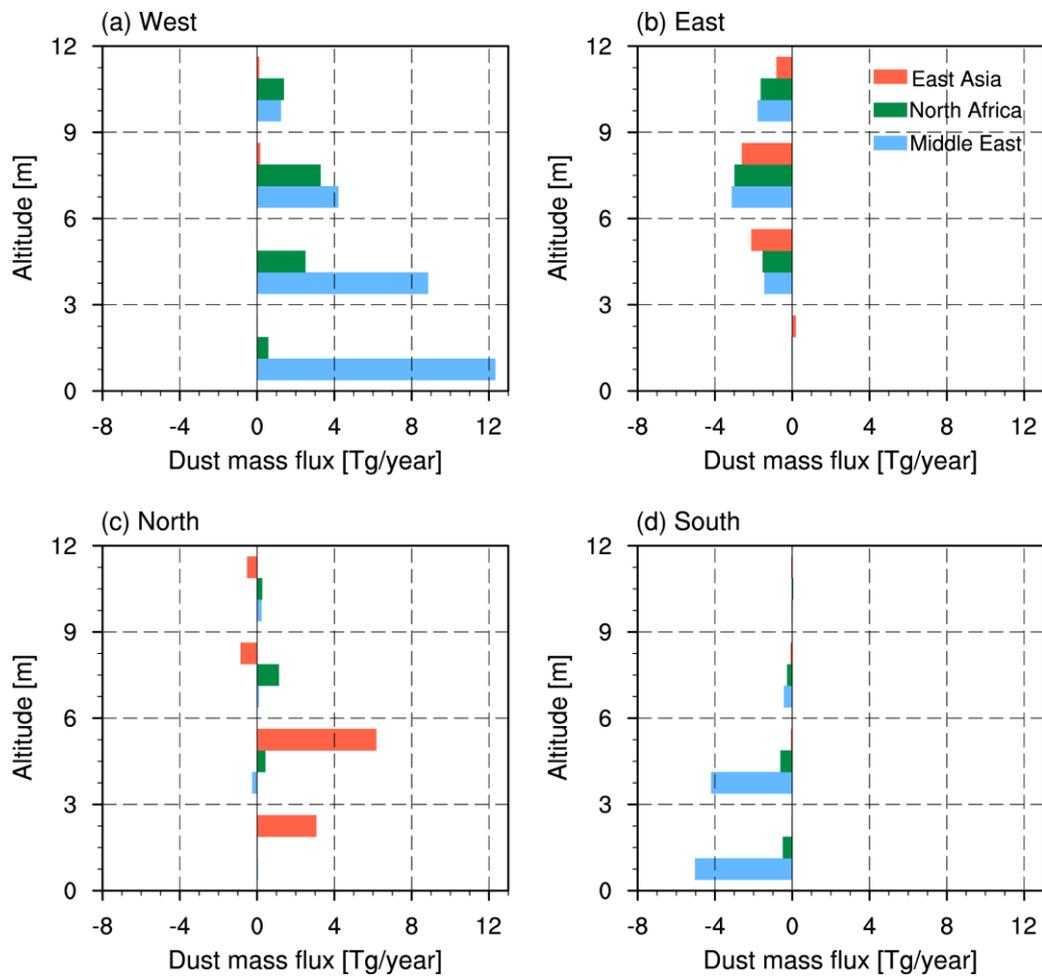
**Figure 6.** Vertical cross-sections of meridional circulation (m/s and scale factor 300

applied for vertical wind) and zonal dust mass concentration ( $\mu\text{g}/\text{m}^3$ ) emitted from East

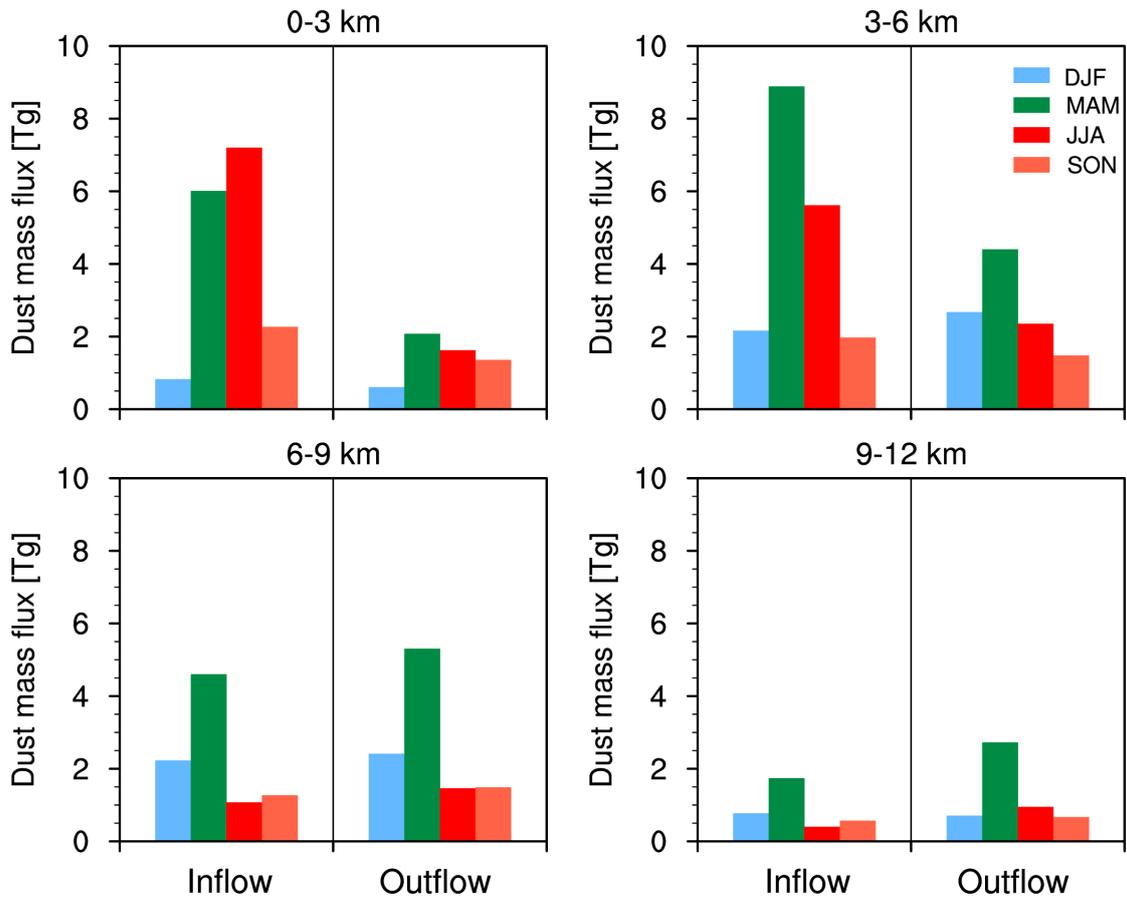
980 Asia, North Africa and Middle East at  $75^\circ \text{ E}$ ,  $90^\circ \text{ E}$  and  $102^\circ \text{ E}$ .



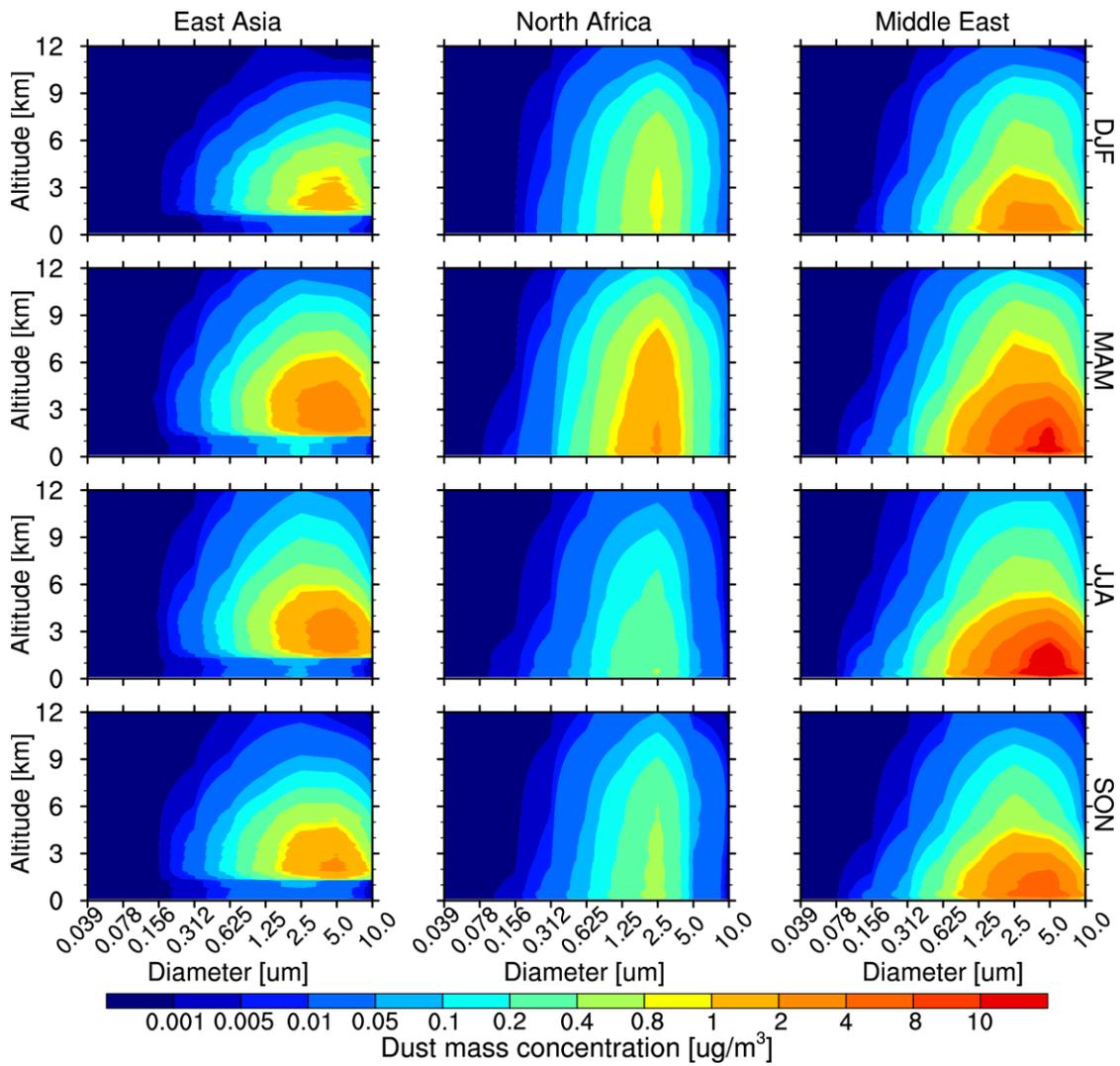
**Figure 7.** Vertical cross-sections of zonal circulation (m/s and scale factor 300 applied for vertical wind) and meridional dust mass concentration ( $\mu\text{g}/\text{m}^3$ ) emitted from East Asia, North Africa and Middle East at  $24^\circ\text{N}$ ,  $36^\circ\text{N}$  and  $38^\circ\text{N}$ .



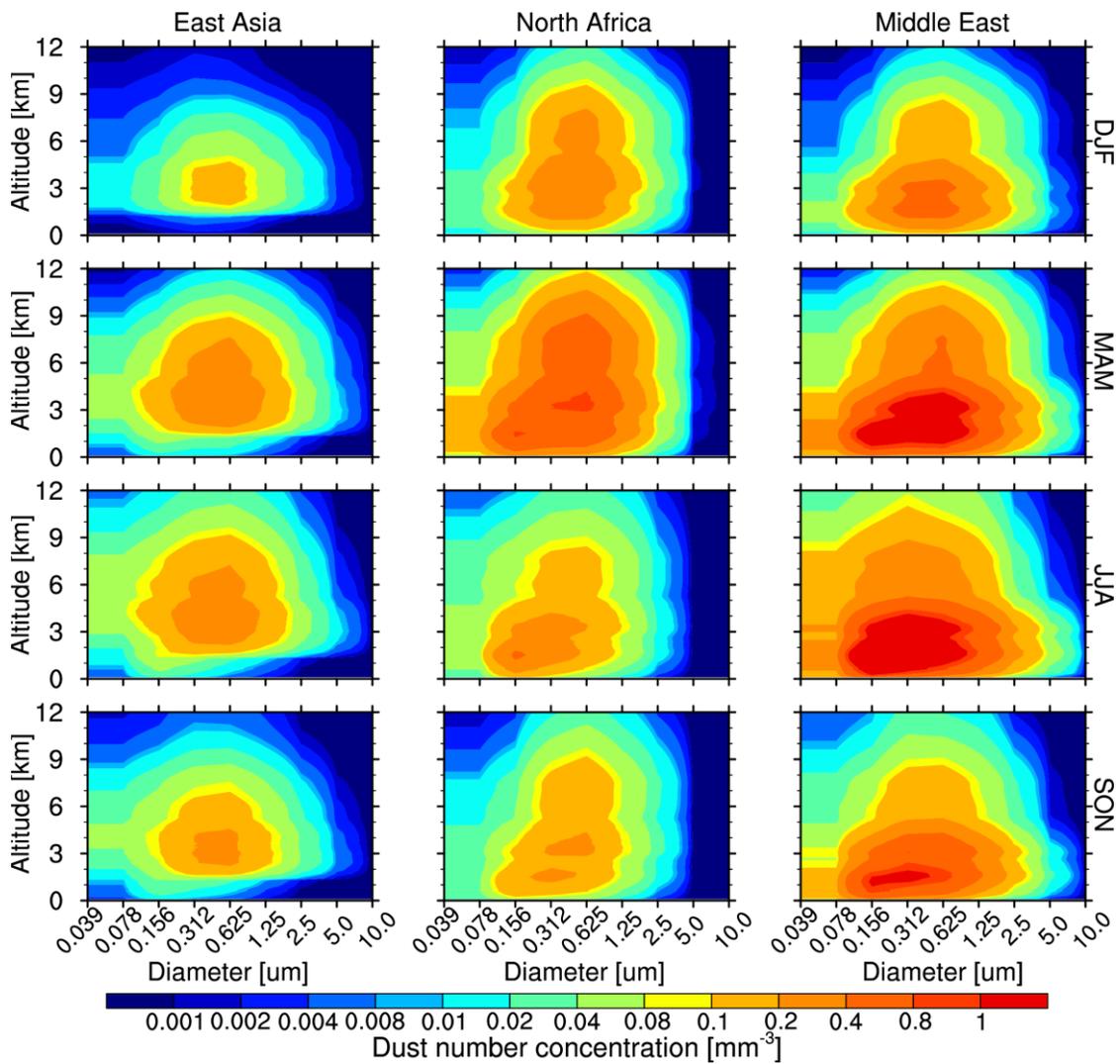
**Figure 8.** Model-based estimation of annual dust mass flux (Tg/year) at the West (a) and East (b), North (c) and South (d) side of the Tibetan Plateau, respectively. The latitude ranges in  $27^{\circ}$  N –  $38^{\circ}$  N and the longitude ranges in  $75^{\circ}$  E –  $104^{\circ}$  E. The west and east imported mass flux are based on the zonal wind, and South and North are based on the meridional wind. Also, the values are negative for imported and positive for outflowed.



1000 **Figure 9.** Model-based estimation of annual dust mass flux (Tg) inflow and outflow from the TP between 0–3 km, 3–6 km, 6–9 km and 9–12 km from the WRF-Chem simulations averaged for 2010–2015.

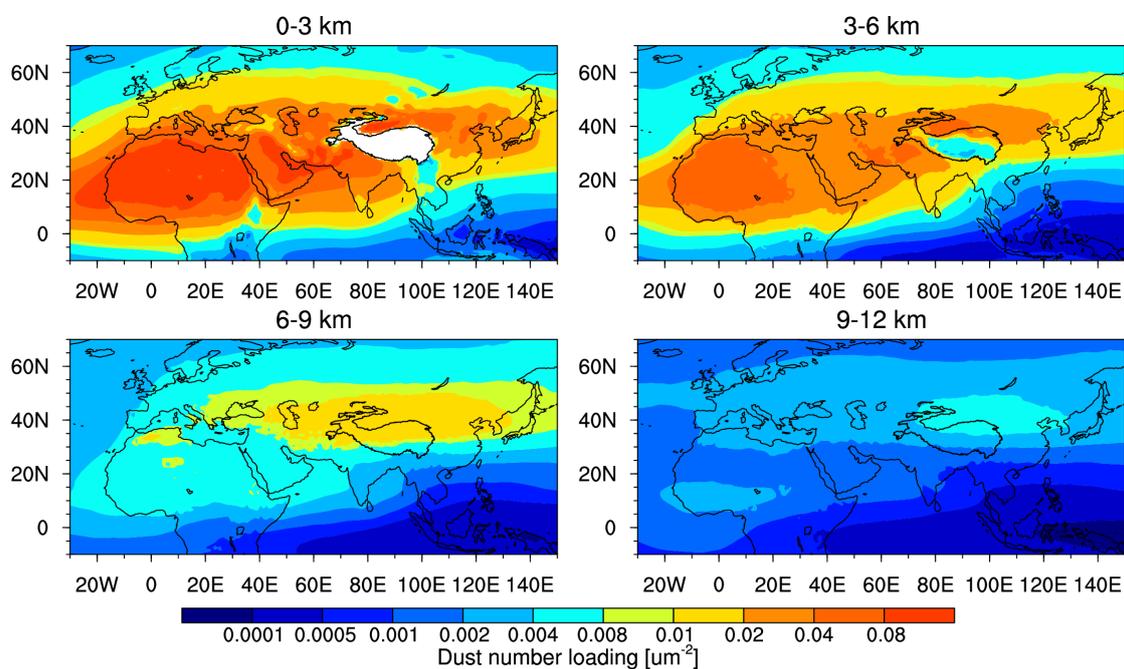


1005 **Figure 10a.** Vertical distribution of seasonal dust mass concentration ( $\mu\text{g}/\text{m}^3$ ) over the TP within various particle size sections emitted from East Asia, North Africa and Middle East averaged for 2010–2015.

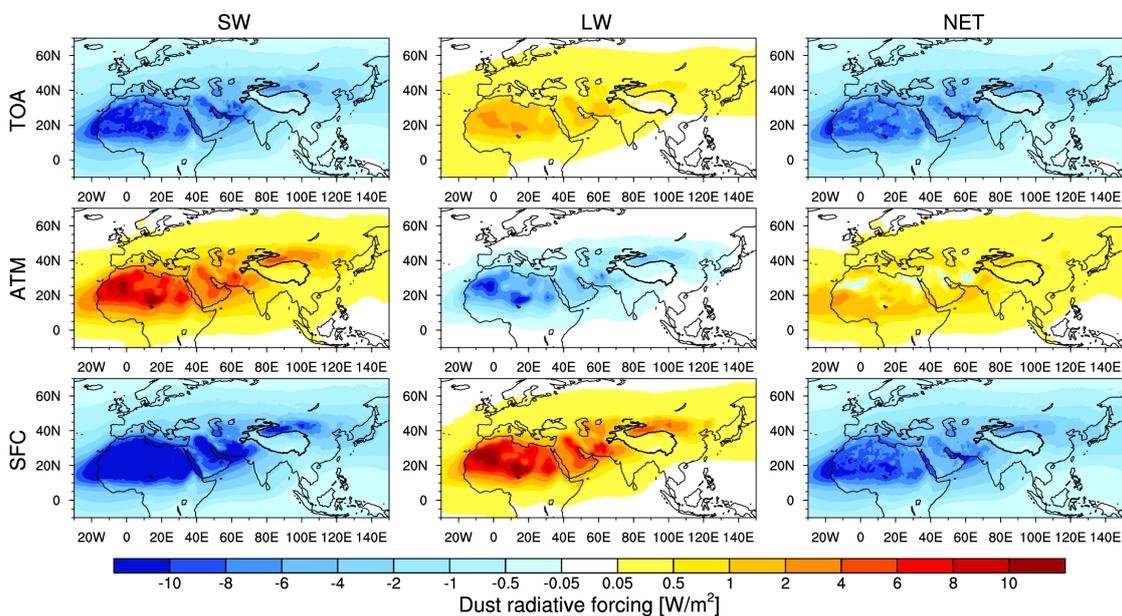


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**Figure 10b.** Vertical distribution of seasonal dust number concentration ( $\text{mm}^{-3}$ ) over the TP in different particle size emitted from East Asia, North Africa and Middle East averaged for the period of 2010–2015.

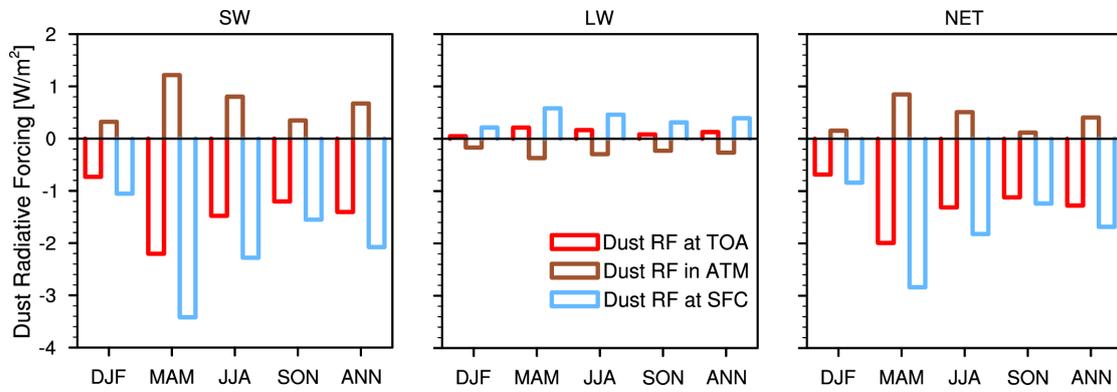


**Figure 11.** Spatial distributions of annual mean dust number loading ( $\mu\text{m}^{-2}$ ) from WRF-Chem between 0–3 km, 3–6 km, 6–9 km, and 9–12 km for the period of 2010–



1025 **Figure 12.** Spatial distribution of annual mean SW, LW, and net (SW + LW) direct radiative forcing ( $\text{W/m}^2$ ) of dust at the TOA (top panels), in the atmosphere (ATM: middle panels) and at the surface (SFC: bottom panels) under all-sky conditions from the WRF-Chem simulation averaged for 2010–2015.

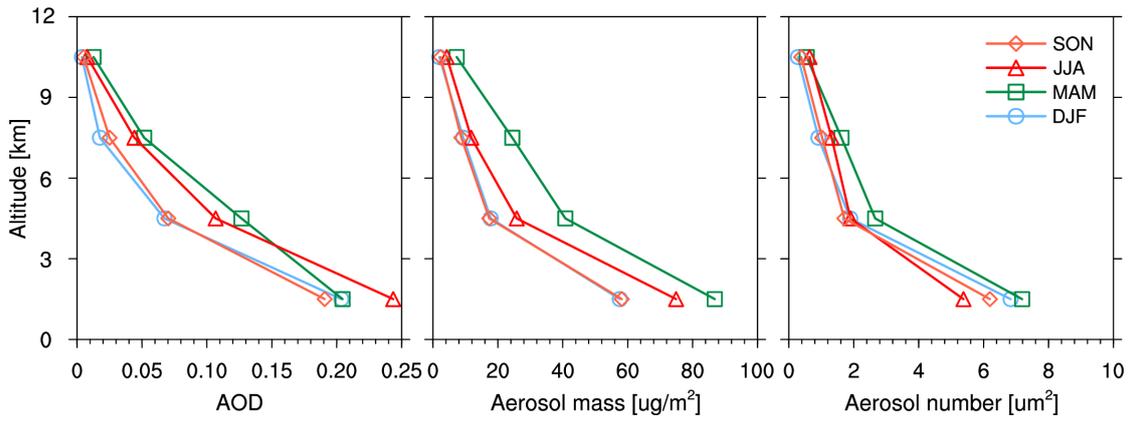
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**Figure 13.** Seasonal and annual mean SW, LW, and net (SW + LW) radiative forcing

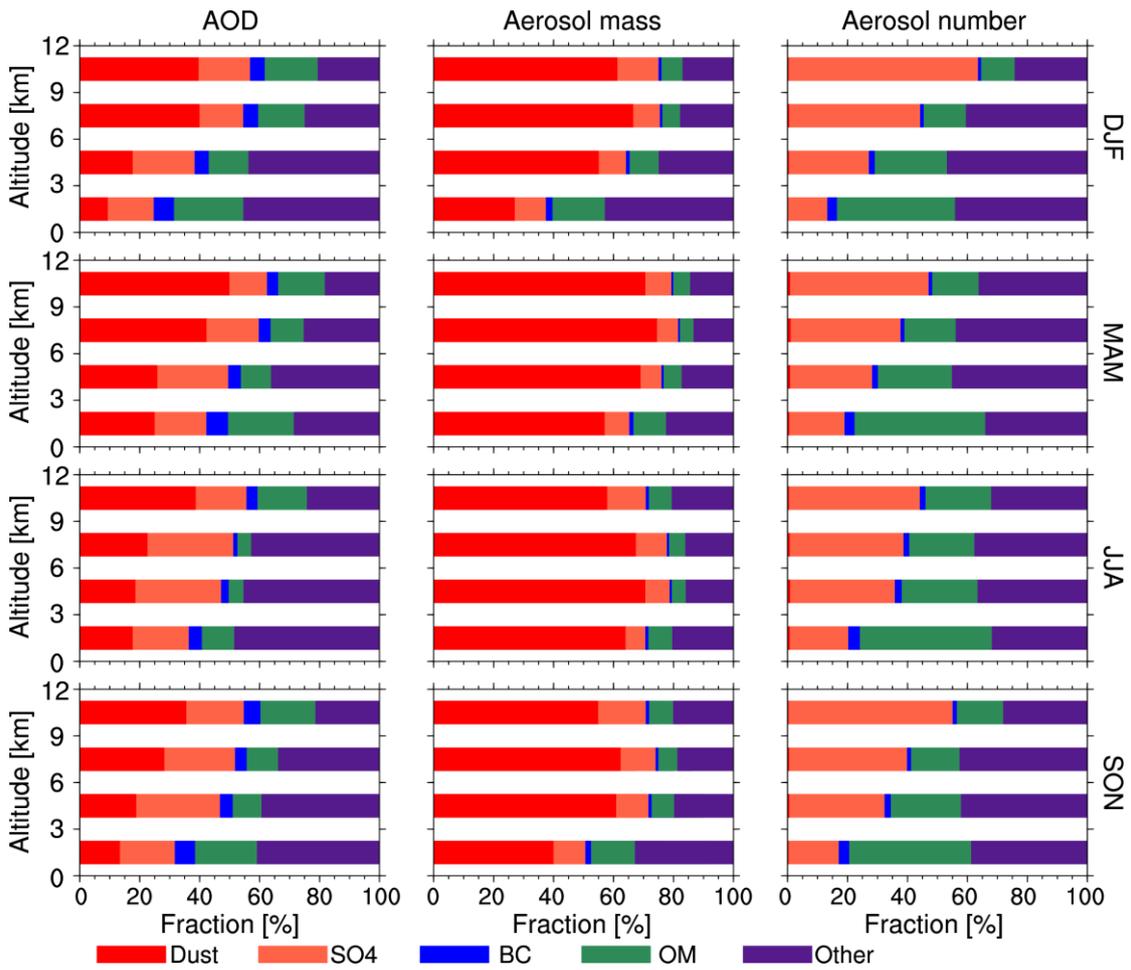
1035 (W/m<sup>2</sup>) of dust simulated by WRF-Chem for the period of 2010–2015 over the TP.

Negative values represent downward radiation.



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**Figure 14.** Vertical distribution of seasonal AOD, aerosol mass loading ( $\mu\text{g m}^{-2}$ ), and aerosol number ( $\mu\text{m}^2$ ) over the TP from WRF-Chem simulation averaged for the period of 2010–2015.



**Figure 15.** Fractions of seasonal aerosol composition in total AOD (left), aerosol mass concentration (middle), and aerosol number (right) in four separate vertical layers: 0–3 km, 3–6 km, 6–9 km and 9–12 km from the WRF-Chem simulation averaged for the period of 2010–2015 over the TP.