- 1 Radiative and Thermodynamic Responses to Aerosol Extinction Profiles during the
- 2 **Pre-monsoon Month over South Asia**
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- 4 Y. Feng^{1*}, V. R. Kotamarthi¹, R. Coulter¹, C. Zhao², and M. Cadeddu¹
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- ⁶ ¹Environmental Science Division, Argonne National Laboratory, Argonne, IL
- 7 ²Atmospheric Science and Global Change Division, Pacific Northwest National Laboratory,
- 8 Richland, WA
- 9 *e-mail: <u>yfeng@anl.gov</u>

Abstract. Aerosol radiative effects and thermodynamic responses over South Asia are 10 examined with the Weather Research and Forecasting model coupled with Chemistry 11 (WRF-Chem) for March 2012. Model results of Aerosol Optical Depths (AOD) and 12 extinction profiles are analyzed and compared to satellite retrievals and two ground-based 13 14 lidars located in the northern India. The WRF-Chem model is found to heavily underestimate the AOD during the simulated pre-monsoon month and about 83% of the model low-bias is 15 due to aerosol extinctions below ~2 km. Doubling the calculated aerosol extinctions below 16 17 850 hPa generates much better agreement with the observed AOD and extinction profiles averaged over South Asia. To separate the effect of absorption and scattering properties, two 18 runs were conducted: in one run (Case I), the calculated scattering and absorption coefficients 19 were increased proportionally, while in the second run (Case II) only the calculated aerosol 20 scattering coefficient was increased. With the same AOD and extinction profiles, the two runs 21 produce significantly different radiative effects over land and oceans. On the regional mean 22 basis, Case I generates 48% more heating in the atmosphere and 21% more dimming at the 23 surface than Case II. Case I also produces stronger cooling responses over the land from the 24 25 longwave radiation adjustment and boundary layer mixing. These rapid adjustments offset the stronger radiative heating in Case I and lead to an overall lower-troposphere cooling up to 26 -0.7 K day⁻¹, which is smaller than that in Case II. Over the ocean, direct radiative effects 27 dominate the heating rate changes in the lower atmosphere lacking such surface and lower 28 29 atmosphere adjustments due to fixed sea surface temperature, and the strongest atmospheric warming is obtained in Case I. Consequently, atmospheric dynamics (boundary layer heights 30 and meridional circulation) and thermodynamic processes (water vapor and cloudiness) are 31 shown to respond differently between Case I and Case II underlying the importance of 32 determining the exact portion of scattering or absorbing aerosols that lead to the 33 underestimation of aerosol optical depth in the model. In addition, the model results suggest 34 that both direct radiative effect and rapid thermodynamic responses need to be quantified for 35 understanding aerosol radiative impacts. 36

1. Introduction

South Asia, including the Indian subcontinent and adjacent oceans, is a regional hotspot 39 with high aerosol loadings (Ramanathan et al., 2001; Moorthy et al., 2013). Aerosols over 40 this region are composed of locally emitted sulfate, black carbon (BC), and organic 41 substances (mainly from industrial, transportation, residential, and agricultural burning), as 42 well as long-range-transported desert dust and sea spray aerosols. These aerosols together 43 induce a large negative radiative forcing at the top of the atmosphere (TOA) through direct 44 45 scattering and absorption of incoming solar radiation. With year 2000 emissions, Chung et al. (2010) estimated the regional TOA aerosol forcing in South Asia at about -1.9 W m⁻², which 46 is larger by several factors than the present-day global mean direct forcing (Boucher et al., 47 2013). The overall aerosol cooling effect in response to negative TOA forcing is suggested to 48 weaken the sea surface temperature gradient over the Indian Ocean and decelerate the 49 monsoonal circulation and moisture transport (Ramanathan et al., 2005). Other studies show 50 that local warming by BC in the upper troposphere intensifies vertical motion over land and 51 modulates intraseasonal monsoon rainfall variations (Lau et al., 2006). Therefore, rapidly 52 53 increased anthropogenic aerosol emissions in South Asia have been linked closely to observed changes in surface temperature and rainfall patterns in global climate simulations 54 (Meehl et al., 2008; Lau et al., 2009; Wang et al., 2009; Bollasina et al., 2011; Ganguly et al., 55 2012). 56

57 For quantifying aerosol direct perturbations in the radiation budget, column-integrated aerosol optical depth (AOD) is often examined in global models, some of which include 58 regional analysis over South Asia (Myhre et al., 2009, 2013; Shindell et al., 2013; Boucher et 59 al., 2013; Pan et al., 2015), and in regional-scale models (Chung et al., 2010; Nair et al., 2012; 60 61 Kumar et al., 2014). Besides AOD, aerosol single scattering albedo (SSA) has also been identified as a main source of uncertainty in estimates of aerosol direct forcing (McComiskey 62 et al., 2008; Loeb and Su et al., 2010) and evaluated with observations. Most models 63 underpredict aerosol abundances over South Asia versus data from the ground-based Aerosol 64 Robotic Network (AERONET) (Holben et al., 1998) or satellite-retrieved AOD observations 65 such as the Moderate Resolution Imaging Spectroradiometer (MODIS) (e.g., Yu et al., 2003; 66 Kinne et al., 2006; Koch et al., 2009; Ganguly et al., 2012). In addition, models also tend to 67

underestimate aerosol absorption by over-estimating the SSA (Liu et al., 2012). Such low
biases in aerosol optical properties might potentially affect model simulations of regional
climatology and assessment of aerosol climate impacts over the South Asia region.

71 Vertical distribution of aerosols is another important parameter in determining aerosol-radiation interactions. When column AOD is constrained, uncertainties in aerosol 72 vertical profiles can still contribute to significant uncertainties in the calculation of radiative 73 74 forcing (Lohmann et al., 2001; Zarzycki and Bond, 2010; Ban-Weiss et al., 2011). The extent 75 to which the aerosol profile impacts aerosol radiative effects depends on the presence of cloud, surface albedo, and SSA. Column and global aerosol and radiation models have been 76 used to explore the sensitivity of aerosol direct radiative forcing to the vertical distribution of 77 aerosols, especially absorbing aerosols, relative to clouds (Haywood and Shine, 1997; Liao 78 79 and Seinfeld, 1998; Samset et al., 2013; Vuolo et al., 2014; Choi and Chung, 2014). However, compared to column AOD and SSA, aerosol vertical distributions are evaluated less 80 frequently against observations, partly due to lack of observational data sets. 81

Aircraft profiling of aerosol concentrations from recent airborne experiments, such as the 82 83 HIAPER Pole-to-Pole Observations (Schwarz et al., 2010) and the Arctic Research of the Composition of the Troposphere from Aircraft and Satellites (Jacob et al., 2010), provides 84 high-quality data sets for model comparison (e.g., Koch et al, 2009; Liu et al., 2012). 85 However, these data sets are usually available only for limited locations and time periods. In 86 87 particular, few long-term aircraft surveys are available for South Asia, other than a few past field experiments such as the Maldives Autonomous Unmanned Aerial Vehicle Campaign 88 (Ramanathan et al., 2007) and the Integrated Campaign for Aerosol, Gases and Radiation 89 Budget experiment (Satheesh et al., 2009). Satellite-retrieved aerosol extinction profiles 90 91 providing wide coverage in space and time have been used increasingly for model evaluation. Using the Cloud-Aerosol Lidar and Infrared Pathfinder Satellite Observations (CALIPSO) 92 lidar nighttime data at 532 nm in cloud-free conditions from June 2006 to November 2007, 93 Yu et al. (2010) evaluated aerosol extinction profiles simulated by the Goddard Chemistry 94 Aerosol Radiation Transport (GOCART) model and found substantial underestimation in the 95 96 magnitude of aerosol extinctions over the Indian subcontinent. Similar analysis of all-sky CALIPSO nighttime data in the AeroCom (Aerosol Comparisons between Observations and 97

Models) multi-model evaluation of the vertical distribution of aerosols (Koffi et al., 2012) found that 11 of the 12 AeroCom models underestimated the annual mean aerosol extinctions below 2 km over South Asia. A recent study by Quennehen et al. (2015) examined six global and one regional models with CALIPSO-derived backscatter profiles at 532nm during August and September 2008, and the multi-model mean backscatter is also underestimated between 0 and 2 km over northern India and eastern China.

Although these model-data comparisons help to identify the biases in model simulations 104 105 of aerosol extinction or concentration profiles, the resultant changes in atmospheric heating, dynamics, and cloud adjustments (the aerosol semi-direct effects) have yet to be investigated. 106 Moreover, satellite retrievals of aerosol extinction profiles are also subject to uncertainties 107 associated with cloud contamination, surface overlap correction, and daylight background 108 noise. Observational studies have examined atmospheric heating rates extensively by using 109 aerosol extinctions retrieved from ground-based or CALIPSO lidar instruments (Misra et al., 110 2012; Gautam et al., 2010; Kuhlmann and Quaas, 2010) and in situ aircraft data (Ramana et 111 al., 2007; Satheesh et al., 2008). These studies directly provide observational constraints on 112 the instantaneous atmospheric heating caused by aerosols, ranging from 0.35 to 2 K day⁻¹, in 113 the South Asia region. On the other hand, observational methods face challenges in 114 distinguishing the rapid adjustments in the atmosphere attributable to aerosols versus other 115 environmental influences. 116

117 In the present study, we examine the atmospheric radiative and thermodynamic responses to uncertainty associated with vertical distributions of aerosol extinction coefficient by 118 correcting bias in model calculations with satellite and surface remote sensing data. This not 119 only identifies discrepancies between the model-predicted and observed aerosol optical 120 properties as a function of height, but it also demonstrates the potential importance of 121 122 aerosol-related uncertainty for regional climate simulations. The regional Weather Research and Forecasting (WRF) model, coupled with a chemistry module (WRF-Chem), is used to 123 simulate the pre-monsoon month of March 2012 over South Asia. The next section describes 124 125 the regional climate model configurations and ground-based and satellite data sets available. 126 Section 3 evaluates the modeled and observed AODs and aerosol profiles and discusses changes in the simulated radiative energy balance, surface temperature, lower-atmospheric 127

heating rates, boundary layer (BL) height, large-scale circulation, and cloud occurrence, in response to optimized matching of aerosol extinction profiles to observations. The main findings of this study and implications for future work are summarized in Section 4.

131 **2.** Methodology

132 **2.1 Model description**

This study uses a version of the WRF-Chem 3.3 (Skamarock et al., 2008; Grell et al., 133 2005), coupled with the chemistry module MOZCART (Pfister et al., 2011), to simulate 134 135 aerosol distributions, aerosol-radiation interactions, and regional meteorological fields. The default model simulations are performed for eight months from August 2011 to March 2012, 136 the period when multi-instrumental aerosol observations were collected by the U.S. 137 Department of Energy (DOE) Ganges Valley Aerosol Experiment (GVAX) at a mountain-top 138 site, Nainital (29°N, 79°E, e.s.l. 1939 m), in northern India. The model domain is configured 139 from 55°E to 95°E and 0° to 36°N, with a horizontal grid spacing of ~12 km and 27 vertical 140 layers. The MOZCART chemistry module (WRF-Chem Version 3.7 User's guide: http:// 141 142 http://ruc.noaa.gov/wrf/WG11/Users_guide.pdf) includes the MOZART-4 gas-phase 143 chemistry (Emmons et al., 2010) and the GOCART bulk aerosol scheme (Chin et al., 2002). MOZCART simulates externally mixed aerosol species including sulfate, BC, organic carbon 144 (OC), dust (in 5 size bins with 0.5, 1.4, 2.4, 4.5, and 8 µm effective radius) and sea salt (in 4 145 size bins with 0.3, 1.0, 3.2, and 7.5 µm effective radius). This version of the WRF-Chem 146 147 aerosol and chemistry modules has been used and evaluated in studying effects of dust aerosols on tropospheric chemistry during the pre-monsoon season in northern India (Kumar 148 et al., 2014). 149

The anthropogenic emissions of gaseous species are derived from the Reanalysis of the 150 Tropospheric Chemical Composition and Emissions Database for Global Atmospheric 151 Research compiled for the year 2000. The default emissions of BC, OC, and SO₂ are same as 152 in the GOCART model for year 2006. Over India, emissions of BC, OC, and SO₂ are 153 replaced with year 2010 inventories available at resolutions of $0.1^{\circ} \times 0.1^{\circ}$ for anthropogenic 154 sources and $0.5^{\circ} \times 0.5^{\circ}$ for biomass burning (Lu et al., 2011). The total emissions of BC and 155 156 OC used in this study are about 1.12 Gg/yr and 3.06 Gg/yr over India, respectively, roughly 51% and 63% higher than those from the default GOCART global inventories (0.74 Gg/yr 157

and 1.88 Gg/yr). The total SO2 emissions in South Asia with updated emissions over India 158 are 9.36 Gg yr⁻¹, slightly less than the default GOCART emissions (10 Gg yr⁻¹). Additional 159 sulfate emissions from waste and biofuel burning (Yevich and Logan, 2003) are also included 160 (about 0.21 Gg/yr). Dimethyl sulfide, dust, and sea salt emissions are calculated online as for 161 the GOCART model (Ginoux et al., 2001; Chin et al., 2002). Primary aerosol emissions 162 including all the anthropogenic, biomass burning and natural sources are injected into the 163 lowest level of the model and transported by advection and updrafts. Calculations of optical 164 165 properties of aerosols assume internal mixing (Fast et al., 2006) including the Kappa-based hygroscopic growth of aerosol components (Petters and Kreidenweis, 2007), although 166 aerosols are transported as external mixtures. The Rapid Radiative Transfer Model for 167 General Circulation Model schemes (Iacono et al., 2008) is used for shortwave and longwave 168 radiation calculations (Zhao et al., 2011). Other main physical packages used in this study are 169 the Thompson cloud microphysics (Thompson et al., 2008), the Zhang-McFarlane cumulus 170 parameterization (Zhang and McFarlane, 1995), the Mellor-Yamada-Janjic BL scheme (Janjic, 171 1994), and the Rapid Update Cycle land surface model (Benjamin et al., 2004). 172

173 The initial and boundary conditions of meteorological fields were interpolated to the model time step (72 s) from the compiled 6-h National Centers for Environmental Prediction 174 reanalysis data available at $1^{\circ} \times 1^{\circ}$ resolution. Outputs from the MOZART-4 global chemical 175 transport model (Emmons et al., 2010) generated for the simulation time periods are used for 176 177 chemistry initial and boundary conditions. Radiative feedbacks of aerosols are coupled with the meteorology updates at each model time step. Indirect aerosol microphysical effects are 178 not considered. While this omission might affect the simulated total aerosol radiative impact, 179 the focus here is on examination of the model's sensitivity to uncertainty in predicted aerosol 180 181 extinction, which, as an aerosol optical property, has a direct impact on aerosol direct and 182 semi-direct radiative effects more than aerosol microphysical effect.

The model-data analysis and discussions here center on simulations in March 2012, for two reasons. First, during this pre-monsoon month, ground-based lidar measurements are available at Nainital and Kanpur (in northern India) and used with satellite observations to characterize bias in the calculated aerosol extinctions. As discussed later, it is important to have independently calibrated ground-based measurements because of the uncertainty 188 associated with satellite data. Second, we examine the model's performance in simulating AOD and vertical distributions for this pre-monsoon month, because the anthropogenic 189 aerosol concentrations over this period are among the highest of the year and impose large 190 radiative forcing (Ramanathan et al., 2007). Uncertainty in aerosol predictions might 191 propagate into the predicted meteorological fields and influence the moisture distribution in 192 the pre-monsoon-to-monsoon season. In addition to the default (control) run for March, two 193 sensitivity model simulations are conducted with corrected extinction profiles, as described 194 195 below. One-week spin-up is used for initializing the one-month runs.

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2.2 Observational data sets

During the GVAX experiment, the DOE Atmospheric Radiation Measurements (ARM) 197 Program Mobile Facility 1 (AMF-1) was operated at Nainital in the central Himalayan region 198 of the northern India. Located at ~1939 m above sea level, this site was frequently near the 199 planetary BL top or in the free troposphere during the experimental period. Ground-based 200 AMF-1 multi-filter rotating shadowband radiometer (MFRSR) measurements were made 201 from September 2011 to March 2012. The post-processed, quality-assured AOD products 202 203 (pghmfrsraod1michM1.s1) from the MFRSR are used to evaluate the model simulations of monthly and daily mean daytime (0600-1800 local time) AODs. Instrumental uncertainty in 204 the MFRSR-retrieved AOD is about 0.026 above 380 nm (Schmid et al., 1999), which is 205 generally below the typical AOD levels observed at this site. Monthly mean AERONET 206 207 (Holben et al., 1998) level 2 sun photometer AOD data sets that are also used have a reported uncertainty of approximately 0.01 at 500 nm (Eck et al., 1999; Smirnov et al., 2000). 208 Comparisons of the simulated monthly mean AODs with Moderate Resolution Imaging 209 Spectroradiometer (MODIS)/Terra satellite observations (MOD08 Level 3, edition 5; Platnick 210 211 et al., 2003) are used to evaluate the geographic distribution of AOD.

Vertical profiles of aerosol extinction at 532 nm are retrieved at Nainital from micropulse lidar (MPL) backscatter measurements and MFRSR AOD data for March 2012, according to Kafle and Coulter (2013) and Klett (1981). After exclusion of cloud contamination and missing data, 26 days of MPL-retrieved extinction profiles remain, 25 of which have valid data during the daytime when MFRSR AOD retrievals are available. The 30-min-frequency extinction retrievals are averaged hourly and monthly for model comparison with a vertical 218 resolution of ~500 m. Aerosol extinction profiles at 532 nm are also available at a nearby low-elevation site, Kanpur (26.5°N, 80.3°E, e.s.l. 120m), from the National Aeronautics and 219 Space Administration's MPL network (MPLNET; Welton et al., 2001). Unlike Nainital, 220 which is located near the BL top, the Kanpur site provides aerosol characteristics close to the 221 surface pollution sources in the Indo-Gangetic Basin. During winter and the pre-monsoon 222 season, this site is often loaded with high concentrations of anthropogenic aerosols mixed 223 with dust from episodic events (Dey and Di Girolamo, 2010). The quality-assured MPLNET 224 225 level 2 daytime products are available from August 2011 to March 2012 for model comparison. In addition to the ground-based remote sensing data, CALIPSO satellite 226 retrievals of extinction profiles from the Cloud-Aerosol Lidar with Orthogonal Polarization 227 sensor (Winker et al., 2009), version 3, level 2, nighttime products are also used to 228 characterize regional variations in aerosol vertical distribution. Uncertainties associated with 229 these lidar retrievals of aerosol extinction profiles, either space-borne or ground-based, 230 include overlapping corrections near the surface, signal-to-noise ratio in the background 231 (Welton and Campbell, 2002), and propagated errors in AOD measurements (Kafle and 232 233 Coulter, 2013). The observations of extinction profiles are used mainly to identify and correct systematic bias in the model-simulated monthly mean vertical profiles of aerosols. The 234 aerosol abundances in the column are constrained with column-integrated AOD 235 measurements from MFRSR and MODIS. 236

3. Results

238 **3.1 Aerosol optical depth**

The model simulations of monthly mean AOD for March 2012 are compared with the 239 MODIS/Terra satellite observations in Fig. 1. During this time of the year, the Indo-Ganges 240 241 Valley is impacted with locally emitted aerosols from urban and industrial sources as well as 242 dust mainly from nearby arid agricultural lands and deserts (Giles et al., 2011). As shown in Fig. 1a, the MODIS retrievals of AOD are generally larger than 0.5 in these areas. Given the 243 dry pre-monsoon conditions with small wet removal, these aerosols are transported in long 244 distance by the northwesterly winds prevailing in the Valley. That leads to similarly high 245 246 AODs (>0.5) over to the Bay of Bengal and the eastern India in the MODIS observations. Another aerosol hotspot is off the southwest coast of the Indian subcontinent, influenced by 247

both nearby anthropogenic emissions in the western India and long-range transported
pollutions from the northern India (Ramanathan et al., 2001). Dust dominates the AOD
observed over the Arabian Sea with values about 0.3~0.5.

The model-calculated AODs (shown in Fig. 1b) are lower than MODIS retrievals over 251 most of the domain, while the overall geographic pattern of AOD distributions is simulated 252 except for over the Arabian Sea. Large AODs are predicted in northern and eastern India and 253 along the pathway that the aerosol plumes travel to southwestern India and the downwind as 254 255 depicted similarly in the MODIS observations. But the maximum AOD values calculated by the model are much lower around 0.3~0.4. AODs less than 0.1 are predicted over most of 256 northwestern India and the adjacent oceans, whereas MODIS has much higher values (> 0.3). 257 These discrepancies could be attributable to episodic dust activities not reproduced by 258 WRF-Chem (as shown in Fig. S1 in the Supplement that dust aerosols are dominating species) 259 or to overestimation associated with the MODIS satellite retrievals over highly reflective 260 surfaces such as deserts and clouds over the ocean. In other aerosol-concentrated regions, 261 anthropogenic pollutants such as sulfate, BC, and OC are the main contributors to the AOD 262 263 underestimation (Fig. S1).

The degree to which the model-calculated AOD is lower than the MODIS data is further 264 shown in Fig. 1c for March 2012. The figure compares the latitudinal variations in AOD 265 averaged between 60°E and 95°E. The default model (control run) calculations of AOD are 266 systematically smaller than the MODIS data (by about a factor of 2), from the Equator 267 northward to 27°N (Latitudes north of 27°N are not shown for the MODIS data, because 268 more than 2/3 of the data are missing). Despite the underestimation in absolute AODs, a 269 gradient in AOD calculated as a function of latitude is similar to the MODIS observations, 270 271 increasing by about ~0.1 AOD every 10° in latitude. In addition, the calculated daily daytime mean AODs are compared in Fig. 1d with ground-based GVAX MFRSR measurements at 272 Nainital and AERONET data at nearby Kanpur (~390 km southeast; locations of the two sites 273 are marked in Fig. 1b). Being a relatively clean site, Nainital has a monthly mean AOD of 274 0.232 from MFRSR measurements, while the mean AERONET AOD is 0.583 at Kanpur. The 275 276 discrepancies between the modeled and observed AOD are much smaller at the Nainital site. The monthly mean AOD at Nainital is estimated at 0.181 by WRF-Chem — about 22% lower 277

than the MFRSR AOD — and the model-data difference is only 13% if the outlier on day 27
of the observations is excluded. In contrast, the model's underestimation at Kanpur is about
54%, which is more close to the zonal-mean differences shown in Fig. 1c. These differences
in AOD comparison imply that WRF-Chem tends to underpredict aerosol extinction (whose
vertical integral is AOD) at lower elevations (in the BL) more than in the free troposphere
over this region, as the Nainital data are more representative of the atmosphere near or above
the BL top.

285 Similar underestimation in the modeled AOD compared with the MODIS observations is also found for other months between August 2011 and March 2012 (Fig. S2 in the 286 Supplement). The AOD underestimation is one of the common problems in aerosol model 287 simulations for post-monsoon and winter time periods over the S Asian region. Pan et al. 288 (2015) suggested several possible causes including suppression of the aerosol hygroscopic 289 growth and formation of secondary inorganic aerosol due to low-biased relative humidity in 290 the boundary layer (Feng et al., 2015), omission of nitrate aerosol, and underestimated 291 emissions from agricultural waste burning and biofuel usage. Resolving these differences in 292 293 AOD is beyond the scope of this paper that intends to identify the vertical location of the AOD biases and investigate the subsequent responses, but certainly deserves further 294 investigation. 295

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3.2 Aerosol extinction profiles

To further evaluate the vertical distribution of calculated aerosol extinctions (b_{ext}) , the 297 ground-based MPL retrievals available in March 2012 at Nainital and Kanpur, along with 298 CALIPSO satellite retrievals, are used. Figure 2 compares the simulated monthly mean 299 vertical profiles of b_{ext} with the observational data sets. Like column-integrated AOD, 300 301 calculated aerosol extinctions are also lower at the high-elevation Nainital site (Fig. 2a), at 302 the polluted surface Kanpur site (Fig. 2b), and as an average over the South Asia region (Fig. 2c). Moreover, the discrepancies between the modeled and observed profiles are larger in the 303 lower atmosphere, where aerosols are more concentrated (as indicated by larger extinctions), 304 than at higher altitudes in the free troposphere. These differences are further illustrated in Fig. 305 306 2d-f, which shows the percent differences in calculated extinction profiles relative to the CALIPSO data in the column. Table 1 summarizes the column-mean relative differences (%) 307

between the predicted monthly mean b_{ext} and retrievals from the CALIPSO data, expressed as

$$\frac{\sum_{i=1}^{n} \frac{\left[b_{ext,model}(i) - b_{ext,CALIPSO}(i)\right]}{b_{ext,CALIPSO}(i)}}{n} \times 100, \quad (1)$$

where $b_{ext,CALIPSO} > 0.01$, and *i* denotes the vertical levels from the surface up to 8 km (level *n*) at 0.1 km intervals. For altitudes below 850 hPa (or ~2-3 km, depending on the location), the calculated average differences between the model control run and the CALIPSO data are -56%, -52%, and -77% for Nainital, Kanpur, and South Asia, respectively. In comparison, smaller differences of -33%, -33%, and -75%, respectively, are estimated for the entire column.

The monthly mean extinction height (z_{α}) , defined as $\frac{\sum_{i=1}^{n} b_{ext,i} z_{i}}{\sum_{i=1}^{n} b_{ext,i}}$ (Koffi et al., 2012), is 316 also calculated in order to compare the modeled aerosol mean vertical structure with 317 observations (Table 2). On a regional mean basis over South Asia, z_{α} estimated from the 318 March CALIPSO data is 1.7 km in this study. This value is consistent with the 319 320 March-April-May mean extinction height of 1.99 km given by Koffi et al. (2012). However, model estimates of z_{α} in the control run are generally higher than those inferred from 321 ground- and satellite-based data sets over different locations/areas in South Asia, as shown in 322 Table 2. The only exception is the comparison with MPL data at Nainital, with a slightly 323 lower model-calculated z_{α} . This might be due to spatial averaging differences between the 324 12-km grid mean model results and the point-based MPL data, because the comparison of z_{α} 325 with the value estimated from CALIPSO for Nainital points to model overestimation, 326 327 consistent with the other sites. The analysis of extinction profiles confirms model underestimation of column AOD in March and moreover, indicates that the low bias in AOD 328 arises mainly from calculated lower aerosol burden in the lower atmosphere, which leads to 329 an AOD underestimate of > 50%, irrespective of location. These differences between the 330 observed and modeled profiles at low altitudes are generally larger than the uncertainties 331 associated with ground-based measurements (~40%). Although the CALIPSO satellite 332 retrievals indicate uncertainties of ~91% to 110%, at the two ground sites their monthly mean 333 values are comparable with the ground-based measurements. This validation provides support 334

to the regional mean comparison with the CALIPSO data here, as no sufficient ground-based measurements are available on the regional scale. Comparison of the standard deviations in the daily extinction profiles (Fig. S3 in the Supplement) and two-sample t-test of daily aerosol extinction time series suggest that the differences between the model calculations and observations (MPL data for Nainital and Kanpur; and CALIPSO data for South Asia) are significant below 2.5 km with p-values less than the significance level of 0.05 (in the Supplement).

342 To examine potential impacts on calculated radiative and thermodynamic processes from the underestimation of aerosols, sensitivity model runs are conducted for March 2012 by 343 optimizing matching of the observed aerosol vertical profiles. The calculated aerosol 344 extinctions in the lowest eight model layers (below ~850 hPa, at 1.5-3 km above sea level in 345 the simulated model domain) are increased by a factor of 2 at each time step to reduce the 346 identified low bias. However, there are no independent observations of aerosol absorption 347 vertical profiles to constrain the model. AERONET SSA or the satellite-based absorption 348 AOD retrievals provide constraints for column-integrated absorption properties, but neither 349 350 of them resolves in altitude. To address this uncertainty, two approaches are tested for adjusting the extinction profiles. In Case I, the calculated scattering and absorption 351 coefficients are increased proportionally, so that the altitude-dependent SSA — the fraction of 352 scattering in total extinction — remains the same as in the control run. This case assumes that 353 354 the underestimation of AOD is contributed proportionally by both scattering and absorbing aerosol loadings. In Case II, only the calculated aerosol scattering coefficient is increased to 355 compensate for the AOD underpredictions, whereas the absorption coefficient remains the 356 same as in the control run, so that the aerosol SSA is increased. This assumption for example 357 could represent for a case study of the underrepresented hygroscopic growth of aerosol 358 particles postulated in other studies for this region (Pan et al., 2015). Comparing Cases I and 359 II will help to illuminate the impact due to uncertainty in modeled aerosol absorption profiles, 360 when the model representation of aerosol extinction profiles is comparable to observations. 361

As Fig. 1c shows, the zonal-mean AOD comparison with the MODIS observations as a function of latitude is much improved in the sensitivity studies with the adjusted extinction profiles (red dot-dashed line). The domain-averaged mean AOD is higher at 0.31 compared to the base case value of 0.12, and only about 11% lower than that obtained from the MODIS retrieval (0.35). Similarly, adjustment of the extinction profiles also leads to significant improvement in the comparison with MPL and CALIPSO vertical profiles (Fig. 2 and Table 1). Below 850 hPa, the average percentage differences from the CALIPSO extinction profiles decrease to -12%, -11%, and -30% at Nainital, Kanpur, and South Asia, respectively. The mean errors averaged through the entire column also decrease to -22%, -14%, and -40%, respectively.

372 Some of the remaining differences between the calculated and observed profiles in the sensitivity studies can be attributed to uncertainty associated with column AOD retrievals by 373 CALIPSO. When the CALIPSO extinction profiles are normalized to the MODIS AOD data, 374 the differences between modeled and observed extinction profiles averaged over the South 375 Asia domain (Figs. 2c and 2f) are decreased to -16% for the entire column and -0.4% below 376 850 hPa (Table 1). This confirms that the bias correction method introduced in the sensitivity 377 studies compares better with the observed extinction profiles on the regional scale. On the 378 other hand, the CALIPSO profile normalized to the column integral of the MPL-retrieved 379 380 extinctions at Kanpur results in even larger AOD, thus enlarging the discrepancy from the predicted extinction profile to -33%. At Nainital, normalization makes little difference, 381 because the surface and satellite retrievals of column AOD agree well at this site. Overall, at 382 both ground sites and on the regional mean, the simulations of aerosol extinctions, 383 particularly near the surface (below 2-3 km), are significantly improved in the sensitivity 384 studies, compared to the control run. Furthermore, Table 2 shows that, for various regions in 385 South Asia, the estimated mean extinction height z_{α} for the adjusted extinction profiles in 386 the sensitivity studies is generally lowered by about 10-20%. This also results in better 387 388 agreement with the CALIPSO-inferred mean extinction heights. In the sections below, radiative and thermodynamic responses to these improved aerosol extinction profiles are 389 390 discussed.

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3.3 Radiative and surface temperature responses

The buildup of aerosols in March plays an important role in modulating the distribution of solar radiation throughout the atmosphere over South Asia. In the control run, the aerosol-induced change in net downward solar radiation at the TOA is estimated at about -3

W m⁻², averaged over South Asia (Table 3), suggesting an overall cooling effect. On the other 395 hand, aerosols heat the atmosphere by absorbing incoming solar radiation at $+6.3 \text{ W m}^{-2}$. This 396 reduces the net downward radiation at the surface (surface dimming) by -9.3 W m⁻². These 397 estimated changes in radiation fluxes not only account for the instantaneous perturbation on 398 399 radiation by aerosols (aerosol direct radiative forcing), but they also include the effects of rapid responses to aerosols at the land surface and in clouds (semi-direct radiative effects). 400 Because aerosol extinctions (thus AODs) in Cases I and II are increased to the same level, the 401 402 TOA radiative effects of aerosols are similar for the two cases, a net reduction of about -5 W m^{-2} . However, the distribution of incoming solar (shortwave) radiation in the column is very 403 different between the two cases: the estimated atmospheric absorption is 50% stronger in 404 Case I, leading to a larger negative aerosol forcing at the surface (-14.2 W m⁻²) than in Case II 405 $(-11.7 \text{ W m}^{-2}).$ 406

The aerosol impact on the surface air temperature (at 2 m) in the model simulations, 407 linked directly to aerosols' perturbation of the radiation budget, is shown in Fig. 3 as a 408 function of latitude over the land and oceans, respectively. Because the sea surface 409 410 temperature is fixed, the surface air temperature over the ocean responds little to aerosol surface forcing. The near-surface air temperature responds mainly to aerosol heating and 411 increases in the lower atmosphere over the ocean. . In contrast, the absolute changes in the 412 surface air temperature are much more significant over the land area, and they are also 413 414 opposite in sign. Over land, the dominating effect of aerosols is cooling corresponding to an overall negative forcing at the TOA. The latitudinal variations in the surface air temperature 415 changes are consistent with the AOD distribution, with a maximum up to -0.45 K at around 416 26°N. Of the three simulations, Case II estimates the largest cooling by aerosols at the surface, 417 although the largest surface dimming of the incoming radiation is given by Case I (Table 3). 418 This could be because aerosols over land are generally concentrated near the surface, and the 419 aerosol-induced warming of the lower atmosphere offsets the cooling due to the surface 420 dimming (Penner et al., 2003). Because Case I has more absorbing aerosols, the near-surface 421 compensating heating effect is stronger, resulting in weaker surface cooling for the same 422 423 AOD conditions as in Case II. The breakdown of the heating rate changes due to individual processes is discussed in the next section. 424

425 **3.4 Lower-atmosphere heating rate response**

In addition to instantaneous radiative heating due to aerosol absorption of solar radiation, 426 rapid adjustments in the surface energy balance and BL dynamical and thermodynamical 427 processes also influence the heating rate in the lower atmosphere. The heating rate in a 428 429 volume of air or the temperature tendency term (dT/dt) is calculated in the WRF-Chem model as a function of altitude for five different physical processes: shortwave (SW) and longwave 430 (LW) radiation, BL mixing, exchange of the latent heat flux in cloud microphysics (Micro), 431 432 and heat transport in cumulus (deep convection) parameterization. The differences in the calculated heating rates with and without aerosols are shown in Fig. 4 for individual 433 processes, except that cumulus cloud parameterization — a small term at a grid spacing of 12 434 km in March — is not shown. The heating rate profiles are shown separately over the land 435 (Figs. 4a-c) and oceans (Figs. 4d-f). The land-ocean contrast is evident in SW heating rates 436 that are much more significant over land because of higher aerosol loadings. The SW heating 437 over the ocean peaks at more elevated levels, mostly above ~900 hPa, not as close to the 438 surface as over the continental source regions. Since the sea surface temperature is fixed in 439 440 the simulations, stronger lower-atmosphere thermodynamic responses (indicated by larger heating rates) are estimated over the land than over the ocean for BL and LW process. 441

Consistent with the atmospheric forcing shown in Table 3, Case I estimates the largest 442 diurnal mean SW heating rate (maximum ~0.7 K/day) of the three cases, and the SW heating 443 444 rate in Case II is similar to that for the control run (maximum ~0.35 K/day). Forced by the same aerosol extinction profiles with the bias correction, the differences in calculated heating 445 rates for individual processes between Case I and Case II are shown in Fig. 4. These results 446 demonstrate the impact of different absorbing aerosol profiles on boundary layer dynamics 447 and cloud microphysics processes. The BL cooling is initiated as a dynamical response to 448 449 both surface dimming and atmospheric heating by aerosols. Because the simulated aerosol effects reduce the temperature gradient between the land and atmosphere, the surface 450 buoyance production is reduced. It leads to the suppression of the convection in the BL that 451 452 transports the heat fluxes, causing the cooling. Over land, the local maximum cooling due to 453 BL mixing occurs at the height with the largest SW heating; the larger SW heating in Case I also drives stronger BL cooling than in Case II. The LW radiation responds similarly to 454

455 surface dimming and atmosphere heating, so Case I estimates the largest LW cooling over 456 land. Over the ocean, the LW responses are also affected by cloud microphysics processes 457 (i.e., the subsequent latent heat flux exchanges from cloud condensation and evaporation 458 [Micro]). Because absorbing aerosols tend to stabilize the lower atmosphere and suppress the 459 cloud formation, Case I estimates a smaller Micro heating rate at the cloud condensation level 460 and also a smaller LW heating (cooling) below (above) the cloud layer over the ocean than 461 Case II.

462 The total aerosol impact on the lower-atmosphere temperature profile is determined by the combined effects of all the heating rates (solid black line in Fig. 4). Over the ocean, the 463 total heating rate is strongly governed by the SW heating. Thus, Case I calculates the most 464 significant atmospheric heating by aerosols, which warms most of the lower atmosphere 465 below 600 hPa. The maximum heating occurs below the level where the SW heating rate 466 peaks, because of compensating LW cooling by lower marine clouds. The heating response is 467 different over land. The calculated total heating rate deviates from the SW heating profile in 468 the lower atmosphere as a result of rapid thermodynamic adjustments over the land surface 469 470 and through BL mixing. Aerosols tend to have an overall cooling effect (negative heating rate) near the surface that exceeds the direct instantaneous SW radiative heating. The surface 471 cooling rate is enhanced from ~-0.4 K/day in the control run to -0.7 K/day in Case I and -0.8 472 K/day in Case II after aerosol extinctions are increased nearly to the observed levels. 473

474 Furthermore, sensitivity studies of unconstrained partitioning between absorbing and scattering components of aerosols (Case I versus Case II) show that higher atmospheric 475 heating due to a larger absorption fraction (as in Case I) offsets part of the near-surface BL 476 and LW cooling responses generated, which are similar to those in Case II. Therefore, Case I 477 478 warms the lower atmosphere more pronouncedly than Case II but cools less at the land 479 surface. This implies that the manifestation of aerosol direct and semi-direct radiative effects not only depends on the aerosol extinction profile but also is affected strongly by aerosol 480 absorption. These uncertainties in the estimated heating rates resulting from aerosol vertical 481 distributions further propagate into simulations of the BL height and cloudiness, as discussed 482 483 below.

484 **3.5 Atmospheric dynamic and thermodynamic responses**

485 As a result of changes in the heating rate, aerosol effects tend to stabilize the lower atmosphere over land. As Fig. 5 shows, the predicted BL height is lowered over most of the 486 land areas in all three simulations compared to the run without aerosol-radiation feedbacks. 487 The reduction in the BL height is about -10% to -20% at locations where the estimated peak 488 489 BL height (at 1300-1400 local time) is above 2-3 km during the pre-monsoon month. The aerosol impact on the BL height is more significant with increased AOD or extinction in the 490 sensitivity studies, Case I and Case II, than in the control run. Moreover, more absorbing 491 492 aerosols in Case I result in smaller reductions in the BL height than in Case II. This implies 493 that the BL height is predominately linked to surface cooling. Because Case II generates the largest cooling at the surface (Fig. 3), we obtain the largest reductions in the BL heights for 494 Case II. On some portions of the ocean and land surfaces, the BL height is moderately higher 495 (roughly about 200 m) with aerosols, and these regions correspond to areas where aerosols 496 generally have a warming effect on the near-surface air temperature. 497

Figure 6 illustrates percent changes due to aerosols in meridional circulation (ν , - ω) and 498 total precipitable water vapor (background color map) averaged at 60-95°E. These changes 499 500 are linked closely to anomalies of total heating or cooling in the atmosphere (Fig. 4). At 501 5-20°N where ocean prevails, atmospheric heating by aerosols results in strengthening of the upward motion in all three model simulations, especially below 700 hPa (Figs. 6a-c). This is 502 503 accompanied by enhanced large-scale subsidence in the lower troposphere north of 20°N 504 where land surface prevails and aerosols have an overall cooling effect due to strong negative LW and BL responses. The largest enhancement in the ascending zone for aerosols is in Case 505 I, which also has the highest absorbing aerosol content. Similarly, Case II, with the strongest 506 507 cooling, calculates the largest enhancement in the descending zone.

The changes in updraft and downdraft are consistent with the aerosol-induced changes in surface pressure, as illustrated in Fig. 6d for Case I. The decreased pressure over the ocean and an increase over the northern Indian subcontinent are accompanied by enhanced convergence at 850 hPa over the Arabian Sea and enhanced divergence over the eastern India coast, adjacent to the Bay of Bengal. The high-pressure system and divergence drive recirculation of the subsidence flow northward and form more terrain-elevated convection along the Himalayan foothills. Aerosols transported over high-elevation mountains induce a warming effect over the snow-covered surface by reducing the surface albedo, thus enhancing
convective updraft over the Qinghai–Tibet Plateau.

In response to the radiative and dynamical perturbation, the aerosol-induced 517 thermodynamic responses are manifested through enhanced surface evaporation and upward 518 transport of clean, moist marine air from the northern Indian Ocean (Figs. 6a-c). The 519 elevation of water vapor to the upper troposphere in the tropics leads to reduced moisture in 520 the middle troposphere over the subtropics. The calculated percent changes in predicted total 521 522 precipitable water vapor are very sensitive to the aerosol properties simulated. Compared with the control run, Case I predicts both larger increases of water vapor at 5-20°N and larger 523 decreases of water vapor north of 20°N in the free troposphere, as a result of increased 524 aerosol extinctions and AOD. On the other hand, Case II has the same aerosol extinctions and 525 AOD as Case I but gives rise to weaker BL moistening in the tropics and stronger drying (by 526 527 about 50% drier than Case I) in the middle troposphere of the subtropics (>15 $^{\circ}$ N), as a result of less light-absorptive aerosols. 528

As for water vapor, Fig. 7 shows responses in cloudiness for different aerosol simulations. 529 530 Cloud frequency of occurrence is calculated as percent of hours in a month with non-zero liquid water cloud fraction below 500 hPa in each column. In pre-monsoonal March, clouds 531 occur more frequently over the tropical and subtropical ocean than land, in the range of 20-80% 532 (green contour lines in Fig. 7). Over most of the land, cloud occurrence is lower than 10%, 533 534 except for the mountainous areas and over the Plateau with orographic and convective cloud formation which is either not very susceptible to aerosol effects or has low aerosol 535 concentrations. Therefore, over the polluted land surface, in spite of high aerosol loadings, 536 cloud changes resulting from the simulated aerosol effects are small within $\pm 5\%$ and 537 538 considered as insignificant, as shown by the color map in Fig. 7a. The most significant cloud response is found over the Bay of Bengal at 10-20°N, where the cloud occurrence exceeds 60% 539 of the time and aerosol loadings are also high. Increased aerosol extinctions in Case I (Fig. 7b) 540 and Case II (Fig. 7c) result in different cloud responses from the control run (Fig. 7a), which 541 calculates a moderate increase of 5-10% in cloudiness due to aerosols. Case I enhances the 542 aerosol effect in the control run and calculates a distinct and overwhelming increase of 10-20% 543 more cloudy skies over this region, whereas cloud formation in Case II is largely suppressed 544

and aerosols are found to decrease cloudiness by about 5-10% over some areas. Therefore, while aerosol extinctions being the same, a smaller SSA (more absorbing aerosols) in Case I could change the cloud response to aerosol radiative effects from negative to positive in pre-monsoon month. And this uncertainty in cloud response up to 10-20% could contribute to about one third of the calculated local cloud frequency of occurrence (40-60%).

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4. Summary and Discussion

Although aerosol radiative effects have been incorporated into global and regional 551 552 climate simulations, quantification of simulated aerosol vertical distributions and subsequent climate responses in large-scale models is lacking. This is of particular importance for 553 climate studies over South Asia, where high concentrations of aerosols are possibly linked to 554 weakening of the South Asian Monsoon in the 20th century (Bollasina et al., 2014). During 555 March 2012, ground-based lidar measurements of vertical distributions of aerosol extinctions 556 were made available in a polluted area of northern India, both at a high-elevation site 557 (Nainital) near the BL top and at a valley site (Kanpur) near sea level. The aerosol extinction 558 profiles retrieved at these two sites provide an independent ground calibration of CALIPSO 559 560 satellite retrievals of aerosol vertical distributions, which cover a more extended domain. Together, the profiles are used to identify altitude-related bias in WRF-Chem regional model 561 simulations of aerosol optical properties over this region. 562

Our study reveals some broad tendencies and biases in model AOD simulations over 563 South Asia. Compared to the MODIS satellite AOD, the WRF-Chem model generally 564 underestimates AOD, despite using a high-resolution regional model with a grid spacing of 565 12 km and updated anthropogenic emissions. On a zonal or regional mean basis, the modeled 566 AODs are underestimated by about half of the MODIS retrievals. Furthermore, we 567 568 demonstrate that the low bias in column AOD is mainly associated with underprediction of 569 aerosol extinctions in the lower troposphere versus observed extinction profiles. Systematic underestimation of > 50% was observed below 2-3 km at the two ground sites. Comparison 570 with CALIPSO satellite data indicates even larger discrepancies of roughly 77% below ~2 571 km on a regional mean basis, although some of the differences can be attributed to 572 573 uncertainty associated with the CALIPSO retrievals of column AOD. Above ~2 km, the model's low bias in calculated aerosol extinction is smaller and the extent of the model 574

575 underestimation also varies depending on the geographical locations. Previous studies have 576 indicated similar low bias (to different extents) in modeled column AOD (Ganguly et al., 577 2009; Cherian et al., 2013; Pan et al., 2015) and lower-atmosphere extinction coefficients (Yu 578 et al., 2010; Koffi et al., 2012; Pan et al., 2015) over this region. Therefore, although the 579 atmospheric radiative and dynamical responses derived from the sensitivity studies in this 580 study are based on the WRF-Chem model used in this study, the dependence on aerosol 581 extinction profiles might also be applicable to other model simulations.

582 Resolving the mismatch between simulated and observed aerosol extinction profiles requires possible upgrades of multiple model physics schemes and quantification of key 583 parameters that could affect vertical distribution of aerosols, for instance, biomass burning 584 injection heights (Grell et al., 2011), boundary layer height and near-surface winds (Nair et al., 585 2012). Additionally, high-quality measurements at different locations are also needed for 586 model evaluation over longer time periods, and it is recommended for future studies over this 587 region. Here, instead of speculating on factors that contribute to the model-data differences, 588 we apply a bias correction to simulated aerosol extinction profiles and demonstrate the 589 590 impact on regional climate simulations. In our sensitivity studies, increases in aerosol extinction below 2-3 km lead to improved agreement in column AOD, from an 591 underestimation of -66% to -11% relative to MODIS retrievals averaged over South Asia. 592 This suggests that about 83% of the AOD underestimation is attributable to model levels 593 594 below 2-3 km. In addition, the column-mean differences between modeled and CALIPSO extinction profiles averaged over the South Asia domain are reduced from 75% to 40% or 16% 595 if the CALIPSO profiles are normalized to the MODIS AOD retrievals. In the 596 aerosol-concentrated lower atmosphere below 2-3 km, the predicted regional-mean extinction 597 598 profile agrees with the CALIPSO retrieval within 30% or 0.4% compared with the CALIPSO 599 profile normalized to the MODIS AOD.

600 Compared to the control run, the increased aerosol extinctions in Case I and Case II 601 result in 63% and 80% larger negative forcing at the TOA for -4.9 and -5.4 W m⁻², 602 respectively, and 53% and 26% stronger dimming effects at the surface for -14.2 and -11.7 W 603 m⁻², respectively. The contrast between Case I and Case II demonstrates the importance of 604 constraining the vertical distribution of aerosol absorption, in addition to extinction profiles.

When column AOD and extinction profiles are the same as in Case I and Case II, additional absorbing aerosols (a smaller SSA) in Case I generate a 48% larger atmospheric forcing for $+9.3 \text{ W m}^{-2}$.

More importantly, we demonstrate that the larger atmospheric heating and surface 608 dimming in Case I lead to smaller lower-atmosphere cooling (up to -0.7 K day⁻¹) over land 609 than in Case II (up to -0.8 K day⁻¹); in the latter, the aerosols cause a smaller energy 610 imbalance between the atmosphere and surface. This indicates that although absorbing 611 612 aerosols generate larger radiative heating in the atmosphere, they also cause stronger cooling responses from the land surface and BL. These rapid adjustments counteract atmospheric 613 heating and lead to overall cooling at the surface and in the lower atmosphere. The resultant 614 cooling effect is lower than that due to fewer absorbing aerosols with the same AOD (a larger 615 SSA). 616

Consequently, atmospheric dynamic and thermodynamic processes also respond 617 differently. Case I predicts smaller reductions in BL height than Case II over land, as a result 618 of a more stabilized lower troposphere. On the other hand, the larger atmospheric warming 619 620 due to increased absorption of solar radiation in Case I increases surface evaporation from the ocean and enhances the upward convective transport of moisture into the upper troposphere 621 in the tropics. The consequence is a reduction in the transport of moisture to the subtropical 622 lower-to-middle troposphere during the pre-monsoon time over this region. And clouds occur 623 624 more frequently over the Bay of Bengal. Although the simulated aerosol perturbation is small for large-scale circulation (about 10 hPa day⁻¹ vertically, and 0.1 m s⁻¹ in the meridional 625 direction), water vapor ($\pm 6\%$), and cloud occurrence ($\pm 10\%$), the propagated uncertainty due 626 to aerosol extinction is comparable to the absolute aerosol effect, and the partitioning of 627 absorbing and scattering aerosols could change the sign of these responses. 628

In this work, we had to limit the evaluation of model vertical extinction profiles to one month, because of the need for ground-based vertical profile observations at different locations and times to validate and supplement the CALIPSO satellite retrievals. It would be desirable to conduct similar evaluations for longer times and use ensemble members of perturbed meteorological conditions to better investigate the climate response to uncertainties in modeled aerosols. In addition, observational constraints on aerosol absorption profiles are lacking. In particular, light absorption by brown carbon aerosols from biomass burning, which are important aerosol sources in South Asia, might contribute additional aerosol absorption (Feng et al., 2013). This absorption enhancement is not considered in this version of the WRF-Chem model used for this study and evaluated. Also, model simulations of semi-direct aerosol effects depend strongly on the model representation of clouds, which is not examined here; on the other hand, cloud occurrences are generally low over this region during the pre-monsoon month.

642 Nevertheless, this study improves the understanding of model underestimation of aerosols in particular their vertical distribution over South Asia and highlights the importance 643 of accurate representation of both aerosol extinction and absorption profiles in regional 644 climate simulations. Determining whether aerosol scattering or absorption contributes to the 645 aerosol optical underestimation is critical, because the two sensitivity studies here reveal 646 different responses in predicted large-scale dynamics and in subsequent water vapor and 647 cloud distributions. Additional high-quality, routine measurements of both aerosol extinction 648 and absorption profiles are needed. Furthermore, we show that rapid adjustments in the land 649 650 surface energy budget and atmospheric dynamics modulate the instantaneous radiative perturbation by aerosols with comparable force and can either amplify or offset the direct 651 aerosol radiative forcing. Our results thus reinforce the need for observational constraints of 652 effective radiative forcing, which includes both direct and semi-direct radiative effects, for 653 654 quantifying aerosol-radiation interactions, as suggested in the Intergovernmental Panel on Climate Change fifth assessment report (Boucher et al., 2013). 655

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	Column Differences (%)			Differences below 850 hPa (%)		
_	Model	Model	Model	Model	Model	Model
	(control	(increased	(increased	(control	(increased	(increased
Site	run)	extinction)	extinction)*	run)	extinction)	extinction)*
Nainital	-33	-22	-25	-56	-12	-16
Kanpur	-33	-14	-33	-52	-11	-31
S. Asia	-75	-40	-16	-77	-30	-0.4

Table 1. Estimated differences relative to CALIPSO extinction profiles at Nainital, Kanpur,
 and South Asia in March 2012

925 *Percent differences relative to the CALIPSO extinction profiles normalized to the column

927 for South Asia.

Tables

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- 930 **Table 2.** Calculated mean extinction height (km) from observations (MPL and CALIPSO)
- and model simulations over different regions in March 2012

	Calculated Mean Extinction Height (km)					
					North	
			Indo-Ganges	Central	Indian	
	Nainital	Kanpur	basin	India	Ocean	South Asia
MPL	4.11	1.39	-	-	-	-
CALIPSO [*]	3.55 (3)	1.48 (4)	1.53 (9)	1.74 (4)	1.09 (5)	1.70 (29)
Model	4.00	2.09	1.86	1.91	1.73	1.85
(control run)						
Model	3.64	1.68	1.69	1.68	1.53	1.68
(increased						
extinction)						

^{*}Numbers in the parentheses are the counts of CALIPSO tracks of the month.

933

934 Table 3. Aerosol-induced changes in shortwave radiation flux calculated by the WRF-Chem

model in the control run and two sensitivity studies (Case I and Case II) for March 2012,

averaged for 60-95°E, and 0-36°N.

	Aerosol-Induced Change (W m ⁻²)			
	Control run	Case I	Case II	
Top of the atmosphere	-3.0	-4.9	-5.4	
Atmosphere	+6.3	+9.3	+6.3	
Surface	-9.3	-14.2	-11.7	

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AOD inferred from the surface measurements for Nainital and Kanpur and the MODIS data

940 Figures

941 Figure 1. For March 2012: (a) MODIS-retrieved and (b) simulated monthly mean AOD

distributions over South Asia. The locations of Nainital and Kanpur sites are indicated by red

dots. (c) Latitudinal variations in AOD averaged for 60-95°E from the model control run (red

solid), sensitivity runs (red dotted dash), and MODIS retrievals (blue). North of 27°N, more

than 2/3 of the MODIS AODs are missing (data not shown). (d) Comparison of simulated and

946 observed daily mean AOD at Nainital and Kanpur

947 Figure 2. Comparisons of monthly mean aerosol extinction profiles from model calculations

at 550nm (red squares for the control run and green open circles for the sensitivity studies),

ground-based MPL data at 532nm (solid black), satellite-retrieved CALIPSO data at 532nm

- 950 (dashed black), and CALIPSO data normalized to the MODIS AODs (dashed blue) (a) at
- Nainital, (b) at Kanpur, and (c) over South Asia (60-95°E, 0-30°N), respectively. The
- 952 column-mean uncertainty in CALIPSO extinction data is $\pm 110\%$, $\pm 93\%$, and $\pm 91\%$ in panels
- 953 (a)-(c); Percent differences between the simulated and CALIPSO profiles are shown for (d)
- 954 Nainital, (e) Kanpur, and (f) South Asia
- Figure 3. Changes in surface air temperature (K) due to aerosol radiative effects for three
 model simulations

Figure 4. Calculated monthly mean heating rates (temperature tendency, dT/dt, in K/day)

958 perturbed by aerosols, over land for (a) the control run, (b) Case I, and (c) Case II, as well as

over the ocean for (d) the control run, (e) Case I, and (f) Case II. The heating processes

960 include shortwave (SW) radiation (red), longwave (LW) radiation (blue dashed), boundary

961 mixing (BL; magenta dashed), and cloud microphysics (Micro; green). The total heating due

- 962 to aerosol effects is shown with solid black lines
- Figure 5. (a) Calculated monthly mean planetary BL height (PBLH) at 1300-1400 local time

for March, without aerosols; and estimated changes in PBLH (Δ PBLH) due to aerosols in (b)

965 the control run, (c) Case I, and (d) Case II

Figure 6. Changes in meridional circulation $(v, -\omega)$, averaged at 60-95°E, due to different 966 967 aerosol effects for (a) the control run, (b) Case I, and (c) Case II, where v (scaled to 0.1 m/s) is the meridional velocity, and $-\omega$ (scaled to 10 hPa/day) is the vertical velocity. The 968 color-shaded contours in the background indicate the changes (%) in total precipitable water 969 (ΔQv) in the column due to aerosols. Panel (d) shows the changes in horizontal winds (u, v) 970 at 850 hPa and surface pressure changes(Δ PSURF) due to aerosols for Case I 971 Figure 7. Changes in frequency of cloud occurrence (defined as % of hours in a month with 972 clouds below 500hPa in each column) due to aerosols for (a) the control run, (b) Case I, and 973

974 (c) Case II. The contour lines in green color in each panel indicate calculated frequency of

cloud occurrence without aerosols. The contour levels are shown for 10%, 20%, 40%, and

976 60%

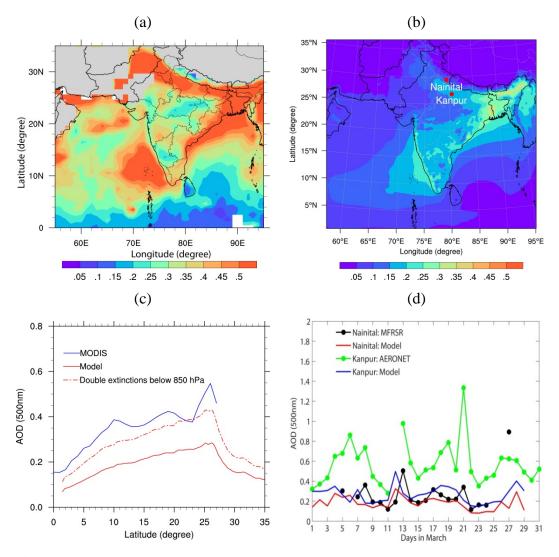


Figure 1. For March 2012: (a) MODIS-retrieved and (b) simulated monthly mean AOD distributions over South Asia. The locations of Nainital and Kanpur sites are indicated by red dots. (c) Latitudinal variations in AOD averaged for 60-95°E from the model control run (red solid), sensitivity run (red dotted dash), and MODIS retrievals (blue). North of 27°N, more than 2/3 of the MODIS AODs are missing (data not shown). (d) Comparison of simulated and observed daily mean AOD at Nainital and Kanpur

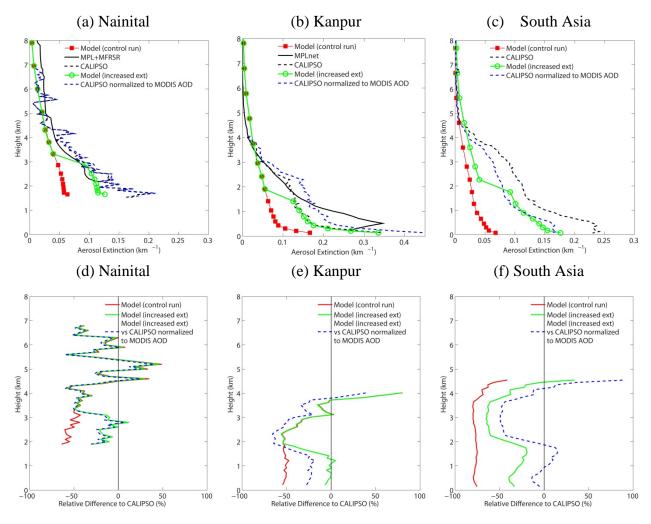


Figure 2. Comparisons of monthly mean aerosol extinction profiles from model calculations at 550nm (red squares for the control run and green open circles for the sensitivity studies), ground-based MPL data at 532nm (solid black), satellite-retrieved CALIPSO data at 532nm (dashed black), and CALIPSO data normalized to the MODIS AODs (dashed blue) (a) at Nainital, (b) at Kanpur, and (c) over South Asia (60-95°E, 0-30°N), respectively. The column-mean uncertainty in CALIPSO extinction data is $\pm 110\%$, $\pm 93\%$, and $\pm 91\%$ in panels (a)-(c); Percent differences between the simulated and CALIPSO profiles are shown for (d) Nainital, (e) Kanpur, and (f) South Asia.

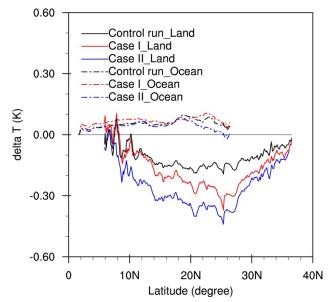


Figure 3. Changes in surface air temperature (K) due to aerosol radiative effects for three model simulations.

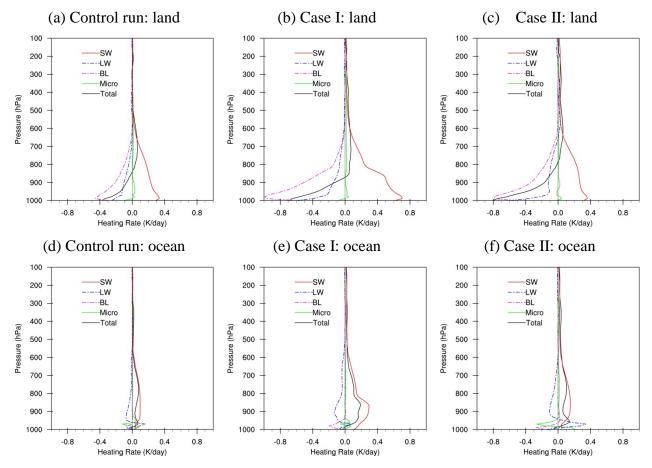


Figure 4. Calculated monthly mean heating rates (temperature tendency, dT/dt, in K/day) perturbed by aerosols, over land for (a) the control run, (b) Case I, and (c) Case II, as well as over the ocean for (d) the control run, (e) Case I, and (f) Case II. The heating processes include shortwave (SW) radiation (red), longwave (LW) radiation (blue dashed), boundary mixing (BL; magenta dashed), and cloud microphysics (Micro; green). The total heating due to aerosol effects is shown with solid black lines.

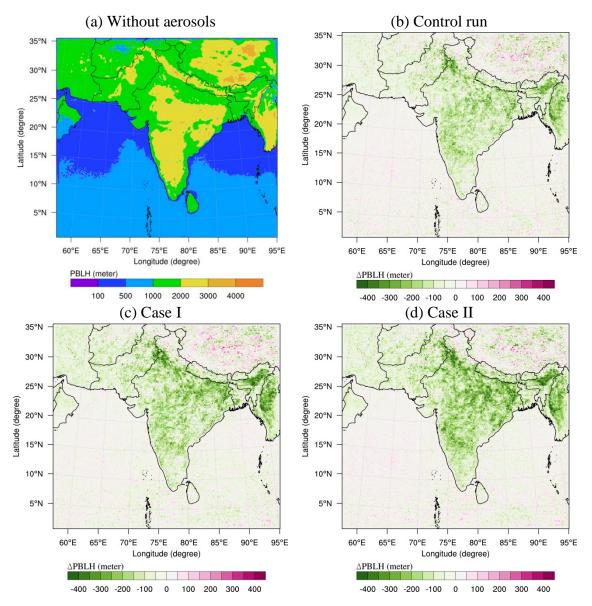


Figure 5. (a) Calculated monthly mean planetary BL height (PBLH) at 1300-1400 local time for March, without aerosols; and estimated changes in PBLH (Δ PBLH) due to aerosols in (b) the control run, (c) Case I, and (d) Case II.

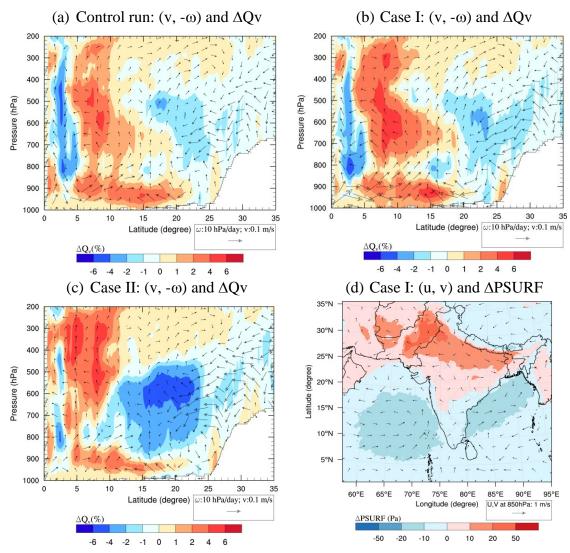
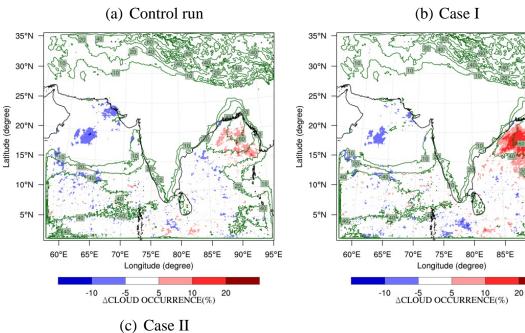


Figure 6. Changes in meridional circulation $(v, -\omega)$, averaged at 60-95°E, due to different aerosol effects for (a) the control run, (b) Case I, and (c) Case II, where v (scaled to 0.1 m/s) is the meridional velocity, and - ω (scaled to 10 hPa/day) is the vertical velocity. The color-shaded contours in the background indicate the changes (%) in total precipitable water (Δ Qv) in the column due to aerosols. Panel (d) shows the changes in horizontal winds (u, v) at 850 hPa and surface pressure changes(Δ PSURF) due to aerosols for Case I.





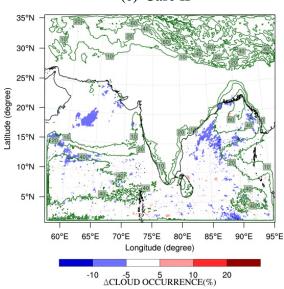


Figure 7. Changes in frequency of cloud occurrence (defined as % of hours in a month with clouds below 500hPa in each column) due to aerosols for (a) the control run, (b) Case I, and (c) Case II. The contour lines in green color in each panel indicate calculated frequency of cloud occurrence without aerosols. The contour levels are shown for 10%, 20%, 40%, and 60%

90°E

95°E