Environmentally dependent dust chemistry of a super Asian dust storm in March 2010: observation and simulation

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Received: 10 May 2017 – Discussion started: 15 May 2017
Revised: 18 January 2018 – Accepted: 4 February 2018 – Published: 9 March 2018

Abstract. Near-surface and vertical in situ measurements of atmospheric particles were conducted in Shanghai during 19–23 March 2010 to explore the transport and chemical evolution of dust particles in a super dust storm. An air quality model with optimized physical dust emission scheme and newly implemented dust chemistry was utilized to study the impact of dust chemistry on regional air quality. Two discontinuous dust periods were observed with one traveling over northern China (DS1) and the other passing over the coastal regions of eastern China (DS2). Stronger mixing extents between dust and anthropogenic emissions were found in DS2, reflected by the higher \(\text{SO}_2/\text{PM}_{10}\) and \(\text{NO}_2/\text{PM}_{10}\) ratios as well as typical pollution elemental species such as As, Cd, Pb, and Zn. As a result, the concentrations of \(\text{SO}_4^{2-}\) and \(\text{NO}_3^-\) and the ratio of \(\text{Ca}^{2+}/\text{Ca}\) were more elevated in DS2 than in DS1 but opposite for the \([\text{NH}_4^+] / (\text{SO}_4^{2-} + \text{NO}_3^-)\) ratio, suggesting the heterogeneous reactions between calcites and acid gases were significantly promoted in DS2 due to the higher level of relative humidity and gaseous pollution precursors. Lidar observation showed a columnar effect on the vertical structure of particle optical properties in DS1 that dust dominantly accounted for \(\sim 80–90\%\) of the total particle extinction from near the ground to \(\sim 700\) m. In contrast, the dust plumes in DS2 were restrained within lower altitudes while the extinction from spherical particles exhibited a maximum at a high altitude of \(\sim 800\) m. The model simulation reproduced relatively consistent results with observations that strong impacts of dust heterogeneous reactions on secondary aerosol formation occurred in areas where the anthropogenic emissions were intensive. Compared to the sulfate simulation, the nitrate formation on dust is suggested to be improved in the future modeling efforts.

1 Introduction

Asian dust originating from the arid and semiarid areas in Mongolia and China can be transported for long distances, reaching Beijing (Sun et al., 2010), Shanghai (Fu et al., 2010), Xiamen (Zhao et al., 2011), Taiwan (Tsai et al., 2012, 2014), and even as far as North America (Uno et al., 2009; Wu et al., 2015), exerting significant impacts on the air quality of both densely populated habitations and remote regions. Huang et al. (2014) showed that Asian dust could be transported from the Qilian Shan or from the Tsaidam Basin through Qinghai and Gansu provinces to reach the Pacific Ocean, and that dust originating from the Taklimakan Desert could travel across the Hexi Corridor and Loess Plateau to reach southeastern China. Zhao et al. (2011), Taiwan (Tsai et al., 2012, 2014), and even as far as North America (Uno et al., 2009; Wu et al., 2015), exerting significant impacts on the air quality of both densely populated habitations and remote regions. Huang et al. (2014) showed that Asian dust could be transported from the Qilian Shan or from the Tsaidam Basin through Qinghai and Gansu provinces to reach the Pacific Ocean, and that dust originating from the Taklimakan Desert could travel across the Hexi Corridor and Loess Plateau to reach southeastern China. Zhao et al. (2006) demonstrated that the deserts in Mongolia and in western and northern China were the major sources of Asian dust particles in East Asia and estimated that 26\% of the dust particles emitted from Asian dust sources were transported to the Pacific Ocean. Eguchi et al. (2009) reported that the dust plume from
the Gobi Desert in East Asia was transported at low altitudes of 4–6 km to North America and mixed with Asian anthropogenic air pollutants during its transport. Fu et al. (2014) simulated that during a dust event from 1 to 6 May 2011, the transported dust particles accounted for 78.9 % of the surface layer PM$_{10}$ over the Yangtze River Delta.

Dust particles can significantly influence the regional and global climate directly by absorbing and scattering solar radiation (Bi et al., 2016) and also indirectly by influencing the formation of ice nuclei, cloud, and precipitation (Creamean et al., 2013; Li and Min, 2010; Wang et al., 2010). In addition, deposition of transported dust particles into the ocean can enhance phytoplankton blooms due to the existence of bioavailable iron (Wang et al., 2012; Zhuang et al., 1992), which indirectly impacts global climate change. The effects of dust particles on climate change depend critically on their physical and chemical properties. Natural dust particles with limited contamination have low light absorption, with a single-scattering albedo of 0.91–0.97 at 500 and 550 nm (Bi et al., 2014; Uchiyama et al., 2005). During the long-range transport, dust particles are often modified by their mixing with anthropogenic emissions over the downwind areas (Fischer et al., 2011; Formenti et al., 2011; Huang et al., 2010b; Tobo et al., 2010), resulting in high uncertainties in evaluating the climatic effects of dust particles. It was estimated that mineral dust had a radiative forcing of $-0.1 \pm 0.2$ W m$^{-2}$ (IPCC, 2013), of which the uncertainty was as high as 200 %. Obviously, the characteristics of dust particles and their evolution during the transport are not well understood.

In March 2010, a super dust storm swept China, invading extensive areas from northern China to southern China including Fujian and Guangdong provinces and lasting for ~4 days from 19 to 23 March (Li et al., 2011). The dust plumes further extended to the South China Sea (Wang et al., 2011), Taiwan (Tsai et al., 2013), South Korea (Tatarov et al., 2012), Japan (Zaizen et al., 2014), and even to North America (Wu et al., 2015). This dust storm was as strong as the one in 20–21 March 2002 and attracted considerable attention. Chen et al. (2017) used WRF-Chem to simulate the emission and transport of dust particles over the Taklimakan Desert and Gobi Desert. The results indicated that the Gobi Desert dust particles were easily lifted to 4 km and subject to the long-range transport, which contributed much more to the dust plumes over East Asia than the Taklimakan Desert dust. Lidar observations revealed that this super dust storm was transported within a low altitude (Tatarov et al., 2012; Wang et al., 2011), which could benefit the mixing and interaction between dust particles and anthropogenic pollutants. Indeed, modifications of dust particles during the transport of this dust storm were suggested based on in situ measurements. Zhao et al. (2011) displayed substantial increases in particulate sulfate and nitrate when the dust plumes arrived at Xiamen City of Fujian Province, implying the mixing and interaction between dust particles and anthropogenic pollutants. Wang et al. (2011) indicated that the dust particles detected at the Pratas Islands over the South China Sea were mixed with anthropogenic and marine particles. Observations of this dust storm at Tsukuba and Mt. Haruna, Japan, showed that most of the transported dust particles in lower altitudes were internally mixed with sulfate or sea salt (Zaizen et al., 2014).

Most of the studies on this super dust storm focused on investigating the dust particles reaching southeastern China and the South China Sea and relied on a single method, e.g., aerosol chemistry measurement, optical property inversion, or model simulation. In this study, we investigated this super dust storm in Shanghai, a coastal city in eastern China. A synergy of measurement techniques was applied, including in situ measurements of pollutant gaseous precursors, particle with its major chemical components, and lidar observation of particle optical properties. To corroborate the observational evidence, a regional numerical model was used to simulate the impact of dust chemistry on the perturbation of regional air quality. What interested us is that there were two discontinuous dust periods observed in Shanghai with distinctly different transport pathways, providing a great opportunity to study the chemical evolution of transported dust particles under different environmental conditions.

2 Methodology

2.1 Field measurement

2.1.1 Lidar observation

A dual-wavelength depolarization lidar (model L2S-SMII) developed by the National Institute for Environmental Studies (NIES) of Japan was installed on the roof (~20 m above ground level) of a teaching building on the campus of Fudan University in the Yangpu District of Shanghai (Fig. 1b). The lidar measurement was performed every 15 min (at 00, 15, 30, and 45 min every hour) with a height resolution of 6 m. Attenuated backscattering coefficient ($\beta$), volume depolarization ratio ($\delta v$), particle depolarization ratio ($\delta \rho$), and particle extinction coefficient ($\sigma$) at the wavelength of 532 nm were obtained by the measurement. More details about the lidar system have been described in Huang et al. (2012). $\delta v$ is calculated using the parallel ($I_p$) and perpendicular ($I_s$) components of backscatter intensity, and $I_p$ and $I_s$ were calibrated before the calculation. Briefly, a sheet polarizer with the polarizing direction set at 45° (then ~45°) to the polarizing plane of the emitted light was installed in front of the beam splitter cube, and two sets of backscatter signal profiles from the sky were obtained for the calibration. The detailed calibration procedure has been described in Shimizu et al. (2004, 2017). $\sigma$ was derived using the Fernald inversion method (Fernald, 1984) with the lidar ratio (extinction-to-backscatter ratio) set as 50 sr (Liu et al., 2002) in the inversion process. The total particle extinction coefficient can be split into nonspherical particle (dust particle, $\sigma_d$) and spheri-
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Figure 1. (a) Locations of the 86 major cities in China. The cities with PM$_{10}$ concentrations up to 600 µg m$^{-3}$ on 20, 21, and 22 March are marked by red, blue, and pink circles, respectively. (b) The site location of the ground-based measurement in Shanghai.

2.1.2 Online particle and gas monitoring

Continuous PM$_{10}$ concentrations were measured with a TEOM (tapered element oscillating microbalance) 1405D monitor (Thermo Scientific, USA). Trace gases SO$_2$ and NO$_2$ were measured with a 43i SO$_2$ analyzer (Thermo Scientific, USA) and a 42i NO-NO$_2$-NO$_x$ analyzer (Thermo Scientific, USA), respectively. All the measured PM$_{10}$ and gas concentrations were averaged and used at intervals of 1 h in this study.

2.1.3 Aerosol sampling

TSP (total suspended particle) samples were collected during 19–27 March 2010 at the Fudan observational site co-located with all the other instruments. The aerosol samples were collected for 12 h (normally from 08:00 to 20:00 LST, local standard time, in daytime and from 20:00 to 08:00 LST of the next day at nighttime) or 24 h (normally from 08:00 to 08:00 LST of the next day) on Whatman 41 filters (Whatman Inc., Maidstone, UK) by a medium-volume sampler (Beijing Geological Instrument-Dickel Co., Ltd.; model TSP / PM$_{10}$ / PM$_{2.5}$ – 2; flow rate: 77.59 L min$^{-1}$). All the samples were put in polyethylene plastic bags immediately after sampling and then reserved in a refrigerator. The filters were weighed before and after sampling using an analytical balance (model Sartorius 2004MP; reading precision of 10 µg) after stabilizing in constant temperature (20 ± 1 °C) and humidity (40 ± 2 %) for 48 h. All the procedures were strictly quality controlled to avoid the possible contamination of the samples.

2.2 Chemical analysis

2.2.1 Ion analysis

One-fourth of each aerosol sample and blank filters were extracted ultrasonically using 10 mL deionized water (18 MΩ cm$^{-1}$). Inorganic ions of SO$_4^{2-}$, NO$_3^-$, Cl$^-$, Na$^+$, NH$_4^+$, K$^+$, Mg$^{2+}$, and Ca$^{2+}$ were analyzed using ion chromatography (Dionex ICS 3000, USA) with a separation column of Dionex IonPac AS 11, a guard column of Dionex IonPac AG 11, a self-regenerating suppressed conductivity detector of Dionex IonPac ED50, and a gradient pump of Dionex IonPac GP50. The detailed analytical procedures can be found in Yuan et al. (2003).

2.2.2 Element analysis

Half of each aerosol sample and blank filters were digested at 170 °C for 4 h in a high-pressure Teflon digestion vessel with 3 mL of concentrated HNO$_3$, 1 mL of concentrated HClO$_4$, and 1 mL of concentrated HF. The solutions were dried and then diluted to 10 mL with deionized water (18 MΩ cm$^{-1}$). Using inductively coupled plasma optical emission spectroscopy (SPECTRO, Germany), 15 elements (Al, As, Ca, Cd, Cu, Fe, Mg, Mn, Na, Ni, Pb, Sr, Ti, V, and Zn) were measured. The detailed analytical procedures were described in Sun et al. (2004) and Zhuang et al. (2001).
2.3 Nationwide daily PM\textsubscript{10} data

Air pollution index (API) data for 86 major cities (locations shown in Fig. 1a) in China were obtained from the data center of Ministry of Environmental Protection of China (http://datacenter.mep.gov.cn/). In China, six grades of air pollution of excellent, good, slightly polluted, lightly polluted, moderately polluted, and heavily polluted were set corresponding to the API scales of 0–50, 51–100, 101–150, 151–200, 201–300, and > 300, respectively. All API values of 50, 100, 200, 300, 400, and 500 and their corresponding concentrations of air pollutants were defined in the API grading limited-value table as shown in Table S1 in the Supplement. According to the definition of API in China, the API value of air pollutants was calculated as

\[
I_x = \left( I_{x,\text{high}} - I_{x,\text{low}} \right) \left( C_x - C_{x,\text{low}} \right) / \left( C_{x,\text{high}} - C_{x,\text{low}} \right) + I_{x,\text{low}},
\]

(1)

where \( C_x \) and \( I_x \) are the concentration and the API value of air pollutant \( X \) in Table S1, respectively. \( I_{x,\text{high}} \) and \( I_{x,\text{low}} \) stand for the two values in the API grading limited-value table (Table S1) that mostly approach to value \( I_x \), respectively. \( C_{x,\text{high}} \) and \( C_{x,\text{low}} \) represent the concentration of \( X \) corresponding to \( I_{x,\text{high}} \) and \( I_{x,\text{low}} \), respectively. And the daily API value is defined as

\[
\text{API} = \text{Max} \left( I_{\text{PM}_{10}}, I_{\text{SO}_2}, I_{\text{NO}_2}, I_{\text{CO}}, I_{\text{O}_3} \right).
\]

(2)

According to API data records from 20 to 23 March 2010, PM\textsubscript{10} was the premier air pollutant in most of the 86 cities in China, i.e., API = \( I_{\text{PM}_{10}} \). Thus, the API value can be converted to PM\textsubscript{10} concentration as

\[
C = \left( I - I_{\text{low}} \right) \left( C_{\text{high}} - C_{\text{low}} \right) / \left( I_{\text{high}} - I_{\text{low}} \right) + C_{\text{low}}.
\]

(3)

It should be noted that API was recorded with a maximum value of 500, which corresponded to the PM\textsubscript{10} concentration of 600 µg m\textsuperscript{-3}.

2.4 Backward trajectory analysis

The 48 h back trajectories of the air masses at both 250 and 1000 m a.g.l. (above ground level) during dust days starting at Shanghai were computed by the HYSPLIT model (http://ready.arl.noaa.gov/hypub-bin/trajtype.pl?runype=archive), using the meteorological data of GDAS (1°, global, 2006–present). Four trajectories ending at 00:00, 06:00, 12:00, and 18:00 LST were calculated for each day.

2.5 Model simulation

The WRF-CMAQ modeling system was applied to simulate the dust chemistry in this study. The Weather Research and Forecasting model (WRFv3.4) was used to produce the meteorology fields by digesting the reanalysis data from National Centers for Environmental Prediction (NCEP), the Community multiscale Air Quality Modeling System (CMAQv5.0.1) was configured with the 2005 carbon bond gas-phase mechanism (CB05) and aerosol module AE6. The default CMAQ model does not include dust chemistry reactions but only the dust emission module. We have implemented dust chemistry in the CMAQ model and corrected the dust emission module in our earlier work (Dong et al., 2016), which was used to simulate the heterogeneous reactions on dust during the long-range transport in this study. Briefly, the major developments included the following: (1) the default dust emission module in CMAQ was found to strongly underestimate the dust emissions. By removing the double counting of soil moisture in the default dust emission module and conducting a reanalysis of field data, the threshold friction velocities over various land covers were readjusted. (2) The source-dependent speciation profiles of dust particles from the Taklimakan and Gobi deserts were implemented based on field measurement data. (3) There were 13 dust heterogeneous reactions implemented, including dust reactions with \( \text{O}_3, \text{OH}, \text{H}_2\text{O}_2, \text{CH}_3\text{COOH}, \text{CH}_2\text{O}, \text{HNO}_3, \text{N}_2\text{O}_5, \text{NO}_2, \text{NO}_3, \text{HO}_2, \text{and} \text{SO}_2 \). The uptake coefficients of gases onto the surface of dust particles were taken from previously published studies in deserts of China. More details of the technical development of this dust emission and chemistry module in CMAQ and the evaluation of model performance can be found in Dong et al. (2016).

The modeling domain includes all of China with a horizontal grid resolution of 36 km × 36 km and 34 vertical layers with a model top at 50 hPa. The chemical initial and boundary conditions for CMAQ were downscaled from the GEOS-Chem global model. Emissions inputs included anthropogenic emissions from Zhao et al. (2013) over China, biogenic emissions from MEGAN2.1 (Guenther et al., 2006), and biomass burning emissions from FLAMBE (Reid et al., 2006).

3 Results and discussion

3.1 Spatiotemporal evolution of the 2010 spring dust storm over China

On 19 March 2010, a super dust storm broke out over the Gobi Desert of Inner Mongolia, China, and southern Mongolia. It was driven by a strong cold front and revealed by the OMI (Ozone Monitoring Instrument) aerosol index (AI) from space detection (Tatarov et al., 2012). Along with the cold front, the dust plumes moved southeastward, invading extensive areas from northern China to southern China. Figure 2 shows the daily PM\textsubscript{10} concentrations over 86 cities of China from 19 to 23 March 2010, displaying the spatiotemporal evolution of this dust storm event. On 20 March, daily PM\textsubscript{10} concentrations of higher than 200 µg m\textsuperscript{-3} were observed over widespread areas of northern China, close to the dust source regions. The PM\textsubscript{10} concentrations of those heav-
Daily PM$_{10}$ concentrations (mg m$^{-3}$) in 86 major cities over China and 48 h backward trajectories of the air masses at both 250 m (black lines) and 1000 m (red lines) above ground level over Shanghai during 19–23 March 2010. Four trajectories ending at 00:00, 06:00, 12:00, and 18:00 LST are computed for each day.

Figure 2. Daily PM$_{10}$ concentrations (mg m$^{-3}$) in 86 major cities over China and 48 h backward trajectories of the air masses at both 250 m (black lines) and 1000 m (red lines) above ground level over Shanghai during 19–23 March 2010. Four trajectories ending at 00:00, 06:00, 12:00, and 18:00 LST are computed for each day.

![Daily PM$_{10}$ concentrations](image)

Figure 2. Daily PM$_{10}$ concentrations (mg m$^{-3}$) in 86 major cities over China and 48 h backward trajectories of the air masses at both 250 m (black lines) and 1000 m (red lines) above ground level over Shanghai during 19–23 March 2010. Four trajectories ending at 00:00, 06:00, 12:00, and 18:00 LST are computed for each day.

![Backward trajectories](image)

Figure 2. Daily PM$_{10}$ concentrations (mg m$^{-3}$) in 86 major cities over China and 48 h backward trajectories of the air masses at both 250 m (black lines) and 1000 m (red lines) above ground level over Shanghai during 19–23 March 2010. Four trajectories ending at 00:00, 06:00, 12:00, and 18:00 LST are computed for each day.

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3.2 Identification of two dust plumes with distinct transport pathways

Figure 3a shows the time–height cross section of $\delta v$ (volume depolarization ratio) measured at the wavelength of 532 nm from 19 to 23 March in Shanghai. $\delta v$ is frequently used to identify dust events and a threshold value of 10% is used to distinguish dust from other types of particles (Shimizu et al., 2004). As shown in Fig. 3a, there were evidently two discontinuous periods with $\delta v$ higher than 10%, consistent with the two peaks of PM$_{10}$ concentrations measured near the ground (Fig. 4c). The first dust episode (DS1) lasted from ~16:00 LST on 20 March to ~10:00 LST on 21 March and the second dust episode (DS2) lasted from ~06:00 LST on 22 March to ~00:00 LST on 23 March.

The 48 h backward trajectories of the air masses during 20–23 March in Shanghai are shown in Fig. 2. It is interesting to note that the transport pathways of the dust plumes in DS1 and DS2 were distinctly different. In DS1, the dust plumes at both low altitudes (i.e., 250 m denoted by the black lines in Fig. 2c–d) and high altitudes (i.e., 1000 m denoted by the red lines in Fig. 2c–d) were mostly transported from the dust source regions in the Gobi Desert. This is one of the typical inland transport pathways of Asian dust, which

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passed over northern China, that is characterized by intense anthropogenic emission rates, e.g., from Shanxi, Hebei, and Shandong provinces.

In DS2, the air masses reaching Shanghai are shown in Fig. 2e–h. From the start of DS2 to midday of 22 March (Fig. 2e–f), the backward trajectories were still mainly from the north but we noticed that the low-altitude trajectories that originated from the Gobi Desert traveled over the Yellow Sea and East China Sea and then circled back to Shanghai. After midday of 22 March (Fig. 2g–h), the trajectories became much shorter and restricted within the coastal and offshore areas. The low-altitude trajectories were mainly from the ocean and the high-altitude trajectories shifted from the south. As indicated by the surface observation (Fig. 4a), the southeasterly winds prevailed until ∼18:00 LST on 22 March when PM$_{10}$ climbed to reach its peak value in DS2, quite different from DS1 when the northerly winds dominated. The CALIPSO (Cloud-Aerosol Lidar and Infrared Pathfinder Satellite Observations) transect at around 13:00–13:30 LST on 21 March specified that the major aerosol type was dust over the East China Sea and South China Sea (Fig. S1). Therefore, it was evident that DS2 passed over the coastal regions of eastern China and the ocean and it should be a humid dust plume.

As visualized in Fig. 3, the two dust plumes were mostly transported at low altitudes below 1 km. It is expected that this type of transport would benefit for the mixing and interactions between dust particles and anthropogenic pollutants, as the anthropogenic emissions were mainly trapped within the boundary layer. Transport pathway is one of the most important factors accounting for the evolution of dust particles and the resulting environmental effects (Zaizen et al., 2014; Zhang et al., 2010). In this super dust storm, the two discontinuous dust plumes reaching Shanghai were distinctly different in their transport pathways, providing a great opportunity to study the chemical evolution of dust particles under different transport conditions.

### 3.3 Distinct behaviors of gaseous pollutants between two dust episodes

Figure 4 illustrates the different behaviors of the two identified dust episodes by plotting the temporal variations in emission precursors (i.e., SO$_2$ and NO$_2$) as well as PM$_{10}$ and crucial meteorological parameters. As shown in Fig. 4a, the winds prevailed from the south before the onset of DS1 at ∼10:00 LST on 20 March. Starting from early morning of 19 March, SO$_2$ and NO$_2$ continuously climbed due to enhanced human activities. From 18:00 LST of 19 March to 06:00 LST of 20 March, the concentrations of NO$_2$ and SO$_2$ synchronously decreased. This was partly attributed to the prevailing southeast winds, i.e., sea breezes that had clean effects on the local pollution. Furthermore, the decrease in NO$_2$ and SO$_2$ occurred during night, when the anthropogenic emissions were relatively low during a day. During this period, SO$_2$ and NO$_2$ concentrations were relatively high with mean concentrations of 39 ± 19 and 70 ± 25 µg m$^{-3}$, respectively. In the meantime, PM$_{10}$ was at a moderate level of 112 ± 54 µg m$^{-3}$, suggesting the dominance of anthropogenic emissions. It was observed that the peak hourly concentrations of SO$_2$ and NO$_2$ up to 97 and 116 µg m$^{-3}$ occurred just a few hours before the sharp increase in PM$_{10}$. This was due to the fact that air pollutants north of Shanghai were pushed by the cold front and accumulated before the dust plumes invaded (Guo et al., 2004), which was also evi-
dent from the time difference between the values of $\beta$ and $\delta v$ as shown in Fig. 3.

From 10:00 LST on 20 March to 11:00 LST on 21 March, the winds shifted from the north and northwest accompanied with a quick drop in relative humidity (RH) with a minimum of 25% at 21:00 LST on 20 March, indicating the invasion of a strong cold front from northern China. Correspondingly, PM$_{10}$ abruptly climbed from 16:00 LST and reached 1000 $\mu$g m$^{-3}$ (a maximum value of 1000 $\mu$g m$^{-3}$ was set in the TEOM 1405D monitor) within 4 h. This high level of PM$_{10}$ lasted for $\sim$11 h till 04:00 LST on 21 March. During this dust episode, the concentrations of SO$_2$ and NO$_2$ decreased substantially and the lowest values of 17 and 27 $\mu$g m$^{-3}$ (Fig. 4c) were recorded at 04:00 LST on 21 March due to the strong dilution effect of dust plumes. The ratios of SO$_2$/PM$_{10}$ and NO$_2$/PM$_{10}$ were as low as 0.04 ± 0.02 and 0.06 ± 0.03 in DS1 compared to 0.30 ± 0.05 and 0.57 ± 0.28 before DS1. After 12:00 LST on 21 March, the wind direction started to shift again from the southeast with an increase in RH. The PM$_{10}$ concentrations quickly decreased below 200 $\mu$g m$^{-3}$ within 5 h, indicating the pass of the first dust episode over Shanghai.

The second wave of dust (DS2) commenced after about half a day as indicated by the temporal variation in PM$_{10}$ climbing quickly from 06:00 LST on 22 March. PM$_{10}$ reached its peak of 530 $\mu$g m$^{-3}$ observed at $\sim$18:00 LST on 22 March, much lower than the peak values during DS1. It should be noted that during the growth of DS2 (i.e., from 06:00 to 18:00 LST), southerly winds sustained until 18:00 LST on 22 March, opposite from DS1. As discussed above, DS2 had gone through the maritime environment during most of its transport trajectory. This can be corroborated by the moderately high RH (Fig. 4b). After 18:00 LST, 22 March, PM$_{10}$ underwent a quick decline followed by the prevailing northeast winds and continuously elevated RH. This suggested the sea breezes after 18:00 LST were almost free of dust particles and acted as cleaner for the dust pollution that was previously accumulated. Compared to the mean RH of 46% ± 18% in DS1, RH in DS2 was much higher at 69% ± 8%. This was mainly attributed to the different transport pathways of the two dust episodes.

One interesting phenomenon that has been rarely observed was that the temporal variations in SO$_2$ and NO$_2$ varied fairly consistently with those in PM$_{10}$ in DS2 (Fig. 4c), quite different from DS1 and previous studies (Fu et al., 2010; Guo et al., 2004) showing that dust usually had a clean effect on the local gaseous pollutants, causing an inverse relationship between SO$_2$/NO$_2$ and PM$_{10}$. In this case, NO$_2$ reached its maximum hourly concentration of 131 $\mu$g m$^{-3}$ along with the maximum PM$_{10}$ in DS2, the highest during the whole study period. This probably indicated that the dust particles in DS2 were externally mixed or “coated” with abundant gaseous pollutants. As a result, the SO$_2$/PM$_{10}$ and NO$_2$/PM$_{10}$ ratios reached 0.11 ± 0.03 and 0.20 ± 0.04 in DS2, respectively, much higher than those in DS1 and on a super dust day of 2 April 2007 in Shanghai (Fu et al., 2010), revealing that the dust plumes in DS2 were much more polluted.

In the following sections, we will investigate deeply into the chemical characteristics and evolution of the two dust episodes.

### 3.4 Chemical evolution of dust particles

#### 3.4.1 Pollution elements significantly enhanced in dust periods

Table 1 lists the concentrations of measured elements in TSP before, during, and after the two dust episodes in Shanghai. D and N represent the samples that were collected in daytime ($\sim$08:00 to $\sim$20:00 LST) and nighttime ($\sim$20:00 to 08:00 LST in the next day), respectively. NDS represents the non-dust days from 25 to 27 March and the mean concentrations are shown in Table 1. To identify whether these elements were mainly derived from the crustal source or anthropogenic sources, enrichment factors of elements were calculated. Enrichment factor (EF) is defined as EF = (X/X$_{\text{Ref}}$)$_{\text{particle}}$/ (X/X$_{\text{Ref}}$)$_{\text{crust}}$, where (X/X$_{\text{Ref}}$)$_{\text{particle}}$ is the mass ratio of a given element X to the reference element in particle, (X/X$_{\text{Ref}}$)$_{\text{crust}}$ is the ratio in the crust (Lida, 2006), and Al is the reference element used in this study. Enrichment factors of Al, Cu, Ca, Fe, Mg, Na, Mn, Ti, Sr, Ni, and V were calculated to be lower than 5, indicating these 11 elements were mostly from the crustal source, while enrichment factors of As, Cd, Pb, and Zn were higher than 10 even during the dust periods (Fig. 5c), indicating these four elements were significantly influenced by anthropogenic sources. Hence, Al, Cu, Ca, Fe, Mg, Na, Mn, Ti, Sr, Ni, and V were classified as “crustal elements” while As, Cd, Pb, and Zn were classified as “pollution elements”. Due to the dilution effect of dust plumes, enrichment factors of the four pollution elements decreased from $\sim$100–150 in NDS to $\sim$10–50 in DS1 and $\sim$20–115 in DS2.

As shown in Table 1, the concentrations of the crustal elements before the dust event (19N) were as low as those on NDS days, but substantially increased in DS1 and DS2, about 3–13-fold and 1–7-fold of those on NDS days, respectively. The highest concentration of Al, widely used as a tracer for dust, reached 67.5 $\mu$g m$^{-3}$ in DS1 (20N), comparable to the Al concentration on the super dust day of 2 April 2007 in Shanghai (Fu et al., 2010). The highest concentrations of crustal elements in DS1 (20N) were $\sim$2-fold of those in DS2 (22D), corroborating that the intensity of DS1 was stronger than in DS2.

As for the pollution elements, the non-crustal part (nc-) of As, Cd, Pb, and Zn were estimated as nc-X = X – Al × (X/Al)$_{\text{crust}}$. The concentrations of nc-As, nc-Cd, nc-Pb, and nc-Zn increased in both DS1 and DS2, about 1–4-fold of those on NDS days (Fig. 5a). As these elements were mainly derived from anthropogenic sources such as coal combustion, industrial processing, vehicle emis-
Table 1. Concentrations of the measured elements (µg m⁻³) in TSP before, during, and after the dust periods from 19 to 22 March and on non-dust (NDS) days in Shanghai. N, D, and NDS represent the nighttime samples collected from 20:00 to 08:00 LST on the next day, the daytime samples collected from 08:00 to 20:00 LST, and the average of the non-dust samples collected from 25 to 27 March, respectively.

<table>
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<tr>
<th></th>
<th>19N</th>
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<th>20N</th>
<th>21D</th>
<th>21N</th>
<th>22D</th>
<th>22N</th>
<th>NDS</th>
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<td>348.2</td>
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<td>67.5</td>
<td>9.6</td>
<td>9.3</td>
<td>35.8</td>
<td>12.8</td>
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<tr>
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<td>56.9</td>
<td>9.4</td>
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<td>33.2</td>
<td>12.0</td>
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<td>23.3</td>
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<td>11.6</td>
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</tr>
<tr>
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<td>6.4 × 10⁻²</td>
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<tr>
<td>V</td>
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<td>3.4 × 10⁻³</td>
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<td>4.7 × 10⁻³</td>
<td>2.7 × 10⁻³</td>
<td>1.3 × 10⁻³</td>
</tr>
</tbody>
</table>

Figure 5. Variations in (a) the mass concentration ratio of each sample to the NDS sample for nc-As, nc-Cd, nc-Pb, and nc-Zn, (b) the mass ratios, and (c) enrichment factors of pollution elements As, Cd, Pb, and Zn in TSP during 19–22 March and non-dust (NDS) days. D, N, and NDS represent the daytime samples collected from 08:00 to 20:00 LST, the nighttime samples collected from 20:00 to 08:00 LST on the next day, and the average of the non-dust samples collected from 25 to 27 March, respectively.

Figure 6 shows the evolution of major water-soluble ions in TSP during the whole dust event. The concentrations of Na⁺, K⁺, Mg²⁺, and Ca²⁺ increased the most among all the ions in both DS1 and DS2 due to their crustal origin, ~2–5-fold and ~2–3-fold of those in NDS. However, the mass ratios of these ions in TSP generally decreased in the dust periods (Fig. 6d), as the masses of dust particles were dominated by water-insoluble matters. Different from NDS, the concentrations of Ca²⁺ exceeded NH₄⁺ and ranked as the most abundant cation in the dust periods. This was because Asian dust particles are rich in calcium carbonate (Wang et al., 2005), which could react with acidic nitrogen and sulfur compounds to form Ca(NO₃)₂ and CaSO₄. It has been found that Ca-rich particles in Asian dust transported to Japan were mostly spherical in shape (Zaizen et al., 2014), and many of the spherical Ca-rich particles contained sulfur and nitrogen compounds (Matsuki et al., 2006; Zaizen et al., 2014) due to the heterogeneous reactions. Recently, Pan et al. (2017)
reported that the concentrations of both \( \text{NO}_3^- \) and \( \text{Ca}^{2+} \) increased in coarse-mode mineral dust in Beijing, particularly at high RH conditions due to the interaction between nitric acid and Ca-rich particles. It is further suggested that the impact of nitrate on modifying the morphology of dust particles has become increasingly important, as the \( \text{NO}_3^- \) emissions in East Asia have been rapidly increasing. It is noted that the concentrations of \( \text{Ca}^{2+} \) in DS2 were comparable to those in DS1 (Fig. 6b), although the intensity of DS1 was much stronger than DS2. In addition, the mass ratios of \( \text{Ca}^{2+} \) in TSPs were even higher in DS2 than in DS1 (Fig. 6d). Collectively, these results indicated that more calcium in its soluble form was produced via the reactions between calcium carbonate and acids. This could also be revealed by the ratio of \( \text{Ca}^{2+} / \text{Ca} \) that was higher in DS2 (0.2–0.5) than in DS1 (0.1–0.2) (Fig. 7a). In DS2, the dust plumes traveled over the ocean and carried a higher amount of water vapor as well as \( \text{SO}_2 \) and \( \text{NO}_3^- \) than DS1 as discussed earlier. In this regard, the heterogeneous reaction between calcium carbonate and acidic gases was enhanced more in DS2, resulting in a higher fraction of calcium carbonate from dust particles that could be transformed to soluble calcium.

\( \text{Cl}^- \) in the dust periods was moderately enhanced by ~1–2-fold compared to NDS, indicating that \( \text{Cl}^- \) was also impacted by the invasion of dust plumes. As shown in Fig. 6a and c, both the concentrations of \( \text{Cl}^- \) and its mass ratios in TSP were higher in DS2 than in DS1. As the air masses of DS2 passed over the ocean, part of the high \( \text{Cl}^- \) concentrations should be attributed to the contribution from sea salts. The average equivalent ratio of \( \text{Cl}^- \) to \( \text{Na}^+ \) (\( [\text{Cl}^-] / [\text{Na}^+] \)) was 1.65 in NDS and 2.17 in 19N, higher than the ratio in seawater (1.17), indicating anthropogenic sources such as coal combustion (Sun et al., 2014; Yao et al., 2002) contributed significantly to \( \text{Cl}^- \) on the NDS days. The \( [\text{Cl}^-] / [\text{Na}^+] \) ratio dropped to ~1.0 in DS1 as massive continental particles invaded Shanghai, while in DS2 the ratio was elevated to 1.5. Thus, both sea salts and anthropogenic sources should contribute to the particulate \( \text{Cl}^- \) in DS2.

As for the secondary inorganic ions (i.e., \( \text{SO}_4^{2-}, \text{NO}_3^- \), and \( \text{NH}_4^+ \)), their concentrations in TSP were elevated to 16.2, 15.4, and 7.2 µg m\(^{-3}\) in the daytime of 20 March (20D) in DS1. The sampling time of 20D was from ~08:00 to 20:00 LST, including the short period of pollutant accumulation before the arrival of DS1. As a result, the high concentrations of \( \text{SO}_4^{2-} \) and \( \text{NO}_3^- \) measured in 20D were contributed from both local and transported sulfate and nitrate, as well as from the heterogeneous reactions on dust particles. In the nighttime of 20 March (20N), the concentrations of \( \text{NO}_3^- \) and \( \text{NH}_4^+ \) sharply decreased by 57.8 and 43.2 %, respectively. Although \( \text{SO}_4^{2-} \) also decreased, its reduction extent was much weaker at 27.8 % and was still ~2-fold that on NDS days (Fig. 6a). Nitrate formation on dust is strongly dependent on the ambient conditions. Low temperature, low relative humidity, strong wind, and low concentrations of pollution gases did not favor the heterogeneous reaction (Huang et al., 2010a; Yuan et al., 2008). Hence, strong dust events usually diluted the concentrations of nitrate (Duvall et al., 2008; Huang et al., 2010a; Wang et al., 2006). As for the sulfate formation on dust, \( \text{SO}_2 \) could interact with various mineral components of dust particles to produce sulfate, and sulfate became mixed with the dust first competing with nitrate (Duvall et al., 2008; Sullivan et al., 2007). Hence, although the secondary particle components were diluted by the invasion of dust, the formation of sulfate could still be compensated for by the heterogeneous reaction on dust to some extent.

In the daytime of 22 March (22D) during DS2, the concentrations of \( \text{SO}_4^{2-} \) and \( \text{NO}_3^- \) reached the highest during the study period with values of 16.6 and 19.3 µg m\(^{-3}\), respectively. Although \( \text{SO}_4^{2-} \) and \( \text{NO}_3^- \) decreased in the nighttime of 22 March (22N), their levels were still higher than the
NDS (Fig. 6a). Also, the mass ratios of SO$_4^{2-}$ and NO$_3^-$ in TSPs were higher in DS2 than DS1 (Fig. 6c). These results indicated that SO$_4^{2-}$ and NO$_3^-$ were more favorably formed in DS2. It was observed that the concentration of NO$_3^-$ was even higher than that of SO$_4^{2-}$ in both daytime and nighttime samples during DS2, showing a contrary behavior to DS1. As discussed above, the formation of nitrate on dust strongly depends on the ambient conditions. During DS2, RH was at a moderately high level, enhancing the efficiency of aqueous processing on the particles. In addition, the abnormally high concentrations of NO$_2$ (Fig. 4c) suggested the emission precursors were sufficient for the production of nitrate. Finally, high concentrations of nitrate during DS2 may be partially attributed to the reaction between sea salts and nitric acid (Hsu et al., 2014; Huang et al., 2010a) as the dust plumes traveled over the ocean. The formation of secondary aerosol species during DS2 should have involved the complex interactions between pollutant precursors, dust, and sea salts.

Figure 7b shows the equivalent ratio of the total anions to the total cations (A/C) in TSP. The A/C ratio dropped to ~0.5 in DS1 from ~0.9 in 19N, which was attributed to the existence of abundant CO$_3^{2-}$ in dust particles that cannot be detected using ion chromatography (Huang et al., 2010a). The A/C ratio reached 0.85 and 0.80 in 22D and 22N in DS2, respectively, much higher than those in DS1, suggesting that a higher fraction of CaCO$_3$ in the dust particles in DS2 were transformed to CaSO$_4$ and Ca(NO$_3$)$_2$ than in DS1, consistent with the higher Ca$^{2+}$/Ca ratio in DS2 than in DS1 (Fig. 7a). The equivalent ratio of NH$_4^+$ to the sum of SO$_4^{2-}$ and NO$_3^-$ ([NH$_4^+$]/[SO$_4^{2-} + $NO$_3^-$]) in TSP also indicated that the heterogeneous reactions between carbonate and acid gases were more promoted in DS2 compared to DS1. As shown in Fig. 7c, the [NH$_4^+$]/[SO$_4^{2-} + $NO$_3^-$] ratio was slightly higher than that on the NDS days, indicating that SO$_4^{2-}$ and NO$_3^-$ could be completely neutralized by NH$_4^+$. In DS1, the [NH$_4^+$]/[SO$_4^{2-} + $NO$_3^-$] ratio was 0.68 and 0.65 in 20D and 20N, while in DS2 it was even lower at 0.45 and 0.55 in 22D and 22N, respectively. Apparently, NH$_4^+$ was insufficient for completely neutralizing SO$_4^{2-}$ and NO$_3^-$ in both dust episodes, particularly in DS2. The ammonium deficiency was also observed in Kinmen and Zhuhai (Hsu et al., 2014), an island site and a coastal site, respectively, during this super dust storm. We further investigated the [NH$_4^+$ + Ca$^{2+}$ + Mg$^{2+}$]/[SO$_4^{2-}$ + NO$_3^-$] ratio. As shown in Fig. 7d, with the addition of Ca$^{2+}$ and Mg$^{2+}$, sulfate and nitrate had been completely neutralized, implying the important role of alkaline calcium and magnesium as the medium of dust heterogeneous reactions. By estimating the neutralization efficiency of Ca$^{2+}$ and Mg$^{2+}$ (NE$_{Ca&Mg}$) as $NE_{Ca&Mg} = 1 - [\text{NH}_4^+] / \text{[SO}_4^{2-} + \text{NO}_3^-]$, the average value of NE$_{Ca&Mg}$ in DS1 and DS2 was 0.34 and 0.50, respectively. The higher NE$_{Ca&Mg}$ in DS2 also suggested the chemical processing via dust was efficient under the environmental conditions such as DS2 in this study.

3.5 Vertical evolution of dust particles

In both DS1 and DS2, dust particles were mostly restrained below the altitude of 1 km. Strong vertical gradients of $\delta v$ and $\beta$ were observed (Fig. 3). To quantitatively investigate the evolution of vertical dust profiles, we selected four typical episodes as follows: (1) 09:00–15:00 LST on 20 March, an episode right before the arrival of DS1; (2) 16:00–17:45 LST on 20 March, an episode before the onset of maximum hourly PM$_{10}$ concentrations in DS1; (3) 18:00 LST of 20 March–04:45 LST of 21 March, an episode that covers the highest PM$_{10}$ concentration hours (>1000 µg m$^{-3}$) in DS1; (4) 06:00–18:00 LST on 22 March, an episode in DS2.

As shown in Fig. 8a, the mean $\sigma$ between 09:00 and 15:00 LST on 20 March ranged from around 0.12 to 0.72 km$^{-1}$ from near ground level to 1 km. During this period, the mean $\delta p$ was relatively low at ~0.02–0.08, suggesting spherical particles, i.e., pollution particles dominated. Accordingly, the contribution of dust to the total particle extinction (dust ratio) was less than 20% (Fig. 8e). As discussed earlier, the high values of light extinction caused by pollution particles before the onset of DS1 were due to the pre-accumulation of local and transported pollutants brought by the invading cold front. On the pathway of DS1 (Fig. 2c), the air masses traveled over large areas with intense anthropogenic emissions and thus a large quantity of pollutants could be pushed to the downstream areas and accumulated before the dust plume arrived.

As DS1 invaded, the mean $\sigma$ further increased and reached 0.73 km$^{-1}$ near the surface level (Fig. 8b–c). In the meantime, the values of $\delta p$ were elevated to be higher than 10% from near the ground to ~1 km (Fig. 8f–g). When PM$_{10}$ reached its highest concentrations (>1000 µg m$^{-3}$), the mean $\delta p$ was ~23–27% extending from near the ground to ~700 m (Fig. 8g). However, compared to the $\delta p$ value of ~30–35% for the relatively pure Asian dust (Murayama et al., 2003; Sakai et al., 2003), the $\delta p$ in DS1 was still lower, suggesting the mixing of dust with pollution to a certain extent. As shown in Fig. 8b–c, the mean $\sigma_d$ obviously overwhelmed the mean $\sigma$, and could be up to 0.82 km$^{-1}$ near the surface level, while the mean $\sigma_d$ dropped to less than 0.1 km$^{-1}$. From near the ground to ~700 m, no significant vertical gradients of $\delta p$ and dust ratio were observed. This indicated DS1 had a top-down effect on modifying the bulk particle optical properties in the lower troposphere in this case. Within this altitude range, dust could account for ~80–90% of the total particle extinction coefficients while only a minor fraction of ~10–20% was attributed to the pollution particles. Above 700 m, $\delta p$ and the dust ratio quickly deceased, suggesting the impact of dust on the light extinction was much weakened.
In DS2, the maximum $\sigma$ and $\delta p$ averaged between 06:00 and 18:00 LST on 22 March was $\sim 0.61$ km$^{-1}$ and 26 $\%$, respectively, observed at an altitude of $\sim 300$ m. Different from DS1, both $\delta p$ and the dust ratio had a significant vertical gradient in DS2. As shown in Fig. 8h, $\delta p$ decreased quickly from its maximum value at $\sim 250$ m to 5 $\%$ at $\sim 750$ m. Correspondingly, the dust ratios decreased from 88 to 25 $\%$. Moreover, the vertical profiles of $\sigma_d$ and $\sigma_s$ showed distinctly different behaviors during this period. As shown in Fig. 8d, the maximum $\sigma_d$ ($\sim 0.55$ km$^{-1}$) appeared at the altitude of $\sim 250$ m, while that of $\sigma_s$ ($\sim 0.25$ km$^{-1}$) appeared at a higher altitude of $\sim 800$ m. As compared to DS1 (Fig. 8b–c), the $\sigma_s$ in DS2 showed similar magnitudes below $\sim 270$ m. Above this altitude, the $\sigma_s$ in DS2 gradually increased while that in DS1 varied relatively stably with the altitudes. The enhancement of pollution particles in the middle layer during DS2 should be mainly attributed to its unique transport pathway. As shown in Fig. 2e, substantial air masses in the upper layer were transported from the south and may bring more moisture. The sounding data at a meteorology station (31.40° N, 121.46° E) in Shanghai supported this statement as shown in Fig. S2.

Opposite from the low relative humidity and its decreasing trend with altitude in DS1, RH in DS2 (measured at 08:00 and 20:00 LST on 22 March, respectively) showed much higher values and an increasing trend with altitude (Fig. S2). This phenomenon corroborated our discussions above that the meteorological conditions were more favorable for promoting the dust chemistry in DS2. As a result, the secondary aerosol formation via heterogeneous reaction yielded stronger particle extinction in DS2, especially in the middle and upper layers through 270 m till the top (2 km) where the particle extinctions caused by spherical particles were still significant. Conversely, due to the higher humidity in DS2, the soluble particle components should undergo stronger hygroscopic growth and thus partly explain the structure of the vertical profile of spherical particles as shown in Fig. 8d. It is commonly regarded that in the dry and less-oxidative environment that dust storms are usually associated with, the formation and growth of secondary particles are often depressed. However, under certain favorable conditions, new particle formation during dust events could still be discernible (Nie et al., 2014). In this study, vertical profiles of crucial meteorological parameters, pollutant precursors, and particle numbers were not available for diagnosing the new particle formation. Tethered balloon-based measurement (Li et al., 2015) could be a good platform for investigating the particle formation during dust events at different altitudes in future research.

### 3.6 Impact of dust chemistry on regional air quality

Chemical transport modeling (Methods in Sect. 2.5) was utilized to assess the impact of dust chemistry on the perturbation of air quality on the regional scale. The model performance of CMAQ with improved dust module has been evaluated against various observational datasets and it was demonstrated that the model has relatively good capability in capturing both magnitudes and temporal variability in bulk aerosol (e.g., PM$_{10}$, aerosol optical depth) during the spring season over China (Dong et al., 2016). It has to be noted that the model only simulated the particle size up to 10 $\mu$m while the observation of particle chemistry included all the sizes (i.e., TSP); hence the mismatch of size distribution between...
Figure 9. The spatial distribution of OMI ultraviolet aerosol index (unitless) and simulated mineral aerosols (µg m\(^{-3}\)) from 20 to 22 March 2010.

the model and observation precluded the evaluation of the simulated particle chemical species in this study. In the following discussions, we focused on the qualitative assessment of the impact of dust chemistry on the regional air quality.

Figure 9 shows the spatial distribution of simulated mineral particles from 20–22 March 2010. Accordingly, we show the spatial distribution of ultraviolet aerosol index (UVAI) retrieved from OMI during the same period. UVAI is sensitive to absorbing particles, i.e., black carbon and mineral dust (Torres et al., 2007). Hence, the comparison between simulated mineral particles and observed UVAI could illustrate how the transport of dust was reproduced. However, based on the definition of aerosol index, it is a parameter based on the difference between radiance at two near-ultraviolet wavelengths. Thus, the comparison between satellite aerosol index and simulated mineral dust is only qualitative. As seen from Fig. 9, high values of UVAI were always observed over Southeast Asia and this was ascribed to the black carbon particles emitted from strong biomass burning over this region during the spring season (Fu et al., 2012; Huang et al., 2013; Tsay et al., 2013). We look particularly at the dust and its downwind regions over East Asia. On 20 March, high UVAI values stretched from the Gobi Desert to the North China Plain and the Yangtze River Delta. This transport pathway was relatively well reproduced by the model as we can see high concentrations of mineral particles over similar areas as.
well. On the following day of 21 March, the satellite observation illustrated the movement of the high-UVAI zones further southward and the drifting of dust plumes off the coastline of East China (Fig. 9c). Accordingly, the simulation showed similar behavior with strengthened concentrations of mineral particles over the Gobi Desert and downwind areas of the Yangtze River Delta (Fig. 9d). On 22 March, although UVAI signals were absent over most areas of East China due to the satellite swath, high UVAI values could still be observed over the tip of the Yangtze River Delta and the East China Sea. This is also relatively consistent with the model simulation that high concentrations of mineral particles hovered over the coastlines from the Yangtze River Delta to the Taiwan Strait. Overall, we demonstrated that the model is capable of capturing the spatial distribution of dust during the long-range transport.

Since we specifically focus on the interaction between dust and anthropogenic pollutants in this study, we have performed two simulations, i.e., one with dust emissions but without dust chemistry and the other one with dust chemistry. The impact of dust chemistry on particle chemical components could thus be quantified via the difference between these two simulations. Figure 10a and c show the spatial distribution of sulfate via the formation pathway of dust heterogeneous reactions, as well as for nitrate in Fig. 10b and d. Different from the spatial distribution of mineral particles (Fig. 9a–c), the formation of sulfate and nitrate via dust chemistry mainly occurred over northeastern China. It is expected that although the major source region of mineral dust is from the Gobi Desert in northern China, fewer anthropogenic emission sources existed there; hence relatively weak atmospheric chemical processing was simulated over the dust source region. Conversely, drier climate in northern China also suppressed the extent of heterogeneous reactions on the surface of dust. Hence, the strongest impact from dust heterogeneous reactions on the formation of secondary particles occurred in those populous areas where the interaction of anthropogenic precursors and dust was the strongest.

As for sulfate, the simulated concentration over Shanghai averaged 8.1, 3.1, and 8.5 µg m\(^{-3}\) from 20 to 22 March, respectively. This temporal variation corresponded to that from observation as discussed in Sect. 3.4.2. While it has to be noted again that the simulated particle species contained particulate sizes less than 10 µm, a close match between the simulation and observation was not expected. As we compare DS1 (Fig. 10a) and DS2 (Fig. 10c), the simulated sulfate during DS2 was evidently more intense than that during DS1 in a larger geographic region, which was fairly consistent with the observation. Since the daily emission rates digested by the model were almost constant during this period, meteorological conditions should be the determining factor, of which elevated humidity during DS2 has been diagnosed as the most important factor responsible for stronger dust chemistry.

As for nitrate, its spatial distribution pattern was as similar as that of sulfate at a certain extent. The simulated concentra-
tion of nitrate averaged 3.1, 2.3, and 5.2 µg m$^{-3}$ over Shanghai from 20 to 22 March, respectively. Although the simulation results and observational data could not be statistically intercompared due to the size difference as stated above, we think the simulated nitrate should be largely underestimated. The ratio of simulated nitrate between DS2 and DS1 was 1.7, similar to that of ~ 1.6 from observation. This suggested that the favorable meteorological conditions (e.g., higher humidity) for facilitating the dust heterogeneous reaction during DS2 have been accounted for by the model. In this regard, we ascribe the low-biased nitrate mainly to several aspects. First, the NO$_3^-$ emissions could have been underestimated. As indicated in Dong et al. (2016), who used the same anthropogenic emission inventory as this study, the model showed some underestimation of the total NO$_2$ columns as compared to the OMI observation, especially over northeastern China (see Fig. 8 in Dong et al., 2016). Secondly, HNO$_3$, N$_2$O$_5$, NO$_2$, and NO$_3$ were the major precursors of nitrate as implemented in the dust module. Reactions via HNO$_3$ and N$_2$O$_5$ were the dominant pathways of nitrate formation due to their relatively high uptake coefficients on the dust. It was possible that the formation of HNO$_3$ was underestimated, thus lowering the production of nitrate. However, this is just a guess as observation of gaseous HNO$_3$ was not available in this study. Lastly, we think the underestimation of nitrate may be due to the omission of nitrate processing on the surface of sea salt, which was especially important for coastal cities such as Shanghai (Buseck and Posfai, 1999).

4 Conclusions

During 19–23 March 2010, a super dust storm swept extensive areas from northern China to southern China. Two separate dust periods were observed in Shanghai, one from ~16:00 LST on 20 March to ~10:00 LST on 21 March (DS1) and the other from ~06:00 LST on 22 March to ~00:00 LST on 23 March (DS2). In DS1, the dust plumes were mostly transported over those areas characterized by high pollution emissions in northern China, while the dust plumes in DS2 were transported over the coastal regions of eastern China with higher RH. The ratios of SO$_2$ / PM$_{10}$ and NO$_2$ / PM$_{10}$ were up to 0.11 ± 0.03 and 0.20 ± 0.04 in DS2, much higher than the values in DS1. In addition, the concentrations of typical elemental species such as As, Cd, Pb, and Zn were also more enriched in DS2 than in DS1, indicating the stronger mixing extent between dust and primary anthropogenic emissions in DS2. Due to the higher level of gaseous pollutant precursors associated with moderate relative humidity, SO$_4^{2-}$ and NO$_3^-$ exhibited higher concentrations in DS2 than in DS1. The higher Ca$^{2+}$/Ca ratio and lower [NH$_4^+$]/[SO$_4^{2-}$ + NO$_3^-$] ratio in DS2 suggested that the heterogeneous reactions between calcites and acid gases were significantly promoted in DS2. Particularly, more NO$_3^-$ than SO$_4^{2-}$ was formed in DS2, probably due to the high concentrations of NO$_2$ and the complex reaction among dust, sea salts, and nitric acid. Vertical profiles of particle optical properties from lidar measurement retrieved high depolarization ratios of ~23–27% extending from near the ground to ~700 m in DS1 and it was estimated that dust dominantly accounted for ~80–90% of the total particle extinction. In DS2, the vertical structure of particles changed dramatically from that of DS1. The maximum extinction coefficient of dust particles emerged at the altitude of ~250 m in DS2, while that of pollution particles showed at a higher altitude of ~800 m. The abnormal increase in humidity as a function of altitude from the southerly winds explained this phenomenon due to promoted heterogeneous reactions on dust particles and the subsequent particle hygroscopic growth.

Simulated mineral particles were compared to the remote sensing UV AI from satellites, showing consistent spatial patterns between model and observation. By applying the dust scheme with explicit chemistry mechanisms, evident impacts of dust heterogeneous reactions on secondary aerosol formation were reproduced over widespread areas of northeastern China where the anthropogenic emissions were intensive. The sulfate formation was relatively well simulated while the nitrate formation on dust was believed to be largely underestimated. More research on laboratory kinetic studies of nitrate dust chemistry is suggested. Also, the feedback between dust chemistry and regional climate change needs to be investigated in the future.

Data availability. All data used in this paper are available by contacting Kan Huang (huangkan@fudan.edu.cn).

The Supplement related to this article is available online at https://doi.org/10.5194/acp-18-3505-2018-supplement.

Competing interests. The authors declare that they have no conflict of interest.

Special issue statement. This article is part of the special issue “Anthropogenic dust and its climate impact”. It is not associated with a conference.

Acknowledgements. This work was supported by the National Natural Science Foundation of China (nos. 41405115, 41429501, and 91644105) and National Key Technology Research and Development Program of the Ministry of Science and Technology of China (no. 2014BAC22B06). Qingyan Fu and Yanfen Lin would like to acknowledge support from the Shanghai Science and Technology Fund (nos. 14DZ1202900 and 16DZ1204601) and National Key Technology Research and Development Program of the Ministry of Science and Technology of China (no. 2014BAC22B00).
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