

Source-receptor relationships between East Asian sulfur dioxide emissions and Northern Hemisphere sulfate concentrations

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Abstract. We analyze the effect of varying East Asian (EA) sulfur emissions on sulfate concentrations in the Northern Hemisphere, using a global coupled oxidant-aerosol model (MOZART-2). We conduct a base and five sensitivity simulations, in which sulfur emissions from each continent are tagged, to establish the source-receptor (S-R) relationship between EA sulfur emissions and sulfate concentrations over source and downwind regions. We find that from west to east across the North Pacific, EA sulfate contributes approximately 80%–20% of sulfate at the surface, but at least 50% at 500 hPa. Surface sulfate concentrations are dominated by local anthropogenic sources. Of the sulfate produced from sources other than local anthropogenic emissions (defined here as "background" sulfate), EA sources account for approximately 30%-50% (over the Western US) and 10%-20% (over the Eastern US). The surface concentrations of sulfate from EA sources over the Western US are highest in MAM (up to $0.15 \,\mu \text{g/m}^3$), and lowest in DJF (less than $0.06 \,\mu \text{g/m}^3$). Reducing EA SO₂ emissions will significantly decrease the spatial extent of the EA sulfate influence (represented by the areas where at least $0.1 \,\mu g m^{-3}$ of sulfate originates from EA) over the North Pacific both at the surface and at 500 hPa in all seasons, but the extent of influence is insensitive to emission increases, particularly in DJF and JJA. We find that EA sulfate concentrations over most downwind regions respond nearly linearly to changes in EA SO2 emissions, but sulfate concentrations over the EA source region increase more slowly than SO₂ emissions, particularly at the surface and in winter, due to limited availability of oxidants (in particular of H2O2, which oxidizes SO2 to sulfate in the aqueous phase). We find that similar estimates of the S-R relationship for trans-Pacific transport of EA sulfate would



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be obtained using either sensitivity (i.e., varying emissions from a region to examine the effects on downwind concentrations) or tagging techniques. Our findings suggest that future changes in EA sulfur emissions may cause little change in the sulfate-induced health impact over downwind continents. However, SO₂ emission reductions may significantly reduce the sulfate concentrations and the resulting negative radiative forcing over the North Pacific and the United States, thus providing a warming tendency.

1 Introduction

Sulfate aerosol is an important component of fine particulate matter (PM_{2.5}, diameter $< 2.5 \,\mu$ m). PM_{2.5} concentrations are associated, without a threshold, with increased risk of adverse health outcomes including premature mortality (Pope et al., 2002; Pope et al., 2004; Schwartz et al., 2008). In addition, sulfate aerosols scatter sunlight, reduce visibility, affect regional climate, and harm ecosystems (Gunther, 1992; Giorgi et al., 2003; Park et al., 2004; Marmer et al., 2007; Koch et al., 2007a). Sulfate aerosols are produced by gas phase oxidation of SO2 by OH radicals and by aqueous phase oxidation of SO_2 by H_2O_2 (Martin and Damschen, 1981) and O₃ (Feichter et al., 1996). Since oxidation of SO₂ leads to the production of sulfate aerosols and contributes to acid deposition, many industrialized nations have stringently regulated SO₂ emissions to protect human health and ecosystems (Dutkiewicz et al., 2000; Moldan et al., 2001). However, the benefits of sulfur emission control partly depend on the linearity of the source-receptor (S-R) relationship between SO₂ emissions and sulfate concentrations (Oppenheimer et al., 1985; Dutkiewicz et al., 2000). Generally, the relationship between SO₂ emissions and sulfate concentrations is linear near minor SO₂ sources, but nonlinear near



Fig. 1. The ten tagged continental source and receptor regions.

 Table 1. Annual sulfur emissions from the ten tagged continental regions (Gmoles/yr).

NA	SA	EU	FSU	AF	IN	EA	SE	AU	ME
445	125	717	160	114	75	508	61	24	89

major SO₂ sources because of limited availability of oxidants (Hilst, 1992; Berglen et al., 2004).

Due to rapid industrialization, anthropogenic SO_2 emissions from East Asia (EA), particularly China, have increased substantially in recent decades and between 1990 and 2030 are projected to increase by nearly another 50% (Klimont et al., 2001). However, China has realized that it is urgent to mitigate SO_2 emissions and has designed the Acid Rain and SO_2 Pollution Control Program to efficiently control sulfur pollution (Hao et al., 2001). Therefore, future SO_2 emissions from EA are highly uncertain and significant increases or decreases are possible (Streets, 2007). These changes underscore the need to establish quantitative S-R relationships between EA SO_2 emissions and sulfate concentrations over source and downwind regions.

Typical methods for reducing SO_2 emissions include switching fuels or removing sulfur from fuels (e.g., replacing high-sulfur with low-sulfur coal; removing sulfur from gasoline) and reducing end-of-pipe emissions (e.g., installing scrubbers) (Conrad and Kohn, 1996; NAPAP, 2005; Carlson et al., 2000). These strategies have been widely used in the US to reduce SO_2 emissions (Carlson et al., 2000), and are believed by the SO_2 Pollution Control Program to be affordable strategies to mitigate SO_2 emissions in China (Hao et al., 2001). Unlike improving energy efficiency (which reduces energy use), reducing SO_2 emissions by using lowsulfur coal or scrubbers does not reduce other pollutants, such as NO_x and VOCs (which are the precursors for atmospheric oxidants, such as OH, O_3 , H_2O_2) or carbon dioxide (CO₂) the primary greenhouse gas. Therefore, in this study we only change SO_2 emissions and leave the emissions of other chemical species unchanged.

Two techniques are used by the atmospheric modeling community to establish the effect of regional emissions on global concentration distributions, namely tagging tracers of pollutant emissions (Liu and Mauzerall, 2005, 2007; Liu et al., 2005) and conducting sensitivity studies. In sensitivity studies, emissions of a pollutant from a given region are varied to examine the effects on downwind concentrations (Park et al., 2004; Heald et al., 2006; Chin et al., 2007; Koch et al., 2007b). The results using these two approaches can differ depending on the linearity of the chemical conversion of SO₂ to sulfate between the source and receptor regions. In this study, we use a coupled tagging-sensitivity approach to quantify the S-R relationship and compare the difference between these two techniques. Our objectives are:

- to determine the effect of potential future increases or decreases in EA SO₂ emissions on sulfate concentrations over downwind regions (Sect. 3);
- 2. to quantify the linearity of the S-R relationship between EA SO₂ emissions and sulfate concentrations globally (Sects. 4 and 3)
- 3. to compare the source-receptor relationships obtained using tagging and sensitivity studies (Sect. 5).

R=0.90 10.0 80 8 1.0 C 99 <u>9</u> 0.1 -150 -30 -120-60 30 60 90 120 150 0.1 1.0 10.0 Measurements

Fig. 2. Scatter plot (left panel) and the relative difference (i.e., (model-obs)/obs, right panel) between the simulated (MOZART2, early 1990s) and observed annual mean sulfate concentrations (SO₄²⁻; unit: μ g m⁻³). Observations are from RSMAS (1980s–1990s average, University of Miami, triangles), IMPROVE (1990–1992 average, circles), EMEP (1990–1992 average, diamonds), and EANET (2000–2004 average, squares).

-1.0 -0.75 -0.50 -0.25

2 Methods

Model

We use the three-dimensional global chemical oxidantaerosol (fully coupled) transport model MOZART-2 (Model of Ozone and Related Tracers, version 2) (Horowitz et al., 2003) driven with NCEP/NCAR reanalysis meteorology to simulate inter-continental transport of sulfate aerosols. The model is configured with a T62 $(1.9^{\circ} \times 1.9^{\circ})$ horizontal resolution and 28 hybrid vertical levels from the surface to 2.7 mb. Standard MOZART-2 emission inventories are used which represent global emissions in the early 1990s (Olivier, 1996; Horowitz et al., 2003). Table 1 summarizes the annual sulfur emissions from ten continental regions. The sulfur emissions from EA account for approximately 21% of the global emission total. Detailed descriptions of the model and model evaluation are provided by Horowitz et al. (2003, 2006), Tie et al. (2005) and Ginoux et al. (2006).

MOZART-2 simulates sulfate production including both gas phase oxidation of SO₂ by OH radicals and aqueous phase oxidation of SO₂ by H₂O₂ (Martin and Damschen, 1981) and O₃ (Feichter et al., 1996). In addition, naturally produced dimethyl sulfide (DMS) is oxidized to SO₂ by gasphase reactions with OH and NO₃ radicals. Aqueous oxidation of SO₂ to sulfate depends on cloud water content, cloud pH, temperature, and abundance of oxidizing agents (namely H₂O₂ and O₃). When clouds are present, MOZART-2 first predicts the pH values based on the mixing ratios of SO₂, CO₂, HNO₃, sulfate, and NH₃ (the contribution of organic acids to cloud acidity is not included in our calculation). It then uses the predicted pH and temperature to calculate the temperature dependent effective Henry's Law coefficients and aqueous reaction rate coefficients (Tie et al., 2005). When the cloud pH is below 5, the reaction rate between SO_2 and H_2O_2 is much faster than that between SO_2 and O_3 (Brasseur et al., 1999; Seinfeld and Pandis, 1998). Removal processes for sulfur species include both dry deposition and wet scavenging. The dry deposition velocities for SO₂ are from Feichter et al. (1996) and are much faster over ocean (0.8 cm/s) and land (0.6 cm/s) than over snow (0.2 cm/s). The dry deposition velocities for sulfate are 0.2 cm/s (Feichter et al., 1996) over all surfaces. Wet deposition, including both in-cloud rainout and below cloud washout, is parameterized as a function of the effective Henry's law constant for each species (Horowitz et al., 2003). In the case of SO₂, its dissolution in cloud droplets and precipitation is enhanced considerably over its physical solubility by acid dissociation and by rapid aqueous-phase oxidation from S(IV) to S(VI) (primarily by H_2O_2). To reflect this enhanced solubility, wet removal of SO₂ is calculating using an increased effective Henry's law constant, equal to that of H_2O_2 , as assumed by (Tie et al., 2001, 2005; Horowitz, 2006). For sulfate, the wet deposition rates are set to 20% of that for the highly soluble gas HNO₃ (Horowitz, 2006).

0.50

1.0

2.0

10.

In this study, we quantify S-R relationships using a coupled approach including tagged tracers and sensitivity simulations. We first conduct a baseline simulation with standard sulfur emissions. We then conduct five sensitivity simulations with anthropogenic sulfur emissions from EA reduced by 80%, 50%, 20%, and increased by 20% and 50% relative to the base simulation. In all cases, we tag the anthropogenic emissions of SO₂ from the ten continental regions including North America (NA), South America (SA), Europe (EU), the



Fig. 3. Horizontal distribution of EA sulfate concentrations (SO₄; unit: μ g m⁻³) at (a) 500 hPa and (b) the surface in DJF, MAM, JJA, and SON (letters correspond to the 12 months of the year).

Former Soviet Union (FSU, excluding part of Russia in the European domain), Africa (AF), Indian Subcontinent (IN), East Asia (EA), Southeast Asia (SE), Australia (AU), and the Middle East (ME) as shown in Fig. 1 and track their conversion to sulfate (SO_4^{2-}). Each simulation covers the 2-year period from 1990 to 1991 with the first year used for initialization.

Since this study uses meteorological inputs from the NCEP reanalysis (rather than MACCM-3 as in Horowitz et al., 2003), we then evaluate simulated aerosol concentrations by comparing the model results with various observations for sulfate, including the data collected by the Rosenstiel School of Marine and Atmospheric Science (RSMAS) at the University of Miami (Prospero, 1996) and by regional observation networks, namely the Interagency Monitoring of

Protected Visual Environments (IMPROVE) in the United States (http://vista.cira.colostate.edu/IMPROVE/), the Cooperative Program for Monitoring and Evaluation of the Longrange Transmission of Air Pollutants in Europe (EMEP: http://www.emep.int), and the East Asian Monitoring Network (EANET: http://www.eanet.cc). We average observations over 1980s–1990s for RSMAS data, over 1990 to 1992 for IMPROVE and EMEP data, and over 2000 to 2004 for EANET (however many EANET observation stations did not begin to report data until 2003). Figure 2 compares the MOZART-2 simulated sulfate concentrations with global observation networks. The MOZART-2 results are generally in good agreement with observations, with annual mean sulfate concentrations within a factor of 2 of observations at 80% of the global stations considered. In addition, the model tends to



Fig. 4. Percent contribution of EA sulfate to total sulfate concentrations (using standard emissions) at (a) 500 hPa and (b) the surface in the same seasons as in Fig. 3.

(b)

Surface

20

90N

60N

30N

0

0

0

30

Emission

40

SON

30E 60E 90E 120E150E 180 150W120W 90W 60W 30W

80

50

Surface

underestimate sulfate concentrations over the Eastern US by nearly 25–50%. While the model shows little mean bias with respect to the EANET observations (from the early 2000s), it is likely that the model would overestimate sulfate concentrations over EA during the early 1990s (the period for which our emissions were estimated) because SO_2 emissions from East Asia are estimate to have increased between the early 1990s and the early 2000s (Klimont et al., 2001).

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3 Global contribution of sulfate aerosol from EA

The annual average simulated surface concentrations of EA sulfate (SO_4^{2-}) range from more than $10 \,\mu g \,m^{-3}$ over EA to less than $0.2 \,\mu g \,m^{-3}$ over the Western US (Fig. 3). These

values are comparable to those obtained by other studies which use a sensitivity approach to estimate the contribution of Asian sulfate to the Western US (Park et al., 2004; Heald et al., 2006; Chin et al., 2007). Vertical lifting by convection and frontal activities (e.g., warm conveyor belts) followed by rapid transport in mid-latitude westerlies (or jet stream) are the main mechanisms for transporting EA air pollution to the North Pacific and North America (Kritz et al., 1990; Stohl, 2001; Stohl et al., 2002; Liu et al., 2003; Liu et al., 2005). The contribution of EA to surface sulfate over the Western US is highest in Spring (MAM) (up to $0.15 \,\mu g/m^3$) and lowest in Winter (DJF) (< $0.06 \,\mu g/m^3$). In our earlier work (Liu et al., 2005; Liu and Mauzerall, 2005), we found that trans-Pacific transport of an idealized tracer (with a fixed first-order

00%

90N

60N

30N

0

0

Emission

JJA

30E 60E 90E 120E150E 180 150W120W 90W 60W 30W

5

10



Fig. 5. Same as Fig. 4, but percent contribution of EA sulfate to North American (NA) background sulfate (Note: NA background sulfate is the difference between total sulfate concentrations and sulfate originating from anthropogenic sources in NA).

decay lifetime of 2 weeks) to be strongest in winter-spring and weakest in summer. The results here differ from those of our earlier study because sulfate production is highly dependent on the abundance of oxidants, which have different seasonal variation than trans-Pacific transport. Comparing Figs. 3a and b, in summer the transport of EA sulfate to the Central Pacific in summer is weak at the surface but relatively strong at 500 hPa where strong westerlies prevail. The summer high EA sulfate concentration over the Western US is the net result of a series of processes, including stronger convective transport over EA, faster sulfate production, faster wet removal, slower surface transport, and stronger subsidence (within summer highs) over the Western US in summer than in winter. Most recent field work examining trans-Pacific transport (e.g. the 2002 Intercontinental Transport and Chemical Transformation campaign) and modeling research (e.g. Heald et al., 2006) has focused on spring. Our finding suggests that additional investigation of EA influence on sulfate concentrations over the Western US in summer and fall may be worthwhile.

The fractional contribution of sulfate concentrations from EA in the base simulation during each season is shown in Fig. 4. From west to east across the North Pacific, EA sulfate contributes from 80% to 20% of total sulfate at the surface, but contributes at least 50% at 500 hPa. This indicates that EA sulfate is the dominant source of sulfate over the Pacific Ocean, particularly in the free troposphere. Sulfate aerosols directly scatter solar radiation and increase the albedo of clouds. Thus, they cool the Pacific air mass which could influence regional climate over the Western US. Investiga-



Fig. 6. Areas where at least $0.1 \,\mu \text{g m}^{-3}$ of sulfate originates from EA (A_{EA0.1}) at (a) 500h Pa (b) the surface over the same seasons as in Fig. 3 when EA sulfur emissions are 0.2, 0.5, 0.8, 1.0, 1.2 and 1.5 times standard EA emissions (indicated by colors).

tion into linkages between changing EA sulfate concentrations over the North Pacific and their impact on US climate would be valuable (e.g., Levy et al., 2008). Over the surface of the US, EA sulfate contributes more than 10% of total sulfate over the Western US in MAM and JJA, but its influence is negligible over the Eastern US (<1%) due to the dominance of domestic sources (Fig. 4).

Figure 5 shows the fractional contribution of EA to background sulfate over North America (i.e., total sulfate concentrations minus sulfate from anthropogenic sources in NA). At the surface, EA sulfate accounts for 30%–50% and 10%– 20% of background sulfate over the Western and Eastern US, respectively. Due to the differences in model use, emission inventories and meteorological input, as well as the definition of "background sulfate" and "East Asian sources", our result differs slightly from that of Park et al. (2004), who find that total Asian pollution accounts for 30% of background sulfate over both Western and Eastern US, and Chin et al. (2007), who find that Asian pollution accounts for ~40% and ~30% of background sulfate over the Western and Eastern US, respectively. At 500 hPa, EA sulfate accounts for more than 50% of background sulfate over the US (Fig. 5a).

With standard EA SO₂ emissions, EA sulfate concentrations can exceed $0.1 \,\mu g \,m^{-3}$ (A_{EA0.1}) over the Western United States at 500 hPa (Fig. 3a) and even at the surface (Fig. 3b), particularly in MAM and JJA (for comparison,



Fig. 7. Schematic of the linearity of S-R relationships between the SO₂ emission scale factor (E_{SO_2} , the SO₂ emissions in each sensitivity run scaled to the baseline emissions) and the sulfate concentration scale factor (C_{SO_4} , the average sulfate concentration in each sensitivity run scaled to the baseline concentrations). The straight line OA shows the idealized perfect linear dependence of C_{SO_4} on E_{SO_2} , when E_{SO_2} varies between O and B. The convex curve OECF shows the actual relationship between C_{SO_4} and E_{SO_2} . The linearity index L is defined by Eq. (1) in Sect. 4 (Note: "1" here indicates standard emissions, and "O" indicates zero emissions or concentration).

the US EPA's annual average PM_{2.5} air quality standard is $15 \,\mu g \,m^{-3}$). Figure 6 illustrates how the A_{EA0.1} changes with increases/decreases in EA SO2 emissions. At the surface, the spatial extent of $A_{EA0,1}$ is constrained to the North Pacific and is sensitive to EA emissions between 20% and 80% of standard EA emissions. Therefore, a decrease of EA SO₂ emissions will significantly decrease the spatial extent of EA sulfate over the surface of the North Pacific, but an increase in emissions will not significantly increase the horizontal extent of EA sulfate at the surface. The eastern boundary of AEA0.1 reaches the Western US at the surface only when EA SO₂ emissions increase by more than 50% beyond the standard emissions (especially in MAM and JJA). Since most EA sulfate is efficiently removed from the lower troposphere by wet and dry deposition during transport over the North Pacific, further increases in EA sulfur emissions will not significantly increase the surface concentrations and deposition of sulfate over the US. These results are supported by the measurements reported in Jaffe et al. (2005) and Prospero et al. (2003) which indicate that samples from Midway Island in the North Pacific are significantly more influenced by Asian industrial sources of sulfur than measurements at Crater Lake in Oregon. At 500 hPa (Fig. 6a), where sulfate removal is slower and oxidants are relatively abundant, increasing EA emissions cause the eastern boundary of $A_{EA0,1}$ to expand from the Western Pacific (20% EA emissions) to the Eastern US (150% EA emissions), particularly in MAM and SON. In addition, the spatial extent of $A_{EA0.1}$ at 500 hPa is approximately twice as large as that at the surface in JJA. These findings suggest that future changes in EA sulfur emissions may cause little change in sulfate induced health effects over the US, but may cause a significant change in the sulfate related climate impact over the North Pacific and the Western US.

4 Linearity of the S-R relationship

The linearity between SO_2 emissions and sulfate concentrations is of importance to both policymakers interested in reducing the impacts of sulfate exposure and scientists eager to understand the oxidation rate of SO_2 which depends on the concentrations of H_2O_2 , OH, and O_3 . Here we quantitatively investigate the linearity of the response of sulfate concentrations to changes in SO_2 emissions. As SO_2 emissions increase, non-linearity may arise as oxidants are consumed increasingly quickly hence reducing the production efficiency of sulfate (Berglen et al., 2004; Koch et al., 2007b)

Figure 7 shows the S-R relationship between SO_2 emissions (scaled to the baseline SO_2 emissions) and sulfate concentrations (scaled to the baseline sulfate concentrations). When the S-R relationship is linear, sulfate concentrations increase proportionally with the increase in SO_2 emissions (following line OA). However, if the increase in SO_2 emissions decreases the availability of oxidants, the S-R relationship will follow the OECF curve, which is non-linear. The change of slope along OECF indicates the change in oxidizing capacity of the atmosphere. To quantify the linearity of the oxidation process, we define a cumulative linearity index (L) which indicates the percentage departure from linearity:

$$L = \frac{S_{OEC} + S_{CFA}}{S_{OAB}} \times 100\%$$
 (1)

S_{OAB} is the area of the triangle OAB associated with a linear S-R relationship (Fig. 7); S_{OEC} ($S_{OECD} - S_{OCD}$) and S_{CFA} $(S_{CABD} - S_{CFBD})$ are the shaded areas in Fig. 7, indicating departure from linearity. When L=0, the S-R relationship is perfectly linear and the atmospheric oxidation power for SO₂ is unchanged. A larger L-value implies stronger nonlinearity, resulting from lower oxidant availability. In reality, the S-R relationship is rarely perfectly linear. This is because sulfate is a secondary aerosol and an increase in SO₂ emissions will influence both oxidation power and photochemistry over both source and downwind regions. By comparing the shape of the OECF curve (in Fig. 7) to the L-index in different locations, we find that when L < 5%, the S-R relationship is very close to linear. In contrast, when L>10%, a non-linear S-R relationship can be easily identified (see plots in the supplementary material http://www.atmos-chem-phys. net/8/3721/2008/acp-8-3721-2008-supplement.pdf).



Fig. 8. Distribution of the Linearity Index (L) for the S-R relationship between EA SO₂ emissions and EA sulfate concentrations over the northern hemisphere (based on Eq. (1) where low numbers indicate approximate linearity; EA sulfur emissions range from 0 to 1.5 times the standard emissions) at (a) 500 hPa and (b) the surface. Seasons are the same as in Fig. 3.

Figure 8 shows the distribution of $L_{0-1.5}$ (i.e., the linearity index obtained by varying EA emissions from 0 to 1.5 times the standard EA sulfur emissions) for the S-R relationship between EA SO₂ emissions and EA sulfate concentrations in the Northern Hemisphere. In regions where SO₂ emissions are large, oxidant limitation results in incomplete conversion to sulfate, limiting the increase in sulfate concentrations as SO₂ emissions are increased. This results in the convex curve seen in Fig. 7 and a positive value for L. Over EA, high $L_{0-1.5}$ -values (>10% and more than 20% over Southeastern China) are found at the surface in all seasons, indicating a persistent non-linear S-R relationship over EA and significant variations of atmospheric oxidation power for SO₂. For example, in this study a 50% change (either increase or decrease) of EA sulfur emissions is associated with 5–10% (1– 2%), 2–5% (0.5–2), and 1–2% (0.5–1%) change in surface H₂O₂, OH, and O₃ concentrations over EA (Eastern Pacific), with the largest percentage changes occurring in winter for OH and O₃ and in summer for H₂O₂ (plots are given in the supplementary material http://www.atmos-chem-phys.net/8/ 3721/2008/acp-8-3721-2008-supplement.pdf). As shown in Fig. 8b, over the Western Pacific the L_{0–1.5}-values in JJA are low (<5%), indicating a higher atmospheric oxidation power for SO₂ than in other seasons. In addition, over the Eastern Pacific and North America, the L_{0–1.5}-values are low (<5%) in most seasons except winter (at high latitudes where oxidant levels are low). At 500 hPa (Fig. 8a), the L_{0–1.5}-values are relatively low even over the EA source region. There-



Fig. 9. Direct (a) and indirect (b) effects on surface sulfate concentrations (unit: $\mu g m^{-3}$) from 50% increase of EA SO₂ emissions (note: different color scales). Direct effects refer to changes in sulfate produced from EA emissions, while indirect effects refer to changes in sulfate concentrations produced from pollutant emissions in other regions.

fore, the S-R relationships between EA SO₂ emissions and EA sulfate concentrations are close to linear everywhere except at the surface over EA.

5 Direct and indirect effects of the change in EA SO₂ emissions

Changing SO_2 emissions in EA leads to a direct change in EA sulfate and an indirect change in sulfate from other sources, which cannot be distinguished using sensitivity studies alone. Usually sensitivity studies represent the total change in sulfate concentrations between a perturbation run in which EA SO₂ emissions are changed and the base run. Using our tagged regional sulfur tracers we identify a direct change in EA sulfate concentrations (due to production and transport of sulfate from SO_2 emitted in EA). We also identify an indirect effect: the response of non-EA sulfate (i.e., the sulfate produced and transported from SO_2 emitted in regions other than EA) to the change in EA SO_2 emissions. The negative indirect effect results from a reduction in the concentration of oxidants (particularly H_2O_2) which in turn slows down the oxidation of non-EA SO_2 .

Figure 9 shows the direct and indirect changes in surface sulfate concentrations that result from increasing EA SO₂ emissions by 50%. Raising EA SO₂ emissions has the direct effect of increasing EA sulfate concentrations across the Pacific Ocean (Fig. 6a) and the indirect effect of decreasing non-EA sulfate concentrations over East Asia (Fig. 6b). As

shown in Fig. 9, the direct and indirect effects are both largest over the source region and diminish downwind. However, the direct effect exceeds the indirect effect by more than a factor of 10 over the source region and North Pacific (particularly between 20° N– 50° N). Therefore, very similar trans-Pacific EA sulfate S-R relationships are obtained using tagging and sensitivity techniques. At 500 hPa, the magnitudes of the direct effect are $0.1-0.5 \,\mu \text{g m}^{-3}$, $0.05-0.1 \,\mu \text{g m}^{-3}$, and less than $0.05 \,\mu \text{g m}^{-3}$ over the Western Pacific, Eastern Pacific and the United States (not shown). The indirect effect is negligible ($<0.01 \,\mu \text{g m}^{-3}$).

6 Conclusions

We analyze the source-receptor relationships between sulfur emissions from East Asia and the resulting sulfate concentrations over both source and downwind regions using the global oxidant-aerosol model (MOZART-2). We conduct a base simulation and five sensitivity simulations in which EA sulfur emissions are varied. In each simulation, we tag sulfur species from EA and other continental regions.

We find that the concentrations of EA sulfate in surface air over the Western US (resulting from trans-Pacific transport) is highest in MAM and JJA (>0.1 μ g m⁻³) and is lowest in DJF (<0.06 μ g m⁻³). This spring (summer) maximum in EA sulfate over the US is caused by the efficient production and frontal (convective) lifting of sulfate aerosols over the EA source region followed by relatively rapid trans-Pacific transport in the free troposphere. Our findings indicate that for environmental policy (e.g., risk to human health due to sulfate's contribution to PM_{2.5}), summertime trans-Pacific transport of East Asian sulfate to the Western US is as important as that in spring.

We find that present-day EA SO₂ emissions account for at least 50% (20%) of total sulfate concentrations over the North Pacific at 500 hPa (at the surface). EA SO₂ emissions account for approximately 30–50% and 10–20% of background sulfate (defined here as total sulfate minus sulfate from NA anthropogenic sources) at the surface over the Western and Eastern US, respectively. At 500 hPa, the EA SO₂ emissions account for at least 50% of background sulfate over even the Eastern US.

Using a series of sensitivity simulations, we compare the areas over which EA sulfate concentrations are at least $0.1 \,\mu g \,m^{-3}$ (A_{EA0.1}). We find that reducing EA SO₂ emissions will significantly decrease the spatial extent of A_{EA0.1} over the North Pacific at both the surface and 500 hPa, but the spatial extent is insensitive to emission increases except for spring and fall at 500 hPa. In addition, the spatial extent of A_{EA0.1} at 500 hPa is approximately twice as broad as at the surface in JJA, indicating the efficient trans-Pacific transport of EA sulfate in the free troposphere in summer. These findings suggest that future changes in EA sulfur emission may cause little change in the sulfate induced health impact over downwind continents but might significantly influence the sulfate related climate change over the North Pacific and the Western US.

We quantify the degree of linearity in the S-R relationship between EA SO₂ emissions and EA sulfate concentrations in the northern hemisphere by defining a linearity index. We find that EA sulfate concentrations respond nearly linearly (within 5%) to changes in EA SO₂ emissions everywhere except over the EA source region (where non-linearities exceed 10%, particularly at the surface during winter). Sulfate concentrations over EA increase proportionately less than the EA sulfur emissions because the conversion of SO₂ to sulfate reduces the availability of atmospheric oxidants (particularly H₂O₂), which in turn slows down the production rate for sulfate aerosol. However, even under low-oxidant conditions, conversion to sulfate occurs more quickly than transport to other continental regions.

We compare the direct effect (i.e., the change in sulfate produced from EA SO₂ emissions) and indirect effect (i.e., response of non-EA sulfate) of changing EA SO₂ emissions. We find that raising EA SO₂ emissions leads to a positive direct effect and a negative indirect effect on sulfate concentrations, particularly over the source region. However, the magnitude of the direct effect is more than 10 times larger than the indirect effect over the mid-latitude Pacific. We therefore conclude that the tagging and sensitivity techniques will produce nearly identical estimates of the source-receptor relationship of trans-Pacific transport of sulfate aerosols.

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