ATMOSPHERIC SCIENCE

Daytime SO₂ chemistry on ubiquitous urban surfaces as a source of organic sulfur compounds in ambient air

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The reactions of sulfur dioxide (SO₂) with surface-bound compounds on atmospheric aerosols lead to the formation of organic sulfur (OS) compounds, thereby affecting the air quality and climate. Here, we show that the heterogeneous reaction of SO₂ with authentic urban grime under near-ultraviolet sunlight irradiation leads to a large suite of various organic compounds including OS released in the gas phase. Calculations indicate that at the core area of Guangzhou, building surface uptake of SO₂ is 15 times larger than uptake of SO₂ on aerosol surfaces, yielding ~20 ng m⁻³ of OS that represents an important fraction of the observed OS compounds (60 to 200 ng m⁻³) in ambient aerosols of Chinese megacities. This chemical pathway occurring during daytime can contribute to the observed fraction of OS compounds in aerosols and improve the understanding of haze formation and urban air pollution.

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INTRODUCTION

Sulfur dioxide (SO₂) is one of the most important trace gases in the atmosphere emitted by anthropogenic sources such as fossil fuel combustion and occasionally by volcanic eruptions. The mixing ratios of SO₂ in the atmosphere broadly varies, ranging from 20 parts per thousand (ppt) to 1 parts per billion (ppb) in the continental atmosphere, 20 to 50 ppt in the marine boundary layer, several hundreds of parts per billion in urban environments, and parts per million (ppm) levels in volcanic plumes (1). Several studies suggested that the heterogeneous and multiphase reactions of SO₂ with organic and inorganic surfaces could contribute substantially to the formation of sulfate ions (SO₄²⁻) in the atmosphere (2–6). It is known that sulfate aerosols constitute an important fraction of haze events severely affecting the air quality in densely populated urban environments (7–9). Sulfate particles exhibit a cooling effect on the global climate by scattering solar radiation and acting as cloud condensation nuclei (10–12).

Air quality models cannot explain the quick increase in the quantity of sulfate when going from clean air to hazy events and applying only the gas-phase and aqueous-phase chemistry (8). A recent air quality model suggested that SO_2 uptake coefficients of 5×10^{-5} can best describe the sulfate formation during severe haze episodes in North of China (8).

Urban grime with thicknesses from 10 to 1000 nm deposited on glass windows and concrete walls are abundant in megacities where most of the population lives (13-16). Urban grime exhibits similar and sometimes even greater surface-to-volume (S/V) ratios than that

of atmospheric particulate matter (PM), suggesting that heterogeneous chemistry on urban surfaces can be significant in megacities. Urban grime consists of a mixture of organic compounds, such as polycyclic aromatic hydrocarbons (PAHs) and fatty acids among others, and inorganic salt compounds Na₂SO₄, NaNO₃, and NaCl (16–20).

Uptake coefficients of SO_2 on various organic and inorganic surfaces as a function of relative humidity (RH) (21–23) have been used as input data to model studies (8, 9, 24) to integrate heterogeneous reactions of SO_2 with aerosol particles. However, there is still a lack of knowledge about the formation processes of organic sulfur (OS) compounds upon heterogeneous SO_2 oxidation.

Considering the importance of SO₂ heterogeneous conversion to OS compounds, a comprehensive evaluation is required to determine the important factors that govern the heterogeneous kinetics of SO₂ onto atmospherically relevant surfaces. We investigated the heterogeneous uptake of SO₂ by urban grime in the dark and under simulated sunlight irradiation (300 nm $< \lambda < 400$ nm) at different RHs and applied a kinetic multilayer model of aerosol surface and bulk chemistry (KM-SUB) (25). The formation of the secondary product compounds released in the gas phase was evaluated by real-time measurements of volatile organic compounds (VOCs) by using a secondary electrospray ionization ultrahigh-resolution quadrupole Orbitrap mass spectrometer (SESI-UHR-MS) coupled to a flow tube reactor with urban grime, upon simultaneous exposure to gaseous SO₂ and light irradiation. We observed an unexpectedly high level of VOCs including OS compounds formed during the light-induced heterogeneous processing of SO₂ on the urban grime. Then, we estimated the surface area of urban buildings in the city of Guangzhou on the basis of a building dataset (www.resdc.cn/data.aspx?DATAID=270) that helped to calculate the fluxes of SO₂ by building surfaces. Last, the SO₂ fluxes were used to estimate the contribution of the produced OS fluxes to organosulfur aerosols.

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RESULTS

Uptake coefficients of SO₂

The reactive uptake coefficients of SO_2 to the authentic urban grime were calculated from the experimentally measured pseudo–first-order rate constants as follows (26–28)

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$$\gamma = \frac{4 \, k_1'}{\overline{\nu}_{\text{SO}_2}} \frac{V}{S} \tag{1}$$

where k_1' (s⁻¹) is the pseudo–first-order rate constant for the heterogeneous reaction between gaseous SO₂ and the urban grime, S (m²) is the surface of the glass plate, V (m³) is the volume of the flow tube reactor, and $\overline{v}_{SO_2} = 312$ (m s⁻¹) is the average molecular velocity of SO₂. The uptake coefficients of SO₂ (50 ppb) with urban grime deposited on the glass plates were assessed as a function of RH, in the dark and under ultraviolet-A (UV-A) light irradiation at 296 K (see Materials and Methods and fig. S1).

The uptake coefficients of SO_2 on urban grime in the dark and in the presence of near-UV light increased nonlinearly by more than one order of magnitude from $(1.6\pm0.6)\times10^{-6}$ at 0% RH to $(4.5\pm0.5)\times10^{-5}$ at 90% RH and from $(2.3\pm0.01)\times10^{-6}$ at 0% RH to $(5.0\pm0.1)\times10^{-5}$ at 90% RH, respectively (fig. S2). Similarly, the uptake of SO_2 on oleic acid increased nonlinearly by a factor of 3 from 3.2×10^{-6} at 2% RH to 6.2×10^{-6} at 74% RH under dark conditions, indicating either promoted adsorption of SO_2 or increased SO_2 solubility at higher RH, in both cases enhancing the reaction of SO_2 with oleic acid (29).

This behavior is in contrast with the observation by Gen et al. (30) who reported a slight decrease of the SO₂ (7.7 ppm) uptake coefficients on illuminated nitrate ions (NO₃⁻) with RH, from 7.7×10^{-6} at 88% RH to 1.8×10^{-5} at 40% RH. As shown in fig. S2, the uptake coefficients of SO₂ on urban grime in the presence of near-UV light at different RHs are only slightly higher than the uptake in the dark, and they are the same order of magnitude as the photo-induced uptakes of SO₂ (50 ppb) on PM_{2.5} (6). However, these values are higher than the uptake of SO_2 on fatty acids under similar conditions (31). For example, the uptake of SO₂ (40 ppb) on linoleic acid was reported to be $(5.5 \pm 0.5) \times 10^{-6}$ at 35% RH, as the highest value among the uptake coefficients of SO₂ on different fatty acids (31). The uptakes of SO₂ on urban grime are also at least one order of magnitude higher than the SO₂ uptake coefficients on typical mineral particles, such as illite (1.03×10^{-7}) , nontronite (0.30×10^{-7}) , smectite (1.72×10^{-7}) , and Arizona Test Dust (1.37×10^{-7}) (32).

Figure S3 shows that the uptake coefficients of SO_2 on urban grime slightly increase with the light intensity. This observation is similar to the report by Zheng *et al.* (6) who showed a slight linear increase of SO_2 uptakes with light intensity. Figure S4 indicates that the uptake coefficients of SO_2 on urban grime are independent of the SO_2 mixing ratio at least for atmospherically relevant SO_2 values.

Kinetic modeling of the SO₂ uptakes

The kinetic model reproduced the measured SO_2 uptake coefficients well, providing insights into the processes controlling the loss of SO_2 to urban grime (Fig. 1). Uptake coefficients increase as a function of RH because of increasing diffusion coefficients of SO_2 and fatty acids as the urban grime becomes less viscous. Under dry conditions, the urban grime is likely to be an amorphous solid, and the initial SO_2 reacto-diffusive length is approximately 1 nm, indicating that the reaction only occurs at the surface and near-surface bulk. As the RH increases, the reaction occurs throughout a greater proportion of the 0.19- μ m-thick urban grime bulk with the initial SO_2 reacto-diffusive lengths being calculated as 0.020 and 0.018 μ m at 90% RH under dark and irradiated conditions, respectively. These findings are similar to our previous work, where NO_2 uptake coefficients on indoor films were found to be dependent on the RH due

to changing diffusion in the film (28). We were also able to parametrize the SO_2 and fatty acid diffusion coefficients as a function of RH using an exponential function, in a similar fashion to our previous work (28), which also reproduced the measurements reasonably well (fig. S5). The obtained bulk reaction rate coefficients were on the order of 10^{-16} to 10^{-18} cm³ s⁻¹. The rate coefficient of SO_2 with reactive fatty acid was slightly higher for the irradiated condition compared to the dark condition (table S1), reflecting the increase in measured uptake coefficient in the presence of UV light.

The model results are consistent with the experimental measurements that show that the uptake coefficient increases by about a factor of 1.1 to 2.0 in the presence of UV light and over the range of RHs. These enhancements are controlled by the complex interplay of photolysis rates (table S1) and surface composition as moderated by bulk diffusion at different RHs. SO₂ loss from the gas phase was also measured as a function of time and modeled with KM-SUB (fig. S6). Gas-phase SO₂ concentrations at 30% RH were relatively stable over the measurement time scale with the concentrations of the fatty acids also remaining relatively constant (figs. S6, A and B, and S7, A and B). For the 90% RH dark and irradiated conditions, the gas-phase SO₂ concentrations increased over the time period of the measurements (fig. S6, C and D) because of a decreasing loss to the urban grime as the concentration of reactive fatty acid decreased significantly (fig. S7, C and D). At longer times, the gas-phase SO₂ concentration for the 90% RH irradiated condition remained relatively stable and is only controlled by the reaction with fatty acid, which has a relatively stable concentration (fig. S7D). There are some details of the measurements that have not been reproduced by the model such as the faster SO₂ loss observed for the 90% RH dark condition during the first 100 min of reaction (fig. S6C). This may indicate the presence of additional species which are untreated in the model and can react away on this time scale because of a fast reaction with SO_2 . Overall, these modeling results suggest that the SO₂ uptake coefficient depends on a variety of factors such as the RH, the concentrations of a variety of reactive species in the urban grime, and the rate of loss and replenishment of these species in urban grime.

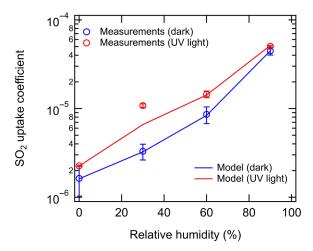


Fig. 1. Measured and modeled SO₂ uptake coefficients on urban grime under dark and irradiated conditions as a function of RH.

General description of gas-phase product compounds

Real-time measurements of the gas-phase compounds formed by the heterogeneous reaction of SO_2 with urban grime at 70% RH, in the dark and under UV-A irradiation, were assessed by a SESI-UHR-MS in both negative (ESI⁻) and positive (ESI⁺) ionization modes. In addition, blank measurements were performed before and after analysis. Overall, 589 and 58 ions with an intensity threshold above 1×10^5 arbitrary units (a.u.) were distinguished by a Python program (for details, see the Supplementary Materials) in the mass spectra obtained from online measurements in ESI⁺ and ESI⁻ mode, respectively.

A hierarchical cluster analysis was performed to identify the ion groups with different chronological variations (Fig. 2A). Then, in total, 226 ions in the ESI $^+$ mode and 13 ions in the ESI $^-$ mode were screened out again from the detected compounds above the threshold (1 × 10 5 a.u.) after deleting the isotope peaks and the significance analysis (two-tailed test). Only the ions with a mass tolerance of ± 2 ppm were assigned to the corresponding molecular formulas. The observed peaks in the blank were not considered during the data analysis, regardless of their intensity. Mass spectra in the negative mode often have fewer peaks and are therefore easier to interpret than spectra obtained in the positive mode (33). This could be the reason that only 13 ions in total were analyzed in the negative mode. Therefore, the gas-phase products detected in the positive mode will be further discussed.

Figure 2B shows the average mass spectra of the detected product compounds including the relative number abundance of the compounds. To make a comparison among wide range of molecules obtained from the mass spectra, we choose the most abundant $C_{11}H_{21}O_5S_2$ [mass/charge ratio (m/z) 297.0824] ion as 100%, and all peak intensities in the measured samples were normalized to it. The attributed elemental formulas are classified into five major compound categories with CH⁺-, CHO⁺-, CHOS⁺-, CHON⁺-, and CHN⁺-based formula identification by Xcalibur software (3.0.63, Thermo Fisher Scientific). Of 226 ions the most abundant are CHO⁺ with 71.7% followed by 11.5% CH⁺, 6.2% CHOS⁺, 5.3% CHON⁺, and 1.8% CHN⁺, broadly distributed over the whole m/z range between 50 and 400 (Fig. 2B). The plausible explanation for the abundance of the CHO compounds could be attributed to the sensitivity of ESI source toward polar oxygenated molecules with lower aromaticity (34). Figure 2B (NA, nonavailable) shows that only few substances (3.5%) with a high mass tolerance ($> \pm 5$ ppm) or unknown formulas were observed in this study.

The distribution of the detected ions depicted in the red rectangle of Fig. 2A shows that light-induced heterogeneous processing of SO_2 with 1-month-old urban grime at 70% RH leads to enhanced product formation compared to dark conditions. As an example, Fig. 2C shows the temporal evolution of m/z at 101.0596 127.1116, 143.1006, and 153.0909, formed upon SO_2 heterogeneous reaction with urban grime in the dark and under UV-A light irradiation. Paired sample t test of m/z at 101.0596 127.1116, 143.1006, and 153.0909 (Fig. 2D) shows that there is a significant difference between the concentrations of each ion at zero-air stage and the stage of light-induced SO_2 chemistry of urban grime. The gas-phase product compounds have different chemical properties as illustrated by the Van Krevelen plot depicted in Fig. 3.

The oxygen-to-carbon ratio (O/C) indicates the degree of oxidation, while the hydrogen-to-carbon ratio (H/C) is a good indicator of the degree of unsaturation in organic molecules (35). In addition, double bond equivalent (DBE) and aromaticity equivalent (Xc) as

important parameters to characterize the chemical composition of the organic components observed by high-mass resolution spectrometry are also shown (Fig. 3). Typically, $2.5 \le Xc < 2.71$ indicates the presence of monoaromatic compounds, and $Xc \ge 2.71$ suggests the presence of polyaromatic compounds (36). Figure 3 shows that many peaks are depicted in the range between 1 < H/C < 2 and O/C < 1, similar to the chemical composition of atmospheric organic aerosols (37). Moreover, Fig. 3 shows that compounds with low DBE values (DBE < 6) are abundant, while Xc values range between 0 and 2.5, indicating that most of the observed compounds could be identified as aliphatic compounds with a low degree of aromaticity. One of the reasons for the absence of polyaromatic compounds with high DBE and $Xc \ge 2.71$ is that the ESI ionization method is more sensitive to polar organic compounds instead of nonpolar or less polar compounds such as PAHs and saturated hydrocarbons (38). The compounds with high H/C values (>1.5) and low O/C values (<0.5) with DBE = 1, and Xc = 0, could be attributed to aliphatic species (37). The left corner at the bottom of Fig. 3 shows the compounds with $H/C \le 1$, and $O/C \le 0.5$, which are typically defined as low-oxidation aromatic compounds ($Xc \le 2.5$) (39).

CHO product compounds

The Van Krevelen diagram obtained by plotting the H/C versus O/C ratio for CHO compounds was evaluated more closely in the Fig. 4. Different homolog series of all CHO+ compounds in the range between 0.6 < H/C < 2 and O/C < 0.7 are displayed in Fig. 4, which have also been detected in coal burning (40), cloud water (41), and rain water samples (42). The continuous homologous CH2 series indicate their chemical homogeneity. For example, the upper right corner of Fig. 4 shows series of C₂H₅O₂(CH₂)_n and C₄H₉O(CH₂)_n with a low degree of unsaturation (Xc = 0, DBE = 1), which are commonly associated with aliphatic compounds (42). Note that CHOcontaining compounds emerging from light-induced heterogeneous reaction of SO₂ with urban grime at 70% RH are consistent with the CHO compounds produced during heterogeneous processing of SO₂ with unsaturated fatty acids identified in both field measurements and laboratory experiments (29, 31, 43). For example, saturated fatty aldehyde with m/z 143.1430 [(C₉H₁₈O)H⁺] (nonanal) and saturated fatty acid m/z 145.1222 [(C₈H₁₆O₂)H⁺] (octanoic acid) were previously identified during the heterogeneous reaction of SO2 with oleic acid (Fig. 4) (29). Unsaturated and saturated fatty acids are the most ubiquitous species [35.8% (5.4 mg m⁻²)], compared to other compounds loaded in the urban grime collected in Guangzhou (fig. S10), the most abundant being nonanoic acid (61.2 µg m⁻²), among others (table S2). Thus, it is not excluded that compounds such as nonanal are formed upon heterogeneous reaction of SO₂ with nonanoic acid. The heterogeneous reaction of SO₂ with particulate-bound unsaturated fatty acids can lead to the formation of long-chain saturated fatty acids such as m/z 227.2006 [(C₁₄H₂₆O₂)H⁺] (tetradecenoic acid), m/z241.2162 [$(C_{15}H_{28}O_2)H^+$] (pentadecenoic acid), and m/z 269.2475 $[(C_{17}H_{32}O_2)H^+]$ (heptadecenoic acid) (43), which were also identified in this study (table S3), and they belong to the series of $C_3H_5O_2(CH_2)_n$ (Fig. 4).

In addition, fatty acids were proven to act spontaneously as photoactive surfactants under UV light irradiation (44). Rossignol *et al.* (45) reported a wide variety of mostly oxygenated gas-phase product compounds derived from UV light irradiation of nonanoic acid, including saturated and unsaturated ketones and aldehydes (\leq C9). Several fatty aldehydes with the same m/z as those reported by

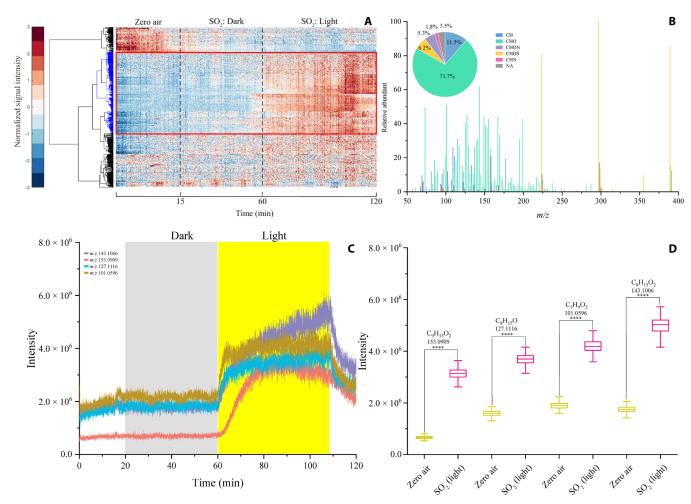


Fig. 2. Mass spectrometric data representing the SO₂ chemistry with urban grime. (**A**) Cluster analysis of 588 ions with signal intensities of $\ge 1 \times 10^5$ a.u. in the positive mode. (**B**) SESI-HR-MS mass spectra in the positive mode. The *x* axis corresponds to the molecular weight of the gas species, and the *y* axis corresponds to the relative abundant. Different formula groups are color-coded. The pie chart shows the proportions of CH⁺, CHO⁺, CHON⁺, CHON⁺, CHOS⁺, and unassigned peaks among all observed gas-phase products. (**C**) The time profile of m/z at 101.0596, 127.1116, 143.1006, and 153.0909 observed by the SESI-HRMS. (**D**) Box plot of m/z at 101.0596, 127.1116, 143.1006, and 153.0909. The paired sample *t* test shows significant difference (****P< 0.0001) in signal intensity of each ion at the zero-air stage and stage of SO₂ light-induced processing of urban grime.

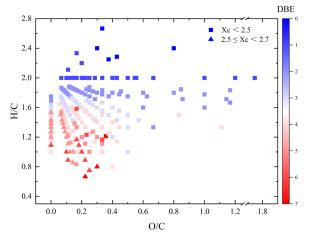


Fig. 3. Van Krevelen plot for the observed organic compounds in ESI*. The color bar denotes the DBE, and the markers denote the value of Xc divided by different ranges.

Rossignol *et al.* (45) were identified in this study—m/z 101.0961 [($C_6H_{12}O$)H⁺] (hexanal), m/z 115.1117 [($C_7H_{14}O$)H⁺] (heptanal), m/z 129.1274 [($C_8H_{16}O$)H⁺] (octanal), and m/z 143.1430 [($C_9H_{18}O$)H⁺] (nonanal) (table S3) during light-induced SO₂ heterogeneous processing of urban grime—implying that the presence of nonanoic acid as the most abundant fatty acid in the urban grime is responsible for the production of these aldehydes upon light-induced SO₂ reactions. Several of the chemical formulas (Fig. 4) correspond to compounds (H/C = 2 and O/C < 0.5), which can be also formed upon light irradiation of long-chain saturated fatty acids (45).

CHOS product compounds

A total of 14 peaks were assigned to compounds containing C, H, O, and S elements in the ESI $^+$ mode. More than 88% of CHOS species comprised one S atom and more than four O atoms exhibiting higher molecular weight than the CHO and CHON compounds. Because a sulfate group (-OSO $_3$ H) carries four O atoms and it readily deprotonates in ESI $^-$ mode, these compounds can be assigned to organosulfates as indicated by tandem mass spectrometry (MS/MS) analysis of \bullet OSO $_3$ $^-$ or

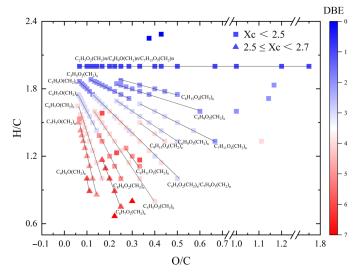


Fig. 4. Van Krevelen plot for homologous series of CHO compounds detected in the ESI⁺. The "n" refers to the number of CH₂ groups in a given family: (n = 0 to 8)-C₂H₅O₂⁺, (0 to 10, 12)-C₃H₅O⁺, (0 to 12, 14)-C₃H₅O₂⁺, (0, 2 to 6, 11)-C₄H₉O⁺, (0 to 11)-C₅H₇O⁺, (0 to 10)-C₅H₅O₂⁺, (0, 3 to 8)-C₅H₉O₃⁺, (0 to 8, 11)-C₆H₇O⁺, (0 to 7)-C₆H₉O₃⁺, (0 to 7, 9)-C₇H₇O⁺, (0 to 6, 8)-C₇H₉O₃⁺, (0, 5)-C₇H₁₅O₃⁺, (0 to 3, 5)-C₇H₁₁O₄⁺, (0 to 4)-C₈H₇O₂⁺, (0 to 2, 4, 5)-C₈H₉O₂⁺, (0 to 2, 4, 8)-C₈H₁₅O₄⁺, (0, 1)-C₉H₉O⁺, (0 to 2)-C₉H₁₁O₃⁺, and (0, 1, 3)-C₉H₁₃O₄⁺. The color bar and marker type denote the DBE values and the Xc range of the compounds.

HSO₄⁻ product ions (42, 46). However, MS/MS experiments were not performed on the CHOS ions detected, and therefore, other S-containing compounds, such as sulfonates, may also be assigned to this group.

The addition of SO_2 to the double bond of the organic compounds (fatty acids and PAHs) (see Discussion) available on the urban grime could explain the formation of these CHOS compounds. For example, a cycloaddition of SO_2 to the C=C of the PAHs compounds may occur, leading to the formation of cyclic CHOS compounds (47–49). The observed CHOS could also be organosulfates with a hydroxyl group (OH) and a C=C bond or cycle in the side chain (46).

Table S4 shows that most of the CHOS compounds exhibit a low degree of unsaturation and relatively high molecular weights, similar to the composition of OS compounds detected in ambient aerosol samples collected in Guangzhou (50, 51), Wuhan, Nanjing (52), and Shanghai (46). Previous investigations have suggested that OS compounds with a low degree of unsaturation could be formed via anthropogenic precursors such as long-chain alkanes or aromatic compounds (46). It has been reported that long-chain alkanes are major constituents of tailpipe emissions from medium-duty diesel trucks and gasoline-powered motor vehicles in urban areas (53). As the urban grime was collected in the downtown of Guangzhou not far from a dense traffic road, it is highly plausible that the origin of the long-chain alkanes and PAHs adsorbed on the urban surface comes from the roadway vehicle emissions. In addition, cooking from the neighboring restaurants (54, 55) can also be an emission source of long-chain alkanes and PAHs (table S2) as possible precursors of the observed organosulfates formed through SO₂ heterogeneous oxidation of the urban grime. The gas chromatography-MS (GC-MS) performed analysis of the sampled urban grime in Guangzhou indicates that the portions of long-chain alkanes and PAHs, which could

be responsible for the formation of one fraction of the CHOS compounds, are 7.6 and 1.8%, respectively (fig. S8).

The hydrophilic (sulfate group) and hydrophobic (long alkyl chains) functionalities of the observed CHOS indicate that these compounds have surfactant properties and therefore may substantially affect the aerosol properties (46). The following OS compounds detected in this study, m/z 95.0160 $[{\rm C_2H_6O_2S}){\rm H}^+]$ (methylsulfonylmethane), m/z 169.0523 $[{\rm C_5H_{12}O_4S}){\rm H}^+]$, m/z 223.0635 $[({\rm C_8H_{14}O_5S}){\rm H}^+]$, m/z 225.0427 $[({\rm C_7H_{12}O_6S}){\rm H}^+]$, and m/z 239.0948 $[({\rm C_9H_{18}O_5S}){\rm H}^+]$, were observed in surfactant sulfur-containing aerosols during field measurements in the urban area of Guangzhou (50, 51). The SESI-HR-MS cannot discriminate structural formulas; hence, it is not possible to distinguish whether the CHOS are rather hydroxyl sulfonates or alkyl organosulfates.

The observed OS compounds exhibit a lower degree of unsaturation (low DBE), low degree of oxidation (O/C < 1), and low aromaticity (Xc = 0), indicating that these compounds are most likely aliphatic compounds forming more ordered surfactant films on the aerosols, which would decrease the surface tension and affect the hygroscopicity of the aerosol particles (46). It has been suggested that this kind of OS compounds with low degree of unsaturation are representative of urban aerosols in Chinese megacities such as Guangzhou, Shanghai, Wuhan, and Nanjing because of the heavy traffic (46, 50–52). It has been suggested that these OS compounds are important constituents of atmospheric aerosol on a global scale and capable of long-range transport (56). The CHON, CHN, CH, and unassigned compounds formed upon heterogeneous reaction of SO₂ with urban grime are shown in tables S5 to S7, respectively.

DISCUSSION

The uptakes of SO₂ on urban grime exhibited very similar values and trend in the dark and upon light irradiation, while the product distribution observed in ESI+ mode differs significantly because of the different reaction mechanism between dark and near-UV light conditions (see below). Therefore, a commercial MI-SPI-TOF-MS (membrane inlet-single photon ionization-time of flight-mass spectrometer) device (SPIMS 3000, Guangzhou Hexin Instrument Co. Ltd., China) (see the Supplementary Materials for description) was used to further investigate the impact of the combined effect of RH and presence of light on the formed VOCs upon light-induced heterogeneous reaction of SO₂ with the urban grime. Figure S9 shows the total ion counts (TICs) of the observed gas-phase product compounds by MI-SPI-TOF-MS, upon heterogeneous reaction of SO₂ with urban grime at 0% RH, 30% RH, and 70% RH in the dark and in the presence of light. As shown in fig. S9, the TIC at low RH (0 to 30% RH) slightly increased upon light irradiation, but a sharp increase of TIC was observed at 70% RH. The uptake coefficient of SO2 also increased with an increase of RH (Fig. 1), indicating that higher RH accelerates SO₂ uptake on urban grime upon light irradiation, leading to enhanced formation of gas-phase product compounds. Considering that the average RH in the Pearl River Delta region (57) is about 70% and that haze episodes especially occur at higher RH in the urban atmosphere, the suggested heterogeneous SO₂ chemistry on ubiquitous urban glass surfaces can play an important role during daytime affecting the air quality. In particular, the high RH (70%) would facilitate the reactive uptake of SO₂, leading to the formation of typically polar OS compounds with high water solubility (43). The obtained results clearly indicate that synergistic effect of near-UV light irradiation

and high RH (70%) represents key factors promoting the formation of VOCs during the heterogeneous reaction of SO₂ with urban grime.

The formation mechanisms of OS compounds in the atmosphere are not yet fully understood. Some earlier studies suggested that OS compounds might be formed through esterification of OH groups or C=O groups (after gem-diol conversion) with sulfuric acid (50, 58, 59). However, it has been shown that the esterification reactions between sulfuric acid and simple alcohols are not feasible under typical atmospheric pH conditions (60). It was demonstrated that acid-catalyzed reactions of epoxides are kinetically feasible to generate OS compounds (61, 62). It has been also shown that direct addition of SO₂ to C=C bonds of alkenes and fatty acids is another possibility to explain the formation of OS compounds in the atmospheric aerosols (29, 31). The unsaturated fatty acid and PAHs adsorbed on the urban surfaces can react with gaseous SO₂ through a [2 + 2] cycloaddition mechanism leading to the formation of OS compounds (29, 31, 43). It has to be noted that the forbidden triplet state (${}^{3}B_{1}$) of SO₂ can be formed upon near-UV light irradiation that lies in the wavelength range between 340 and 400 nm, and it can react with water molecules, leading to the formation of the hydroxyl radical (OH) and hydroxysulfinyl radical (HOSO) (63). The OH radical can further oxidize the organic constituents of the urban grime leading to the production of CHO compounds in the air. Under light irradiation, SO₂ can also form π complexes with C=C bonds of fatty acids that can absorb near-UV light, leading to a photoactivation of the fatty acids such as nonanoic acid and generation of saturated and unsaturated aldehydes (31). It has been suggested that charge transfer complexes incorporating the excited triplet state of SO₂ (³SO₂*) is the important first step toward product formation during SO₂ reaction with compounds containing C=C bonds (64). Following the attack of ${}^3SO_2^*$ on the π bond of the fatty acids, oxidation at the carbon radical would be expected to lead to the cyclic sulfite as an intermediate compound (64). The diradical organosulfur intermediates can react with O2 and form reactive oxygen species such as OH, which can initiate radical chain reactions and induce the formation of oxygenated CHO compounds (29, 64). Previous

investigations have suggested that the observed compound with m/z 189.1122 [C₉H₁₆O₄)H⁺] (DBE = 2, Xc = 0) is a common product compound formed upon oxidation of unsaturated lipids (65). However, it is difficult to distinguish which pathway is prevailing among all the pathways mentioned above, and it could be responsible for most of the formed OS compounds. Last, it has to be noted that adsorbed ions on the urban grime can also affect the heterogeneous chemistry and alter the reaction mechanism (27, 66, 67).

Contribution to ambient organosulfur aerosol formation

We evaluate whether heterogeneous reaction of SO_2 with building surfaces may be important for ambient organosulfur aerosol formation. We start from the spatial distribution of building surfaces in a $0.4^{\circ} \times 0.4^{\circ}$ (roughly 43 km) domain centering Guangzhou (Fig. 5). We estimate a total building surface area of 0.52 billion m^2 . As a comparison, the boundary-layer aerosol surface area is roughly 0.22 billion m^2 for the same study region, if we assume an aerosol concentration of 25 μ g m⁻³ (roughly annual mean concentration for Guangzhou), 1- μ m aerosol diameter, and 800-m boundary layer height [estimated on the basis of MERRA-2 (modern-era retrospective analysis for research and applications, version 2) reanalysis data].

We then estimate the flux of SO_2 uptake by building or aerosol surfaces (F_i , i = building or aerosol), using the following equation

$$F_i = \frac{1}{4} \gamma_i \omega C_{SO_2} A_i \tag{2}$$

where γ_i is the uptake coefficient (10^{-5} for both building and aerosol surfaces), ω is the mean molecular velocity (312 m s^{-1}), C_{SO2} is the SO₂ concentration ($10 \text{ µg m}^{-3} = 0.16 \times 10^{-6} \text{ mol m}^{-3}$), and A_i is the surface area for buildings or aerosols. The above equation does not account for the limitation of gas-phase transport to surfaces, which is, in general, non-negligible for buildings. Nevertheless, F_{building} should still characterize the order of magnitude. We find an average SO₂ uptake flux of 0.06 mol s⁻¹ by buildings and 0.03 mol s⁻¹ by aerosols over the domain shown in Fig. 5, and the results show that building uptake is up to 15 times faster than aerosol uptake at the city core where high rises locate.

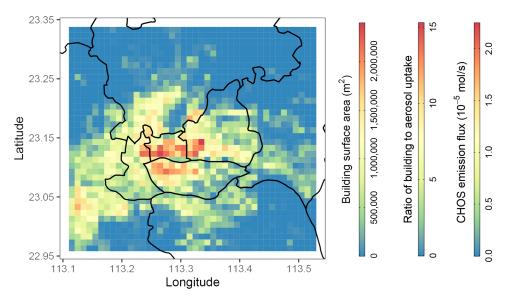


Fig. 5. Distribution of building surface areas, ratio between building surface uptake and aerosol surface uptake, and gaseous CHOS emission fluxes from building surfaces in the city of Guangzhou.

Following the reaction of SO₂ with the urban grime at 70% RH, we have determined (Eq. 7) the concentrations of the produced CHO, CH, CHOS, CHON, and CHN compounds (tables S3 to S5). On the basis of the estimated concentrations, we established the following reaction stoichiometry

$$SO_2 + C = C + hv \rightarrow 0.35 \text{ CHO} + 0.08\text{CHOS} + 0.01\text{CHON} + 0.05\text{CH} + 0.003\text{CHN}$$
 (R-1)

Assuming that SO_2 reacts with the urban grime by direct addition of SO_2 to a double bond or the separate addition of SO_2 to the cleavage of a double bond (e.g., fatty acids and PAHs) (31, 68), we then estimate a CHOS emission flux of 4.9×10^{-3} mol s⁻¹ or an average emission flux density of 2.7×10^{-12} mol m² (ground area) s⁻¹ from building surfaces in Guangzhou. This emission flux is nontrivial for atmospheric chemistry at the city scale.

We demonstrate this with an order-of-magnitude estimate for the contribution of CHOS fluxes to organosulfur aerosols. We assume that emitted CHOS gases quickly and completely convert into organosulfur aerosols, although the fate of emitted species is not fully addressed in the current study. We treat the domain shown in Fig. 5 as a single well-mixed box with 800-m height, which satisfies the following mass balance equation

$$F_{\text{CHOS}}\tau = C_{\text{CHOS}}V\tag{3}$$

where τ is the characteristic residence time of the air in the box. τ is roughly 8 hours given a boundary-layer wind speed of 1.8 m s⁻¹ (annual mean surface wind speed for Guangzhou) and a lateral length of 43 km. V is the air volume of the box.

This yields an organosulfur concentration ($C_{\rm CHOS}$) of 1 × 10^{-10} mol m⁻³ or 20 ng m⁻³ (molecular weight of CHOS molecules is taken roughly as 200 g mol⁻¹) under the average condition in Guangzhou. In comparison, measurements in Guangzhou have shown a CHOS aerosol concentration of 200 ng m⁻³ (43). The average concentration of quantified OS compounds in Shanghai was 65.5 to 77.5 ng m⁻³ in 2015 to 2016 and 59.4 to 79.7 ng m⁻³ in 2018 to 2019 (69). This result suggests that emissions from building surfaces may be a non-negligible source for OS compounds in megacities through heterogeneous reactions with SO₂ (70).

MATERIALS AND METHODS

Urban grime

Sampling of urban grime was carried out in Guangzhou, China between 26 August and 26 September 2020 on the roof of the building situated on the campus of Guangzhou Institute of Geochemistry (113.36° E, 23.13° N), described previously (26). Briefly, the building is located about 200 m from a highway with frequent traffic and dense population in metropolitan Guangzhou. The urban film was collected onto rectangular borosilicate glass plates (1.5 cm by 45 cm) by placing them on a custom-built sampler, which shields glass plates from precipitation. Before deployment, borosilicate glass plates were prepared by rinsing eight times with tap water followed by successive immersions into a bath of hydrochloric acid (HCl) of 10%, 1 M sodium hydroxide (NaOH) for 1 hour, and further rinsing eight times in ultrapure water (18 megohms, H₂O-MM-UV-T, Germany), sequentially. Last, they are wrapped in aluminum foil and baked in a 100°C oven to remove any residual moisture. The samples were

transported to and from the sampling site and were refrigerated until extraction and further analysis by GC-MS and for assessing the SO_2 heterogeneous reactions in the flow tube reactor.

Flow tube reactor

The flow tube reactor was applied in our previous studies to evaluate the uptake coefficients of NO₂ on urban grime (26, 27, 67). The uptake coefficients of gaseous SO₂ (50 ppb) with the urban grime were measured in a double-wall flow tube reactor (50-cm length and 2.6-cm inner diameter) coupled to a SO2 analyzer (Thermo Fisher Scientific, model 43i SO₂ analyzer) under constant ambient temperature (296 K) controlled by a thermostatic bath (Lauda RC6 refrigerated bath with RCS thermostat, temperature accuracy = \pm 0.02 K at 263 K). The flow tube reactor is designed to operate at ambient pressure, under gas-phase laminar flow conditions. The glass plate with grime sample was placed in the reactor and exposed to four lamps (Philips TL-D 40 W, 300 to 400 nm, length = 60 cm) that are installed above the reactor and placed in a wooden box. The resulting spectral intensities of the lamps were measured by a calibrated spectroradiometer (Ocean Optics, USA) coupled with a linear-array charge-coupled device detector. All the experiments described here were performed under atmospheric conditions (296 K, 1 atm), and the RH ranged from 0 to 90%. A certified mixture of SO₂ (1 ppm) in nitrogen (N₂) (99.999% MESSER) was connected to a mixing loop fed by synthetic air (99.999% MESSER) to allow dilution. For the first dilution, a constant flow of 25 ml min⁻¹ (0 to 100 ml min⁻¹ HORIBA METRON Series mass flow controller, ±1% accuracy) of SO₂ flow was introduced into the flow tube through a horizontal movable injector along with synthetic air at a flow rate of 200 ml min⁻¹ (0 to 500 ml min⁻¹ HORIBA METRON mass flow controller; accuracy, $\pm 1\%$). Then, a sheath flow of 600 ml min⁻¹ (0 to 1000 ml min⁻¹ HORIBA METRON mass flow controller; accuracy, ±1%) was provided by a humidifier and incorporated in the reactor to get the second dilution. All gases were taken directly from gas cylinders without further purification before use.

Kinetic modeling

The KM-SUB (25) was applied to better understand SO_2 uptake coefficients on urban grime for different RHs and for dark and irradiated conditions. Processes included in the model are SO_2 reversible adsorption to the urban grime surface, surface-bulk exchange, bulk diffusion, and chemical reactions at the surface and in the bulk of the urban grime. The urban grimes may contain various kinds of fatty acids that may have different reactivities toward SO_2 . To account for diversity of fatty acids, the model represents them with two surrogate fatty acids with high (fatty acid 1) and low reactivity (fatty acid 2) toward SO_2 . Two reactions are included in the model as follows

$$SO_2$$
 + fatty acid 1 \rightarrow product Rate coefficient = k_1 (R-2)

$$SO_2$$
 + fatty acid 2 \rightarrow product Rate coefficient = k_2 (R-3)

Rate coefficients for dark and irradiated conditions are assumed to be different in the model. An effective rate coefficient is used for irradiated conditions that may account for potential mechanisms including the formation of the SO₂ triplet state and an SO₂ π complex with alkenes that can be activated by light or species in the urban grime absorbing UV light to take part in photochemical reactions (31, 71). The gas-phase concentration of SO₂ in the flow tube ([SO₂]_g) is calculated using the following equation

$$\frac{d[SO_2]_g}{dt} = \frac{\varphi}{V}([SO_2]_{g,0} - [SO_2]_g) - (J_{ads,SO_2} - J_{des,SO_2})\frac{S}{V}$$
 (4)

where φ is the volumetric flow rate, V is the volume of the flow tube, $[SO_2]_{g,0}$ is the concentration of SO_2 entering the flow tube, J_{ads,SO_2} is the SO_2 adsorption flux, J_{des,SO_2} is the SO_2 desorption flux, and S is the surface area of the urban grime.

Unknown parameters in the model included the rate coefficients $(k_1 \text{ and } k_2)$ under both dark and irradiated conditions, the thickness of the film, the initial concentrations of the fatty acids in the urban grime, the partitioning coefficient of SO₂ into the urban grime, and the bulk diffusion coefficients of both SO₂ and the fatty acids for different RHs. The Monte Carlo Genetic Algorithm (MCGA) was applied to determine a parameter set that could reproduce the experimental measurements (72). During the Monte Carlo runs, parameters are randomly varied between fixed boundaries, and each parameter set is assigned a fitting value based on how well it reproduces the measurements. During the Genetic Algorithm runs, the fitting values of some of the parameter sets are improved using a series of processes known in natural evolution such as survival, recombination, and mutation. The parameter ranges used in the MCGA were based on previous literature whenever possible as described in table S1 (28, 73). Best-fitting parameters used in the model are summarized in table S1. It should be noted that it is not possible to fully constrain all parameters and the range of values that provide a reasonable fit to the experimental data are summarized in figs. S10 to S12.

Sample analysis by GC-MS

Before extract, a piece of sample glass was cut into squares of suitable size a by glass knife and submerged in 30 ml of dichloromethane/ methanol (1:1, v/v) and ultrasonically extracted for 5 min, and then the extracts were combined, filtered, and concentrated to about 1 ml at 23°C under N_2 gas. Each of the concentrated extract was split into two aliquots.

The following operation procedure of GC-MS was deployed. In brief, two aliquots were analyzed using an Agilent 7890/5975C gas chromatograph equipped with an HP-5MS capillary column (30 m, 0.25 mm, and 0.25 mm). The temperature program started at 65°C and held for 2 min. Then, the temperature was increased at 5°C min⁻¹ to 290°C with a hold at 20 min. Electron impact ionization was used, and a selected-ion monitoring program was developed to quantify all target analytes.

Characterization of gas-phase product compounds

Real-time measurements of the gaseous compounds generated by the heterogeneous reaction of SO₂ with the urban grime were carried out by homemade SESI and detected directly by a high-resolution Q Exactive hybrid Quadrupole Orbitrap mass spectrometer (UHR-MS) (Thermo Fisher Scientific, USA) online coupled to the reactor. Briefly, a modified SESI source from a commercial nano-ESI (Thermo Fisher Scientific, USA) was coupled with a compact stainless steel ionization chamber (74, 75). The chamber was combined with the vacuum interface of the mass spectrometer. The ESI setting parameters in negative and positive modes were as follows: a stable flow rate of 200 ml min⁻¹ for a nano-LC system (Thermo Fisher Scientific, USA), 2.5-kV voltage, 90°C for the ionization chamber, and the sampling line heated at 130°C. The mass spectra were obtained in a mass range *m/z* from 50 to 500 applying a mass resolution of 140,000 at *m/z* 255 and a scan rate of 1 s. The commercial standard calibration

solutions (Thermo Fisher Scientific, USA) were applied to calibrate the Orbitrap mass spectrometer prior to the measurements.

Calculations of the DBE and Xc parameters

To explore the saturation and oxidation degree of the observed compounds, the DBE, aromaticity equivalent (Xc), were calculated. The value of DBE was calculated on the basis of Eq. 5 for the elemental composition CcHhOoNnSs

DBE =
$$c - \frac{h}{2} + \frac{n}{2} + 1$$
 (5)

where c, h, o, n, and s correspond to the number of carbons, hydrogen, oxygen, nitrogen, and sulfur atoms in the neutral formula, respectively. Molecular formulae with negative DBE and elemental compositions that disobey the nitrogen rule were discarded.

The value of Xc, which is used to identify aromatic and polyaromatic structures in a complex mixture of compounds, was calculated as follows (36)

$$Xc = \frac{3[DBE - (m \times o + n \times s)] - 2}{DBE - (m \times o + n \times s)}$$
(6)

If DBE $\leq m \times o + n \times s$ or $Xc \leq 0$, then Xc = 0, where m and n correspond to a fraction of O and S atoms in π -bond structures of a compound. When compounds contain functional groups such as aldehydes, ketones, nitroso, cyanate, alcohol, or ethers, m and n are adjusted to 1 or 0 (36). We used m = n = 1 for the calculation of the Xc in this study.

Estimation of normalized intensity of gaseous product compounds

Assuming equal ionization efficiency of different product compounds, which is commonly used method to estimate O/C ratios of secondary organic aerosols (51, 76, 77), we calculated the normalized intensity of the formed product compounds during the light-induced SO₂ heterogeneous reaction with authentic urban grime by using 2-butanone as a reference compound (74, 78)

$$C_i = \frac{\operatorname{Int}_i}{\operatorname{Int}_{\mathrm{BUT}}} \times C_{\mathrm{BUT}} \tag{7}$$

where C_i is the mixing ratio (pptv or ppbv) of compound i detected during the experiments, Int_{BUT} is the intensity of 2-butanone, Int_i is the intensity of product i, and C_{BUT} is the mixing ratio of 2-butanone, i.e., 2 ppbv. The normalized intensity of the observed compounds can be used as a semiquantitative analysis of the detected product compounds (79).

Estimations of building surface areas and OS compound emissions

We first estimated the surface area of urban buildings in the city of Guangzhou on the basis of a building dataset (www.resdc.cn/data. aspx?DATAID=270; accessed April 2022). The dataset contains geocoded building footprints and number of floors for 289,119 buildings around the city center (22.963°N to 23.335°N, 113.115°E to 113.525°E). The surface area of a building is estimated as the sum of its rooftop area and its exterior wall area. The rooftop area is computed as the area of the building footprint, and the exterior wall area is estimated as the perimeter of the building footprint times the

building height (assuming that the average floor height is 3 m). Figure 5 shows the spatial distribution of building surface areas in Guangzhou resolved at $0.01^{\circ}\times0.01^{\circ}$ resolution. High-rise buildings in the core areas result in high surface areas. In total, we estimate a building surface area of 0.52 billion m². As a comparison, we estimate that the boundary-layer aerosol surface area is roughly 0.22 billion m² for the same study region, if we assume a 25 μg m $^{-3}$ aerosol concentration, 1- μm aerosol diameter, and 800-m boundary layer height (25 μg m $^{-3}$ is close to annual mean aerosol concentration in Guangzhou; annual average boundary layer height based on MERRA-2 reanalysis data).

Given the reaction stoichiometry (R-1), we estimate that the emission fluxes of CHO, CHOS, CHON, CH, and CHN are 2.1×10^{-2} , 4.9×10^{-3} , 6.1×10^{-4} , 3.1×10^{-3} , and 1.8×10^{-4} mol/s, respectively, or the average emission flux densities are 1.2×10^{-11} , 2.7×10^{-12} , 3.4×10^{-13} , 1.7×10^{-12} , and 1.0×10^{-13} mol m² (ground area) s⁻¹, respectively. These emission fluxes are nontrivial for atmospheric chemistry at the city scale.

SUPPLEMENTARY MATERIALS

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