

# Insights into air pollution chemistry and sulphate formation from nitrous acid (HONO) measurements during haze events in Beijing†

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Wintertime urban air pollution in many global megacities is characterised by episodic rapid increase in particulate matter concentrations associated with elevated relative humidity – so-called haze episodes, which have become characteristic of cities such as Beijing. Atmospheric chemistry within haze combines gas- and condensed-phase chemical processes, leading to the growth in secondary species such as sulphate aerosols. Here, we integrate observations of reactive gas phase species (HONO, OH, NO<sub>x</sub>) and time-resolved aerosol composition, to explore observational constraints on the mechanisms responsible for sulphate growth during the onset of haze events. We show that HONO abundance is dominated by established fast gas-phase photochemistry, but the consideration of the additional formation potentially associated with condensed-phase oxidation of S species by aqueous NO<sub>2</sub> leading to NO<sub>2</sub><sup>–</sup> production and hence HONO release, improves agreement between observed and calculated gas-phase HONO

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levels. This conclusion is highly dependent upon aerosol pH, ionic strength and particularly the parameterisation employed for S(iv) oxidation kinetics, for which an upper limit is derived.

## Background

Atmospheric chemical processing leads to the removal of primary pollutants and determines the rate of production of secondary species, including ozone and many components of aerosol particles. Gas-phase processing is driven by a small number of key oxidants, of which the OH radical is predominant for the majority of species during daytime, including many hydrocarbons and inorganic gas-phase species such as  $\text{SO}_2$  and  $\text{NO}_2$ . Gas- and condensed-phase oxidation chemistry are coupled across the two phases of aerosol, with a wide range of aqueous oxidants driving the particle phase oxidation of species such as  $\text{SO}_2$ , including  $\text{NO}_2$  itself.

In many urban areas, particulate matter (PM, particularly  $\text{PM}_{2.5}$ ) is a key regulated air pollutant, whose abundance drives substantial adverse human health impacts, in addition to affecting visibility, radiation transfer and amenity. PM is formed of a complex chemical mixture including both directly emitted (primary) and chemically produced (secondary) components; understanding the relationship between these underpins the accurate identification of direct and indirect PM sources, formulating the most effective and efficient clean air policy.

This challenge is emphasised by the air pollution climatology of Beijing and the North China Plain, where seasonal haze events characterised by episodic  $\text{PM}_{2.5}$  excursions to  $500 \mu\text{g m}^{-3}$  and above, impact the health and wellbeing of around 400 million people. Sulphate is known to be a major component of the fine size fraction of Beijing haze. The rate of formation of sulphate aerosol from  $\text{SO}_2$ , driven by chemical oxidation, is observed to increase as  $\text{PM}_{2.5}$  levels rise, and recent studies into haze formation have found that the rate of production of sulphate aerosol is significantly accelerated in megacities such as Beijing.<sup>1</sup> New chemical mechanisms have been proposed, notably including the aqueous phase oxidation of  $\text{SO}_2$  by  $\text{NO}_2$ , if aerosol pH is sufficiently high. A by-product of this mechanism is expected to be the production of gas-phase HONO.

Here, we analyse *in situ* observations collected during the UK-Chinese Air Pollution and Human Health (APHH) campaign in central Beijing during haze episodes in November–December 2016, which constrain the gas-phase production and removal of HONO, and the observed rate of formation of sulphate. We identify constraints from the *in situ* observations upon potential chemical  $\text{SO}_2$  oxidation mechanisms contributing to haze formation.

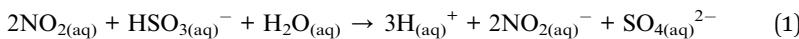
## Sulphate aerosol formation in haze

Secondary  $\text{SO}_4$  formation is driven by a number of chemical mechanisms. Globally, the dominant process is the gas-phase reaction of  $\text{SO}_2$  with OH radicals, leading to the formation of  $\text{HSO}_3$  intermediates, which rapidly react with  $\text{O}_2$  forming  $\text{SO}_3$ , which is converted to  $\text{H}_2\text{SO}_4$  through reaction with water vapour. The recently characterized rapid reaction between  $\text{SO}_2$  and criegee intermediates formed through alkene ozonolysis,<sup>2</sup> is unlikely to significantly impact boundary layer  $\text{SO}_2$  oxidation due to the rapid removal of criegee intermediates by water

vapour and the water vapour dimer.<sup>3,4</sup> SO<sub>2</sub> may also partition to aqueous aerosol particles, where a series of equilibria partition between SO<sub>2</sub>·H<sub>2</sub>O (at low pH), HSO<sub>3</sub><sup>−</sup> (pH 2–7) or SO<sub>3</sub><sup>2−</sup> under basic conditions. In the aqueous phase, SO<sub>2</sub> processing is driven by H<sub>2</sub>O<sub>2</sub> (when pH is near neutral) and O<sub>3</sub> (of increasing importance under more acidic conditions). Transition metals (Fe, Mn) can also catalyse O<sub>2</sub> reactions leading to condensed phase sulphate formation. During the onset of haze events, sulphate formation rates of the order of tens of µg per m<sup>3</sup> per hour are observed.<sup>1</sup> Very recently, Wang *et al.*<sup>5</sup> reported the potential for HONO-mediated SO<sub>2</sub>-to-SO<sub>4</sub> oxidation in Beijing cloud/fog, with associated N<sub>2</sub>O formation.

However, current air quality models fail to reproduce elevated sulphate levels in winter haze. Several mechanisms for S(iv) oxidation are still under consideration to account for the underestimation of sulphate concentration between model simulations and field observations, including reactive nitrogen chemistry involving the oxidation of S(iv) by NO<sub>2</sub>,<sup>6–10</sup> underestimation of the transient metals catalyzed pathway,<sup>11,12</sup> the possible oxidation on the surface of acid droplets by O<sub>2</sub>,<sup>13</sup> or the otherwise dominant role of S(iv) + H<sub>2</sub>O<sub>2</sub> pathway.<sup>14</sup> Although these pathways can improve the agreement between sulphate simulation and measurement, there remains a lack of independent constraints on modelling results, especially the potentially dominant role of the NO<sub>2</sub>-S reaction. A tagging methodology with triple oxygen isotopes has been applied as a proxy to constrain the relative contributions of the individual oxidation pathways of S(iv),<sup>12,15</sup> with results showing that the NO<sub>2</sub>-S reaction is highly dependent on pH and dominant under high-pH conditions, however, a very substantial uncertainty resulted from the assumed activity coefficient between the aerosol liquid phase ionic strength and parameterisation of the kinetic reaction rate.

The reaction between NO<sub>2</sub>, partitioned into the aqueous phase, with HSO<sub>3</sub><sup>−</sup> remains a potentially dominant driver of sulphate formation under haze conditions, forming SO<sub>4</sub><sup>2−</sup> at rates of 1–7 µg m<sup>−3</sup> h<sup>−1</sup>.<sup>6,8</sup>



This is in contrast to tropospheric cloud processing of sulphur species, which is dominated by the H<sub>2</sub>O<sub>2</sub> and O<sub>3</sub> reactions, with NO<sub>2</sub> processing relatively unimportant.<sup>16</sup> The mechanism has the potential to drive a positive feedback in haze formation, where increased sulphate production leads to increased aerosol water and hence SO<sub>2</sub> uptake and oxidation, under conditions of high NO<sub>2</sub>.<sup>6</sup> Of particular note here, the condensed phase nitrite is expected to be released from acidic aerosol to the atmosphere as HONO.<sup>8</sup>

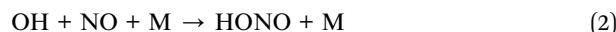
The ionic composition of the aqueous aerosol is critically important in calculating the importance of the NO<sub>2</sub> mechanism – ionic strength (which impacts the rate constants for the S(vi) oxidation reactions) and aerosol pH. Elevated pH enhances SO<sub>2</sub> solubility (higher effective Henry's law constant); consequently chemical factors to maintain elevated aerosol pH (5–7) are required, and have been attributed to high levels of ammonia emissions/ammonium in the North China Plain.<sup>6,8</sup> However, subsequent analyses have concluded that the highest observed NH<sub>3</sub> levels are insufficient to raise pH levels above 4.5 under haze conditions, and hence it is unlikely that NO<sub>2</sub>-mediated oxidation of SO<sub>2</sub> is



a major sulphate formation route in Beijing haze, compared with  $O_3$  and transition-metal mediated oxidation.<sup>11</sup>

## Boundary layer HONO photochemistry

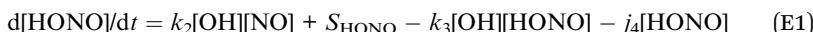
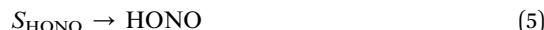
The basic gas-phase chemistry of HONO combines formation through the homogenous termolecular  $OH + NO$  reaction (R2), and reaction of HONO with OH (R3) and relatively rapid solar photolysis (R4), where the photolysis frequency ( $1.7 \times 10^{-3} \text{ s}^{-1}$  at SZA = 40°) corresponds to a typical mid-latitude local solar noon lifetime of around 10 min.



HONO photolysis (R4) is an important, and frequently the dominant, source of OH radicals in the continental boundary layer, accounting for 40% of OH formation in central London,<sup>17</sup> over 80% of OH production at a rural site in Colorado,<sup>18</sup> and most recently an average of 83% of OH production in wintertime Beijing<sup>19</sup> – hence, HONO abundance and formation mechanisms are tightly coupled to the production of OH and rate of *in situ* gas-phase oxidation for many atmospheric pollutants.

HONO levels may be predicted by reactions (R2)–(R4), assuming a photochemical steady state (see below), which may then be compared with observed concentrations to ascertain the presence of additional HONO sources. This exercise has been undertaken a number of times, leading to a range of additional HONO sources being identified – which are frequently significantly larger than the homogeneous  $OH + NO$  reaction. Examples include source strengths exceeding reaction (R2) by factor 13 in a European forest,<sup>20</sup> 30 at Hyttiälä<sup>21</sup> and a factor of 19 in rural China.<sup>22</sup> In performing such analyses, it is important to note the timescales for HONO are rather longer than those of OH, hence analysis in highly spatially heterogeneous environments can be challenging as noted by Lee *et al.*<sup>23</sup> and Crilley *et al.*<sup>24</sup>

In general terms, such sources may be combined as an additional source term,  $S_{HONO}$ , if HONO may be placed into the steady state:



A number of mechanisms for further atmospheric HONO emission and production have been suggested. Direct emission sources include vehicle exhausts (with HONO emissions equivalent to 1.24%, and 0.85% of  $NO_x$  emissions recently derived for the Hong Kong and UK vehicle fleets, respectively),<sup>25,26</sup> biocrusts,<sup>27</sup> and microbial soil emissions.<sup>28</sup> Heterogeneous HONO sources include dark reactions between  $NO_2$  and water (*e.g.* Finlayson-Pitts *et al.*<sup>29</sup>) on ground and aerosol surfaces, photolysis of nitrophenols, and photoenhanced conversion of  $NO_2$  to HONO in the presence of organic chromophores.<sup>30</sup>

Substantial work has been undertaken and the reader is directed to the reviews of Kleffmann<sup>31</sup> and Spataro and Ianniello.<sup>32</sup>

The UK-Chinese Air Pollution and Human Health – Beijing experiment (APHH-Beijing), was funded by the UK Natural Environment Research Council and the National Science Foundation of China. APHH-Beijing brought together well over 100 instruments to study boundary layer atmospheric composition and haze formation at the Institute of Atmospheric Physics (IAP), Chinese Academy of Sciences in central Beijing in November–December 2016 and spring–summer 2017.

Here, we combine co-located measurements from the APHH study, alongside numerical model calculations, to explore potential constraints on the sulphate formation mechanisms under haze conditions in Beijing. We compare the abundance of HONO with potentially determinant parameters including PM, meteorological factors and aerosol composition (including  $\text{SO}_4$ ). We calculate the HONO concentrations which would be predicted in ambient air from established gas-phase chemistry (reactions (2)–(4)), and the rate of HONO formation from the aerosol-mediated  $\text{NO}_2/\text{SO}_2$  oxidation process (reaction (1)). We compare predicted HONO levels with those observed, and discuss the quantitative agreement in the context of different approaches to parameterising the  $\text{NO}_2$ -enhanced  $\text{SO}_2$  oxidation kinetics. Implications for air quality are discussed.

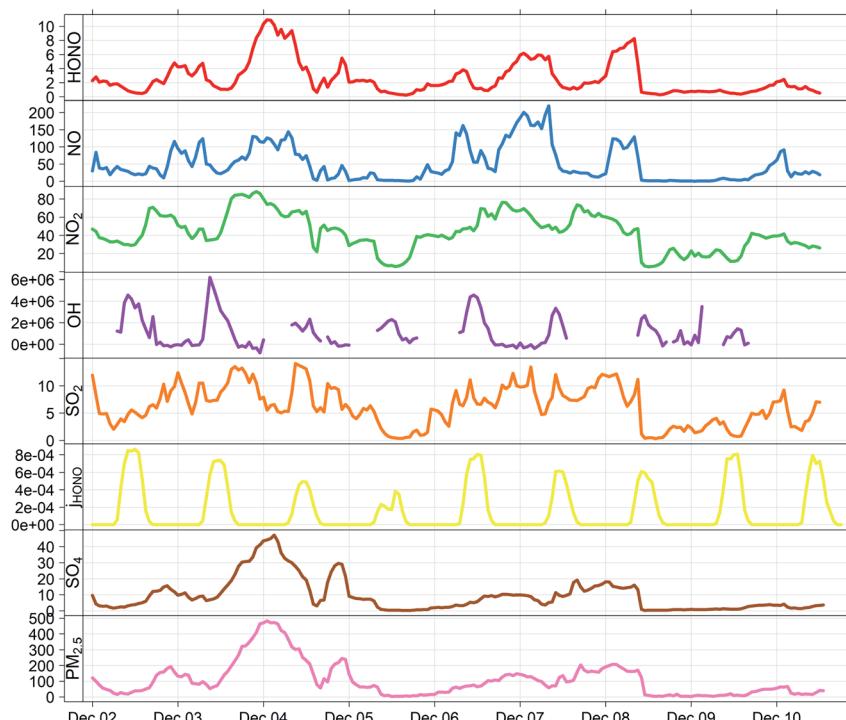
## APHH-Beijing measurements

Measurements were acquired during the APHH-Beijing winter experiment, conducted from 10 November–10 December 2016 at the Institute of Atmospheric Physics (IAP), Chinese Academy of Sciences in central Beijing  $39^{\circ}58'33''$  N,  $116^{\circ}22'41''$  E, between the third and fourth North ring roads. The site is in a residential area, with a number of substantial highways *ca.* 150 m away to the south, north and west. On the site itself, an open grassed area is surrounded by 2–3 storey buildings, with larger structures (residential blocks) some 200–300 m away. A canal runs past the north perimeter of the site, with a park (including conifer pine trees) further to the west. Given recent work to relocate industry from central Beijing, the dominant local emission sources are anticipated to be traffic and domestic activities, with possible contributions from light industry, for  $\text{NO}_x$ . For  $\text{SO}_2$ , sources are anticipated to be regional, industry and power/heating-related combustion (including coal) around the city periphery. For full details of the site, instruments and campaign overview, including a detailed meteorological timeseries, see Shi *et al.*<sup>33</sup>

OH radicals were measured *via* laser-induced fluorescence, using the fluorescence assay by gas expansion (FAGE) methodology. Full details of the instrument operation and calibration are given in Slater *et al.*<sup>19</sup> NO was measured using chemiluminescence employing a Thermo TE421  $\text{NO}_x$  monitor, calibrated to an NPL  $\alpha$ -standard. Photolysis frequencies ( $j_{\text{HONO}}$ ) were measured at ground level using a calibrated spectral radiometer. HONO was measured using the LOPAP (Long Path Optical Absorption Photometry) approach. The LOPAP is a wet chemical technique and has been described in detail in Heland *et al.*<sup>34</sup> and Kleffmann *et al.*<sup>35</sup> Briefly, a stripping coil entrains gas-phase HONO into an acidic solution where it is derivatized into an azo dye, detected by long path absorption at 550 nm, and calibrated against an aqueous phase nitrite standard. The LOPAP

was operated and calibrated according to the standard procedures described in Kleffmann and Wiesen.<sup>36</sup> A detailed account of the APHH-Beijing HONO dataset, including an intercomparison of HONO measurements by LOPAP, broadband cavity absorption spectrometry, chemical ionisation mass spectrometry and proton transfer reaction mass spectrometry is given in Crilley *et al.*<sup>37</sup> All data were acquired at ground level (inlet heights = 5 m).

Aerosol data for sulphate mass concentration were taken from AMS (aerosol mass spectrometer) measurements; these therefore correspond to the fine fraction ( $PM_{2.5}$ ) of the particulate matter present. The sulphate concentrations determined by AMS data were compared with the results obtained by 24 hour high-volume  $PM_{2.5}$  filter samples collected at the IAP site during December 2016, and analysed in the laboratory by ion chromatography.<sup>38</sup> The two datasets were found to be within 20% of each other ( $r^2 = 0.97$ ) and the AMS data were used without further adjustment.  $PM_{2.5}$  mass concentrations were derived by TEOM-FDMS, and were recorded at the top of a two-storey building (about 10 m above ground level). Data were averaged to hourly mean mixing ratios using *in situ* temperature and pressure measurements. The period 2–10 December was selected as this encompassed several periods of haze, with rapid and dramatic  $PM_{2.5}$  growth reaching nearly  $500 \mu g m^{-3}$  (haze periods typically identified as  $PM_{2.5} > 75 \mu g m^{-3}$ ), and maximised overlap between the operational periods of the various instruments used – during this date range, 65% of the necessary



**Fig. 1** Measured timeseries for HONO (ppb), NO (ppb),  $NO_2$  (ppb), OH ( $\text{molec cm}^{-3}$ ),  $SO_2$  (ppb),  $j_{\text{HONO}}$  ( $\text{s}^{-1}$ ),  $SO_4$  (AMS;  $\mu g m^{-3}$ ) and  $PM_{2.5}$  (TEOM FDMS;  $\mu g m^{-3}$ ) at the IAP tower site during the APHH Beijing winter campaign, 2016.



measurements were present (see Fig. 1), limited primarily by the OH and HONO datasets. Conditions during this period were typical of the wider APHH winter campaign (see Shi *et al.*<sup>33</sup> for climatological details).

## Analysis of *in situ* observations

Fig. 1 shows the characteristic pattern of haze event onset observed previously, and associated with increases in many air pollutant species and intermediates; daily mean mixing ratios/concentrations are given in ESI Tables ST1 and ST2.<sup>†</sup> There is a positive correlation between HONO and sulphate abundance, indicating commonality in their mechanisms of formation/removal. In general, HONO abundance is frequently closely coupled with that of NO<sub>2</sub> (through heterogeneous NO<sub>2</sub>-to-HONO conversion chemistry, and/or co-emission of both species), and variations in the HONO/NO<sub>2</sub> ratio can be used to characterise this relationship. We find HONO levels are correlated with the abundance of PM<sub>2.5</sub> ( $r^2 = 0.67$ ) and of aerosol sulphate ( $r^2 = 0.59$ ), but the HONO/NO<sub>2</sub> ratio is much less strongly related to PM<sub>2.5</sub> abundance ( $r^2 = 0.27$ ), indicating that the interaction between particulate matter and HONO may be more strongly related to sulphate chemistry, than NO<sub>2</sub>-to-HONO heterogeneous conversion. The HONO-SO<sub>4</sub> relationship does not show any dependence upon SO<sub>2</sub>, but higher levels of both species are strongly associated with higher RH (Fig. 2), indicating a potential association with aqueous content, such as the condensed phase SO<sub>2</sub> oxidation mechanisms outlined above.

The measurement data coverage during the APHH-Beijing campaign at IAP provides direct constraints on the major (gas-phase, photochemical) processes forming and removing ambient nitrous acid, including measurements of concentrations of OH, NO, HONO and meteorological/photolysis parameters. We averaged data to an hourly time resolution, and evaluated the consecutive changes in concentration of HONO (*i.e.*  $d[\text{HONO}]/dt$ , defined simply as the difference in consecutive hourly mean measurements of HONO abundance), and

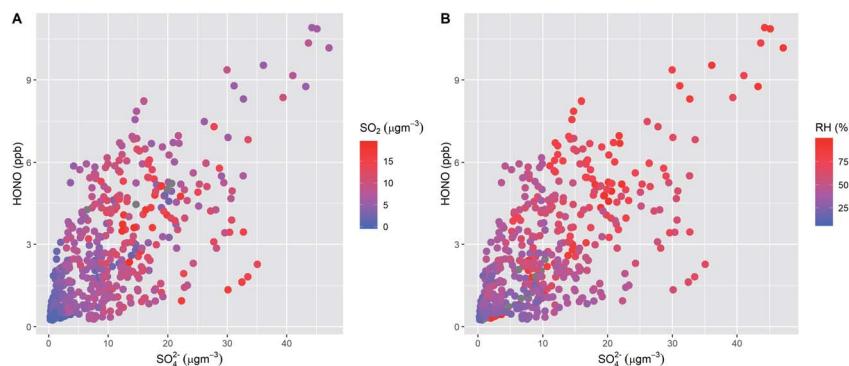


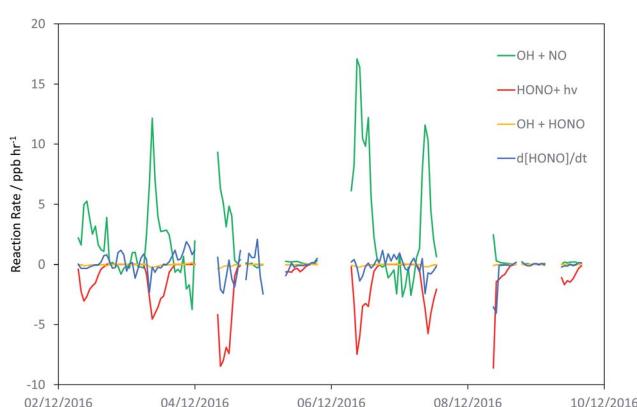
Fig. 2 Relationship between HONO and SO<sub>4</sub> concentrations, coloured by SO<sub>2</sub> abundance (panel A) and by relative humidity (RH, panel B), during the 2–10 December focus period. The data show the limited impact of SO<sub>2</sub>, but the highest levels of both HONO and SO<sub>4</sub> are associated with elevated humidity.



rate of the chemical reactions forming and removing HONO over the equivalent time periods (E1).

Fig. 3 shows the derived timeseries for  $d[\text{HONO}]/dt$ , and the individual components of HONO formation and removal, focusing upon the case study period of 2–10 December. The dominance of the conventional gas-phase chemistry is apparent, with HONO formation dominated by the OH + NO reaction, and removal by photolysis, with a small to negligible contribution from the OH + HONO reaction.

Discounting potential additional sources of HONO (*i.e.*, assuming  $S_{\text{HONO}} = 0$ ), we can calculate the HONO abundance that would be predicted assuming the steady state applies. We limit the analysis to daylight only (here, hourly-averaged data where the HONO lifetime is less than 60 min), corresponding to  $j_{\text{HONO}} > 2.78 \times 10^{-4} \text{ s}^{-1}$ , and where all measurements are available (HONO, OH, NO, SO<sub>2</sub>, photolysis parameters, aerosol composition) – this condition reduces the available data to 44 hourly averages, 23% of the total over the focus period (the principal reduction *vs.* the coverage noted above arises due to the restriction to daylight hours). The predicted HONO concentration is compared with that observed in Fig. 4. The PSS-calculated (red triangles) and observed (blue circles) HONO mixing ratios are in relatively good agreement, indicating limited immediate need for additional production terms. A clearer picture is obtained from the regression analysis (Fig. 5), comparing the PSS-calculated and observed HONO mixing ratios (red triangles). While the data are scattered, overall the observed and calculated mixing ratios are similar in overall magnitude, without evidence for orders-of-magnitude error. Regression analysis derives gradient and intercept values of  $0.90 \pm 0.38$  and  $(0.59 \pm 0.84)$  ppb respectively ( $\pm 2\sigma$ ), with an  $r^2$  coefficient of 0.35. HONO measurements performed by multiple independent techniques during the APHH-Beijing study have been compared by Crilley *et al.*,<sup>37</sup> who showed that the LOPAP-derived HONO data had a detection limit of around 35 ppt (*i.e.* very much smaller than the scatter of the observations), and that all instruments (using different techniques) were extremely well correlated with each other ( $r > 0.97$ ), but with variations in slope (*i.e.* absolute accuracy) of 0.61–0.88.



**Fig. 3** Timeseries of the observationally-derived components of *in situ* HONO formation and destruction: reactions of OH + NO (R2), OH + HONO (R3), HONO +  $h\nu$  (R4), plus the observed rate of change of HONO,  $d[\text{HONO}]/dt$ .



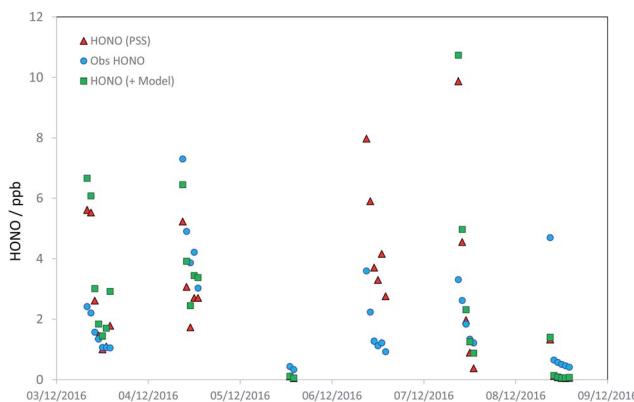


Fig. 4 Timeseries of observed daytime HONO mixing ratios (blue circles), steady state calculated HONO mixing ratios – HONO PSS, as derived from application of eqn (E1) – (red triangles) and model calculated HONO (see text; green squares).

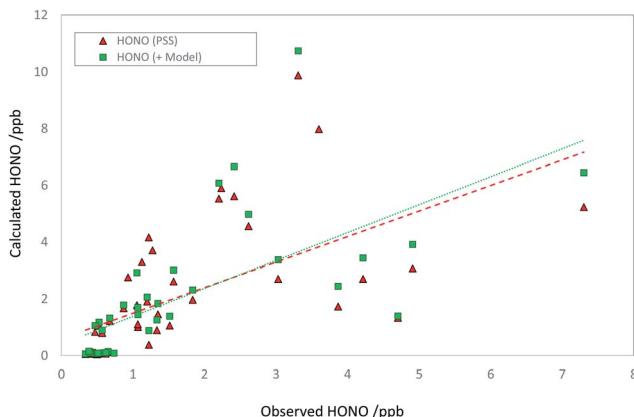


Fig. 5 Correlation between observed HONO and PSS-predicted mixing ratios (red triangles), regression line (red dashes), and model calculated HONO levels (see text; green squares) and associated regression (green dots).

Therefore the scatter in the observed data in Fig. 4 does not reflect measurement precision (although the observations may collectively be biased high or low, depending on the absolute accuracy), and rather reflects changes in the actual observed concentrations, in turn reflecting variations in the atmospheric source and sink-terms as integrated over the HONO lifetime.

The data can also be analysed to quantify HONO formation (or removal) mechanisms not accounted for by the basic chemistry (reactions (R2)–(R4)) through application of (E1) alongside the observed  $d[HONO]/dt$  to derive  $S_{HONO}$ , however the inferred net source for HONO,  $S_{HONO}$ , is very scattered and displays no correlation with  $SO_2$  or  $SO_4$  abundance ( $r^2 = 0.04$  and  $0.02$  respectively), or with the  $SO_2$ -normalised rate of  $SO_4$  formation ( $r^2 = 0.05$ ) – not shown. A crude estimation of the rate of formation of HONO (technically,  $NO_2^-$ ) which would be associated with  $SO_2$  oxidation ( $P_{sulphate}$ ) can be obtained from the observed rate of



formation of sulphate,  $d[\text{SO}_4]/dt$ , multiplied by a factor of 2 for the stoichiometry of  $\text{NO}_2^-$  formation:

$$P_{\text{sulphate}} = 2 \times d[\text{SO}_4]/dt \quad (\text{E2})$$

Critically, in addition to disregarding other (non- $\text{NO}_2$ -mediated) mechanisms for  $\text{SO}_2$  oxidation, this estimate for HONO formation associated with  $\text{SO}_4$  production neglects the effect of dynamics, *i.e.* advection of more (or less) polluted airmasses across the study site – leading to negative as well as positive values (Fig. S1†). Nonetheless it is instructive to compare the resulting daytime  $P_{\text{sulphate}}$  values, which ranged from 0.2 to 2.84 ppb  $\text{h}^{-1}$ , to those predicted for the  $\text{OH} + \text{NO}$  reaction (Fig. 3) – the  $P_{\text{sulphate}}$  values are nearly one order of magnitude smaller (and likely significant overestimates during periods of haze growth, due to pollution advection).

## Model quantification of $\text{SO}_2$ oxidation pathways

To more comprehensively quantify the relative importance of different  $\text{SO}_2$  oxidation mechanisms and the interaction with HONO formation, a zero-dimensional numerical model constrained to the observed conditions was used to calculate the gas- and condensed-phase  $\text{SO}_2$  oxidation rates for the focus period. The model framework involved a series of processes, consisting of gas-phase reaction of  $\text{SO}_2$  with  $\text{OH}$ , absorption equilibria of gaseous species, ionization, aqueous phase chemical reactions of S(IV), and the kinetics of mass transport. The model assumed that air infuses into the aerosol water and then participates in chemical reactions. The condensed-phase oxidation of S(IV) by  $\text{H}_2\text{O}_2$ ,  $\text{O}_3$ , oxygen catalyzed by  $\text{Fe}^{3+}/\text{Mn}^{2+}$  or  $\text{NO}_2$  in the aerosol water were explicitly represented. The influence of primary sulphate emission and regional transportation were disregarded – the focus is on *in situ* chemical production only. The kinetics of sulphate formation and its dependence on ionic strength of aerosol water were implemented following Cheng *et al.*<sup>6</sup> and He *et al.*<sup>15</sup> Concentrations of  $\text{Fe}^{3+}$  and  $\text{Mn}^{2+}$  were pH-dependent and followed the precipitation equilibria of  $\text{Fe}(\text{OH})_3$  and  $\text{Mn}(\text{OH})_2$ .

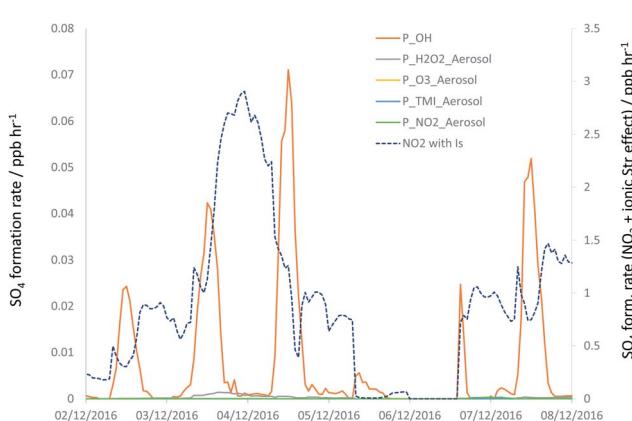
The Nested Air Quality Prediction Model System (NAQPMS) developed by the Institute of Atmospheric Physics, Chinese Academy of Sciences (IAP/CAS) was adopted to simulate hourly concentrations of OH free radicals and  $\text{H}_2\text{O}_2$  during the field campaign.<sup>39</sup> NAQPMS incorporated the Carbon Bond Mechanism version Z (CBM-Z)<sup>40</sup> to simulate gas-phase reactions. The modeled OH and  $\text{H}_2\text{O}_2$  concentrations were used in the estimation of sulphate formation from the gas-phase reaction of OH with  $\text{SO}_2$  and the aqueous-phase reaction of  $\text{H}_2\text{O}_2$  with  $\text{HSO}_3^-$ , and (in the case of OH) to evaluate the model oxidant field calculation. The observed aerosol composition, gaseous  $\text{NH}_3$  and meteorological conditions were input into the ISORROPIA-II thermodynamic equilibrium model<sup>41</sup> to estimate the aerosol water content (AWC), aerosol water pH, and ionic strength (Table ST2†). The model was run in forward mode and predicted the phase partitioning of a  $\text{K}^+/\text{Ca}^{2+}/\text{Mg}^{2+}/\text{NH}_4^+/\text{Na}^+/\text{SO}_4^{2-}/\text{NO}_3^-/\text{Cl}^-/\text{H}_2\text{O}$  in thermodynamic equilibrium with gas-phase precursors.

By way of validation, the modelled and observed OH levels<sup>19</sup> as a sensitive test of the integrated NAQPMS oxidation (VOC,  $\text{NO}_x$  and  $\text{O}_3$  chemistry), are compared

in Fig. S2.† Overall, agreement was good, with the model showing good skill in reproducing the diurnal behaviour of OH. The absolute modelled OH levels were within 15% of those observed on 4 of the 6 days considered, but exceeded those observed (by up to a factor of 2) on the remaining 2 days (interestingly, those characterised by the lowest NO levels).

The modelled rate of formation of  $\text{SO}_4$  was determined for OH (gas phase),  $\text{H}_2\text{O}_2$ ,  $\text{O}_3$ , transition metals (Fe, Mn catalysed  $\text{O}_2$  reaction) and  $\text{NO}_2$  driven processes. Ionic strength is a key factor in such calculations: sulphate production rates were calculated for three cases: (A) neglecting the impact of ionic strength; (B) considering the impact of ionic strength upon the solubility of  $\text{SO}_2$  and the dissociation of  $\text{H}_2\text{SO}_3$  (ref. 42) and upon the kinetics of the  $\text{H}_2\text{O}_2$ ,  $\text{O}_3$  and transition metal reactions; and (C) also considering the impact of ionic strength upon the rate constant for the  $\text{NO}_2 + \text{S(IV)}$  reaction, following the parameterisations of Cheng *et al.*<sup>6</sup> We compared these approaches as there is a lack of experimental data for the influence of ionic strength upon the  $\text{NO}_2$ -S reaction, and the calculated aerosol ionic strength during severe haze events reaches 60 M (when  $\text{RH} > 40\%$  and  $\text{PM}_{2.5} > 75 \mu\text{g m}^{-3}$ ) hence extrapolations from the conditions of dilute solutions may not be warranted.

Discounting ionic strength effects (*i.e.*, case A),  $\text{SO}_4$  formation averaged over the whole 12 November–10 December 2016 campaign period is found to be dominated by gas-phase OH chemistry (51%), followed by condensed phase  $\text{H}_2\text{O}_2$  and transition metal reactions, with  $\text{NO}_2$  reaction responsible for 1.6%. Considering ionic strength effects other than  $\text{NO}_2$  kinetics (case B), oxidation of  $\text{SO}_2$  (g) by OH drives 81% of  $\text{SO}_4$  formation, with 18% arising from  $\text{H}_2\text{O}_2$  and 0.6% for reaction with  $\text{NO}_2$  – however the average and maximum rates of  $\text{SO}_4$  formation calculated were 0.036 and  $0.29 \mu\text{g m}^{-3} \text{ h}^{-1}$  respectively, much lower than those observed. Inclusion of the ionic strength parameterisation for the  $\text{NO}_2 + \text{S}$  kinetics (case C) increases the calculated rate of  $\text{SO}_4$  formation by two orders of magnitude (a factor of 96), with the calculated contribution of the  $\text{NO}_2$  pathway for  $\text{SO}_4$



**Fig. 6** Modelled  $\text{SO}_4$  formation rates (converted to  $\text{ppb h}^{-1}$ ) through reaction of  $\text{SO}_2$  with OH (orange line), condensed phase reactions (all case B) with  $\text{H}_2\text{O}_2$  (grey),  $\text{O}_3$  (yellow), transition metals (blue) and  $\text{NO}_2$  (green). Dashed line, second y axis:  $\text{NO}_2$  reaction considering impacts of ionic strength on  $\text{NO}_2 + \text{S(IV)}$  reaction kinetics (*i.e.* case C). See Fig. S5 (ESI†) for expansion of the  $\text{H}_2\text{O}_2$ ,  $\text{O}_3$  and TMI timeseries.



formation increasing to 98% overall, as a consequence of the very strong dependence of the rate constant upon ionic strength, highlighting this critical uncertainty in this aspect of the kinetics parameterisation. The average and maximum rates of  $\text{SO}_4$  formation calculated for case C were 3.5 and 12  $\mu\text{g m}^{-3} \text{h}^{-1}$ , respectively, comparable to the behaviour observed (Fig. 1 and S3†).

The timeseries for the modelled  $\text{SO}_4$  formation rates for each chemical mechanism under case (B), and for the  $\text{NO}_2$ -driven processing under case (C), are shown in Fig. 6 for the 2–7 December focus period – note the different y axis scale used for the latter data series (see also Fig. S4†). The significant increase in the overall rate of formation of  $\text{SO}_4$  for case (C) is in much closer accord with the rates of  $\text{SO}_4$  formation derived from the observed timeseries (Fig. 1), than for cases (A) and (B).

Considering the rate of production of  $\text{NO}_2^-$ , as an estimate to the  $\text{HONO}$  formation rate associated with  $\text{NO}_2/\text{SO}_2$  oxidation, it is clear that the non-ionic-strength enhanced kinetics (case (A) and (B) – the latter as shown in Fig. 6) are too small to make any appreciable impact upon  $\text{HONO}$  production, compared with the dominant  $\text{OH} + \text{NO}$  reaction flux. Calculated  $\text{HONO}$  formation from case (C), dominated by the ionic-strength-dependent reaction with  $\text{NO}_2$ , was added to the homogeneous  $\text{OH} + \text{NO}$  production to determine the impact upon calculated steady state  $\text{HONO}$  concentrations, according to eqn (E3), and as shown in Fig. 4 and 5 as  $\text{HONO}$  (+Model).

$$[\text{HONO}] = \frac{\{k_1[\text{OH}][\text{NO}] + [\text{Modelled } \text{SO}_2 + \text{NO}_2 \text{ rate}]\}}{\{k_2[\text{OH}][\text{HONO}] + j_3[\text{HONO}]\}} \quad (\text{E3})$$

Addition of the  $\text{SO}_2 + \text{NO}_2$  derived  $\text{HONO}$  flux increases the  $\text{HONO}$  levels by 27% on average, and modestly improves agreement between the calculated and observed  $\text{HONO}$  levels ( $r^2 = 0.98$ ). The observed and PSS-calculated  $\text{HONO}$  levels are compared as a function of  $\text{SO}_4$  in Fig. S3† – while higher levels of both are associated with more polluted conditions (more  $\text{PM}_{2.5}$ , more  $\text{SO}_4$ ), no bias between the observed and PSS-calculated levels with respect to  $\text{SO}_4$  is apparent, indicating this factor is not dominant. By applying a scale factor to the model-derived  $\text{HONO}$  production component, it can be shown that the rate of  $\text{SO}_2$  oxidation by  $\text{NO}_2$ , as simulated here, is consistent with the observed  $\text{HONO}$  within the scatter of the data, but would cease to be so if the ionic strength enhancement factor were to be significantly increased – an upper limit (corresponding to a regression gradient of 1.5) of a factor of 4.5 fold higher may be estimated.

## Conclusions

Nitrous acid was measured in the urban atmosphere of Beijing, at mixing ratios of up to 10 ppb (significantly higher than many other cities, *e.g.* 1.6 ppb for London<sup>17</sup>).  $\text{HONO}$  abundance, alongside that of many air pollutant species, was correlated with the formation of episodic haze events, associated with rapid growth in  $\text{PM}_{2.5}$  under elevated RH conditions, including increases in sulphate concentration. The  $\text{HONO}/\text{NO}_2$  ratio, a marker for heterogeneous interconversion of reactive nitrogen oxides to  $\text{HONO}$  through dark- and photo-enhanced reaction processes,

was not correlated with aerosol abundance, indicating heterogeneous formation does not dominate HONO production. Rather, during daytime, fast conventional gas-phase chemistry – the OH + NO reaction (2), and HONO photolysis (4) – dominates the HONO abundance in wintertime Beijing, and considering these processes (and the minor HONO + OH reaction (R3)), permits alone good quantitative agreement (regression coefficient =  $0.90 \pm 0.38$ ) between measured and calculated photostationary steady state HONO levels.

Combination of observationally-constrained rates of HONO formation and loss through reactions (2)–(4), with the calculated rates of HONO production through heterogeneous mechanisms including  $\text{H}_2\text{O}_2$ ,  $\text{O}_3$ , transition metal and S- $\text{NO}_2$  chemistry showed that, discounting the effects of ionic strength, the condensed phase mechanisms made a negligible contribution to HONO formation, while  $\text{SO}_2$  oxidation was dominated by gas-phase OH chemistry, with the S- $\text{NO}_2$  reaction contributing 1.6% of the total. Inclusion of the ionic strength effects, including parameterisation of the  $\text{NO}_2$ -S(v) kinetics following Cheng *et al.*<sup>6</sup> led to calculated condensed-phase nitrite production equivalent to increases in the steady state HONO levels of 27%, modestly increasing agreement with the HONO levels observed. Under this scenario, the  $\text{NO}_2$ -S processing dominates  $\text{SO}_4$  formation. Considering the constraint the HONO levels place upon the additional production attributable to the  $\text{NO}_2$ -S reaction, an upper limit to the maximum possible enhancement of the ionic-strength-dependent kinetics of a factor of 4.5 is estimated.

This work demonstrates the potential, and limitations, for coordinated observations of gaseous and particulate atmospheric composition to constrain fundamental processes which are extremely challenging to evaluate accurately in the laboratory or field – in this case, aerosol liquid water pH and ionic strength kinetic behaviour under very strongly non-ideal conditions. A key limitation of the data which are available here is their fixed measurement location: a lagrangian approach, allowing parameters to be evaluated along the trajectory of an evolving airmass at higher altitude and remote from possible surface influence may facilitate greater insight.

## Conflicts of interest

There are no conflicts of interest.

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