

SCIENTIFIC REPORTS



OPEN

High levels of ammonia do not raise fine particle pH sufficiently to yield nitrogen oxide-dominated sulfate production

Hongyu Guo¹, Rodney J. Weber¹ & Athanasios Nenes^{1,2,3,4}

High levels of ammonia (NH_3) have been suggested to elevate ambient particle pH levels to near neutral acidity ($\text{pH} = 7$), a condition that promotes rapid SO_2 oxidation by NO_2 to form aerosol sulfate concentration consistent with “London fog” levels. This postulation is tested using aerosol data from representative sites around the world to conduct a thorough thermodynamic analysis of aerosol pH and its sensitivity to NH_3 levels. We find that particle pH, regardless of ammonia levels, is always acidic even for the unusually high NH_3 levels found in Beijing ($\text{pH} = 4.5$) and Xi’an ($\text{pH} = 5$), locations where sulfate production from NO_x is proposed. Therefore, major sulfate oxidation through a NO_2 -mediated pathway is not likely in China, or any other region of the world (e.g., US, Mediterranean) where the aerosol is consistently more acidic. The limited alkalinity from the carbonate buffer in dust and seasalt can provide the only likely set of conditions where NO_2 -mediated oxidation of SO_2 outcompetes with other well-established pathways. The mildly acidic levels associated with excessive amounts of ammonia can promote high rates of SO_2 oxidation through transition metal chemistry, this may be an alternative important aerosol chemical contributor to the extreme pollution events.

pH is a fundamental particle property that affects aerosol formation, composition, toxicity and nutrient delivery^{1–6}. Sulfate is a ubiquitous inorganic aerosol species that strongly regulates aerosol acidity and is produced by aqueous and gas-phase oxidation of SO_2 along well-established pathways. Aqueous pathways dominate depending on the pH level (O_3 under alkaline and H_2O_2 under acidic conditions⁷). Aqueous oxidation of HSO_3^- has recently been proposed as the major mechanism of haze formation in China, but requires fine particle pH levels that are close to neutral ($\text{pH} 6–7$) or higher^{8,9}. It is well-known that upon emission, fresh dust or seasalt particles can have a pH level that exceeds 6^{10,11}, hence provide aerosol where NO_2 -mediated oxidation of sulfate is possible; however, the acidic sulfate that forms upon these particles rapidly depletes their alkaline carbonate buffer and limits any substantial NO_2 -mediated production of sulfate. Acidification is fast for submicron particles, since acidic gases (e.g., HNO_3 and H_2SO_4) are rapidly scavenged by alkaline aerosols^{12,13}, dust and seasalt are only minor ionic fractions compared to sulfate and nitrate¹, and equilibrium states with gases are typically achieved within 30 minutes under ambient conditions^{14–16}. The good agreements between model and observation for the semivolatile species partitioning of $\text{NH}_3\text{-NH}_4^+$ and $\text{HNO}_3\text{-NO}_3^-$ species, using aerosol bulk properties as model input, suggest the thermodynamic equilibrium states in many circumstances and that the ambient fine mode aerosol is consistently (and often strongly) acidic^{2,17–19}. Unlike fine haze particles, fogs and cloud drops can have pH closer to neutral owing to dilution of H^+ by the orders of magnitude more liquid water.

Wang, *et al.*⁸ and Cheng, *et al.*⁹ argue that very high levels of NH_3 from intense agriculture (e.g., up to 50–60 ppbv in Beijing and Xi’an, China) can sufficiently elevate pH in fine mode aerosol (PM_{10} and $\text{PM}_{2.5}$) to promote rapid sulfate formation from NO_2 oxidation of SO_2 . We explore this by carrying out a thorough thermodynamic analysis with the ISORROPIA-II model¹⁸ for conditions of aerosol- and gas-phase constituents that

¹School of Earth and Atmospheric Sciences, Georgia Institute of Technology, Atlanta, GA, 30332, USA. ²School of Chemical and Biomolecular Engineering, Georgia Institute of Technology, Atlanta, GA, 30332, USA. ³Institute for Chemical Engineering Sciences, Foundation for Research and Technology – Hellas, Patras, GR-26504, Greece. ⁴Institute for Environmental Research and Sustainable Development, National Observatory of Athens, GR-15236, P. Penteli, Greece. Correspondence and requests for materials should be addressed to R.J.W. (email: rweber@eas.gatech.edu) or A.N. (email: athanasios.nenes@gatech.edu)

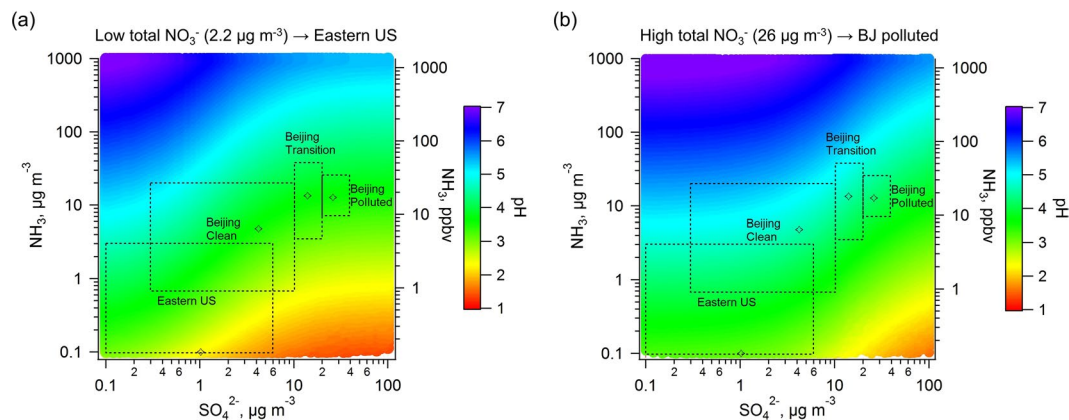


Figure 1. Sensitivity of PM_{10} pH to gas-phase ammonia (NH_3) and PM_{10} sulfate (SO_4^{2-}) concentrations. The results are predictions from a thermodynamic analysis assuming equilibrium between the gas and particle phases for typical winter conditions ($\text{RH} = 58\%$, $T = 273.1\text{ K}$) in (a) the eastern United States with low total NO_3^- ($\text{HNO}_3 + \text{NO}_3^-$) concentrations, $2.2\ \mu\text{g m}^{-3}$, and (b) Beijing haze pollution periods with high total NO_3^- , $26\ \mu\text{g m}^{-3}$. Boxes define observed concentration ranges for the Eastern US and Beijing and open symbols represent mean NH_3 and SO_4^{2-} conditions. Average total NO_3^- for Eastern US, Beijing (BJ) clean, BJ transition, BJ polluted were 2.2 , 6.6 , 18 , $26\ \mu\text{g m}^{-3}$, respectively. Since total NO_3^- during Beijing clean and transition periods were $6.6\ \mu\text{g m}^{-3}$ and $18\ \mu\text{g m}^{-3}$, respectively, graph (a) better represents the Beijing clean period and graph (b) better for the Beijing transition period.

characterize a broad range of aerosol acidities and drivers thereof. We limit our analysis to fine mode ($\text{PM}_{2.5}$) aerosol, as the majority of the sulfate mass resides in that fraction^{1,20} (hence its pH being the most relevant for sulfate formation), and which is also the size range where thermodynamic analysis for acidity inference works best^{2,17,18,21}.

Results

To understand the major drivers of aerosol acidity, we explore pH levels for aerosol of increasing chemical complexity, and its sensitivity to NH_3 levels found throughout the world; we focus on two well-characterized “extremes” of anthropogenic influence: the relatively clean southeastern US and the heavily polluted regions of Beijing and Xi’an, China. In our analysis, we first focus on the simplest possible composition that is atmospherically relevant: aerosol dominated by NH_4^+ , $\text{HSO}_4^-/\text{SO}_4^{2-}$, i.e., where the effects of NO_3^- , Cl^- or nonvolatile cations (Na^+ , K^+ , Ca^{2+} , Mg^{2+}) is negligible. The summertime southeastern US meets this criteria, and was thoroughly studied by Weber, *et al.*²¹; the same study predicted that large amounts of NH_3 , $\sim 160\ \mu\text{g m}^{-3}$ (220 ppbv), is required for equilibrium with a deliquesced ammonium sulfate aerosol. Under such conditions, aerosol pH is equal to 3.2. The pH drops to about 0.1 for aerosol composed of deliquesced ammonium bisulfate, requiring a low gas-phase NH_3 level of $0.06\ \mu\text{g m}^{-3}$ (0.08 ppbv) to be in equilibrium. The transition from NH_4HSO_4 to $(\text{NH}_4)_2\text{SO}_4$ aerosol increases equilibrium NH_3 by 2700 times and aerosol acidity by roughly 3 pH units, regardless of SO_4^{2-} level in the range of 0.1 – $10\ \mu\text{g m}^{-3}$. Expanding the thermodynamic analysis to include the effects of other minor inorganic constituents and organic water found in the southeastern US aerosol do not change this finding; hence a 10-fold increase in NH_3 increases aerosol pH by about one unit over a wide range of ambient NH_3 and SO_4^{2-} concentration (0.1 – $10\ \mu\text{g m}^{-3}$)²¹.

For a more chemically-complex aerosol, where pH is controlled by the NH_4^+ , $\text{HSO}_4^-/\text{SO}_4^{2-}$ and NO_3^- system (wintertime Beijing and Xi’an meet this criteria;^{8,9}), co-condensation of gas-phase NH_3 occurs with HNO_3 to form NH_4NO_3 aerosol if the ambient temperature is low enough and sufficient liquid water content is present¹⁸. This co-condensation also reduces the concentration of hydronium ions in the aerosol aqueous phase (i.e., increases pH) because the salts formed are less acidic than sulfate, and the additional condensed aerosol water further dilutes the aqueous phase^{2,17}. The response of pH to NH_3 in this more complex aerosol may differ from the simpler NH_4^+ , $\text{HSO}_4^-/\text{SO}_4^{2-}$ system discussed above. To study this, we carry out pH calculations for T and RH conditions representative of the eastern US and Beijing during wintertime ($\sim 0^\circ\text{C}$ and $58\% \text{ RH}$)^{2,8} under conditions of “low” ($\text{HNO}_3 + \text{NO}_3^- = 2.2\ \mu\text{g m}^{-3}$, characteristic of eastern US), and “high” ($\text{HNO}_3 + \text{NO}_3^- = 26\ \mu\text{g m}^{-3}$; characteristic of Beijing haze) total inorganic nitrate levels. The results of the simulations are shown in Fig. 1(a,b), respectively. Regardless of total NO_3^- concentration, at any SO_4^{2-} concentration from 0.1 to $100\ \mu\text{g m}^{-3}$, a 10-fold increase in NH_3 raises pH by one unit over a wide range of NH_3 concentrations (0.1 to $1000\ \mu\text{g m}^{-3}$). In Fig. 1(a), a weak sensitivity of pH to SO_4^{2-} is predicted for SO_4^{2-} above $10\ \mu\text{g m}^{-3}$, similar to the situation found in the southeastern US in summer²¹. For this SO_4^{2-} range, SO_4^{2-} mass is high enough to dominate over any effect of NO_3^- on water uptake and pH, and maintains aerosol pH at 2.5 or below; for lower SO_4^{2-} concentrations, NO_3^- becomes increasingly important (for constant NH_3) and pH increases accordingly to levels that may range between 3 and 4.5 for atmospherically-relevant levels of NH_3 . At higher levels of total nitrate (Fig. 1b), the transition from SO_4^{2-} -controlled acidity ($\text{pH} < 2.5$) and NO_3^- -dominant acidity ($\text{pH} > 3$) occurs at levels above $100\ \mu\text{g m}^{-3}$ SO_4^{2-} .

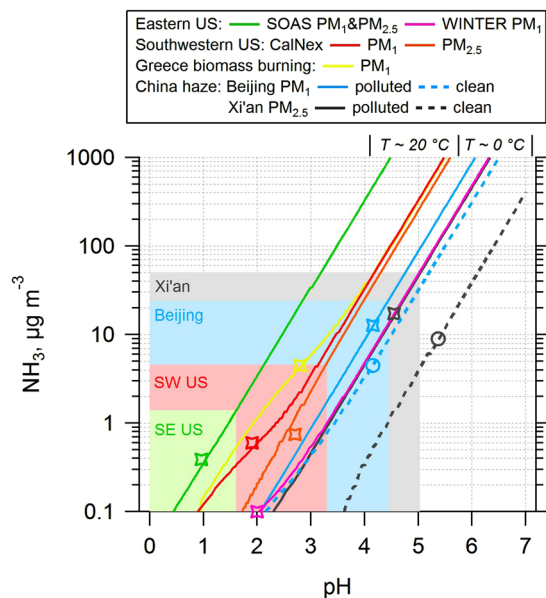


Figure 2. Equilibrium particle pH versus a wide range of ammonia (NH_3) based on average aerosol and meteorological conditions (RH, T) at each site. The open symbols are the study mean pH and NH_3 , and shaded backgrounds show the upper limit of the pH range for each study (shading color matches color of study line given in the legend). Note that Xi'an polluted and WINTER PM_1 lines overlap showing inherent consistency between the two (also true for Beijing). For the WINTER study (the only aircraft data shown), the point represents a predicted NH_3 level $0.1 \mu\text{g m}^{-3}$ (pH = 2), whereas the reported campaign average pH (0.8 ± 1.0) is lower due to lower pH aloft (2).

Therefore, for conditions of modest sulfate and high ammonia and total nitrate levels, acidity in Beijing tends to be reduced compared to the southeastern US and is largely controlled by a “nitrate-dominated” pH level.

Based on the above, the important question on what controls aerosol pH can be seen to be the relative amounts of $\text{HNO}_3 + \text{NO}_3^-$, SO_4 , and $\text{NH}_3 + \text{NH}_4^+$ of the system considered. The boxes indicated in Fig. 1(a,b) define characteristic areas corresponding to eastern US and Beijing aerosol (similar RH and T in winter); the pH levels inside these boxes then characterize the inherent particle acidity level of each location. The NH_3 in the eastern US normally ranges between 0.1 and $2 \mu\text{g m}^{-3}$ with some extremes as high as $3\text{--}4 \mu\text{g m}^{-3}$ according to field measurements²², and the Ammonia Monitoring Network (AMoN, <http://nadp.sws.uiuc.edu/amon>)²³. NH_3 levels in Beijing were observed to be much higher, up to $38 \mu\text{g m}^{-3}$ (51 ppbv), during a heavy haze event in 2015 (Table S2 in Wang, *et al.*⁸). SO_4^{2-} concentration in the same event reached a maximum of $38 \mu\text{g m}^{-3}$. The lowest pH is predicted for the eastern US due to the lower NH_3 and SO_4^{2-} compared to Beijing in Fig. 1(a,b). However, for a wide range in NH_3 and SO_4^{2-} , particle pH for Beijing during clean, transition, and polluted periods are all around 4, and do not exceed 5. Although an extreme maximum of $300 \mu\text{g m}^{-3}$ SO_4^{2-} was reported in another wintertime in Beijing in 2013⁹, the weak dependency of pH on SO_4^{2-} ($>10 \mu\text{g m}^{-3}$) results in a somewhat lower pH but still within the sub- $100 \mu\text{g m}^{-3}$ SO_4^{2-} ranges discussed above.

The main conclusions derived from Fig. 1 do not change when the thermodynamic analysis is expanded to include a broader temperature range or the small amount of fine mode nonvolatile cations found in each region. This is shown in Fig. 2, which presents the equilibrium particle pH versus ammonia for summertime ($T \sim 20^\circ\text{C}$) and wintertime ($T \sim 0^\circ\text{C}$) conditions at different locations. Partitioning of NH_3 and HNO_3 towards particle-phase NH_4^+ and NO_3^- is enhanced in lower temperatures, which as expected tends to increase particle pH. All lines become parallel for $>20 \mu\text{g m}^{-3}$ NH_3 , exhibiting a sensitivity of roughly one unit pH unit increase per 10-fold increase in NH_3 . The slope of the eastern US summertime line (green) is constant throughout the entire NH_3 range due to negligible effects of NO_3^- or other nonvolatile cations on pH. The lowest range of NH_3 and pH (0.9) is also found in the eastern US in summer. Due to the impact of high HNO_3 and NO_3^- observed in the southwestern US, the lines shift to higher pH levels, despite a T, RH, and NH_3 range similar to the eastern US. In that case the study mean $\text{PM}_{2.5}$ pH (2.7) is nearly one unit higher than PM_1 pH (1.9) owing to nonvolatile cations from seasalt being internally mixed with $\text{PM}_{2.5}$, confirmed by particle mixing states measurements and thermodynamic simulations¹⁷. The difference between the southwestern US PM_1 (red line) and $\text{PM}_{2.5}$ (orange line) decreases with NH_3 , as the influence of seasalt on particle pH decreases as more and more ammonium nitrate forms. Biomass burning plumes observed in Greece reached the highest PM_1 pH (2.8) from the effects of K^+ and NH_3 co-condensation with HNO_3 ^{24,25} and the corresponding sensitivity line (yellow) converges with the southwestern US. Some extreme concentrations of NH_3 (e.g. $10 \mu\text{g m}^{-3}$) in the US would increase pH to 3.5 in summer conditions. In winter conditions, although the eastern US line (purple) is very close to the Beijing lines (blue) and Xi'an polluted (black) line, the actual pH is much lower in the eastern US due to a tenfold or more lower NH_3 concentration (on the level of $0.10 \mu\text{g m}^{-3}$); by comparison, Beijing observed on average NH_3 $4.8 \mu\text{g m}^{-3}$ and $12.8 \mu\text{g m}^{-3}$ during

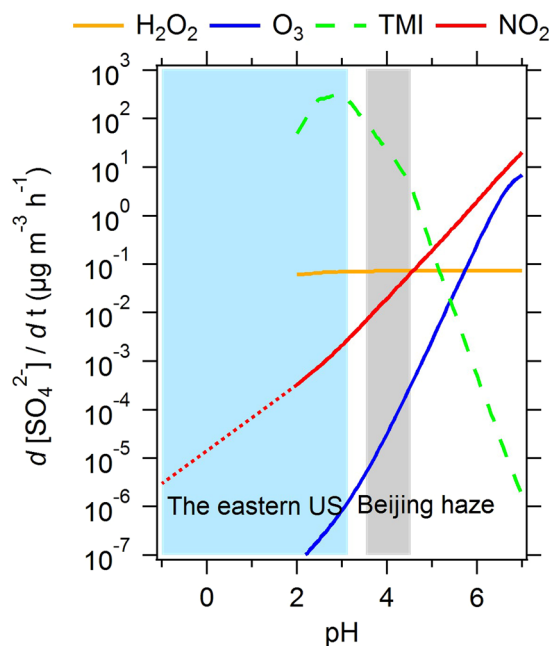


Figure 3. Aqueous-phase sulfate production by sulfur dioxide oxidation under characteristic conditions adapted from Cheng, *et al.*⁹ and plotted with pH ranges calculated in this study. Lines represent sulfate production rates calculated for different aqueous-phase reaction pathways with oxidants: hydrogen peroxide (H_2O_2), ozone (O_3), transition metal ions (TMIs), and nitrogen dioxide (NO_2). The gray-shaded area indicates characteristic pH ranges for aerosols during severe haze episodes in Beijing, calculated in this study. These conditions are contrasted to the lower pH of eastern US aerosol. The plot shows the NO_2 pathway (red line) is not the main route for sulfate production.

clean and polluted periods respectively, and Xi'an observed even higher NH_3 levels at $9.0 \mu\text{g m}^{-3}$ and $17.3 \mu\text{g m}^{-3}$ for clean and polluted periods. Owing to the high levels of NH_3 , the PM_{10} pH of Beijing is predicted to be 4.2 regardless of the air quality condition (clean or polluted), and the $\text{PM}_{2.5}$ pH of Xi'an are predicted to be 4.6 and 5.4. The highest pH in Xi'an is caused by a large fraction of nonvolatile cations (Na^+ , Ca^{2+} , K^+ , Mg^{2+} ; 31% to total aerosol ions by moles); given however that Xi'an data corresponds to $\text{PM}_{2.5}$, and that the mixing state between the PM_{10} and $\text{PM}_{2.5}$ can cause pH to vary up to 3 units¹, it is likely that the aerosol pH in Xi'an exhibits a strong size-dependence that is not reflected in a simple bulk measurement and thermodynamic analysis used here. The maximum NH_3 in Beijing and Xi'an increase pH up to 4.5 and 5.0, respectively, while the maximum NH_3 in the southwestern US increases pH up to 3.3 in the summertime.

Implications for sulfate formation mechanism. The sensitivity of pH to NH_3 is found to be similar between China and eastern US, despite the 10-fold or higher mass loadings of aerosols and gases of the former during intense haze pollution events. We show that for a given set of meteorological conditions (temperature and RH), roughly a 10-fold decrease in NH_3 concentrations is required to drop pH levels by one unit, revealing an inherent consistency between vastly different aerosol systems. The pH levels between the eastern US, Beijing and Xi'an can indeed be related to the inherently different concentrations of NH_3 found in each environment. The average pH of Beijing PM_{10} is predicted to be 4.2 (the same in clean and polluted periods), and the highest pH is about 4.5 for the maximum NH_3 levels observed. Nonvolatile cations do not appear to considerably affect $\text{PM}_{2.5}$ pH at Xi'an (12% mole fraction to total ions for the polluted period) compared to Beijing PM_{10} , except when these cations become a large fraction of $\text{PM}_{2.5}$ (31% mole fraction found during the clean period). Overall, Xi'an $\text{PM}_{2.5}$ may reach a slightly higher maximum pH (5.0) than Beijing, due to even higher NH_3 levels than Beijing. However, for all the pH ranges we find, none are in the range to provide consistent and sufficient alkalinity for the NO_2 oxidation pathway to overwhelm sulfate formation (Fig. 3) based on the model of Cheng, *et al.*⁹. Given this, and that most of the sulfate forms where particles are most acidic (PM_{10} or $\text{PM}_{2.5}$), it is unlikely that NO_2 -mediated oxidation of SO_2 is a major SO_4^{2-} formation route. Under conditions where alkalinity is sufficient to promote NO_2 oxidation, it does not form due to the large amounts of NH_3 , but rather only from the presence of nonvolatile cations, such as those found in mineral dust and searsalt and associated carbonates that maintain pH at levels above 6. Because these species are generally limited to particles sizes larger than $1 \mu\text{m}$ diameter¹, this route is highly unlikely to contribute to PM_{10} sulfate production, including in Beijing²⁰.

The mildly acidic levels associated with excessive amounts of ammonia, however, could promote high rates of oxidation through transition metal chemistry, which overwhelms all other oxidation pathways for pH levels up to 4.5 (Fig. 3). The observed high levels of soluble transition metals that coincide with sulfate at the particle level in the $\text{PM}_{2.5}$ range in US urban air masses¹ and polluted air masses sampled off the coast of China²⁴ supports that this may be an important pathway for explaining the high sulfate production rates, provided that the aerosol

pH persists at the levels predicted here for sufficient time for the slow acid dissolution process of recalcitrant species such as iron⁶. Our analysis shows that aerosol with neutral pH is highly unlikely to be driven by excessive amounts of NH₃; measurements of gas-phase and PM₁/PM_{2.5} aerosol composition at rapid temporal resolution however are still required to show the frequency at which pH exceeds 4.5 during peak haze events, and whether it is possible to approach or exceed the pH 7.6 level in Beijing reported by Wang, *et al.*⁸. Our analysis also suggests this may not be likely, but measurements of size-resolved aerosol composition (including soluble transition metals) and gas-phase constituents at sufficient temporal resolution will provide the definitive observational constraints. We have shown that increasing NH₃ does not lead to a substantially more neutral aerosol, minimizing the importance of a proposed SO₂-NO_x sulfate formation route. An alternative explanation for the recent China winter haze events is changes in weather patterns that have strengthened stagnation conditions²⁶.

Methods

pH affects the equilibrated partitioning of semi-volatile compounds, such as NO₃⁻ and NH₄⁺, between gas- and particle-phase. Based on this sensitivity, the current most reliable method for fine particle pH is via prediction through a thermodynamic model, such as ISORROPIA-II, with gas- and particle-phase concentrations, and meteorological conditions (RH&T) as model input. ISORROPIA-II computes the equilibrium composition of an NH₄⁺-SO₄²⁻-NO₃⁻-Cl⁻-Na⁺-Ca²⁺-K⁺-Mg²⁺-water inorganic aerosol (available online at: <http://isorrophia.eas.gatech.edu>)^{19,27}.

$$\text{pH} = -\log_{10} \gamma_{H^+} H_{aq}^+ = -\log_{10} \frac{1000 \gamma_{H^+} H_{air}^+}{W_i + W_o} \cong -\log_{10} \frac{1000 \gamma_{H^+} H_{air}^+}{W_i} \quad (1)$$

pH is defined as the hydrogen ion activity in an aqueous solution²⁸, where γ_{H^+} is the hydronium ion activity coefficient (assumed as 1; discussed further below), H_{aq}^+ (mole L⁻¹) is the hydronium ion mole fraction in particle liquid water, H_{air}^+ (μg m⁻³) is the hydronium ion concentration per volume of air, and W_i and W_o (μg m⁻³) are the bulk particle water concentrations associated with inorganic and organic species, respectively. W_o needs to be calculated independently by Equation (5) in Guo, *et al.*¹⁸, while both H_{air}^+ and W_i are the outputs of ISORROPIA-II. Particle liquid water ($W_i + W_o$), which is essential for pH calculation, is well predicted compared to the measurement¹⁸. Due to a small bias between 0 and -0.2 pH often found without considering W_o in the pH calculation (the logarithmic nature of pH)^{2,17,18}, in this study we only calculate pH based on W_i , a reasonable assumption given the lower organic mass fraction reported in Beijing (on average 20–60%)^{8,9} compared to the southeastern US (on average 60%)²⁹ resulting in an even smaller effect of organic particle water on pH.

ISORROPIA-II assumes γ_{H^+} as unity, however, the activity coefficients of the other water-soluble ions are calculated as ionic pairs (including H⁺, e.g. H⁺-NO₃⁻). The pH calculated from this method is proven to be similar to models that specifically calculate γ_{H^+} , such as E-AIM³⁰, and observed and predicted gas-particle partitioning of semivolatile species are in good agreement^{2,17}. We note that it is difficult to retrieve activity coefficients in concentrated aqueous solutions. The ISORROPIA-II has been tested by several ambient particle datasets with strong ionic strength, for example, the mean ionic strength 38 mole L⁻¹ in the eastern US². The ionic strength in Beijing haze polluted period (36 mole L⁻¹) is on the same magnitude despite the much higher particle mass loadings (i.e. more particle water).

Details on how the model was run (e.g., forward mode, metastable aerosols), an extensive uncertainty analyses, and predictions of pH at various sites in the southeastern US are discussed in Guo, *et al.*¹⁸. The pH predictions are accurate to a high degree based on the consistency between the predicted and measured partitioning of NH₃-NH₄⁺ or HNO₃-NO₃⁻ examined in a number of studies in various locations from summer to winter conditions^{2,17,18,21,24,25,30}. The thermodynamic model results are further supported by a single pair of semivolatile partitioning calculation, which appears as “S curves” and are thoroughly discussed in the section 3.6 of Guo, *et al.*² and in the section 4.2 of Guo, *et al.*¹⁷, respectively. In applying ISORROPIA-II, we assumed no compositional dependence on particle size, treating the measured chemical constituents as bulk PM₁ or PM_{2.5} properties, and that the aerosol (NH₄⁺, SO₄²⁻, NO₃⁻) was internally mixed and composed of a single aqueous phase that contained the inorganic species, without phase separations that could affect pH (along with partitioning of semi-volatile inorganic species). In Beijing and Xi’an, the large amounts of nitrates present in the aerosol (which exhibit very low efflorescence relative humidity) and other dissolved electrolytes and organics that further depress crystallization⁷ strongly favor the presence of a single aqueous phase. pH calculated under these assumptions (bulk properties, no phase separations, dissolved components in equilibrium with the gas phase) is supported by the ability of ISORROPIA-II to reproduce independently measured gas- and particle-phase semivolatiles concentrations (e.g. NH₃, HNO₃, HCl). It should be noted that Wang, *et al.*⁸ heavily relied on the usage of aerosol molar ratios as a proxy of acidity, which have been shown to not represent pH well^{2,18,21,30}. pH levels reported in that study were carried out with ISORROPIA-II but in stable mode and were evaluated only by predicted equilibrium NH₃ levels by the model. Evaluation of model pH based on predicted NH₃ (or HNO₃) alone is insufficient because gas-phase predictions are insensitive to pH errors (Fig. S1 in the supplemental material; also shown as Fig. S3 in Guo, *et al.*² for HNO₃). Aerosol-phase concentrations, such as NH₄⁺, NO₃⁻, Cl⁻, are however sensitive to the assumption of phase state assumed by ISORROPIA-II and should be used for evaluation purposes (Fig. S1), which were not carried out by Wang, *et al.*⁸. When carrying out such an evaluation (Fig. S1), the metastable option reproduces aerosol NH₄⁺, NO₃⁻, Cl⁻ considerably better than assuming a stable aerosol, hence pH calculations from the metastable option of the model are more consistent with observed thermodynamic partitioning, hence used here. Comparing measured and predicted particle-phase fractions (e.g. $\varepsilon(\text{NH}_4^+) = \text{NH}_4^+ / (\text{NH}_4^+ + \text{NH}_3)$) provides a means for evaluation of the predicted pH. Cheng, *et al.*⁹ also carried out estimates of aerosol pH using ISORROPIA-II with the assumption of metastable aerosol, but a combination of forward and reverse-mode

calculations were used; the strong dependence of pH with size¹ and the extreme sensitivity of ammonia equilibrium vapor pressure to small errors in aerosol NH₄⁺ when pH approaches neutral conditions³⁰ also makes pH assessments that utilize reverse-mode calculations subject to considerable uncertainty.

The approach for generating the contour plots of Fig. 1 is as follows. Average RH, T, and total NO₃⁻ (HNO₃ + NO₃⁻) for the eastern US or Beijing in wintertime, along with a selected sulfate concentration, are input to ISORROPIA-II. Total NH₄⁺ (NH₃ + NH₄⁺) is left as the free variable. The equilibrium concentrations of various components (e.g., gas-phase NH₃, and particle-phase NH₄⁺, SO₄²⁻, and NO₃⁻) and particle pH (along with other variables) are predicted by ISORROPIA-II. Data for the contour plots are generated by varying sulfate from 0.1 to 100 μg m⁻³ while equilibrated NH₃ covers from a wide range between 0.1 and 1000 μg m⁻³ (0.13–1333 ppbv at STP). The calculation of the sensitivity lines in Fig. 2 utilizes a simpler approach than the above due to fixed sulfate concentration at the reported campaign averages, which can be found in the supplemental material Table S1.

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Acknowledgements

This work was supported by the National Science Foundation (NSF) under grant AGS-1360730. AN acknowledges support from a Johnson Faculty Fellowship.

Author Contributions

H.G., A.N., R.W. conceived the study and wrote the manuscript. H.G. and A.N. carried out calculations and H.G. prepared the figures.

Additional Information

Supplementary information accompanies this paper at doi:[10.1038/s41598-017-11704-0](https://doi.org/10.1038/s41598-017-11704-0)

Competing Interests: The authors declare that they have no competing interests.

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