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1 **PM_{2.5} pollution is substantially affected by ammonia emissions in China**

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25 26 **Abstract**

27 Urban air quality in China has been declining substantially in recent years due to severe
28 haze episodes. The reduction of sulfur dioxide (SO₂) and nitrogen oxide (NO_x)
29 emissions since 2013 does not yet appear to yield substantial benefits for haze
30 mitigation. As the reductions of those key precursors to secondary aerosol formation
31 appears not to sufficient, other crucial factors need to be considered for the design of
32 effective air pollution control strategies. Here we argue that ammonia (NH₃) plays a - so
33 far - underestimated role in the formation of secondary inorganic aerosols, a main
34 component of urban fine particulate matter (PM_{2.5}) concentrations in China. By
35 analyzing *in situ* concentration data observed in major cities alongside gridded emission
36 data obtained from remote sensing and inventories, we find that emissions of NH₃ have
37 a more robust association with the spatiotemporal variation of PM_{2.5} levels than
38 emissions of SO₂ and NO_x. As a consequence, we argue that urban PM_{2.5} pollution in
39 China in many locations is substantially affected by NH₃ emissions. We highlight that

40 more efforts should be directed to the reduction of NH_3 emissions that help mitigate
41 $\text{PM}_{2.5}$ pollution more efficiently than other $\text{PM}_{2.5}$ precursors. Such efforts will yield
42 substantial co-benefits by improving nitrogen use efficiency in farming systems. As a
43 consequence, such integrated strategies would not only improve urban air quality, but
44 also contribute to China's food-security goals, prevent further biodiversity loss, reduce
45 greenhouse gas emissions and lead to economic savings.

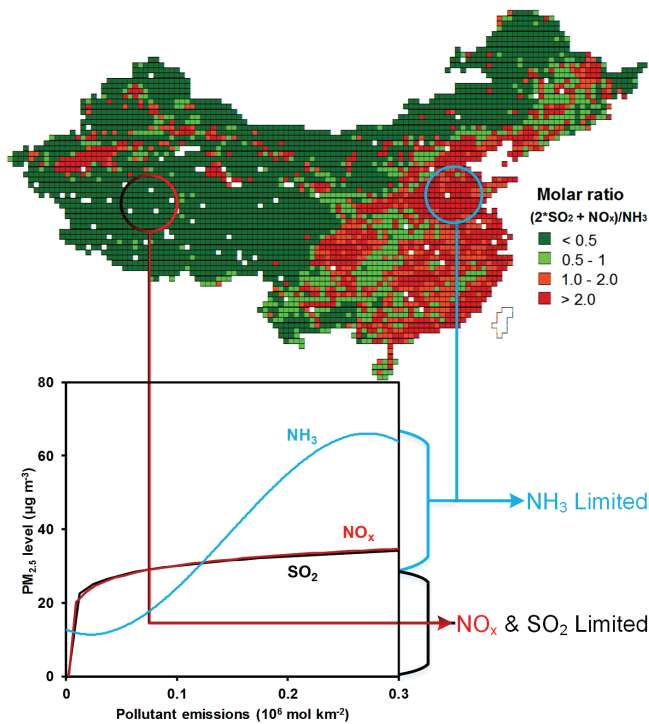
46

47 **A capsule:**

48 $\text{PM}_{2.5}$ pollution in China is substantially affected by NH_3 emissions and more efforts
49 should be directed to reducing NH_3 emissions to mitigate $\text{PM}_{2.5}$ pollution more
50 efficiently.

51

52 **Graphical Abstract**



53

54

55 **Key words:** Ammonia emissions; Air pollution; Haze formation; Nitrogen; Panel model;
56 Food security

57

58 **1.Introduction**

59 China experienced extremely severe and persistent haze episodes in recent years
60 (Huang et al., 2014). The average annual $\text{PM}_{2.5}$ concentrations in 190 major cities do
61 not meet the clean air standard for fine particulate matter recommended by the World
62 Health Organisation (WHO, $10 \mu\text{g m}^{-3}$), and the population-weighted mean of $\text{PM}_{2.5}$
63 concentrations in Chinese cities was $61 \mu\text{g m}^{-3}$, approximately three times higher than

64 global population-weighted mean concentrations in 2014-2015 (Zhang and Cao, 2015).
65 Severe haze in Northern China caused a loss of up to five life years on average, leading
66 to a substantial detrimental effect on public health (Chen et al., 2013). To mitigate PM_{2.5}
67 pollution in China, the central government launched the “Clean Air Act” (CAA) and
68 identified binding reduction targets for emissions of SO₂ and NO_x for each city (MEPC,
69 2016). Nevertheless, a recent study revealed significant increases, rather than decreases,
70 in observed PM_{2.5} concentrations in the years 2013 and 2014 as compared to 2012,
71 when China’s State Council set pollution reduction targets, excluding interannual
72 variations due to meteorological factors (Liang et al., 2015). These findings suggest that
73 emission reductions of SO₂ and NO_x do not present an effective approach to mitigate the
74 PM_{2.5} pollution. Thus, improving the understanding of the underlying processes for haze
75 formation and identifying effective mitigation pathways are still unsolved challenges for
76 China.

77 The most recent studies analysing PM_{2.5} composition suggest that secondary
78 inorganic aerosols (SIA, e.g., ammonium sulfate ((NH₄)₂SO₄) and ammonium nitrate
79 (NH₄NO₃)) play an increasingly dominant role in PM_{2.5} pollution in China, especially
80 during severe haze episodes (Huang et al., 2014; Shen et al., 2014; Tao et al., 2014).
81 Pollutants in both acid (e.g., SO₂ and NO_x) and alkaline (e.g., NH₃) forms are crucial to
82 the nucleation of SIA through acid-base neutralization reactions (Pan et al., 2016).
83 These reactions increase the size and solubility of the particles, and once the bonding
84 particles cross the threshold of diameter size (i.e., the nucleation barrier), aerosol growth
85 becomes spontaneous (Li et al., 2016). As the most important atmospheric alkaline
86 pollutant gas in the atmosphere, NH₃ has a significant contribution to the formation of
87 SIA, exhibiting a base-stabilization and catalytic mechanism (Kirkby et al., 2011; Li et
88 al., 2016).

89 China is the largest source of NH₃ emissions in the world, emitting over 15 Tg
90 NH₃-N yr⁻¹ in 2010, due to its low agricultural nitrogen use efficiency (NUE) in crop
91 and livestock production (Liu et al., 2013; Gu et al., 2015). To understand the effects of
92 NH₃ emission on PM_{2.5} pollution in China, statistical analyses of measurements (Tao et
93 al., 2014), back-trajectory receptor models (Zhang et al., 2013a), response-surface
94 modeling techniques (Wang et al., 2011) and sensitivity simulations with atmospheric
95 chemical transport models (Wang et al., 2014) have been widely applied. These studies
96 usually identified a much smaller contribution of NH₃ emission to the PM_{2.5} pollution
97 compared to that of SO₂ and NO_x emissions. However, these methods generally ignore
98 the nonlinear chemistry of aerosol formation, for instance neglecting the catalytic
99 mechanism of NH₃ (Zhang et al., 2015) and as a consequence do not fully account for
100 the uncertainties due to large variations in the observed PM_{2.5} data (Erisman and Schaap,
101 2004; Liang et al., 2015). The catalytic mechanism of NH₃ may, however, be more
102 important than the role of NH₃ as a substrate contributing to PM_{2.5} formation (Kirkby et

103 al., 2011; Li et al., 2016). Thus, the contribution of NH₃ emission to PM_{2.5} pollution in
104 China may have been underestimated in previous studies.

105 The aim of this study is to re-evaluate the contribution of NH₃ ambient PM_{2.5} levels.
106 We tested the catalytic mechanism of NH₃ on PM_{2.5} formation through econometric
107 analyses across China by applying a panel model and quantile regression (see “Methods”
108 section for details). The panel model quantifies the contribution of NH₃ emission to
109 PM_{2.5} pollution and generates unbiased estimates of the level of this contribution by
110 eliminating confounding variables using the group deviation method (Wilke, 2011;
111 Zhang et al., 2016). We collated monthly panel data of *in situ* PM_{2.5} concentrations in 74
112 major cities in China from January 18 to December 31, 2013 (Fig. 1). Monthly data of
113 pollutant emissions (SO₂, NO_x and NH₃) and meteorological factors (wind, rain,
114 temperature, etc.) were also compiled for these cities. In addition, we obtained annual
115 pollutant emissions, climatic factors and PM_{2.5} concentration data from multiple global
116 databases to crosscheck the results based on local monitoring. To account for the fact
117 that PM_{2.5} and its precursors can be transported from source to receptor regions over
118 long distances, the panel model also takes wind speeds and directions into consideration.
119 The model also includes other natural factors, such as air temperature to assess their
120 effects.

121

122 **2.Methods**

123 **2.1.Data sources.**

124 Monthly PM_{2.5} concentrations for each city were retrieved from the data center of
125 the Ministry of Environmental Protection of China (MEPC, 2016). For the year 2013,
126 data were available only from 18 January, when the Ministry of Environmental
127 Protection of China began to report PM_{2.5} concentration data regularly for major cities
128 across China. The meteorological parameters, including air temperature, wind speed and
129 direction, and precipitation, in each city were obtained from the meteorological station
130 nearest to the monitoring site, or city centre (CMDS, 2016). If more than one
131 meteorological station shared a similar shortest distance to the city, the average value
132 from these meteorological stations was used.

133 Industrial sources accounted for 90 and 67% of the total SO₂ and NO_x emissions,
134 respectively, in China (MEPC, 2016); thus, industrial output indicators were used to
135 temporally distribute annual emission data over 12 months. This calculation was done
136 applying the following equation:

$$137 \quad POL_{i,a,m} = POL_{i,a} \times \frac{output_{i,m}}{\sum_{m=1}^{12} output_{i,m}} \quad (1)$$

138 where $POL_{i,a,m}$ is the daily emission of a pollutant of type a in month m in city i ,
139 and $POL_{i,a}$ is the annual emission of a pollutant of type a in city i ; $output_{i,m}$ is the
140 output value of industry in month m in city i .

141 The total monthly SO₂ and NO_x emissions in each city were significantly linearly
142 correlated, indicating that these two pollutants share similar emission sources, in most
143 cases large-scale fossil fuel combustion in power plants, industry and road transport
144 (Zhang et al., 2016). Therefore, we can only select one pollutant (SO₂ **or** NO_x) or a
145 combined pollutant (SO₂ **and** NO_x with a constant ratio) for our panel data model to
146 avoid multicollinearity. To reflect the molar weight capacity to neutralize NH₃, we used
147 two moles of SO₂ and one mole of NO_x as a combined pollutant for the analyses
148 conducted in this study.

149 Annual grided concentration data (2001-2008) for PM_{2.5} was retrieved from earth
150 observation products provided by the National Aeronautics and Space Administration
151 (NASA) with a resolution at 0.5×0.5° by blending total-column aerosol amount
152 measurements from two NASA satellite instruments with information about the vertical
153 distribution of aerosols (van Donkelaar et al., 2010; de Sherbinin et al., 2014). Matching
154 emission data, including NH₃, NO_x, SO₂, and NMVOC were retrieved from the
155 Emission Database for Global Atmospheric Research (EDGAR, 2016). Finally, the
156 meteorological parameters are compiled from an updated grided climate dataset
157 (referred to as CRU TS3.10) based on monthly observations at meteorological stations
158 across the world's land areas (Harris et al., 2013).

159

160 **2.2. Panel data model.**

161 Considering the multiple interactions, we designed a panel model to quantify the
162 contributions of meteorological and anthropogenic factors to haze episodes. The panel
163 model is set up for a comprehensive analysis of PM_{2.5} formation derived from pollutant
164 emission and meteorological factors (Zhang et al., 2016). More details of this model and
165 its application to analyse contributions of different components to PM_{2.5} formation can
166 be found in Zhang et al (Zhang et al., 2016). The panel model incorporates data on both
167 temporal and spatial scales simultaneously (12 months for 74 cities in this study, i.e. 884
168 samples in total), an approach also known as ‘time-series cross-sectional data’. For
169 example, the eastern region of the Yangtse Delta Region (YDR) illustrates how
170 pollutant diffusion leads to a lesser impact on air pollution in Shanghai compared to
171 other cities in the west. Thus, a simple application of cross-sectional data may
172 underestimate the effect of pollutant emissions because emissions in Shanghai are
173 actually much higher, while its air pollution is much lower than comparable other
174 regions. Nevertheless, although the time-series data analysis in Shanghai can offset this
175 underestimation, the data samples are substantially reduced if only Shanghai was to be
176 included. Here, the panel model is capable of solving unobservable time-invariant
177 regional differences and omitted variable problems. Moreover, PM_{2.5} accumulation over
178 previous days also affects the attribution analysis; thus, including lagged PM_{2.5} pollutant
179 concentrations as an explanatory variable is also essential. The panel model can well

180 capture this effect given its ability to assess both temporal and spatial variability of
 181 input data (Zhang et al., 2016). The panel model was constructed as follows in this
 182 study:

$$183 \quad Y_{it} = c + Pl_{it}\beta_1 + WIND_{it}\beta_2 + \sum_j Ctrl_{itj}\beta_j + \mu_i + \varepsilon_{it} \quad (2)$$

184 where Y_{it} is the daily $PM_{2.5}$ concentration in month t in city i ; Pl_{it} is the monthly
 185 pollutant (SO_2 , NO_x and NH_3) emission; $WIND_{it}$ is the monthly average wind
 186 speed; $Ctrl_{itj}$ is a group of control variables, including air temperature, precipitation,
 187 etc., which are difficult to regulate to mitigate $PM_{2.5}$ pollution, although they are
 188 contributing factors; $\beta_1, \beta_2 \dots \beta_j$ are the coefficients of the independent variables; c is
 189 the intercept; the effect of pollutant emission on $PM_{2.5}$ pollution is calculated as
 190 $\partial Y / \partial pl = \beta_1$; μ_i is the unobservable individual effect in city i such as the time
 191 invariant geographical situation; and ε_{it} is random error term. Contemporaneous
 192 correlation, heteroskedasticity and serial correlation are controlled to calculate
 193 asymptotically efficient parameters with Prais-Winsten regression in the statistical
 194 software package STATA12 (<http://www.stata.com/stata12/>) .

195

196 **2.3. Quantile regression model.**

197 Quantile regression, introduced by Koenker & Bassett (Koenker and Bassett, 1978),
 198 is a method for estimating functional relationships between variables for all portions of
 199 a probability distribution. Instead of estimating a regression model with average effects
 200 using the Ordinary Least Squares linear model, the quantile regression produces
 201 different effects along the distribution (quantiles) of the dependent variable. To obtain
 202 an estimation of a quantile regression model, we minimize the following sum of
 203 absolute residuals by linear programming methods.

$$204 \quad \min_{\beta \in \mathcal{H}} \sum \rho_{\tau}(Y_{it} - \xi(X_i, \beta)) \quad (3)$$

205 where Y_{it} is the average daily $PM_{2.5}$ concentration in month t in city i as above, X_i is a
 206 vector of explanatory variables, $\rho_{\tau}(\cdot)$ is a tilted absolute value function that yields the
 207 τ th sample quantile as its solution, $\xi(X_i, \beta)$ is a parametric function with β as a
 208 vector of parameters. Quantile regression is more robust to non-normal errors and
 209 outliers than conventional least squares regression methods, and provides a more
 210 complete characterization of the data.

211

212 **3. Results and Discussion**

213 **3.1. The role of NH_3 emission in $PM_{2.5}$ pollution**

214 *3.1.1. NH_3 limitation in forming SIA.*

215 The negative coefficients of meteorological factors (i.e. wind speed, precipitation,

216 and air temperature) suggest a reduction of PM_{2.5} concentrations with increases of these
217 factors. In contrast, the positive coefficients of pollutant emissions on PM_{2.5}
218 concentration levels suggest the opposite (Table 1). This is consistent with existing
219 understanding of atmospheric processes, where stronger wind dilutes pollutant
220 concentrations, rainfall washes out pollutants through wet deposition, and higher
221 temperatures accelerates the decomposition of PM_{2.5} (in particular through evaporation
222 of ammonium nitrates), as well as eliminates the inversion layer that prevents dilution
223 (Li et al., 2014; Tian et al., 2014). These findings indicate that the panel model is well
224 able to capture and distinguish the effects from pollutant emissions and meteorological
225 factors on PM_{2.5} concentrations. To focus on the effect of pollutant emissions on PM_{2.5}
226 formation, we thus set all climatic variables as control factors and focused our
227 discussion on the effects of pollutant emissions in the following analysis.

228 Here, we find that NH₃ emissions significantly affect the monthly average (mean of
229 daily concentration) PM_{2.5} concentrations across China's major cities, while at the same
230 time the influence of SO₂ or NO_x is not significant (Table 1). Increasing NH₃ emission
231 by 1 t km⁻² would result in an increase of 33 μg m⁻³ of monthly average PM_{2.5}
232 concentrations, *ceteris paribus* (Table 1). In China, despite its large NH₃ emissions, the
233 molar amount is still smaller than that of 2SO₂ + NO_x emissions, both calculated from
234 our own budget studies (Gu et al., 2014, 2015) as well as resulting from analyses of
235 global database values (i.e. EDGAR, 2016). SO₂ or NO_x emissions that do not
236 contribute to the formation of SIA, lead to more local acidification or nutrient
237 deposition, as is evident in the widespread occurrence of acid rain across China (MEPC,
238 2016). Our findings suggest that NH₃ is the critical pollutant determining the acid-base
239 reactions related to the nucleation of PM_{2.5}. They further illustrate that PM_{2.5} pollution
240 in China is indeed limited by the availability of atmospheric NH₃. Similar findings have
241 been reported in other regions, such as in Europe where regulation of NH₃ emissions
242 has been addressed in recent years (Erisman and Schaap, 2004; Vieno et al., 2015;
243 Backes et al., 2016). Increases in NH₃ emissions not only lead to increases in PM_{2.5}
244 concentrations due to its own mass (Ye et al., 2011; Huang et al., 2014), but also benefit
245 the nucleation with SO₂ and NO_x emissions and facilitate the combination with other
246 pollutants to form larger particles (Kirkby et al., 2011; Li et al., 2016).

247 3.1.2. Seasonal influence.

248 To compare the effects of NH₃, SO₂ and NO_x on the PM_{2.5} levels, we separated the
249 12 months into two seasons: the *Major fertilization* (April to October) and *Occasional*
250 *fertilization* (November to March) seasons. NH₃ emissions vary substantially between
251 these two seasons (Huang et al., 2012), whereas SO₂ and NO_x emission are relatively
252 stable during different months (MEPC, 2016). NH₃ emissions in the *Major fertilization*
253 season are approximately 50% higher, while SO₂ and NO_x are only 5% higher compared
254 to corresponding values in the *Occasional fertilization* season. We ordered all PM_{2.5}

255 concentrations in each season, then analyzed how the pollutant emissions contribute to
256 the differences between the first (top 50% in the order) and second half (bottom 50% in
257 the order) of PM_{2.5} concentrations. By removing the effects from meteorological factors,
258 we found that effects of NH₃ emissions on the changes of monthly average PM_{2.5}
259 concentrations between the first and second half were 5.5 and 1.5 times that of SO₂ and
260 NO_x in the *Major fertilization* and *Occasional fertilization* seasons, respectively. In
261 other words, NH₃ emissions have a much greater impact on the PM_{2.5} pollution
262 compared to SO₂ and NO_x in summer time and even in wintertime, when the impact of
263 NH₃ is reduced. In winter, NH₃ emissions from cropland are much lower, because of no
264 fertilization is taking place and the temperature is lower (Huang et al., 2012). Therefore,
265 PM_{2.5} pollution in winter is even more NH₃-limited when removing the effects from
266 confounding factors such as temperature and wind. These findings are consistent with
267 the results from the panel analysis discussed above and from molecular experiments
268 reported in literature (Kirkby et al., 2011; Li et al., 2016).

269 3.1.3. Urban areas.

270 Owing to the limited transport distances of air pollutants, the distributions of acid-
271 and alkaline-form pollutant emissions are also crucial to the PM_{2.5} formation (Hu et al.,
272 2014). Closer proximity of emission sources of different acid- and alkaline-forms
273 pollutants facilitates the formation of secondary PM_{2.5} (Gu et al., 2014; Stokstad, 2014).
274 Hot spots of NH₃ emission largely overlap with those of SO₂ and NO_x sources in China
275 and are mainly located in Eastern China, such as the North China Plain (NCP) and
276 Yangtze Delta Region (YDR) (Su et al., 2011; Gu et al., 2012; Huang et al., 2012). This
277 allows the pollutants to react more readily and form PM_{2.5}, contributing to a worsening
278 air quality near or within cities in those regions. In the central areas of 74 major Chinese
279 cities, the atmosphere is relatively NH₃-deficient, thus increasing NH₃ emission can
280 rapidly lead to an increase in PM_{2.5} concentrations (Fig. 1). Therefore, episodes of high
281 PM_{2.5} levels usually occur in cities with both a NH₃-deficient atmosphere and the
282 occurrence of high NH₃ emissions in the immediate vicinity (e.g. intensive agricultural
283 areas). The 10 cities with the highest PM_{2.5} levels in 2013-2014 in China are all
284 surrounded by areas with intensive agricultural production (e.g., Shijiazhuang and
285 Zhengzhou), and no megacities without major agricultural production regions nearby
286 are found on this list (MEPC, 2016).

287 Despite measures implemented for SO₂ and NO_x emissions control, air quality in
288 China's major cities continues to deteriorate (Liang et al., 2015). In an NH₃-deficient
289 atmosphere, the reduction of SO₂ and NO_x emissions is less efficient than that of NH₃
290 emission up to the point where the concentration balance shifts in a limitation from
291 NH₃-deficient to SO₂+NO_x-deficient. In China and elsewhere, NH₃ is predominantly
292 emitted from agriculture (Huang et al., 2012; Gu et al., 2015). Therefore, improvement
293 of air quality in major cities will require new policies to encourage farming practices

294 that reduce NH₃ emission from a rapidly growing agricultural sector, especially in
295 suburban areas and farmlands surrounding major urban areas.

296 *3.1.4. Quantile regression.*

297 To further capture the effect of NH₃ emissions on haze episodes in addition to their
298 conditional means, we introduced quantile regression for four quantiles (25, 50, 75, and
299 90% the PM_{2.5} levels) and found that NH₃, rather than SO₂ or NO_x, dominates the
300 occurrences of PM_{2.5} pollution episodes. On the one hand, the coefficients of NH₃
301 emissions increase in the upper quantile for both the monthly average and maximum
302 PM_{2.5} concentrations (Fig. 2), implying that NH₃ emission is significantly related to the
303 occurrence of PM_{2.5} pollution and its effect is nonlinear with a higher contribution under
304 more severe PM_{2.5} pollution. On the other hand, the coefficients of 2SO₂+NO_x
305 decreased in the upper quantiles and the 90% quantile coefficient of SO₂ and NO_x is no
306 longer significant for the monthly average PM_{2.5} concentrations. For the monthly
307 maximum PM_{2.5} concentrations, the quantile coefficients of 2SO₂+NO_x are either not
308 significant or negative. Such facts further suggest that 2SO₂+NO_x emission is not
309 significantly correlated to the occurrence of severe PM_{2.5} pollution in China, thus again
310 supporting the fact that NH₃ substantially affected PM_{2.5} pollution in China.

311

312 **3.2. Periodic cycle of haze episodes**

313 Haze episodes exhibit typical periodic cycles (Guo et al., 2014). PM_{2.5} can
314 accumulate in the atmosphere and last for several days before being dispersed or
315 deposited to the ground by dry or wet removal processes, resulting in typical haze
316 episodes (Guo et al., 2014). The daily average PM_{2.5} concentrations are low (usually
317 below 30 µg m⁻³) in the beginning of each cycle, but can reach more than 150 µg m⁻³
318 (maximum PM_{2.5} level in each cycle, turning point) within a few days, after which the
319 levels tend to decrease again. By counting the polluted days during clean-dirty-clean
320 cycles, we found an average duration of 6-10 days in each periodic cycle of haze
321 episodes across the 74 cities.

322 Although NH₃ emissions seem to have a dominant effect on the PM_{2.5} formation
323 compared to the influence of SO₂ and NO_x, high concentrations of both of these
324 pollutants can lengthen the duration of each haze episode (Table 1). PM_{2.5} compounds
325 (e.g., ammonium sulfate) that combine different monomer pollutants such as SO₂ and
326 NH₃ can stay longer in the atmosphere compared to the monomer pollutants. Therefore,
327 the critical pollutants that determine acid-base reactions are key to the accumulation of
328 PM_{2.5} in the atmosphere. Owing to the NH₃-deficient atmosphere (relative to SO₂ and
329 NO_x) in cities in China, the maximum PM_{2.5} level in each cycle is significantly limited
330 by NH₃ emission, but not the emission of SO₂ or NO_x (Table 1). Increasing NH₃
331 emission by 1 ton km⁻² would result in an increase of 61 µg m⁻³ for the maximum PM_{2.5}
332 level during each periodic cycle.

333

334 **3.3. Crosschecking the role of NH₃ by alternative data sources**

335 To crosscheck the role of NH₃ emission on PM_{2.5} formation, we applied annual
336 gridded emission data (NASA, EDGAR, CRU TS3.10) in a two-period panel model. On
337 an annual scale, all pollutant emissions (NH₃, SO₂ and NO_x) significantly affect PM_{2.5}
338 levels (Table 2). The majority of the emission intensities of SO₂ and NO_x are in the
339 range of 0-1×10⁶ mol km⁻² across China, substantially larger than that for NH₃
340 emissions, which normally range from 0 to 0.3×10⁶ mol km⁻² (Fig. 3). This illustrates as
341 well that the emission intensities of NH₃ are spatially more evenly distributed than is the
342 case for SO₂ and NO_x across China. A small amount of SO₂ and NO_x emissions can thus
343 lead to an increase in PM_{2.5} levels rapidly when the emission intensity is lower than
344 0.1×10⁶ mol km⁻² (Fig. 3a and b). However, we did not see further enhancement of
345 PM_{2.5} levels when higher emission intensities of SO₂ or NO_x occurred, especially above
346 0.2×10⁶ mol km⁻². On the contrary, we found a rapid increase of PM_{2.5} levels with the
347 increase of NH₃ emission in the majority of grid cells analysed. This reveals that PM_{2.5}
348 formation is limited by the availability of NH₃ emissions, especially especially when the
349 SO₂ or NO_x emission intensity is high.

350 On this spatial scale, the higher PM_{2.5} levels are also consistent with the regions
351 with a molar ratio of (2SO₂+NO_x)/NH₃ greater than one (Fig. 4, Fig. 5). About 10% of
352 gridcells do not have sufficient SO₂ and NO_x to neutralize NH₃ emissions mainly
353 located in the rural regions including forests and grasslands in western China (Fig. 4).
354 Therefore, we found a saturation level where NH₃ emissions do not lead to further
355 increases of PM_{2.5} levels (Fig. 3c). A few grid cells with very high NH₃ emission rates
356 (>0.1×10⁶ mol km⁻²) would also not further increase the PM_{2.5} concentrations, due to
357 SO₂ and NO_x limitation (Fig. 4).

358 In fact, except in regions with intensive agriculture (including both croplands and
359 livestock farming) but little industry or urbanization, NH₃ is usually deficient compared
360 to the emission of acid pollutants (SO₂ and NO_x), in line with findings on the role of
361 photochemical reactions and precursor emissions in other regions worldwide. The small
362 mass ratios (usually rank 5-15%) of NH₃ in PM_{2.5} source apportionments suggest an
363 NH₃-deficient atmosphere at global scale (Jimenez et al., 2009; Huang et al., 2014).
364 That means the limitation of NH₃ in severe haze formation is not only found in China,
365 but also likely a widespread phenomenon worldwide. To assess the relevance of this
366 potential phenomenon, we estimate the correlation between annual emission data of
367 NH₃, SO₂, NO_x, non-methane volatile organic compounds (NMVOC) (four pollutants
368 that are key for the formation of secondary PM_{2.5} pollution, Huang et al., 2014) and
369 PM_{2.5} concentration data in each grid (0.5×0.5°) on terrestrial land areas worldwide. We
370 used over 200 million data points in this analysis. Although we acknowledge that global
371 inventories may be subject to large uncertainties, they are in most cases well constrained

372 and support analyses of large-scale pollution effects at a coarse resolution (Wang et al.,
373 2011; Zhang et al., 2015). Correlation analysis showed that the coefficient of NH₃
374 emission to PM_{2.5} concentrations is by far the greatest, at least twice that of the other
375 three pollutants (Table 3). Although these statistical correlations do not identify causal
376 relationships, they give a robust indication in relation to the effect of NH₃ emissions on
377 PM_{2.5} formation. Therefore, more focus should be directed to NH₃ mitigation not only
378 in China, but also in other world regions with excess nitrogen inputs and resulting NH₃
379 emissions.

380

381 **3.4. Policy implications**

382 This paper highlights the crucial role of NH₃ in the formation of PM_{2.5} pollution in
383 China, which suggested that the future reduction of NH₃ emission should be made a
384 priority in the Clean Air Act. Considering the substantial contribution of agricultural
385 activities to China's NH₃ emission (Gu et al., 2015), new measures to reduce the NH₃
386 emission from cropland and livestock are essential, such as illustrated by the "4R" (right
387 type, right amount, right time and right place) and better manure management in
388 feedlots to treat and use it as fertilizer should be developed and applied to Chinese
389 agriculture (Ju et al., 2009; Bai et al., 2014). Meanwhile, the non-agricultural NH₃
390 emissions from such as fossil fuel combustion is also playing an increasingly important
391 role in PM_{2.5} pollution in urban area, especially where lacks agricultural activities in the
392 surrounding areas (Chang, 2014). Although the total amount of NH₃ emission from
393 non-agricultural source is small (Huang et al., 2012), the concentrated dose of these
394 NH₃ emissions and close to the SO₂ and NO_x emission sources still can result in severe
395 air pollution in urban area (Wang et al., 2015). However, there needs to be more
396 realization among the public and policy makers that NH₃ emissions present a serious
397 environmental issue. For instance, the practices developed by the Task Force on
398 Reactive Nitrogen to reduce NH₃ emission in European Union are good example for
399 China to adapt (Backes et al., 2016). This study shows the relevance of NH₃ in the
400 formation of secondary PM, both also its role contributing to other effects including
401 eutrophication, acidification, as well as a contribution to climate change and
402 biodiversity loss (Erisman et al., 2013).

403 In order to allow for new technologies to be introduced, some socioeconomic
404 barriers need to be addressed (Gu et al., 2016), such as the fragmentation of Chinese
405 croplands under the household contract responsibility system (Zhang et al., 2013b).
406 However, increasing the scale and structure of agricultural operations needs follow
407 systematic, integrated approach combining several measures, including capital
408 investment, institutional design, educating farmers, etc. Thus, it is difficult to implement
409 a new production system based on large scale farming in a short term. Mixed farming
410 systems including both small and large farming operations with innovative technologies
411 designed for application at appropriate scales may be more feasible and effective in
412 China in the near future. Meanwhile, a healthier diet with less animal protein intake

413 would also reduce NH₃ emissions (Ma et al., 2013). By implementing policies to
414 support new technologies and regulations, NH₃ emissions could be reduced by
415 approximately 50% (Gu et al., 2015), significantly mitigating PM_{2.5} pollution and at the
416 same time benefiting food security and environmental protection objectives in China.

417

418 **4. Conclusions**

419 In this study, we found that emissions of NH₃ have a stronger association with the
420 spatiotemporal variation of PM_{2.5} levels than emissions of SO₂ and NO_x. The results
421 derived from *in situ* monitoring data observed in major cities agreed well with the
422 results of gridded emission data. PM_{2.5} concentrations were much more strongly
423 affected by NH₃ emissions during severe haze episodes. Our findings suggest that NH₃
424 emissions, instead of the SO₂ and NO_x emissions from fossil fuel combustion as
425 previously believed, are the key limiting factor for secondary inorganic PM_{2.5} formation
426 in urban regions of China. Therefore, we highlight the importance of reducing NH₃
427 emissions through improved nitrogen management from agricultural activities in
428 mitigating PM_{2.5} pollution in urban areas.

429

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589
590

591 **Table 1.** Estimated coefficients in a panel model with monthly data

	Average PM _{2.5} (µg m ⁻³)	Maximum PM _{2.5} (µg m ⁻³)	Duration of a haze episode (day)
2SO ₂ +NO _x (10 ⁶ mol km ⁻²)	388.1 (265.8)	700.1 (622.1)	73.72*** (27.62)
NH ₃ (10 ⁶ mol km ⁻²)	560.9*** (147.3)	1036.4*** (387.8)	110.8*** (14.96)
Precipitation (mm)	-1.501*** (0.204)	-2.621*** (0.732)	-0.108** (0.0465)
Wind speed (m s ⁻¹)	-25.00*** (2.736)	-41.24*** (6.320)	-0.952*** (0.227)
MMT (°C)	-2.531*** (0.130)	-3.115*** (0.482)	-0.0189 (0.0118)
<i>N</i>	884	547	547
within <i>R</i> ²	0.645	0.384	0.094
F stat	142.56	33.48	14.40
Hausman test	13.69	29.39	63.34

592 Note that the coefficient represents how much the PM_{2.5} concentrations or duration of a
593 haze episode change when increasing one unit of influencing factors in the panel model.
594 Data in brackets represent the standard errors. Average PM_{2.5} refers to the mean of
595 PM_{2.5} concentration in a month in each city. Maximum PM_{2.5} refers to the mean of the
596 maximum PM_{2.5} concentration in each periodic cycle of haze episode. Periodic cycles of
597 haze episode refers to the times of haze episode occurred in a month. SO₂ & NO_x refers
598 to the emission intensity of SO₂ and NO_x in a city. MMT refers to mean monthly
599 temperature. Fixed effect panel model is applied in this analysis owing to the large
600 value of Chi2 in Huasman test. Standard errors in parentheses. * *p* < 0.10, ** *p* < 0.05,
601 *** *p* < 0.01.

602

603

604 **Table 2** Estimated coefficients in a two-period panel model with annual data

	Coefficient	Standard error	t	P>t
NH ₃ (10 ⁶ mol km ⁻²)	77.439	4.781	16.200	0.000
SO ₂ (10 ⁶ mol km ⁻²)	2.310	0.663	3.480	0.001
NO _x (10 ⁶ mol km ⁻²)	1.949	0.988	1.970	0.049
Wind speed (m s ⁻¹)	3.300	0.253	13.030	0.000
Precipitation (mm)	-0.004	0.000	-8.130	0.000
MAT (°C)	-0.057	0.079	-0.730	0.468
<i>N</i>	7492			
Within <i>R</i> ²	0.2109			
F stat	117.83			
Hausman test	868.30			

605 Note, mean value of first and last three years of data available are selected as two
 606 periods, i.e., mean value of pollutant emissions and climatic factors on PM_{2.5} from 2001
 607 to 2003 and 2006 to 2008 for the whole China are used. MAT refers to mean annual
 608 temperature. Fixed effect panel model is applied in this analysis owing to the large
 609 value of Chi2 in Huasman test. Standard errors in parentheses. * *p* < 0.10, ** *p* < 0.05,
 610 *** *p* < 0.01.

611

612

613 **Table 3** Coefficients of correlation among PM_{2.5}, SO₂, NO_x, NMVOC and NH₃ on the
 614 global scale with 0.5×0.5° grid data

	PM _{2.5}	SO ₂	NO _x	NMVOC	NH ₃
PM _{2.5}	1				
SO ₂	0.4342	1			
NO _x	0.4497	0.6499	1		
NMVOC	0.4607	0.6416	0.9796	1	
NH ₃	0.6475	0.4990	0.5679	0.5699	1

615
 616
 617

618 **Figure legend**

619

620 **Figure 1** Locations of these 74 cities and their average and maximum PM_{2.5} level in
621 2013. The background color refers to the NH₃ emission intensity on the provincial scale.

622

623 **Figure 2** Coefficients of quantile regressions of emissions of NH₃ and SO₂&NO_x to the
624 PM_{2.5} level under different quantile. (a) Average monthly PM_{2.5} concentration; (b)
625 Average of the maximum PM_{2.5} concentration in each period cycle.

626

627 **Figure 3** Correlations of pollutant emissions and PM_{2.5} level by using grid data in 2008
628 across China. (a) SO₂; (b) NO_x; (c) NH₃; (d) 2SO₂+NO_x

629

630 **Figure 4** Molar ratios of emissions of SO₂ and NO_x to NH₃ in 2008. The top one refers
631 to the molar ratio of acid pollutants to NH₃, and > 1 of the ratio represents NH₃
632 limitation to the PM_{2.5} pollution. The bottom one refers to the molar ratio of SO₂ to NH₃,
633 and > 1 of the ratio represents the pollution reach ammonium nitrate equilibrium. One
634 mole of SO₂ can react with two moles of NH₃, thus 2SO₂ is used to indicate the
635 limitation of PM_{2.5} pollution related to different forms of pollutant emission.

636

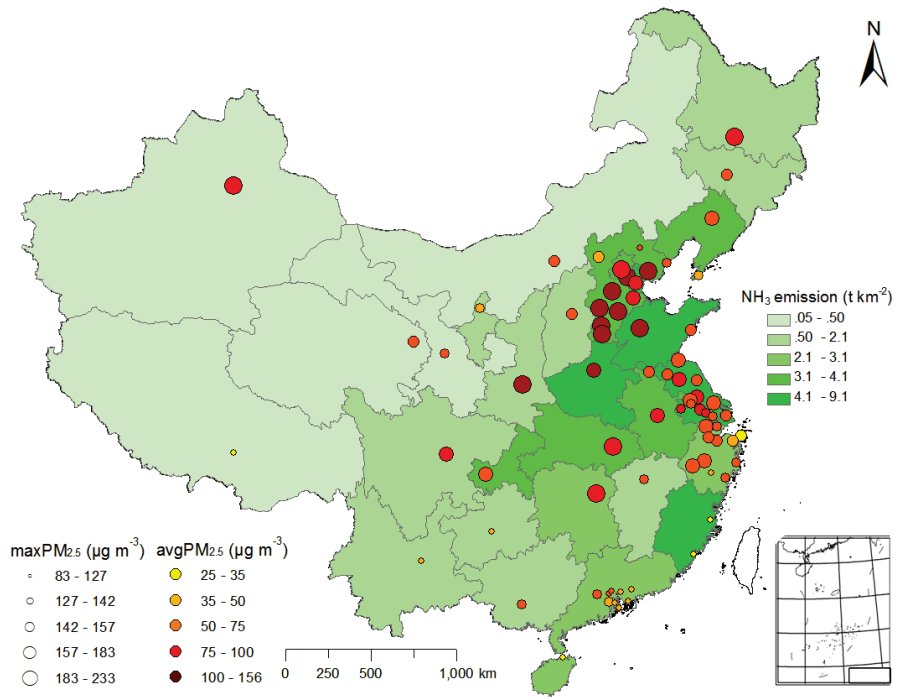
637 **Figure 5** Changes of PM_{2.5} pollution and pollutant emissions from 2001 to 2008. The
638 left and middle four figures used the average data from 2001 to 2003, and 2006 to 2008,
639 respectively, and the right four figures were the difference between the left and middle
640 four figures.

641

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644 **Figure 1**

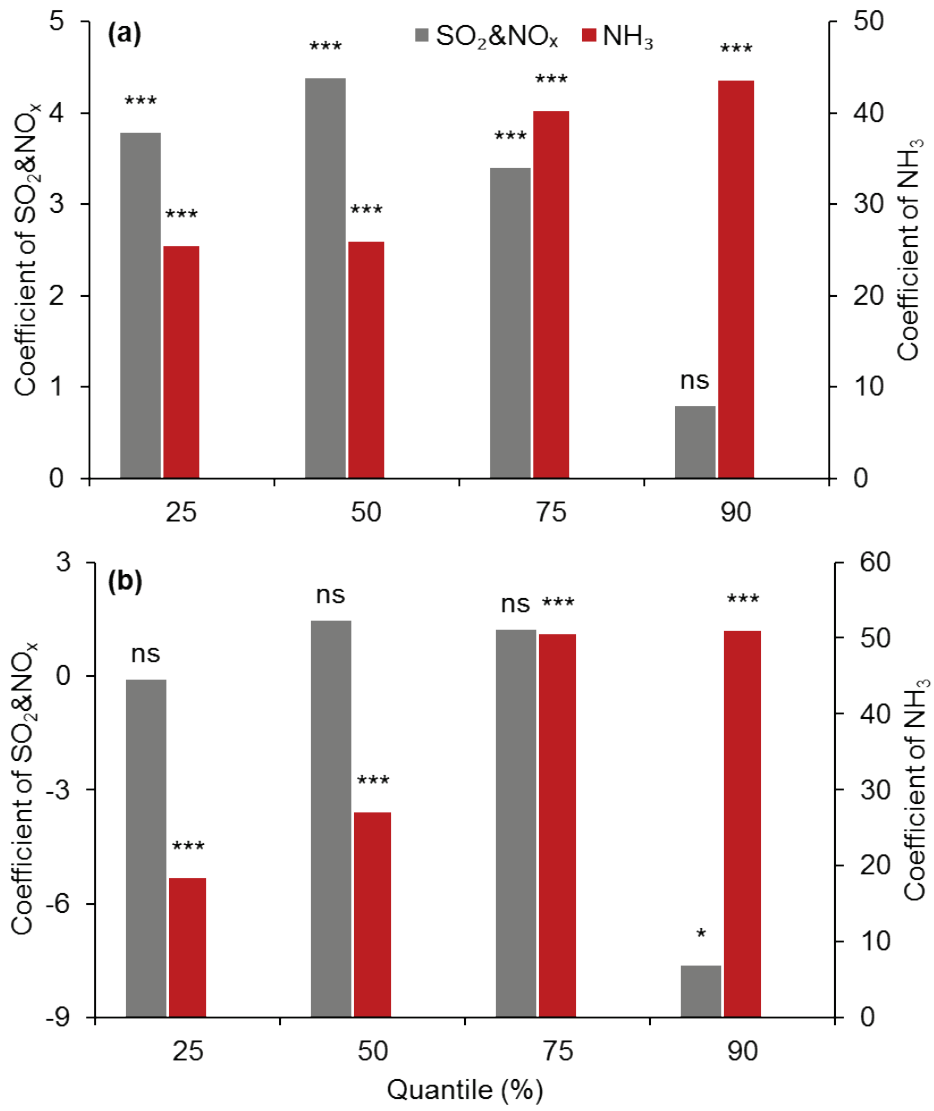


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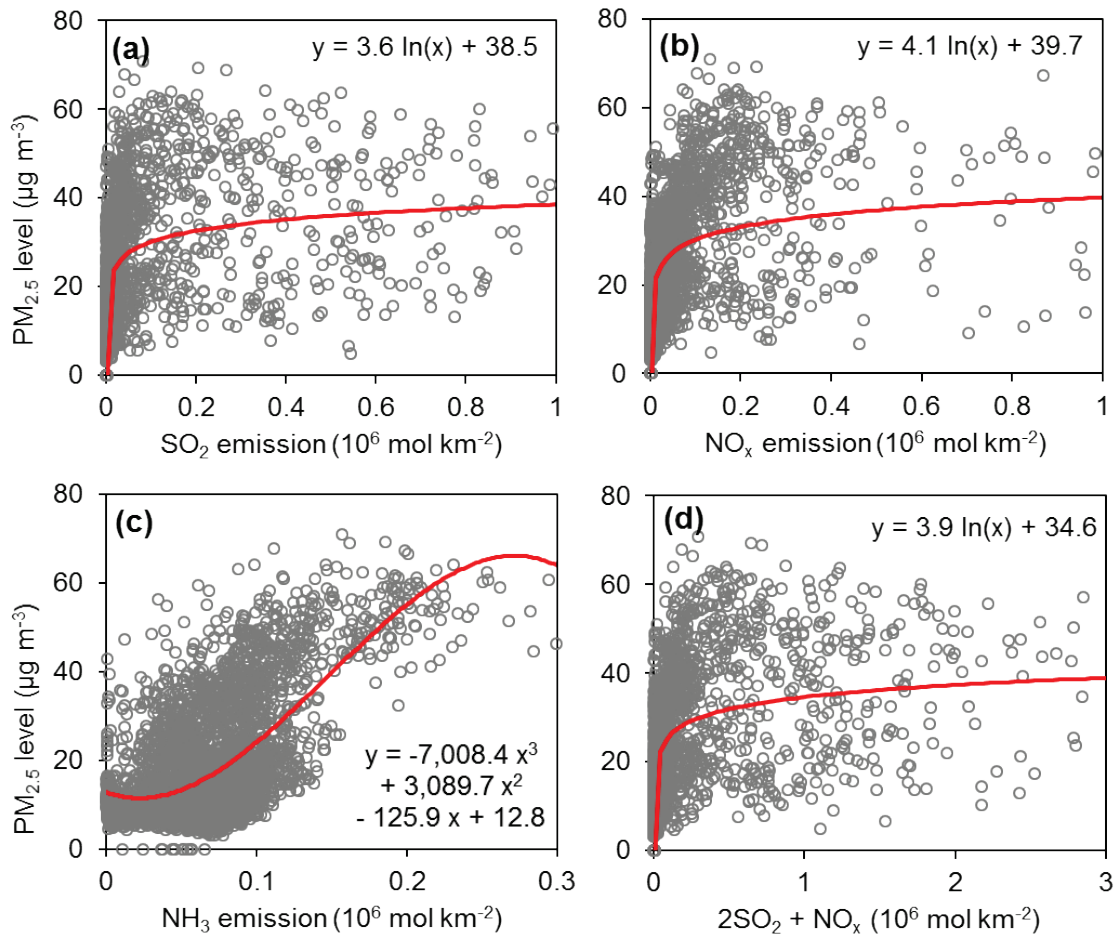
648 **Figure 2**



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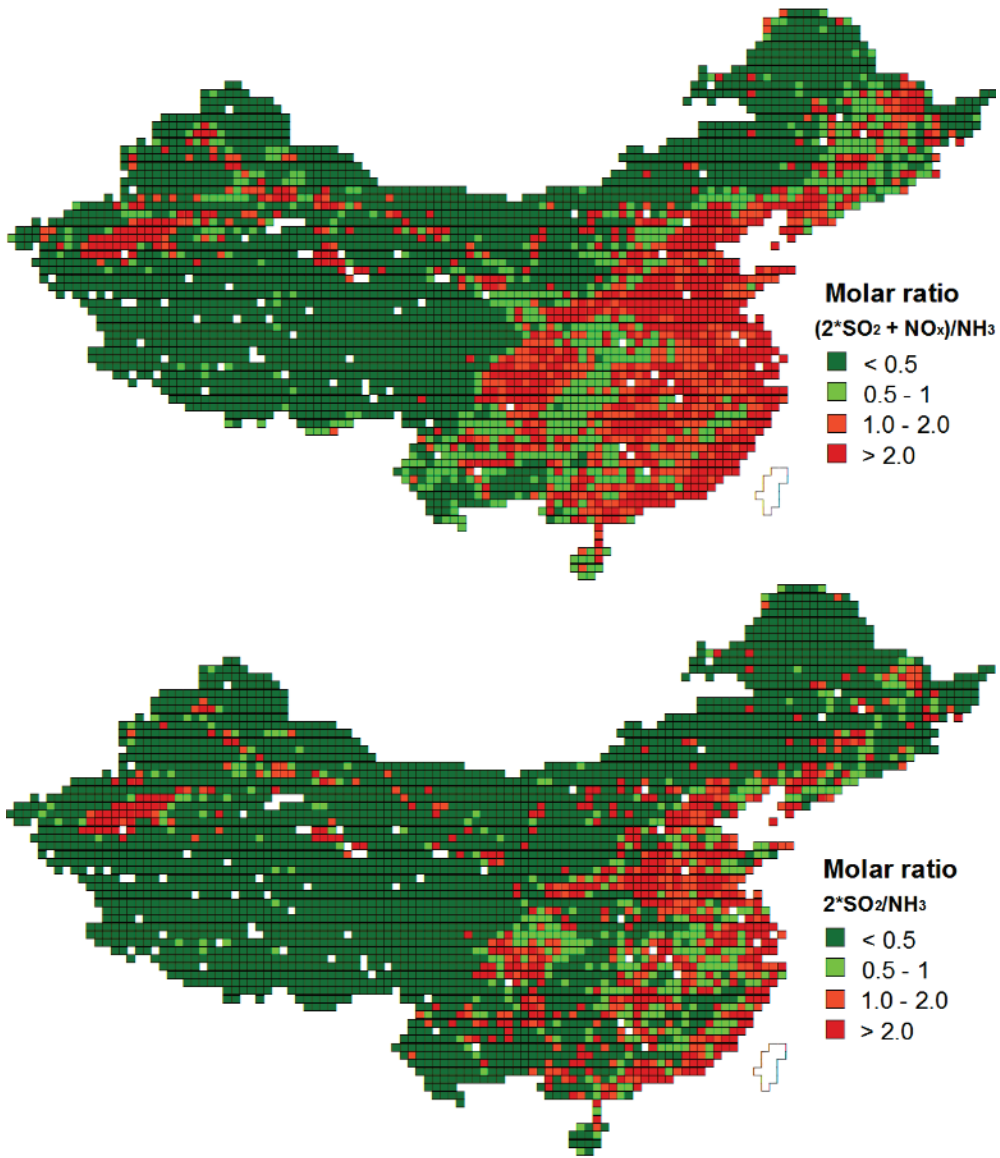
651 **Figure 3**



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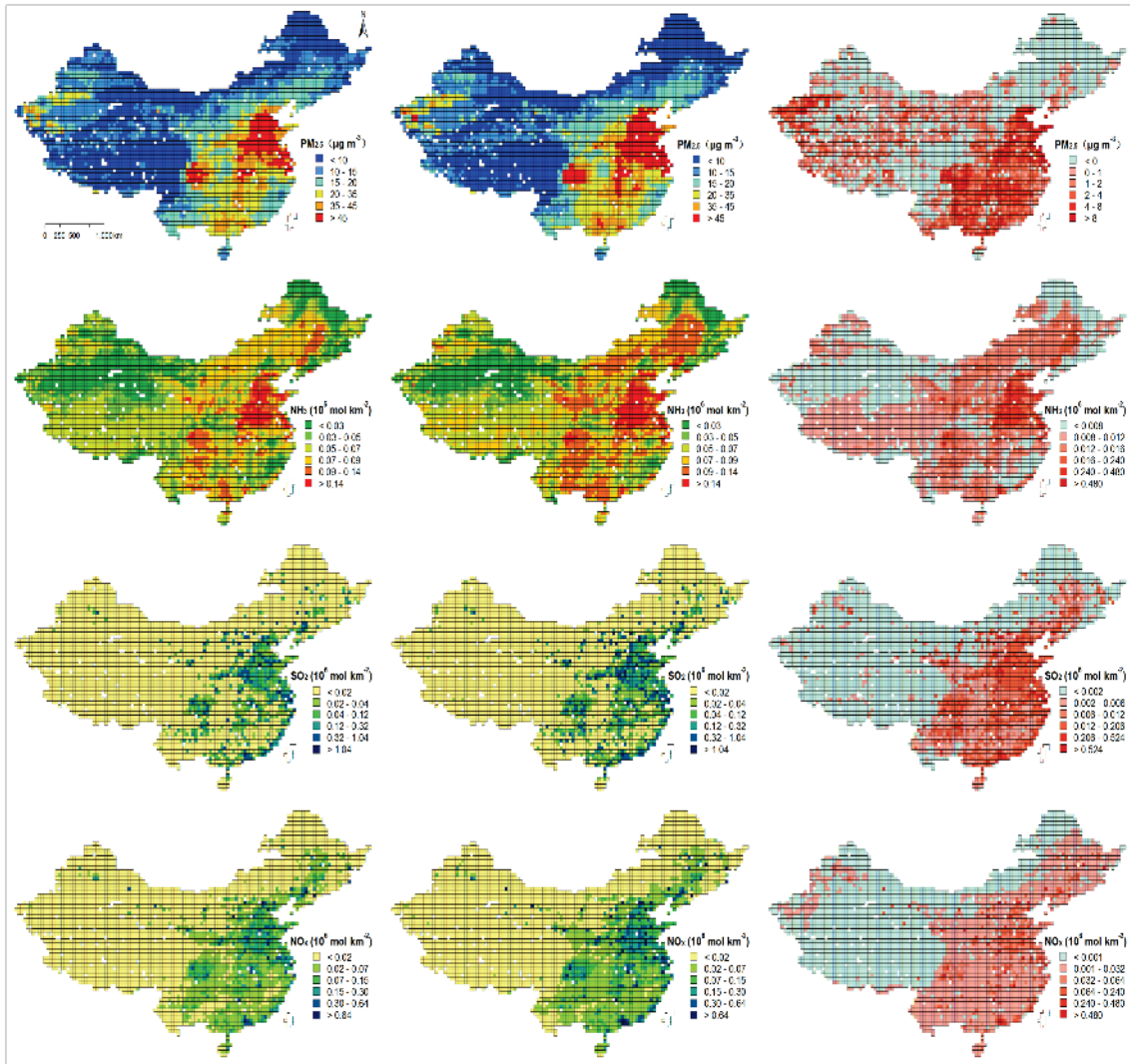
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654 **Figure 4**



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657 **Figure 5**



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