



1 **Elucidating the pollution characteristics of nitrate, sulfate and ammonium in**
2 **PM_{2.5} in Chengdu, southwest China based on long-term observations**

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17 **Abstract**

18 Nitrate, sulfate and ammonium (NSA) are the main secondary inorganic aerosols of
19 PM_{2.5} and play an important role in the process of air pollution. However, few studies
20 have analysed the variation characteristics of NSA in PM_{2.5} and the effects of control
21 measures through long-term observations. In this study, a long-term observational
22 experiment was conducted from January 1, 2015 to December 31, 2017 in Chengdu,
23 southwest China. NSA pollution characteristics, chemical conversion generation,
24 emission reduction control sensitivity analysis and pollutant regional transport
25 characteristics were analysed. The concentrations of sulfate and ammonium in PM_{2.5}
26 have been well reduced, but the effect of reducing nitrate was not obvious. Seasonal
27 and diurnal variations have obvious characteristics, winter still has a high NSA
28 concentration and emission intensity, and the concentration during the day was higher



29 than that at night. Although the workday concentration was slightly higher than the
30 weekend concentration, the difference was nonsignificant. The chemical conversion
31 characteristics of NSA formation were comprehensively analysed, and the aqueous
32 phase oxidation process plays an important role in the conversion of NO_x, SO₂ and NH₃
33 to NSA. The ammonia-rich environment became increasingly obvious in the
34 atmosphere of Chengdu. Under these conditions, the sensitivity of NSA concentration
35 variation was analysed using the ISORROPIA-II thermodynamic model, and the results
36 show that by reducing NO_x and SO₂ emissions, not only can reduce the nitrate and
37 sulfate in PM_{2.5}, but also help reduce the formation of ammonium nitrate and
38 ammonium sulfate to reduce ammonium. The results also show that while carrying out
39 NSA emission reduction, it is also possible to generate potential risks of changes in
40 aerosol pH. Combined with meteorological conditions and a potential source
41 contribution function (PSCF) analysis, local emissions and regional emissions of
42 pollutants are found to have important impacts on Chengdu's atmospheric environment.
43 This research result not only provides an assessment of the current atmospheric
44 emission reduction effect but also provides an important reference for determining
45 methods to further reduce the NSA concentration in atmospheric PM_{2.5}.

46 **Keywords:** Secondary inorganic aerosols; Long-term observations; Pollution
47 characteristics; Chemical conversions; Source analysis; Chengdu

48 **1 Introduction**

49 In recent years, with the rapid development of China's domestic economy and
50 acceleration of the urbanization process, energy consumption and pollutant emissions
51 have also increased, which increases the burden on the atmospheric environment, and
52 severe air pollution has become the focus of social concern (Liu et al., 2013b; An et al.,
53 2019; Fu et al., 2014; Zhao et al., 2017). When air pollution forms, PM_{2.5} (aerodynamic
54 diameter less than 2.5 μm) mass concentrations can reach a higher pollution level,
55 which not only reduces atmospheric visibility but also carries a large number of toxic
56 species into the human lungs, increasing the risks of cardiovascular and cerebrovascular



57 diseases, as well as harming human health (Chang et al., 2018;Tie et al., 2009;Kong et
58 al., 2019;Zhao et al., 2018;Yang et al., 2015b). Nitrate, sulfate, ammonium, organic
59 matter and elemental carbon are the main components of $PM_{2.5}$, among which sulfate,
60 nitrate and ammonium (NSA) are the main secondary inorganic components in $PM_{2.5}$
61 (Ji et al., 2019;Zheng et al., 2016). NSA mainly originates from the secondary aerosols
62 produced by complex chemical reactions of NO_x , SO_2 and NH_3 from coal combustion,
63 vehicle exhaust emissions and agricultural sources (Liu et al., 2013a;Wang et al.,
64 2016;Tian et al., 2017).

65 Because China's current main energy consumption is still fossil fuels, which are widely
66 used in industry, vehicles and residentially, the emission reduction space of NSA is still
67 restricted by a large number of gaseous precursors of NSA (Zhao et al., 2018;Tong et
68 al., 2019). In addition, the chemical conversion of NO_2 , SO_2 and NH_3 to form NSA is
69 still very complex. For example, photochemistry may affect the formation of NSA at
70 high solar radiation, and the homogeneous reaction may dominate the formation of NSA
71 in high relative humidity (Cheng et al., 2016;Sun et al., 2014;Wang et al., 2016;Ohta
72 and Okita, 1990). The formation of sulfate can increase the acidity of aerosols (Sun et
73 al., 2014). In contrast, the presence of NH_3 can play a role in neutralization and maintain
74 the acid-base balance of aerosols (Wang et al., 2016). If improper control measures are
75 taken in pollution reduction control, such as further ammonia emission reduction,
76 acidification of aerosols and environmental problems of acid rain are the likely result
77 (Liu et al., 2019c). In addition to the local emission of pollutants, regional transport is
78 also an important influencing factor. Determination of regional transport sources of
79 pollutants, taking regional joint prevention and control measures, and jointly reducing
80 the emissions of pollutants will enable better air control effects, particularly in the
81 Beijing-Tianjin-Hebei region of northern China (Chen et al., 2019a).

82 The characteristics of higher concentrations proportion of nitrate, sulfate and
83 ammonium in $PM_{2.5}$ were also found in other polluted areas in China, such as Beijing-
84 Tianjin-Hebei, the Yangtze River Delta, the Pearl River Delta, the Fenwei Plain,



85 Chengdu-Chongqing region (An et al., 2019;Li et al., 2017;Liu et al., 2019d). In
86 response to this situation, the Chinese government issued an Air Pollution Prevention
87 and Control Action Plan (2013-207) in 2013 to reduce pollutant emissions and improve
88 air quality (Ministry of Ecology and Environment of the People's Republic of China,
89 2013, last access: 12 February 2020). A large number of treatment measures have been
90 taken in coal combustion, motor vehicle emissions and phase out of outdated industrial
91 capacities, and by 2017, China's ambient air quality control measures have achieved
92 good results (Liu et al., 2019a;Chen et al., 2019b;Cheng et al., 2019;Li et al., 2019b).
93 In Beijing, PM_{2.5}, NO₂ and SO₂ decreased by 35.2%, 17.9% and 69.8%, respectively,
94 in 2017 compared with 2013 (Beijing Municipal Ecology and Environment Bureau,
95 2017, last access: 12 February 2020). In Chengdu, PM_{2.5}, NO₂ and SO₂ decreased by
96 42.3%, 15.9% and 64.5%, respectively, in 2017 compared with 2013 (Chengdu
97 Municipal Ecology and Environment Bureau, 2017, last access: 12 February 2020). To
98 continue to promote air quality improvement, the Chinese government launched the "
99 Three-Year Action Plan for Winning the Blue Sky Defense Battle" in 2018, which puts
100 forward stricter requirements on how to further promote the implementation of
101 emission reduction plans (the Sate Council, 2018, last access: 12 February 2020).
102 Through long-term observations, a comprehensive analysis of PM_{2.5} chemical
103 composition and source characteristics is carried out to verify the current
104 implementation effects of emission reduction, and in-depth analyses of pollution
105 reduction control characteristics is of great significance for the next step in air pollution
106 control. However, observations with high time resolution are very rare, and the time
107 period of these atmospheric observations usually includes several pollution processes
108 or last for weeks or months; thus, it is difficult to analyse the long-term change
109 characteristics of air pollution through comprehensive observational means (Sun et al.,
110 2013;Tie et al., 2017;Guo et al., 2014). Especially in the Sichuan Basin of Southwest
111 China, there are few long-term observational experiments on NSA, which is the main
112 chemical component of PM_{2.5}.

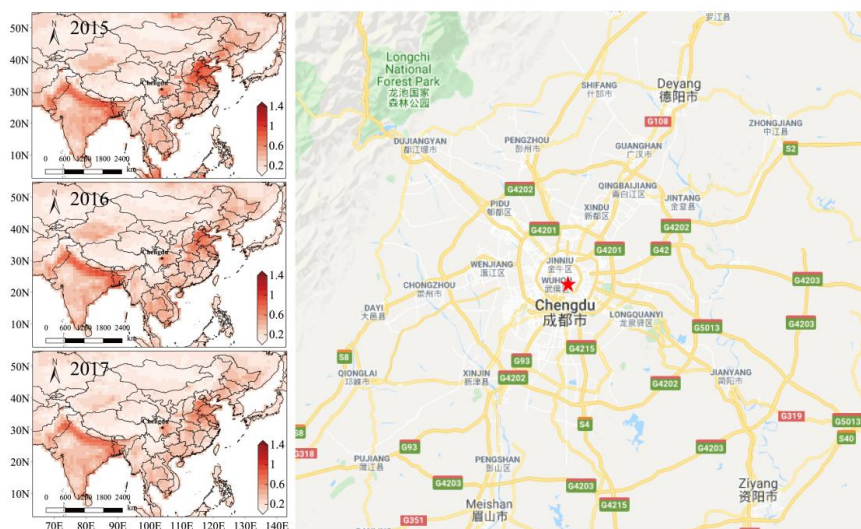


113 The Sichuan Basin is among the most important areas of air pollution in China (Qiao
114 et al., 2019;Gui et al., 2019;Zhong et al., 2019). Although there are many studies in this
115 area, there are few long-term view studies of the hourly concentration data resolution
116 of PM_{2.5} chemical components. In this study, through long-term observations (from 1
117 January 2015 to 31 December 2017), we analysed the pollution level and chemical
118 conversion characteristics of NSA in PM_{2.5} in Chengdu and the concentration change
119 sensitivities of sulfate, nitrate and ammonium. Finally, combined with local emissions
120 and regional transmission characteristics, we analysed the regional transport
121 characteristics of Chengdu air pollution.

122 **2 Experiment and methods**

123 **2.1 Observation site**

124 Comprehensive observations were carried out at the Super Station of Atmospheric
125 Environmental Monitoring of Chengdu Academy of Environmental Protection
126 Sciences (30.65°N, 104.05°E). The site is located in the Wuhou District of Chengdu,
127 between First Ring Road and Second Ring Road (Fig. 1). This is a typical residential,
128 transportation and commercial mixed area that represent the characteristics of the urban
129 atmospheric environment. Chengdu is also a megacity in the Sichuan Basin of
130 Southwest China, as well as an important part of the Chengdu-Chongqing region, which
131 is among the regions with serious air pollution in China (Fig. 1).



132

133 Fig. 1. Observation site in Chengdu. The image on the left shows the aerosol optical
 134 depth (AOD, 550 nm) from 2015 to 2017 (National Aeronautics and Space
 135 Administration, 2019, last access: 12 February 2020). The red star in the image on the
 136 right shows the location of the observation site in Chengdu (© Google Maps 2020).

137 2.2 Instruments

138 During the research period, online experimental monitoring instruments were used to
 139 obtain the observation data with an hourly resolution. The equipment list is shown in
 140 Table 1.

141 Table 1. The experimental instruments used in this study

Instrument Model	Parameters	Manufacturer/Country
URG-9000	$\text{NO}_3^-/\text{SO}_4^{2-}/\text{NH}_4^+/\text{Na}^+/\text{Mg}^{2+}/\text{Ca}^{2+}/\text{Cl}^-/\text{K}^+$	Thermo Fisher Scientific/USA
SHARP 5030	$\text{PM}_{2.5}/\text{PM}_{10}$	Thermo Fisher Scientific/USA
RT-4	OC/EC	Sunset Laboratory/USA
Xact-625	Fe/Mn	CES/USA
450i/17i/42iY/48i/49i	$\text{SO}_2/\text{H}_2\text{S}/\text{NO}_x/\text{NO}_2/\text{NO}/\text{NH}_3/\text{CO}/\text{O}_3$	Thermo Fisher Scientific/USA
WXT520	Meteorological parameters	VAISALA/Germany

142



143 **2.3 Chemical conversions and model methods**

144 To examine the conversion of gaseous pollutants to secondary aerosols, the sulfur
145 oxidation ratio (SOR) and nitrogen oxidation ratio (NOR) were used to reflect the
146 conversions of SO₂ and NO₂ to sulfate and nitrate, respectively (Sun et al., 2014; Yang
147 et al., 2015b). They can be calculated using Eq. (1) and Eq. (2):

148
$$\text{SOR} = \frac{n\text{SO}_4^{2-}}{(n\text{SO}_4^{2-} + n\text{SO}_2)} \quad (1)$$

149
$$\text{NOR} = \frac{n\text{NO}_3^-}{(n\text{NO}_3^- + n\text{NO}_2)} \quad (2)$$

150 where n is the molar concentration.

151 The ISORROPIA-II thermodynamic model was used to analyse the variation
152 characteristics of the interaction among aerosol chemical components (Fountoukis and
153 Nenes, 2007; Guo et al., 2017; Ding et al., 2019). Temperature (T), relative humidity
154 (RH) and the total concentrations (i.e., gas + aerosol) of Na⁺, SO₄²⁻, NH₃, NO₃⁻, Cl⁻,
155 Ca²⁺, K⁺ and Mg²⁺ were input into the ISORROPIA-II thermodynamic model. In this
156 study, we use “forward problems” mode to run the model, assuming that the aerosols
157 were in a “metastable” state (salts do not precipitate under supersaturated conditions).
158 The simulated data and observed data were compared and analysed. Simultaneously,
159 the aerosol water content (AWC) and pH of aerosols were calculated. The sensitivity of
160 the interaction between aerosol chemical components (NSA) was analysed (Ding et al.,
161 2019; Fountoukis et al., 2009). The pH can be calculated using Eq. (3):

162
$$\text{pH} = -\log_{10} H_{aq}^+ \cong -\log_{10} \frac{1000 H_{air}^+}{\text{AWC}} \quad (3)$$

163 where H_{aq}^+ (mol/L) is the concentration of hydronium ions in liquid water of
164 atmospheric particulate matter, which can be calculated by the H_{air}^+ and AWC (μg/m³)
165 outputs from the ISORROPIA-II thermodynamic model (Ding et al., 2019; Guo et al.,
166 2017).

167 Gas-particle phase partitioning can be used to describe the transformation
168 characteristics between semivolatile inorganic salts (NO₃⁻ and NH₄⁺) and corresponding
169 gases (HNO₃ and NH₃) (Guo et al., 2017), which can be calculated by Eq. (4) and Eq.
170 (5):



$$171 \quad \varepsilon(\text{NO}_3^-) = \frac{\text{NO}_3^-}{\text{HNO}_3 + \text{NO}_3^-} \quad (4)$$

$$172 \quad \varepsilon(\text{NH}_4^+) = \frac{\text{NH}_4^+}{\text{NH}_3 + \text{NH}_4^+} \quad (5)$$

173 where the units of NO_3^- , NH_4^+ , NH_3 and HNO_3 were $\mu\text{g}/\text{m}^3$, and the HNO_3 data are
174 from the ISORROPIA-II thermodynamic model output.

175 **2.4 CPF and PSCF methods**

176 To analyse the relationship between pollutants and wind direction (WD) and wind speed
177 (WS), the conditional probability function (CPF) was introduced the R Programming
178 Language. This function can be defined as $\text{CPF} = m_{\theta,j}/n_{\theta,j}$, where $m_{\theta,j}$ is the number of
179 samples in the WD interval θ and WS interval j with mixing ratios greater than some,
180 given a ‘high’ pollution concentration (percentile of pollutants), and $n_{\theta,j}$ is the total
181 number of samples in the same wind direction-speed interval (Uria-Tellaetxe and
182 Carslaw, 2014). Usually, a higher given ‘high’ pollution concentration (percentile) is
183 chosen, such as the 90th percentile, which will mask the lower percentile pollution
184 concentration source contributions. In this work, to obtain a more complete contribution
185 of pollution sources, a range of percentile values were selected for the CPF calculation,
186 e.g. 0-25, 25-50, 50-75 and 75-100.

187 The potential source contribution function (PSCF) is based on the analysis of pollution
188 sources, which is based on the air mass backward trajectory and can be used to judge
189 the long-distance regional transport of pollutants (Ji et al., 2019). In this study,
190 Meteoinfomap and TrajStat (Wang et al., 2009) were used, and the Hybrid Single-
191 Particle Lagrangian Integrated Trajectory (HYSPLIT) data input model were provided
192 by National Oceanic and Atmospheric Administration (National Oceanic and
193 Atmospheric Administration, 2019, last access: 12 February 2020); these data was used
194 for calculating the 24-hr backward trajectories at the observation site at a height of 500
195 m every 1 hr from 1 January 2015 to 31 December 2017 (UTC+8). The calculated
196 domain for PSCF was a range of 20-50° N, 75-115° E, and a grid cell with a resolution
197 of 0.5° × 0.5° was divided. The PSCF can be defined as Eq. (6):



$$198 \quad PSCF_{ij} = \frac{M_{ij}}{N_{ij}} W_{ij} \quad (6)$$

$$199 \quad W_{ij} = \begin{cases} 1.0 & (N_{ij} \geq 3N_{ave}) \\ 0.7 & (3N_{ave} > N_{ij} \geq 1.5N_{ave}) \\ 0.4 & (1.5N_{ave} > N_{ij} \geq N_{ave}) \\ 0.2 & (N_{ave} > N_{ij}) \end{cases} \quad (7)$$

200 where $PSCF_{ij}$ is the value for the ij th grid cell, M_{ij} is the total number of endpoints in
201 the ij th grid cell, with pollution concentrations at the observation site (30.65°N ,
202 104.05°E) that are greater than a given threshold value (75 percentiles are selected for
203 gaseous pollutants). N_{ij} is the number of backward trajectory endpoints that fall in the
204 ij th grid cell during the simulation period. To reduce the uncertainty in N_{ij} , an empirical
205 weight function W_{ij} was introduced in Eq. (7), where N_{ave} is the average of N_{ij} during
206 the simulation period (Ji et al., 2019; Zhang et al., 2017; Wang et al., 2009).

207 **3 Results and discussion**

208 **3.1 Pollution characteristics of the interannual and entire observation periods**

209 The annual average mass concentration of NSA and its proportion in $PM_{2.5}$ are shown
210 in Table 2. The annual averages of $PM_{2.5}$ were 67.78, 71.88 and 59.68 $\mu\text{g}/\text{m}^3$,
211 corresponding to 2015, 2016 and 2017, respectively. However, the pollution of $PM_{2.5}$
212 in Chengdu was much higher than the annual secondary guideline value (35 $\mu\text{g}/\text{m}^3$,
213 Ambient air quality standards/GB3095-2012) and the World Health Organization
214 annual guideline value (10 $\mu\text{g}/\text{m}^3$). The same $PM_{2.5}$ pollution problem was also a
215 serious problem in Beijing and Nanjing (Ji et al., 2019; Zheng et al., 2019). The annual
216 average mass concentration of NSA also changed significantly, and the difference was
217 large. The Mann-Whitney U test showed that the variation in NO_3^- was nonsignificant
218 ($p > 0.05$), and SO_4^{2-} and NH_4^+ had obvious significance from 2015 to 2017 ($p < 0.05$),
219 indicating that NO_3^- had not decreased significantly, and there was an increase in 2017
220 compared to 2015. SO_4^{2-} continues to decline, and NH_4^+ was also lower in 2017
221 compared to 2016. Notably, SO_4^{2-} and NH_4^+ decreased significantly in 2017 compared
222 with 2015, but the variation in NO_3^- was nonsignificant. Meanwhile, the annual
223 averages of $\text{NO}_3^-/\text{SO}_4^{2-}$ were 0.95, 1.02 and 1.45 for 2015, 2016 and 2017, respectively,



224 indicating that the contribution of vehicle emissions as a mobile source to $PM_{2.5}$ was
225 increased compared with that of coal combustion as a stagnant source (Li et al.,
226 2017; Wang et al., 2015). As shown in Table S1, from 2013 to 2017, the emissions of
227 NO_2 in Chengdu were obviously higher than those of SO_2 , but $PM_{2.5}$, NO_2 and SO_2 all
228 showed downward trends, which benefited from the implementation of the Air
229 Pollution Prevention and Control Action Plan launched by the Chinese government,
230 and Chengdu also launched a more detailed pollution control plan in 2014 (the People's
231 government of Chengdu, 2014, last access: 12 February 2020).

232 Table 2. Comparison of annual mass averages ($\mu\text{g}/\text{m}^3$) and proportions (%) for NSA
233 from 2015 to 2017.

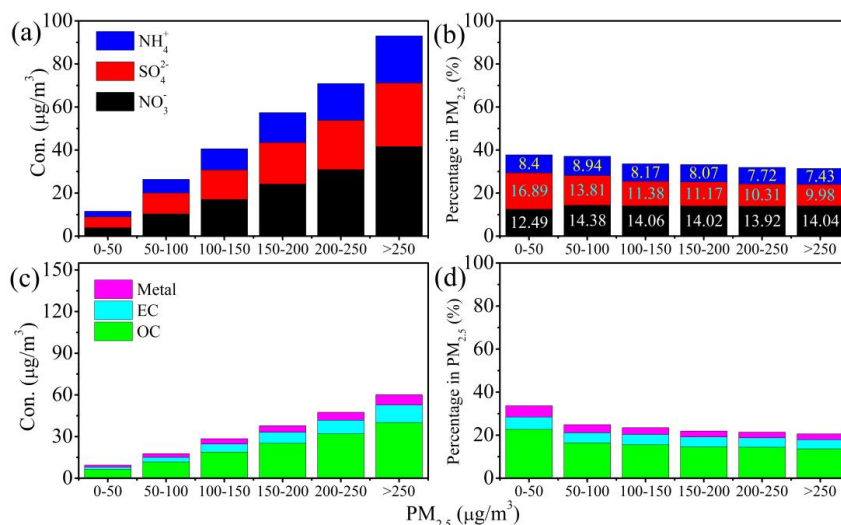
	NO_3^-	SO_4^{2-}	NH_4^+	$PM_{2.5}$	$NO_3^-/PM_{2.5}$	$SO_4^{2-}/PM_{2.5}$	$NH_4^+/PM_{2.5}$
2015	9.13	10.37	6.14	67.78	0.129	0.165	0.088
2016	9.27	8.53	6.16	71.88	0.123	0.133	0.089
2017	9.17	6.88	5.01	59.68	0.141	0.132	0.079

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235

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238

239 Fig. 2. Variation characteristics of the NSA and other chemical compositions with
240 different concentrations of PM_{2.5}. (a) NSA mass concentration. (b) Percentage of NSA
241 in PM_{2.5}. (c) Chemical compositions of organic carbon (OC), element carbon (EC), and
242 metal elements. (d) Percentage of other chemical compositions in PM_{2.5}.

243 The chemical composition of PM_{2.5} from 2015 to 2017 varies with its concentration, as
244 shown in Fig. 2. With the accumulation of PM_{2.5} in the atmosphere, the concentration
245 of NSA has also increased significantly, but their proportion in PM_{2.5} has a downward
246 trend (Fig. 2a and b). When the PM_{2.5} was less than 50 µg/m³ and greater than 250
247 µg/m³, the mass concentrations of NSA were 11.57 and 90.06 µg/m³, respectively, and
248 the proportions were 37.78 and 31.45% respectively. Comparing Fig. 2b and d, it was
249 found that NSA was always the main contributor in the entire process of PM_{2.5}
250 accumulation, which was significantly higher than the proportions of OC and EC (Ji et
251 al., 2019; Li et al., 2019c). In the accumulation process of PM_{2.5} concentrations greater
252 than 50 µg/m³, nitrate accounts for a high proportion in NSA and was stable at
253 approximately 14%, and the proportion of sulfate and ammonium continues to decrease
254 (Li et al., 2019c; Wang et al., 2016). When the PM_{2.5} concentration was less than 50
255 µg/m³, the concentration of SO₄²⁻ was higher than that of NO₃⁻, and the concentration



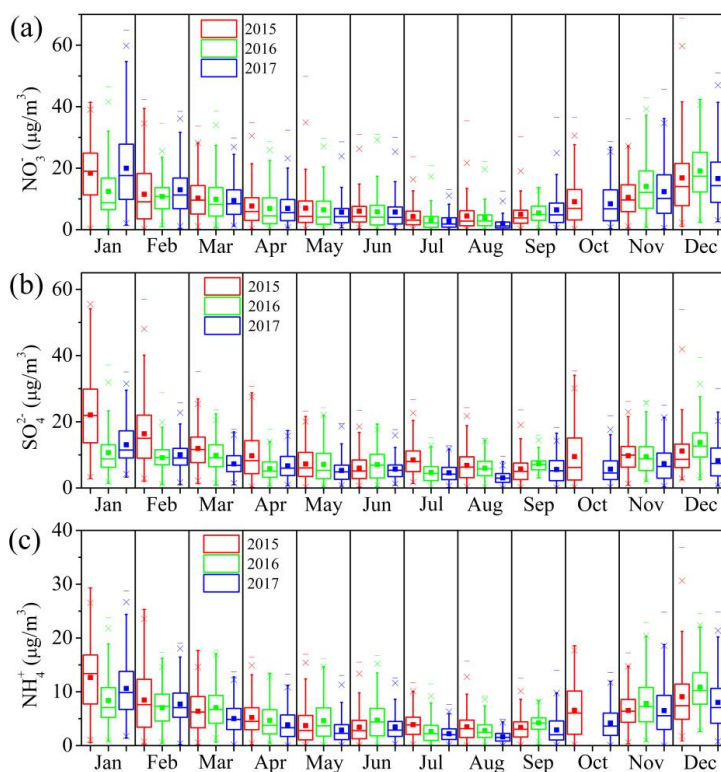
256 of NH_4^+ was lower than the NH_4^+ concentration of $\text{PM}_{2.5}$ at 50 to 100 $\mu\text{g}/\text{m}^3$, possibly
257 due to sulfate concentration was higher than nitrate, forming more chemically stable
258 ammonium sulfate (Guo et al., 2017). In addition, when $\text{PM}_{2.5}$ was less than 50 $\mu\text{g}/\text{m}^3$,
259 low RH and strong solar radiation were also important ways to generate sulfate (Yao et
260 al., 2018).

261 **3.2 Monthly and seasonal variations**

262 The monthly variation characteristics of NSA from 2015 to 2017 are shown in Fig. 3.
263 These variations have similar trends due to meteorological factors (Fig. S1); from April
264 to August, they have higher temperature and WS, lower RH and atmospheric pressure,
265 which is not only conducive to the dilution and diffusion of pollutants but also reduces
266 the chemical conversions of pollutants by aqueous phase and the concentrate ability of
267 gaseous pollutants to concentrate particles (Wang et al., 2016; Ji et al., 2019). Overall,
268 the concentrations are higher in January and December and lower in July and August.
269 The highest monthly average of NO_3^- reached 19.98 $\mu\text{g}/\text{m}^3$ in January 2017, and the
270 highest monthly average of SO_4^{2-} and NH_4^+ were 22.08 $\mu\text{g}/\text{m}^3$ and 12.66 $\mu\text{g}/\text{m}^3$ in
271 January 2015, respectively. The lowest concentrations of NSA appeared in August 2017,
272 which were 1.96, 3.07 and 1.62 $\mu\text{g}/\text{m}^3$. The gaseous precursors of NSA also have
273 obvious monthly variations, and the NO_x and SO_2 trends were similar to those of nitrate
274 and sulfate (Fig. 3 and S2). NH_3 emissions were significantly different, with increases
275 in warmer months (April-July) and colder months (September-December). On the one
276 hand, NH_3 volatilization was promoted by relatively high temperatures; on the other
277 hand, the use of agricultural fertilizers and livestock farming were also important
278 sources of NH_3 in China. Second, from urban areas, fossil fuel combustion and motor
279 vehicle emissions also contribute significantly (Liu et al., 2013a; Pan et al., 2016).
280 Notably, NH_3 increased significantly from April to December 2017 compared with
281 2015 and 2016, especially during low-temperature months (Fig. S2c). This also shows
282 that the implementation of air pollution reduction measures should increase the
283 emission reduction intensity in terms of NO_x and NH_3 emissions, especially the



284 implementation of autumn and winter air pollution prevention and control action. The
285 seasonal variation in NSA was shown in Fig. S3, and the concentration in winter was
286 much higher than that in summer. Nitrate only declined in spring and summer from
287 2015 to 2017, with an increase in autumn and winter (Fig. S3a). Seasonal variations in
288 ammonium were similar to those of nitrates, with higher concentrations in winter and
289 the lowest in summer. This may be because higher temperatures and Ws not only can
290 promote the decomposition of ammonium nitrate in summer but also promote the
291 dilution and diffusion of pollutant concentrations (Guo et al., 2017; An et al., 2019).
292 Sulfate has a significant downward trend in all seasons from 2015 to 2017, especially
293 in winter. This downward trend was due to implementation of the Air Pollution
294 Prevention and Control Action Plan, especially the measures of "electricity instead of
295 coal" and "natural gas instead of coal" (refers to increased use of electricity and natural
296 gas in the residential sector to reduce coal combustion). The variation amplitude of NSA
297 and gaseous pollutants in cold months was significantly higher than that in warm
298 months (Figs. 3, S2 and S3). This higher variation amplitude may be due to the
299 differences in pollutant accumulation and scavenging processes. This finding also
300 indicates that the instability of local pollutant emissions and regional transport during
301 cold months was affected by meteorological conditions (Li et al., 2017; Ji et al., 2018).
302 The large variation amplitude of pollutants in different months, similar to the changes
303 in the Beijing-Tianjin-Hebei region of northern China and Chengdu, are due to the
304 accumulation and removal of pollution by meteorological conditions and pollutants
305 emissions (Ji et al., 2019; Qin et al., 2019; Zhang et al., 2019).



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307 **Fig. 3. Monthly variations in NO_3^- , SO_4^{2-} and NH_4^+ mass concentrations from 2015**
308 **to 2017.3.3 Diurnal and weekly variations**

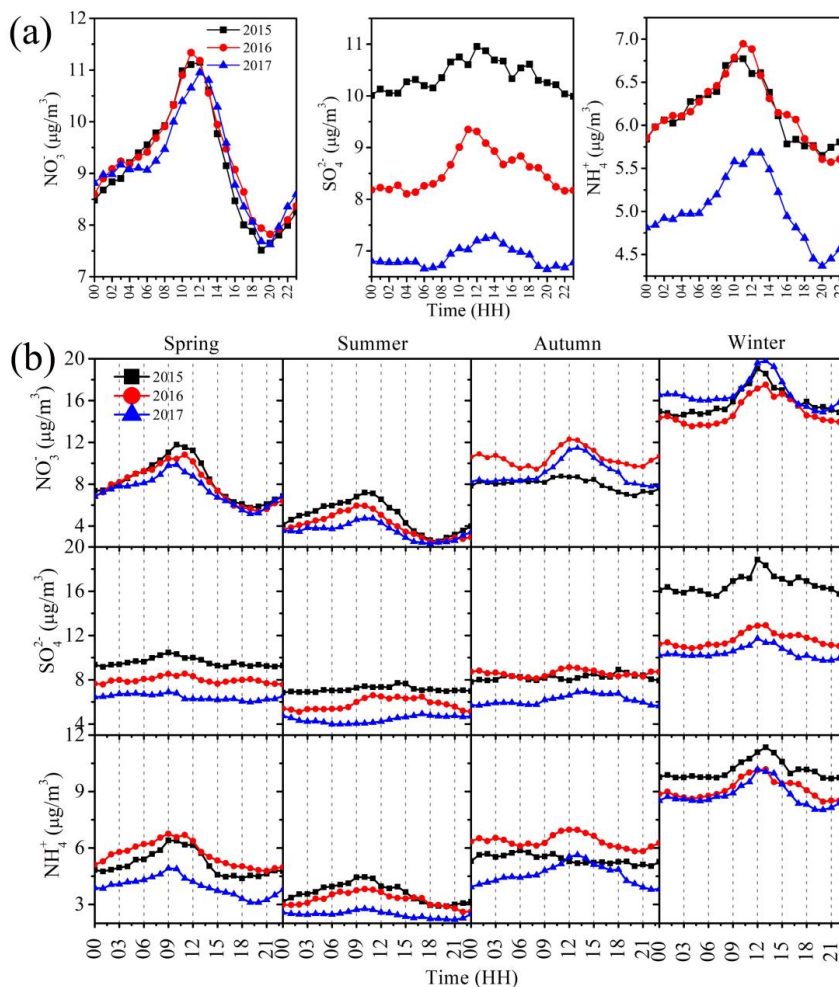
309 The diurnal variation in NSA is shown in Fig. 4; a similar trend was shown for daily
310 changes of nitrate, sulfate and ammonium, which was higher in the daytime than in the
311 evening. From 2015 to 2017, the diurnal variation trend of nitrate was similar, sulfate
312 was obviously reduced, and the ammonium was only significantly reduced in 2017. The
313 decrease in NH_4^+ may be closely related to the decrease in SO_4^{2-} (Fig. 4a). Some studies
314 have shown that NH_4^+ in aerosols will first combine with SO_4^{2-} ions and HSO_4^- to form
315 $(\text{NH}_4)_2\text{SO}_4$ or NH_4HSO_4 and then combine with NO_3^- . The significant drop in NH_4^+ in
316 2017 may be due to a decrease in SO_4^{2-} . Similarly, the NH_4^+ did not show a significant
317 decrease in 2016, probably due to the increase in NO_3^- in 2016 (Table 2), combined
318 with a portion of the NH_4^+ (Meier et al., 2009; Sun et al., 2014; Ding et al., 2019). This



319 finding also indicates that the concentration of NH_4^+ in particulate matter in Chengdu
320 may be affected by the concentration of SO_4^{2-} . From 2015 to 2017, the concentration of
321 NSA was higher in the daytime than in the evening (Fig. 4a), and similar results were
322 found in different seasons (Fig. 4b), which may be due to the combination of pollutant
323 emissions and meteorological conditions. As shown in Fig. S4, from 9:00 to 11:00 a.m.,
324 the concentrations of SO_2 , NO_x , NH_3 , CO and other gases increased significantly,
325 indicating that the primary emission of pollutants was relatively strong. At this time,
326 higher RH (Fig S5) also provides favourable conditions for the formation of secondary
327 aerosols and promotes the accumulation of NSA (Cheng et al., 2016; Wang et al.,
328 2016; Sun et al., 2014). In addition, before 10 o'clock, relatively low WS will enable
329 easy pollutant concentration accumulation. In contrast, the higher WS in the afternoon
330 may be the main factor for the decrease in pollutant concentration (Fig. 4, S4 and S5).
331 Photochemical reactions may also be one of the factors in the formation of NSA, and
332 the concentration of O_3 peaks at approximately 15:00, which may be affected by the
333 free radicals generated by photochemistry. At approximately 19:00, the ratio of
334 NO_2/NO reached its highest value, and the concentration of NO_2 also increased
335 significantly (Song et al., 2018; Zhu et al., 2019). At night, with the increase in RH (Fig.
336 S5), dissolved ozone, free radicals, hydrogen peroxide and NO_2 can catalyse SO_2 to
337 form secondary aerosols through an aqueous phase reaction (Zhang et al., 2015; An et
338 al., 2019). The seasonal diurnal variation in NSA was shown in Fig. 4b. The
339 concentration of NSA in winter was obviously higher than that in summer, and the
340 diurnal variation range was larger. The concentration in spring and autumn was closer,
341 but the diurnal variation in spring was larger than that in autumn. The larger diurnal
342 variation range not only indicates serious pollution but also indicates the importance of
343 other factors affecting air quality, such as meteorological conditions, secondary aerosol
344 conversion conditions, and so on (Ji et al., 2019; Yang et al., 2015a). The peak value of
345 the NSA seasonal diurnal variation also varies in different seasons. The peak value
346 appears at approximately 13:00 in winter, approximately 10:00 in spring and summer,



347 and approximately 12:00 in autumn, possibly due to the influence of meteorological
348 conditions.



349
350 Fig. 4. Diurnal variations in NSA from 2015 to 2017. (a) Annual average. (b) Seasonal
351 average.

352 The weekly variation in NSA is shown in Figs. S6-8. During the overall observational
353 period, workdays (Monday to Friday) showed higher variations than the weekend
354 (Saturday and Sunday), with the highest variation being on Tuesday and the lowest
355 being on Sunday. Despite the difference in mean values between Tuesday and Sunday,
356 nonparametric tests show that the difference in mean values was nonsignificant (Mann-



357 Whitney U test, $P > 0.05$). As shown in Figs. S6-7, the average trends of NO_3^- and NH_4^+
358 were consistent from Monday to Sunday. The correlation coefficient was 0.94 ($P < 0.01$)
359 from 2015 to 2017, which indicates that they have a common source and that the vehicle
360 emissions also have an important contribution to NH_4^+ (Pan et al., 2016). The average
361 values of NO_3^- , SO_4^{2-} and NH_4^+ from 2015 to 2017 were 9.21, 8.64 and 5.64 $\mu\text{g}/\text{m}^3$ on
362 workdays and 8.56, 8.33 and 5.29 $\mu\text{g}/\text{m}^3$ on weekends, respectively. Similarly, the
363 Mann-Whitney U test showed no significant difference. Population standard deviation
364 comparisons of NO_3^- , SO_4^{2-} and NH_4^+ showed that workdays were higher than
365 weekends, with 7.96, 6.04 and 4.35 on weekdays, 6.76, 5.69 and 3.88 on weekends,
366 respectively (Fig. S8). Compared with the diurnal variations on weekdays and
367 weekends, the variations in nitrate and ammonium were more obvious than those of
368 sulfate (Fig. S9). In Beijing, a vehicle restriction scheme based on motor vehicle license
369 plates was implemented, that is, there are no restrictions on weekends, and the
370 contribution of vehicle emissions pollution on weekends was lower than that on
371 workdays (Ji et al., 2019). Similarly, Chengdu also implemented restriction measures
372 according to the license plate of vehicles on weekdays, but the average concentration
373 of pollutants on weekdays was slightly higher than that on weekends (Mann-Whitney
374 U test, $P > 0.05$). This finding shows that while implementing a policy of motor vehicle
375 restriction, improving the emission standards of motor vehicles and the quality of
376 gasoline and diesel oil was an important measure.

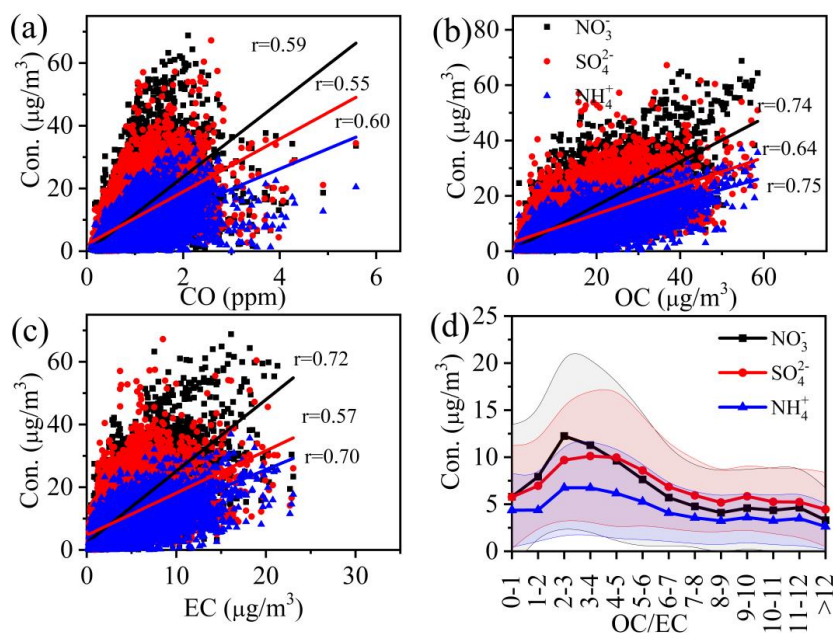
377 **3.4 Chemical characteristics of NSA**

378 **3.4.1 Relationship between NSA and carbonaceous components**

379 Precursor gases of NSA, such as SO_2 , NO_x and NH_3 , are usually derived from coal
380 combustion, vehicle exhaust and agricultural sources, and they are accompanied by
381 emissions of carbonaceous aerosols (Wang et al., 2016). Fig. 5a, b and c show the
382 relationship between NSA concentration and CO, OC and EC, demonstrating a good
383 Pearson's correlation ($p < 0.01$), which indicates that the emissions of carbon aerosols
384 were accompanied by the emissions of NSA precursor gases; these gases form NSA



385 through complex chemical reactions, such as photochemical, aqueous chemical
386 conversions and heterogeneous reactions (An et al., 2019;Li et al., 2019a;Zhu et al.,
387 2019). CO and EC usually originate from combustion sources, while OC originates
388 from primary emissions and secondary conversion (Tie et al., 2017;Tao et al.,
389 2017;Kong et al., 2019;Wu et al., 2016). The OC/EC value can be used to determine
390 the sources of carbon aerosols, such as vehicle exhaust, coal combustion and biomass
391 burning (Zhang et al., 2010). As shown in Fig. 5d, when the concentration of nitrate
392 and ammonium reached a peak, the OC/EC value was between 2-3, which was lower
393 than the OC/EC value when the sulfate was at the peak (3-4). Previous studies have
394 also shown that the OC/EC value of vehicle emissions was lower than that of coal
395 combustion (Cao et al., 2005;Kopp and Mauzerall, 2010). Nitrate and ammonium also
396 have similar trends, and their Pearson's correlation was 0.92 ($p < 0.01$), which was
397 higher than that of ammonium and sulfate (0.88). The correlation coefficients of NH_3
398 with NO_x and SO_2 were 0.42 and 0.23, respectively, suggesting that vehicle emissions
399 may also be a major source of ammonia (Pan et al., 2016;Liu et al., 2013a).



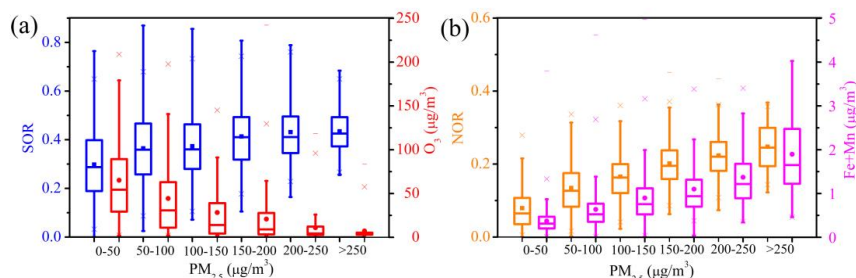
400



401 Fig. 5. Relationships between NSA and CO and OC and EC. (a) NSA and CO. (b)
402 NSA and OC. (c) NSA and EC. (d) NSA and OC/EC.

403 3.4.2 Chemical conversion characteristics of NSA

404 Figure 6 shows the abilities of SO₂ and NO₂ to chemically convert to sulfates and
405 nitrates and the variation trend of ozone concentration and metal elements at different
406 PM_{2.5} concentrations. With the increase in PM_{2.5} concentration, SOR and NOR
407 gradually increased, indicating that the formation ability of sulfate and nitrate increased
408 during the formation of air pollution. As the concentration of PM_{2.5} increases, the
409 extinction properties of aerosols increase, the photochemical reaction conditions
410 weaken, and the O₃ concentration shows a decreasing trend, as shown in Fig. 6a. With
411 the accumulation of PM_{2.5} concentration, metal elements (Fe and Mn) also showed an
412 increasing trend and were similar to SOR and NOR. Previous studies have shown that
413 mineral dust elements such as Fe and Mn can play a catalytic role in the formation of
414 atmospheric sulfate (Martin and Good, 1991; He et al., 2014). The Pearson's correlation
415 statistics of SOR and NOR with Fe and Mn under different PM_{2.5} concentration
416 conditions are shown in Table S2; it is only under high PM_{2.5} concentration
417 (>200 μg/m³) that SOR and NOR have a positive correlation. This result is similar to
418 those of previous studies in Beijing and Xi'an, where Fe and Mn play a limited catalytic
419 role in sulfate formation (Cheng et al., 2016; Wang et al., 2016). Some studies suggest
420 that when SOR is greater than 0.1, there may be a photochemical reaction pathway
421 leading to the conversion of SO₂ to sulfate (Ohta and Okita, 1990). Fig. 6a shows that
422 in addition to the photochemistry contributing to SO₂ oxidation, there may be a more
423 important pathway leading to the conversion of SO₂ to sulfate.

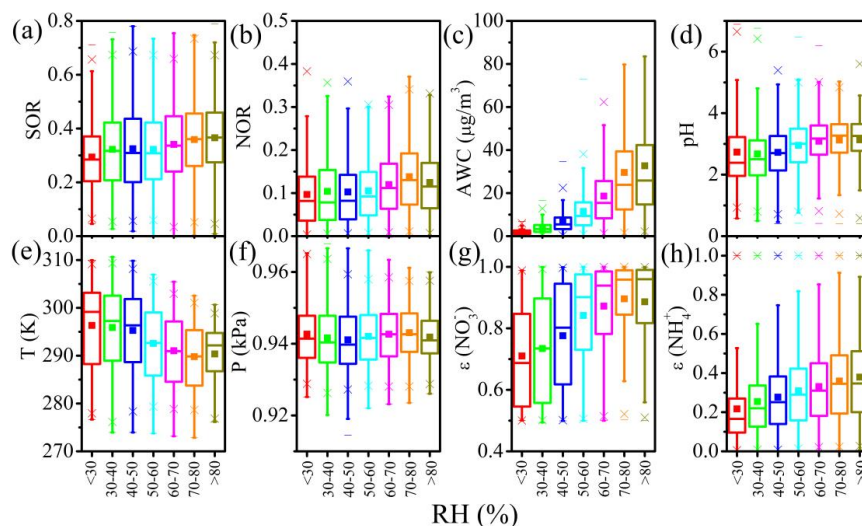


424
425 Fig. 6. Analysis of atmospheric chemical conversion ability at different PM_{2.5}
426 concentrations. (a) SOR and O₃. (b) NOR and concentration of metal elements (Fe and
427 Mn).

428 Figure 7 shows the variation characteristics of NSA chemical conversions and
429 meteorological conditions with increasing RH. SOR and NOR increased with
430 increasing RH, suggesting that SO₂ and NO₂ were more likely to produce sulfate and
431 nitrate under higher RH conditions. Previous studies have shown that in the presence
432 of NH₃, NO₂ can promote the chemical conversion of SO₂ to sulfate in the aqueous
433 phase (Wang et al., 2016). In aerosol water, alkaline aerosol components can promote
434 the dissolution of SO₂ and formation of sulfate under the oxidation of NO₂ (Cheng et
435 al., 2016). Especially when the atmosphere was polluted, the formation of sulfate by
436 SO₂ through the aqueous phase environment can contribute most of the sulfate (Sun et
437 al., 2013). According to the ISORROPIA-II thermodynamic model simulation, AWC
438 and pH also increase with RH (Fig. 7c and d). The increase in AWC can dilute the
439 concentrations of sulfate and hydrogen ions and promote an equilibrium shift in the SO₂
440 to sulfate during the aqueous phase. The increase in RH and gradual decrease in T can
441 also affect the gas-particle phase partitioning of HNO₃-NO₃⁻ (Fig. 7g) and NH₃-NH₄⁺
442 (Fig. 7h), prompting more nitrate and ammonium to condense in aerosol liquid water.
443 By comparing the NOR with the meteorological conditions and gas-particle distribution
444 when RH is greater than 80% (Fig. 7b, e, f and g), the increase in T and the decrease in
445 atmospheric pressure were not conducive to the conversion and presence of nitrate in
446 the aqueous phase (Guo et al., 2017; Ding et al., 2019). Therefore, Figs. 6 and 7 also



447 illustrate that the aqueous phase oxidation environment may contribute to the
448 generation of a larger portion of NSA.



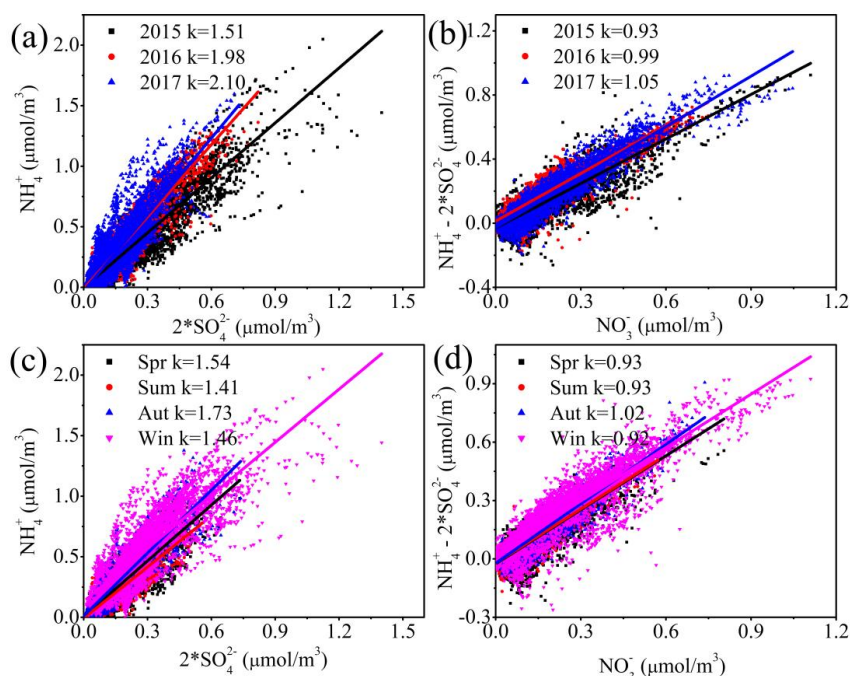
449
450 Fig. 7. Effects of RH on the chemical conversion of NSA. (a) SOR. (b) NOR. (c) AWC.
451 (d) pH of PM_{2.5}. (e) Temperature (T). (f) Atmospheric pressure (P). (g) NO₃⁻ gas-particle
452 phase partitioning. (h) SO₄²⁻ gas-particle phase partitioning.

453 3.4.3 Sensitivity analysis

454 The molar ratio analysis of NSA shown in Fig. 8 was used to analyse the chemical
455 relationships among NSA. (NH₄)₂SO₄ and NH₄NO₃ are mainly composed of NH₄⁺,
456 SO₄²⁻ and NO₃⁻ in particulate matter (Malm and Hand, 2007; Meier et al., 2009).
457 Because (NH₄)₂SO₄ has better stability than NH₄NO₃, NH₄⁺ will first combine with
458 SO₄²⁻ and then with NO₃⁻ (Liu et al., 2012). The annual average molar ratio of NH₄⁺ to
459 2*SO₄²⁻ was more than 1, which indicates that SO₄²⁻ can be completely neutralized by
460 NH₄⁺ (Fig. 8a). The molar ratios of residual NH₄⁺ (NH₄⁺ - 2*SO₄²⁻) to NO₃⁻ were 0.93,
461 0.99 and 1.05 in 2015, 2016 and 2017, respectively. As shown in Fig. 8a and b, the
462 gradual increase in the ratio (slope k) from 2015 to 2017 indicates an increase in
463 ammonia emissions from aerosols, especially in 2017, with a ratio of 1.05, indicating
464 the presence of other forms of ammonium salts, such as NH₄Cl and (NH₄)₂C₂O₄ (Sun



465 et al., 2006). Seasonal variations in NH_4^+ , SO_4^{2-} and NO_3^- are shown in Fig. 8c and d.
466 The higher molar ratio in autumn indicates that the intensity of ammonia emission in
467 autumn was higher than that in other seasons. This finding also shows that the problem
468 of atmospheric ammonia-rich environments in Chengdu in 2017 and autumn was more
469 prominent.



470
471 Fig. 8. Molar ratio analysis of NSA. (a) Interannual variation in the molar ratio of SO_4^{2-}
472 and NH_4^+ . (b) Interannual variation in the molar ratio of NO_3^- and NH_4^+ . (c) Seasonal
473 variation in the molar ratio of SO_4^{2-} and NH_4^+ . (d) Seasonal variation in the molar ratio
474 of NO_3^- and NH_4^+ .

475 Table 3 shows the sensitivity analysis of the concentration variations in SO_4^{2-} , NO_3^- and
476 NH_4^+ . ISORROPIA-II thermodynamic model sensitivity analysis is described in detail
477 in the Supplementary Materials. The coefficient of variance represents the response of
478 the species to variations in other components. The coefficients of variance for NH_4^+ and
479 NO_3^- produced by SO_4^{2-} changes were 52.62 and 5.38, respectively. Similarly, the



480 coefficients of variance for NH_4^+ and SO_4^{2-} produced by nitrate changes are 49.27 and
481 0.002, respectively. The large coefficient of variance for NH_4^+ indicates that the changes
482 in SO_4^{2-} and NO_3^- can affect the presence of NH_4^+ , which also indicates that $(\text{NH}_4)_2\text{SO}_4$
483 and NH_4NO_3 were the main states of NH_4^+ (Liu et al., 2012). The coefficients of
484 variance for SO_4^{2-} and NO_3^- produced by NH_3 changes are 2.48 and 31.30, respectively,
485 which indicates that NH_4^+ was excessive to sulfate and that NH_4^+ first combines with
486 sulfate to form stable $(\text{NH}_4)_2\text{SO}_4$, and the remaining NH_4^+ and NO_3^- will combine to
487 form NH_4NO_3 . From 2015 to 2017, the coefficient of variance for NH_4^+ and NO_3^-
488 caused by the changes in SO_4^{2-} gradually decreased, which may be attributed to the
489 decrease in SO_4^{2-} concentration in $\text{PM}_{2.5}$ (Table 2). The coefficients of variance for NO_3^-
490 caused by the changes in NH_3 in 2015 and 2016 were 32.83 and 38.24, respectively. At
491 this time, NO_3^- can completely neutralize NH_4^+ . In 2017, the coefficient of variance
492 was 21.88, and the ammonia was a surplus (Fig. 8b); thus, the coefficient of variance
493 may be affected by the thermal instability of NH_4NO_3 during this time (Ansari and
494 Pandis, 2000; An et al., 2019). In terms of seasonal variation, the changes in sulfate and
495 nitrate can cause larger coefficients of variance for NH_4^+ . When NH_3 changes, the
496 coefficient of variance for NO_3^- was greater than that of SO_4^{2-} . In summer, the
497 coefficient of variance for NO_3^- and NH_4^+ caused by the changes in SO_4^{2-} were
498 obviously higher than those in other seasons. On the one hand, this may be due to the
499 relatively low concentrations of NO_3^- and NH_4^+ in $\text{PM}_{2.5}$ due to lower gas-particle phase
500 partitioning in summer (Fig. S10a and b). On the other hand, the stronger
501 photochemical reaction may also lead to a greater change in the concentrations of NO_3^-
502 and NH_4^+ (Ohta and Okita, 1990). The coefficients of variance for NO_3^- and SO_4^{2-} in
503 winter were 6.13 and 0.005, respectively, which are higher than those in spring and
504 autumn, most likely due to higher NOR and SOR (Fig. S10c and d). Previous studies
505 have shown that the conversion of SO_2 to sulfate in the aqueous phase not only increases
506 the conversion of sulfate but also enhances the formation of nitrate particles in the
507 aqueous phase (Wang et al., 2016). Therefore, sulfate emission reduction may play a



508 key role in the process of controlling emission reduction in NSA pollution, as it not
509 only reduces the presence of NH_4^+ ($(\text{NH}_4)_2\text{SO}_4$) in particulate matter but also affects
510 the formation of NH_4NO_3 by influencing the formation of nitrate. NO_2 and NH_3 can
511 also promote the conversion of SO_2 to sulfate through an aqueous phase environment
512 (Wang et al., 2016). Therefore, in the current ammonia-rich environment, priority
513 control of SO_2 and NO_2 emissions is an important way to reduce NSA in particulate
514 matter. Through the implementation of the Air Pollution Prevention and Control Action
515 Plan, the reduction in sulfate emissions has achieved good results. Therefore, while
516 continuing to promote "electricity instead of coal" and "natural gas instead of coal" to
517 reduce coal combustion pollution, more stringent control measures should be added for
518 nitrate and ammonia emissions. To further improve air quality, the Chinese government
519 launched a "Three-Year Action Plan for Winning the Blue Sky Defense Battle" in 2018
520 (the State Council, 2018) and proposed emission reduction targets for SO_2 and NO_x
521 emissions, which will be 15% lower in 2020 than in 2015. By using the ISORROPIA-
522 II thermodynamic model to simulate SO_4^{2-} , NO_3^- and NH_3 emission reduction control
523 effects of 5%, 10%, 15% and 20% respectively, the results were shown in Table S3.
524 The results show that a better effect can be achieved by controlling the SO_4^{2-} and NO_3^-
525 emissions reduction, especially the effects of synergistic emissions reduction.
526 In addition, NSA can increase the hygroscopicity properties of aerosols, and more AWC
527 can increase the pH by diluting the hydrogen ion concentration (Kong et al., 2020; Ding
528 et al., 2019). Higher sulfates, nitrates and AWC correspond to a lower pH, indicating
529 that higher sulfates and nitrates have a greater effect on increasing aerosol acidity than
530 AWC dilution (Fig. S11a and b). Previous studies have also shown that sulfate
531 formation reduces aerosol pH (Sun et al., 2014). The same increase in ammonia
532 emissions can increase the aerosol pH (Fig. S11c). Table S3 also shows the impacts of
533 SO_2 , NO_3^- and NH_3 emissions reduction control on pH, such as sulfate and nitrate
534 emissions reduction increasing pH and NH_3 emissions reduction reducing pH, and
535 synergistic emission reduction has the least impact on pH changes, so controlling the



536 emissions reduction ratio in the air pollutant emission reduction scheme to reduce the
537 impacts of aerosol pH is worth further study. Acid rain is mostly concentrated in
538 southern China, and there are also important acid rain problems in the Sichuan Basin
539 (Fig. S12). Therefore, while controlling NSA emissions, especially controlling
540 ammonia emissions, the potential environmental problems of acid rain are worth
541 comprehensive assessment and analysis (Liu et al., 2019c).

542 Table 3. Sensitivity analysis of NSA concentration variations during the different
543 observation periods.

Periods	Variables	Coefficient of variance		
		NO ₃ ⁻	SO ₄ ²⁻	NH ₄ ⁺
2015-2017	NO ₃ ⁻		0.002	49.27
	SO ₄ ²⁻	5.38		52.62
	NH ₃	31.3	2.48	
2015	NO ₃ ⁻		0.005	43.34
	SO ₄ ²⁻	11.27		58.37
	NH ₃	32.83	2.69	
2016	NO ₃ ⁻		0.004	46.27
	SO ₄ ²⁻	5.55		45.15
	NH ₃	38.24	3.09	
2017	NO ₃ ⁻		0.001	58.22
	SO ₄ ²⁻	2.56		43.64
	NH ₃	21.88	1.23	
Spring	NO ₃ ⁻		0.001	40.55
	SO ₄ ²⁻	3.5		49.72
	NH ₃	26.57	2.49	
Summer	NO ₃ ⁻		0.002	34.69
	SO ₄ ²⁻	27.85		86.23
	NH ₃	58.29	1.74	
Autumn	NO ₃ ⁻		0.002	47.34
	SO ₄ ²⁻	2.71		49.18
	NH ₃	32.3	1.87	
Winter	NO ₃ ⁻		0.005	35.94
	SO ₄ ²⁻	6.13		36.08
	NH ₃	26.76	1.56	

Coefficient of variance: Standard deviation/Mean value*100



544 **3.5 Characteristics of local emissions and regional transport**

545 **3.5.1 Local emissions**

546 The concentration of pollutants is obviously affected by meteorological conditions; for
547 example, WS and WD can affect the accumulation and removal of pollutants (Li et al.,
548 2016). Figs. S13-15 show the annual variation characteristics of NSA and gas
549 precursors affected by the WS and WD using CPF. Overall, the higher WS was
550 accompanied by a lower pollutant concentration. As the WS decreases, the pollution
551 becomes serious, and the pollution hot spots were gradually concentrated. On the whole,
552 when the WS was usually greater than 2 m/s, the pollution was light (pollutant
553 concentration percentile was between 0-25). When WS was usually less than 1 m/s, the
554 pollution was heavy (pollutant concentration percentile was between 75-100), the
555 which also reflects the distance and orientation between the emission source and the
556 observation station, indicating that when the pollution was serious, the contribution of
557 local source emissions was more prominent.

558 Nitrate and NO_x have similar distributions of pollution hot spots in the polar plot
559 diagram (Fig. S13), and when the concentration percentile was between 0-25, they were
560 concentrated in the northeast and southeast directions and widely distributed. When the
561 concentration percentile was between 25-75, the sources of nitrate and NO_x were
562 distributed west and northeast of the observatory, and there were important contribution
563 sources in the northwest direction (WS was approximately 3-4 m/s) in 2017. When the
564 WS was approximately 1-2 m/s and the concentration percentile was between 50-75,
565 the important NO_x source was in the northwest direction. When the accumulation of
566 pollution concentration was high (concentration percentile was between 75-100), the
567 nitrate source was mainly concentrated in the east and southeast of the observation
568 station, and NO_x was distributed in the south and southeast, with WSs of less than 1
569 m/s; additionally, the distribution of pollution hot spots was relatively wide in 2016 (the
570 annual mean values of NO_x were 42.15, 43.99 and 39.63 (ppb) in 2015, 2016 and 2017,
571 respectively). The sulfate and SO₂ pollution sources affected by meteorological



572 conditions also have similar distribution characteristics (Fig. S14). At a higher
573 concentration of pollutants, the pollution hot spots of sulfate were distributed in the east
574 and southeast of the observation station, and SO₂ was distributed in the northeast,
575 southeast and west. The concentrations of SO₂ were 5.44, 4.15 and 3.68 (ppb) in 2015,
576 2016 and 2017, respectively. Compared with 2017 and 2016, the distribution of SO₂
577 pollution sources in 2016 was also more extensive, mainly in the west and northeast.
578 The NH₃ emissions were slightly different from those of SO₂ and NO_x (Fig. S15).
579 Under conditions of high pollution concentration (concentration percentile was
580 between 75-100), the pollution hot spots were distributed in the west in 2015 (WS was
581 approximately 2-3 m/s), in the north in 2016 (WS was approximately 3 m/s), and in the
582 near distance in 2017 (WS was approximately 0.5 m/s). The higher pollution
583 concentration was accompanied by a higher WS (2015 and 2016), which indicates that
584 the NH₃ emission transport in the surrounding area was more obvious, which may come
585 from the surrounding agricultural source distribution area (Liu et al., 2019b; Liu et al.,
586 2013a). The annual mean value of NH₃ emissions in 2017 was 27.91 ppb, which is
587 significantly higher than those in 2015 and 2016 at 17.93 ppb and 16.55 ppb,
588 respectively. During the 25-50 concentration percentile period of the NH₃, there was a
589 WS of approximately 2 m/s east of the observation site, and during the 50-75
590 concentration percentile period, there was an obvious source northwest of the
591 observation site, with a WS of approximately 4 m/s. During the 75-100 concentration
592 percentile periods, the pollution sources were mainly local. This shows that in 2017, in
593 addition to the pollution sources being distributed in the east and southeast, the higher
594 NH₃ emissions were also contributed by the surrounding emission sources northwest of
595 Chengdu.

596 **3.5.2 Gaseous precursors of NSA regional transport**

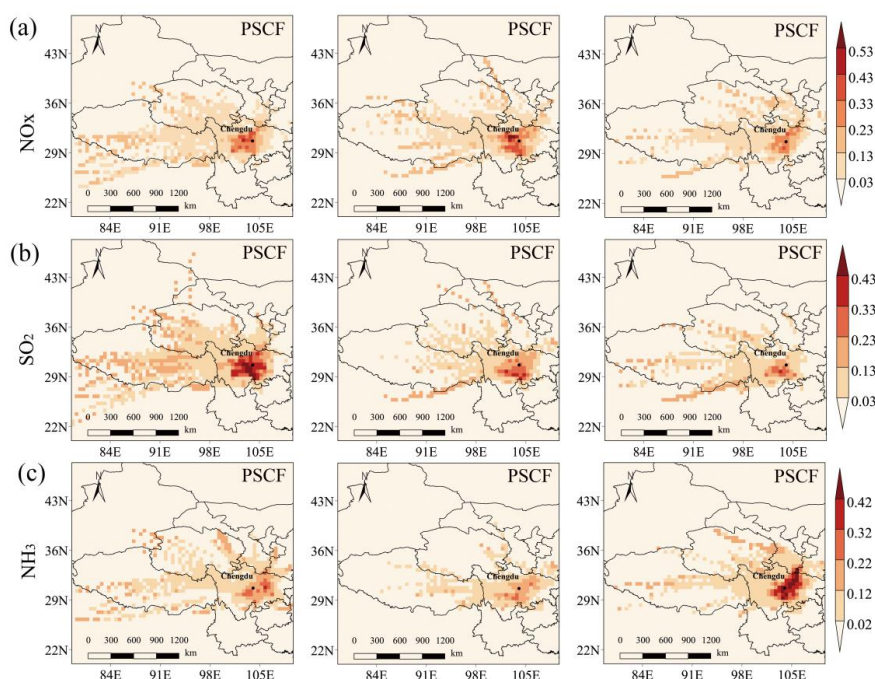
597 The PSCF is used to analyse the potential source distribution of pollutants to determine
598 the regional transport characteristics of pollutants (Ji et al., 2019). Fig. 9 shows the
599 PSCF analysis of NO_x, SO₂ and NH₃, with significant differences in their potential



600 source distributions. The higher PSCF value of NO_x was mainly distributed within 300
601 km west and southwest of Chengdu in 2015 (Ya'an, Meishan, Leshan and western
602 Chengdu), north and south of Chengdu in 2016 (Deyang, Meishan, Leshan and
603 northwestern Chengdu), and south and northeast of Chengdu in 2017 (Deyang,
604 Mianyang, Meishan, Leshan and western Chengdu). Chengdu is located along the
605 western margin of the Sichuan Basin. It was also observed through satellite remote
606 sensing data that the higher NO₂ emissions in the Sichuan Basin are distributed in
607 Chengdu and Chongqing (Fig. S16). As shown in Fig. 9, the higher PSCF values were
608 concentrated in the surrounding areas of Chengdu, indicating that the Chengdu NO_x
609 was mainly from local emissions. The SO₂ emissions were widely distributed, mainly
610 in the Sichuan Basin. Among them, Leshan city and Meishan city south of Chengdu
611 have higher SO₂ emissions, and another higher emission source was distributed in
612 Chongqing (Fig. S16). The PSCF analysis of SO₂ shows that the higher PSCF values
613 were distributed in the western, southern and southwestern parts of Chengdu, and the
614 western, southern and southwestern marginal regions of the Sichuan Basin were also
615 important potential distribution areas. Therefore, comparison Figs. 9 and S16 shows
616 that the main source of SO₂ may be distributed in the western, southern and
617 southwestern edge areas of the Sichuan Basin. In particular, Leshan, Ya'an and Meishan
618 were important potential sources. There were different sources of NH₃ emissions from
619 2015 to 2017, mainly distributed in the Sichuan Province. In 2015, the potential sources
620 were mainly west of the Sichuan Basin, southwest of Chengdu city, which is
621 approximately 100 km away from an important source. A higher PSCF was mainly
622 distributed in Ya'an, Leshan, Meishan and Yibin in 2016. In 2017, the higher PSCF was
623 mainly distributed in the western and northern areas of the Sichuan Basin, as well as
624 Meishan and Leshan, which were close to Chengdu and contributed significantly.
625 Northwest of Chengdu, Deyang, Mianyang and Guangyuan were important potential
626 sources, and a small part also comes from south of Gansu and Shaanxi. Fig. S17 shows
627 the Multiresolution Emission Inventory for China (MEIC) Gridded emissions of NH₃



628 in 2016 (Zhang et al., 2019). The higher NH_3 emissions were mainly concentrated in
629 the interior of the Sichuan Basin, especially near Chengdu, the western edge of the
630 basin. In comparison with Figs. 9 and S17, the regions with potential impacts on NH_3
631 concentration in Chengdu were mainly distributed in the Sichuan Basin, especially
632 south and northeast of Chengdu.



633
634 Fig. 9. PSCF of NO_x , SO_2 and NH_3 (ppb) in Chengdu from 2015 to 2017.

635 4 Conclusions

636 The long-term observation experiment with hourly resolution of NSA from January 1,
637 2015 to December 31, 2017 was carried out in Chengdu in southwest China, which is
638 in the Sichuan Basin. The pollution characteristics of NSA's annual, monthly, seasonal,
639 diurnal and weekly variations were demonstrated. The characteristics of chemical
640 conversion, the relationship with carbonaceous aerosols, and the sensitivity of emission
641 reduction control were analysed. Finally, combined with meteorological factors and
642 PSCF simulation, the local emission and regional transport characteristics of NSA



643 gaseous precursors were also illustrated. The main conclusions were as follows:
644 (1) Compared with 2015, the concentration of NO_3^- in 2017 did not decrease
645 significantly, while the concentrations of SO_4^{2-} and NH_4^+ decreased. With the increase
646 in $\text{PM}_{2.5}$ concentration, the NSA mass concentration increased, accounting for 31.45-
647 37.78% of $\text{PM}_{2.5}$, but there was a downward trend, indicating that the contribution of
648 other unknown components to $\text{PM}_{2.5}$ may significantly increase with the aggravation of
649 pollution. Higher and lower NSA concentrations were seen in winter and summer,
650 respectively, and higher concentrations were seen more during the day than at night.
651 Although the NSA concentration on weekdays was slightly higher than that on
652 weekends, the mean difference between them was nonsignificant.
653 (2) With the increase in $\text{PM}_{2.5}$ concentration, aqueous phase oxidation was an important
654 process of NSA chemical conversion. The ammonia-rich environment in Chengdu
655 became increasingly obvious. Under this condition, the main strategy to reduce the
656 concentration of NSA was to continue to promote sulfate reduction and to strengthen
657 the control of nitrate and ammonium reductions. When controlling the decrease in
658 sulfate and nitrate, the decrease in ammonium will be obvious. NSA synergistic
659 emissions reduction control implementation can achieve a better emission reduction
660 effect. Regulation of the emission reduction ratio of NSA and reduction of the impact
661 on aerosol pH was also a problem worth further consideration.
662 (3) Local emissions and regional transport of NSA gaseous precursors have an
663 important impact on air pollution in Chengdu. In particular, NO_x was the most obvious
664 contribution from the western, southern and southwestern margins of the Sichuan Basin
665 and local emissions in Chengdu. Northeast and west of Chengdu, there were high local
666 SO_2 emission sources, and combined with satellite remote sensing data and PSCF
667 analyses, within the Sichuan Basin, the cities of Leshan and Meishan south of Chengdu
668 may be important sources of SO_2 regional transport. The potential sources of NH_3 were
669 widely distributed, and the internal emissions of the Sichuan Basin may be important
670 potential contribution sources. Southwest, south and southeast of Chengdu, the



671 contribution was obvious. The analysis of local emissions and regional transport shows
672 that implementing regional joint prevention, controlling emissions reduction working
673 mechanisms and simultaneously promoting pollutant emission control are important
674 implementation plans.

675 **Acknowledgements**

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678 Natural Science Foundation of China (No. 91544221).

679 **Data availability**

680 The data are available on request to the corresponding author.

681 **Author contribution**

682 XL, QT and LK designed and led this study. QT and MF was responsible for the
683 observations. LK, MF, YL, YZ, CZ, CL analyzed the data. LK, YQ, JA, NC, YD, RZ
684 and ZW discussed the results. LK and XL wrote the paper. All authors commented on
685 the paper.

686 **Competing interests**

687 The authors declare that they have no conflict of interest.

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