

1 **Characterizations and source analysis of atmospheric inorganic ions**
2 **at a national background site in the northeastern Qinghai-Tibet**
3 **Plateau: insights into the influence of anthropogenic emissions on a**
4 **high-altitude area of China**

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11
12 **Abstract**

13 Atmospheric particulate matter (PM) imposes highly uncertain impacts on both
14 radiative forcing and human health. While ambient PM has been comprehensively
15 characterized in China's megacities; its composition, source, and characteristics in the
16 Qinghai-Tibet Plateau (QTP) are not yet fully understood. An autumn observational
17 campaign was conducted during the 1st - 15th October 2013 at a national background
18 monitoring station (3295 m a.s.l.) in the QTP. Real time concentrations of inorganic
19 water-soluble ions (WSIs) associated with PM_{2.5} were measured in addition to PM_{2.5}
20 concentrations, gaseous pollutants, and meteorological parameters. SO₄²⁻ was the
21 most abundant WSI (10.00 ± 4.39 μg/m³) followed by NH₄⁺ (2.02 ± 0.93 μg/m³), and
22 NO₃⁻ (1.65 ± 0.71 μg/m³). Observed WSI concentrations were lower as compared to
23 urban sites in eastern China; however, they were higher as compared to other QTP
24 monitoring sites. To better understand the potential sources of WSIs in the QTP, a
25 Positive Matrix Factorization receptor model was used. Results showed that mixed
26 factor including animal waste emission and biomass burning, crustal dust, salt lake
27 emissions, secondary sulfate and secondary nitrate were the major emission sources of
28 particulate inorganic ions at the study site. Correlation analysis between WSIs
29 revealed that NH₄NO₃, (NH₄)₂SO₄, Na₂SO₄, and K₂SO₄ were the major atmospheric
30 aerosol components. High sulfate and nitrate oxidation ratios indicated strong
31 secondary formation of both SO₄²⁻ and NO₃⁻. Both photochemical and heterogeneous
32 reactions contributed to the formation of particulate SO₄²⁻, while the conversion of
33 NO₂ to NO₃⁻ only occurred via photochemical reactions in the presence of high O₃
34 concentrations and strong sunlight.

37 **1. Introduction**

38 Atmospheric aerosol has a significant impact on climate change and human
39 health, the extent of which is determined by their physical and chemical properties.
40 High concentrations of aerosols are associated with rapid economic growth,
41 urbanization, industrialization, and motorization, and have become a major
42 environmental concern in China (Du et al., 2015). Extensive research has investigated
43 the sources, chemical and physical properties, and evolution processes of aerosol
44 particles at urban and rural sites in China during the last decade (Cao et al., 2007;
45 Gong et al., 2012; He et al., 2011; Jiang et al., 2015; Sun et al., 2015; Sun et al., 2013;
46 Wu et al., 2007). These studies indicated that fine particles are mainly composed of
47 organics, sulfate, nitrate, ammonium, mineral dust, and black carbon. While these
48 studies have greatly improved our understanding on the sources and
49 physical/chemical properties of aerosol particles, they were predominantly conducted
50 in developed areas of China, including Beijing–Tianjin–Hebei, the Pearl River Delta,
51 and the Yangtze River Delta. In remote areas, such as the Qinghai-Tibet Plateau
52 (QTP), studies on atmospheric aerosol properties are rare.

53 The QTP covers most of the Tibet Autonomous Region and Qinghai Province in
54 western China, with an area of 5,000,000 km² and an average elevation over 4000 m.
55 The area is geomorphologically the largest and highest mountain region on earth (Yao
56 et al., 2012). Described as the “water tower” of Asia, this area contains the headwaters
57 of the Mekong, Yangtze, and Yellow Rivers. Therefore, climate variability and
58 change in this region has fundamental impacts on a range of climate-related
59 ecosystem services (McGregor, 2016). Due to its unique ecosystem, landforms, and
60 monsoon circulation, the QTP has a profound role in regional and global atmospheric
61 circulation, radiative budgets, and climate systems (Su et al., 2013; Kopacz et al.,
62 2011; Yang et al., 2014; Jin et al., 2005). Limited anthropogenic activity, a sparse
63 population, immense area, and high elevation mean that, alongside the Arctic and
64 Antarctic, the QTP is considered one of the most pristine terrestrial regions in the
65 world. Because of this, the region is an ideal location for characterizing background
66 aerosol properties, regional and global radiative forcing, climate and ecological
67 changes, and the transportation of global air pollutants. Thus, a comprehensive
68 understanding of QTP aerosol chemistry is crucial for assessing anthropogenic
69 influences and evaluating long-term changes in the global environment (Cong et al.,
70 2015; Zhang et al., 2012).

71 Research relating to the chemical and physical characteristics of aerosols in the
72 QTP is rare; hence, their sources, properties, and evolution processes are poorly
73 understood. This lack of research is a result of the region’s remoteness and
74 challenging weather conditions. Most previous studies of aerosol chemistry in the
75 QTP were conducted in the Himalaya (the southeastern or southern areas of the QTP)
76 to assess the key roles of the Himalaya on regional climate and the environment, as
77 well as the boundary transportation of air pollutants from South Asia (Cong et al.,
78 2015; Zhao et al., 2013b; Wan et al., 2015; Shen et al., 2015). Conversely, the
79 northeastern QTP, located in inland China, is likely to have very different atmospheric

80 behaviors as compared to those of the Himalaya due to different climate patterns and
81 aerosol sources between the two regions (Xu et al., 2015).

82 Two decades ago, natural emission and occasional perturbations from human
83 activities were believed to be the major sources of particles in this area. (Wen et al.,
84 2001; Gao and Anderson, 2001; Tang et al., 1999). With enlargement of human
85 activities in recent years, several studies found that SO_4^{2-} , NO_3^- , NH_4^+ , and Ca^{2+} were
86 major water-soluble ions (WSIs) (Xu et al., 2014; Li et al., 2013; Zhang et al., 2014),
87 suggesting that both anthropogenic pollution and mineral dust contributed to the total
88 mass of $\text{PM}_{2.5}$. Recent real time observation also proved that sulfate, which is
89 regarded as one of the marker of anthropogenic emission, was dominant in PM_1 mass
90 in this area (Du et al., 2015). Despite some researches have been done in this area,
91 there are still some scientific gaps on the aerosol chemical properties. Most of
92 previous studies were based on the manual filter sampling, with the duration ranging
93 from days to weeks (Du et al., 2015). These low temporal resolution data have
94 limitations when being used for characterizing the rapid variations of chemical
95 compositions and capturing secondary aerosol formations. Data from the high
96 resolution instruments offer significant advantages over traditional filter-based
97 measurements (Vedantham et al., 2014). To our knowledge, real-time measurements
98 of aerosol particle composition at rural sites in the Tibetan Plateau are still rare (Du et
99 al., 2015).

100 WSIs comprise a large portion of aerosol particles and may help understand
101 chemical reactions in the atmosphere (Tripathee et al., 2017). They can provide
102 important information for understanding chemical characterizations, sources,
103 behaviors, and formation mechanisms; and hence, knowledge on the emission of
104 gaseous precursors and the effect of regional and local pollution on ecosystem health
105 (Wang et al., 2005; Tripathee et al., 2016). Furthermore, WSIs regulate the electrical
106 properties of the atmospheric medium, participate in ion-catalyzed and ion-molecule
107 reactions, and contribute to physicochemical interactions, including ion-induced new
108 particle formation (Frege et al., 2017; Schulte and Arnold, 1990). Given the
109 importance of WSIs on aerosol properties and the limited data on aerosol chemical
110 compositions in the QTP, more WSIs data are needed to better characterize the
111 chemical composition of aerosols in this area.

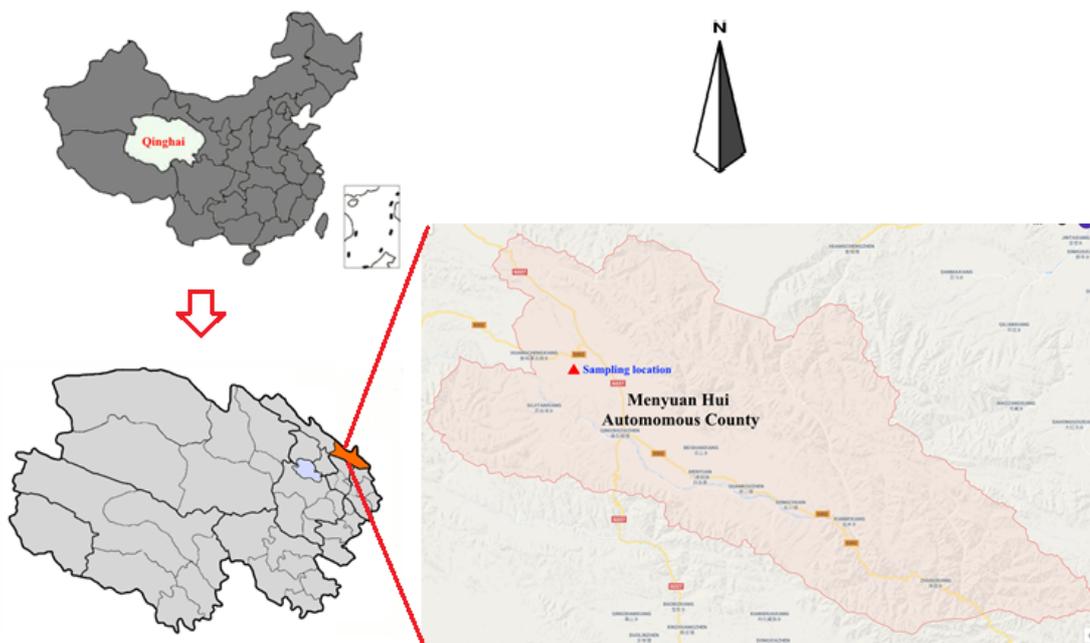
112 In our study, a real time monitor for WSIs associated with $\text{PM}_{2.5}$ was deployed at a
113 national background monitoring site (Menyuan, Qinghai, $37^\circ36'30''\text{N}$, $101^\circ15'26''\text{E}$;
114 3295 m a.s.l.) in the northeastern QTP, following Du et al. (2015). Hourly mass
115 concentrations of $\text{PM}_{2.5}$ bound sulfate, nitrate, ammonium, sodium, potassium,
116 magnesium, and calcium were obtained during the 1st–15th October 2013. Real time
117 measurements of SO_2 , NO_x , CO , O_3 , $\text{PM}_{2.5}$, and meteorological parameters were also
118 recorded. We discuss the characterization and variation of WSIs; analyze the potential
119 formation mechanisms of particulate SO_4^{2-} and NO_3^- , and investigate potential aerosol
120 sources by combining WSI and gas pollutant data.

121 **2. Methods**

122 **2.1 Monitoring site**

123 Figure 1 shows the location of the monitoring site at the peak of Daban Mountain,
124 Menyuan Hui Autonomous County, Qinghai Province (37°36'30"N, 101°15'26"E;
125 3295 m a.s.l.). The site is owned by the Chinese national atmospheric background
126 monitoring station system and is approximately 160 km north of Xining, the capital
127 city of Qinghai Province. This monitoring site is also approximately 100 km northeast
128 of Qinghai Lake, a saline and alkaline water body that is the largest lake in China. The
129 area is characterized by a typical plateau continental climate with an annual
130 temperature of 0.8 °C and precipitation of 520 mm. Meteorological parameters during
131 the observation period are summarized in Table 1. The site is surrounded by typical
132 QTP vegetation, including *potentilla fruticosa* and *kobresia*. No strong anthropogenic
133 emission sources exist in the adjacent area, with the exception of occasional biomass
134 burning events and yak dung burning for residential cooking and heating. A national
135 road (G227) and a provincial road (S302) to through the area of this site, however, the
136 traffic volume around the site is small (Du et al., 2015).

137



138

139

Figure 1 Location of sampling site

140

141 **2.2 Instruments**

142 Hourly concentrations of NO_3^- , SO_4^{2-} , Na^+ , NH_4^+ , K^+ , Mg^{2+} , and Ca^{2+} associated
143 with $\text{PM}_{2.5}$ were simultaneously measured by an ambient ion monitor (Model URG
144 9000B, URG Corporation, USA). A set of commercial instruments from Teledyne
145 API (USA) were equipped to measure hourly concentrations of SO_2 (M100EU,
146 detection limit: 50 ppt), $\text{NO}/\text{NO}_2/\text{NO}_x$ (M200EU, detection limit: 50 ppt), CO (Model
147 300EU, detection limit: 20 ppb), and O_3 (Model 400E, detection limit: 0.6 ppb).
148 Hourly $\text{PM}_{2.5}$ concentrations were measured using an Ambient Dust Monitor 365

149 (GRIMM; Grimm Aerosol Technik GmbH &Co. KG, Ainring, Germany).
 150 Meteorological parameters (e.g. temperature, relative humidity, pressure, and wind
 151 speed and direction) were also recorded.

152

153 2.3 data analysis

154 2.3.1 Oxidant ratio

155 Particulate sulfate and nitrate oxidation ratios (SOR and NOR, respectively),
 156 defined as the molar ratio of SO_4^{2-} and NO_3^- to total oxidized sulfur and nitrogen
 157 (Zhou et al., 2009), were used to evaluate secondary conversion from NO_2 and SO_2 to
 158 NO_3^- and SO_4^{2-} , respectively. High SOR and NOR indicate larger conversions of SO_2
 159 and NO_x to their respective particulate forms in $PM_{2.5}$. In this study, NOR and SOR
 160 were calculated based on the following formulae:

$$161 \quad SOR = \frac{[SO_4^{2-}]}{[SO_2] + [SO_4^{2-}]} \quad (1)$$

$$162 \quad NOR = \frac{[NO_3^-]}{[NO_2] + [NO_3^-]} \quad (2)$$

163 Given that there potentially exist the direct emissions of sulfate and nitrate (such
 164 as the sulfate released from the salt lake, which will be discussed in the source
 165 apportionment section), it is not suitable to apply their concentrations directly into the
 166 formulae (1) and (2). Therefore, we used the PMF model to calculate the
 167 concentrations of secondary sulfate and nitrate in each observation, and then take
 168 these modeled concentrations to estimate the SOR and NOR. The PMF model will be
 169 introduced in following section.

170 2.3.2 Ion balance

171 Ion balance was used to evaluate the acid-base balance of aerosol particles. We
 172 converted the WSIs mass concentration into an equivalent concentration, as follows:

$$173 \quad C (\text{cation}, \mu\text{eq}/\text{m}^3) = \frac{Na^+}{23} + \frac{NH_4^+}{18} + \frac{K^+}{39} + \frac{Mg^{2+}}{12} + \frac{Ca^{2+}}{20} \quad (3)$$

$$174 \quad A (\text{anion}, \mu\text{eq}/\text{m}^3) = \frac{SO_4^{2-}}{48} + \frac{NO_3^-}{62} \quad (4)$$

175

176 2.3.3 Source apportionment

177 Positive Matrix Factorization (PMF), developed by Paatero (Paatero and Tapper,
 178 1994; Paatero, 1997), has been widely applied in source apportionment researches. In
 179 this model, a data matrix X_{ij} , in which i is the sample and j is the measured chemical
 180 species, can be viewed as a speciated data set, and the concept of this model can be
 181 represented as:

$$182 \quad X_{ij} = \sum_{k=1}^p g_{ik} f_{kj} + e_{ij} \quad (5)$$

183 where p is the number of factors; f is the chemical profile of each source, g is
 184 the mass contribution of each factor to the sample; f_{jk} is the source profile, and e_{ij}
 185 is the residual for each species or sample.

186 PMF solves Eq (5) by minimizing the sum of the square of residuals weighted
 187 inversely with the error estimates of the data points, Q , defined as:

188
$$Q = \sum_{i=1}^n \sum_{j=1}^m \left[\frac{x_{ij} - \sum_{k=1}^p g_{ik} f_{kj}}{u_{ij}} \right]^2 \quad (6)$$

189 where u_{ij} is the uncertainty of chemical species j in sample i .

190 Furthermore, we used the results of the source apportionment to estimate the
 191 concentrations of secondary sulfate and nitrate and then applied them in the
 192 calculations of SOR and NOR. By running the PMF model, we identified the
 193 secondary sulfate and nitrate in factor s and t , respectively. We also obtained the
 194 hourly contributions of each factor to the total ions, as well as the profile of each
 195 factor. Then the products of hourly contributions of factor s or t and the
 196 percentages of sulfate or nitrate in the profile of factor s or t are taken as the
 197 concentrations of secondary sulfate or nitrate. The calculation is defined as:

198 Presume that factor s and t are the secondary sulfate and nitrate sources calculated
 199 by the PMF model ($s, t \leq p$), then:

200
$$\text{Contribution}_{i, \text{secondary sulfate}} = g_{i,s} \times r_{s, \text{sulfate}} \quad (7)$$

201
$$\text{Contribution}_{i, \text{secondary nitrate}} = g_{i,t} \times r_{t, \text{nitrate}} \quad (8)$$

202 where $g_{i,s}$ is the contribution of factor s to sample i , while $g_{i,t}$ is the
 203 contribution of factor t to sample i ; and $r_{s, \text{sulfate}}$ is the ratio of *sulfate* in the
 204 factor s , while $r_{t, \text{nitrate}}$ is the ratio of *nitrate* in the factor t .

205 2.3.4 Statistical analysis

206 Correlation analysis, analysis of variation (ANOVA), and linear regression were
 207 applied. All statistical calculations were preformed using R studio software packages
 208 (Version 0.99.903, RStudio, Inc.).

209 3. Results and Discussion

210 3.1 Descriptive analysis

211 Table 1 summarizes the concentrations of WSIs, PM_{2.5}, and gaseous pollutants
 212 and data of meteorological parameters during the observation period. SO₄²⁻ accounted
 213 for 67.9% of the total WSIs mass, followed by NH₄⁺ (13.7%), and NO₃⁻ (11.2%).
 214 SO₄²⁻, NO₃⁻ and NH₄⁺ (SNA), accounting for 92.8% of the total WSIs mass, were the
 215 major components of secondary inorganic aerosols.

216

Table 1 Descriptive statistics of WSIs species, gaseous pollutants and meteorological parameters

Species	Mean	Standard Deviation	Percentile				
			5 th	25 th	50 th	75 th	95 th
WSIs ($\mu\text{g}/\text{m}^3$)							
NO ₃ ⁻	1.65	0.71	0.62	1.14	1.60	2.02	2.90
SO ₄ ²⁻	10.00	4.39	6.39	7.05	8.37	10.73	18.83
Na ⁺	0.86	0.61	0.01	0.50	0.79	1.12	1.66
NH ₄ ⁺	2.02	0.93	0.52	1.40	1.95	2.54	3.59
K ⁺	0.05	0.03	0.01	0.03	0.04	0.06	0.11
Mg ²⁺	0.06	0.19	0.01	0.02	0.04	0.05	0.09
Ca ²⁺	0.09	0.05	0.01	0.05	0.09	0.11	0.18
Air pollutants ($\mu\text{g}/\text{m}^3$)							
PM _{2.5}	18.99	13.10	2.60	9.00	16.15	26.35	44.28
SO ₂	4.37	5.76	1.28	1.79	2.40	3.88	14.70
NO	0.12	0.19	0.01	0.02	0.04	0.13	0.45
NO ₂	4.35	2.66	1.42	2.58	3.96	5.26	8.99
NO _x	4.45	2.70	1.42	2.68	4.14	5.33	9.02
CO	48.59	56.51	4.60	13.65	26.31	58.35	183.57
O ₃	107.71	25.13	82.91	92.74	106.93	117.72	134.02
Acidity ($\mu\text{eq}/\text{m}^3$)							
Anion	0.22	0.11	0.01	0.17	0.19	0.26	0.42
Cation	0.13	0.08	0.00	0.05	0.14	0.17	0.25
Oxidation Ratio							
SOR	0.55	0.18	0.23	0.43	0.56	0.65	0.88
NOR	0.16	0.08	0.07	0.11	0.15	0.20	0.30
Meteorological Parameters							
Temp (°C)	6.55	4.53	0.50	2.80	5.60	10.70	14.49
RH (%)	52.92	18.44	22.56	38.40	55.80	65.80	81.56
Pressure (kPa)	68.58	0.26	68.10	68.30	68.60	68.80	68.90
Wind Speed (m/s)	3.39	3.02	0.00	1.30	2.60	4.70	9.20

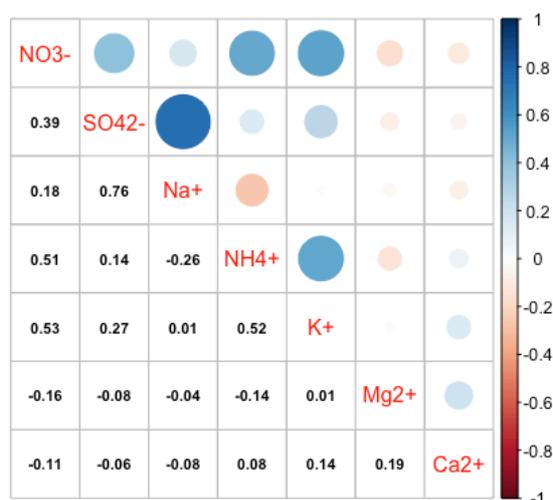
Table 2 Comparisons of WSIs concentrations with other high altitude and urban sites (mean, $\mu\text{g}/\text{m}^3$)

Sampling site	Sampling Year	SO ₄ ²⁻	NO ₃ ⁻	Na ⁺	NH ₄ ⁺	K ⁺	Ca ²⁺	Mg ²⁺	Reference
The QTP site									
Menyuan, Qinghan, the northeastern QTP (3295m)	2013	10.0	1.6	0.9	2.09	0.05	0.09	0.06	This study
South edge of the QTP (4276m)	2009	0.43	0.20	0.07	0.03	0.02	0.88	0.04	Cong et al. (2015)
Qilian Shan Station, the northeastern QTP (4180m)	2010	0.74	0.20	0.04	0.15	0.04	0.18	0.04	Xu et al. (2014)
Qinghai Lake, the northeastern QTP (3200m)	2010	4.45	0.38	0.13	-	0.12	0.23	0.06	Zhang et al. (2014)
	2012	3.65	1.42	0.26	0.62	0.10	0.66	0.10	Zhao et al. (2015)
Low altitude site in China (urban and background sites)									
Sampling site	Sampling Year	SO ₄ ²⁻	NO ₃ ⁻	Na ⁺	NH ₄ ⁺	K ⁺	Ca ²⁺	Mg ²⁺	Reference
Beijing (43m)	2013	13.80	15.43	0.69	8.02	1.06	0.08	0.58	Dao et al. (2014)
Shanghai (4m)	2009	12.9	15.0	-	6.64	0.94	-	-	Ming et al. (2017)
Xi'an (396m)	2006	42.0	20.6	-	13.1	-	-	-	Zhang et al. (2011)
Shangdianzi, Beijing (293m)	2009	8.68	11.20	-	3.23	-	-	-	Zhao et al. (2013a)
Lin'an, Zhejiang (138m)	2014	15.9	11.7	2.6	4.9	1.1	3.7	0.2	Zhang et al. (2017)
Other high-altitude area sites around the world									
Sampling site	Sampling Year	SO ₄ ²⁻	NO ₃ ⁻	Na ⁺	NH ₄ ⁺	K ⁺	Ca ²⁺	Mg ²⁺	Reference
Langtang, remote Himalayas, Nepal (3920m)	1999-2000	0.27	0.04	0.06	0.15	0.02	0.03	0.004	(Carrico et al., 2003)
Nagarkot, Kathmandu Valley, Nepal (2150m)	1999-2000	2.5	0.8	0.13	1.2	0.28	0.05	0.01	(Carrico et al., 2003)
Monte Martano, Italy (1100 m)	2009	1.90	0.84	0.02	0.54	0.06	0.25	0.06	(Moroni et al., 2015)
Great Basin National Park, Nevada, USA (2060 m)	2009-2012	0.38	0.10	-	-	-	0.05	-	(VanCuren and Gustin, 2015)

221 To better understand the concentrations of WSIs, we compared our observations
 222 with other studies implemented in background sites or urban sites across China and
 223 high altitude areas around the world in Table 2. Our results are lower as compared to
 224 studies in Europe and the USA (VanCuren and Gustin, 2015; Moroni et al., 2015),
 225 and the high latitude Himalaya region (Carrico et al., 2003); however, observations
 226 are comparable with some urban area in Nepal (Carrico et al., 2003). Observed

227 concentrations of SO_4^{2-} are also lower as compared to low altitude sites in China, for
 228 example urban sites in Beijing, Shanghai and Xi'an, and background sites in
 229 Shangdianzi (Beijing) and Lin'an (Zhejiang). Concentrations of NO_3^- were five to
 230 thirteen times lower as compared to those in low altitude areas (both urban and
 231 background sites), indicating that the influence of vehicle emissions in studying area
 232 is weak. NH_4^+ levels were lower as compared to those in urban sites (three to six
 233 times lower), and also slightly lower as compared to background sites (less than three
 234 times lower).

235 SNA concentrations in this study were higher as compared to those at other sites
 236 in the QTP, including the southern edge (Cong et al., 2015), Qilian Shan Station (Xu
 237 et al., 2014), and Qinghai Lake in the northeastern QTP (Zhang et al., 2014; Zhao et
 238 al., 2015). Large differences in concentrations suggest that the monitoring site in this
 239 study appears to be more impacted by natural and human activities as compared to
 240 other sites in the QTP.



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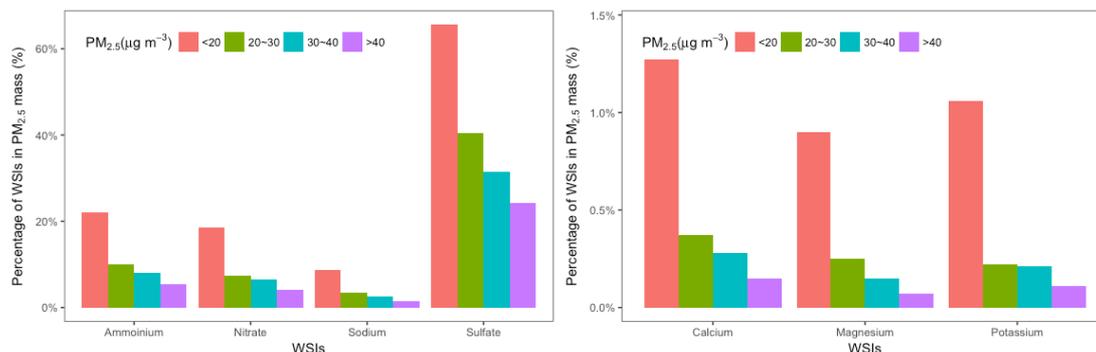
242 Figure 2 Correlation coefficients (r) between WSIs in $\text{PM}_{2.5}$ during sampling period

243

244 Correlations between WSIs are useful to investigate potential associations
 245 between the various WSIs (Xu et al., 2014). Figure 2 illustrates the correlation
 246 coefficients between WSIs based on their mass concentrations. A high correlation was
 247 found between Na^+ and SO_4^{2-} ($r=0.76$). Part of SO_4^{2-} and most of Na^+ could be
 248 attributed to the emission of the salt lake in our following discussion on source
 249 apportionment, which can explain the high correlation between SO_4^{2-} and Na^+ . NO_3^-
 250 and SO_4^{2-} had a negative and weak correlation with Mg^{2+} and Ca^{2+} , which were found
 251 to be highly correlated with CO_3^{2-} in another study in the QTP (Xu et al., 2014). SNA
 252 displayed medium positive correlations with each other. K^+ , commonly used as a
 253 marker for emissions from the burning of biomass or biofuel, had a medium
 254 correlation with NH_4^+ and NO_3^- .

255 To further examine the relationship between $\text{PM}_{2.5}$ and WSIs, we divided the
 256 $\text{PM}_{2.5}$ concentrations into four categories: a) $C(\text{PM}_{2.5}) < 20\mu\text{g}/\text{m}^3$, (b) $20\mu\text{g}/\text{m}^3 \leq$
 257 $C(\text{PM}_{2.5}) < 30\mu\text{g}/\text{m}^3$, (c) $30\mu\text{g}/\text{m}^3 \leq C(\text{PM}_{2.5}) < 40\mu\text{g}/\text{m}^3$, and (d) $C(\text{PM}_{2.5}) \geq 40\mu\text{g}/\text{m}^3$
 258 and attributed each WSI measurement to its corresponding $\text{PM}_{2.5}$ category. Figure 3

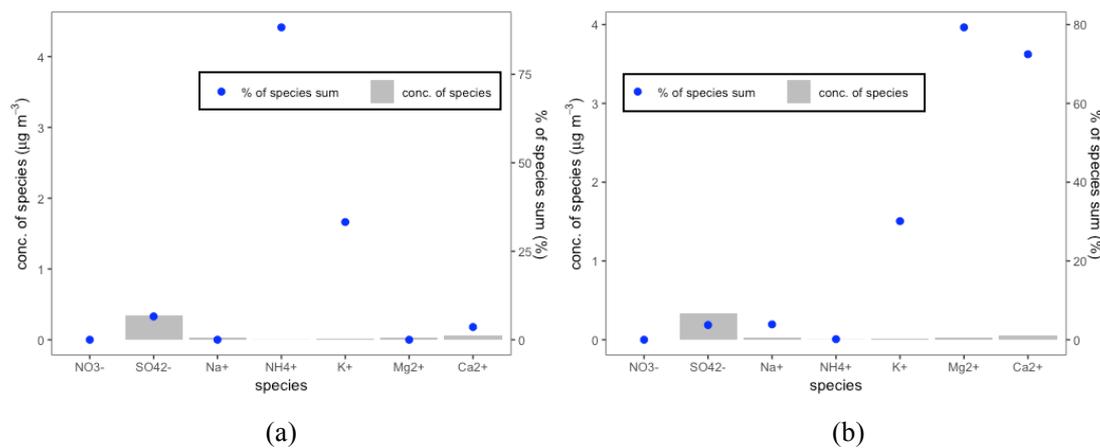
259 shows the mean proportions of WSIs in $PM_{2.5}$ for the different categories. As the
 260 $PM_{2.5}$ concentration increases, the percentages of WSIs in $PM_{2.5}$ mass exhibited
 261 decreasing trends, suggesting that the contribution of WSIs to $PM_{2.5}$ increases was
 262 negligible. Therefore, more observational campaign should be implemented in the
 263 future to investigate the driver compositions on the increase of $PM_{2.5}$ mass
 264 concentrations.
 265



266
 267 Figure 3 Mass portions of WSIs within different $PM_{2.5}$ level ranges

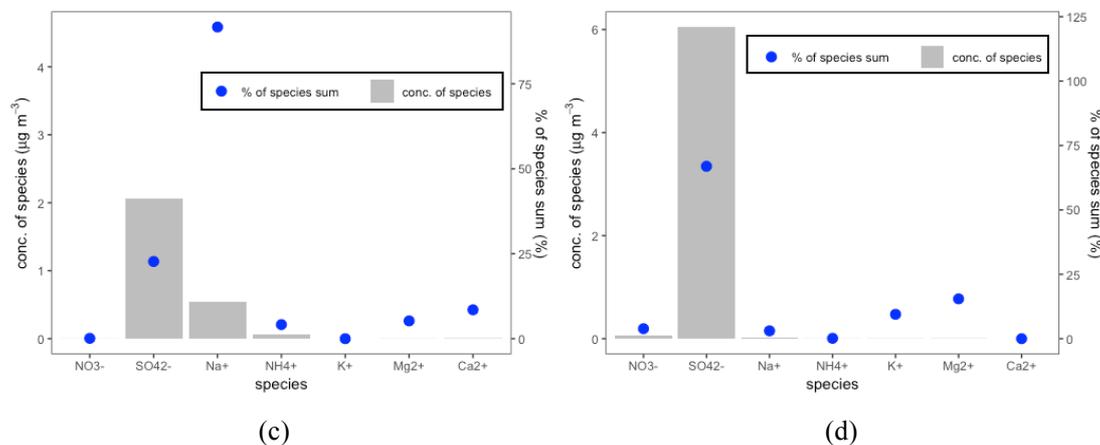
268 3.2 Source apportionment by PMF

269 In this study, all WSIs and gaseous pollutants were introduced into the PMF
 270 model for source identification. Five factors were used in the PMF model. The
 271 distributions of the factor species and the percentage of total species are shown in
 272 Figure 4.



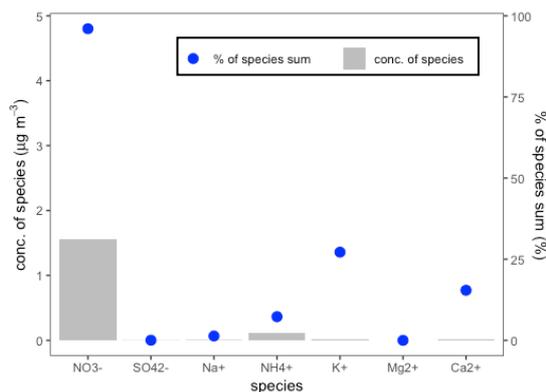
273 (a)

274 (b)



275 (c)

276 (d)



(e)

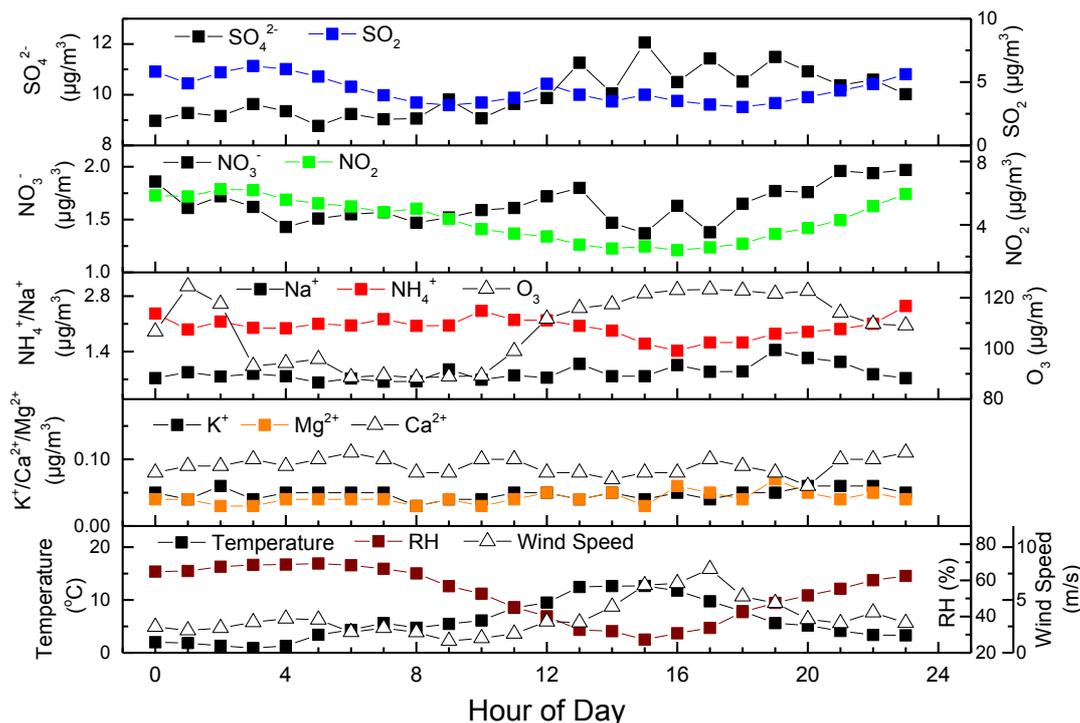
Figure 4 Source profiles exacted by PMF

(a) factor 1: animal waste emission and biomass burning; (b) factor 2: crustal dust; (c) factor 3: salt lake emissions; (d) factor 4: secondary sulfate and (e) factor 5: secondary nitrate (blue circle represents the percentage of species sum, while white bar represents concentration of species)

High NH_4^+ and K^+ loading were observed in factor 1. Livestock feces, which is commonly found in the meadows around the sampling site is a possible source of NH_4^+ . K^+ can be attributed to the combustion of biomass, which has both natural and anthropogenic origins. Li et al. (2015) found that occasional biomass burning events in the area contributed significantly to the formation of anthropogenic fine particles.. Consequently, factor 1 is attributed to mixed sources, animal emissions and biomass burning, and crustal materials. Factor 2 is identified as crustal materials with high loading of Mg^{2+} and Ca^{2+} (Ma et al., 2003). Factor 3 has high Na^+ loading and a moderate SO_4^{2-} loading, which is also shown in previous correlation analysis with the correlation coefficient between SO_4^{2-} and Na^+ is 0.76. Our monitoring site is approximately 100 km from Qinghai Lake, a saline and alkaline water body which is the largest lake in China. Zhang et al. (2014) collected total suspended particle (TSP) and $\text{PM}_{2.5}$ samples at Qinghai Lake, and found that the concentration of Na^+ was higher as compared to other mountainous areas. Furthermore, they found that SO_4^{2-} was one the most abundant species in both TSP and $\text{PM}_{2.5}$. Therefore, we attribute factor 1 to aerosols emitted from Qinghai Lake. Factor 4 and 5 are enriched with SO_4^{2-} and NO_3^- , respectively, which could be considered as the secondary sulfate and secondary nitrate. The precursor of SO_4^{2-} is SO_2 , which may originate from coal combustion, and NO_3^- is mainly converted from ambient NO_x , emitted by both vehicle exhaust and fossil fuel combustion.

3.2 Diurnal variation analysis

Diurnal variations of WSIs in $\text{PM}_{2.5}$, related gaseous pollutants (SO_2 , NO_2 , and O_3), and meteorological parameters (temperature, relative humidity, and wind speed) are shown in Figure 5.



307

308 Figure 5 Diurnal variations of WSIs in $PM_{2.5}$, gaseous pollutants (SO_2 , NO_2 , O_3), as well as
 309 meteorological parameters (temperature, relative humidity and wind speed) during sampling
 310 period

311 SO_4^{2-} concentrations begin to increase from midnight (Beijing time), reach peak
 312 levels at approximately 15:00, and then decrease gradually. SO_2 concentrations
 313 exhibit a bimodal trend, with peaks at 03:00 and 12:00; conversely, SO_4^{2-} exhibits an
 314 inverse trend. NO_3^- concentrations peak at midnight and in the early afternoon, with
 315 lowest levels occurring during the late afternoon. NO_2 displays high nighttime levels
 316 and low daytime levels. NH_4^+ remains steady during the morning with a peak at 10:00,
 317 and then decreases until 16:00. O_3 , temperature, RH, and wind speed also display
 318 evident diurnal variations; O_3 , temperature, and wind speed are low (high) at night
 319 (day), while RH shows an inverse variation to this pattern.

320

321 3.3 Sulfate and nitrate oxidation ratio analysis

322 Average NOR and SOR during the whole measurement campaign were 0.16 and
 323 0.55, respectively, suggesting potentially strong secondary formation of both SO_4^{2-}
 324 and NO_3^- . Strong photochemical reactions and the existence of high O_3 concentrations
 325 would elevate the oxidant ratio from SO_2 and NO_2 to SO_4^{2-} and NO_3^- , despite the low
 326 intensity of local emissions.

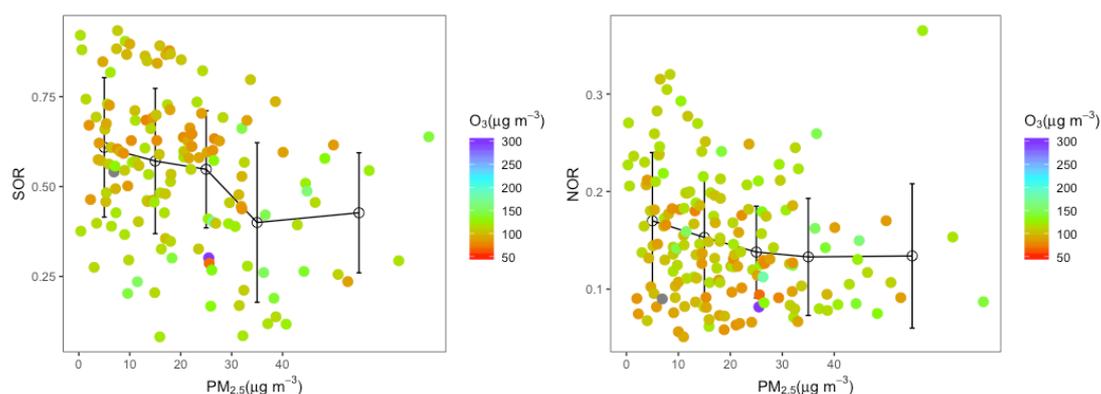
327 Variation trends of SOR and NOR were compared to changes in $PM_{2.5}$
 328 concentration and ambient RH, as shown in Figure 6. Previous research has shown
 329 that, in urban areas, both SOR and NOR increased with the $PM_{2.5}$ concentration,
 330 suggesting that heavy $PM_{2.5}$ pollution corresponds to high SOR and NOR (Xu et al.,
 331 2017). However, studies investigating SOR and NOR variations at background sites
 332 with low $PM_{2.5}$ concentration range are rare. Our results showed that increasing
 333 concentrations of $PM_{2.5}$ at low levels corresponded to decreasing SOR and NOR

334 (Figure 6a), although the decreases were slight. This is consistent with our previous
 335 finding that concentrations of SO_4^{2-} and NO_3^- did not vary markedly with $\text{PM}_{2.5}$
 336 increases at background sites, and provides further evidence to suggest that SO_4^{2-} and
 337 NO_3^- are not key drivers on the increase of $\text{PM}_{2.5}$ mass concentrations at low levels.
 338 Crustal materials are either not responsible for it as shown in Figure 3. The
 339 simultaneous observations of Du et al. (2015), indicated that organics were thought to
 340 be the major driver.

341 In Figure 6b, SOR initially decreases and then increases as RH increases. Peak
 342 SOR occurs when RH reaches both its maximum and minimum levels, when RH is
 343 low (10–20%), O_3 is high (114.6 $\mu\text{g}/\text{m}^3$, approximately the 70th percentile of O_3
 344 concentrations), and vice versa (RH > 70% and O_3 93.8 $\mu\text{g}/\text{m}^3$, approximately the 30th
 345 percentile of O_3 concentrations). The formation of particulate SO_4^{2-} can be achieved
 346 via aqueous-phase oxidation (heterogeneous reaction) or gas-phase oxidation
 347 (photochemical reaction). Normally, aqueous-phase oxidation from SO_2 to SO_4^{2-} is
 348 faster than gas-phase oxidation (Wang et al., 2016). When RH is low and O_3 is high,
 349 the photochemical formation of SO_4^{2-} via gas-phase oxidation should be considered
 350 the main oxidation pathway. Conversely, low O_3 and high RH are not sufficient to
 351 provide adequate oxidizing capacity; thus photochemical SO_4^{2-} formation becomes
 352 less important and aqueous-phase oxidation plays a more dominant role.

353 NOR constantly decreases as RH increases. Particulate NO_3^- is predominantly
 354 formed by the gas-phase reaction of NO_2 and OH radicals during the day and by
 355 heterogeneous reactions of nitrate radicals (NO_3) at night (Seinfeld and Pandis, 2016).
 356 In this study, high (low) O_3 and low (high) RH lead to high (low) NOR, meaning that
 357 gas-phase reactions oxidized by high levels of O_3 are the major pathway for nitrate
 358 formation, while heterogeneous reactions play a less important role.

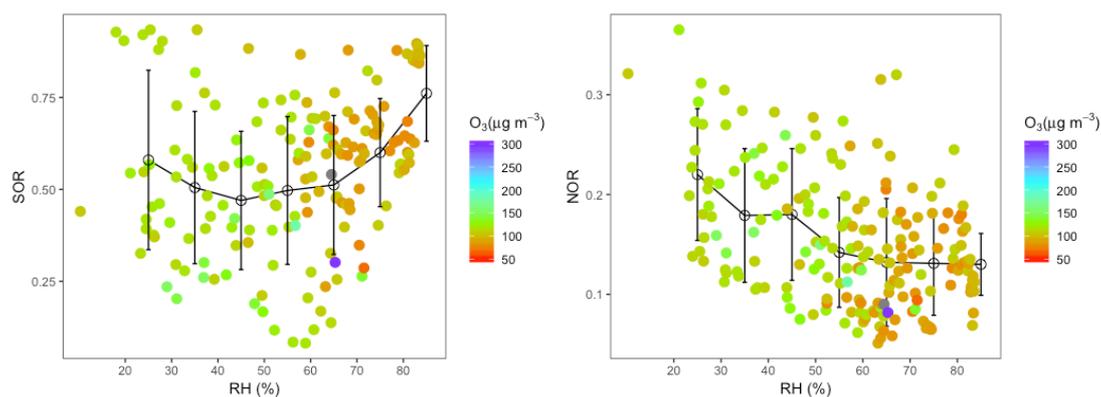
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(a) $\text{PM}_{2.5}$

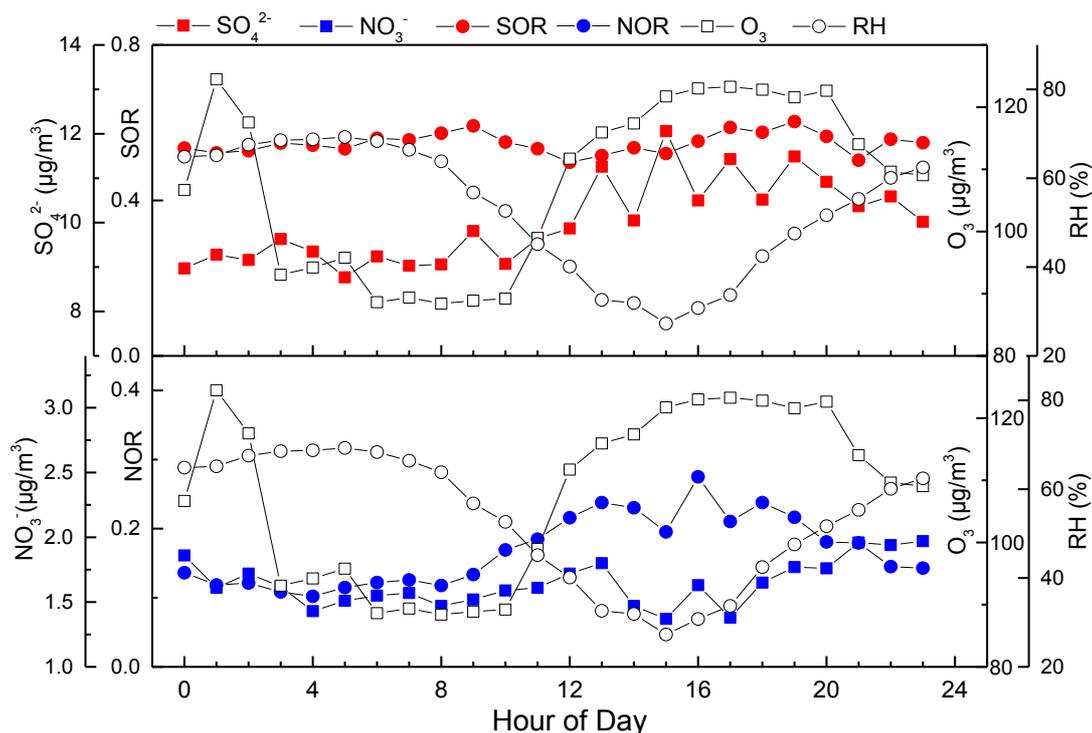


(b) RH

Figure 6 Variations of SOR and NOR as a function of $PM_{2.5}$ and RH. The vertical bars correspond to one standard error from the mean.

Figure 7 characterizes the diurnal variations of SO_4^{2-} , NO_3^- , SOR, NOR, O_3 , and RH. The variation of SOR is small, particularly as compared to the evident diurnal variation in SO_4^{2-} . Daytime gas-phase oxidation and nighttime aqueous-phase oxidation are thought to be equally important to the formation of SO_4^{2-} . NOR is high during the day and low at night; reflecting a strong positive correlation with O_3 ($r=0.71$, $p<0.05$) and a weak negative correlation with RH ($r=-0.43$, $p<0.05$). The high correlation between NOR and O_3 indicates that gas-phase oxidation via photochemical reactions is the main NO_3^- formation pathway. Trends of SOR and NOR with RH and O_3 suggest that both photochemical and heterogeneous reactions contribute to the secondary transformation of SO_2 , while only photochemical reaction drives the conversion of NO_2 to nitrate.

It is apparent that photochemical reactions (dominated by O_3 oxidization) contribute markedly to the secondary conversion of both SO_2 and NO_2 , while heterogeneous reactions (promoted by the existence of aqueous phase) contributed to the formation of SO_4^{2-} and only had a weak effect on NO_3^- . Ma et al. (2003) found that fine nitrate particles ($D_p < 2.0 \mu m$) at Waliguan Observatory (150 km south of our monitoring site) were most likely produced via gaseous-phase reactions between nitric acid and ammonia, in line with our findings on nitrate formation.



385
386

387 Figure 7 Diurnal variations of SO_4^{2-} and NO_3^- , SOR, NOR O_3 and RH during sampling period

388 **3.4 Molecular composition of major ionic species**

389 The molecular chemical forms of the major WSIs in $\text{PM}_{2.5}$ were identified using
 390 bivariate correlations based on individual WSI molar concentrations (Verma et al.,
 391 2010; Wang et al., 2005). In this study, we used equivalent concentrations for
 392 correlation analysis, and the coefficients are shown in Table 3. Figure 8 a–c show
 393 scatter plots of the equivalent concentrations of $[\text{NH}_4^+]$ and $[\text{NO}_3^-]$, $[\text{Na}^+]$ and $[\text{SO}_4^{2-}]$,
 394 and $[\text{NH}_4^+]$ and $[\text{SO}_4^{2-} + \text{NO}_3^-]$, respectively. $(\text{NH}_4)_2\text{SO}_4$ and NH_4NO_3 are major
 395 components of atmospheric aerosols (Park et al., 2004), commonly formed by the
 396 neutralization of sulfuric acid (H_2SO_4) and nitric acid (HNO_3) by NH_3 (Xu et al.,
 397 2014). It is apparent that NH_4^+ is closely correlated with NO_3^- ($r=0.56$). The slope of
 398 the regression between NH_4^+ and NO_3^- ($\mu\text{ep}/\text{m}^3$ versus $\mu\text{ep}/\text{m}^3$) is 2.28, indicating the
 399 complete neutralization of NO_3^- by NH_4^+ . SO_4^{2-} was highly correlated with Na^+
 400 ($r=0.56$), rather than NH_4^+ . Unlike NO_3^- and NH_4^+ , Na^+ was completely neutralized by
 401 SO_4^{2-} (slope=0.15) in the form of NaHSO_4 . Excess NH_4^+ would then combine with
 402 excess SO_4^{2-} ($r=0.46$). The regression slope between excess NH_4^+ and excess SO_4^{2-}
 403 was 0.72, meaning that excess NH_4^+ was completely neutralized by SO_4^{2-} and existed
 404 in the form of $(\text{NH}_4)_2\text{SO}_4$. Excess sulfuric acid was likely neutralized by crustal WSIs;
 405 and K_2SO_4 was a major chemical species in aerosol particles based on their
 406 correlation coefficients. Good regression results between $[\text{NH}_4^+ + \text{Na}^+ + \text{K}^+]$ and
 407 $[\text{NO}_3^- + \text{SO}_4^{2-}]$ were also observed in Figure 8 d.

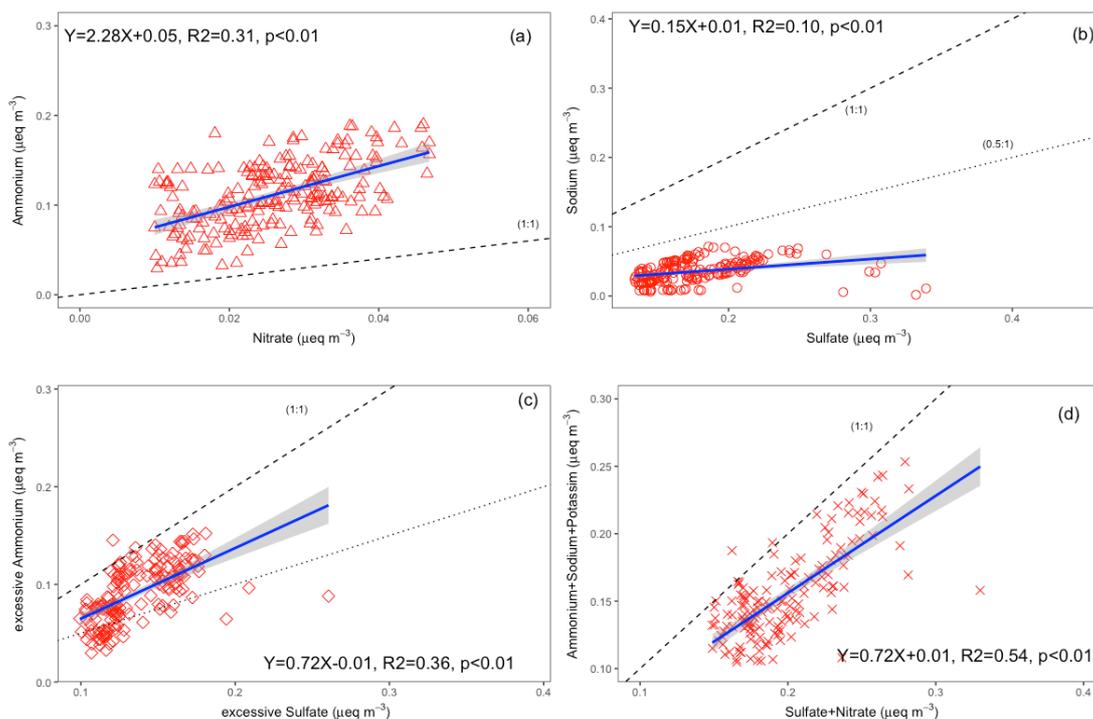
408 Table 3 Correlation coefficients (r) between the equivalent concentrations of WSIs in $\text{PM}_{2.5}$

409

during sampling period						
NO_3^-	SO_4^{2-}	Na^+	NH_4^+	K^+	Mg^{2+}	Ca^{2+}

NO_3^-						
SO_4^{2-}	0.49					
Na^+	0.17	0.56				
NH_4^+	0.56	0.46	-0.24			
K^+	0.56	0.39	0.06	0.57		
Mg^{2+}	-0.11	-0.13	-0.06	-0.15	-0.03	
Ca^{2+}	-0.06	-0.11	0.01	-0.08	0.03	0.09

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413 Figure 8 Scatter plot of (a) $[\text{NH}_4^+]$ and $[\text{NO}_3^-]$ (b) $[\text{Na}^+]$ and $[\text{SO}_4^{2-}]$ (c) $[\text{excessive NH}_4^+]$ and
 414 $[\text{excessive SO}_4^{2-}]$ (d) $[\text{NH}_4^+ + \text{Na}^+ + \text{K}^+]$ and $[\text{NO}_3^- + \text{SO}_4^{2-}]$

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3.5 Ion acidity analysis

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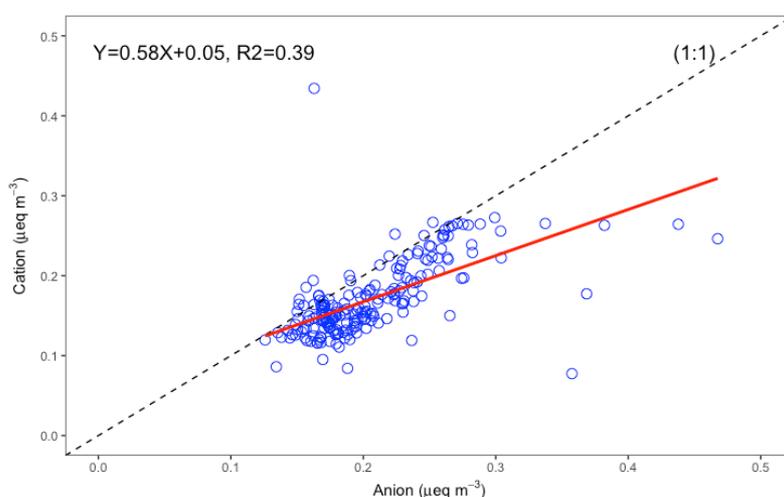
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The ion balance, expressed by the sum of the equivalent concentration ($\mu\text{eq}/\text{m}^3$) ratio of cation to anion (C/A), is an indicator of the acidity of particulate matter (Wang et al., 2005). In this study, the ion balance ratio was 0.87, indicating that aerosols tended to be acid, in line with previous studies in the QTP (Xu et al., 2015; Zhao et al., 2015). However, the results across the QTP are quite different at different locations. In the studies of south edge of the QTP, the aerosols were found to be alkaline at Qomolangma (Mt. Everest) Station for Atmospheric and Environmental Observation and Research Station (TSP, C/A=4.1) (Cong et al., 2015), four sites in central Himalayan region (TSP, C/A=3.7) (Tripathee et al., 2017), and Shigatsz, China (PM_{2.1}, C/A=1.5) (Yang et al., 2016). While in the studies of the northeastern QTP, the results vary. Two studies at Qilan Shan Station (QSS) at different time achieved difference values of C/A (C/A=1.3, sampling time: summer, 2011; C/A=0.95, sampling time: summer, 2012) (Xu et al., 2014; Xu et al., 2015). Another study at the Qinghai Lake also got slightly acidic result (PM_{2.5}, C/A=0.8) (Zhao et al.,

431 2015). In their study at the summer of 2012, Xu et al. (2015) also found that the
 432 equivalent balances of water-soluble species in different size modes indicate that the
 433 accumulation mode particles were somewhat acidic (with the linear regression slope
 434 of $[\text{NH}_4^+ + \text{Ca}^{2+} + \text{Mg}^{2+} + \text{K}^+]$ vs. $[\text{SO}_4^{2-} + \text{NO}_3^-]$ being 0.6) and that the coarse mode
 435 particles were almost neutral (the slope was 0.999), indicating that small size of
 436 particles show tendency of acid. As compared to the results at the south edge of the
 437 QTP that is mostly influenced by natural emission (such as mineral dust), the
 438 northeastern QTP suffers more anthropogenic emissions (e.g. SO_4^{2-} and NO_3^-), since it
 439 is more close to the areas with intensive human activities.

440 Figure 9 shows the scatter and linear regression plot of cations and anions
 441 ($\mu\text{eq}/\text{m}^3$). It is apparent that most points are below the 1:1 line, highlighting the acid
 442 tendency. The total equivalent anion concentration was regressed against the total
 443 equivalent concentrations of cations, and the slope of regression was 0.58.

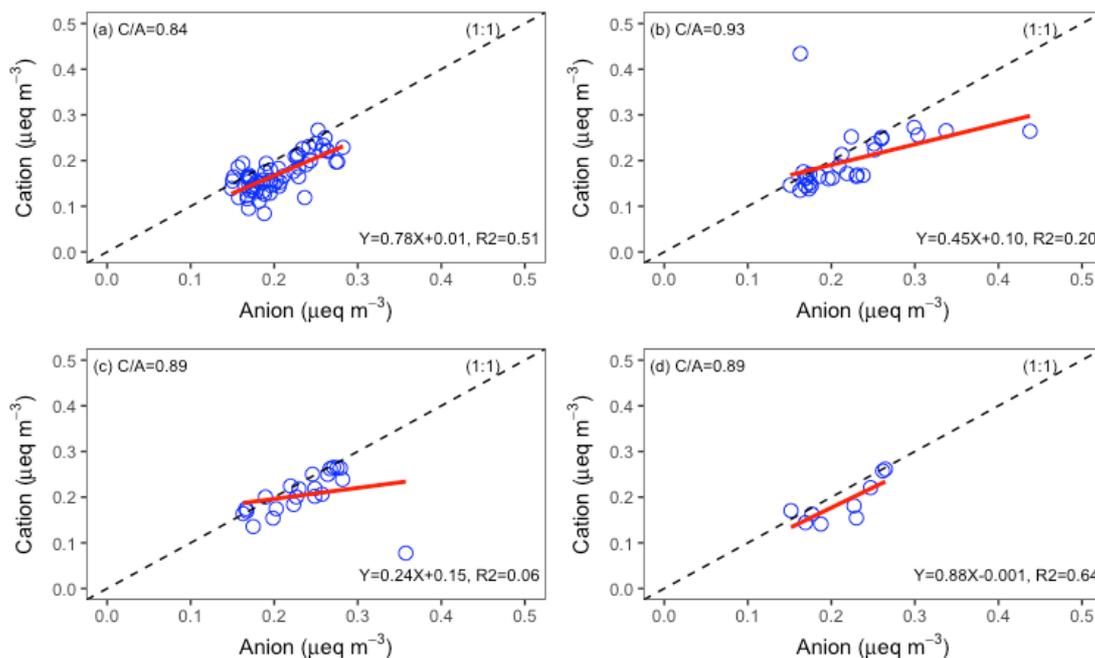


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445 Figure 9 Cation and Anion scatter plot and linear regression

446

447 Aerosol acidity for different categories of $\text{PM}_{2.5}$ concentration (described in
 448 section 3.1) and their respective scatter plots of total equivalent concentrations of
 449 anions and cations are shown in Figure 10. C/A was high when $\text{PM}_{2.5}$ concentrations
 450 exceeded $20\mu\text{g}/\text{m}^3$, indicating that aerosol acidity was weak when the $\text{PM}_{2.5}$
 451 concentration was high. This provides further evidence to support our finding that
 452 SO_4^{2-} and NO_3^- did not contribute to $\text{PM}_{2.5}$ increases.



453

454 Figure 10 Scatter plot Σ Anion and Σ Cation with different $PM_{2.5}$ concentration range (a) $C(PM_{2.5})$
 455 $< 20\mu\text{g}/\text{m}^3$ (b) $20\mu\text{g}/\text{m}^3 \leq C(PM_{2.5}) < 30\mu\text{g}/\text{m}^3$ (c) $30\mu\text{g}/\text{m}^3 \leq C(PM_{2.5}) < 40\mu\text{g}/\text{m}^3$ (d) $C(PM_{2.5}) \geq$
 456 $40\mu\text{g}/\text{m}^3$

457 4. Conclusion

458 The QTP is an ideal location for characterizing aerosol properties. In this study,
 459 we investigated the characterizations of WSIs associated with autumn $PM_{2.5}$ at a
 460 background site (3295 m a.s.l.) in the QTP. In this study, we finished some analysis
 461 on WSIs by taking advantage of real-time data to: 1) analyze the diurnal variations of
 462 WSIs; 2) discuss the formation of secondary sulfate and nitrate at the QTP; and 3)
 463 investigate source apportionment on hourly data within short-term observation. All
 464 these above are difficult by using traditional manual $PM_{2.5}$ sampling, given that it
 465 usually takes hours or even days for sample collection, and is unable to detect more
 466 variations on aerosol compositions and supply more data on finer temporal scale for
 467 further analysis.

468 During our observation, we collected real time concentrations of WSIs, and
 469 analyzed them together with $PM_{2.5}$, gaseous pollutants, and meteorological parameters
 470 for investigating ion chemistry of aerosols in the QTP. SO_4^{2-} , NO_3^- , and NH_4^+ (SNA)
 471 were the three most abundant WSI species, and crust-originated ions (Na^+ , Mg^{2+} , K^+ ,
 472 and Ca^{2+}) comprised a small fraction of total WSIs. As compared to similar studies in
 473 China, SNA concentrations in this study were lower as compared to low altitude
 474 urban areas, but higher relative to other sites in the QTP. NH_4NO_3 , $(NH_4)_2SO_4$,
 475 Na_2SO_4 , and K_2SO_4 are found to be the major atmospheric aerosol components during
 476 our observation campaign.

477 Source apportionment using a PMF model identified five factors: mixed factor
 478 including animal waste emission and biomass burning, crustal dust, salt lake
 479 emissions, secondary sulfate and secondary nitrate. Based on the results of source

480 apportionment, we found that the major sources of sulfate are salt lake emission and
481 secondary transformation, while particulate nitrate is mostly from secondary
482 conversion. After excluding the emission of sulfate from the salt lake, we investigated
483 the possible formation pathway of SO_4^{2-} and NO_3^- , the concentrations of which
484 showed evident diurnal variations. The results revealed that strong solar intensity and
485 high O_3 concentrations combined with low daytime RH greatly enhanced the
486 conversion of SO_2 and NO_2 to SO_4^{2-} and NO_3^- , respectively. Heterogeneous reactions
487 were weak overnight, and contributed to SO_4^{2-} formation only. Our analysis suggests
488 that photochemical reactions played a critical role in the secondary formation of SO_4^{2-}
489 and NO_3^- during our observation period.

490 To our knowledge, there is no such real-time measurement on WSIs associated with
491 $\text{PM}_{2.5}$ at rural sites in the QTP yet. This study provides some preliminary results on
492 aerosol ion compositions on the QTP, and proposes the potential formation
493 mechanism of secondary sulfate and nitrate. These findings are supposed to be useful
494 for further studies on aerosol chemistry in this area.

495 **Data Availability**

496 All data of this work can be obtained from Bin Han (hanbin@craes.org.cn)
497

498 **Author Contributions**

499 BH, WY and ZB designed the experiments. BY, XW and XD were in charge of the
500 whole field experiment. JW and XZ processed the original data and primary analysis.
501 BH prepared the manuscript with contributions from all co-authors.
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