



1 **Increased inorganic aerosol fraction contributes to air pollution and**
2 **haze in China**

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22 **Abstract**

23 The detailed formation mechanism of increased number of haze events in China is
24 still not very clear. Here, we found that reduced surface visibility and an increase in
25 satellite derived columnar concentration of inorganic precursor concentrations are
26 connected with each other. Typically higher inorganic mass fractions lead to increased
27 aerosol water uptake and light scattering ability in elevated relative humidity. Satellite
28 observation of aerosol precursors of NO₂ and SO₂ showed increased concentrations
29 during study period. Our in-situ measurement of aerosol chemical composition in
30 Beijing also confirmed increased contribution of inorganic aerosol fraction as a function
31 of increased particle pollution level. Our investigations demonstrate that the increased
32 inorganic fraction in the aerosol particles is a key component in the frequently occurring
33 haze days during studying period, and particularly the reduction of nitrate, sulfate and
34 their precursor gases would contribute towards better air quality in China.

35 **Introduction**

36 As one of the most heavily polluted regions in the world, China has suffered from
37 air pollution for decades (Hao et al., 2007; Zhang et al., 2015). Aerosol particles, as
38 major air pollutant, have significant effects on human health (Lelieveld et al., 2015).
39 The general public and the central government in China have realized the severe
40 situation and have taken some measures to improve the air quality nationwide in the
41 recent years. For example, the state council published a plan for air pollution control,
42 in September of 2013, aim to reduce PM_{2.5} concentrations by 10%~25% in different
43 regions of China. The successful implementation requires a sufficient knowledge of



44 haze formation mechanism (Kulmala, 2015) and comprehensive observation network
45 (Kulmala, 2018). Our understanding on haze events with high PM_{2.5} concentrations in
46 China is still limited due to the spatial-temporal variation of aerosol properties and
47 limited observation information (Wang et al., 2016). Recent studies found that
48 secondary aerosol components are important during the intense haze events in Beijing,
49 Xi'an, Chengdu and Guangzhou during January of 2013, and the reduction of aerosol
50 precursors is a key step to reduce particle pollution (Guo et al., 2014; Huang et al.,
51 2014). The analysis of longer time series data from Nanjing shows that secondary
52 particles are typically dominating even the number concentrations in polluted
53 conditions (Kulmala M., 2016). The most abundant mass fractions of atmospheric
54 aerosol are inorganic and organic components, which have large spatio-temporal
55 variation (Jimenez et al., 2009). Identifying the most abundant as well as critical aerosol
56 species that contribute to the haze formation in a longtime perspective is important to
57 draw up effective plans for the air pollution control.

58 Here, we used comprehensive data sets to reveal that an increasing trend of
59 inorganic components in atmospheric aerosol may be a pivotal factor, at least, which
60 leads to frequently occurred haze events in China from 1980-2010. As a result, the
61 controlling of inorganic aerosol components of nitrate, sulfate and their precursors
62 should be of a high priority.

63 **2.Methodology**

64 The daily averaged visibility and relative humidity data in 262 sites of China are
65 obtained from the Integrated Surface Dataset (ISD) from National Oceanic and
66 Atmospheric Administration National Climate Data Center of the USA
67 (<https://www.ncdc.noaa.gov/isd>). The visibility observations were made three times a



68 day at 8-hour intervals begins at 00:00 by well trained technicians. They measured
69 visual range using distinctive markers, such as tall buildings, mountains and towers,
70 to which the distance from the meteorological monitoring stations are known. First,
71 we quantified the importance of relative humidity to visibility as the hygroscopic
72 inorganic compounds typically grow in size in high humidity (Swietlicki et al., 2008).
73 In this study, for a given site and given year, we used the observed annual visibility
74 (V) as a ratio (R_i) between visibility values from the surface observation stations,
75 when the daily average RH was below 40% for more than 20 days. In the
76 corresponding high-humidity cases daily RH was between 80%~90% for more than
77 20 days each year at a given observation site:

78

$$79 \quad R_i = \frac{V_{dry}}{V_{wet}}$$

80 We use this ratio to infer long trend of aerosol hygroscopicity information. In
81 addition, we calculate anomaly (A) from the ratio for a given year i as a difference from
82 the 30-year (R_{30y}) from 1980 to 2010:

$$83 \quad A = R_i - R_{30y}$$

84 Our spatial focus is placed on North China Plain, Yangtze River Plain and Sichuan
85 Basin due to frequent haze events (Zhang et al., 2012). The stations in Pearl River delta
86 region and other Southern China stations were not included due to limited days with
87 the daily average RH below 40%.

88 The atmospheric column amount of NO_2 and SO_2 data are obtained from
89 SCIAMACHY (Scanning Imaging Absorption spectrometer for Atmospheric
90 CHartographY) satellite products. Modeled aerosol chemical composition from GEOS



91 (Goddard Earth Observing System) - Chem chemical transport model in China during
92 1998-2012 is used. The model utilizes assimilated meteorology data and regional
93 emission inventories with a horizontal resolution of $2^{\circ}\times 2^{\circ}$ with 47 vertical levels from
94 surface to 80 km. The detailed information about the model can be found in (Boys et
95 al., 2014). Aerosol chemical composition of organic, sulfate, nitrate, ammonium and
96 chloride were measured with a high-resolution-time of flight-aerosol mass
97 spectrometers (DeCarlo et al., 2006). Detailed information of data analysis, collection
98 efficiencies (CE) and relative ionization efficiencies are presented in Zhang et al. (2014).

99 **3. Results and discussion**

100 **3.1 Decreasing trend in visibility in high relative humidity conditions**

101 According to the geographical division, our study sites are mainly in North China
102 Plain (NCP), Sichuan Basin (SCB) and Yangtze River Plain (YRP) as showed in Figure
103 1. Looking at the time series as a whole, the visibility in dry (RH <40%) condition did
104 not have a clear trend in Yangze River Plain and Sichuan Bsain region, whereas
105 visibility in high RH (80%~90%) conditions showed a decreasing trend. The average
106 ratio of visibility in low RH to that in high RH from 1980-2010 is presented in Figure
107 1. The maximum ratios were identified in eastern China and in some western Chinese
108 cities. Overall, the enhancement factor due to hygroscopicity is within expected values
109 both from modeling and observation results (van Donkelaar et al., 2010; Xin et al.,
110 2015). The higher ratios occurred in more severe air pollution areas, like North China
111 Plain, Sichuan Basin and the city of Urumqi, where the contribution of hygroscopic
112 aerosol is more pronounced in comparison with non-hygroscopic dust particles. Long
113 time trends of this ratio in a specific site can reveal the variation of aerosol inorganic
114 fraction and organic fraction due to their different hygroscopicity and water uptake



115 capacity and associated light extinction ability. That is, the mass fractions and
116 concentrations of sulfate, nitrate and ammonium may have increased over study period
117 as they dominate water uptake ability compared with other components (e.g., organic,
118 black carbon, dust and metal elements) in the atmospheric aerosol (Wang et al., 2015).
119 For the selected regions, we have calculated the anomaly as a regional average as shown
120 in Figure 2. The ratio showed increasing trends over three regions of China and the
121 maximum trends occurred in North China Plain with the value of 0.0168 per year,
122 which indicate an increase of hygroscopic aerosol in these regions during the 30-year
123 observation period.

124 To corroborate our results, Yang et al. (2011) showed an increasing fraction of
125 inorganic components by 20% in Beijing from 1998 to 2008, especially in summer,
126 while the fractions of hydrophobic components such as organic and black carbon
127 decreased in the aerosol phase. A recent study by Boys et al. (2014) revealed that
128 increasing fraction of secondary inorganic aerosol is dominated in the increased mass
129 concentration of PM_{2.5} in China from 1998-2012. Due to the increase in hygroscopic
130 inorganic aerosol composition, the number of haze days have significantly increased in
131 the past three decades over North China Plain (Fu et al., 2014).

132 **3.2 Enhanced emissions of inorganic aerosol precursors**

133 The longterm trends of aerosol precursors and their spatial variability can improve
134 our understanding of the trends in aerosol chemical composition. Figure 3 and Figure
135 4 show atmospheric column trends of NO₂ and SO₂ observed from SCIAMACHY. The
136 column NO₂ level can be a good proxy for vehicle and coal burning emission associated
137 with oil and coal consumption (Richter et al., 2005). The column amount of NO₂
138 showed pronounced increasing trends in three regions of China, particularly in Northern



139 China with the value of 0.14×10^{15} molecule/cm²/year from 2002 to 2011. This is
140 probably associated with the increase in power plant and on-road vehicle emissions
141 (Wu et al., 2012). The average NO₂ concentration in Northern China increased by more
142 than two-fold, while in the Yangze River Plain region experienced a considerable
143 smaller trend in NO₂, with the value of 9.7×10^{15} molecule/cm² in 2010 and 6.4×10^{15}
144 molecule/cm² in 2002. As a whole, the column NO₂ concentration in China doubled
145 from 2002 to 2010, with the values of 1.4×10^{15} molecule/cm² in 2002 and 2.8×10^{15}
146 molecule/cm² in 2010, respectively.

147 Figure 4 depicts trend in SO₂ concentration in four regions of China from 2004 to
148 2010. The SO₂ concentration showed an increasing trend in North China Plain,
149 Sichuan Basin and Yangze River Plain, but nearly a constant trend in China as a whole.
150 A decreasing trend was observed during the year of 2008 and 2009, especially in
151 Northern China Plain. This may be due to a combination of Chinese economic
152 downturn and emission reduction during the Olympic games (Lin and McElroy, 2011)
153 (Wang et al., 2010). Anyway, the aerosol precursor of NO₂ showed the most increasing
154 trend in China, consistent with the trend of increased aerosol concentration (Xing et al.,
155 2015). Figure S1 shows the annual trends of aerosol inorganic fraction in PM_{2.5} mass
156 concentration from 1998-2012 with GEOS-Chem model in China. The results indicate
157 that North China Plain area suffered the most from heavily pollution, consistent with
158 our surface observations as well as earlier work (Xin et al., 2015). Aerosol concentrations
159 have increased considerably from 1980 to 2010. The modeling results show that concurrently
160 the fraction of inorganic fraction has increased more rapidly. Consequently the water uptake
161 of the aerosol have increased leading to reduced visibility, which is consistent with our ground-
162 based observations.



163 **3.3 Validation of increased inorganic aerosol components with elevated air**
164 **pollution level with in-situ measurement**

165 To validate our hypothesis that the increased inorganic components contribute to
166 visibility degradation, we used four months of aerosol chemical composition and
167 visibility data from urban Beijing from November of 2010 to February of 2011. As
168 shown in Figure 5, we divided the visibility values into four bins, which corresponds to
169 clean time to heavy pollution time and to conditions in between. The inorganic aerosol
170 precursors of SO₂ and NO_x doubled as the visibility decreased from more than 10 km
171 (clean time) to less than 2 km (heavily polluted time). At the same time, the mass
172 concentration of nitrate, sulfate and ammonium components increased to 13.5 μg m⁻³,
173 15.5 μg m⁻³ and 10.6 μg m⁻³, respectively. Meanwhile, the mass fraction of these
174 inorganics increased from 11% to 13%, from 14% to 21% and from 10% to 14%,
175 respectively. At the same time, the mass concentration and fraction of organic
176 components decreased from 12.2 μg m⁻³ to 33.4 μg m⁻³ and 60% to 46%, respectively.
177 This direct observation shows that the contribution of inorganic components increased
178 during this campaign. It is plausible that the increased concentration of SO₂ and NO_x
179 are highly associated with this giving rise to the long-term trends observed in Figure 2
180 (Pan et al., 2016; Wang et al., 2014).

181

182 **4. Conclusion and implication for atmospheric air pollution control**

183 Atmospheric pollution and associated haze events has a dramatic effect on climate
184 change, human health and visibility degradation (Ding et al., 2013; Petäjä et al., 2016;
185 Wang et al., 2015; Zhang et al., 2015). Here, longterm visibility measurements



186 combined with satellite data sets, in-situ measurements and model results revealed that
187 increased fractions of inorganic aerosol components in the particle matter are crucial in
188 contributing to more haze events. In this way, aerosol hygroscopic growth has
189 occurred in lower relative humidity conditions than before due to more ammonium
190 nitrate aerosol, and the light scattering ability of atmospheric aerosol enhanced as
191 shown in Figure 6. Another mechanism is that high concentration of NO_x can promote
192 the conversion of SO_2 to form sulfate aerosol via aqueous phase oxidation during
193 intensive pollution periods (He et al., 2014; Wang et al., 2016). Considering the vast
194 energy consumption in the future decades and the sources of inorganic components in
195 atmospheric aerosol, we demonstrate that the reduction nitrate, sulfate, ammonium
196 and their precursors maybe more critical in China.

197

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204 in Atmospheric Sciences.

205

206 **Competing financial interests**

207 The authors declare no competing financial interests.



208 **Author contributions**

209 Y.H.W had the original idea. L.L.W and C.S.G provided and processed satellite and
210 visibility data. Y.S.W provided measurements of aerosol chemical composition
211 data. Y.H.W, Y.S.W, L.L.W, T.P and M.K interpreted the data and write the paper.
212 All the authors commented on the paper.

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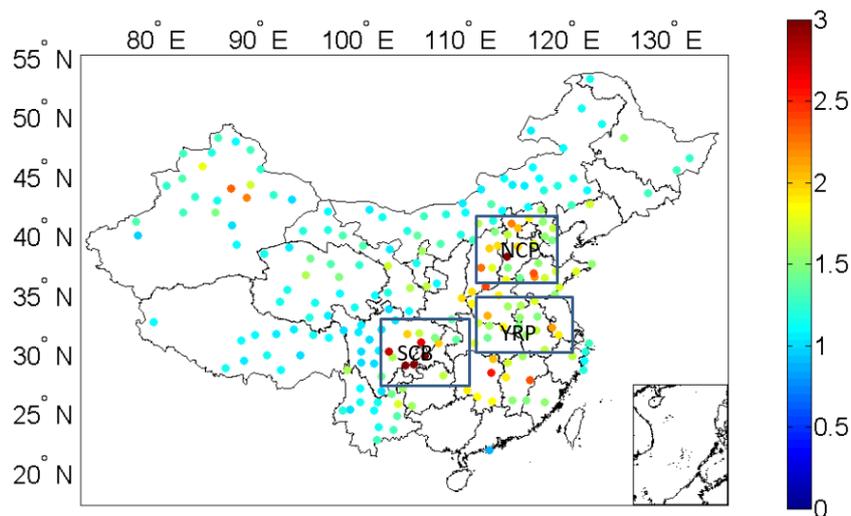


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Figure caption



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290 **Figure 1.** The distribution of the average surface visibility ratio in dry and wet
291 conditions based on observations at 262 surface observation sites in China. The
292 aerosol in the industrialized regions of China in the East are more hygroscopic than
293 aerosol particles in the west of China.

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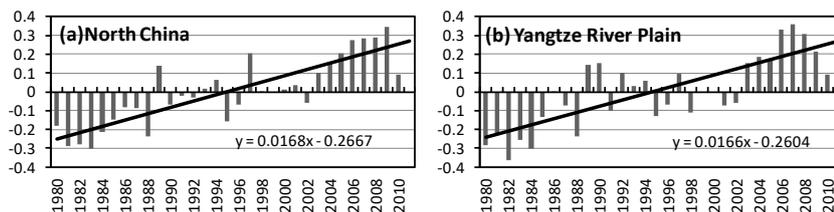
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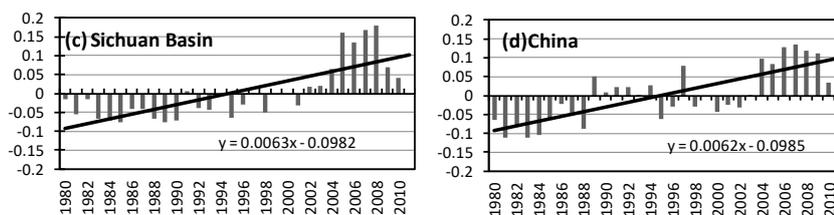
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304 **Figure 2.** Anomalies and trends of ratio of visibility in North China Plain, Yangtze
 305 Plain, Sichuan Basin and in China as a whole. The relative contribution of
 306 hygroscopic aerosols to the visibility reduction has increased from 1980 to 2010 in
 307 China.

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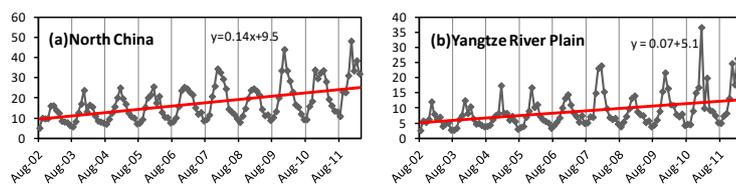
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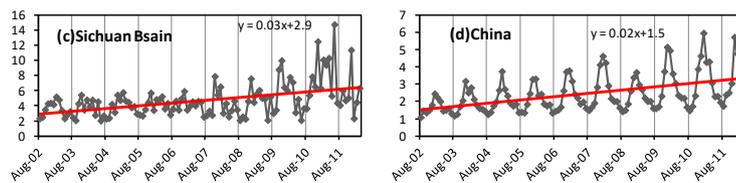
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318 Figure 3. Trends of NO₂ concentration over china from SCIAMACHY from the year

319 2002 to 2012 (10^{15} mol/cm²)

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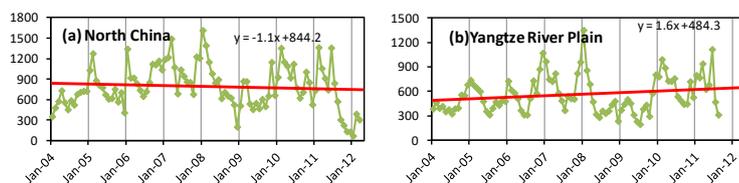
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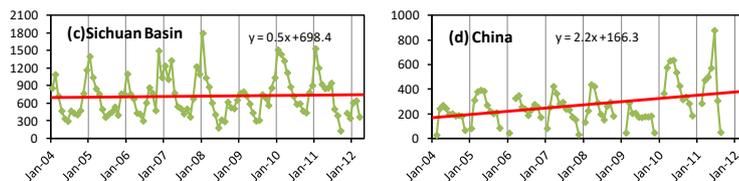
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332 Figure 4. Trends of SO₂ concentration over china from SCIAMACHY from the year of

333 2004 to 2012 (1000DU)

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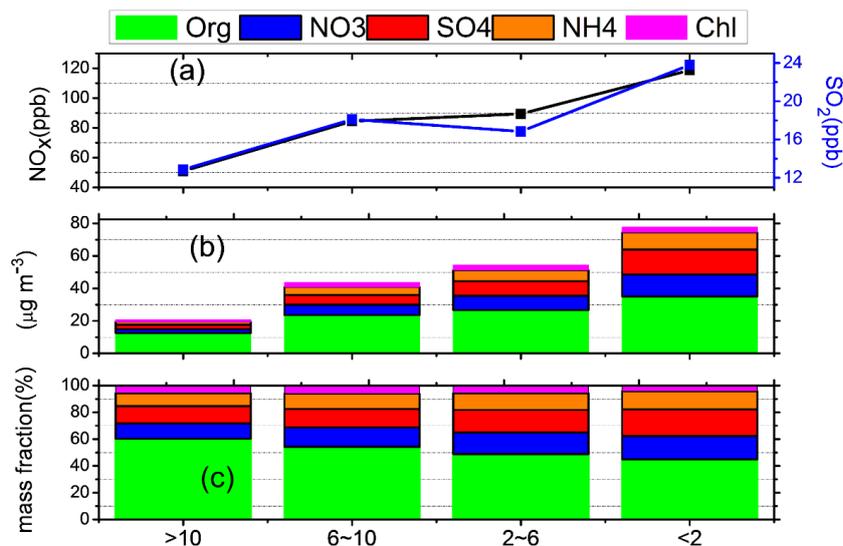
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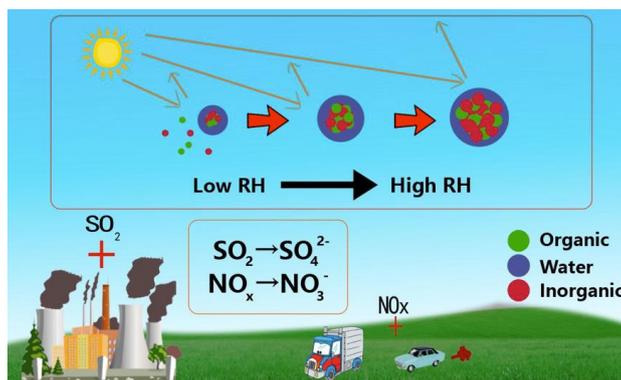
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345 **Figure 5:** Variation of (a) NO_x, SO₂, (b) chemical composition (c) mass fraction of
346 organic, nitrate, sulfate, ammonium and chloride with decreased visibility during the
347 intensive campaign in Beijing.

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352 Figure 6. A schematic picture illustrating the process of enhanced emission of
353 aerosol inorganic precursors and formation of aerosol inorganic components leading to
354 increased hygroscopicity and aerosol water uptake ability leading to considerable
355 visibility degradation in China. The plus symbols represents the strengthening of a
356 specific process.

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