



Measurement report: Effects of photochemical aging on the formation and evolution of summertime secondary aerosol in Beijing

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1 Abstract

2 Atmospheric submicron aerosols have a great effect on air quality and human health, while
3 their formation and evolution processes are still not fully understood. Herein, the crucial role of
4 atmospheric oxidation capacity, as characterized by OH exposure dose in the formation and
5 evolution of secondary submicron aerosols, was systematically investigated based on a highly time-
6 resolved chemical characterization of PM₁ in a southern suburb of Beijing in summertime from 25th
7 July to 21st August 2019. The averaged concentration of PM₁ was $19.3 \pm 11.3 \mu\text{g m}^{-3}$, and nearly
8 half (48.3%) of the mass was organic aerosols (OA) during the observation period. The equivalent
9 photochemical age (t_a) estimated from the ratios of toluene to benzene was applied to characterize
10 the OH exposure dose of the air mass. The relationships of NR-PM₁ species, OA factors (i.e., one
11 hydrocarbon-like (HOA) and three oxygenated (LO-OOA, SV-OOA and MO-OOA) organic
12 aerosol factors) and elemental compositions (e.g., H/C, O/C, N/C, S/C, OM/OC, and OSc) to t_a were
13 analyzed in detail. It was found that higher PM₁ concentration accompanied longer t_a , with an
14 average increase rate of $0.8 \mu\text{g m}^{-3}$ per hour. Meanwhile, the formation of SO_4^{2-} and MO-OOA were
15 most sensitive to the increase in t_a , and their contributions to PM₁ were enhanced from 19% to 27%
16 and from 27% to 48%, respectively, as t_a increased from 9.4 h to 19.6 h. In addition, OSc and the
17 ratios of O/C and OM/OC increased with the increase in t_a . These results indicated that
18 photochemical aging is a key factor leading to the evolution of OA and the increase of PM₁ in
19 summertime.

20 Keywords

21 PM₁; Aerosol mass spectrometer; Photochemical age; Atmospheric oxidation capacity; Positive
22 matrix factorization



23 **1 Introduction**

24 Fine particulate matter (PM_{2.5}) is one of the major atmospheric environmental problems owing
25 to its effects on air quality, human health, and climate (IPCC, 2013; Davidson et al., 2005; Molina
26 and Molina, 2004). In recent years, the PM_{2.5} concentration in China exhibited a significant decrease
27 with the implementation of the measures and strict policies in the Air Pollution Prevention and
28 Control Action Plan (Action Plan) (Zhang et al., 2019). However, the nationwide annual average
29 concentration of PM_{2.5} is still greater than the standard of the World Health Organization (WHO)
30 and PM_{2.5} is the primary pollutant in many regions, especially in the North China Plain (NCP).
31 Beijing, one of the most polluted megacities in the NCP, is also facing severe PM_{2.5} pollution. The
32 annual mean concentration in Beijing was 51 µg m⁻³ in 2018 (<http://sthjj.beijing.gov.cn/>), which
33 significantly exceeds the Chinese National Ambient Air Quality Standard (annual average of 35 µg
34 m⁻³) and the WHO Standard (annual average of 10 µg m⁻³). Continuing to reduce the PM_{2.5}
35 concentration is an important issue in improving the air quality in Beijing.

36 It has been well recognized that secondary aerosols (SA), including secondary inorganic
37 aerosol (SIA) and secondary organic aerosol (SOA), are the crucial constituents (30-77%) of PM_{2.5}
38 (Xie et al., 2020; An et al., 2019; Sun et al., 2016a; Guo et al., 2014; Huang et al., 2014). However,
39 the formation and evolution mechanism of SA is still not well understood, mainly due to multiple
40 precursors, complex formation processes, and meteorological conditions (Chen et al., 2020; Duan
41 et al., 2020; Chen et al., 2019a; Duan et al., 2019; Hua et al., 2018; Li et al., 2018a; Tie et al., 2017;
42 Sun et al., 2015). Therefore, from the perspective of precise PM_{2.5} control, in-depth understanding
43 of the processes related to SA formation and evolution is crucial.

44 The Aerodyne high-resolution time-of-flight aerosol mass spectrometer (HR-ToF-AMS) has



45 the advantage of real-time measurement of non-refractory submicron aerosol (NR-PM₁) with high
46 time resolution and sensitivity, compared to filter measurements (DeCarlo et al., 2006). As a result,
47 HR-ToF-AMS measurements have been widely employed for illustrating the formation and
48 evolution of PM in China (Chen et al., 2020; Xu et al., 2019b; Wu et al., 2018; Ge et al., 2017; Ye
49 et al., 2017; Qin et al., 2016; Sun et al., 2016a; Huang et al., 2015; Li et al., 2015; Xu et al., 2014;
50 Li et al., 2013). Many previous field observation studies have inspected the formation mechanism
51 and process of SA (Huang et al., 2019; Shi et al., 2019; Sun et al., 2018a,b; Wang et al., 2017; Xu
52 et al., 2017; Cheng et al., 2016; Wang et al., 2016; Sun et al., 2016b; Sun et al., 2014). For example,
53 studies showed that an aqueous-phase process could be an important pathway in the formation of
54 SO₄²⁻ (Elser et al., 2016) and NO₃⁻ (Duan et al., 2020). However, most recent studies suggested that
55 SO₄²⁻ formation was also associated with a photochemical process, which is closely related to the
56 meteorological conditions, especially in summertime (Chen et al., 2020; Duan et al., 2019). In terms
57 of SOA, its contribution to fine particles was reported to be as important as SIA during haze events
58 in China (Huang et al., 2014). However, the formation mechanism of SOA is much less understood
59 compared to SIA because SOA consist of various organic species with different oxidation degrees.
60 Meanwhile, based on the organics database measured by HR-ToF-AMS, positive matrix
61 factorization (PMF) analysis, one receptor model (Paatero and Tapper, 1994), has been employed
62 to distinguish and quantify multiple OA factors (Hu et al., 2016; Sun et al., 2016b). Studies have
63 found that photochemical and aqueous-phase processes played different roles in the evolution of
64 SOA, which depended on the level of atmospheric oxidation capacity (e.g., total oxidant O_x (= O₃
65 + NO₂)), relative humidity (RH), seasons and regions (Chen et al., 2020; Feng et al., 2019; Wang et
66 al., 2017; Xu et al., 2017). For example, an aqueous-phase process was reported to have a significant



67 effect on the formation of less-oxidized oxygenated OA (LO-OOA) and more-oxidized oxygenated
68 OA (MO-OOA) at low levels of atmospheric oxidation capacity in wintertime Baoji, Shaanxi (Wang
69 et al., 2017). However, Xu et al. (2017) demonstrated that the formation of MO-OOA was
70 significantly dominated by the aqueous-phase process, while LO-OOA was closely correlated with
71 the photochemical process in urban Beijing (Xu et al., 2017). These inconsistencies highlight the
72 necessity of studying the role of atmospheric chemical processes in the formation and evolution of
73 different types of SOA.

74 Previous studies have revealed some important factors (e.g., seasonal variation, meteorological
75 factors, and pollution degree) that influence the formation and evolution of PM_{10} in Beijing, based
76 on AMS observations (Hu et al., 2016; Sun et al., 2013b; Sun et al., 2012, Sun et al., 2013a, and
77 Zhang et al., 2014, respectively). Nevertheless, it should be pointed out that as the $PM_{2.5}$
78 concentration decreases, the ozone (O_3) concentration increases year by year (Li et al., 2019b; Zhang
79 et al., 2019). O_3 has become the primary air pollutant in summertime in the NCP and has caused the
80 enhancement of atmospheric oxidation capacity. Therefore, there is an urgent need to investigate
81 the impact of these changes on the atmospheric oxidation capacity and the formation and evolution
82 of PM_{10} . Moreover, it should be noted that most previous AMS observations in Beijing were carried
83 out in urban areas (Duan et al., 2020; Xu et al., 2019b; Wang et al., 2018; Li et al., 2017; Xu et al.,
84 2017; Hu et al., 2016; Zhang et al., 2014; Sun et al., 2013a,b; Sun et al., 2012; Liu et al., 2012;
85 Huang et al., 2010; Sun et al., 2010), while few studies were deployed in suburban areas (Chen et
86 al., 2020; Li et al., 2019a). Considering the different meteorological factors and emission sources,
87 the contribution of different formation and evolution pathways to PM_{10} in urban and suburban areas
88 could be different.



89 In this study, a field observation, mainly using HR-ToF-AMS, was conducted from 25th July to
90 21st August 2019 in a typical suburban site in Daxing District, which is the south gate of Beijing.
91 The observation site lies in the air pollution transport channel between Beijing and Hebei province.
92 Based on the measurement results of a series of gas- and particle-phase monitoring instruments, the
93 chemical composition of NR-PM₁, elemental ratios, and source categories of OA were analyzed.
94 Moreover, the formation and evolution of secondary aerosols were elucidated. Specifically, the
95 effects of atmospheric oxidation capacity, which was characterized using the equivalent
96 photochemical age (t_a), on the formation of secondary aerosols were discussed.

97 **2 Experimental methods**

98 **2.1 Sampling site**

99 The online field observation was carried out in the top floor of a building (9th, ~27 m above
100 the ground) at the Qingyuan campus of Beijing Institute of Petrochemical Technology in Daxing
101 District (39.73°N, 116.33°E) from 25th July to 21st August 2019. The site is located between the 5th
102 ring road and the 6th ring road in the south of Beijing and is a typical suburban site. Additionally,
103 there is no additional source of pollution except for two adjacent streets (i.e., Xinghua Street and
104 Qingyuan Street, with a distance ~600 m).

105 **2.2 Instrumentation**

106 The mass concentration and chemical composition of NR-PM₁ were simultaneously measured
107 by a HR-ToF-AMS (Aerodyne Research Inc. USA). The detailed principles of HR-ToF-AMS can
108 be found elsewhere (DeCarlo et al., 2006). Briefly, the aerosols are sampled through a critical orifice
109 and then concentrated into a narrow beam via an aerodynamic lens. The size of aerosol is determined
110 using the flight time of particles to the thermal vaporization and ionization chamber. Then the



111 aerosols are successively vaporized by a heated surface (~600 °C), ionized by electron ionization
112 (EI, 70 eV), and detected by a mass spectrometer detector. During this field observation, the HR-
113 ToF-AMS was operated under alternation of two modes, i.e., 2 min V mode and 2 min W mode.
114 Meanwhile, routine quality assurance and quality control procedures, mainly including the
115 calibration of inlet flow, ionization efficiency (IE), and aerosol sizing, were carried out regularly
116 every week according to the standard protocols, using pure dry mono-dispersed 300 nm NH₄NO₃
117 aerosols (Chen et al., 2019b; Drewnick et al., 2005) to guarantee the credibility of the HR-ToF-
118 AMS results. The size distribution and number concentration of aerosols with a mobility diameter
119 from 13.6 nm to 736.5 nm were also measured by a custom-built scanning mobility particle sizer
120 (Model 3082 equipped with 3776 CPC, TSI, USA).

121 The gas-phase species including NO_x, NO_y, SO₂, O₃, and CO were measured in real time by a
122 series of Thermo analyzer (Model 42i-TL, Model 42i-NO_y, Model 43i, Model 49i, Model 48i,
123 respectively). The volatile organic compounds (VOCs) (e.g., benzene and toluene) concentrations
124 were measured on-line using a vacuum ultraviolet single-photon ionization time-of-flight mass
125 spectrometer (SPIMS-3000, Guangzhou Hexin Analytical Instrument Co., Ltd., China). These
126 instruments were calibrated periodically with the corresponding standard gas to ensure the accuracy
127 of the observation data. In addition, two Apresys Temperature Humidity Data Loggers (179-UTH,
128 Apresys, USA) were also used to measure the meteorological parameters including temperature (T)
129 and RH.

130 **2.3 Data analysis**

131 **2.3.1 HR-ToF-AMS data analysis**

132 The standard analysis software tool (SQUIRREL, Version 1.57I and PIKA, Version 1.16I)



133 written in Igor Pro (Version 6.37, Wavemetrics Inc., USA) was used to analyze the HR-ToF-AMS
134 data. In order to obtain the quantitative mass concentrations of different species (i.e., OA, SO₄²⁻,
135 NO₃⁻, NH₄⁺, and Cl⁻), and considering that the aerosols were almost neutral and had been dried
136 before entering into the HR-ToF-AMS inlet, the collection efficiency factor (CE) was determined
137 according to the following equation (Middlebrook et al., 2012):

$$138 \quad CE = \max(0.45, 0.0833 + 0.9167 \times ANMF)$$

139 where ANMF is the mass fraction of NH₄NO₃ in NR-PM₁. The default relative ionization efficiency
140 (RIE) values were used for OA (1.4), NO₃⁻ (1.1), and Cl⁻ (1.3) (Jimenez et al., 2003). As for NH₄⁺
141 and SO₄²⁻, their RIE values were determined using the pure dry mono-dispersed NH₄NO₃ and
142 (NH₄)₂SO₄ aerosols to be 4.0 and 1.2, respectively.

143 Elemental analysis (EA) was also executed using the “Improved-Ambient” method
144 (Canagaratna et al., 2015) to obtain the hydrogen-to-carbon ratio (H/C), oxygen-to-carbon ratio
145 (O/C), and organic-mass to organic-carbon ratio (OM/OC), as well as elemental ratios of N/C and
146 S/C. The average carbon oxidation state (OS_c) can be approximated by 2×O/C-H/C and is a metric
147 describing the oxidation degree of atmospheric OA (Kroll et al., 2011).

148 2.3.2 PMF analysis of OA

149 Source apportionment of OA was executed using the PMF model to analysis the HR-ToF-AMS
150 mass spectral data to identify the main organic components and their sources (Zhang et al., 2011).
151 PMF, as a bilinear receptor model, can be expressed as the following equation (Paatero, 1997;
152 Paatero and Tapper, 1994):

$$153 \quad \mathbf{X} = \mathbf{GF} + \mathbf{E}$$

154 where \mathbf{X} is the observed data matrix with dimensions of $n \times m$. \mathbf{G} is the factor contribution matrix
155 of dimensions $n \times p$, \mathbf{F} is the factor profile matrix of dimensions $p \times m$, and \mathbf{E} is the matrix of



156 residuals with dimensions of $n \times m$. n , m , and p are the number of samples, species, and factors,
157 respectively.

158 A least-squares fitting method was used to minimize the object function Q , which is defined as
159 the sum of the squared residuals (e_{ij}) weighted by their degree of measurement uncertainty (σ_{ij}).

$$160 \quad Q = \sum_{i=1}^n \sum_{j=1}^m (e_{ij} / \sigma_{ij})^2$$

161 In our study, the PMF software tool (PMF Evaluation Tool, PET, version 2.06) (Ulbrich et al.,
162 2009) written in Igor Pro (Version 6.37, Wavemetrics Inc., USA) was used to analyze the HR-ToF-
163 AMS mass spectra (m/z 12-170). The detailed steps have been expressed in Zhang et al. (2011).
164 According to the values of the signal-to-noise ratios (SNR), m/z with SNR in a range of 0.2-2 were
165 weak variables and down-weighted 2 times, and m/z with SNR less than 0.2 were bad variables and
166 directly removed. As for duplicate information, m/z 44 (CO_2) and related m/z values (including 16
167 (O), 17 (HO), 18 (H_2O), and 28 (CO)) were also down-weighted. Then PMF was run for a range of
168 number of factors (from 1 to 5) and rotational parameters (FPEAK) (from -1 to 1 with a step of 0.2).
169 After considering multiple criteria, including mass spectral features, diurnal patterns, correlation
170 with external tracers, and temporal variations (Zhang et al., 2011), the best number of factors was
171 determined to be 4, including one hydrocarbon-like OA (HOA) and three oxygenated organic
172 aerosol factors (LO-OOA, SV-OOA and MO-OOA). The corresponding mass spectra, time series,
173 and diurnal variation, which are similar to our previous results observed in the same site during
174 summertime 2018 (Chen et al., 2020), are given in Fig. S1.

175 **2.3.3 Photochemical age**

176 In the ambient air, the reaction of benzene and toluene with O_3 and NO_3 radicals is very slow,
177 with reaction rate on the order of $<10^{-20}$ and $<10^{-16} \text{ cm}^3 \text{ molecule}^{-1} \text{ s}^{-1}$, respectively (Atkinson and



178 Arey, 2003), which is significantly lower than the reaction rate with OH radicals (10^{-12} cm³
179 molecule⁻¹ s⁻¹). Thus, their degradation is dominated by reaction with OH radicals. Meanwhile, the
180 reaction rate of toluene with OH radicals is about five times that of benzene. Therefore, their
181 degradation rates in the ambient air are significantly different after being exhausted from an
182 emission source, which would lead to an observable change in their concentration ratio.
183 Consequently, the ratio of toluene to benzene is typically used to study the photochemical aging
184 process of localized air masses (Yuan et al., 2012; Parrish et al., 2007; de Gouw et al., 2005;
185 Gelencsér et al., 1997; McKeen et al., 1996).

186 In this study, the equivalent photochemical age (t_a) was calculated to characterize the OH
187 exposure dose of the air mass, as expressed in the following equation:

$$188 \quad t_a = \frac{1}{[\text{OH}](k_{\text{toluene}} - k_{\text{benzene}})} \times \left[\ln\left(\frac{[\text{toluene}]}{[\text{benzene}]}\right) - \ln\left(\frac{[\text{toluene}]_0}{[\text{benzene}]_0}\right) \right]$$

189 where [OH] is the average OH concentration in the ambient air and is assumed as 5.2×10^6 molecule
190 cm⁻³, which was the average daytime ambient OH concentration observed in summer of Beijing
191 (Yang et al., 2017). k_{toluene} and k_{benzene} are the rate constants for the reactions of OH with toluene
192 (5.63×10^{-12} cm³ molecule⁻¹ s⁻¹) and benzene (1.22×10^{-12} cm³ molecule⁻¹ s⁻¹), respectively
193 (Atkinson and Arey, 2003). $\left(\frac{[\text{toluene}]}{[\text{benzene}]}\right)_0$ is the emission concentration ratio of toluene and
194 benzene before aging in the atmosphere, and was determined to be 3.3 (Fig. S2, in the Supplement).

195 $\frac{[\text{toluene}]}{[\text{benzene}]}$ is the measured concentration ratio of toluene and benzene, which is given in Fig. S3a.

196 The diurnal variation of calculated t_a (Fig. S3b) followed a similar diurnal trend of OH radicals
197 observed in summertime of Beijing, which had a higher level at noon (Tan et al., 2019). Therefore,
198 this method can provide useful information on the photochemical process in the atmosphere (Yuan



199 et al., 2012; Parrish et al., 2007; de Gouw et al., 2005; McKeen et al., 1996).

200 **3 Results and discussion**

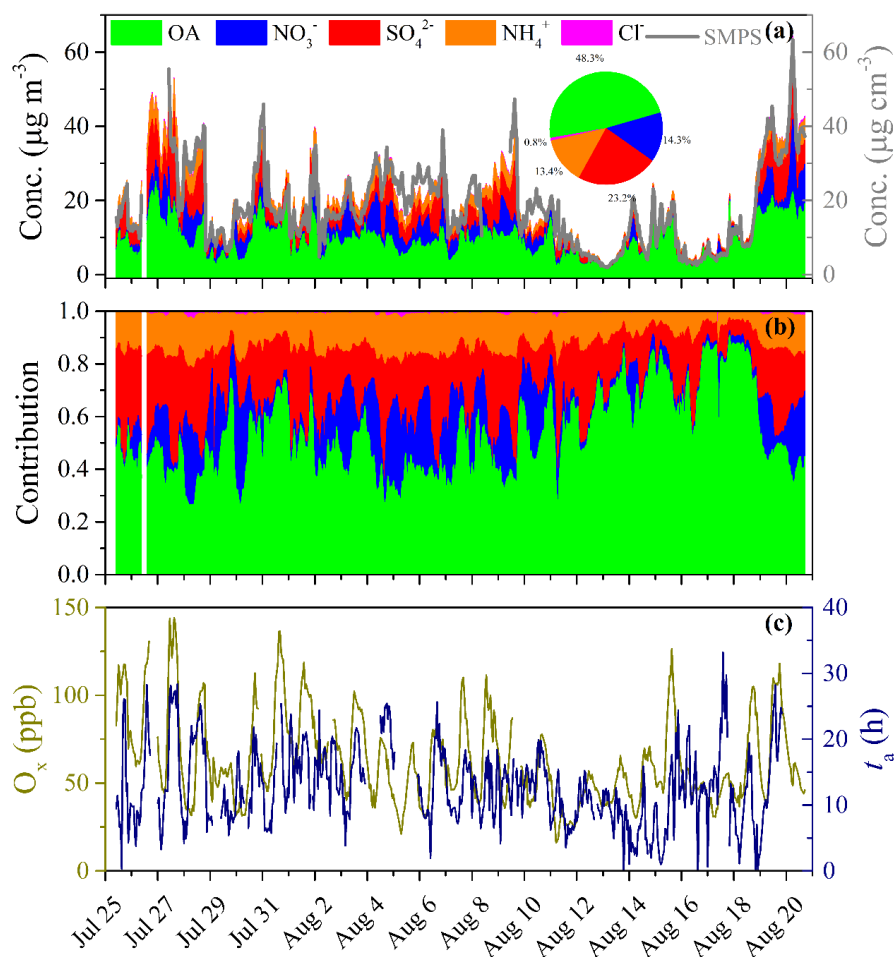
201 **3.1 Chemical compositions of PM₁**

202 The time series of mass concentrations of NR-PM₁ species (i.e., OA, NO₃⁻, SO₄²⁻, NH₄⁺, and
203 Cl⁻) and their relative contributions are summarized in Fig. 1. During this field observation, the
204 hourly mass concentrations of NR-PM₁ was in the range of 2.2-64.3 μg m⁻³, with an average of 19.3
205 ± 11.3 μg m⁻³, which is close to those observed in a suburb of Beijing in summer 2016 (14.2 ± 9.4
206 μg m⁻³, Li et al., 2019a) and summer 2018 (24.1 ± 18.0 μg m⁻³, Chen et al., 2020). However, this
207 averaged PM₁ concentration was much lower than those observed in urban Beijing in summertime,
208 such as 80 ± 40.6 μg m⁻³ in 2006 (Sun et al., 2010), 63.1 μg m⁻³ in 2008 (Huang et al., 2010), 50 ±
209 30 μg m⁻³ in 2011 (Sun et al., 2012), and 37.5 ± 31.0 μg m⁻³ in 2012 (Hu et al., 2017). Meanwhile,
210 among all species in NR-PM₁, OA contributed the most (48.3%), indicating the dominant role of
211 OA in summertime PM₁ pollution (Chen et al., 2020; Hu et al., 2016; Sun et al., 2015; Zhang et al.,
212 2014). Moreover, the largest daily contribution of OA (> 80%) was observed during the clean period,
213 with PM₁ concentration less than 20 μg m⁻³ (e.g., from 16th August to 18th August 2019, Fig. 1b).
214 With further improvement in air quality, PM₁ concentrations would decrease in the future. Then, the
215 contribution of OA in PM₁ is likely to increase. On the other hand, SIA accounted for 51.7% of NR-
216 PM₁, in which SO₄²⁻ was the largest contributor (23.2%), followed by NO₃⁻ (14.3%), NH₄⁺ (13.4%),
217 and Cl⁻ (0.8%). Similar relative contributions of these species were also observed in a suburb of
218 Beijing in summer 2016, where OA contributed a mass fraction of 42-71%, followed by SO₄²⁻ (15-
219 27%), NO₃⁻ (6-22%), NH₄⁺ (8-13%), and Cl⁻ (0.3-0.6%) (Li et al., 2019a). By comparison, NR-PM₁
220 in urban Beijing in summertime had relatively low contribution of OA (33-40%) and high



221 contribution of SIA (58-65%) (Hu et al., 2017; Sun et al., 2012; Huang et al., 2010; Sun et al., 2010),
222 which may be due to the difference in the emissions of gaseous precursors (e.g., SO₂ and NO_x) and
223 their conversion ratio to SIA (Li et al., 2020; Hu et al., 2017). Meanwhile, the inorganic SO₄²⁻, NO₃⁻,
224 and Cl⁻ could be well neutralized by NH₄⁺ during this field observation since there is an extremely
225 good linear relationship between NO₃⁻+2×SO₄²⁻+Cl⁻ and NH₄⁺ ($R^2 = 0.998$, slope = 0.992 ± 0.002 ,
226 Fig. S4, in the Supplement). This implied the significant contribution of gaseous NH₃ to the
227 formation of SIA and PM_{2.5}. Therefore, NH₃ emission control in China should be strengthened in
228 the future to mitigate PM pollution (Liu et al., 2019b).

229 Figure 1 also presents the time series of total oxidant ($O_x = O_3 + NO_2$) and photochemical age
230 (t_a). In this study, t_a and O_x can be used to characterize the photochemical aging process undergone
231 and the total oxidant present in the ambient atmosphere, respectively. As shown in Fig. 1c, t_a showed
232 a similar evolutionary trend to that of O_x during this summertime observation, which is consistent
233 with the formation process of photochemical smog in the presence of NO_x, VOCs, and sunlight. It
234 is well known that the photochemical aging process of VOCs can enhance the formation of organic
235 peroxy radical (RO₂) and hydroperoxy (HO₂), which will then accelerate the cycle of NO_x and the
236 formation of O₃ in the atmosphere. Consequently, longer aging time (t_a) always corresponds to a
237 higher concentration of O₃ and stronger atmospheric oxidation during summertime.



238

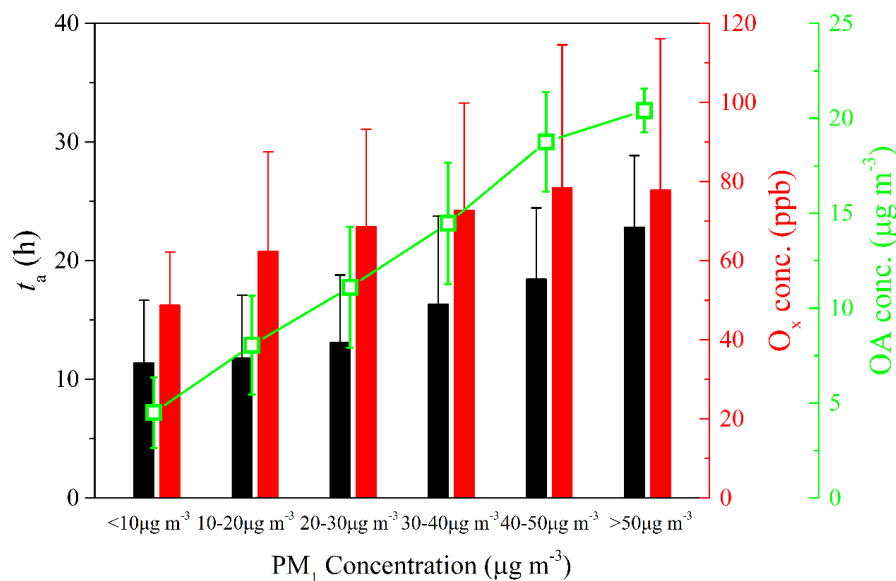
239 Figure 1. Overview of time series of (a) concentrations of NR-PM₁ species derived from HR-ToF-
240 AMS (left y axis) and SMPS (right y axis), (b) relative contributions of NR-PM₁ species, and (c)
241 concentration of total oxidant (O_x = O₃ + NO₂) and photochemical age (t_a) during this field
242 observation.

243 3.2 Role of t_a in aerosol formation and composition

244 In order to evaluate the effect of the photochemical aging process on PM₁ concentrations, the
245 relationships among t_a, O_x, OA concentration, and binned PM₁ concentration were analyzed and
246 shown in Fig. 2. Both t_a and O_x simultaneously rose with the increasing concentration of PM₁. This



247 suggested that the photochemical aging process was closely related to the PM pollution level, and
248 that the photochemical process becomes more intensive with the increase of VOCs and O_x at higher
249 PM₁ concentrations. In addition, the similar evolutionary trends of t_a and O_x during this summertime
250 observation further confirmed that they are closely correlated. Meanwhile, with the increase in t_a ,
251 concentrations of PM₁ and O₃ increased simultaneously (Fig. S5, in the Supplement), which
252 indicated that the formation of PM₁ and O₃ were both positively correlated with the photochemical
253 aging process during this summer observation. One reason is that high temperature observed at
254 elevated t_a levels (Fig. S6) increases the emission rates of biogenic VOCs (Fu et al., 2010), which
255 could promote the formation of O₃ and PM₁ (Li et al., 2019c; Schnell and Prather, 2017).
256 Considering that the concentration of NO_x decreased with increasing t_a (Fig. S6), this implied that
257 the formation of O₃ is in the VOC-sensitive regime during this observation. Under this condition,
258 increased VOCs will enhance the reactions between VOCs and OH, resulting in high production of
259 RO₂ and O₃ locally (Li et al., 2018b). The concentration of OA also persistently increased with t_a ,
260 which was consistent with the fact that SOA (predominant species in OA) mainly originated from
261 the photochemical process of VOCs (Fan et al., 2020; Fu et al., 2014; Hallquist et al., 2009). Higher
262 production of RO₂ will be beneficial to the formation of low volatility species and new particle
263 formation (NPF) (Garmash et al., 2020; Tröstl et al., 2016), and then promote the formation of SOA
264 through gas-particle partitioning (Odum et al., 1996). These results implied that the formation and
265 evolution of PM pollution as well as OA was greatly dependent on the photochemical aging process
266 and total oxidant present during the summertime, which need to be deeply explored to understand
267 the growth of PM₁.



268

269 Figure 2. Relationship between PM₁ concentration and photochemical age (t_a), total oxidant (O_x),
270 as well as OA concentration during this field observation. The data are binned according to PM₁
271 concentration (10 $\mu\text{g m}^{-3}$ increment).

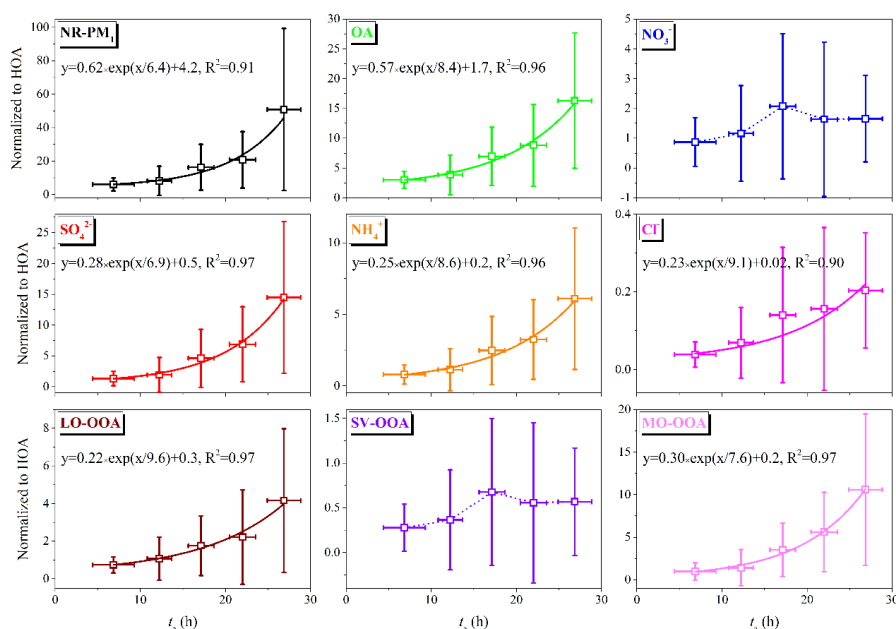
272 To further investigate the role of t_a in aerosol formation, all NR-PM₁ species and OA factors
273 were normalized to HOA to exclude the accumulation and/or dilution effects in the atmosphere, and
274 the corresponding ratios as a function of t_a are given in Fig. 3. Although the HOA emissions vary
275 throughout the day and might bring some uncertainty, Sun et al. (2013a) indicated that this
276 uncertainty might be reduced and become insignificant when these databases are averaged (as a
277 function of t_a in this study). The normalized ratios of all NR-PM₁ species positively increased as a
278 function of t_a with different increase rates. At low t_a levels (< 15 h), relatively small ratios of all
279 species could be observed, and all ratios showed a slight increase trend. However, at $t_a = 20\text{-}30$ h,
280 the normalized concentration of total NR-PM₁, OA, SO_4^{2-} , and NH_4^+ increased by a factor of > 5
281 compared with that at low t_a levels (< 15 h). This indicated that these species were susceptible to



282 photochemical aging processes in the summer, with strong solar radiation. Exponential fitting ($y =$
283 $A \times \exp(x/B) + C$) was applied to quantitatively describe the relationship between these species and
284 t_a , as given in Fig. 3. The fitting parameter B could be used to characterize the sensitivity of each
285 species to the increase of t_a , while smaller B means more sensitivity to t_a . According to the fitting
286 results, the formation of NR-PM₁ was most sensitive to t_a , followed by SO₄²⁻, OA, and NH₄⁺ in
287 sequence. Their average increase rates in absolute mass concentration (Fig. S7) showed the same
288 trend as the normalized ratios in Fig. 3. The average increase rate of SO₄²⁻ was the largest (0.4 μg
289 m⁻³ per hour) among NR-PM₁ species, while that of NR-PM₁ was 0.8 μg m⁻³ per hour. These results
290 also suggested that the photochemical aging process plays an important role in SO₄²⁻ formation in
291 summertime (Li et al., 2020). Previous studies have revealed that an aqueous-phase process plays
292 an important role in SO₄²⁻ formation (Sun et al., 2015; Sun et al., 2013a). However, it appears that
293 photochemical oxidation was the primary pathway of SO₄²⁻ formation in the present summertime
294 observation, as seen in the t_a - and RH-dependent distributions of SO₄²⁻ (Fig. S8). Both the SO₄²⁻
295 mass concentration and its proportion in PM₁ were highly dependent on t_a rather than RH. The
296 similar evolution trends of NH₄⁺ and SO₄²⁻ suggested that NH₄⁺ mainly existed in the form of
297 (NH₄)₂SO₄ (apart from NH₄NO₃ and NH₄Cl), which could be supported by the relative contributions
298 of these SIA species during this field observation (see Section 3.1). The formation of Cl⁻ was also
299 boosted with increasing t_a , similar to that of NH₄⁺, which confirmed the combination Cl⁻ with NH₄⁺
300 in the form of NH₄Cl (Chen et al., 2020). As for NO₃⁻, the corresponding ratio first increased and
301 then slightly decreased as t_a increased, which was similar to the evolution trend of absolute mass
302 concentration (Fig. S7). It was worth noting that the concentration of NO_x decreased with increasing
303 t_a (Fig. S6), suggesting the photochemical oxidation of NO_x to HNO₃ or NO₃⁻. This was in agreement



304 with the observation of high concentrations of NO_z ($\text{NO}_z = \text{NO}_y - \text{NO}_x$) at elevated t_a levels (Fig.
305 S6). Meanwhile, high temperature accompanied high levels of t_a (Fig. S6), which could cause the
306 evaporation of NO_3^- or adsorbed HNO_3 into the gas phase (Xu et al., 2019a). As demonstrated by
307 the t_a - and RH-dependent distributions of NO_3^- (Fig. S8), the aqueous-phase process made a
308 significant contribution to the formation of NO_3^- (Duan et al., 2020).



309
310 Figure 3. Variations of the ratios of mass concentrations of NR-PM₁ species and OA factors to HOA
311 as a function of t_a . The data are binned according to the value of t_a (5 h increment). The solid lines
312 are the results of exponential fitting with the function of $y = A \times \exp(x/B) + C$.

313 Regarding the OA factors, they exhibited different dependence on t_a as presented in Fig. 3.
314 Among these four OA factors, MO-OOA was most affected by the increase in t_a , with a factor of
315 ~ 10 compared with that at low t_a levels (< 15 h). The enhancement factor of LO-OOA with increased
316 t_a was ~ 6 , which might be due to its lower oxidation state ($\text{OSc} = -0.34$) than that of MO-OOA (OSc
317 $= -0.23$). These results are consistent with the exponential fitting parameter B of MO-OOA and LO-



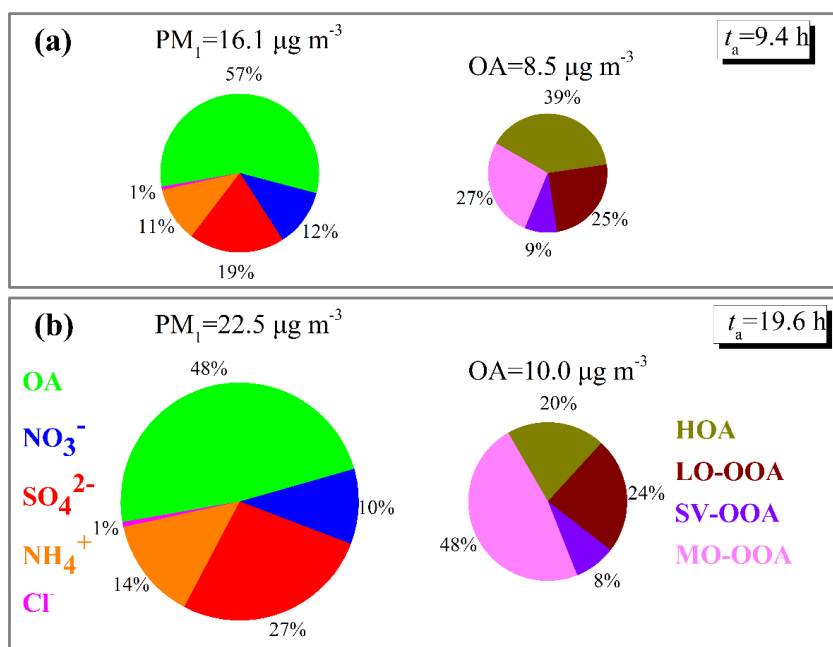
318 OOA in Fig. 3. The average increase rate of MO-OOA ($0.3 \mu\text{g m}^{-3}$ per hour) was also significantly
319 larger than that of LO-OOA, with a factor of ~ 7 . As for SV-OOA, t_a exhibited a slight enhancement
320 effect, suggesting that photochemical aging may be not its main formation pathway. In contrast, the
321 normalized concentration of SV-OOA and its contribution to PM_{10} significantly depended on RH
322 (Fig. S9), which was consistent with the results of Herrmann et al. (2015).

323 Figure 4 shows the averaged contributions of NR- PM_{10} species and OA factors at low and high
324 t_a levels. The average mass concentration of NR- PM_{10} at $t_a > 15$ h was $22.5 \mu\text{g m}^{-3}$, which was 1.4
325 times of that at $t_a < 15$ h. All NR- PM_{10} species were enhanced in mass concentration by a factor of
326 more than 1.1 at elevated t_a , of which SO_4^{2-} had the largest enhancement factor of 2.1. OA was the
327 dominant species in NR- PM_{10} at both t_a levels, although its percentage decreased from 57% to 48%
328 with the increase of t_a . This decreased percentage could be attributed to the significantly decreased
329 contribution of HOA (from 39% to 20%) with the enhancement of t_a , suggesting that the
330 photochemical aging process was not conducive to the accumulation of HOA. Comparing the
331 contribution of other species to NR- PM_{10} at low and high t_a levels, it was found that the contribution
332 of NO_3^- presented a decreasing trend (from 12% to 10%) as t_a increased, which could be attributed
333 to the lower concentration of NO_x , higher temperature and lower RH, as mentioned above. The
334 contribution of Cl^- did not change with t_a level. The contributions of SO_4^{2-} and NH_4^+ were enhanced
335 from 19% to 27% and 11% to 14%, respectively as t_a increased from 9.4 h to 19.6 h, which
336 confirmed that the formation of SO_4^{2-} greatly benefited from the photochemical process, and that
337 NH_4^+ mainly existed in the form of $(\text{NH}_4)_2\text{SO}_4$ during this summertime observation.

338 The OA factors also presented different change trends and different compositions at high t_a
339 levels compared with those at low t_a levels. The OOA accounted for more than half of OA, and



340 showed much higher contribution at high t_a levels than at low t_a levels (61% vs. 80%). Among them,
341 MO-OOA showed the largest enhancement, by a factor of 2.0 from 2.6 to 5.2 $\mu\text{g m}^{-3}$ in absolute
342 mass concentration, and a factor of 1.8 from 27% to 48% in relative contribution, indicating the
343 importance of MO-OOA in PM_{10} pollution at elevated t_a during the summertime. The contributions
344 of LO-OOA and SV-OOA were almost equal ($\sim 24\%$ and $\sim 8\%$, respectively) between low and high
345 t_a levels, while the absolute mass concentrations were enhanced by a factor of >1.1 at high t_a levels.
346 On the contrary, the absolute mass concentration of HOA decreased from 3.3 to 1.8 $\mu\text{g m}^{-3}$ during
347 high t_a periods, indicating a negative effect of t_a on the accumulation of HOA.

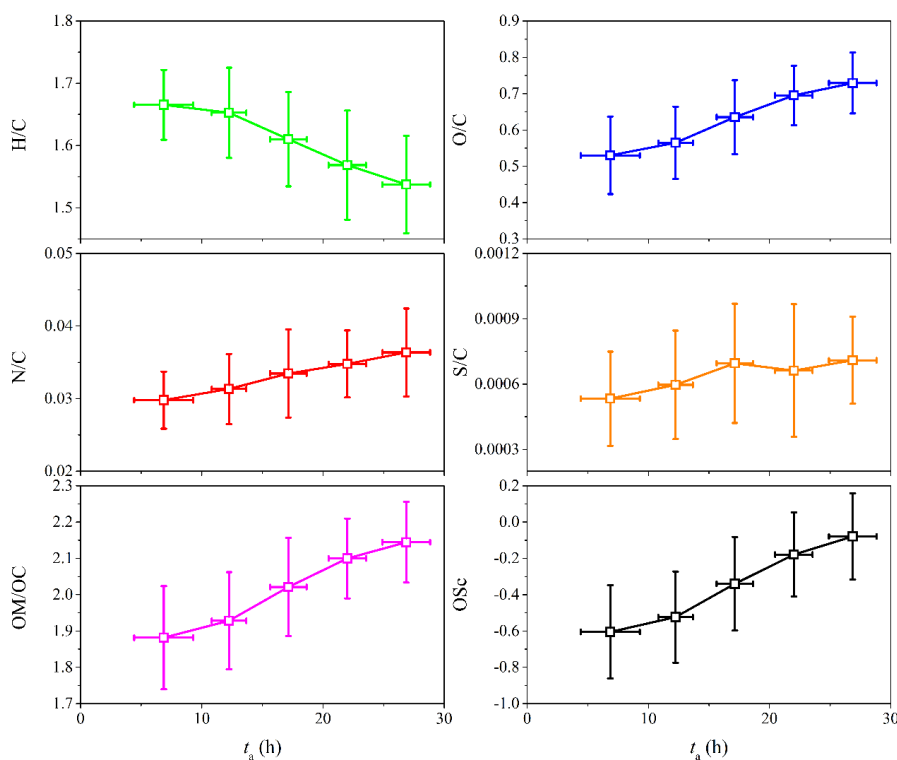


348
349 Figure 4. Different chemical compositions of NR- PM_{10} and OA factor contributions during the (a)
350 low t_a (< 15 h) period, and (b) high t_a (> 15 h) period. The displayed PM_{10} , OA, and t_a are averages
351 of values during the corresponding period.



352 **3.3 Role of t_a in OA evolution**

353 The role of t_a in the evolution of OA during the summertime was further examined. Fig. 5
354 shows the variations of H/C, O/C, N/C, S/C, OM/OC, and OSc as a function of t_a . All these
355 parameters except H/C increased with the increase of t_a . The decrease of H/C was related to the
356 decreased contribution of HOA (Fig. 4), since HOA had the highest H/C among these four OA
357 factors (Fig. S1). In contrast to H/C, O/C and OM/OC increased from 0.53 to 0.73 and 1.88 to 2.14
358 with the increase of t_a , respectively. Moreover, a high correlation coefficient between OM/OC and
359 O/C was observed ($R^2 = 0.997$, Fig. S10, in the Supplement). These results suggest that OA was
360 highly oxidized due to the progress of atmospheric photochemical aging. Meanwhile, the analogous
361 variation between OSc and O/C confirmed the high oxidation state of OA, since both are metrics of
362 the oxidation degree of OA (Kroll et al., 2011). As for the variation of N/C and S/C, they presented
363 a slight increase trend with the increase in t_a . This indicated that photochemical processes could
364 contribute to the formation of N-containing and S-containing organics, which is consistent with
365 previous smog chamber simulations in the laboratory (Chen et al., 2019c,d).



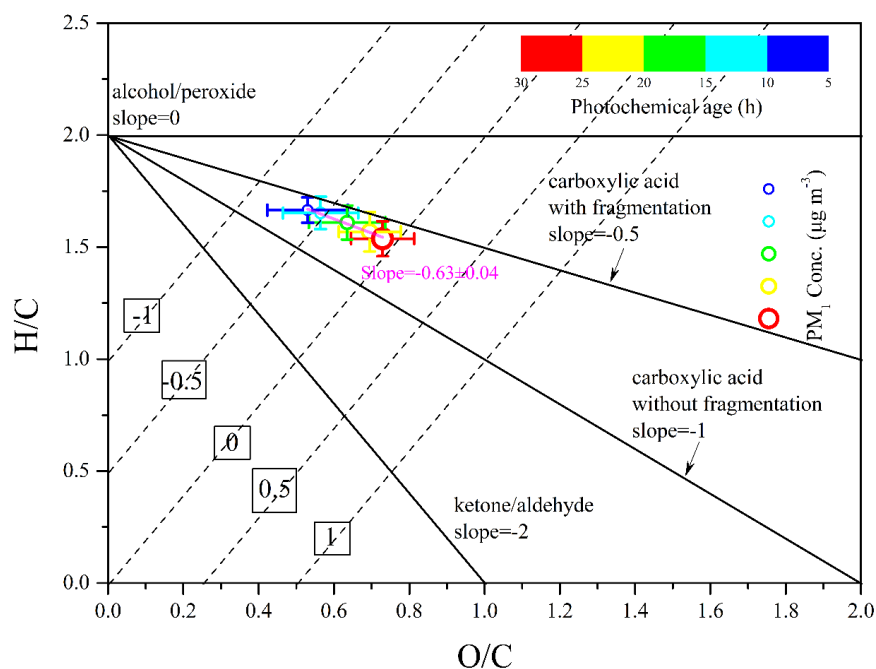
366

367 Figure 5. Variations of H/C, O/C, N/C, S/C, OM/OC and OSc as a function of t_a . The data are binned
368 according to the value of t_a (5 h increment).

369 The binned H/C and O/C as a function of t_a are given in Fig. 6. The fitted slope of -0.63 is
370 similar to those reported in both field observations and laboratory simulations on the photochemical
371 aging of anthropogenic primary OA or biomass burning OA (Chen et al., 2015). This slope can be
372 obtained by a combination of the simultaneous addition of both alcohol (slope = 0) and carbonyl
373 (slope = -2) functional groups, or the addition of carboxylic acid with (slope = -0.5) and without
374 (slope = -1) fragmentation (Peng et al., 2016; Chen et al., 2015; Ng et al., 2011; Heald et al., 2010).
375 Additionally, as t_a increased, the OA evolved from the left top region to the right bottom region of
376 the Van Krevelen diagram, accompanied by a decrease in H/C and increase in O/C. This further
377 indicated that the evolution process of OA was from less oxidized to more aged as the atmospheric



378 photochemical aging progressed, leading to higher PM₁ concentrations.



379

380 Figure 6. Van Krevelen diagram during this field observation. The data are binned according to the
381 value of t_a (5 h increment) and color coded by t_a . The elemental composition of OA was fitted with
382 a slope of -0.63 ($R^2 = 0.98$).

383 4 Conclusions

384 In this study, a summertime field observation mainly based on the Aerodyne HR-ToF-AMS
385 was carried out to characterize NR-PM₁ in a southern suburb of Beijing from 25th July to 21st August
386 2019. The role of photochemical age (t_a) in aerosol formation and composition was analyzed. During
387 this period, the averaged NR-PM₁ concentration was $19.3 \pm 11.3 \mu\text{g m}^{-3}$; of NR-PM₁, OA was the
388 dominant species (48-57%), followed by SO_4^{2-} (19-27%), NO_3^- (10-12%) at different t_a levels.
389 Higher PM₁ concentrations were observed at longer t_a . Meanwhile, with the increase of t_a , the
390 normalized ratios of NR-PM₁ species and OA factors to HOA were greatly enhanced by a factor



391 of >5 , especially for OA, SO_4^{2-} , and MO-OOA. The total NR- PM_{10} presented the largest average
392 increase rate of $0.8 \mu\text{g m}^{-3}$ per hour, followed by SO_4^{2-} ($0.4 \mu\text{g m}^{-3}$ per hour) and MO-OOA ($0.3 \mu\text{g}$
393 m^{-3} per hour). As t_a increased from 9.4 h to 19.6 h, the relative contribution of MO-OOA presented
394 the most obvious promotion from 27% to 48%, suggesting the significance of more-oxidized OA,
395 which mainly originates from the photo-oxidation of VOCs, in PM_{10} pollution during the
396 summertime with strong solar radiation. The evolution of OA was also greatly affected by t_a ,
397 decreased H/C and increased O/C could be found as t_a increased, along with the larger OSc and
398 OM/OC, indicating that OA went from less oxidized to more aged with the progression of
399 atmospheric photochemical aging, further leading to the higher PM_{10} concentration. Our results
400 suggested that the atmospheric photochemical aging process is a crucial factor resulting in the PM_{10}
401 pollution in summertime, especially for the formation and evolution of SOA. Previous studies have
402 indicated that NO_x is a highly active species and has a great effect on the source of the main oxidants
403 (e.g., OH, O_3 , and NO_3) (Seinfeld and Pandis, 2016). Therefore, NO_x and VOCs, mainly from
404 vehicle-related emissions (Liu et al., 2019a; Qin et al., 2017), should be strictly controlled to lower
405 the atmospheric oxidation capacity characterized by OH exposure dose to further ease the PM
406 pollution in summertime.

407 Considering there would be differences in the formation and evolution of PM_{10} between
408 different seasons, and few field observations have been conducted in suburban areas of Beijing,
409 further works should be carried out to shed light on the seasonal variations of PM_{10} and their
410 formation and evolution mechanisms in different seasons in suburban areas. Additionally, the
411 detailed role of photochemical age (t_a) in the formation of the secondary gaseous pollutant O_3 , as
412 well as their relationship in different seasons, should also be of concern because O_3 has become the



413 primary air pollutant, especially in summertime.

414 **Declarations of interest**

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

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423 **Supplement**

424 Supplementary data to this article can be found online.

425 **Author contributions**

426 HH, YM, YL, and QM designed this filed observation. TC, JL, and QM conducted the
427 measurements and data analyses. TC, JL, QM, BC, PZ, CZ, and YL interpreted and discussed the
428 data results. TC wrote the paper with input from all coauthors. All authors contributed to the final
429 paper.

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