



1 **High secondary formation of nitrogen-containing organics (NOCs) and its**
2 **possible link to oxidized organics and ammonium**

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19 **Highlights**

- 20 ● Nitrogen-containing organics (NOCs) were highly internally mixed with photochemically
21 produced secondary oxidized organics
- 22 ● More than 50% of NOCs were well predicted by secondary formation from these
23 oxidized organics and ammonium
- 24 ● Higher relative humidity and particle acidity facilitated the formation of NOCs



25 **Abstract**

26 Nitrogen-containing organic compounds (NOCs) substantially contribute to light
27 absorbing organic aerosols, although the atmospheric processes responsible for the secondary
28 formation of these compounds are poorly understood. In this study, seasonal atmospheric
29 processing of NOCs were investigated by single particle mass spectrometry in urban
30 Guangzhou from 2013-2014. The relative abundance of NOCs was found to be strongly
31 enhanced by internal mixing with the photochemically produced secondary oxidized organics
32 (such as formate, acetate, pyruvate, methylglyoxal, glyoxylate, oxalate, malonate and
33 succinate). Furthermore, the co-occurrence of NOCs with ammonium was also observed.
34 Interestingly, the relative abundance of NOCs was inversely correlated with ammonium, while
35 their number fractions were positively correlated. Multiple linear regression analysis and
36 positive matrix factorization analysis were performed to predict the relative abundance of NOCs
37 generated from oxidized organics and ammonium. Both results showed close associations ($R^2 >$
38 0.7 , $p < 0.01$) between the predicted NOCs and the observed values. Increased humidity and
39 higher particle acidity were found to promote the production of NOCs. Higher relative
40 contributions of NOCs were observed in summer and autumn, in comparison to spring and
41 winter, due to the relatively higher contribution of oxidized organics and $\text{NH}_3/\text{NH}_4^+$ in summer
42 and autumn periods. To the best of our knowledge, this is the first direct field observation study
43 establishing a close association between NOCs and both oxidized organics and ammonium.
44 These findings have substantial implications on the role of ammonium in the atmosphere,
45 particularly in models predicting the evolution and deposition of NOCs.



46

47 **Keywords:** nitrogen-containing organic compounds, individual particles, oxidized organics,

48 ammonium, mixing state, single particle mass spectrometry



49

50 **1 Introduction**

51 Organic aerosols that strongly absorb solar radiation are referred to as brown carbon
52 (BrC), capable of a comparable level of light absorption in the spectral range of near-
53 ultraviolet (UV) light as black carbon (Andreae and Gelencser, 2006; Feng et al., 2013; Yan
54 et al., 2018). Nitrogen-containing organic compounds (NOCs) represent a large and
55 complicate fraction of atmospheric aerosols, significantly contributing to the pool of BrC
56 (Feng et al., 2013; Mohr et al., 2013; Li et al., 2019). Furthermore, NOCs have a major effect
57 on atmospheric chemistry, human health and climate forcing (Noziere et al., 2015;
58 Kanakidou et al., 2005; Shrivastava et al., 2017; De Gouw and Jimenez, 2009). The nitrogen
59 component of NOCs accounts for a large fraction of total airborne nitrogen (~30%), although
60 the proportion exhibits a high level of variability temporally and spatially and therefore has
61 an influence on both regional and global N deposition (Neff et al., 2002; Shi et al., 2010;
62 Cape et al., 2011). However, the sources, evolution and optical properties of NOCs remain
63 unclear and contribute significantly to uncertainties in the estimation of their impacts on the
64 environment and climate (Laskin et al., 2015; Feng et al., 2013).

65 NOCs are ubiquitous components of atmospheric aerosols, cloud water and rainwater
66 (Altieri et al., 2009; Desyaterik et al., 2013; Laskin et al., 2015), spanning a wide range of
67 molecular weights, structures and light absorption properties (Lin et al., 2016). Emissions of
68 primary NOCs have been attributed to biomass burning, coal combustion, vehicle emissions,
69 biogenic production and soil dust (Laskin et al., 2009; Desyaterik et al., 2013; Sun et al.,



2017; Mace et al., 2003; Rastogi et al., 2011; Wang et al., 2017). Growing evidence from laboratory studies suggest that the production pathways for secondary NOCs in gas phase, aerosol, and clouds. Maillard reactions involving mixtures of atmospheric aldehydes (e.g., methylglyoxal/glyoxal) and ammonium/amines are of particular interests (e.g., Hawkins et al., 2016; De Haan et al., 2017; De Haan et al., 2011). Similarly, a significant portion of NOCs may also be derived from the heterogeneous ageing of secondary organic aerosol (SOA) with NH_3 / NH_4^+ (Liu et al., 2015; Laskin et al., 2015). Mang et al. (2008) proposed that even trace levels of ammonia may be sufficient to form NOCs via this pathway. In addition, gas phase formation of NOCs through interaction between volatile organic hydrocarbons and NO_x and other oxidations, followed by condensation may also have potential contribution (Fry et al., 2014; Stefenelli et al., 2019; Lehtipalo et al., 2018).

The secondary formation of NOCs is especially prevalent in environments experiencing high anthropogenic emissions (Yu et al., 2017; Ho et al., 2015), although further studies are required to comprehensively establish the formation mechanisms. A major obstacle is that organic and inorganic matrix effects have a profound impact on the chemistry of organic compounds in bulk aqueous particles and particles undergoing drying (El-Sayed et al., 2015; Lee et al., 2013). While real-time characterization studies remain a challenge due to the extremely complex chemical nature of NOCs, establishing this data along with the co-variation of NOCs with other chemical components would help to identify the sources and evolution of NOCs. Using single-particle aerosol time-of-flight mass spectrometry, Wang et al. (2010) observed that the widespread occurrence of NOCs was closely correlated with



91 particle acidity in the atmosphere of Shanghai (China). In addition, real-time measurements
92 of the atmosphere in New York (US) by aerosol mass spectrometry, indicated a positive link
93 between the age of organic species and the N/C ratio (Sun et al., 2011). Further in-depth
94 studies are required to identify the role of formation conditions (e.g., relative humidity (RH)
95 and pH) for secondary NOCs (Aiona et al., 2017; Nguyen et al., 2012). In present study, the
96 mixing state of individual particles were investigated, involving NOCs, oxidized organics
97 and ammonium, based on in-line seasonal observations using single particle aerosol mass
98 spectrometry (SPAMS). These findings show that the formation of NOCs was significantly
99 linked to oxidized organics and NH_4^+ , which ought to have important environmental
100 implications for the impact and fate of these compounds.

101

102 **2 Methods**

103 **2.1 Field measurements**

104 Sampling was performed at the Guangzhou Institute of Geochemistry, a representative
105 urban site in Guangzhou (China), a megacity in the Pearl River Delta (PRD) region. SPAMS
106 analysis was performed (Hexin Analytical Instrument Co., Ltd., China) to establish the size
107 and chemical composition of individual particles in real-time (Li et al., 2011). The sampling
108 inlet for aerosol characterization was situated 40 meters above the ground level. A brief
109 description of the performance of SPAMS and other instruments can be found in the
110 Supporting Information. The sampling periods covered four seasons including spring (21/02
111 to 11/04 2014), summer (13/06 to 16/07 2013), autumn (26/09 to 19/10 2013) and winter



112 (15/12 to 25/12 2013). The total measured particle numbers and mean values for
113 meteorological data and gaseous pollutants, are outlined for each season in Table S1 and
114 were described in a previous publication (Zhang et al., 2019).

115

116 2.2 SPAMS data analysis

117 Fragments of NOCs were identified according to detection of ion peaks at m/z -26 $[\text{CN}]^-$
118 or -42 $[\text{CNO}]^-$, generally due to the presence of C-N bonds (Silva and Prather, 2000;
119 Zawadowicz et al., 2017; Pagels et al., 2013). Thus, the NOCs herein may refer to complex
120 nitrated organics such as organic nitrates, nitro-aromatics, nitrogen heterocycles and
121 polyphenols. The bulk solution-phase reaction between the representative oxidized organics
122 (i.e., methylglyoxal) and ammonium sulfate was also performed in the laboratory to confirm
123 that the formation of C-N bonds would generate ion peaks at m/z -26 $[\text{CN}]^-$ and/or -42
124 $[\text{CNO}]^-$ using SPAMS (Fig. S1). The number fractions (Nfs) of particles that contained
125 NOCs ranged from 56-59% across all four seasons (Table S1). The number of detected
126 NOCs-containing particles and their vacuum aerodynamic diameter (d_{va}) are shown in Fig.
127 S2. Most of the detected NOC-containing particles had a d_{va} in a range of 300-1200 nm.

128 A representative mass spectrum for NOCs-containing particles is shown in Fig. 1.
129 Dominant peaks in the mass spectrum were 39 $[\text{K}]^+$, 23 $[\text{Na}]^+$, nitrate (-62 $[\text{NO}_3]^-$ or -46
130 $[\text{NO}_2]^-$), sulfate (-97 $[\text{HSO}_4]^-$), organics (27 $[\text{C}_2\text{H}_3]^+$, 63 $[\text{C}_5\text{H}_3]^+$, -42 $[\text{CNO}]^-$, -26 $[\text{CN}]^-$),
131 ammonium (18 $[\text{NH}_4]^+$) and carbon ion clusters ($\text{C}_n^{+/-}$, $n = 1, 2, 3, \dots$). NOCs-containing
132 particles were internally mixed with various oxidized organics, represented as formate at m/z



133 -45 $[\text{HCO}_2]^-$, acetate at m/z -59 $[\text{CH}_3\text{CO}_2]^-$, methylglyoxal at m/z -71 $[\text{C}_3\text{H}_3\text{O}_2]^-$, glyoxylate
134 at m/z -73 $[\text{C}_2\text{HO}_3]^-$, pyruvate at m/z -87 $[\text{C}_3\text{H}_3\text{O}_3]^-$, malonate at m/z -103 $[\text{C}_3\text{H}_3\text{O}_4]^-$ and
135 succinate at m/z -117 $[\text{C}_4\text{H}_5\text{O}_4]^-$ (Zhang et al., 2017; Zauscher et al., 2013; Lee et al., 2003).
136 The contribution of these ion peaks to the formation of secondary oxidized organics has been
137 previously confirmed based on their pronounced diurnal trends, with maximum
138 concentrations observed in the afternoon (Zhang et al., 2019). Furthermore, these oxidized
139 organics have been reported to be highly correlated ($r = 0.72 - 0.94$, $p < 0.01$) with each other
140 (Zhang et al., 2019), consistent with the assumption that they are photochemical oxidation
141 products of various volatile organic compounds (VOCs) (Paulot et al., 2011; Zhao et al.,
142 2012; Ho et al., 2011). More information on the seasonal variation range of the Nfs of
143 oxidized organics, ammonium and NOCs can be found in Fig. S3.

144 Hourly mean Nfs and relative peak areas were applied herein to indicate the variations
145 of aerosol compositions in individual particles. Even though advances have been made in
146 the quantification of specific chemical species for individual particles based on their
147 respective peak area information, it is still quite a challenge for SPAMS to provide
148 quantitative information on aerosol components due to matrix effects, incomplete ionization
149 and so on (Qin et al., 2006; Jeong et al., 2011; Healy et al., 2013; Zhou et al., 2016). Despite
150 of this, the variation of relative peak area should be a good indicator for the investigation of
151 atmospheric processing of various species in individual particles (Wang et al., 2010;
152 Zauscher et al., 2013; Sullivan and Prather, 2007; Zhang et al., 2014).

153



154 **3 Results and Discussion**

155 **3.1 Evidence for the formation of NOCs from oxidized organics and ammonium**

156 Figure 2 shows the seasonal variations in Nfs of the oxidized organics and ammonium,
157 which were internally mixed with NOCs. On average, more than 90% of the oxidized
158 organics and 65% of ammonium (except spring) were found to be internally mixed with
159 NOCs (Fig. S4). Based on the comparison of the Nfs of NOCs (~60%) relative to all the
160 measured particles, it may be concluded that NOCs were enhanced with the presence of
161 oxidized organics and ammonium, with the increase associated with oxidized organics being
162 most pronounced. A strong correlation between NOCs and oxidized organics further
163 demonstrates a close association between these factors, as shown in Fig. 3. Thus, the
164 dominant association between oxidized organics and NOCs (Fig. 2) indicates that NOCs
165 may be formed from the processing of secondary oxidized organics in particle phase, rather
166 than gas phase reactions followed by condensation. Water soluble organic nitrogen (WSO_N)
167 was reported to be positively correlated with some oxidation products in a forest in northern
168 Japan (Miyazaki et al., 2014). A close correlation observed ($R^2 = 0.55$, $p < 0.01$) between
169 the temporal variation of NOCs internally and externally mixed with oxidized organics,
170 further indicates that NOCs-containing particles free of oxidized organics may also be
171 associated with the processing of these compounds (Fig. S5). This is further supported by
172 the similar pattern of diurnal variation observed for NOCs and oxidized organics (Fig. S6).
173 However, a slight lag period was observed in the overnight peaks of NOCs, as compared to
174 those of the oxidized organics. This finding was consistent with previously reported results,



175 showing NOCs to have concentration maxima overnight in Beijing and Uintah (Yuan et al.,
176 2016; Zhang et al., 2015). The lower contribution of NOCs during daytime may be partly
177 explained by the lower RH, as discussed in section 3.2, in addition to photo-bleaching which
178 occurs during daytime (Zhao et al., 2015).

179 A previously reported study effectively modelled predictions of the diurnal variation in
180 secondary NOCs, produced by mixed carbonyls and ammonium (Woo et al., 2013). In the
181 present study, the Nfs of ammonium-containing particles internally mixed with NOCs,
182 varied within a wider range (~40-90%) (Fig. 2), as compared to the variation in oxidized
183 organics. The enhanced mixing of NOCs with ammonium suggests that the uptake of gas
184 phase oxidized organics and their interaction with particulate ammonium might also
185 contribute to the formation of NOCs (Gen et al., 2018; De Haan et al., 2017). However, no
186 enhancement occurred during spring and the enhancement was limited in ammonium-
187 containing particles, as compared to oxidized organics-containing particles (Fig. 2). This
188 phenomenon may be attributed to the limited oxidized organics fraction during spring (<
189 20%), in comparison to other seasons (~40%) (Fig. S3). Interestingly, the relationship
190 between NOCs and ammonium was distinctly different from the relationship between NOCs
191 and oxidized organics. A positive correlation ($R^2 = 0.50$, $p < 0.01$) was observed between
192 the hourly detected number of NOCs and ammonium. In contrast, a negative correlation (R^2
193 $= 0.55$, $p < 0.01$) was observed between the hourly average relative peak areas (RPAs) of
194 NOCs and ammonium (Fig. 3). These results imply that the controlling factors on the
195 formation of NOCs from ammonium are different from those controlling oxidized organics.



196 This may be due to the fact that the ammonium available to react with secondary oxidized
197 organics was from the uptake of ammonia, regarding that NOCs were mainly supplied by
198 heterogeneous reactions of oxidized organics, as discussed above. By this pathway, the
199 formation of ammonium and NOCs would compete for ammonia, potentially resulting in a
200 negative correlation between the RPAs of NOCs and ammonium as observed (Fig. 3). A
201 study shows that ammonia is more efficient at producing NOC than ammonium (Nguyen et
202 al., 2012). The negative correlation between concentrations of WSON and NH_4^+ in filter
203 samples (Fig. S7), may serve as quantitative support for the close association between
204 WSON formation and NH_4^+ . Furthermore, the negative correlation between the RPA of
205 NOCs and ammonium, may indicate that the formation of NOCs is influenced by particle
206 acidity, which is directly affected by the abundance of ammonium (as discussed in section
207 3.3). Consistently, the Nfs of ammonium that internally mixed with NOCs were inversely
208 correlated with the RPAs of ammonium (Fig. S8).

209 As discussed, the formation of oxidized organics is mainly attributed to gas-phase
210 photochemical reactions followed by condensation. One may expect that NOCs were formed
211 through the interaction between NO_x and oxidized organics in gas phase followed by
212 condensation (Fry et al., 2014; Stefenelli et al., 2019; Lehtipalo et al., 2018). However, low
213 correlation coefficients ($R^2 = 0.02\text{--}0.13$) between NOCs and NO_x indicates limited
214 contribution of this pathways to the observed NOCs. Also, NOCs formed through NO_x and
215 oxidized organics followed by partitioning would not be dependent on the amount of
216 ammonium, which is incompatible with our results.



Multiple linear regression analysis was performed to predict the RPAs of NOCs generated from oxidized organics and ammonium, showing a close association ($R^2 = 0.71$, $p < 0.01$) between the predicted RPAs and the observed values of NOCs (Fig. 4). Therefore, the interactions involving oxidized organics and ammonium may explain over half of the observed variations in NOCs in the atmosphere of Guangzhou. A fraction of the unaccounted NOCs could be due to primary emissions and other formation pathways. Consistent results were also obtained from the PMF model analysis (Norris et al., 2009) (detailed information is provided in the SI). Fig. 5 presents the PMF factor profiles and their diurnal variations. Around 75% of NOCs could be well explained by two factors, with 33% of the modelled NOCs mainly associated with ammonium and carbonaceous ion peaks (ammonium factor), while 59% were mainly associated with oxidized organics (oxidized organics factor). The ammonium factor showed a diurnal variation pattern peaking during early morning, which is consistent with the diurnal variation in RH (Zhang et al., 2019). In addition, this factor contributed to ~80% (Fig. S9) of the modelled NOCs during spring when the highest RH was observed (Table S1), while the oxidized organics factor dominated in all other seasons. This may indicate a potential role of aqueous pathways in the formation of NOCs, particularly during spring. In contrast, the oxidized organics factor showed a pattern of diurnal variation, increasing from morning hours and peaking overnight, which may correspond to the photochemical production of oxidized organics and follow-up interaction with condensed ammonium. This pathway may explain the slightly late peaking of NOCs compared to oxidized organics, as condensation of ammonium is favorable overnight (Hu et



al., 2008). While there were similarities in the fractions of oxidized organics in the oxalate factor and the oxidized organics factor, they only contributed to 8% of the modelled NOCs in the oxalate factor, which contained ~80% of the modelled oxalate. As previously discussed, these oxidized organics are also precursors for the formation of oxalate (Zhang et al., 2019) and therefore, these results suggest that there were two competitive pathways for the evolution of these oxidized organics. Some oxidized organics formed from photochemical activities were further oxidized to oxalate, resulted in a diurnal pattern of variation and concentration peaks during the afternoon (Fig. 5), while others interact with ammonium to form NOCs. This However, the controlling factors for these pathways could not be determined in the present study.

Several laboratory studies have confirmed the importance of ammonium in the formation of NOCs from carbonyls in atmospheric aerosols (Sareen et al., 2010; Shapiro et al., 2009; Nozriere et al., 2009; Kampf et al., 2016; Galloway et al., 2009). Similarly, SOA generated from a large group of biogenic and anthropogenic VOCs can be further aged by $\text{NH}_3/\text{NH}_4^+$ (Nguyen et al., 2012; Bones et al., 2010; Updyke et al., 2012; Liu et al., 2015; Huang et al., 2017). In a chamber study, the formation of NOCs were found to be enhanced in a NH_3 -rich environment (Chu et al., 2016). While such chemical mechanisms might be complex, the initial steps generally involve reactions forming imines and amines, which can further react with carbonyl SOA compounds to form more complex products (e.g., oligomers/BrC) (Laskin et al., 2015).



259 3.2 Seasonal variations in the observed NOCs

260 A clear seasonal variation in NOCs were also observed, with higher relative
261 contributions during summer and autumn (Figs. 3 and 4), mainly due to the variations in
262 oxidized organics and $\text{NH}_3/\text{NH}_4^+$. As discussed in section 3.3, particle acidity was lower
263 during spring and winter than during summer and autumn, which may contribute to the
264 observed seasonal variations. In this region, a larger contribution from secondary oxidized
265 organics is typically observed during summer and autumn (Zhou et al., 2014; Yuan et al.,
266 2018). The seasonal maximum NH_3 concentrations have also been reported during the
267 warmer seasons, corresponding to the peak emissions from agricultural activities and high
268 temperatures, while the low NH_3 concentrations observed in colder seasons may be
269 attributed to gas-to-particle conversion (Pan et al., 2018; Zheng et al., 2012). Such seasonal
270 variation in NOCs were also obtained in a model simulation, showing that the conversion of
271 NH_3 into NOCs would result in a significantly higher reduction of gas-phase NH_3 during
272 summer (67%) than winter (31%), due to the higher NH_3 and SOA concentrations present in
273 the summer (Zhu et al., 2018). Since NOCs have been commonly observed in air masses
274 affected by biomass burning (Desyaterik et al., 2013), more primary NOCs may also be
275 present during summer and autumn in the present study, due to the additional biomass
276 burning activities in these seasons (Chen et al., 2018; Zhang et al., 2013).

277 While the seasonal variations in NOCs can be adequately explained by the variations in
278 concentrations of oxidized organics and ammonium (Fig. 4), the hourly variations during
279 each season were not well explained, as indicated by the lower R^2 values (Table S2). The



correlation coefficients (R^2) ranged from 0.24 to 0.57 for inter-seasonal variations, although all regressions were found to be significant. As shown in Fig. 3, the seasonal dependence of NOCs on oxidized organics and ammonium varies, despite the correlations between NOCs and oxidized organics / ammonium being significant ($p < 0.01$) over different seasons. During spring, NOCs exhibited a limited dependence on oxidized organics (Fig. 3a and 3b), while during summer, the hourly detected number of NOCs showed a limited dependence on ammonium (Fig. 3d). These findings were consistent with the PMF results, showing that the ammonium factor explained ~80% of the predicted NOCs during spring, while the oxidized organics factor dominantly contributed to the predicted NOCs during warmer seasons (Fig. S9). A detailed discussion of this issue is provided in the SI.

290

291 3.3 Influence of RH and particle acidity

The importance of RH on NOC RPAs and peak ratios of NOCs and oxidized organics, are shown in Fig. 6. While NOCs did not show a clear dependence on RH, the ratio of NOCs to oxidized organics showed a clear increase with higher RH. This finding is consistent with the observations reported by Xu et al. (2017), in which the N/C ratio significantly increased as a function of RH in the atmosphere of Beijing. In addition, the diurnal variations of NOCs with peaks values around 20:00 were also similar to those reported by Xu et al. (2017). These findings imply that aqueous-phase processing likely plays an important role in the formation of NOCs. Significant changes in RH, such as during the evaporation of water droplets, have been reported to facilitate the formation of NOCs via $\text{NH}_3/\text{NH}_4^+$ and SOA (Nguyen et al.,



2012). In addition, an increase in RH would improve the uptake of NH_3 and formation of NH_4^+ , which also contributes to the enhancement of NOCs. However, the relatively weak correlation ($R^2 = 0.27$, $p < 0.01$) between the peak ratios and RH, reflect the complex influence of RH on the formation of NOCs (Xu et al., 2017; Woo et al., 2013). It is noted that the formation of NOCs from oxidized organics was not enhanced when RH conditions were lower than 40%.

While particulate organics with a high N/C ratio were formed in the presence of ammonium salts (Lee et al., 2013), the influence of particle acidity on the formation of NOCs has not previously been thoroughly evaluated. We further analyzed the influence of particle acidity on the formation of NOCs, with particle acidity represented by the relative acidity ratio, defined as the sum of absolute average peak areas of nitrate (m/z -62) and sulfate (m/z -97) divided by those of ammonium (m/z 18) (Denkenberger et al., 2007). Fig. 7 clearly shows the dependence of NOCs on particle acidity. Similarly, ambient observations reported from a forest site in Japan indicate that aerosol acidity likely plays an important role in the formation of WSON via acid-catalyzed reactions in summer (Miyazaki et al., 2014). Enhanced organic aerosol yields from gas-phase carbonyls in the acidic seed aerosol have been attributed to the occurrence of acid-catalyzed reactions (Jang et al., 2002). Furthermore, acidity could also play a significant role in the gas-to-particle partitioning of aldehydes (Herrmann et al., 2015; Liggio et al., 2005; Gen et al., 2018; De Haan et al., 2018; Kroll et al., 2005), although some studies have indicated that browning of some SOA occurs independently within a pH range of 4–10 (Nguyen et al., 2012). Consistently higher relative



322 acidity was observed for the internally mixed ammonium and NOCs particles, as compared
323 to ammonium-containing particles without NOCs (Fig. S7). This finding was consistent with
324 the results discussed in section 3.1, indicating that particles containing a higher abundance
325 of ammonium may not facilitate the formation of NOCs. A previously reported modelled
326 simulation showed that after including the chemistry of SOA ageing with NH_3 , an increase
327 in aerosol acidity would be expected due to the reduction in NH_4 , resulting in more SOA
328 generated from acid-catalyzed reactions (Zhu et al., 2018). Consequently, the relative acidity
329 ratio was also included in the multiple linear regression model applied in the present study,
330 as previously discussed. However, the inclusion of relative acidity did not improve the
331 degree of fit between the observed and modeled RPAs of NOCs. This suggests that the
332 selection of the RPAs of ammonium or the relative acidity ratio in regression analysis
333 resulted in similar outcomes for the formation of NOCs as the present study, due to the
334 overlap between these variables. Sulfate might also play a role in the enhancement of
335 formation kinetics for NOCs ($R^2 = 0.13$, $p < 0.01$), as previously demonstrated in laboratory
336 simulations showing that sulfate can enhance the partitioning of some carbonyls (Lee et al.,
337 2013).

338

339 3.4 Atmospheric implications and limitation

340 In this study we showed that in an urban megacity area, secondary NOCs were
341 significantly contributed by the heterogeneous ageing of photochemical products with
342 $\text{NH}_3/\text{NH}_4^+$, providing valuable insight into SOA aging mechanisms. In particular, the effects



343 of $\text{NH}_3/\text{NH}_4^+$ on SOA or BrC formation remain relatively poorly understood. In the PRD
344 region, it has been shown that oxygenated organic aerosols (OOA) account for more than
345 40% the total organic mass (He et al., 2011), with high concentrations of available gaseous
346 carbonyls (Li et al., 2014). Therefore, it is expected that over half of all water soluble NOCs
347 in this region, might link to secondary processing (Yu et al., 2017). Furthermore, secondary
348 sources have been found to contribute significantly to NOCs related BrC in Nanjing, China
349 (Chen et al., 2018). The results presented herein also suggest that the production of NOCs
350 might be effectively estimated by their correlation with secondary oxidized organics and
351 ammonium. The effectiveness of correlation based estimations needs to be examined in other
352 regions before being generally applied in other environments. However, this approach may
353 provide valuable insights in investigations into NOCs using atmospheric observations. In
354 contrast, it has previously been reported that a positive correlation exists between WSON
355 and ammonium (Li et al., 2012), indicating similar anthropogenic sources. This divergence
356 could be mainly attributed to varying contributions of primary sources and secondary
357 processes to the observed NOCs. Possible future reductions in anthropogenic emissions of
358 ammonia may reduce particle NOCs. Understanding the complex interplay between
359 inorganic and organic nitrogen is an important part of assessing the global nitrogen cycling.

360 Moise et al. (2015) proposed that with high concentrations of reduced nitrogen
361 compounds, high photochemical activity and frequent changes in humidity, BrC formed via
362 $\text{NH}_3/\text{NH}_4^+$ and SOA may become a dominant contributor to aerosol absorption, specifically
363 in agricultural and forested areas. However, this study suggests that even in typical urban



364 areas, BrC formation via $\text{NH}_3/\text{NH}_4^+$ and SOA should be considered. In particular, SOA was
365 found to account for 44–71% of the organic mass in megacities across China (Huang et al.,
366 2014), with NH_3 concentrations in urban areas comparable with those from agricultural sites
367 and 2- or 3-fold those of forested areas in China (Pan et al., 2018). Additionally, the acidic
368 nature of particles in these regions would be also favorable for the formation of NOCs (Guo
369 et al., 2017; Jia et al., 2018).

370 Considering the formation of NOCs from the uptake of NH_3 onto SOA particles, Zhu
371 et al. (2018) suggested that this mechanism could have a significant impact on the
372 atmospheric concentrations of $\text{NH}_3/\text{NH}_4^+$ and NO_3^- . However, the uptake of carbonyl onto
373 the ammonium-containing particles was not considered. As discussed above, 33% of the
374 modelled NOCs on average could be explained by the ammonium factor, with this effect
375 most pronounced during spring (Fig. 5 and Fig. S9). Such chemistry may also result in an
376 increase in aerosol acidity due to the reduction in NH_4^+ , resulting in the formation of more
377 SOA from acid-catalyzed reactions of gas-phase carbonyls (Jang et al., 2002). Given that
378 RH and particle acidity play an important role in the aqueous formation of SOA and uptake
379 of NH_3 , such models should be developed to include these factors, in order to improve our
380 understanding of the impact of the discussed chemical mechanisms in atmospheric chemistry
381 and the global nitrogen cycle.

382

383 5 Conclusions



384 This study investigated the processes contributing to the seasonal formation of NOCs,
385 involving ammonium and oxidized organics in urban Guangzhou, using single particle mass
386 spectrometry. This is the first study to provide direct field observation results to confirm that
387 the variation in NOCs correlated well and strongly enhanced internal mixing with secondary
388 oxidized organics. These findings highlight the possible formation pathway of NOCs
389 through ageing of secondary oxidized organics by $\text{NH}_3/\text{NH}_4^+$ in ambient urban environments.
390 A clear pattern of seasonal variation in NOCs was observed, with higher relative
391 contributions in summer and autumn as compared to spring and winter. This seasonal
392 variation was well predicted by multiple linear regression model analysis, using the relative
393 abundance of oxidized organics and ammonium as model inputs. More than 50% of NOCs
394 could be explained by the interaction between oxidized organics and ammonium. The
395 production of NOCs through such processes were facilitated by increased humidity and
396 higher particle acidity. These results extend our understanding of the mixing state and
397 atmospheric processing of particulate NOCs, as well as having important implications for
398 the accuracy of models predicting the formation, fate and impacts of NOCs in the atmosphere.
399

400 **Author contribution**

401 GHZ and XHB designed the research (with input from WS, LL, ZYW, DHC, MJT, XMW
402 and GYS), analyzed the data, and wrote the manuscript. XFL, YZF and QHL conducted air
403 sampling work and laboratory experiments under the guidance of GHZ, XHB and XMW.
404 All authors contributed to the refinement of the submitted manuscript.



405

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756

757 **Figure captions**

758 Figure 1. Representative mass spectrum for NOCs-containing particles. The ion
759 peaks corresponding to NOCs and oxidized organics are highlighted with red bars.

760 Figure 2. The variation in hourly mean Nfs of the oxidized organics and
761 ammonium that internally mixed with NOCs. Box and whisker plot shows lower,
762 median and upper lines, denoting the 25th, 50th and 75th percentiles, respectively; the
763 lower and upper edges denote the 10th and 90th percentiles, respectively.

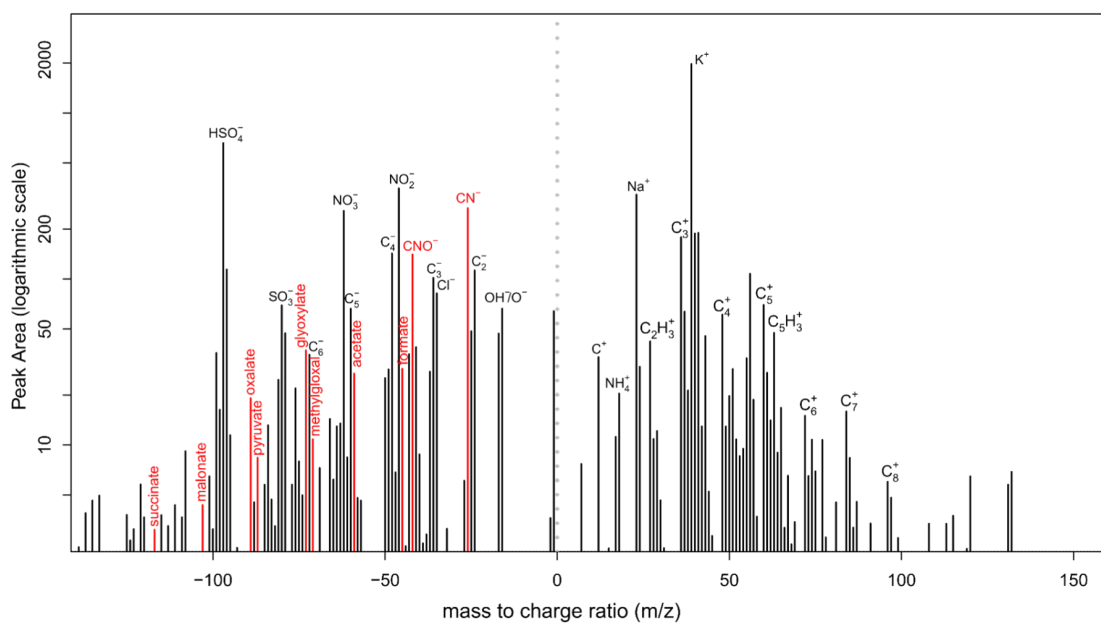
764 Figure 3. Correlation analysis of (a, c) the RPAs and (b, d) the number of
765 detected NOCs, with the oxidized organics and ammonium in different seasons.
766 Significant ($p < 0.01$) correlations were obtained for both the total observed data and
767 the seasonally separated data. RPA is defined as the fractional peak area of each m/z
768 relative to the sum of peak areas in the mass spectrum and is applied to represent the
769 relative amount of a species on a particle (Jeong et al., 2011; Healy et al., 2013).

770 Figure 4. Comparison between the measured and predicted RPAs for NOCs.

771 Figure 5. (left) PMF-resolved 3-factor source profiles (percentage of total species)
772 and (right) their diurnal variation (arbitrary unit).

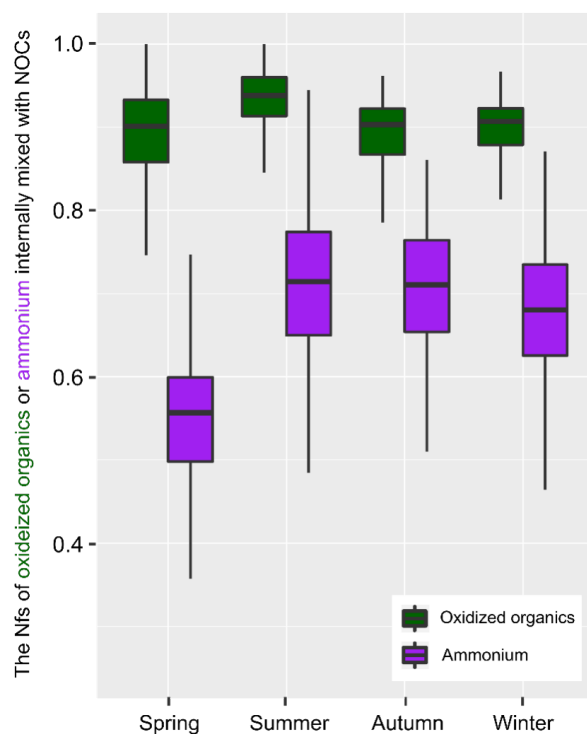
773 Figure 6. The dependence of NOCs and the ratio of NOCs to the oxidized organics
774 on RH.

775 Figure 7. The dependence of NOCs on the relative acidity ratio. The relative
776 acidity ratios were logarithmically transformed to follow a normal distribution.



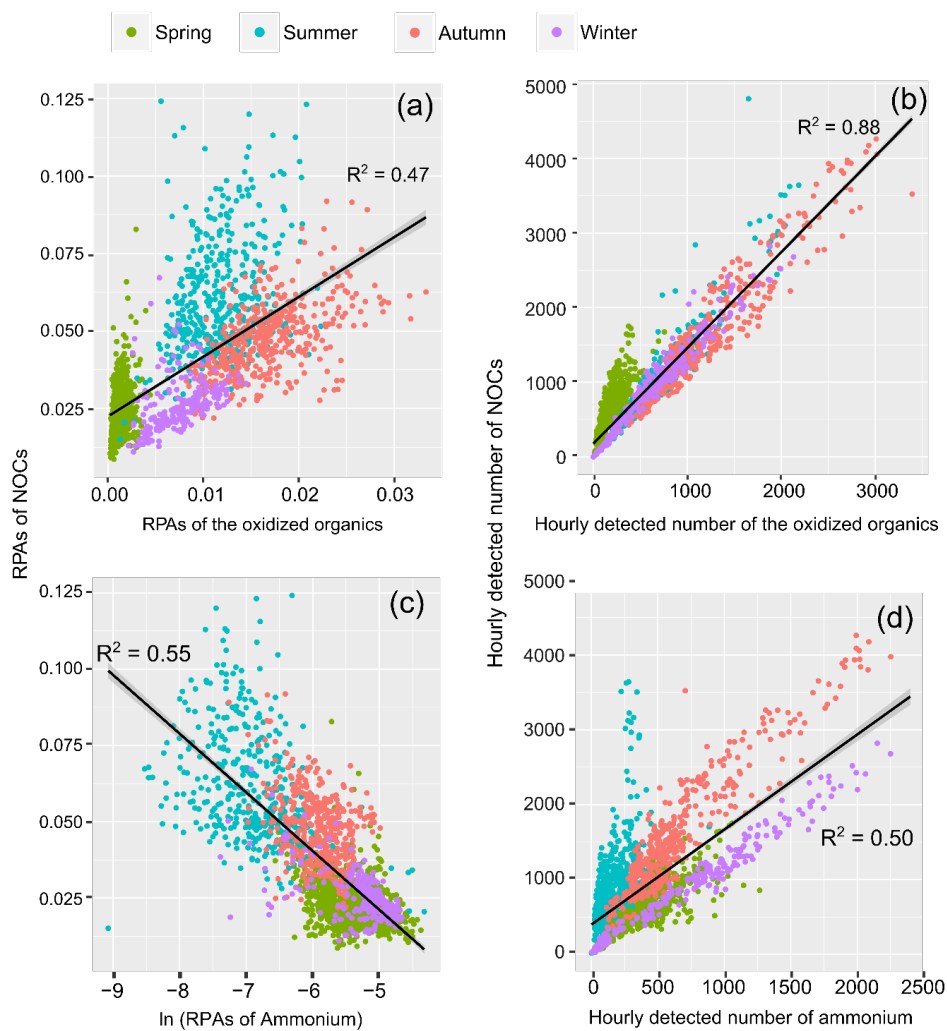
777

778 Fig. 1.



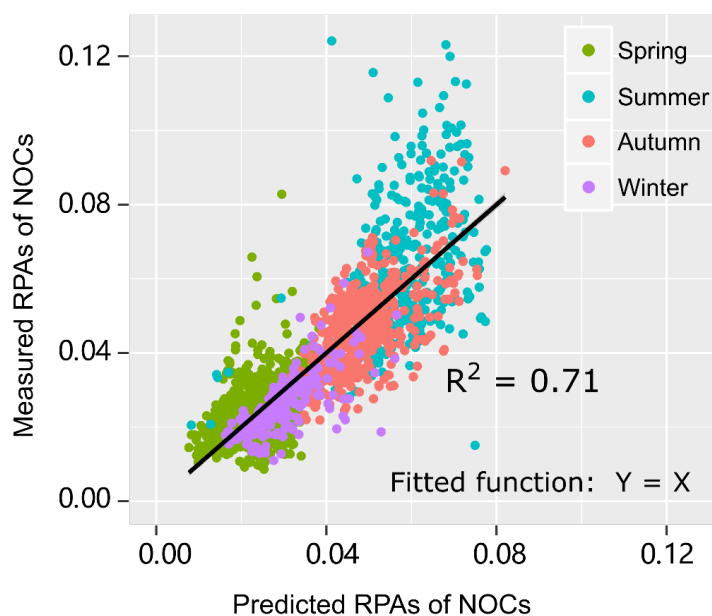
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780 Fig. 2.



781

782 Fig. 3.

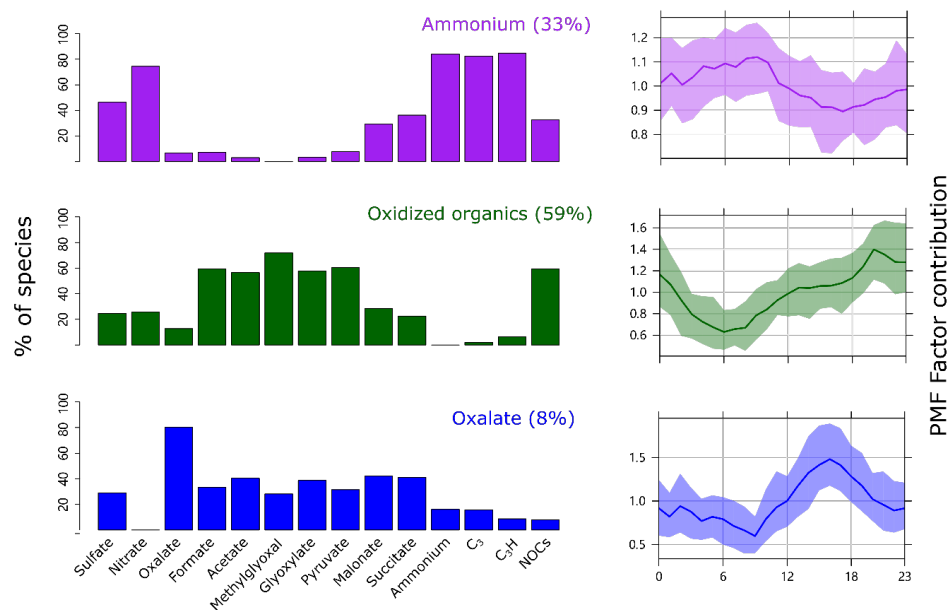


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784 **Fig. 4.**

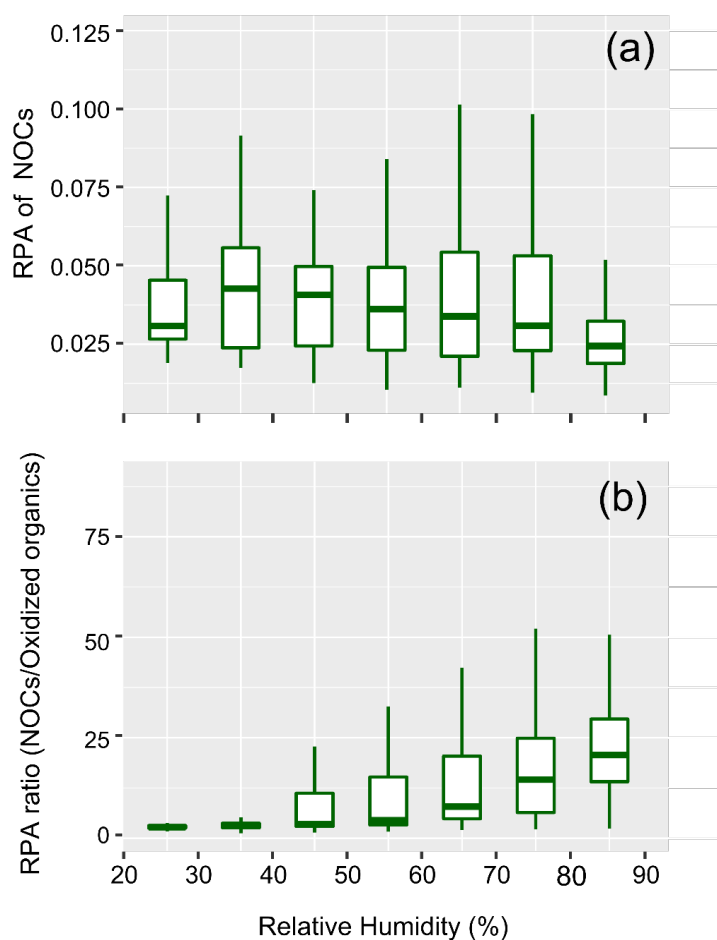


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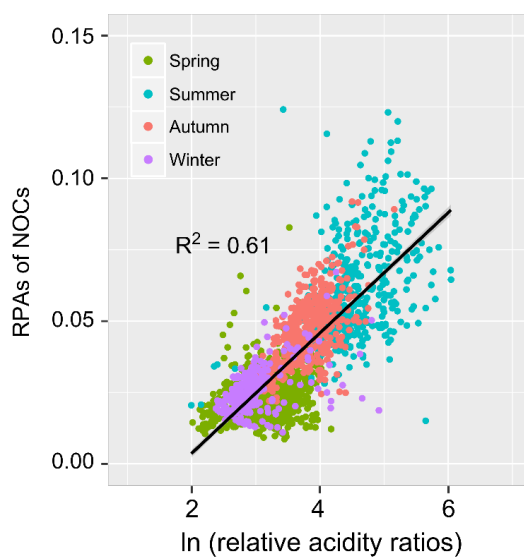
787 **Fig. 5.**



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789

Fig. 6.



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791 **Fig. 7.**