

# Different Formation Pathways of Nitrogen-containing Organic Compounds in Aerosols and Fog Water in Northern China

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**Abstract.** While aqueous-phase processing is known to contribute to the formation of nitrogen-containing organic compounds (NOCs), the specific pathways involved remain poorly understood. In this study, we aimed to characterize the NOCs present in both pre-fog aerosols and fog water collected at a suburban site in northern China. Fourier-transform ion cyclotron resonance mass spectrometry was utilized to analyze the molecular composition of NOCs in both negative and positive modes of electrospray ionization (ESI<sup>-</sup> and ESI<sup>+</sup>). In both pre-fog aerosols and fog water samples, NOCs constituted a significant portion, accounting for over 60% of all assigned formulas in ESI<sup>-</sup> and more than 80% in ESI<sup>+</sup>. By comparing the molecular composition of NOCs originating from biomass burning, coal combustion, and vehicle emissions, we identified that 72.3% of NOCs in pre-fog aerosols were attributed to primary anthropogenic sources (pNOCs), while the remaining NOCs were categorized as secondary NOCs formed within the aerosols (saNOCs). While unique NOCs found in fog water were classified as secondary NOCs formed within the fog water (sfNOCs). Through a comprehensive "precursor-product pair" screening involving 39 reaction pathways, we observed that the nitration reaction, the amine pathway and intramolecular N-heterocycle pathway of NH<sub>3</sub> addition reactions contributed to 43.6%, 22.1%, and 11.6% of saNOCs, respectively. In contrast, these pathways contributed 26.8%, 28.4%, and 29.7% to sfNOCs, respectively. This disparity in formation pathways is likely influenced by the diverse precursors, aqueous acidity, and the gas-phase species partitioning. Correspondingly, saNOCs were found to contain a higher abundance of carbohydrate-like and highly oxygenated compounds with two nitrogen atoms compared to pNOCs. Conversely, sfNOCs exhibited a higher content of lipid-like compounds with fewer oxygen atoms. These results underscore the distinct secondary processes contributing to the diversity of NOCs in aerosols and fog water, which may lead to their different climate effects.

## 1 Introduction

35 Nitrogen-containing organic compounds (NOCs), predominantly comprising organonitrates, amines, amino acids, nitroaromatics, and nitrogen-heterocyclic compounds, have been extensively detected in aerosols, cloud/fog water, and rainwater (Altieri et al., 2012; Li et al., 2020c; Wang et al., 2018; Feng et al., 2016; Leclair et al., 2012; Ditto et al., 2022). As essential contributors to the absorption of brown carbon, NOCs play a substantial role in influencing the radiative balance (Yang et al., 2022; Jimenez et al., 2022; Jiang et al., 2021; Huang et al., 2020). Certain NOCs, such as nitroaromatics, are  
40 classified as phytotoxins and suspected carcinogens (Harrison et al., 2005). Therefore, conducting an in-depth investigation into the characteristics, sources, and atmospheric processes of NOCs is imperative for understanding their climate and health effects.

Both primary emissions and secondary formation contribute to NOCs in the atmosphere. Benefiting from ultra-high Fourier-transform ion cyclotron resonance mass spectrometry (FT-ICR MS), thousands of NOC molecules have been detected in  
45 primary anthropogenic sources, including biomass burning (BB), coal combustion (CC), and vehicle emission (VE) (Tang et al., 2020; Song et al., 2019; Song et al., 2018; Song et al., 2021). Meanwhile, aqueous-phase reactions have been identified as crucial pathways for the secondary formation of NOCs. Recent studies have revealed a positive relationship between NOCs and relative humidity or aerosol liquid water (Liu et al., 2023a; Cai et al., 2023; Jiang et al., 2023) as well as the presence of abundant NOCs in cloud/fog water (Kim et al., 2019; Boone et al., 2015). Laboratory studies have highlighted  
50 two major pathways for NOC formation in the aqueous phase: 1) organic precursors can undergo nitration by  $\text{NO}_2$  radical or nitronium ion ( $\text{NO}_2^+$ ), resulting in the formation of NOCs such as nitroaromatics (Kroflc et al., 2015; Vione et al., 2005); and 2) the reaction of carbonyl compounds (e.g., glyoxal and methylglyoxal) with ammonium and/or amines in the aqueous phase, known as Maillard reactions, can produce reduced NOCs, e.g., imidazoles (Jimenez et al., 2022; De Haan et al., 2009; Kua et al., 2011; De Haan et al., 2018). Observations of both nitration and Maillard products, including dinitrophenols,  
55 methylnitrocatechols, and imidazoles, have been documented in aerosol liquid water or cloud/fog water (Lüttke et al., 1997; Harrison et al., 2005; Frka et al., 2016; Li et al., 2022; Liu et al., 2023a; Lian et al., 2021). The reactions might be influenced by factors such as liquid water content (LWC) and pH of the aqueous phase (Lian et al., 2021; Vidovic et al., 2018). For instance, a low pH promotes the formation of 2,4-dinitrophenols via nitration (Vione et al., 2005), while inhibiting reactions between glyoxal and reduced nitrogen (Sedehi et al., 2013; Yang et al., 2024). Aerosol liquid water and fog water serve as  
60 crucial media for the aqueous-phase reactions of organics, characterized by significant differences in LWC and pH (Ervens et al., 2011; Blando and Turpin, 2000). However, due to the limited comprehensive studies of aqueous-phase processes in these two phases, the contribution of various formation pathways to secondary NOCs remains unclear.

In recent years, northern China has grappled with severe haze pollution, with anthropogenic sources like BB, CC, and VE identified as major contributors (Li et al., 2019a; Li et al., 2023; Li et al., 2019b; Li et al., 2019c). Meanwhile, high relative  
65 humidity has regarded as a significant driver of secondary pollution in this region (Xu et al., 2017; Kuang et al., 2020; Li et al., 2020a). However, research on the understanding of NOCs at the molecular level remains limited (Wang et al., 2019). In

this study, we collected pre-fog aerosols and fog water samples from a suburban site in northern China during a severe haze period. These samples were analyzed using FT-ICR MS coupled with electrospray ionization (ESI) in both negative and positive ionization modes. By employing this technique, we anticipated a comprehensive detection of NOC molecules, with a potential capture of up to 80% (Cape et al., 2011; Jiang et al., 2022). Our study aimed to 1) identify primary NOCs originating from anthropogenic emissions and 2) explore the distinct formation pathways of NOCs in both pre-fog aerosols and fog water.

## 2 Materials and Methods

### 2.1 Sample collection and pretreatment

The sampling site is situated in a suburban area of Qingdao, China (36.35°N, 120.68°E). It is surrounded by residential area and roads. Aerosol and fog water samplers were installed on the roof of a four-story building. Detailed information regarding the environmental and meteorological conditions during the sampling campaign has been described elsewhere (Hu et al., 2022; Zhang et al., 2021).

During a severe haze episode lasting from December 6 to December 11, 2019, the concentration of PM<sub>2.5</sub> soared to as high as 300 μg m<sup>-3</sup> (Fig. S1). On the morning of December 10, a fog event occurred, characterized by visibility dropping below 100 m and relative humidity exceeding 90%. This fog event persisted from approximately 06:30 to 11:20 a.m. (Fig. S1). During this period, two fog water samples (QDF1 and QDF2) were collected utilizing a Caltech Active Strand Cloud Water Collector, Version 2 (CASCC2). The CASCC2 operated at a flow rate of 5.8 m<sup>3</sup> min<sup>-1</sup>, with a collection efficiency of 86%. A blank sample for fog water was acquired by rinsing the CASCC2 during the sampling campaign. The collected fog water was filtered using polytetrafluoroethylene filters, and pH of the fog water was measured on-site using a pH meter (Mettler Toledo, Switzerland). Subsequently, the samples were preserved at -20°C until further analysis.

Two aerosol samples collected on December 8 and 9, prior to the fog event (labeled as pre-fog aerosols QDP1 and QDP2) were selected for comparative analysis with the fog water samples. Daily aerosol collection was conducted onto quartz fiber filters with a radius of 45 mm (Pall, U.S.A.) using a PM<sub>2.5</sub> sampler (TH-150A, Wuhan Tianhong, China) at a flow rate of 100 L min<sup>-1</sup>. To ensure the removal of any organic contaminants, the filters underwent pretreatment by baking in a muffle furnace at 450°C for 4 hours prior to sampling. Each sampling period lasted approximately 23.5 hours, from 8:00 a.m. to around 7:30 a.m. the following day. Immediately after sampling, the filters were refrigerated at -20°C for preservation. Additionally, a field blank was prepared and processed following the same procedure used for the samples.

For the FT-ICR MS analysis, one eighth of the aerosol filters were cut into pieces and subjected to extraction with ultrapure water using ultrasonic agitation. The resulting extracts were then filtered through 0.22 μm polytetrafluoroethylene filters. Subsequently, water-soluble organic matter (WSOM) present in both fog water and water extracts from aerosols was isolated through a solid-phase extraction (SPE) process as described in our previous studies (Sun et al., 2024) and in Text S1. Briefly, the SPE cartridges (Strata-X, Phenomenex, USA) were initially pre-conditioned sequentially with isopropanol, acetonitrile,

methanol containing 0.1% of formic acid, and ultrapure water containing 0.1% formic acid. Then, samples with pH adjusted to 4.5 using formic acid were introduced to the cartridge. Inorganic salts were subsequently removed from the cartridges using ultrapure water containing 0.1% formic acid. The cartridges were then subjected to freeze-drying, after which the analytes were eluted using 3 mL of acetonitrile/methanol/ultrapure water (45/45/10, v:v:v) at pH 10.4, with the pH being adjusted using ammonium hydroxide. The final eluent was dried using gentle nitrogen gas and subsequently frozen until analysis.

## 105 2.2 Instrumental analysis and data processing

The molecular composition of WSOM in fog water and aerosols was detected using an ESI source coupled with a 9.4-T solariX FT-ICR MS (Bruker Daltonik GmbH, Bremen, Germany). Both negative and positive ionization modes of the ESI source were utilized. The samples were redissolved in 1 mL of methanol and injected into an ESI source at a flow rate of 200  $\mu\text{L h}^{-1}$ . The mass range scanned was 100-800 Da. A total of 128 continuous 4M data FT-ICR transients were co-added to improve the signal-to-noise ratio and dynamic range. All mathematically possible formulas for ions with a signal-to-noise ratio greater than 10 were calculated, considering a mass tolerance of  $\pm 0.6$  ppm. The maximum numbers of atoms for the formula calculator were set to: 30  $^{12}\text{C}$ , 60  $^1\text{H}$ , 15  $^{16}\text{O}$ , 2  $^{14}\text{N}$ , 2  $^{32}\text{S}$ , 1  $^{13}\text{C}$ , 1  $^{18}\text{O}$ , and 1  $^{34}\text{S}$  for ESI- and one additional  $^{23}\text{Na}$  for ESI+. Formulas assigned to isotopomers (i.e.,  $^{13}\text{C}$ ,  $^{18}\text{O}$ , or  $^{34}\text{S}$ ) were not discussed. The neutral molecular formula  $\text{C}_c\text{H}_h\text{O}_o\text{N}_n\text{S}_s$  was achieved by adding H in ESI- or subtracting H or Na in ESI+. Note that there are other possible adducts, such as K, during the ionization in ESI+. However, the number of other adducts were very limited. Most of the current studies only considered the addition of H and Na in ESI+ (Sareen et al., 2016; Jiang et al., 2022). The other adducts were therefore not considered when we assigned formulas. Further screening was applied using the following criteria to exclude formulas not detected frequently in natural materials:  $\text{O}/\text{C} \leq 1.2$ ,  $0.3 \leq \text{H}/\text{C} \leq 2.25$ ,  $\text{N}/\text{C} \leq 0.5$ ,  $\text{S}/\text{C} \leq 0.2$ ,  $2\text{C} + 2 > \text{H}$ ,  $\text{C} + 2 > \text{O}$ , and obeying the N rule. Only ion peaks with intensities in sample enhanced  $>100$  times higher than in the blank sample were retained for further analysis. More detailed information about the instrumental analysis can be found in our previous studies (Sun et al., 2021; Sun et al., 2023) and in Text S2. The double-bond equivalent (DBE) of each assigned formula  $\text{C}_c\text{H}_h\text{O}_o\text{N}_n\text{S}_s$  was calculated as follows:

$$\text{DBE} = (2c + 2 - h + n)/2$$

The oxidation state of carbon atoms ( $\text{OS}_\text{C}$ ) was calculated based on the approximation described in Kroll et al. (2011) and Brege et al. (2018):

$$\text{OS}_\text{C} \approx 2 \times o/c - h/c - 5 \times n/c - 6 \times s/c$$

For each sample, the average elemental ratios of oxygen, carbon, and hydrogen (i.e., O/C, H/C, etc.) and other characteristic parameters weighted by intensity were calculated as follow:

$$X = \Sigma(X_i \times \text{Int}_i) / \Sigma \text{Int}_i$$

130 where  $X_i$  and  $\text{Int}_i$  represent the parameter and intensity, respectively, in the mass spectrum of each individual molecular formula,  $i$ .

Additionally, water-soluble ions in fog water were analyzed using an ion chromatography (883 Basic IC plus, Metrohm, Switzerland).

### 3 Results and Discussion

#### 135 3.1 Profiles of molecular composition in pre-fog aerosol and fog water

The reconstructed mass spectrogram of ESI<sup>-</sup> and ESI<sup>+</sup> FT-ICR MS for a typical sample is depicted in Fig. 1A. A total of 2659-3753 formulas in ESI<sup>-</sup> mode, and 1695-2419 formulas in ESI<sup>+</sup> mode were assigned for two pre-fog aerosol samples. Four molecular groups (CHO<sup>-</sup>, CHON<sup>-</sup>, CHOS<sup>-</sup>, and CHONS<sup>-</sup>) were categorized based on the elemental compositions of molecular formulas in ESI<sup>-</sup>, while three groups (CHO<sup>+</sup>, CHN<sup>+</sup>, and CHON<sup>+</sup>) were categorized in ESI<sup>+</sup> modes. The 140 fractions of their numbers and relative abundance ( $f_{RA}$ , normalized by the sum of intensity) are presented in Figs. 1B and S2. CHON represents the most abundant group in both modes. The numbers of NOCs (CHON<sup>-</sup>, CHONS<sup>-</sup>, CHN<sup>+</sup>, and CHON<sup>+</sup>) are 1697-2397 in ESI<sup>-</sup> and 1387-2039 in ESI<sup>+</sup>, comprising number fractions of 63.8-63.9% ( $f_{RA}$  of 60.0-62.5%) and 81.8-84.3% ( $f_{RA}$  of 85.0-86.7%) of all assigned formulas, respectively. The significant contribution of NOCs to organic aerosols has also been observed at rural (Jiang et al., 2023; Mao et al., 2022) and urban sites (Jang et al., 2020) in northern China 145 during haze events.

Similar profiles were also observed in fog water. In total, 3903-3992 formulas in ESI<sup>-</sup>, and 3011-3460 formulas in ESI<sup>+</sup> mode, were assigned to fog water samples, including 2551-2633 and 2477-2845 NOCs, respectively. NOCs constitute high number fractions of 65.0-66.0% ( $f_{RA}$  of 69.7-75.0%) and 82.2-82.3% ( $f_{RA}$  of 84.1-85.7%) of all formulas in ESI<sup>-</sup> and ESI<sup>+</sup>, respectively (Figs. 1B and S2). These fractions are higher than those observed in cloud water at Mt. Tai, where CHON 150 accounts for 33% and 63% of all detected molecules in ESI<sup>-</sup> and ESI<sup>+</sup> mode, respectively (Liu et al., 2023b). The high proportion of NOCs in this study may be related to enhanced emissions and subsequent secondary formation, as discussed in Section 3.2 and 3.3.

The molecular characteristics of NOCs, including oxidation states, unsaturation, and molecular weight, in pre-fog aerosols and fog water are presented in Table 1. Obviously, molecules in ESI<sup>-</sup> exhibit a higher oxidation state ( $O/C$  and  $OS_C$ ), lower 155 unsaturation (DBE), and lower molecular weight compared to those in ESI<sup>+</sup>. Interestingly, the H/C ratio of molecules in ESI<sup>-</sup> is lower than that in ESI<sup>+</sup>, seemingly an opposite trend of unsaturation with DBE. The plot of DBE versus H/C of CHON<sup>-</sup> and CHON<sup>+</sup> clearly shows that CHON<sup>-</sup> usually has lower H/C than CHON<sup>+</sup> at the same DBE value (Fig. S3). We note that CHON<sup>+</sup> has a more abundant nitrogen atom content than CHON<sup>-</sup> (1.56 vs. 1.45 on average). The introduction of nitrogen into a molecule includes the possibility to form N-C  $\pi$ -bonds, and requires an additional H atom to fill the 160 additional valence of nitrogen (Koch and Dittmar, 2006), which may lead to a high average H/C of CHON<sup>+</sup>.

In general, the oxidation state of NOCs in fog water is similar to or slightly lower than that observed in aerosols. This trend may be partially attributed to different secondary formation pathways, as discussed in Section 3.3. The DBE values and molecular weight of CHON<sup>-</sup>, CHON<sup>+</sup>, and CHN<sup>+</sup> in fog water are lower than those in pre-fog aerosols, but this is not the

case for CHONS-. Certain CHONS- molecules with high DBE (9-11) and molecular weight (>290) in fog water account for  
165 the higher average values (Fig. S4). The “precursor-product pair” analysis in Section 3.3 suggests that these molecules are  
likely formed through dehydrogenation, dehydration, and other aqueous-phase reactions involving the loss of hydrogen  
atoms in fog water.

### 3.2 Primary sources attribution of NOCs in pre-fog aerosols

Molecules detected in two ionization modes exhibit significant differences. A total of 826 NOCs formulas were common in  
170 both ionization modes in two pre-fog aerosol samples, and 1050 in fog water samples, representing 22.2% and 22.1% of the  
total NOCs, respectively. The result indicates that the combination of ESI- and ESI+ will greatly expand the “Event Horizon”  
of the molecular compositions (Cooper et al., 2022). To ensure representativeness, molecules from both ionization modes in  
two samples will be combined to discuss the source and transformation of NOCs in the following text.

BB, CC, and VE were identified as the major sources of primary organic aerosols (> 80%) in China (Wu et al., 2018) and  
175 significantly contribute to the haze event in northern China (Li et al., 2019c). The study conducted at the same site also  
suggested significant residential combustion activities (Chen et al., 2023). Therefore, BB, CC, and VE likely serve as major  
primary sources at the sampling site. Some studies have characterized the molecular composition of BB (including both  
straw and wood), CC, and VE emissions. The primary NOCs in pre-fog aerosols were identified by comparing with datasets  
of the molecular composition of WSOM from BB (including corn, rice, and pine) and CC smoke detected by both ESI- and  
180 ESI+ coupled with FT-ICR MS, and VE detected by ESI- FT-ICR MS (Song et al., 2018; Tang et al., 2020; Song et al.,  
2021). Then, NOCs in pre-fog aerosols were categorized into BB, CC, VE, and other sources. Similar methods have also  
been utilized for source attribution of the molecules detected in aerosols (Tang et al., 2022; Mao et al., 2022; Wang et al.,  
2019). The number of NOCs derived from BB, CC, and VE is 2298, 1557, and 547, accounting for 61.7%, 41.8%, and 14.7%  
of the total NOCs, respectively. Some NOCs were assigned to more than one primary source. Mao et al. found that 28% of  
185 CHON- and 32% of CHON+ in aerosols collected at a rural site in North China Plain were common with CC emission (Mao  
et al., 2022), which is slightly lower than that in this study. Overall, the primary anthropogenic sources (BB, CC, and VE)  
generated NOCs (pNOCs) accounts for 72.3% of the total NOCs in pre-fog aerosols. This suggests that anthropogenic  
emission significantly contribute to the species richness of particulate NOCs during the haze event at this suburban site.  
Certainly, some other primary sources (e.g., cooking emissions) might also contribute to NOCs, but were not explicitly  
190 assigned in this study. This omission could introduce bias into the identification of pNOCs, which warrants more research on  
the molecular composition of these additional sources in the future.

The Van Krevelen (VK) diagram facilitates information retrieval from assigned molecules (Kim et al., 2003; Hockaday et al.,  
2009). In this study, NOCs molecules from various sources were plotted on the VK diagram (Fig. 2), in which NOCs  
assigned to more than one source is labeled as mixed sources to avoid overlapping points. It is evident that pNOCs are  
195 mainly distributed in the lower left corner, where BB-generated pNOCs occupy the largest area. A previous study also  
identified the BB-generated NOCs in ambient aerosols by comparing them with laboratory combustion emissions. A similar

distribution of these molecules in the VK plot was observed (Wang et al., 2019). Meanwhile, NOCs from other sources are located in the upper right area (Fig. 2). Consistently, the average O/C and H/C of pNOCs are significantly lower than those from other sources (Fig. S5). It should be noted that the deficiency of dataset on the VE source in ESI+ may introduce  
200 uncertainty in assigning sources to molecules. However, our focus is on the overall trend of the secondary NOCs formation process, rather than individual molecules. Importantly, ESI+ tends to ionize molecules with fewer oxygen and more hydrogen. Therefore, even with the inclusion of ESI+ molecules, the average O/C and H/C position of VE on the VK diagram would shift towards the upper left direction, without altering the relative position of "other sources" and pNOCs. NOCs from other sources have relatively higher O/C ( $0.65 \pm 0.29$ ), H/C ( $1.55 \pm 0.42$ ), as well as N/C ( $0.14 \pm 0.07$ )  
205 compared to pNOCs (Fig. S5), resembling the characteristics of aged aerosols (Jiang et al., 2023). Therefore, it is reasonable to regard these NOCs from other sources as secondary NOCs.

### 3.3 The formation of secondary NOCs in pre-fog aerosols and fog water

To identify the formation pathways of secondary NOCs in pre-fog aerosol (saNOCs), the "precursor-product pairs" were screened from the formula list of pre-fog aerosols. A total of 39 reaction pathways were considered in the analysis (Table S1)  
210 (Lian et al., 2020; Liu et al., 2023b). These pathways can be classified into eight types, including dealkyl group, oxygen addition, reaction of carboxylic acid, reaction of amine, reaction of the nitro/nitroso group, reaction of sulfur, NH<sub>3</sub> addition, and other reactions, covering oxidation, hydrolysis, fragmentation, and other typical aqueous-phase reactions. Note that some other reaction pathways, such as oligomerization, were not included in this study because their corresponding atomic variations within the molecules are too complex to describe using "precursor-product pairs".  
215 The primary molecules (i.e., molecules corresponding to BB, CC, or VE emissions, including both pNOCs and other primary molecules) were considered as precursors, while saNOCs were regarded as products. The products of 39 reaction pathways collectively account for 83% of saNOCs, demonstrating their representativeness. Most of the reaction pathways involve the addition and subtraction of H, O, and C atoms to NOC molecules, such as the oxygen addition and dealkylation. Two types of formation pathways for asNOCs involving nitrogen addition on nitrogen-free or one-nitrogen molecules are nitration (-  
220 H+NO<sub>2</sub>, corresponding to nitro substitution) and NH<sub>3</sub> addition. The NH<sub>3</sub> addition pathways include the amine pathway (-O+NH) and intramolecular N-heterocycle pathway (-HO<sub>2</sub>+N) of reactions between carbonyl compounds and ammonia, indexed as NH3Add1 and NH3Add2 in the following texts, respectively (Table S1) (Liu et al., 2023b). As depicted in Fig. 3, three pathways (nitration, NH3Add1, and NH3Add2) produce 450, 228, and 120 asNOCs products, accounting for 43.6%, 22.1%, and 11.6% of all asNOCs, respectively, indicating nitration is the most important formation pathway of saNOCs.  
225 Nitration was widely identified in cloud and fog water (Harrison et al., 2005). However, a recent study showed that aqueous-phase reactions in aerosol liquid water were also important pathways for nitroaromatics formation (Jiang et al., 2023). Since the ESI- and ESI+ modes preferentially ionize acidic and basic functional groups, respectively (Song et al., 2021), the ratio of detected molecule numbers between ESI+ and ESI- (MNR<sub>+/-</sub>) may reflect the relative contribution of functional groups of products to some extent. The MNR<sub>+/-</sub> of nitration products in saNOCs is 0.16, significantly lower than that of NH<sub>3</sub> addition

230 products (0.85 and 0.76 for NH<sub>3</sub>Add1 and NH<sub>3</sub>Add2, respectively, as shown on Table S2). The result is consistent with the fact that NH<sub>3</sub> addition would introduce the reduced nitrogen into the molecules, making them more easily detectable by ESI+. The pathways for the formation of secondary NOCs in fog water (sfNOCs) were assessed under the premise that fog droplets arise from the activation of pre-fog aerosols. Common molecules shared between fog water and pre-fog aerosols (n = 4830) were designated as activated molecules, while unique NOCs molecules found solely in fog water (n = 1315) were identified  
235 as sfNOCs, following a similar approach as in a previous study (Liu et al., 2023b). The sfNOCs molecules exhibit no significant differences in characteristic parameters (O/C and N/C) from activated NOCs molecules, except for a slightly higher H/C ratio in the former (Figs. S6 and S7). These activated molecules and sfNOCs were subsequently considered as precursors and products, respectively, in the "precursor-product pair" analysis. The products stemming from 39 reaction pathways collectively represent 92% of sfNOCs. Illustrated in Fig. 3, the distribution of reaction pathways in fog water  
240 markedly differs from that observed in pre-fog aerosols. The contributions of these pathways in fog water are comparable to each other, except for the reaction of sulfur. For example, oxygen addition and carboxylic acid reactions lead to the addition and loss of oxygen atoms, respectively (Fig. 3 and Table S1). The contributions of these two pathways to sfNOCs are of similar magnitude (23.3-28.2% and 22.7-29.6%, respectively), potentially elucidating the similar O/C ratio between precursors and products in fog water. Upon scrutinizing the formation pathways of sfNOCs involving nitrogen addition, it  
245 becomes apparent that two NH<sub>3</sub> addition pathways are comparable to the nitration pathway in fog water. Nitration, NH<sub>3</sub>Add1, and NH<sub>3</sub>Add2 produce 352, 374, and 390 sfNOC products, constituting 26.8%, 28.4%, and 29.7% of all sfNOCs, respectively. The MNR<sub>+/-</sub> of the sfNOCs generated by these three pathways are 0.25, 0.84, and 0.78, respectively (Table S2), which is similar to that of asNOCs. Based on these analyses, it is evident that nitration plays a more pivotal role in the formation of NOCs in aerosols, while NH<sub>3</sub> addition prevails in fog water. Numerous laboratory studies have investigated the aqueous-phase reactions between carbonyls and reduced nitrogen (Ervens et al., 2011; Jimenez et al., 2022). However, field  
250 evidence of such reactions in the atmosphere remains scarce. Liu et al. have suggested that NH<sub>3</sub> addition reactions are critical in the formation of reduced NOCs in cloud water at Mt. Tai (Liu et al., 2023b). The analogous finding in fog water from this study underscores the enhancement of NH<sub>3</sub> addition reactions in dilute aqueous phases.

It's important to note that some formulas regarded as precursors (primary molecules in aerosols and activated molecules in  
255 fog water) may also be formed by secondary processes. However, their formation would not necessarily increase the richness of organic composition. We primarily focused on the formation pathways of new molecular formulas that directly contribute to increasing chemical richness. Therefore, the formation of previously existing molecules was not considered.

### 3.4 Possible explanations for the different formation pathways of NOCs in aerosols and fog water

The different contributions of formation pathways to secondary NOCs in pre-fog aerosols and fog water may be linked to  
260 several factors, including the aqueous concentrations of nitrogen-containing species (e.g., NO<sub>3</sub><sup>-</sup> and NH<sub>4</sub><sup>+</sup>), the distribution of organic precursors, the properties of the aqueous phases (e.g., LWC and pH), and the gas-phase species partition.



First, the average  $\text{NH}_4^+/\text{NO}_3^-$  ratios in terms of mass concentration in two fog water samples were found to be 0.45 and 0.57, respectively. The concentrations of water-soluble ions in pre-fog aerosols were not detected in this study. However, Zhang et al. collected fine ( $< 1 \mu\text{m}$ ) and coarse particulates ( $> 1 \mu\text{m}$ ) at the same site and observed  $\text{NH}_4^+/\text{NO}_3^-$  ratios of 0.45-0.68 for  $\text{PM}_{10}$  and 0.51-0.66 for  $\text{PM}_{>10}$  collected on Dec. 8 and Dec. 9 (corresponding to QDP1 and QDP2 in this study), which is close to or slightly higher than those in fog water (Zhang et al., 2021). Therefore, the disparate pathways of NOC formation cannot be solely attributed to variations of  $\text{NH}_4^+$  and  $\text{NO}_3^-$  across the two phases.

Second,  $\text{NH}_3$  addition reactions are exclusively viable on the carbonyl group, rendering them more selective than nitration. Precursors in pre-fog aerosols predominantly comprise primary molecules from BB, CC, and VE, with a low average O/C of 0.39. Conversely, those in fog water comprise more oxidized organics (O/C = 0.48 on average), encompassing both primary and secondary molecules formed in pre-fog aerosols, which may allow the presence of more carbonyl groups (Fig. 2 and S6). Functional group identification is challenging in the formula list obtained via FT-ICR MS, though, carbonyls have been extensively detected in fog and cloud water at other sites (Ervens et al., 2013; Van Pinxteren et al., 2005). Furthermore, a higher LWC in fog water compared with aerosols may facilitate the dissolution of carbonyl compounds (e.g., methylglyoxal) from the gas phase, augmenting their aqueous concentrations (Li et al., 2020b). The heightened formation of imidazole, a typical product of carbonyls and ammonium/amine, has also been observed in cloud droplets in southern China (Lian et al., 2021). Hence, it is reasonable to speculate that the divergent distributions of organic precursors, especially carbonyls, in the two phases may lead to distinct reaction pathways.

Third, the varying acidity levels in pre-fog aerosols and fog water likely provide another plausible explanation for the different contributions of various formation pathways to secondary NOCs. The pH value of fog water in this study was measured at 5.1, while those of pre-fog aerosols (both  $\text{PM}_{10}$  and  $\text{PM}_{>10}$ ) were estimated to be less than 4.0 by the ISORROPIA-II model (Zhang et al., 2021). Such pH discrepancies may result in several-fold differences in reaction rates for nitration and  $\text{NH}_3$  addition pathways. For instance, the formation rate of 2,4-dinitrophenols from the nitration of 4-nitrophenol at pH 4 is approximately 4.4 times higher than that at pH 5 (Vione et al., 2005), whereas the reaction rate between glyoxal and ammonium sulfate at pH 5 is approximately 15 times higher than that at pH 4 (Iupac, 2017).

Finally, gas-phase nitrogen-containing species ( $\text{NO}_2$ , amines, and  $\text{NH}_3$ ) may also influence the NOC formation in aerosols and fog water through two pathways: 1) NOCs formed via gas-phase reactions partition into the condensed phase; 2) gas-phase species partition into the condensed phase and subsequently participate in aqueous-phase NOC formation. While nitration can occur in the gas phase, the concentrations of  $\text{NO}_2$  during pre-fog aerosol and fog water collection times were similar (51.5 and 53.0 ppb, respectively). Therefore, the variation in  $\text{NO}_2$  levels cannot adequately explain the divergent formation pathways observed in the two phases. Furthermore, reactions between carbonyls and reduced nitrogen predominantly occur in the aqueous phase. Gas-phase  $\text{NH}_3$  and amines may influence these reactions through the second pathway. Given the proximity of  $\text{NH}_4^+/\text{NO}_3^-$  ratios in aerosols and fog water, variations in  $\text{NH}_3$  or  $\text{NH}_4^+$  concentrations are unlikely to account for differing reactions in the two phases. This discrepancy may be attributed to an excess of  $\text{NH}_3$  in the reactions. However, previous studies have demonstrated that atmospheric amines primarily partition into cloud/fog water

(Leng et al., 2015). Importantly, the formation of reduced nitrogen-containing compounds is more efficient in the presence of amines (Jimenez et al., 2022). Thus, gas-phase amines also have the potential to impact NOC formation through partitioning into fog water.

### 3.5 The impact of secondary processes on compositions of NOCs

300 To evaluate the impact of secondary processes on the molecular composition of NOCs, we classified NOCs into seven classes in the VK plot (Table S3) (Bianco et al., 2018). A heatmap, generated based on these molecular classes, vividly illustrates the variations in the distribution of pNOCs, saNOCs, and sfNOCs (Fig. 4A). Notably, pNOCs in pre-fog aerosols predominantly consist of CRAMs-like structures (61.4%), whereas saNOCs exhibit an enrichment in carbohydrates-like compounds (28.3% in saNOCs vs. 3.8% in pNOCs) and highly oxygenated compounds (HOCs, 25.2% in saNOCs vs. 4.6%  
305 in pNOCs), indicative of the higher oxidation state and saturation of saNOCs. Conversely, sfNOCs display a significantly higher number fraction of lipids-like compounds (21.4%) compared to pNOCs (8.0%).

The divergent composition of saNOCs and sfNOCs results from distinct formation pathways. The nitration products in pre-fog aerosols are dominant by HOCs (37.5%). Conversely, NH<sub>3</sub> addition reactions in pre-fog aerosols predominantly enhance aliphatic/peptides-like compounds (32.5% and 26.1% for NH<sub>3</sub>Add1 and NH<sub>3</sub>Add2, respectively, Fig. 4A). Obviously, the  
310 composition of nitration products is closely similar to that of all saNOCs, indicating a significant contribution of nitration in aerosols to the presence of highly oxygenated NOCs. The average relative humidity in this study during the pre-fog aerosol collection is 70 ± 14% (Fig. S1). Based on ISORROPIA-II estimates, PM<sub>1</sub> samples collected on Dec. 8 and Dec. 9 exhibited aerosol water contents of 33.9 and 22.3 μg m<sup>-3</sup>, respectively. Such elevated relative humidity and liquid contents may favor the formation of HOCs in aerosol liquid water, as evidenced by observations of aqueous-phase formation of oxygenated  
315 organic aerosol during haze events in the North China Plain (Feng et al., 2022; Kuang et al., 2020; Xu et al., 2017).. Applying the same method to fog water, NH<sub>3</sub>Add1 and NH<sub>3</sub>Add2 products enrich lipids-like NOCs (19.0% and 21.2%), whereas nitration products are dominated by HOCs (42.9%). NH<sub>3</sub> addition products show a similar composition to all sfNOCs (Fig. 4A), illustrating that NH<sub>3</sub> addition plays an important role in shaping sfNOCs composition.

Further subdivision of NOCs into different subclasses based on the distribution of characteristic elements (N, O, and S) can  
320 offer additional insights into molecular composition. The distribution of CHON molecule subclasses is depicted in Fig. 4B. pNOCs exhibit an approximate normal distribution with peaks at -N<sub>1</sub>O<sub>7</sub> and -N<sub>2</sub>O<sub>6</sub> for one- and two-nitrogen molecules (-N<sub>1</sub> and -N<sub>2</sub>), respectively. In saNOCs, the fraction of -N<sub>1</sub> NOCs decreases, while that of -N<sub>2</sub> NOCs (e.g., -N<sub>2</sub>O<sub>5-7,10-12</sub>) increases. Conversely, sfNOCs display a lower content of oxygen atoms, with peaks at -N<sub>1</sub>O<sub>5</sub> and -N<sub>2</sub>O<sub>3</sub> (Fig. 4B). Nitration and NH<sub>3</sub> addition in pre-fog aerosols likely contribute to the augmentation of -N<sub>2</sub>O<sub>10-12</sub> and -N<sub>2</sub>O<sub>5-7</sub>, respectively. The high ratio of  
325 O/N observed in these NOCs allows the presence of -NO<sub>2</sub> or -ONO<sub>2</sub> functionalities (Leclair et al., 2012; Song et al., 2021). However, NH<sub>3</sub> addition products may encompass both reduced nitrogen and other oxidized functional groups. The surplus oxygen atoms may predominantly exist in the form of oxygen-containing functional groups, such as -OH and -COOH (Tang

et al., 2022; Yang et al., 2023). In fog water, nitration and NH<sub>3</sub> addition mainly contribute to high- and low-oxygen-number molecules, respectively, with NH<sub>3</sub> addition products displaying a distribution similar to that of all the sfNOCs.

330 The heatmap illustrating the distribution of CHONS is shown in Fig. S8, in which the same conclusion can be easily drawn, namely, NH<sub>3</sub> addition reactions play a more significant role in shaping the composition of sfNOCs. In addition, the count of CHN in sfNOCs (n = 29) exceeds that in saNOCs (n = 8), which further underscores the heightened contribution from NH<sub>3</sub> addition in fog water.

#### 4 Conclusions

335 A case study was conducted on the composition of NOCs in pre-fog aerosols and fog water at a suburban site in northern China during a winter haze episode. NOCs constitute over 60% of all molecular formulas assigned by both ESI- and ESI+ modes coupled with FT-ICR MS, indicating a significant contribution of NOCs to the haze pollution. Primary anthropogenic emissions predominantly contribute to the species richness of NOCs in pre-fog aerosols, accounting for over 70% of the number fraction, while the remaining fraction is attributed to secondary aqueous pathways. The nitration reaction plays a  
340 dominant role in secondary NOC formation in aerosols, while NH<sub>3</sub> addition pathways are more important in fog water. As a result, the secondary NOCs in aerosols contain a high abundance of HOCs and carbohydrates compounds with two nitrogen atoms compared to primary NOCs. Differently, secondary NOCs formed in fog water are associated with increased lipids-like compounds, potentially containing more abundant reduced nitrogen. It is important to note that our findings may be specific to the observed conditions due to the limited sample size. Therefore, conducting more representative research that  
345 includes a broader range of samples under different environmental conditions is necessary in the future. Nevertheless, this study highlights that the reactions occurring in the aerosols and fog water yield distinct secondary NOCs compositions. Particularly noteworthy is the identification of NH<sub>3</sub> addition and corresponding reduced NOCs formation in fog water. This phenomenon has not been widely recognized since limited studies have utilized ESI+ to capture reduced NOCs in cloud and fog water (Liu et al., 2023b). Both oxidized NOCs (e.g., nitrophenols) and reduced NOCs (e.g., imidazole) constitute brown  
350 carbon component. However, their maximum absorption wavelengths differ, potentially resulting in distinct climate effects. Considering that aqueous-phase formed secondary NOCs may contribute to secondary organic aerosols, gaining a deeper understanding of their aqueous-phase formation processes will be crucial for better assessing their climate effects.

*Supplement.* Supporting information includes two texts (Text S1-2), eight figures (Fig. S1-S8), and three tables (Table S1-3)  
355 related to the manuscript.

*Data availability.* The raw data of this study can be obtained by contacting the corresponding author.

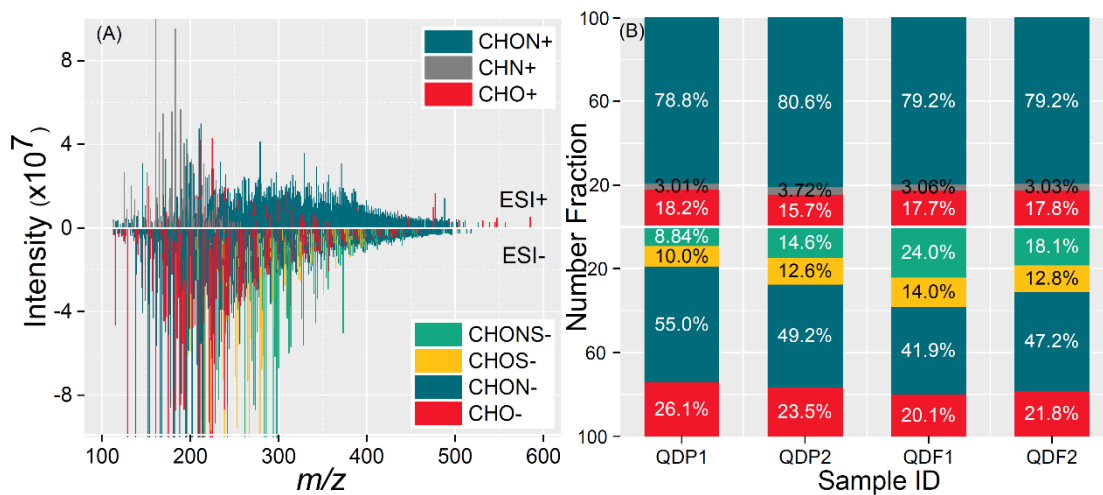
360 *Author contributions.* XB and GZ design the research with input from XW and PP. WS, XH, and YF collected samples. WS  
and BJ carried out the sample pretreatment and instrumental analysis under the guidance of YL. WS processed data, and  
wrote the manuscript. XB, and GZ edited the manuscript. LX, CY, XW, YZ, and HM had an active role in supporting the  
sampling work. All authors contributed to the discussions of the results and refinement of the manuscript.

365 *Competing interests.* The authors declare that they have no conflict of interest.

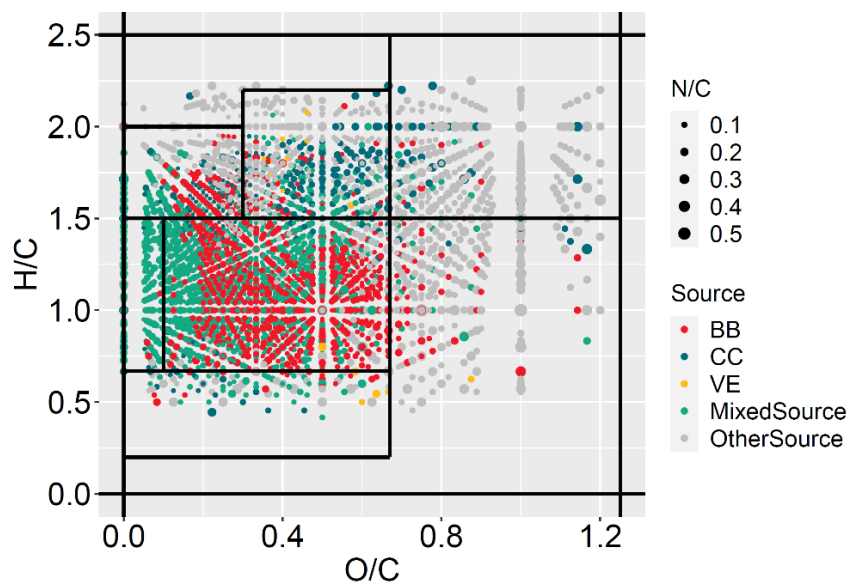
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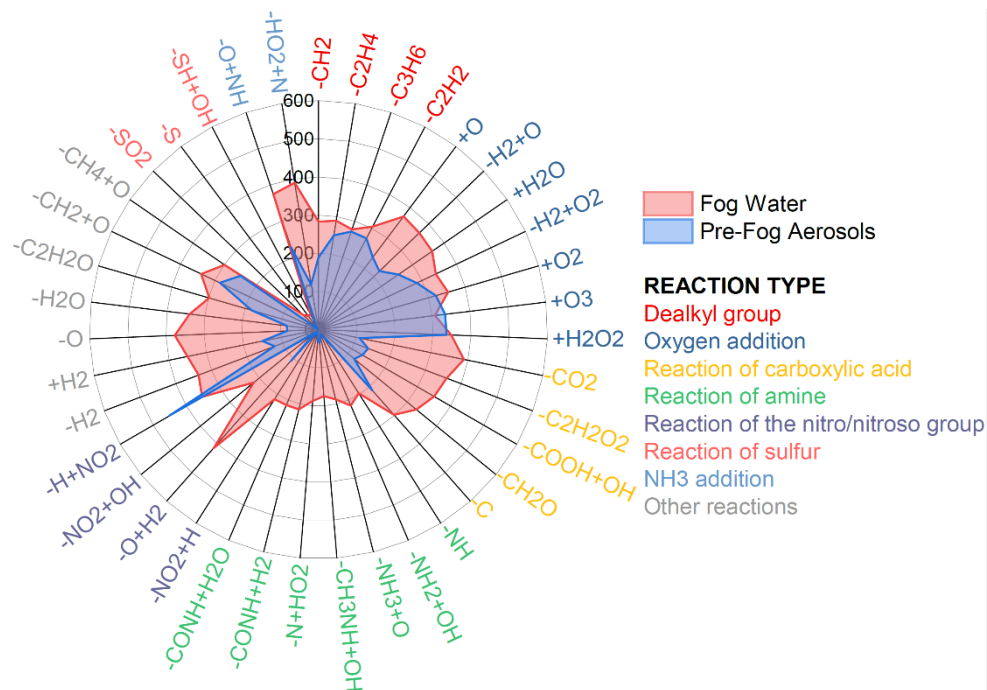
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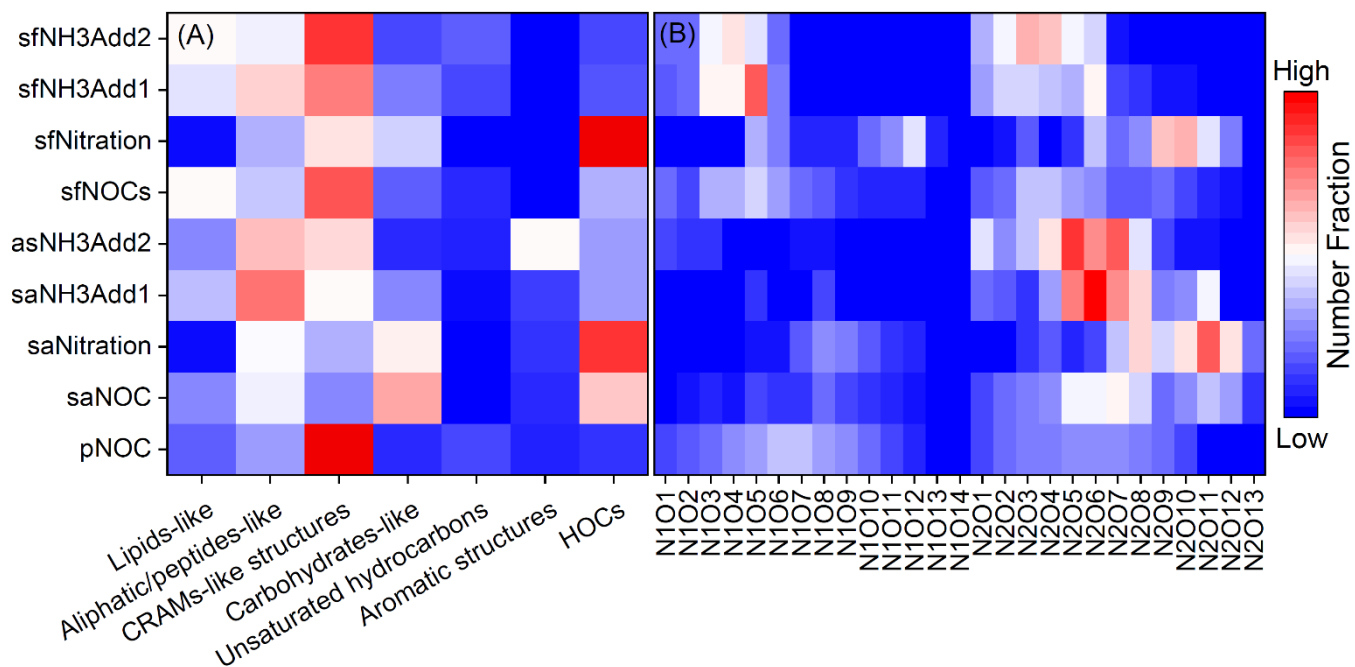
375 **Figure 1: Panel A: The reconstructed mass spectrogram of a typical aerosol sample QDP1. The negative and positive values of the y-axis represent the intensities of the ion peaks detected in ESI- and ESI+, respectively. Panel B: The number fraction of each molecular group in ESI- and ESI+ mode.**



380 **Figure 2: The Van Krevelen diagrams for NOCs from different sources (Biomass burning, BB; Coal combustion, CC; Vehicle emission, VE, and other sources) in pre-fog aerosols. The “MixedSource” in the plot represents the molecules were assigned to at least two sources of BB, CC, and VE.**



385 **Figure 3: Radar plot of the links from precursors (primary molecules in aerosols and activated molecules in fog water) to products (saNOCs and sfNOCs) in pre-fog aerosols and fog water based on 39 reaction pathways. The y-axis (0-600) in the plot represent the number of “precursor-product pair”.**



**Figure 4:** The heatmap of seven classes of NOCs divided by O/C and H/C (panel A) and subclasses of CHON divided by the number of N and O atoms in pNOCs, all saNOCs, all sfNOCs, and nitration- and NH<sub>3</sub> addition- formed NOCs (panel B).



**Table 1: The ranges of the relative-abundance-weighted average values of the parameters (including O/C, OS<sub>c</sub>, H/C, DBE, #C and MW)**

		O/C	OS <sub>c</sub>	H/C	DBE	#C	MW
	CHON-	0.51-0.57	-0.66~-0.67	1.05-1.17	6.42-6.54	10.75-11.81	242.2-277.7
Pre-Fog	CHON+	0.31-0.34	-1.17~-1.03	1.32-1.41	6.68-7.52	17.24-17.30	332.6-340.9
Aerosol	CHONS-	0.81-0.86	-1.29~-1.23	1.65-1.76	2.67-3.30	9.51-10.09	304.0-311.5
	CHN+	--	--	1.30-1.31	6.16-6.18	11.92-11.96	184.7-185.1
	CHON-	0.59-0.59	-0.77~-0.73	0.98-1.02	5.82-5.96	8.47-9.19	207.8-222.9
Fog	CHON+	0.31-0.31	-1.39~-1.38	1.46-1.47	6.07-6.20	15.89-15.96	309.8-310.0
Water	CHONS-	0.78-0.81	-1.22~-1.21	1.53-1.63	3.49-4.10	10.27-10.41	313.7-316.7
	CHN+	--	--	1.39-1.47	5.07-5.52	11.36-11.85	176.4-181.2

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