



Combustion-Derived Organic Aerosols Enhance PM_{2.5} Oxidative Potential in a Medium-Sized North China Plain City

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Abstract

Organic aerosol (OA) is a major component of PM_{2.5} with significant health impacts, particularly in the highly populated NCP. However, characterizing OA composition, toxicity, and sources remains challenging. To address this, we conducted an intensive campaign throughout the 2023 – 2024 heating season in Weifang, a representative medium-sized NCP city. Despite overall air quality improvements, severe winter PM_{2.5} pollution events still occurred, with a maximum concentration reaching 985 $\mu\text{g m}^{-3}$. Using a Chemical Ionization Time-of-Flight Mass Spectrometer equipped with a Filter Inlet for Gases and AEROSols (FIGAERO-CIMS), we obtained molecular composition and identified six clusters, linking them to sources resolved by positive matrix factorization (PMF) applied to the online dataset, including secondary



43 inorganics, biomass burning, vehicle emissions, coal combustion, and dust. To
44 evaluate toxicity, we determined the oxidative potential (OP) in Weifang.
45 While volume-normalized OP (OP_v) increased with both the degree of
46 unsaturation and O:C ratios of OA, the compounds most positively correlated
47 with mass-normalized OP (OP_m) exhibited an average carbon oxidation state
48 of -0.5 and O:C of 0.5, indicating that moderately oxygenated OA possesses
49 high OP activity. Multiple linear regression revealed that two combustion-
50 derived groups drive OP: highly unsaturated C_{10-15} compounds with ~10
51 oxygen atoms from solid fuel burning, and $C_{>15}$ compounds with <5 oxygen
52 atoms or nitrogen-containing compounds from traffic emissions, which
53 exhibited OP_m up to 23 times higher than the ambient average. Our study
54 highlights the continued need for primary emission controls, particularly those
55 targeting solid fuel combustion in the NCP region beyond its megacities.

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60 1. Introduction

61 Organic aerosols (OA) typically account for 20% – 60% of ambient PM
62 mass in the atmosphere and are the primary driver of aerosol cytotoxicity and
63 adverse health outcomes, including respiratory inflammation, cardiovascular
64 dysfunction, and premature mortality. In Chinese cities, OA constitutes 33%
65 to 48% of fine particulate matter (PM_{2.5}) (Huang et al., 2014), and its relative
66 contribution, particularly from secondary organic aerosol (SOA), has increased
67 substantially in recent years (Chen et al., 2024).

68 Epidemiological studies have indicated strong associations between OA and
69 adverse outcomes, including respiratory and cardiovascular hospital visits,
70 morbidity, and mortality (Pye et al., 2021). Oxidative stress from certain
71 pollutants, typically recognized as the pivotal mechanism underlying PM-
72 related health hazards in toxicological studies, is quantified using oxidative
73 potential (OP) as an indicator of redox activity. Some inhaled trace organic
74 compounds were found to have high OP and corresponding high adverse health
75 impacts. These compounds, such as quinones (e.g., 1,2-naphthoquinone, 1,4-
76 phenanthraquinone), nitroaromatics, and humic-like substances (HULIS),
77 stimulate excessive reactive oxygen species (ROS) generation, thereby
78 disrupting antioxidant homeostasis and causing cellular damage and sustained
79 inflammation (Fang et al., 2019; Chen et al., 2019; Shang et al., 2012). For
80 example, the redox cycling of quinones and semiquinone radicals in the
81 presence of ascorbic acid and iron can generate ROS, potentially increasing
82 PM toxicity (Li et al., 2012). Similarly, HULIS may act as electron transfer
83 intermediates to catalyze ROS production, and this process can be enhanced
84 by reduced organic nitrogen compounds like alkaloids (Dou et al., 2015).

85 Due to the vast variations in the chemical composition, functional groups,
86 redox properties, and interactions within OA across different sources, the
87 resulting OP and health impacts are highly compound and source dependent
88 (Bates et al., 2019). High-risk compounds that drive OP, such as nitro-/oxy-
89 aromatics, polyphenols (Poly) and condensed aromatic amines, are more
90 enriched in sources like residential combustion and biomass burning (Cao et
91 al., 2025b; Zhang et al., 2025). Meanwhile, traffic-derived POA, enriched with
92 PAHs and adipic acid (Zhang et al., 2016), also exhibits heightened OP and
93 health risks. Furthermore, beyond primary emissions, the formation rate and
94 toxicological potency of SOA are both highly dependent on the nature of its
95 precursors and sources. For example, through rapid multi-generational



96 oxidation, anthropogenic aromatics like naphthalene and toluene produce
97 organic compounds with much lower volatility (Wang et al., 2020a), a higher
98 SOA production rate (Gu et al., 2023), and greater OP activity than biogenic
99 precursors such as α -pinene (Tuet et al., 2017). Additionally, when fresh
100 anthropogenic mixed with biogenic emissions, ROS generation and OP can be
101 further enhanced due to quinone-terpenoid adduct stabilization of semiquinone
102 radicals (Chen et al., 2026).

103 The North China Plain is a vast urban cluster with a population exceeding
104 340 million and a density of over 1,000 inhabitants per km², making it one of
105 the world's most densely populated regions (Kulmala et al., 2021). In this
106 region, significant amounts of carbonaceous aerosols and precursor VOCs are
107 emitted from major sources such as solid fuel burning, vehicle exhaust, and
108 agricultural activities. Based on the MEIC (Multi-resolution Emission
109 Inventory model for Climate and air pollution research) inventory, in 2025,
110 over 2.8×10^5 tons of organic carbon (OC) and 1.8×10^5 tons of black carbon
111 (BC) were emitted in this region (Geng et al., 2024; Peng et al., 2019).
112 However, while it is widely recognized that PM levels in this region exhibit
113 spatial homogeneity validated by strong temporal correlations between cities
114 within 250 km (Hu et al., 2014), the emission sources and intensity of
115 carbonaceous aerosols display distinct spatiotemporal heterogeneity. Aerosol
116 growth factors, OA composition, and formation pathways in smaller NCP
117 cities (e.g., Xingtai and Handan) are distinct from those in Beijing due to
118 different primary emissions and meteorological conditions (Wang et al., 2021;
119 Gu et al., 2023). Gasoline and diesel vehicle emissions, for instance, are
120 heavily concentrated in Beijing and Tianjin, where they constitute over 80%
121 of transport-sector OC. In contrast, residential biofuel combustion is largely
122 confined to Hebei and Shandong provinces, contributing 90% of the OC from
123 this source with over 60% emitted during the heating season.

124 To the best of our knowledge, most previous studies on OA composition and
125 its health impacts in the NCP have focused on megacities like Beijing and
126 Tianjin. For example, Ma et al. (2018) identified biomass burning, coal
127 combustion, waste incineration, vehicle emissions, and secondary formation as
128 the dominant drivers of PM_{2.5} OP in Beijing; Zheng et al. (2026) reported
129 higher OP and carcinogenic risks during polluted events such as firework
130 events and haze episodes; and Zhou et al. (2019) demonstrated that SOA
131 dominates OP, contributing 60% of the total OP in Beijing. In contrast, the few
132 studies conducted at rural NCP sites, mostly over short sampling periods, have



133 highlighted the significant contributions of nitrogen-containing organic
134 compounds (Cao et al., 2026) and biomass burning to OP (Liu et al., 2024a).

135 The key toxic components and underlying health impact mechanisms of OA
136 in broader NCP regions, especially in medium-sized cities, remain poorly
137 constrained. This gap is particularly critical considering that over 80% (> 260
138 million) of the NCP population resides in over 50 medium-sized cities (1 – 10
139 million population). However, it remains unknown whether OP in those cities
140 has declined as sharply as in Beijing recently, where strict regulations on
141 residential burning have driven a drop in mass-normalized OP in the past
142 decade (from 150 in 2015 to 24 pmol min⁻¹ µg⁻¹ in the 2020s (Zheng et al.,
143 2026)). Bridging this gap by characterizing the key OA components that drive
144 OP is vital for evaluating the health benefits of populations in these densely
145 populated, medium-sized areas.

146 In this study, we conducted a field campaign covering the whole heating
147 period from 2023 – 2024 in Weifang. We integrated offline filter sampling with
148 molecular OA characterization via FIGAERO-CIMS (Cai et al., 2023)),
149 alongside OP assays of ambient samples and standard chemicals, cluster
150 analysis, and online PM_{2.5} chemical speciation and PMF source apportionment.
151 Our main objectives are: (1) to elucidate the near-molecular composition and
152 concentrations of OA in Weifang; (2) to identify key OP-active organic
153 compounds and their cluster characteristics, and to validate these findings
154 using standard chemicals; and (3) to apportion the emission sources of high
155 OP-active OA compounds in Weifang. This work provides new insights into
156 the molecular-scale drivers of PM toxicity in medium-sized cities in the NCP
157 region. Furthermore, these findings can inform targeted air quality
158 management strategies based on particle composition and toxicological effects
159 across the broader NCP, where the majority of the population resides in
160 densely populated medium-sized cities.

161 **2. Method**

162 **2.1 Measurement: Measurement site and filter collections**

163 Field measurements in this study were conducted in Weifang; a city located
164 in the NCP region and has a population over 9 million. The city is characterized
165 by substantial primary emissions and vigorous secondary formation of
166 pollutants. Consequently, its dense population faces heightened exposure to
167 elevated concentrations of fine particulate matter.



168 Offline PM_{2.5} Quartz filter samples collection in this study was conducted
169 on the rooftop of Wenti Building in Shandong Second Medical University
170 (36.7°N, 119.7°E), located in the urban area of Weifang city, using a Four-
171 channel air particle sampler (TH-16A, Wuhan Tianhong Instrument Co., Ltd.)
172 from Nov 15, 2023, to Mar 15, 2024, covering the whole heating season in
173 Weifang. Offline samples (24-h) were collected from 12 am to 12 am every 3
174 days for FIGAERO-CIMS and dithiothreitol (DTT) tests. The sampling site
175 has been introduced in a previous study (Li et al., 2025). All data have
176 undergone strict quality control in accordance with the requirements of the
177 corresponding instruments.

178 Online chemical components of PM_{2.5} were measured in another near site
179 covering the whole sampling period with a time resolution of 1 hour (see SI
180 for a detailed description). Those components include black carbon (BC),
181 measured by Aethalometer (AE33, Magee Scientific Inc., USA), total carbon
182 (TC) measured by Total Carbon Analyzer (TCA-08, Magee Scientific Inc.,
183 USA), trace elements (including Al, K, Ca, Ti, Mn, Fe, Co, Cu, Zn, Se, and Pb)
184 measured by an x-ray fluorescence instrument Online Atmospheric Heavy
185 Metal Detector (AHMA-1000, NCS Testing Technology Co., Ltd., China) and
186 water-soluble ions (sulfate, nitrate, ammonium, and chloride) were measured
187 by a Monitor for AeRosols and Gases in ambient Air (MARGA, Metrohm Inc.,
188 Switzerland). Organic carbon (OC) was calculated as TC minus OC and OA
189 was calculated as 1.4 times OC.

190 **2.2 Analyze: FIGAERO-CIMS, DTT, Standard DTT analyze**

191 Offline analysis of PM_{2.5} filter samples was conducted utilizing a
192 FIGAERO-CIMS (Aerodyne Research Inc., USA and ToFwerk AG,
193 Switzerland) configured with I⁻ as the reagent ion (Zha et al., 2023; Lopez-
194 Hilfiker et al., 2014). To generate the reagent ions, heated and dry ultra-high-
195 purity N₂ was directed through a permeation tube containing liquid methyl
196 iodide (CH₃I; Alfa Aesar, 99%) and subsequently into an X-ray source
197 (ToFwerk AG, P-type), thereby producing I⁻ to charge the thermally desorbed
198 compounds from the filter samples. For analysis, small circular punches
199 (3.1×10^{-2} cm², 2 mm diameter) were taken from the collected filters. These
200 punches were manually loaded into the FIGAERO-CIMS filter holder between
201 two pre-baked, full-sized (25 mm diameter) Zefluor® Teflon filters, a method
202 adapted from previous studies (Cai et al., 2023; Cai et al., 2022). The thermal
203 desorption procedure with a uniform temperature ramping from 25 °C to



204 200 °C was deployed to analyze the OA. And the calibrations were conducted
205 with levoglucosan ($C_6H_{10}O_5$) and succinic acid ($C_4H_6O_4$). The data was
206 analyzed with Tof-ware (ver. 3.3.2) and 1,630 compounds were identified in
207 the ambient samples. The OA compounds identified with FIGAERO-CIMS
208 can be regarded as oxygenated since I^- is more favored to charge moderately
209 oxygenated OA. Double Bond Equivalent (DBE), O to C ratio (O:C) and
210 oxidation state (OS) of compounds were also calculated (see SI for a detailed
211 description).

212 In our study, OA compounds identified by FIGAERO-CIMS were defined
213 as CHO X ($C_{\geq 1}$, $H_{\geq 1}$, $O_{\geq 2}$, where X represents N_{0-n} , S_{0-n} , or both). These CHO X
214 species were considered as oxygenated species since I^- ionization tends to
215 select toward moderately oxygenated OA. Concentrations of CHO X were
216 carefully calibrated using levoglucosan ($C_6H_{10}O_5$) and succinic acid ($C_4H_6O_4$).
217 Specifically, integrated signals for lower molecular weight compounds ($m/z <$
218 120) were calibrated with succinic acid, while other compounds (m/z from 120
219 to 500) were calibrated with levoglucosan, as its sensitivity approaches the
220 collision-limit of the FIGAERO-CIMS (Lopez-Hilfiker et al., 2016). Using
221 this semi-quantitative method, we determined that the identified CHO X
222 species constituted approximately 40 % of the total OA mass concentration
223 during the study period.

224 The OP of ambient $PM_{2.5}$ samples and commercial standards was measured
225 using the DTT assay. This well-established method has been described in detail
226 previously (Ma et al., 2018; Cho et al., 2005) and is thus only briefly introduced
227 here. Half of each collected ambient sample was ultrasonically extracted in 5.0
228 mL of purified water for 60 min in a water bath at 37 °C. The extracts were
229 filtered through a 0.45 μm PTFE membrane filter. The dissolved samples in
230 filtrates were then reacted with excess DTT and the consumption rate was
231 measured by an ultraviolet-visible (UV-Vis) spectrophotometer (Ma et al.,
232 2018; Cho et al., 2005). Therefore, it should be noted that water-insoluble
233 components, including elemental carbon (EC), water-insoluble organics (e.g.,
234 HULIS), and insoluble metals, were not analyzed in the DTT analyses in this
235 study. In total, 45 samples, 2 blanks were analyzed for this study, accompanied
236 by daily standard calibration curves obtained before and after experiments (see
237 Supporting Information for detailed methods). The volume normalized (OP_v)
238 and mass normalized OP (OP_m) were calculated as Eq.1 to 3.

239



$$OP_{v-PM} = \frac{(Abs_b - Abs_a) \times DTTc}{RT \times V_{ambient}} \quad \text{Eq. 1}$$

$$OP_{m-PM} = \frac{(Abs_b - Abs_a) \times DTTc}{RT \times M_{ambient}} \quad \text{Eq. 2}$$

$$OP_{m-chem} = \frac{(Abs_b - Abs_a) \times DTTc}{RT \times M_{Chem}} \quad \text{Eq. 3}$$

Abs_a and Abs_b are the light absorption for each sample at time 0 and time b, respectively. $DTTc$ refers to DTT concentration (nmol), and RT is the reaction time at 37 °C. $V_{ambient}$, $M_{ambient}$ and M_{Chem} represent the volume of the ambient sample, the mass concentration of the ambient sample, and the added mass of the standard, respectively. Notably, our subsequent analysis validates the use of water extraction by identifying water-soluble OA (dominated by oxygenated species) as the primary driver of the measured OP, demonstrating significantly stronger correlations than transition metals (Fig. S6).

2.3 Data analyses

Hierarchical Cluster Analysis (HCA) clustering method is applied to classify OA offline samples based on their molecular-level composition and temporal variations. The analysis was conducted using R software (ver. 4.4.1) with 274 high concentration compounds with signal intensity > 0.05% of total CHOX and at least twice the background level which defined as the standard deviation of field blanks. The details for clustering methods have been given in SI.

The positive matrix factorization (PMF) model was utilized with online data with the resolution of 1-h for source apportionment of $PM_{2.5}$. The online $PM_{2.5}$ component data was imported into the Source Finder toolkit (SoFi, ver. 6.8.4), which communicates with the multi-linear engine (ME-2). The PMF model was conducted with a factor number from 2 to 7 and the results of 5 factors were chosen (see SI for a detailed description).

We applied both online source apportionment using PMF with $PM_{2.5}$ component data, and offline sample analyses utilizing FIGAERO-CIMS data with an HCA clustering model to characterize the source of OA. Although the two methods operate on different time scales and utilize distinct tracers, the strong temporal correlation between their results ($r=0.7$ to 0.8 for most factors) indicates that the source apportionments from PMF and HCA are highly comparable. Furthermore, the consistency of inorganic and organic tracers across both models further solidifies these findings. A detailed comparison of



the organic clustering, organic tracers, and inorganic PMF results is presented in SI and Section 3.3.

3. Results

3.1 High levels of PM and OA in Weifang

Weifang displayed elevated gaseous pollutant concentrations compared to NCP megacities such as Beijing and Tianjin, where residential coal and biomass burning are restricted. During the same observation period (Nov 2023 to Mar 2024), Weifang's SO₂ (5 ppb) and NO₂ (17 ppb) levels were approximately twofold higher than those in Beijing (1.4 and 9.7 ppb, respectively) and Tianjin (2.5 and 10 ppb), revealing the ongoing significance of primary emissions. Furthermore, despite being only 300 – 400 km from Weifang, Beijing and Tianjin, a distance easily spanned by accumulation-mode PM transport, the NCP cannot be treated as a spatially homogenous emission region. This spatial heterogeneity directly affects the chemical composition and toxicity of regional air pollution, a conclusion further corroborated by the extreme PM levels during the episodes and Weifang's distinct OA composition.

Severe PM_{2.5} pollution events were frequently observed in Weifang during the measurement period, with a mean PM_{2.5} of 58 µg m⁻³ (Fig. 1a), and seven identified pollution episodes during which hourly levels exceeded 200 µg m⁻³. The PM_{2.5} concentration exhibited periodic cycles every 5 to 7 days, similar to those observed in Beijing which is typically driven by pollutant accumulation and cold front arrivals (Jia et al., 2008). However, a distinct daily cycle also emerged in Weifang, especially after January 2024, which peaked in the morning with gaseous pollutants (Fig. S2), underscoring the emissions influences (Fig. 3). The highest peak concentration (985 µg m⁻³) occurred on Chinese New Year's Eve, coinciding with intense firework emissions (Feb 9 – 11, 2024). These findings indicate that, despite the general decline of PM_{2.5} levels in megacities like Beijing (Chen et al., 2024; Dai et al., 2023; Chen et al., 2025a), autumn and wintertime air pollution may remain substantial across the broader NCP region. Specifically, nitrate was the most abundant species in PM_{2.5} (16.6 µg m⁻³, 29 %), followed by OA (12.3 µg m⁻³, 22 %) and sulfate (7.6 µg m⁻³, 13%). However, in Weifang, the correlation coefficient between PM_{2.5} and OA ($r = 0.80$) was stronger than that with nitrate ($r = 0.71$), underscoring that OA emissions are the key driver to fine PM pollution, especially during extreme episodes.

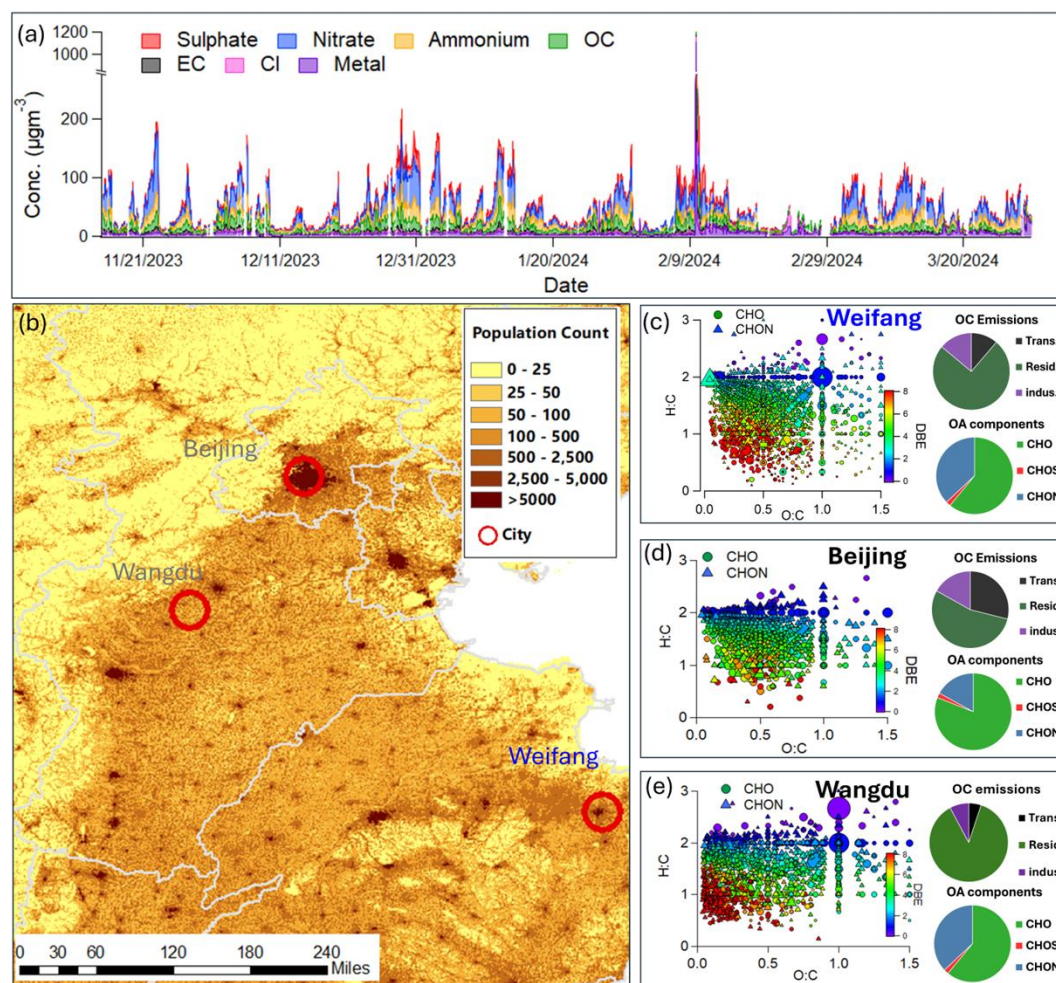


Figure 1. (a) Temporal variations of $\text{PM}_{2.5}$ and major chemical components during the sampling period; (b) Population density distribution in the North China Plain (data source: <https://landscan.ornl.gov/>); (c), (d), and (e) Van Krevelen (VK) diagrams for CHO and CHON compounds and group fractions (pie chart, green for CHO, blue for CHON and red for CHOS) from Beijing (BJ), Wangdu (WD), and Weifang (WF, this study) in autumn. The size area of dots was proportional to the fourth square root of corresponding integrated signals. Beijing and Wangdu data are adapted from Cai et al., 2022 (Cai et al., 2022) and Ren et al., 2022 (Ren et al., 2022), respectively. OC emission sections of each city were from MEIC (<http://meicmodel.org.cn>, (Geng et al., 2024)).

Based on FIGAERO-CIMS measurements, the observed OA in Weifang was classified into CHO, CHON, and CHOS groups to investigate its composition. These results were then compared with our previous heating-season measurements conducted in Beijing (Nov 2018, megacity site, population density $> 5000 \text{ km}^{-2}$) and Wangdu (Jan, 2019, rural site, population density $500 - 2000 \text{ km}^{-2}$) in the NCP (Fig. 1b). In Weifang, CHO, CHON, and



CHOS accounted for 61%, 37%, and 2% of the OA signals, respectively (Fig. 1c). This compositional distribution closely similar to that of Wangdu (CHO: 67%, CHON: 30%, CHOS: 3%; (Ren et al., 2022)), but differed significantly from Beijing (CHO: 81%, CHON: 17%, CHOS: 2%; (Cai et al., 2022)). Notably, the CHON proportion in Weifang was comparable to Wangdu, a site heavily influenced by biomass burning during the harvesting and heating seasons. The elevated CHON fractions in Weifang and Wangdu are consistent with their higher NO₂ levels (36 ppb and 34 ppb on average, respectively, versus 29 ppb in Beijing) in autumn and winter, which are likely driven by local NO_x concentrations and intense combustion activities (e.g., biomass and residential burning).

It is consistent with the emission inventories (MEIC) which suggest residential burning is the dominant OC source in Weifang, which is lower than Wangdu (87%) but substantially higher than in Beijing (54%). Consistent with this, a large fraction of levoglucosan (0.9 % in signal intensity) and compounds with DBE>4 comprised ~40% of the total OA by number during the measurement period (Fig. 1c), exceeding previously reported fractions in Beijing (20%) but close to those in Wangdu (40%). This indicates that as a medium-sized city in the NCP, Weifang is more heavily influenced by primary residential combustion emissions than megacities like Beijing, yet comparable to the rural Wangdu site, characterized by intense agricultural activities, as further validated by the high urea signal (Fig. 1e).

3.2 Sources of PM_{2.5} in Weifang City

Hourly online water-soluble ions, OC/EC, and trace elements data were utilized to resolve major PM_{2.5} sources in Weifang using the PMF method. Based on the source apportionment results, we further compared the contribution of different PM_{2.5} sources and indicate the source origins of OA (Fig. 2a). The five-factor result was selected since adding more factors could not further improve the explanation of the residuals (Fig. S1). The identified sources include secondary inorganics (33%), biomass burning (26%), vehicle emissions (18%), coal combustion (13%) and dust (10%). Solid fuel burning (sum of biomass burning and coal combustion) contributed around 40% of total PM_{2.5}, implying the importance of residential emissions. The source apportionment results are further validated by their source profiles (Fig. S3), and their high correlation with organic and inorganic tracers. Detailed



information of source apportionment method and validation can be found in SI and the following section.

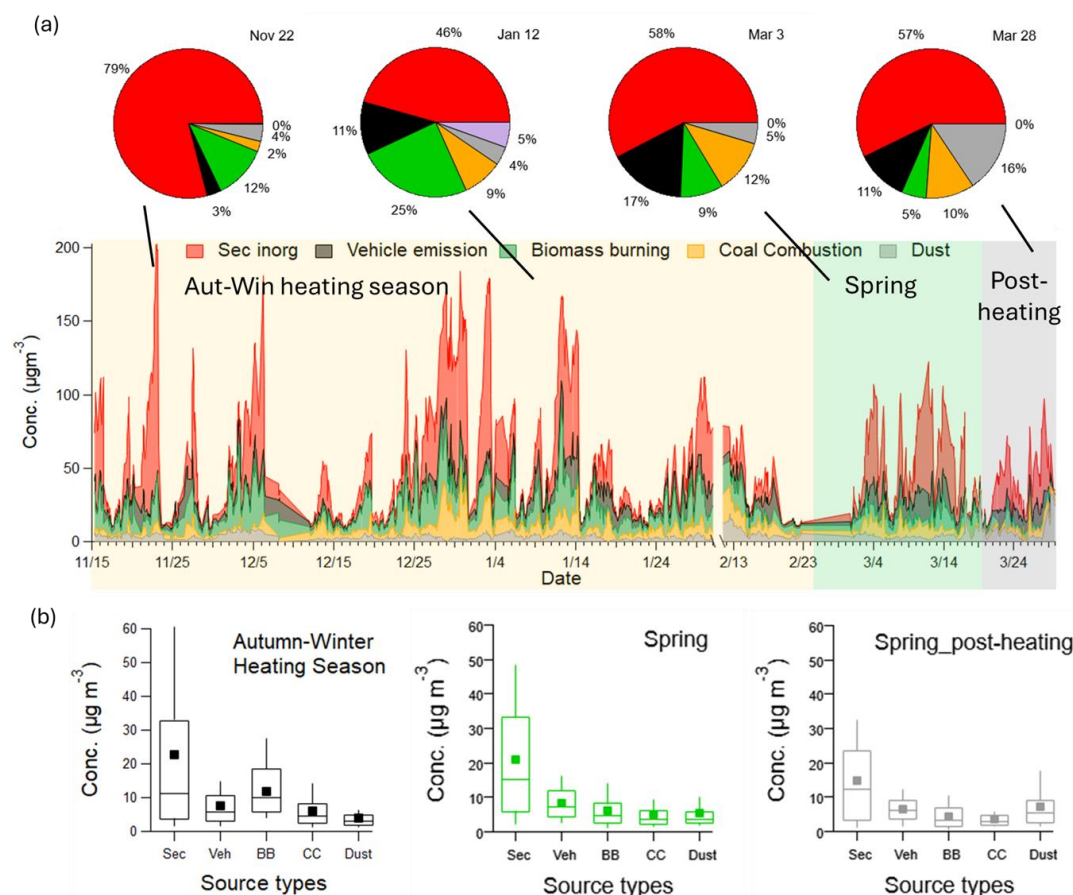


Figure 2. Source contribution variations during the sampling period, with pie charts showing four selected representative days (Nov 22, Jan 12, Mar 3, and Mar 28). Colors represent: red = secondary inorganic aerosols, black = vehicle emissions, green = biomass burning, orange = coal combustion, grey = dust, purple = others. (b) Concentrations of each identified source during the autumn-winter heating season, spring, and post-heating spring season. Abbreviations: Sec, secondary inorganic; Veh, vehicle emissions; BB, biomass burning; CC, coal combustion.

The diurnal profiles of the resolved source types reflected their inherent emission and atmospheric dynamics. Biomass burning exhibited a pronounced diurnal cycle, peaking at night ($\sim 15 \mu\text{g m}^{-3}$) and reaching a minimum in the afternoon around 14:00 ($< 7 \mu\text{g m}^{-3}$), coinciding with the maximum height of the typical urban boundary layer in NCP. In contrast, coal combustion peaked around 11:00, closely tracking the diurnal variations of SO₂ (Fig. S4). Given that residential coal combustion is the dominant source of SO₂ in this region,



376 this coherence confirms that the source apportionment successfully resolved
377 coal combustion emissions. Vehicle emissions exhibited a higher contribution
378 around 10 a.m., slightly earlier than coal combustion, aligning with the diurnal
379 pattern of CO (Fig. S4). Similarly, NO₂ exhibited a morning enhancement;
380 however, overall NO₂ concentrations were elevated at night due to reduced O₃
381 titration and additional nocturnal sources, such as biomass burning.

382 Regarding primary sources of PM_{2.5} in Weifang, the whole sampling period
383 can be divided into three phases: the autumn-winter heating season (Nov 15 –
384 Feb 28), spring-heating season (Mar 1 – Mar 15), and the post-heating season
385 (Mar 16 – Mar 19). Source apportionment with inorganic tracers revealed that
386 secondary inorganic aerosols (SIA) peaked during the heating season, with a
387 mean concentration of 23 µg m⁻³ and a 90th percentile reaching 67 µg m⁻³. This
388 is in contrast to spring, during which the 90th percentile dropped to 48 µg m⁻³
389 and further declined to 33 µg m⁻³ in the post-heating season, indicating that
390 extreme pollution driven by secondary components in the heating season were
391 largely mitigated in the non-heating season. During extremely polluted days,
392 such as November 22 (PM_{2.5}: 136 µg m⁻³) and January 12 (178 µg m⁻³),
393 secondary inorganics (79%) and solid fuel burning (36%) respectively
394 dominated the pollution, with concentrations significantly higher than during
395 the post-heating period. During the heating season, mean concentrations of
396 biomass burning (15 µg m⁻³) and coal combustion (8 µg m⁻³) significantly
397 exceeded spring season averages (6 µg m⁻³ for both). Conversely, dust
398 contributions surged in the post-heating period, increasing from 3.9 µg m⁻³ (in
399 the heating season) to 10 µg m⁻³, driven by severe dust events in late March.
400 On dust-impacted days (e.g., March 28), dust sources can elevate PM₁₀
401 concentrations to over 660 µg m⁻³ while PM_{2.5} remains below 50 µg m⁻³, with
402 most particles consisting of dust-derived PM_{2.5} (>60%).

403 **3.3 Sources of different OA compounds**

404 We compared the correlations between identified OA compounds and
405 different sources to further characterize the emission profiles, except for dust
406 source that contributed little to OA (Fig. 3). The OA compounds most strongly
407 correlated with coal combustion ($r > 0.75$) were characterized by high DBE
408 values and a high proportion of S-containing compounds, albeit with relatively
409 lower signal intensities (Fig. 3a). The S-containing compounds (C₂H₄SO₄,
410 C₃H₆SO₄, and C₉H₆SO₈) were likely formed during coal burning, especially in
411 the low-temperature residential burning process. During coal burning, the



content of sulfur containing groups (e.g., sulfone, sulfoxide, and sulfate) increased, likely because during coal combustions low-valence sulfur was oxidized to a high-valence state via radical and active oxygen reactions (Gao et al., 2022). During coal oxidation's initial stage, aliphatic and aromatic sulfur compounds decompose under oxygen exposure, generating sulfur radicals ($C-S\cdot$) and sulphydryl radicals ($\cdot SH$). These radicals participate in key reactions to form H_2S , disulfide bonds ($-S-S-$), and sulfur-oxygen radicals ($S-O\cdot$), which subsequently combine with oxygen species to produce sulfones or sulfoxides. Furthermore, certain high-DBE fragments (e.g., $C_9H_2O_6$ and C_5HNO_3 ; DBE/C: 0.78–1) are also found to correlate strongly with coal combustion, likely representing oxidized aromatic species (e.g., PAHs) or their combustion fragments (Fig. 3a). Despite having molecular weights under 400 Da, these ions may be generated from larger OA compounds via thermal fragmentation within the FIGAERO-CIMS (Stark et al., 2017).

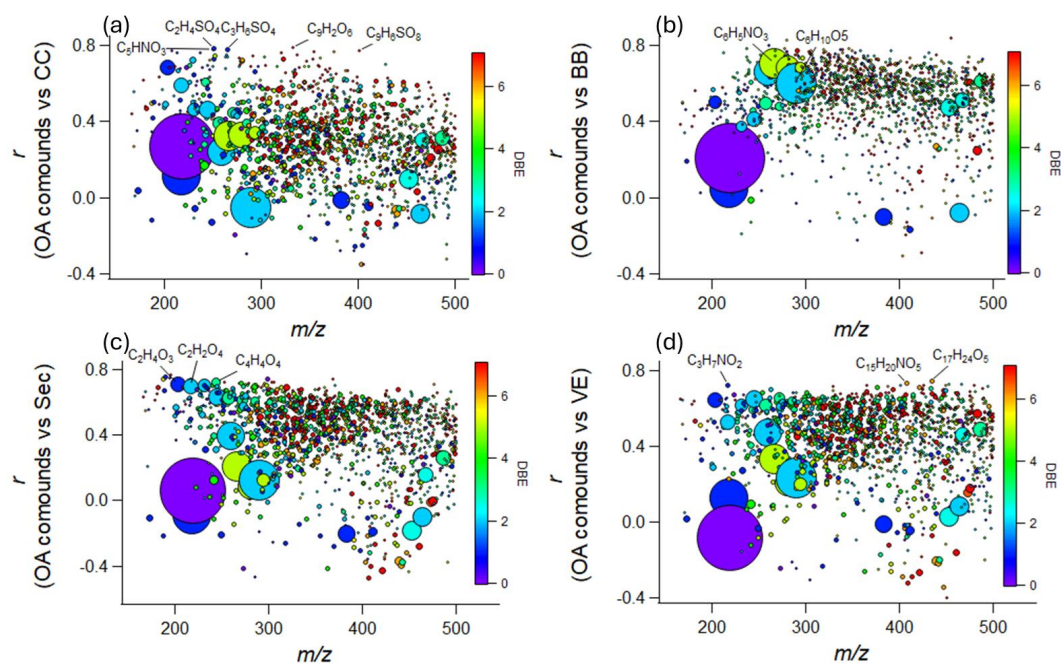


Figure 3. Correlation coefficients of compound concentrations and their correlations with different sources: (a) coal combustion, (b) biomass burning, (c) secondary inorganics, and (d) vehicle emissions. Dot sizes are proportional to the square root of the concentration for the corresponding compounds, and dots are color-coded by the DBE number of each compound. The two highest signal intensity compounds ($C_3H_8O_3$ and $C_3H_6O_3$) are likely thermal fragments of larger OA compounds.



434 Biomass burning-correlated species identified in the OA compounds
435 included well-known tracers like levoglucosan ($C_6H_{10}O_5$, $r = 0.63$),
436 nitrophenol ($C_6H_5NO_3$, $r = 0.71$), and nitrocatechol ($C_6H_5NO_4$, $r = 0.72$), which
437 is shown in Fig. 3b. Nitrophenol derivatives were found to constitute ~1% of
438 organic particulate matter in fresh biomass burning plumes (Mohr et al., 2013).
439 Meanwhile, levoglucosan derives from crop residue cellulose degradation in
440 high temperature (Cubison et al., 2011), and its moderate correlation with the
441 biomass burning tracer can be explained by the co-emission of coal combustion
442 alongside biomass burning in the NCP (Yan et al., 2017). During our sampling
443 period, $C_6H_{10}O_5$ constituted ~0.9% of total OA, one in fourth of the
444 levoglucosan-to-OA ratio in fresh biomass burning (~4%) (Mazzoleni et al.,
445 2007), highlighting the significance of fresh biomass burning to ambient.
446 Besides those widely reported tracers, compounds with 5 – 6 DBEs and
447 molecular weights of 300 – 400 correlated strongly with biomass burning (Fig.
448 3b); these compounds likely represent one- or two-ring aromatics emitted
449 during solid fuel burning activities. Compounds that were highly correlated
450 with vehicle emissions showing higher molecular weight compounds ($m/z >$
451 350), moderate DBE/C ratios (~0.4) and were frequently N-containing (e.g.,
452 $C_{15}H_{20}NO_5$, $C_{17}H_{24}O_5$), pointing to oxidized organics from fuel combustion
453 origins such as diesel traffic emissions (Fig. 3d, (Wang et al., 2022; Zhang et
454 al., 2023)). Reactive nitrogen-containing organics emitted from vehicles may
455 undergo hydrolysis and/or oxidation, forming the high-molecular-weight
456 derivatives observed via methylation and hydroxylation. At night, these
457 products react further with amine, nitro, and nitroso groups, while during the
458 day, they undergo decarboxylation with the presence of hydroxyl radicals
459 ($\bullet OH$), further complicating the product mixture (Chen et al., 2025b).

460 Compounds strongly correlated with secondary inorganic sources exhibited
461 low DBE values (1 – 3) and lower molecular masses (200 – 300 Da).
462 Representative molecules ($C_2H_4O_3$, $C_2H_2O_4$, $C_4H_4O_4$) suggest low molecular
463 weight organic acids or aldehydes (e.g., oxalic and maleic acid). Previous
464 studies showed that these low organic acids attributed to aqueous
465 heterogeneous reactions in the North China Plain, especially during haze or
466 fog episode (Guo et al., 2010). These low-molecular-weight acids and diacids
467 have been reported to be enriched in the condensation and droplet modes. They
468 likely form via gas-phase photochemical processes and subsequently condense
469 onto pre-existing particles. During haze events, high relative humidity (RH)
470 further facilitates this condensation, thereby enhancing aerosol hygroscopic



471 growth and the enrichment of these compounds (Song et al., 2021). Beside
472 those acids and diacids that are highly correlated, a large fraction of OA
473 compounds from the mass range between 300 and 500 moderately correlated
474 ($r = 0.4 - 0.5$) with the secondary inorganic factor, underscoring the importance
475 and complex formation pathways of secondary formation as an OA source.

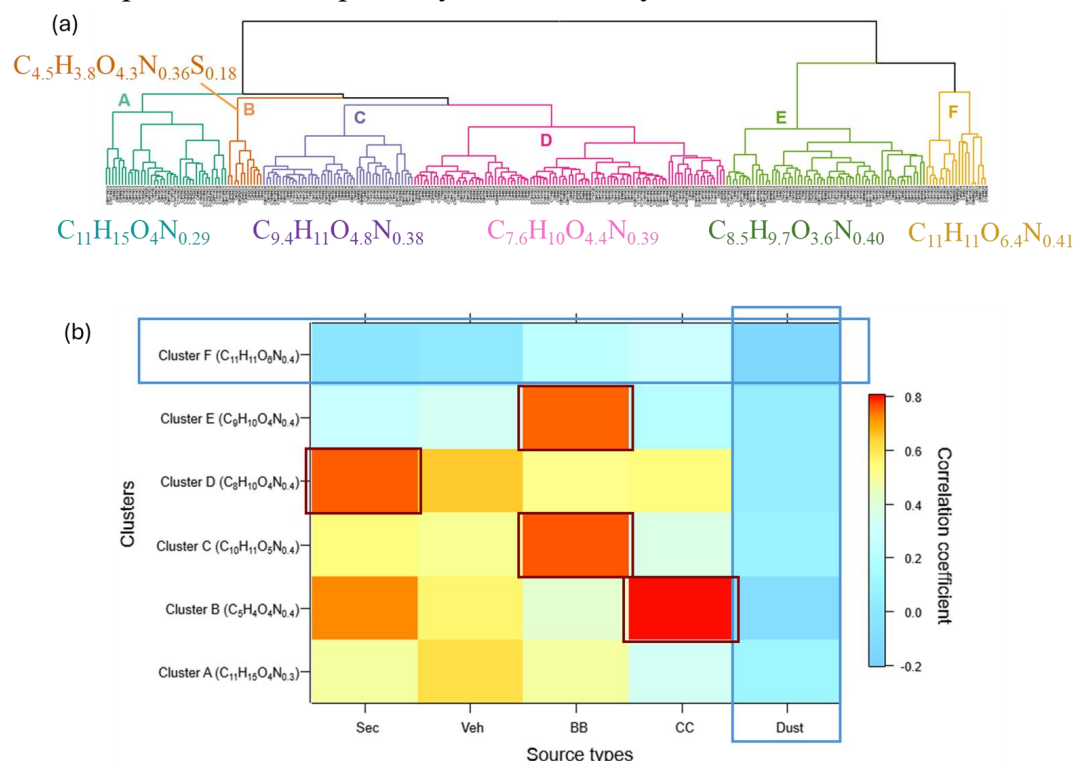


Figure 4. (a) Clusters of high-intensity OA compounds ($n = 274$) identified by HCA and their average molecular formula; (b) Spearman correlation coefficients between these clusters and PM sources resolved using the PMF method.

In order to characterize the variations of OA compounds, we selected high-abundance compounds that exhibited signal intensity higher than 0.05 % of the total CHOX signal and exceeded both field and instrument backgrounds by a factor of 2 (Cai et al., 2023), and then use the HCA method to cluster those high concentration compounds. Based on this criteria, 274 high-abundance compounds were selected and categorized into six clusters (Cluster A-F, Fig. 4a) using HCA method. The time series of these clusters were then correlated with the source apportionment results.

Cluster A compounds have an average formula of $C_{11}H_{15}O_4N_{0.3}$ and a low DBE/C ratio of 0.42. These compounds showed a moderate positive



correlation with secondary sources ($r = 0.49$ to 0.61), vehicle emissions, and biomass burning, but a negative correlation with coal combustion, suggesting they likely originate from the secondary formation or aging of vehicle emissions or biomass burning. In contrast, Cluster B compounds (average formula of $C_5H_4O_4N_{0.4}$) exhibited the highest DBE/C ratio of 1.0 among all clusters, indicating moderate oxidation and a highly aromatic-like character. This cluster was highly correlated with coal combustion ($r = 0.81$, Fig. 4b) and moderately correlated with secondary sources ($r = 0.72$), pointing to coal burning activities as its primary origin. Clusters C and E, with similar molecular formulae ($C_{10}H_{11}O_5N_{0.4}$ and $C_9H_{10}O_4N_{0.4}$, respectively) and identical DBE/C ratios (~ 0.57), were strongly positively correlated with biomass burning ($r = 0.76$, Fig. 4b) and negatively or weakly correlated with other sources ($r = 0.0080$ to 0.54). This suggests a biomass burning origin for both clusters, which is further supported by the presence of molecular markers such as levoglucosan and nitrocatechols in this cluster.

Cluster D, with an average formula of $C_8H_{10}O_4N_{0.4}$ and a low DBE/C ratio of 0.52 and a higher O:C ratio (0.70 ± 0.41), correlated with secondary inorganic sources ($r = 0.75$, Fig. 4b). This cluster contained the largest number of compounds (97 compounds, comprising 36% of the total high-intensity compounds). These compounds, which typically contain less than 8 carbon atoms, showed positive correlations with $PM_{2.5}$ ($r = 0.87$). They are likely low molecular weight, highly oxygenated molecules produced from fragmentation following prolonged photochemical processing or heterogenous reactions in haze events (Kroll et al., 2011). Finally, Cluster F showed negative or no correlation with all source types (Fig. 4b). This may be because some of these compounds, such as $C_3H_6O_3$ and $C_4H_2O_4$, are likely thermal fragments of larger OA compounds. These fragments are characterized by multiple peaks in their thermograms, with the most abundant signal occurring at $150 - 180^\circ C$ (Fig. S5), suggesting they likely originate from the thermal decomposition of a larger parent compound (Stark et al., 2017). Notably, dust source from PMF has no correlation with all OA compounds ($r = -0.14$ to 0.10 , Fig. 4b) which makes sense since OA is more likely to come from combustion origins or secondary formation rather than dust in the NCP plain.

Overall, the consistent results and high correlation between the HCA-derived clusters and PMF-derived factors suggest that variations in the organic compounds measured by FIGAERO-CIMS in Weifang can be largely



526 explained by the identified $PM_{2.5}$ sources. This highlights that OA and $PM_{2.5}$
527 were dominated by common sources in Weifang, with secondary formation,
528 biomass burning, coal combustion, and vehicle emissions acting as major
529 contributors to both, whereas dust contributed exclusively to the inorganic
530 fraction of PM during spring period.

531 **3.4 OA compounds and sources driving OP_m and OP_v**

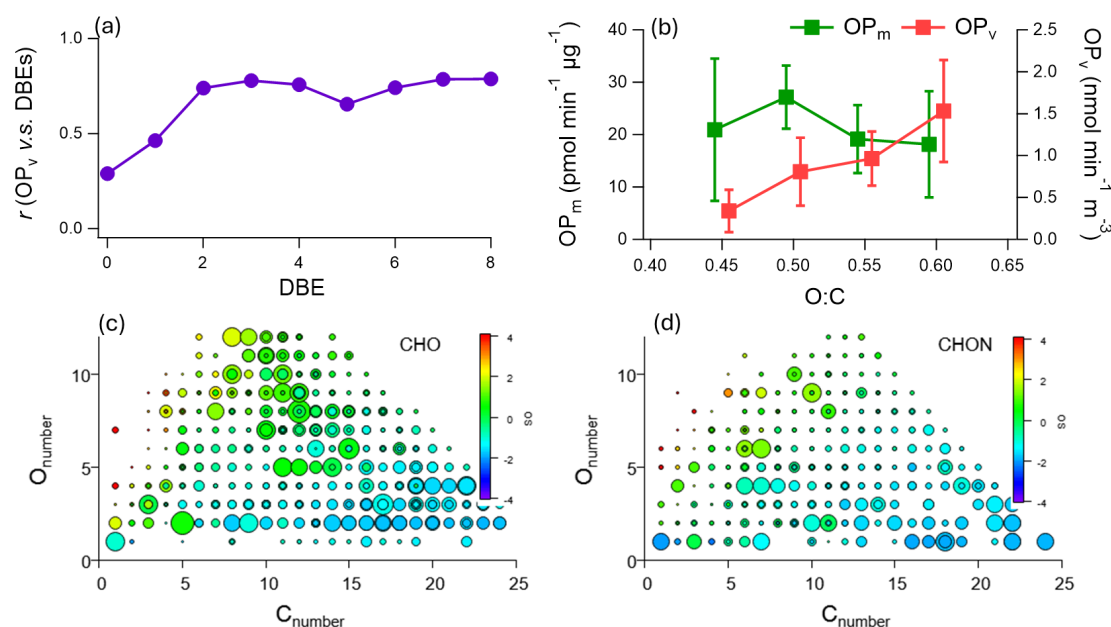
532 In general, the OP_v levels in Weifang during the study period (average: 0.91
533 $nmol\ min^{-1}\ m^{-3}$; peak: $2.1\ nmol\ min^{-1}\ m^{-3}$) were comparable to the elevated OP_v
534 levels reported in the rural NCP (Cao et al., 2025a), and were approximately
535 twofold higher than those determined in Los Angeles (Shen et al., 2022). The
536 correlation between OP_v and OC mass concentrations ($r = 0.80$) is significantly
537 higher than those with transition metals such as iron (Fe, $r = 0.35$) or copper
538 (Cu, $r = 0.56$), despite these metals typically being considered as one of the
539 drivers of OP (Fig. S6) (Wang et al., 2020b; Charrier and Anastasio, 2012).
540 When the firework case (Feb 11) is excluded, this correlation was further
541 enhanced ($r = 0.85$), which underscores the dominant role of OC in driving the
542 oxidative potential of $PM_{2.5}$ in Weifang.

543 The highest OP_v levels occurred during two distinct pollution episodes (Fig.
544 1b). On Jan 12, high secondary inorganic contribution (5%) and levoglucosan
545 ($0.59\ \mu g\ m^{-3}$; 1.9% of OA) indicated strong secondary formation and solid fuel
546 burning contribution. In contrast, on Feb 11 (one day after Chinese New Year),
547 firework emissions caused SO_2 and metals (Ba, Cu) to spike tenfold above the
548 period average, driving OP_v to a comparable level ($2.1\ nmol\ min^{-1}\ m^{-3}$).
549 Despite the contrasting compound compositions and source profiles, similar
550 OP_v values ($2.1\ nmol\ min^{-1}\ m^{-3}$) were observed in these two episodes. Such a
551 similarity indicates that OP driven by OA during biomass burning events could
552 rival the toxicity levels driven by transition metals during firework events. To
553 accurately compare OA activity, Feb 11 was excluded from further analysis,
554 as its toxicity was dominated by firework metals rather than OA.

555 A small subset of OA compounds was found to be the key to driving the
556 elevated intrinsic OP_m (Fig. S7). To further investigate those key compounds
557 with molecular characteristics, we compared the average OP_v and OP_m with
558 DBEs, O:C ratios, oxidation state, and carbon numbers across different
559 compounds. In general, the correlation coefficient between OP_v and DBE
560 enhanced significantly from 0.30 for saturated compounds (DBE = 0; e.g.,
561 polyols) to 0.80 for unsaturated species (DBE > 3, Fig. 5a). A slight reduction



in correlation at DBE = 5 is mainly attributed to nitrophenol. Although FIGAERO-CIMS is highly sensitive to these compounds (Zheng et al., 2021), the OP of 2-, 3-, and 4-nitrophenol isomers ranges from moderate to high (Khan et al., 2022). Consequently, this correlation drop likely reflects the contribution of lower-OP nitrophenol isomers. However, this general positive trend indicates that high-DBE compounds, likely aromatic derivatives, are major contributors to the OP_v of OA and PM_{2.5} in Weifang.



569

Figure 5. (a) Correlation coefficients between OP_v and the total signal for compounds with different DBEs; (b) OP_m and OP_v variation across different O:C ratio for CHO compounds; (c) Spearman correlation coefficients between OP_m and the signal intensities of CHO compounds with varying O and C numbers. Compound markers are color-coded according to their average oxidation state; (d) Spearman correlation coefficients between OP_m and the signal intensities of CHON compounds with varying O and C numbers. Compound markers are color-coded according to their average oxidation state.

Interestingly, while OP_v continuously increased as the O:C ratio rose from 0.4 to 0.6, OP_m exhibited a diverging trend: it increased at lower O:C ratios but plateaued (~27 pmol min⁻¹ μg⁻¹) or slightly decreased (~20 pmol min⁻¹ μg⁻¹) when the O:C exceeded 0.5 (Fig. 5b). The continuous enhancement in OP_v with increasing O:C is likely driven by PM concentration; as PM levels increase, OA compounds become more aged and result in higher O:C ratio. However, the decline in OP_m at higher O:C implies that although initial oxidation enhances OA toxicity as widely reported in previous studies (Antiñolo et al., 2015); the highly oxygenated OA likely formed in the extremely haze periods



585 may exhibit lower OP activity in Weifang City, which is also validated by our
586 test experiment using standard chemicals. Our findings are consistent with the
587 spatial variations reported by Liu et al. (2024a), who showed that while highly
588 oxygenated OA dominates OP activity in megacities like Beijing, primary
589 emitted or moderately oxygenated OA compounds play a more important role
590 in driving OP_m in rural areas of the NCP.

591 Moreover, we observed that compounds with the strongest positive
592 correlations to OP_m generally exhibit moderate oxidation state OS_c (-1 to 1),
593 with correlations decline significantly when OS_c exceeds 2. Highly oxygenated
594 compounds ($OS_c > 2$), which primarily consist of <6 carbons and 2 – 10
595 oxygens, show weak or even negative correlations with OP_m . These
596 compounds correspond predominantly to small-molecule carboxylic acids and
597 aldehydes. In contrast, the most highly positive correlated OA compounds fall
598 into two groups: (1) $C_{10} - C_{15}$ with ~10 oxygen atoms and m/z around 300
599 (likely oxygenated aromatics linked to the solid fuel burning emissions in
600 Section 3.3), and (2) long-chain species ($> C_{15}$) with less than 5 oxygen atoms.
601 The latter group, particularly N-containing species with $m/z > 350$ and DBE of
602 5 – 6, likely represent oxidized traffic emissions as discussed in Section 3.3
603 and previous literature (Zhang et al., 2023; Chen et al., 2025b). This aligns
604 with previous field observations in Europe, which identified Less-Oxygenated
605 OOA (LO-OOA, particularly anthropogenic secondary OA), as a major
606 contributor to OP activity, despite its much lower concentration compared to
607 secondary inorganics (Daellenbach et al., 2020).

608 **3.5 Apportioning the key sources of OP_m**

609 To further illustrate the impacts of source to OP_m , we compare the source
610 apportionment and corresponding OP_m variations during four episodes: Nov
611 22 ($PM_{2.5}$: $136 \mu g m^{-3}$, OP_m : $28.7 pmol min^{-1} \mu g^{-1}$), Jan 6 ($PM_{2.5}$: $68 \mu g m^{-3}$,
612 OP_m : $33.4 pmol min^{-1} \mu g^{-1}$), Jan 21 ($PM_{2.5}$: $178 \mu g m^{-3}$, OP_m : $36.8 pmol min^{-1}$
613 μg^{-1}), and Mar 28 ($PM_{2.5}$: $81 \mu g m^{-3}$, OP_m : $26.8 pmol min^{-1} \mu g^{-1}$). During the
614 November 22 and March 28 episodes, secondary inorganic aerosols and dust
615 were the dominant sources, comprising 76% and 47% of $PM_{2.5}$, respectively.
616 However, their corresponding OP_m values (28.7 and $26.8 pmol min^{-1} \mu g^{-1}$) were
617 comparable to the campaign average ($24 pmol min^{-1} \mu g^{-1}$), implying that
618 secondary inorganics and dust aerosols are not the key components driving of
619 OP activity in Weifang city (Fig. 6a). In contrast, on January 6 and January 21,
620 fine PM was dominated by biomass burning and coal combustion; together,



these two primary combustion sources accounted for up to 45% of the total mass, corresponding to the highest OP_m values observed across the four cases. On these two days, secondary OC accounted for approximately 40 – 60% of the total OC based on the OC/EC ratio method (Cao et al., 2007). These findings reinforce that primary solid fuel combustion and associated secondary organic aerosol formation are the dominant contributors to OP_m .

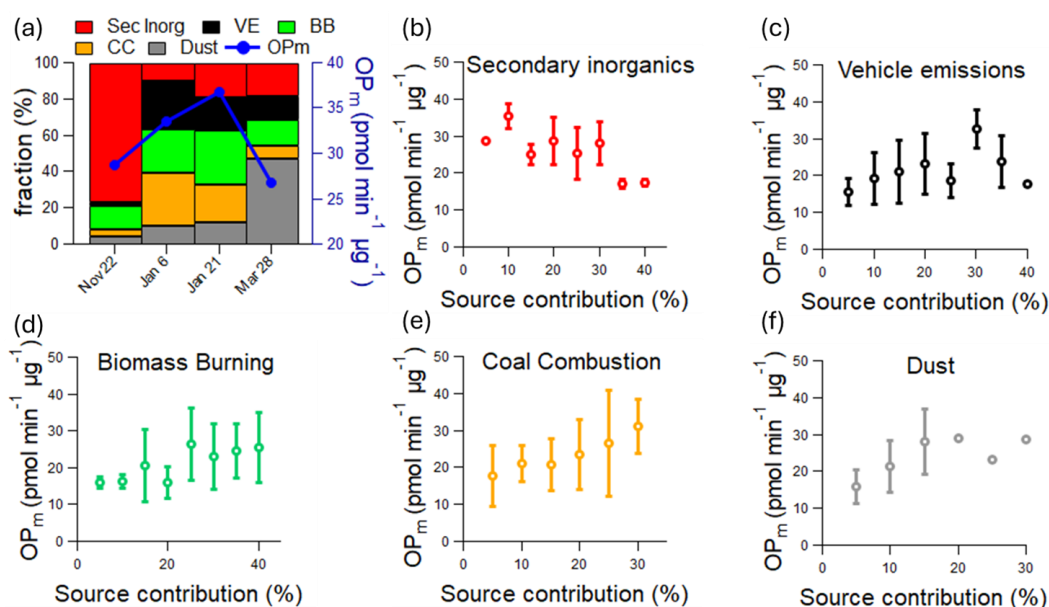


Figure 6. (a) Variation of OP_m and source contribution fractions on four selected days (Nov 22, Jan 6, Jan 21, and Mar 28). OP_m variations across the contributions of different source types: (b) secondary inorganics, (c) vehicle emissions, (d) biomass burning, (e) coal combustion, and (f) dust.

For the whole sampling period, OP_m generally declined as the contribution of secondary inorganics increased (Fig. 6b). The average value of OP_m dropped from $37 \text{ pmol min}^{-1} \mu\text{g}^{-1}$ to as low as $17 \text{ pmol min}^{-1} \mu\text{g}^{-1}$ when the contribution reached 40%. This trend is consistent with previous studies suggesting that a higher proportion of secondary inorganic component in the NCP may exert a dilution or suppression effect on the overall OP activity of $PM_{2.5}$ (Li et al., 2021). In contrast, OP_m initially increased with vehicle emissions but subsequently decreased below $20 \text{ pmol min}^{-1} \mu\text{g}^{-1}$ once the vehicle contribution exceeded 20%–30% (Fig. 6c). This decline is likely attributable to stagnant meteorological conditions during high- $PM_{2.5}$ episodes, which promote the concurrent accumulation of both vehicle emissions and secondary inorganic formations. Crucially, contributions from solid fuel (coal and biomass)



645 combustion showed a continuous positive relationship with OP_m , with this
646 enhancing effect persisting up to 40% contribution (Fig. 6d and 6e), which
647 underscores the important role of solid fuel burning in driving OP_m . On the
648 other hand, OP_m associated with dust increased to $28 \text{ pmol min}^{-1} \mu\text{g}^{-1}$ as its
649 contribution rose from 5% to 15% but stabilized or even decreased to 23 pmol
650 $\text{min}^{-1} \mu\text{g}^{-1}$ beyond 15% (Fig. 6f). This suggests that pure dust is not a major
651 driver of OP_m , owing to the low solubility of crustal metals. Nevertheless, a
652 previous study showed that the solubility and toxicity of dust aerosols could
653 increase significantly when they are transported over polluted regions and mix
654 with anthropogenic emissions in NCP (Zhang et al., 2026).

655 To quantitatively identify the key OP-active compounds and their dominant
656 sources, a multilinear regression (MLR) model was applied to the time series
657 to apportion the contribution of individual compound among the four OA
658 sources identified via cluster analysis: secondary inorganics, biomass burning,
659 vehicle emissions, and coal combustion. Consistent with the HCA analysis,
660 key OP-active compounds were selected based on a significant correlation with
661 OP_m (t-test, $p < 0.05$) among 274 high-signal-intensity compounds (signal
662 intensity $> 0.05\%$ of CHOX).

663 The regression coefficients derived from the MLR model for each
664 compound across the four sources were extracted and normalized to their
665 respective maximum coefficients. These normalized coefficients for the most
666 positive and negative correlated compound are shown in Fig. 7a and b,
667 respectively, alongside the temporal variations and OP_m correlation
668 coefficients of each compound. Accordingly, for compounds positively
669 correlated with OP_m , a higher regression coefficient for a specific source
670 indicates that the source is the primary contributor to the compound, thereby
671 exerting a significant positive influence on the overall OP. Conversely, for
672 compounds negatively correlated with OP_m , a higher regression coefficient
673 suggests that whereas the source dominates the compound's abundance, it
674 likely exerts a negligible or suppressive effect on the OP_m of total $PM_{2.5}$.

675 It was found that only a small fraction of high-intensity compounds was
676 positively correlated with measured OP_m (72 out of 274 species), indicating
677 that a minority of high-abundance compounds drive OA toxicity. Concurrently,
678 these OP-active species showed a strong negative correlation with secondary
679 inorganic sources (t-test, $p < 0.05$). Furthermore, the compounds significantly
680 correlated with OP_m ($r > 0.4$) exhibited a high average DBE of 6.4 ± 4.2 and



681 an O:C ratio of 0.72 ± 0.36 , the latter of which was primarily attributed to the
682 species containing high oxygen number (typically associated with primary
683 sources, especially biomass burning and coal combustion). Representative
684 examples include high-DBE species linked to coal combustion (e.g., $C_{15}H_6O_6$
685 and $C_{12}H_8O_8$), biomass burning related molecules (e.g., $C_{15}H_{12}O_8$ and
686 $C_{15}H_{14}O_8$), and vehicle-derived emission characterized by nitro-aromatic
687 compounds and high molecular-weight compounds (e.g., $C_6H_6N_2O_2$ and
688 $C_{14}H_{28}O_7$).

689 Notably, these high-DBE compounds, likely aromatics with multiple carbon
690 rings, typically feature multiple hydroxyl groups and conjugated systems,
691 which confer strong electron-donating capacity and enable the generation of
692 reactive oxygen species, such as singlet oxygen (1O_2) and superoxide anion
693 ($\bullet O_2^-$). Beyond possessing high intrinsic oxidative potential, these polycyclic
694 aromatic compounds can catalyze transition metal cycling in Fenton-like
695 systems, which further boosts ROS generation (Cao et al., 2025b; Yu et al.,
696 2022). Additionally, nitro-derivatives of these aromatic compounds not only
697 exhibit intrinsic redox activity but also exacerbate oxidative stress by
698 undergoing single-electron reduction to form $\bullet NO_2$, subsequently initiating
699 lipid peroxidation and contributing to elevated OP_m (Cao et al., 2026).
700 Aromatic amines, such as the nitroanilines ($C_6H_6N_2O_2$) found in this study
701 (average concentration of 3.6 ng m^{-3}), may promote the formation of
702 electrophilic reactive intermediates capable of interacting with DNA, thereby
703 leading to severe genotoxicity (Zhang et al., 2025).

704 Under the low temperature and low relative humidity environment that
705 typically predominant the NCP during autumn and winter, aromatic
706 compounds tend to stabilize their benzene ring structures under such
707 conditions (Cao et al., 2026). As a result, they predominantly undergo “ring-
708 preserving” rather than “ring-opening” reactions during atmospheric aging,
709 which allows them to maintain high toxicity after transport and aging process
710 (Kautzman et al., 2010). Furthermore, the acidic aerosol environment (Cheng
711 et al., 2016) in the NCP may further increase molar yields of ROS species (e.g.,
712 H_2O_2) within SOA, driven by accelerated α -hydroxyhydroperoxide
713 decomposition and quinone redox cycling (Wei et al., 2022). These findings
714 underscore the significant contribution of OP-active compounds from primary
715 emissions and subsequent oxidation in Weifang and broader NCP region.

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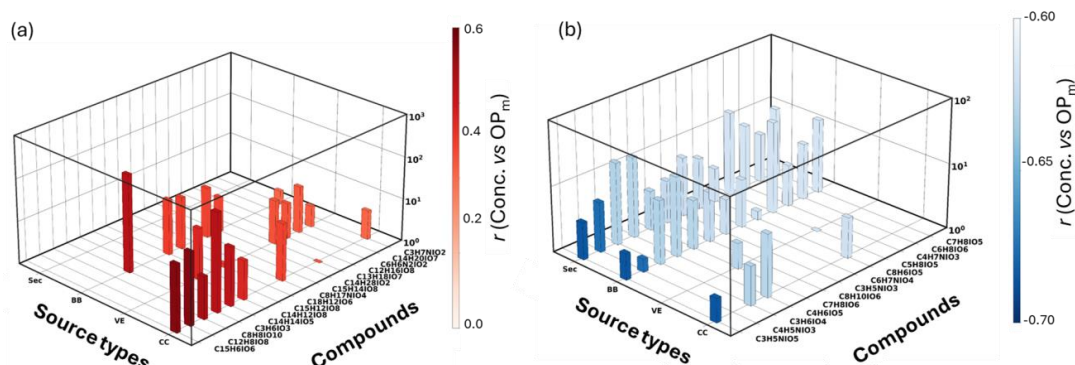


Figure 7. Correlation coefficients of compounds that are significantly correlated with OP_m : (a) positively correlated compounds and (b) negatively correlated compounds. The compounds are plotted based on the normalized coefficients in the multi-linear regression model for each source type and are color-coded by their correlation coefficient with OP_m .

Most of high signal intensity OA compounds showed a negative correlation with OP_m (202 out of 274 species). Specifically, we investigated those exhibiting strong negative correlations with OP ($r < -0.6$), which were characterized by a lower DBE (3.0 ± 1.3), a significantly higher O:C ratio (0.75 ± 0.35), and an average molecular formula of $C_{5.2}H_{6.8}O_{4.6}N_{0.38}$. Prominent compounds in this group included glyceric acid ($C_3H_6O_4$), malic acid ($C_4H_6O_5$), and $C_5H_8O_5$ (likely hydroxyglutaric acid). Glyceric and malic acids are mainly formed via heterogeneous or liquid-phase reactions that are typically enhanced during haze episodes, whereas $C_5H_8O_5$ is a well-known SOA product derived from isoprene oxidation (Claeys et al., 2007) and tends to possess lower OP (Tuet et al., 2017). To verify these field-derived findings, laboratory OP tests of authentic standards were conducted, which further corroborated the low redox activity of these compounds (Fig. 8). Specifically, despite their relatively high abundance in OA during sampling period, glyceric acid ($C_3H_6O_4$, average: $84 \pm 10 \text{ ng m}^{-3}$) and malic acid ($C_4H_6O_5$, average: $90 \pm 10 \text{ ng m}^{-3}$) exhibited negligible intrinsic OP_m values (8.8 and $22 \text{ pmol min}^{-1} \mu\text{g}^{-1}$, respectively). These levels are comparable to those of low-activity inorganics such as ammonium sulfate ($13 \pm 6.9 \text{ pmol min}^{-1} \mu\text{g}^{-1}$) and ammonium nitrate ($5.1 \pm 3.5 \text{ pmol min}^{-1} \mu\text{g}^{-1}$).

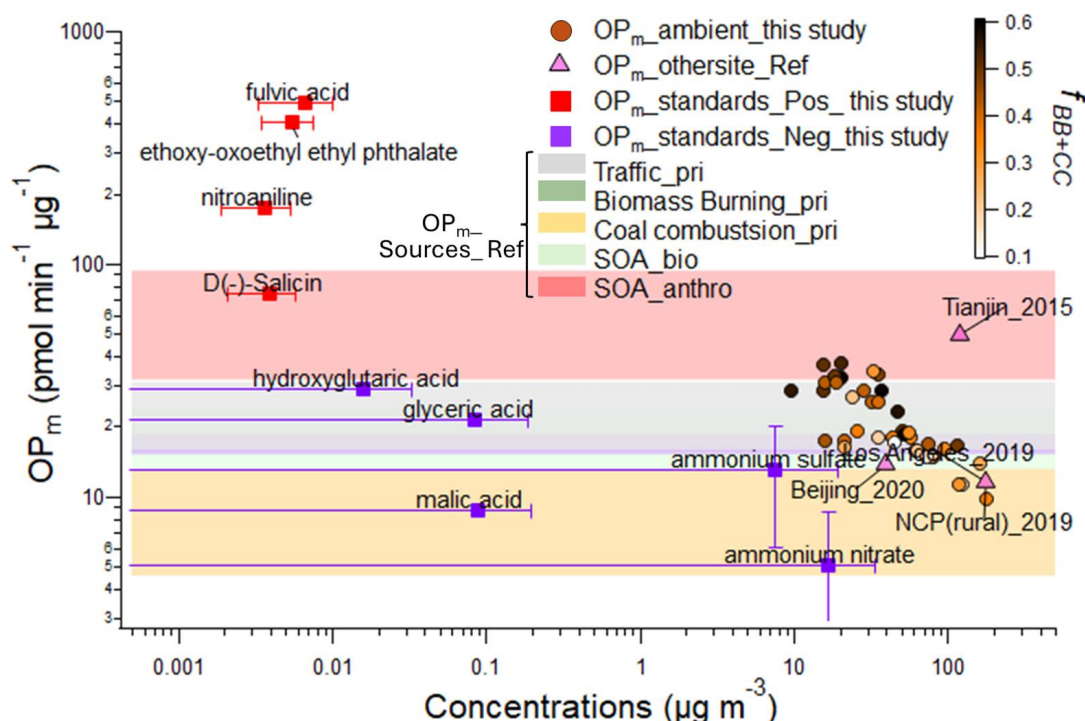


Figure 8. Mass-normalized oxidative potential (OP_m) derived from offline samples and chemical standards in the study. Offline samples collected during the campaign are represented by brown circles, color-coded according to the fractional contribution of solid fuel (biomass burning plus coal combustion). OP_m data previously measured in the NCP are shown in pink triangles, including Beijing in 2020 (Li et al., 2024; Zheng et al., 2026), Tianjin in 2015 (Liu et al., 2018) and NCP rural area in 2019 (Liu et al., 2024b). Chemical standards measured in this study are shown as squares, with red and purple representing compounds positively and negatively correlated with OP , respectively, and error bars represent the standard deviations. Additionally, the standard deviation ranges of previously reported OP_m values from various sources are illustrated using different color shades. These include primary OP_m from traffic (Traffic_pri), biomass burning (Biomass_burning_pri), and coal combustion (Coal_combustion_pri), as well as SOA from biogenic precursors (SOA_bio) and from two aromatic precursors (m-xylene and naphthalene). The data sources are derived from the following references: Liu et al. (2024b); Bates et al. (2019) Cheung et al. (2010); Fushimi et al. (2017); Jiang et al. (2016); Mcwhinney et al. (2013); Tuet et al. (2017)

To evaluate the potential redox activity of the molecular formulas significantly and positively correlated with OP_m , such as $C_{14}H_{12}O_8$, $C_{13}H_{18}O_7$, $C_{14}H_{14}O_5$, and $C_6H_6N_2O_2$, we also conducted OP tests using commercially available standards as representative surrogates (Fig. 8). Notably, these tested isomers (fulvic acid, D(-)-salicin, ethoxycarbonylmethyl ethyl phthalate, and nitroaniline) exhibited exceptionally high intrinsic OP_m values (75 – 490 $pmol\ min^{-1}\ \mu g^{-1}$), which is about 3 to 23 times greater than the ambient average (22 $pmol\ min^{-1}\ \mu g^{-1}$). Moreover, the OP_m of these tested species substantially



768 exceeded those of transition metals reported in the literature (e.g., Cu: 32 pmol
769 min⁻¹ μg⁻¹; V: 20 pmol min⁻¹ μg⁻¹; Fig. S8).

770 Most ambient samples exhibited OP_m values significantly higher than those
771 of biogenic SOA (e.g., isoprene: 10 ± 2 pmol min⁻¹ μg⁻¹; α-pinene: 25 ± 7 pmol
772 min⁻¹ μg⁻¹), but fell within the range of anthropogenic SOA derived from
773 aromatics (e.g., m-xylene: 24 ± 11 pmol min⁻¹ μg⁻¹; naphthalene: 150 ± 50 pmol
774 min⁻¹ μg⁻¹). Notably, we observed that OP_m scaled positively with the fractional
775 contribution of solid fuel combustion (biomass and coal). In particular,
776 samples with the highest OP_m had solid fuel combustion fractions exceeding
777 50%. Their OP_m values surpassed previously reported ranges for primary PM
778 from coal combustion, biomass burning, and vehicle emissions, reaching levels
779 typical of anthropogenic aromatic SOA. Given that primary OA alone cannot
780 account for these elevated OP_m values, and that OP-active compounds in
781 Weifang are generally moderately oxygenated, we infer that moderately
782 oxygenated anthropogenic OA, specifically aged primary OA, plays a critical
783 role in driving OP activity in the NCP.

784 The lowest OP_m observed in Weifang (~10 pmol min⁻¹ μg⁻¹) aligns well with
785 2019 rural NCP data (Liu et al., 2024b) and our previously reported average
786 (~14 pmol min⁻¹ μg⁻¹) observed in Beijing in 2020, where residential burning
787 was strictly regulated. In contrast, the highest OP_m in our study (38 pmol min⁻¹
788 μg⁻¹) approaches the level in Tianjin in 2015 (49 pmol min⁻¹ μg⁻¹) when the
789 initial implementation of the Air Pollution Prevention and Control Action Plan.
790 These comparisons highlight that even under regionally homogeneous PM
791 concentrations, OP activity varies drastically across the NCP depending on
792 emission sources. This underscores an urgent need for targeted pollution
793 control beyond megacities, particularly regarding solid fuel burning emissions,
794 especially in medium- and small-sized cities where the majority of the NCP
795 population resides.

796 **4. Conclusions**

797 Whereas effective air pollution controls have significantly reduced PM_{2.5}
798 levels across China (e.g., from 72 to 35 μg m⁻³ between 2013 and 2020 in 74
799 key cities (Chen et al., 2024)), the relative contribution of OA, particularly
800 SOA, has increased. Unlike Beijing, where primary emissions are continuously
801 declining, medium- and small-sized NCP cities like Weifang still suffer from
802 severe PM pollution, particularly during the heating season. Molecular-level



investigation in this study revealed that OP was crucially affected by OA in Weifang, which was substantially associated with solid fuel burning tracers. These included tracer molecules from coal combustion (e.g., $C_{15}H_6O_6$ and $C_{12}H_8O_8$) and biomass burning (e.g., $C_{15}H_{12}O_8$ and $C_{15}H_{14}O_8$), alongside high-molecular-weight, low-DBE nitro-aromatics likely from vehicle emissions (e.g., $C_6H_6N_2O_2$ and $C_{14}H_{28}O_7$). Conversely, most OA compounds were only moderately correlated with OP_m , indicating a potentially moderate contribution to OP_m but an evident cumulative contribution to OP_v . Some highly oxygenated, low-molecular-weight OA species, such as small-molecule carboxylic acids (e.g., malic and glyceric acid) that are strongly correlated with secondary inorganics and are likely to form during haze episodes, probably contribute little to the overall OP.

Cluster and multilinear regression analyses further demonstrate that solid fuel combustion (biomass and coal) substantially drives high OP activity, while secondary inorganics negatively impact OP_m . Still, we note that our online PMF and offline FIGAERO-CIMS analyses using HCA and MLR methods cannot fully separate primary emissions from their subsequent aging processes. The fact that the high fraction of SOA and high OP_m cannot be explained by primary emissions alone suggests that, in addition to primary sources, post-emission oxidation following fuel burning is also crucial to OP activity during the heating season in Weifang.

Our findings show that OP activity may vary significantly across the NCP region, especially between megacities (e.g., Beijing) and medium-sized cities (e.g., Weifang) due to substantially different OA composition and origins. This underscores the continued need for primary emission controls, particularly those targeting solid fuels, such as the implementation of coal-to-gas switching policies in the broader NCP region. Given the large populations in these cities and the strong OP activity linked to solid fuel combustion, such measures would greatly benefit public health.

Author Contributions

JC, XF, and M.L. designed the research. JC and XF analyzed the FIGAERO-CIMS data and interpreted the results. JC and FZ conducted PMF and HCA analyses. YZ, LS, RL, and LW provided online $PM_{2.5}$ chemical composition data. DD and JW provided the emission inventory for the NCP region. YL, CL, and WD provided valuable discussions and suggestions. JC, XF, QZ, and ML wrote the manuscript with contributions from all co-authors. All authors have read and approved the final version of the manuscript.



838 **Data Availability**

839 Data used in figures are available from the Zenodo online repository (DOI
840 <https://zenodo.org/records/21298413>, Cai, 2026). Supporting data are
841 available from the authors
842 upon request.

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