



1 **Technical note: Refining $\delta^{15}\text{N}$ isotopic fingerprints of local**
2 **NO_x for accurate source identification of nitrate in $\text{PM}_{2.5}$**

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13 ● **Abstract**

14 Stable nitrogen isotopic composition ($\delta^{15}\text{N}$) has proven to be a valuable tool for
15 identifying sources of nitrates (NO_3^-) in $\text{PM}_{2.5}$. However, the absence of a systematic
16 study on the $\delta^{15}\text{N}$ values of domestic NO_x sources hinders accurate identification of
17 NO_3^- sources in China. Here, we systematically determined and refined $\delta^{15}\text{N}$ values
18 for six categories of NO_x sources in the local Tianjin area using an active sampling
19 method. Moreover, the $\delta^{15}\text{N}$ values of NO_3^- in $\text{PM}_{2.5}$ were measured during pre-
20 heating, mid-heating and late-heating periods, which are the most heavily polluted in
21 Tianjin. Results shown that the representative nature and region-specific
22 characteristics of isotopic fingerprints for six categories of NO_x sources in Tianjin.
23 The Bayesian isotope mixing (MixSIAR) model demonstrated that coal combustion,
24 biomass burning, and vehicle exhaust collectively contributed more than 60%,
25 dominating the sources of NO_3^- during sampling periods in Tianjin. However, failure
26 to consider the isotopic signatures of local NO_x sources could result in an
27 underestimation of the contribution from coal combustion. Additionally, the absence
28 of industrial sources, an uncharacterized source in previous studies, may directly
29 result in the contribution fraction of other sources being overestimated by the model
30 more than 15%. Notably, as the number of sources input to the model increased, the
31 contribution of various NO_x sources was becoming more stable, and the inter-
32 influence between various sources significantly reduced. This study demonstrated that
33 the refined isotopic fingerprint in a region-specific context could more effectively
34 distinguish source of NO_3^- , thereby providing valuable insights for controlling NO_3^-
35 pollution.

36 **1. Introduction**

37 In recent decades, the acceleration of urbanization and modernization in China



38 has inevitably led to persistent and frequent incidents of atmospheric PM_{2.5} pollution
39 in urban areas (Zhang et al., 2023; Meng et al., 2024). SNA (SO₄²⁻, NO₃⁻ and NH₄⁺)
40 constitutes one of the most important components of PM_{2.5}, and its elevated
41 concentration will exacerbate the pollution level of PM_{2.5} (Huang et al., 2014). A
42 series of scientific and effective air pollutant emission control measures has led to a
43 significant decrease in the concentration of SO₄²⁻ in PM_{2.5} in urban areas of China has
44 decreased significantly (Wang et al., 2022). However, the concentration and
45 percentage of NO₃⁻ in PM_{2.5} have shown a gradual increase (Wang et al., 2022; Zhang
46 et al., 2020). Previous studies have indicated that NO₃⁻ has surpassed SO₄²⁻ as the
47 primary inorganic component of atmospheric PM_{2.5} in the northern Chinese cities,
48 with mass concentrations accounting for approximately 5% ~ 26% (Zong et al.,
49 2022b; Zhang et al., 2019; Xie et al., 2019). Consequently, the accurate identification
50 of the sources of NO₃⁻ is essential for the development of effective air management
51 measures, which can effectively control the occurrence of urban haze weather.

52 The accurate identification of the sources of atmospheric NO_x was complicated
53 by the considerable complexity and diversity of the sources involved, which include,
54 but are not limited to, coal combustion, vehicle exhaust, biomass burning and soil
55 emissions (Huang et al., 2017; Duncan et al., 2016). The reliable identification of the
56 sources of NO_x in the atmosphere was achieved using stable nitrogen isotopes
57 composition ($\delta^{15}\text{N}$) (Zong et al., 2017; Song et al., 2021). However, to achieve the
58 most accurate results, it is essential to accurately identify the $\delta^{15}\text{N}$ values of the
59 atmospheric NO_x source (Zhang et al., 2024a; Lin et al., 2021). Although the $\delta^{15}\text{N}$
60 values from some NO_x sources have been reported by other studies (Zong et al.,
61 2020a; Zong et al., 2022a). However, the majority of current research reports on the
62 $\delta^{15}\text{N}$ values of NO_x from different sources in the atmosphere originates from foreign
63 countries, and the collection methods have not been unified (Elliott et al.,
64 2019; Walters et al., 2015a; Walters et al., 2015b). For instance, Felix and Elliott (2014)
65 reported the $\delta^{15}\text{N}$ -NO_x from vehicle exhaust as $+14.2 \pm 1.9\%$ based on the active
66 sampler. However, a relatedly negative value ($-11.4 \pm 6.9\%$) from vehicle exhaust
67 was reported by the passive sampler (Walters et al., 2018). Similar discrepancies have
68 also been observed in other NO_x sources (Li and Wang, 2008; Elliott et al., 2019).
69 Furthermore, the production mechanisms of different NO_x types can also affect its
70 $\delta^{15}\text{N}$ values, such as fuel type NO_x and thermal type NO_x (Heaton, 1990). Coal
71 combustion can result in the release of both fuel type NO_x and thermal type NO_x, due
72 to the high combustion temperature and the abundant nitrogen components (Heaton,
73 1990; Felix et al., 2012). However, biomass burns at low temperatures (250 to
74 1200 °C), and the process produces mainly fuel NO_x, with $\delta^{15}\text{N}$ depending on the
75 relative abundance of nitrogenous organic matter ¹⁵N in the biomass itself (Zong et al.,
76 2022a). Therefore, considering the regional differences in the relative abundance of
77 ¹⁵N in fuels (Zong et al., 2022a; Shi et al., 2022), these $\delta^{15}\text{N}$ values reported abroad for
78 fuel-based NO_x may not be applicable to domestic studies. Furthermore, the previous
79 studies have not yet provided a comprehensive overview of the $\delta^{15}\text{N}$ values of NO_x
80 sources. There is a lack of systematic studies on the $\delta^{15}\text{N}$ characteristics of different
81 NO_x sources at both the domestic and international level. For instance, the $\delta^{15}\text{N}$



82 values of NO_x from industrial emissions and natural gas combustion in urban areas
83 have rarely reported. Despite these sources being included in the NO_x emission
84 inventory, the current isotopic fingerprint database lacks a clear definition. In this
85 context, the use of associated model calculations to quantify the source contribution
86 of NO_x or NO₃⁻ to the regional atmosphere may introduce a high level of uncertainty
87 (Zhang et al., 2024a). Therefore, it is of great significance to enhance the existing
88 $\delta^{15}\text{N}$ values of NO_x sources.

89 Tianjin, recognized as one of most heavily polluted cities in China, experiences
90 strongly influenced from severe haze pollution (Xiao et al., 2022, 2023; Xiao et al.,
91 2024b). Particularly during heating periods, episodes of haze formation characterized
92 by abrupt increases in NO₃⁻ concentrations have been observed (Zou et al., 2018; Feng
93 et al., 2020). This phenomenon is attributable to the predominant use of coal as the
94 primary heating fuel in Tianjin, resulting in considerable NO_x emissions (Zhao et al.,
95 2021). Recent research efforts in Tianjin have focused on identifying the sources of
96 NO₃⁻ through its dual isotopic compositions (Zhang et al., 2019; Xiao et al., 2023).
97 Nevertheless, there is a paucity of systematic characterization of the $\delta^{15}\text{N}$ -NO_x source
98 signatures in Tianjin, and even in China, which contributes to significant uncertainties
99 regarding NO_x source contributions (Zhang et al., 2024a). Consequently, to enhance
100 understanding of atmospheric NO₃⁻ sources, it is imperative to refine the $\delta^{15}\text{N}$ values
101 of various local sources in Tianjin.

102 Here, we established a refined isotopic fingerprint for major NO_x sources in
103 Tianjin area using an active sampling method, which including previously
104 uncharacterized sources in China such as industrial emissions and natural gas
105 combustion. To better understand the need for established refined isotopic fingerprint
106 in a region-specific context for major NO_x sources, PM_{2.5} samples were collected in
107 Tianjin across three distinct periods: pre-heating (29th October 2018 to 25th
108 November 2018), mid-heating (8th January 2019 to 22nd January 2019), and late-
109 heating (7th March 2019 to 3rd April 2019). Based on the Bayesian isotope mixing
110 (MixSIAR) model, this study compares and explains the differences in the source
111 resolution results due to the $\delta^{15}\text{N}$ -NO_x sources measured locally in Tianjin and those
112 measured by previous studies. Notably, coal combustion activity was most
113 pronounced during the mid-heating period compared to other periods. Given the
114 proposition that coal combustion is a significant source of NO₃⁻, it is conceivable that
115 coal combustion would exhibit a notably higher contribution fraction during the mid-
116 heating period compared to the pre-heating and late-heating periods (Feng et al.,
117 2020). This provides an opportunity to explore the necessity of establishing local
118 source $\delta^{15}\text{N}$ values for NO_x emissions in Tianjin. The study will enhance our
119 understanding of the source of NO₃⁻ in PM_{2.5}, and further emphasize the necessity for
120 the establishment of a refined isotopic fingerprint for NO_x sources in future studies.



121 **2. Materials and Methods**

122 **2.1 Description of the location and sample collection**

123 PM_{2.5} samples were collected from the rooftop of Tianjin University, located in
124 the Nankai District, Tianjin (Figure S1). The roof stands approximately 25 m above
125 ground level, with no discernible sources of pollutants in the vicinity, such as factories
126 or construction sites. A high-volume air sampler (Tisch, USA) equipped with quartz
127 fiber filters (Pallflex, 20 × 25 cm) was utilised for PM_{2.5} collection, operating at a
128 flow rate of 1.05 m³ min⁻¹. Prior to sampling, all quartz fiber filters underwent
129 combustion at 450°C for 6 hours to eliminate potential interference from organic
130 matter. Samples were collected at two distinct time points: daytime samples between
131 8:00 and 18:00, and nighttime samples between 18:30 and 7:30 the following morning.
132 Pollutant concentrations (e.g., PM_{2.5}, SO₂, NO₂, CO) and corresponding
133 meteorological parameters (e.g., ambient temperature, T; relative humidity, RH; wind
134 speed, WS) during sampling periods were obtained from nearby monitoring stations
135 (Xiao et al., 2024b).

136 To enable comparison, a diaphragm pump (Laoying 3072, Qingdao Laoying
137 Environmental Science and Technology, China) was uniformly employed to actively
138 absorb NO_x emissions from various sources (Figure S2). Initially, hydrophobic Teflon
139 membrane (TF-200, Pall, USA) and nylon membrane (BNRG810S, Pall, USA) were
140 used to exclude interference of particulate NO₃⁻ and gaseous HNO₃ emitted by
141 sources, respectively. Filtered gases were then passed through an alkaline solution of
142 0.5 mol L⁻¹ NaOH and 0.25 KMnO₄, known for its strong oxidizing properties,
143 oxidizing NO_x entering the absorbing solution to form NO₂⁻ or NO₃⁻ and store it in
144 the absorbing vial (Fibiger et al., 2014; Fibiger and Hastings, 2016). The added NaOH
145 served to react with NO_x and enhance the viscosity of the absorbing solution, thereby
146 improving conversion efficiency (Sada et al., 1977). However, since KMnO₄ in the
147 absorbing solution is in excess, incompletely reacted KMnO₄ in the solution must be
148 further reduced in the laboratory. This study involved 6 emission sources of NO_x in
149 the local Tianjin area, including coal-fired power plants, gas-fired power plants,
150 biomass burning, vehicle exhaust, iron and steel smelting and soil emission sources
151 (see Supporting Information Text S1 for detailed description). All collected PM_{2.5}
152 samples and gaseous NO_x from various sources were stored at -20 °C in a refrigerator
153 after sampling. It was worth noting that an additional blank sample was prepared for
154 each sampling campaign, in parallel with the other samples.

155 **2.2 Chemical and isotopic analysis**

156 In the ultraclean room, a proportion of the particulate matter from the each PM_{2.5}
157 sample was cutted and transferred to a 50 ml centrifuge tube. Subsequently, samples
158 from each filter were extracted using Milli-Q water, which has a demonstrated ionic
159 strength of 18.2 MΩ cm (Millipore, United States), via ultrasonication and



160 centrifugation. Ionic chromatography (Dionex Aquion, Thermo Fisher Scientific, Inc.,
161 Waltham, MA, USA) was employed following established methodologies to
162 determine the presence of water-soluble major ions (e.g., SO_4^{2-} , NO_3^- , and NH_4^+) in
163 $\text{PM}_{2.5}$ (Xiao et al., 2024b). For the gaseous NO_x samples from various sources, an
164 excess of H_2O_2 was added to the absorbent solution until all the incompletely reacted
165 KMnO_4 in the sampled absorbent solution was converted, resulting in the formation of
166 black MnO_2 precipitate (Fibiger and Hastings, 2016). Subsequently, the resulting
167 suspension was centrifuged at high speed (4000 r min^{-1}) for 10 minutes to obtain the
168 supernatant, which was neutralized using electronic grade hydrochloric acid (HCl) at
169 a mass concentration of approximately 38% to neutralize under-reacted sodium
170 hydroxide. Finally, the supernatant was analyzed for NO_2^- and NO_3^- concentrations
171 on a Skalar San++ continuous flow nutrient salt analyzer. It was noteworthy that the
172 concentration of NO_2^- in the absorbent solution after treatment with a strong oxidant
173 (i.e., H_2O_2) as described above is typically extremely low, typically below $0.005 \mu\text{g}$
174 mL^{-1} .

175 In this study, we utilized the bacterial denitrification method to determine the
176 dual isotopic values of NO_3^- ($\delta^{15}\text{N}$ and $\delta^{18}\text{O}$) in $\text{PM}_{2.5}$ and absorbent solution. Further
177 details can be found in our previous study (Xiao et al., 2023; Li et al., 2021). Briefly,
178 extracted NO_3^- were quantitatively converted to N_2O through the action of
179 denitrifying bacteria, namely *Pseudomonas aureofaciens*, ATCC 13985, which lacked
180 N_2O reductase (Luo et al., 2020b). Subsequently, the $\delta^{15}\text{N}$ and $\delta^{18}\text{O}$ values of N_2O
181 were determined using GasBench-II with continuous flow isotope ratio mass
182 spectrometry (IRMS; Thermo Fisher DELTA V advantage, Thermo Fisher Scientific,
183 Inc.) for on-line analysis. The study employed three isotopic international standards:
184 USGS32, USGS34 and IAEA-N3, and the analytical accuracies for both $\delta^{15}\text{N}$ and
185 $\delta^{18}\text{O}$ were $\pm 0.2\text{‰}$ and $\pm 0.3\text{‰}$, respectively. Furthermore, the influence of NO_2^- was
186 deemed negligible as its concentration fell below 2% of the NO_3^- level in all samples
187 (Luo et al., 2019).

188 2.3 Stable isotopic mixing model

189 The Bayesian model enabled the determination of the probability distribution of
190 the contribution of each source to a mixture (Parnell et al., 2010). Subsequently, a
191 Bayesian isotope mixing model was implemented in the R software package (Stable
192 Isotope Analysis in R, SIAR) to estimate potential sources of atmospheric NO_3^- in
193 $\text{PM}_{2.5}$ in this study (Zong et al., 2017). Briefly, the model initiates with establishing a
194 logistic prior distribution, followed by determining the probability contribution
195 distribution of each source to the mixture. Further details are available in our previous
196 study (Xiao et al., 2023; Li et al., 2021). It was noteworthy that an obvious isotopic
197 fractionation process occurs during the conversion of NO_x to NO_3^- . Therefore, the
198 nitrogen isotope fractionation coefficient (ϵN) resulting from NO_x to NO_3^- conversion
199 should be calculated prior to determining the relative contribution of NO_x sources
200 using MixSIAR model (Text S2). Furthermore, to enhance the reliability of the study
201 results, the model generated 10,000 potential scenarios for each evaluated potential



202 source (Song et al., 2019; Fan et al., 2020).

203 3. Results and discussion

204 3.1 The $\delta^{15}\text{N}$ values of major NO_x emission sources

205 This study sampled three categories of NO_x sources associated with the
206 combustion of fossil fuels, specifically vehicle exhaust, coal combustion, and natural
207 gas combustion. As shown in Figure 1 and Table 1, the NO_x concentrations emitted
208 by these sources exceeded atmospheric NO_x concentration levels in urban China. The
209 $\delta^{15}\text{N}$ values and concentrations of NO_x in vehicle exhaust exhibited a range of -18.3‰
210 to 7.9‰ and 0.006 to 223.8 ppm, respectively. Furthermore, slight differences were
211 observed between the $\delta^{15}\text{N}$ values in vehicle exhaust at different sampling sites
212 (Figure S3), which can be attributed to the varying nitrogen contents of the fuels, the
213 NO_x generation pathways and the efficiency of the three-way catalytic devices
214 (Walters et al., 2015a; Zong et al., 2020a; Heaton, 1990). For instance, vehicle exhaust
215 can produce both thermal and fuel NO_x . Thermal NO_x is generated at high
216 temperatures exceeding 1500°C and is influenced by factors such as the molar
217 concentrations of O_2 and N_2 and combustion temperature (Walters et al., 2015b). In
218 contrast, fuel NO_x is primarily related to the nitrogen content of the fuel (Walters et
219 al., 2015b). Walters et al. (2015a) observed that fuel NO_x exhibited more positive
220 $\delta^{15}\text{N}$ values than thermal NO_x , and catalytic treatment could also yield positive $\delta^{15}\text{N}$
221 values. When compared with previous studies (Figure S4a and Table 1), our results
222 align with domestic reports but significantly differ from foreign studies. This variation
223 can be attributed to significant differences in $\delta^{15}\text{N}$ values of oils due to their
224 generation and depositional settings (Williams et al., 1995), indicating local
225 characteristics of $\delta^{15}\text{N}$ values of NO_x in vehicle exhaust.

226 The $\delta^{15}\text{N}$ value of NO_x emissions from the coal-fired power plant (coal
227 combustion) in Tianjin ranged from $+9.4\text{‰}$ to $+15.4\text{‰}$, with a mean value of $+12.3$
228 $\pm 1.7\text{‰}$ (Figure 1). Our results differ significantly from previous reported $\delta^{15}\text{N}$ - NO_x
229 values from coal combustion (Figure S4b). A previous study found that the $\delta^{15}\text{N}$ - NO_x
230 values from coal combustion were primarily influenced by thermal NO_x production
231 related to combustion temperature and NO_x reduction technology related to fuel-to-air
232 ratio, rather than by $\delta^{15}\text{N}$ values of the coal itself (Felix et al., 2012). However, the
233 coal combustion temperatures of approximately 1300 to 1400°C observed in power
234 plants in this study were insufficient to produce thermal NO_x (Heaton, 1990).
235 Consequently, the $\delta^{15}\text{N}$ - NO_x value from coal combustion in this study may be related
236 to the ^{15}N abundance of coal, indicating local characteristics of $\delta^{15}\text{N}$ values of NO_x
237 from coal combustion. It is noteworthy that a considerable range of values (-31.3‰ ~
238 -17.5‰) and a relatively negative mean value ($-24.8 \pm 5.6\text{‰}$) of $\delta^{15}\text{N}$ - NO_x from
239 natural gas combustion were observed, in comparison to the aforementioned sources
240 (Figure 1). Generally, natural gas has a low nitrogen content, and its combustion
241 primarily produces thermal NO_x , with $\delta^{15}\text{N}$ values depending on temperature,
242 pressure and oxygen content in the combustion chamber (Heaton, 1990). In this study,
243 the combustion chamber of a gas-fired power plant can have a temperature of more



244 than 2000 °C, generating NO_x mainly through the extended Zeldovich mechanism
245 (Zong et al., 2020a). Consequently, the $\delta^{15}\text{N}$ values of NO_x from natural gas
246 combustion exhibit a significantly more negative trend than those observed in the two
247 aforementioned sources. However, our results were more negative than those reported
248 by Walters et al. (2015b) for NO_x emitted from residential gas furnaces in Indiana,
249 USA (ranging from -19.7 ‰ to -13.9 ‰ and -16.5 ± 1.7 ‰). This discrepancy can be
250 attributed to the combustion process employed in this study, which necessitates the
251 introduction of sufficient air into the combustion chamber. To achieve this, ‘fresh air’
252 was introduced into to the chamber, which may have resulted in a reduction in $^{14}\text{N}^{14}\text{N}$
253 loss and the generation of negative $\delta^{15}\text{N}$ -NO_x values in this study compared to those
254 observed in previous studies.

255 NO_x emissions from industrial sources, such as the iron and steel industry, arise
256 from various processes including sintering, pelletizing, and hot blast furnaces (Wang
257 et al., 2019; Zhao et al., 2017). Generally, the $\delta^{15}\text{N}$ -NO_x value from industrial
258 emission sources differs significantly from those of emissions from fossil fuel
259 combustion (Figure 1b), emphasizing the representativeness of the isotopic fingerprint
260 in industrial emission sources. The $\delta^{15}\text{N}$ values of NO_x emitted from the hot blast
261 furnace were -43.1 ± 12.3 ‰, in contrast to the more positive value observed for the
262 sintering process (-14.5 ± 3.2 ‰) and the pelletizing process (-6.4 ± 2.5 ‰) (Figure
263 S5). This suggests that the mechanisms by which these processes emit NO_x were
264 complex and highly variable. The maximum temperature in the central area of the hot
265 air stove can exceed 2000 °C, with the majority of emitted NO_x being thermal NO_x
266 (Toof, 1986). Due to the continuous $^{14}\text{N}^{14}\text{N}$ supplementation, generated NO_x exhibits
267 a negative $\delta^{15}\text{N}$. In contrast, the temperatures of sintering and pelletizing processes
268 are relatively low (1200 ~ 1400 °C), with the majority of emitted NO_x being fuel-type
269 NO_x (Toof, 1986). Specifically, functional groups such as pyrrole and pyridine in
270 coke powder decompose at high temperatures and react with O₂ to produce NO_x,
271 resulting in a positive value of $\delta^{15}\text{N}$ -NO_x (Hayhurst and Vince, 1980). It should be
272 noted that the raw materials used for sintering were iron ore fines and coke powder,
273 which differed from those used in coal combustion in power plants. Consequently, the
274 $\delta^{15}\text{N}$ values of NO_x released cannot be considered to be the same source isotopic
275 fingerprint, as they are influenced by differences in ^{15}N abundance (Heaton, 1990).

276 This study also characterizes $\delta^{15}\text{N}$ -NO_x values released from biomass burning
277 ($+1.2 \pm 3.0$ ‰), obtained by burning various types of plant materials locally in Tianjin.
278 The mean values observed in this study were comparable to those reported by Fibiger
279 and Hastings (2016) ($+1.0 \pm 4.1$ ‰), while the range of fluctuations (-4.9 ‰ ~
280 $+5.5$ ‰) was narrower than those observed by their results (-7 ‰ ~ $+12$ ‰) (Figure
281 S4d). Moreover, the $\delta^{15}\text{N}$ values of biomass fuel combustion from the Zhejiang
282 Province, China, which measured the $\delta^{15}\text{N}$ -NO_x values of biomass burning from
283 various types of biomass fuels [Shi et al., 2022], were found to be lower than those
284 observed in the present study. These results indicate that the variations in the $\delta^{15}\text{N}$ -
285 NO_x values of biomass burning are primarily influenced by the type of biomass fuel
286 (Shi et al., 2022). Similarly, significant differences were observed between various



287 types of biomass fuel combustion, supporting this viewpoint (Figure S6). These
288 findings indicate that the NO_x from biomass burning worldwide may exhibit a wide
289 range of $\delta^{15}\text{N}$ values due to varying $\delta^{15}\text{N}$ -biomass values. Consequently, in order to
290 accurately assess the contribution of biomass burning to atmospheric NO_x in Tianjin,
291 it is essential to obtain the ^{15}N signal of NO_x release from typical local biomass
292 combustion is essential.

293 In comparison to the five sources mentioned earlier, soil emission exhibits a
294 lower concentration of NO_x, accompanied by the most negative $\delta^{15}\text{N}$ value ($-33.7 \pm$
295 9.7 ‰) (Figure 1). Moreover, the concentration or $\delta^{15}\text{N}$ values of NO_x released from
296 various types of soil demonstrate a clear distinction (Figure S7). The concentration of
297 NO_x released from wheatland soil after irrigation was found to be significantly higher
298 than that observed prior to irrigation (Figure S7). However, the difference in $\delta^{15}\text{N}$ of
299 NO_x ($-38.5 \pm 2.5 \text{ ‰}$ vs. $-40.1 \pm 5.9 \text{ ‰}$) was not found to be significant ($p > 0.05$).
300 These results indicate that irrigation has a significantly impact on NO_x release from
301 wheatland soils, but not on its $\delta^{15}\text{N}$ value. The $\delta^{15}\text{N}$ -NO_x released from wetland soils
302 was comparable to that released from wheatland soils, both of which exhibited a more
303 negative value than those released from urban green belt soils (Figure S7). Previous
304 studies have indicated that soil NO release is primarily divided into biotic and abiotic
305 processes (Hall et al., 1996). The biotic process encompasses the nitrification of NH_4^+
306 and the denitrification of NO_3^- , while the abiotic process is primarily the chemical
307 reduction of NO_2^- in soil (Yu and Elliott, 2017). Kinetic processes favor the presence
308 of ^{14}N in the product gases derived from the biotic process, whereas the $\delta^{15}\text{N}$ -NO_x
309 released by abiotic processes in soil is significantly positive than that of biotic
310 processes (Felix and Elliott, 2014; Li and Wang, 2008; Baggs, 2008). Consequently,
311 our study suggests that a significant abiotic process may have caused NO release from
312 urban green belt soils. Given the abundance of wheatland in the vicinity of Tianjin
313 and the urban area covered by green belts and coastal wetlands, we used the
314 aforementioned $\delta^{15}\text{N}$ -NO_x values from the three soil types as representative of local
315 soil emissions in Tianjin.

316 3.2 Characteristics of concentration and $\delta^{15}\text{N}$ value of NO_3^- in $\text{PM}_{2.5}$

317 3.2.1 Concentrations of $\text{PM}_{2.5}$ and NO_3^-

318 The $\text{PM}_{2.5}$ concentration ranged from $5.1 \mu\text{g m}^{-3}$ to $297.8 \mu\text{g m}^{-3}$ during the
319 sampling period in Tianjin, with an average value of $68.6 \pm 62.4 \mu\text{g m}^{-3}$ (Table 2 and
320 Figure 2). Pre-heating exhibited the highest mean concentration ($75.3 \pm 53.3 \mu\text{g m}^{-3}$),
321 followed by mid-heating ($68.9 \pm 43.2 \mu\text{g m}^{-3}$) and late-heating ($39.0 \pm 27.9 \mu\text{g m}^{-3}$).
322 SNA (Sulfate: SO_4^{2-} , Nitrate: NO_3^- , Ammonium: NH_4^+) constituted the major ions in
323 $\text{PM}_{2.5}$, contributing to over 40% of $\text{PM}_{2.5}$ (Figure S8). The concentration of NO_3^-
324 showed a significant positive linear correlation with $\text{PM}_{2.5}$ (Figure 2), suggesting that
325 the substantial increase in $\text{PM}_{2.5}$ pollution is linked to an increase in NO_3^-
326 concentration.

327 The variation pattern of NO_3^- concentration during different sampling periods
328 aligned with that of $\text{PM}_{2.5}$ (Figure 2). The highest concentration of NO_3^- was



329 observed during pre-heating ($16.0 \pm 12.4 \mu\text{g m}^{-3}$), and the lowest concentration was
330 observed during late-heating ($9.7 \pm 8.7 \mu\text{g m}^{-3}$) (Table 2). Notably, NO_2 , as the
331 precursor of NO_3^- , did not follow the observed pattern of change in NO_3^-
332 concentration. The highest concentration of NO_2 was observed during mid-heating
333 (Table S1 and Figure S7), potentially influenced by increased coal combustion for
334 heating (Luo et al., 2019). Generally, NO_2 concentration and its secondary conversion
335 efficiency were the key factors affecting the concentration of NO_3^- . Therefore, the
336 difference could be attributed to biases in the secondary conversion efficiency of NO_2
337 (Xiao et al., 2023). This is supported by the lower relative humidity (RH) during mid-
338 heating ($31.1 \pm 20.3\%$) compared to pre-heating ($46.2 \pm 14.8\%$) (Table S1), as higher
339 RH could lead to increased NO_3^- formation (Gao et al., 2020). Compared to NO_3^- , the
340 SO_4^{2-} concentration was highest during mid-heating. In addition, SO_2 , mainly
341 originating from coal combustion, exhibited a similar variation pattern to SO_4^{2-} ,
342 potentially attributed to increased coal combustion for heating (Figure S9) (Feng et al.,
343 2020). Markers primarily originating from coal combustion, including CO and Cl^-
344 (Figure S9), also showed higher concentration during mid-heating, supporting our
345 speculation (Luo et al., 2019; Xiao et al., 2022). While the increase in NO_2 could be
346 attributed to enhanced biomass burning during mid-heating, the concentration of K^+ ,
347 primarily a biomass burning marker (Xiao et al., 2024a), exhibited slight variation
348 during the three periods and was significantly lower than Cl^- (Table 2). Thus, the
349 impact of coal combustion heating on NO_3^- sources was evident, despite mid-heating
350 periods being unfavorable for NO_3^- generation.

351 3.2.2 Characteristics in $\delta^{15}\text{N}$ value of NO_3^-

352 The $\delta^{15}\text{N}\text{-NO}_3^-$ values in this study ranged from -0.7% to 20.8% , with a mean
353 $\delta^{15}\text{N}$ value of $8.5 \pm 4.4\%$ (Figure 2 and Table 2). This measurement was more
354 negative than the observations reported by Feng et al. (2020) ($14.1 \pm 3.2\%$) in Tianjin
355 in 2017, Luo et al. (2019) in Beijing ($13.9 \pm 2.4\%$) in 2013, and Zhang et al. (2021) in
356 Beijing ($+11.5 \pm 5.0\%$) in 2018. The Coal Replacement Project, initiated since 2017
357 to replace coal with cleaner energy sources such as natural gas and electricity in major
358 cities such as Beijing and Tianjin in northern China (Feng et al., 2020), could explain
359 this reduction in coal use leading to a gradual decrease in $\delta^{15}\text{N}$ values of NO_3^- , as
360 NO_x emissions from coal combustion have positive $\delta^{15}\text{N}$ values. This speculation is
361 supported by reported changes in the Bohai Sea from 2014 to 2019 (Zong et al.,
362 2022b).

363 Significant differences were observed in $\delta^{15}\text{N}\text{-NO}_3^-$ values among the three
364 sampling periods in this study. The most positive value was observed during mid-
365 heating ($12.4 \pm 3.3\%$), followed by pre-heating ($7.7 \pm 4.1\%$) and late-heating ($7.1 \pm$
366 4.1%) (Table 2). These results suggest variations in the sources of NO_x during three
367 sampling periods. For instance, the primary source $\delta^{15}\text{N}\text{-NO}_x$ from coal combustion
368 ($+12.3 \pm 1.7\%$) has most positive value (Figure 1), indicating coal combustion as the
369 dominant source of NO_x during mid-heating periods (Luo et al., 2019). However, for
370 the other sampling periods, the $\delta^{15}\text{N}$ values of NO_3^- indicate multiple sources of NO_x ,
371 including fossil fuel combustion, industrial emissions, biomass burning, and soil



372 sources (Zong et al., 2017;Sun et al., 2020). Previous studies conducted in Chinese
373 cities have reported monthly variations in $\delta^{15}\text{N-NO}_3^-$, which could also be attributed
374 to changing NOx sources (Luo et al., 2020a;Luo et al., 2020b;Guo et al., 2021;Zhang
375 et al., 2022).

376 3.3 The importance of $\delta^{15}\text{N}$ values from local NOx source for sources
377 apportionment of NO_3^- in $\text{PM}_{2.5}$

378 In this study, the MixSIAR model was employed to quantify the contribution of
379 NOx sources. Previous studies have estimated the contribution of NOx sources using
380 the MixSIAR model, based on the known $\delta^{15}\text{N}$ values of NOx from different sources.
381 These studies have focused on four sources of NOx: coal combustion, biomass
382 combustion, vehicle exhaust, and soil sources (Zong et al., 2017;Zong et al.,
383 2020b;Zhao et al., 2020;Zhang et al., 2020). To facilitate comparison, the $\delta^{15}\text{N}$ data of
384 above four sources from previous studies (Scenario 1) and this study (Scenario 2)
385 were input into the MixSIAR model to quantify the sources of NO_3^- , respectively
386 (Table 1). Throughout the entire sampling duration, the average contributions
387 estimated by the MixSIAR model exhibited no substantial disparities between
388 Scenarios 1 and 2, suggesting that localized $\delta^{15}\text{N}$ data acquisition for NOx sources
389 might be superfluous. However, the contributions of individual NOx sources to NO_3^-
390 in $\text{PM}_{2.5}$ were found to be significantly different during a certain sampling period
391 when calculated using different $\delta^{15}\text{N}$ data for NOx sources. For instance, during the
392 pre-heating periods, the contributions of soil sources, coal combustion, and biomass
393 burning in Scenario 1 were $23.0 \pm 10.1\%$, $17.8 \pm 12.5\%$, and $24.1 \pm 17.3\%$,
394 respectively. The contributions were slightly lower than the estimated results in
395 Scenario 2 ($25.0 \pm 7.4\%$, $19.1 \pm 13.2\%$, and $25.6 \pm 18.3\%$). Furthermore, the
396 contribution of vehicle exhaust exhibited a notable discrepancy, being considerably
397 higher in Scenario 1 ($35.1 \pm 22.8\%$) compared to Scenario 2 ($30.2 \pm 21.1\%$).
398 Therefore, the calculation of the contributions of various sources to NO_3^- using $\delta^{15}\text{N}$
399 data in NOx sources from previous studies may result in inaccuracies.

400 The uncertainty index (UI_{90}), derived from posterior distribution data (as detailed
401 in Text S3), serves as a metric to evaluate the uncertainty in the results calculated by
402 the MixSIAR model (Zhang et al., 2024a). A low UI_{90} value indicates a low degree of
403 uncertainty, which suggests that the results of the source contribution were stable
404 (Shang et al., 2020). As shown in Figure 4, the UI_{90} values of coal combustion and
405 biomass combustion were lower in Scenario 1 than in Scenario 2, indicating that the
406 results in Scenario 1 were relatively stable. However, the contributions of vehicle
407 exhaust and soil sources in Scenario 2 were relatively stable, as their UI_{90} values were
408 lower in Scenario 2 than in Scenario 1. It can therefore be observed that the
409 uncertainty in contributions from different sources exhibited a variety of degrees of
410 variability that were influenced by the differing end-member values inputted into the
411 model. Generally, the correlation of probability density functions (PDFs) between
412 different sources may provide insight into the validity of model calculations (Parnell
413 et al., 2010). For instance, if the two sources cannot be completely differentiated by
414 the model, their correlation in PDFs will exhibit a strong negative correlation (Lin et



415 al., 2021). The study revealed a significant negative correlation between the PDFs of
416 vehicle emissions and coal combustion and soil sources both in both Scenario 1 and
417 Scenario 2 (Table S2), indicating that these sources cannot be completely
418 differentiated. Therefore, the inclusion of additional sources is recommended to
419 enhance the accuracy of estimates provided by the MixSIAR model (Lin et al., 2021).

420 Since the initiation of the Coal Replacement Project in 2017, the contribution of
421 natural gas combustion to NO_3^- may not be negligible in recent years in Tianjin
422 (Meng et al., 2022; Wang et al., 2022). However, previous studies have seldom
423 examined the role of natural gas combustion in contributing to NO_3^- in $\text{PM}_{2.5}$, due to
424 limited availability of reported $\delta^{15}\text{N}$ values of NO_x resulting from natural gas
425 combustion (Zong et al., 2022b; Walters et al., 2015b). Consequently, the results may
426 be subject to some degree of uncertainty when only the four $\delta^{15}\text{N}$ - NO_x end-member
427 values are considered. Therefore, we refer to the $\delta^{15}\text{N}$ - NO_x end-member values from
428 natural gas combustion obtained from previous studies (Scenario 3) and locally
429 acquired in Tianjin (Scenario 4) to calculate the relative contribution fractions of the
430 five NO_x sources using the MixSIAR model (Figure 4c and 4d).

431 In contrast to the findings of the four sources (Scenario 1 and Scenario 2),
432 significant discrepancies exist between Scenario 3 and Scenario 4. Especially the
433 contribution fractions of natural gas combustion ($21.0 \pm 13.8\%$ vs. $16.5 \pm 11.5\%$) and
434 coal combustion ($18.2 \pm 10.7\%$ vs. $22.0 \pm 12.7\%$), the results estimated in Scenario 4
435 significantly differ from those in Scenario 3. These disparities are also present across
436 different sampling periods. During pre-heating periods, contributions of vehicle
437 exhaust ($24.9 \pm 18.5\%$ vs. $25.6 \pm 19.0\%$) and biomass burning ($20.9 \pm 15.1\%$ vs. 24.1
438 $\pm 17.2\%$) were lower in Scenario 4 compared to Scenario 3. Conversely, natural gas
439 combustion ($21.5 \pm 14.3\%$ vs. $17.3 \pm 11.3\%$) and soil sources ($14.4 \pm 9.7\%$ vs. $13.2 \pm$
440 8.7%) estimates in Scenario 3 were higher than those in Scenario 4. Similar
441 differences were observed during the mid-heating periods. However, in the late-
442 heating periods, contributions of vehicle exhaust ($22.1 \pm 18.0\%$ vs. $26.0 \pm 17.3\%$) and
443 coal combustion ($15.6 \pm 10.8\%$ vs. $18.2 \pm 11.6\%$) calculated in Scenario 4 was higher
444 than those in Scenario 3. In addition, biomass burning ($20.8 \pm 14.9\%$ vs. $20.6 \pm$
445 14.9%), natural gas combustion ($24.1 \pm 16.1\%$ vs. $18.7 \pm 13\%$) and soil sources (17.4
446 $\pm 10.8\%$ vs. $16.4 \pm 9.9\%$) in Scenario 4 were lower than those in Scenario 3. In both
447 scenarios, the contribution of natural gas combustion to NO_3^- was close to or even
448 exceeds that of soil sources (Figure 4). This underscores the need to consider natural
449 gas combustion when assessing NO_3^- sources in $\text{PM}_{2.5}$, particularly in urban areas
450 impacted by the Coal Replacement Project (Zhang et al., 2024a). Consequently, our
451 result further highlight that the natural gas combustion as a source input the model
452 could improve the validity of the calculations to a certain extent. Additionally,
453 measuring the $\delta^{15}\text{N}$ values of the local NO_x source is necessary to accurately identify
454 the source of NO_3^- in $\text{PM}_{2.5}$.

455 3.4 Industrial emission should be an important source of NO_3^-

456 Industrial emissions, particularly those from the iron and steel sector, consume a



457 significant quantity of fossil fuel and mineral resources, resulting in a notable increase
458 in NO_x emissions (Wang et al., 2019). The iron and steel industry in China has
459 undergone considerable expansion, resulting in a marked increase in NO_x emissions.
460 From 2005 to 2015, emissions escalated from 687.93 kt to 1017.24 kt (Gao et al.,
461 2019). This trend suggests that emissions from this sector increasingly affect urban
462 atmospheric NO_x levels, especially in industrial cities. Our investigation has revealed
463 that the $\delta^{15}\text{N}$ -NO_x signature from the iron and steel industry is distinct from that of
464 other sources, such as vehicle exhaust, coal combustion, and natural gas combustion
465 (Figure 1). Consequently, it is necessary to treat this source as a unique end-member
466 in the apportionment of NO₃⁻.

467 The MixSIAR model was used to estimate the contributions of six NO_x sources
468 (coal combustion, biomass burning, vehicle exhaust, soil sources, natural gas
469 combustion and industrial emission source) to NO₃⁻ in PM_{2.5} based on their respective
470 $\delta^{15}\text{N}$ values. We concluded that coal combustion ($22.8 \pm 11.9\%$) was major sources of
471 NO₃⁻ in PM_{2.5} in Tianjin, followed by the biomass burning ($20.9 \pm 15.0\%$) and
472 vehicle exhaust ($20.0 \pm 17.2\%$) (Figure S8). In comparison to a previous study in
473 Tianjin (Xiao et al., 2023), where coal combustion contributed 42.6% of NO_x, our
474 study observed a significant decrease, attributable to the ultraclean transformation of
475 coal combustion processes. Nevertheless, energy from coal combustion, which
476 remains the main source of NO_x in Tianjin, is used for most of the manufacturing and
477 residential sectors. Moreover, there is a possibility that the contribution of coal
478 combustion increased due to long-range transportation of air masses, alongside local
479 emissions (Li et al., 2023). This is particularly significant as there was notable coal
480 combustion activity upwind of Tianjin (Feng et al., 2020; Xiao et al., 2024b). However,
481 the contribution of vehicle exhaust was slightly higher than the results in our earlier
482 study (19.8%) (Xiao et al., 2023), which resulted from the increased of vehicle
483 ownership. It was worth noting that the influence of biomass burning was also
484 decreased than that in earlier study in Tianjin, which attributed to the effective
485 implementation of measures, such as the ban on straw burning in the North China
486 Plain (Huang et al., 2021). In this study, industrial emission source was accounting for
487 14%, slightly lower than vehicle exhaust. According to the community emission data
488 system, previous studies have estimated the industrial contribution to NO_x to be
489 around 14% (Bekker et al., 2023), which close to our estimate result. Moreover, the
490 contribution of the industrial emission source was found to be greater than that of soil
491 sources (10%) and natural gas combustion (12%), indicating that it should be
492 considered an important source of NO₃⁻.

493 Generally, the contribution of certain NO_x sources decreased as the number of
494 sources increased (Figure S10). In particular, the contributions from soil and vehicle
495 exhaust sources decreased by 13% and 11%, respectively, compared to the results
496 from four sources. Furthermore, they further decreased by 4% and 4%, respectively,
497 compared to the results from five sources. In this case, however, the contribution of
498 coal combustion was slightly increased (Figure S10). The could indication that the
499 number of sources will markedly influence the estimate results by the MixSIAR



500 model. Furthermore, the correlations of PDFs between coal combustion and biomass
501 burning remained unchanged, while those between the other sources decreased further
502 when the number of sources input into the model increased from four to six (Table
503 S2). This indicated that the inter-influence between these sources was further reduced,
504 and the model was able to distinguish between them (Lin et al., 2021). Moreover, the
505 contributions of all sources demonstrated more relatively stable results, with UI_{90}
506 values exhibiting the lowest values compared to the results estimated by the four or
507 five sources (Figure 4c) (Zhang et al., 2024a). This is because after setting the total
508 contribution of all sources in the model to 1, the lack of input sources in the model
509 may lead to an increase in the fluctuation of the calculated results (Lin et al.,
510 2021; Zhang et al., 2024a; Feng et al., 2023). Therefore, it was concluded that
511 incorporating industrial sources in MixSIAR model could decrease uncertainty in
512 calculating the contribution of NO_x sources.

513 To further elucidate the reasonable of NO₃⁻ source apportionment results when
514 the $\delta^{15}\text{N}$ signature of NO_x from industrial emission sources were input the MixSIAR
515 model, we examine the simulation results of different sampling periods, as shown in
516 Figure 5. It was demonstrated that, irrespective of the sampling period, the
517 contribution of NO_x sources varied with the number of sources increased, attributable
518 to the sensitive of MixSIAR model to missing emission sources (Feng et al., 2023).
519 Notably, during the mid-heating periods, coal combustion and biomass burning
520 contributed more significantly than in other periods (Figure 6), collectively exceeding
521 50% when six sources were incorporated into the MixSIAR model. These findings
522 suggest that winter heating emissions play a dominant role in the increase of NO₃⁻
523 concentrations in the urban area of Tianjin (Luo et al., 2019; Zhao et al., 2020).
524 Additionally, the contributions of these two sources were higher during pre-heating
525 compared to late-heating periods, when six sources were considered in the MixSIAR
526 model. These differences were also reflected in the concentrations of trace factor from
527 biomass burning (K⁺) and coal combustion (Cl⁻) (Sun et al., 2020; Zong et al., 2018)
528 (Figure 6c and 6d). However, the simulation results did not exhibit similar
529 consistency when five or four sources were included in the MixSIAR model. For
530 instance, the contribution of coal combustion was very close in the pre-heating and
531 late-heating periods when five or four sources were considered. Although the
532 contribution of soil sources exhibited similar varied patterns across the three sampling
533 periods when different number of emission sources were considered in the MixSIAR
534 model (Figure 5), the contribution of soil sources estimated with six sources was
535 significantly lower than the results from five or four sources. Especially in the mid-
536 heating period, its contribution was less than 10%. This was expected as low soil
537 temperatures decrease NO_x emissions into the atmosphere (Lin et al., 2021).
538 Interestingly, vehicle exhaust was the highest contributor to NO_x during the late-
539 heating periods (Figure 5), mainly attributable to the gradual weakening of coal
540 combustion and biomass burning activities for heating as temperatures increase.
541 Although vehicle exhaust emissions of NO_x may increase due to the rapid rise in car
542 ownership, their contribution fraction was only around 20%, owing to the three-way
543 catalyst (TWC) and Selective Catalytic Reduction (SCR) equipment installed in petrol



544 and diesel vehicles to mitigate NO_x emissions throughout China (Guan et al.,
545 2014;Gu et al., 2022). It should be noted that the contribution of industrial sources
546 ($16.2 \pm 12.5\%$) during the late-heating periods was close to coal combustion ($17.7 \pm$
547 11.2%), further underscoring the importance of incorporating industrial sources in
548 calculating results using the MixSIAR model. In essence, the exclusion of industrial
549 sources may lead to an increase of more than 15% in the contribution fraction of other
550 sources, biasing source contribution estimates and misleading emissions reduction
551 measures.

552 3.5 Limitations and outlook

553 The dataset presented in this study represents, to the best of our knowledge, the
554 first more systematic attempt to determine the $\delta^{15}\text{N}$ values of several significant NO_x
555 sources within urban environments in China. However, it is essential to acknowledge
556 that some sources, like bulk coal combustion, the metallurgical industry, and
557 residential gas, were either incompletely sampled or not sampled at all. Additionally,
558 the $\delta^{15}\text{N}$ values of NO_x emissions from soil across different seasons remain unknown.
559 These omissions could influence the outcomes of source apportionment, and result in
560 several uncertainties. Nevertheless, it can be determined that in the calculation results
561 of the MixSIAR model, the role of local $\delta^{15}\text{N}$ -NO_x source values is critical and
562 should not be overlooked. And as we introduced more sources into the model, the
563 estimates of the contribution of each NO_x source grew steadier, and the mutual
564 influence among these sources diminished significantly. This also highlights the
565 importance of comprehensively determining the $\delta^{15}\text{N}$ values of typical NO_x sources.
566 Therefore, it would be beneficial for NO₃⁻ source apportionment to further refine the
567 NO_x source types and improve the $\delta^{15}\text{N}$ values of other NO_x sources in the future.

568 It is widely recognized that different conversion pathways for NO_x to NO₃⁻
569 exhibit clear isotopic fractionation of nitrogen. This can lead to inaccuracies in
570 estimating the contributions of nitrate sources, particularly because the specific
571 influence of various pathways on the fractionation coefficient ϵN (NO_x → NO₃⁻)
572 often remains indistinct (Feng et al., 2020;Zhang et al., 2019). Specialized pathways,
573 such as those involving heterogeneous chlorine chemistry and nitrogen trioxide, can
574 alter the $\delta^{15}\text{N}$ values of NO₃⁻ (Luo et al., 2023;Zhang et al., 2024b). In this study, the
575 $\delta^{18}\text{O}$ -NO₃⁻ values helped constrain the fractionation factor from NO_x to NO₃⁻ (Xiao
576 et al., 2020), but only two primary pathways, hydroxyl radical oxidation and nitrogen
577 pentoxide hydrolysis, were taken into account. Previous research supports the view
578 that these pathways account for up to 95% of NO₃⁻ production (Lin et al., 2021;Xiao
579 et al., 2020), implying that alternative pathways might exert a relatively minor impact
580 on ϵN calculations. Nonetheless, future measurements of $\Delta^{17}\text{O}$ -NO₃⁻ are essential to
581 elucidate the isotopic fractionation coefficients comprehensively during the formation
582 of NO₃⁻.

583 4. Conclusions

584 In this study, the $\delta^{15}\text{N}$ values of 6 NO_x sources in the local Tianjin area collected



585 by the active sampler were determined. Results shown that $\delta^{15}\text{N}$ value of NO_x
586 emissions from coal combustion exhibited the positive value ($+12.3 \pm 1.7\text{‰}$),
587 followed by the biomass burning ($+1.2 \pm 3.0\text{‰}$), the vehicle exhaust ($-5.2 \pm 5.4\text{‰}$),
588 the industrial emission source ($-20.6 \pm 16.8\text{‰}$), the natural gas combustion ($-24.8 \pm$
589 5.6‰) and the soil sources ($-33.7 \pm 9.7\text{‰}$). The observation of significant differences
590 in $\delta^{15}\text{N}$ - NO_x values from disparate sources serves to demonstrate the representative
591 nature of these isotopic fingerprints. Furthermore, the mean values or fluctuation
592 range of $\delta^{15}\text{N}$ - NO_x for almost all sources differed from the values reported abroad in
593 previous studies, suggesting that the $\delta^{15}\text{N}$ values of NO_x sources has local
594 characteristics.

595 The contributions of various NO_x sources to NO_3^- in $\text{PM}_{2.5}$ during sampling
596 periods were estimated based on the MixSIAR model. In result, coal combustion,
597 biomass burning and vehicle exhaust collectively contributed more than 60%,
598 dominating the sources of NO_3^- during sampling periods in Tianjin. However, the
599 relative contribution fraction of each sources shown clear difference when the $\delta^{15}\text{N}$ -
600 NO_x source data from previous studies and this study inputted into the model,
601 respectively. Coal combustion, in particular, has a relative contribution that may be
602 underestimated without considering the localized characteristics of the isotopic
603 fingerprints of NO_x source. Remark, as the number of source inputs in the model
604 increases from four to six, the interpretability of the estimated results for the
605 contribution of each source increases. Moreover, the contribution of various NO_x
606 sources was becoming more stable, and the inter-influence between various sources
607 was significantly reduced. Specific examples include the values of UI_{90} and PDFs,
608 both of which exhibited a significant downward trend as the number of sources
609 increased. Overall, the refined $\delta^{15}\text{N}$ values of NO_x sources have been demonstrated to
610 be an effective tool in distinguishing source contributions of NO_3^- , which could help
611 to reduce the uncertainties and inter-influence of each source.

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618 **Data availability**

619 The datasets used in this study are available at
620 <https://doi.org/10.5281/zenodo.11392166> (Xiao et al., 2024c)

621 **Conflict of interest.**

622 The authors declare no conflicts of interest relevant to this study.



623 **Author contributions.**

624 Hao Xiao, Qinkai Li and Xiaodong Li designed the study. Hao Xiao, Qinkai Li,
625 Wenjing Dai and Gaoyang Cui performed field measurements and sample collection;
626 Hao Xiao and Qinkai Li performed chemical analysis; Hao Xiao and Qinkai Li
627 performed data analysis; Hao Xiao wrote the original manuscript; and Shiyuan Ding,
628 and Xiaodong Li reviewed and edited the manuscript.

629

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872 Table 1 Comparison of the $\delta^{15}\text{N}$ characteristic spectra of NO_x sources reported in the previous and
 873 present study

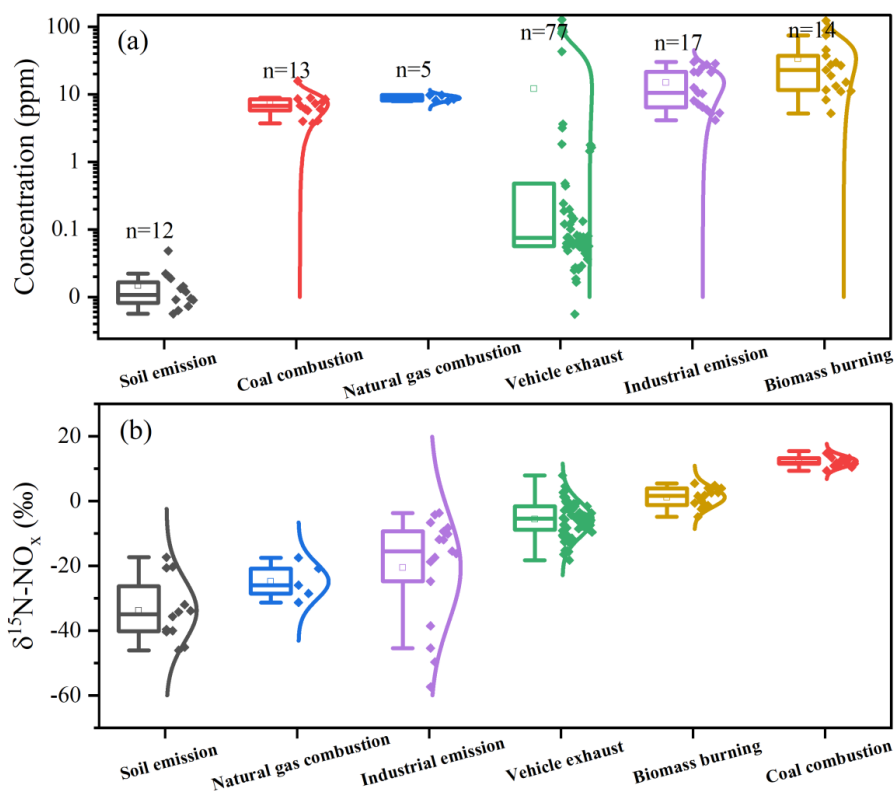
NO _x sources	Previous studies			This study			
	av (‰)	std (‰)	n	Reference	av (‰)	std (‰)	n
Coal combustion	+13.7	4.6	47	(Walters et al., 2015b;Felix et al., 2012) (Walters et al., 2015b;Walters et al., 2015a;Felix and Elliott, 2014;Heaton, 1990)	+12.3	1.7	13
Vehicle exhaust	-7.2	7.8	151	(Fibiger and Hastings, 2016;Felix and Elliott, 2013;Hastings et al., 2009)	-5.2	5.4	62
Biomass burning	+1.0	4.1	24	(Felix and Elliott, 2014;Li and Wang, 2008)	+1.2	3.0	14
Soil emission	-33.8	12.2	6	(Walters et al., 2015b)	-33.7	9.7	12
Nature gas combustion	-16.5	1.7	23		-24.8	5.6	5
Industrial source	N/A	N/A		N/A	-20.6	16.8	17

874 Note: N/A represents data unknown.



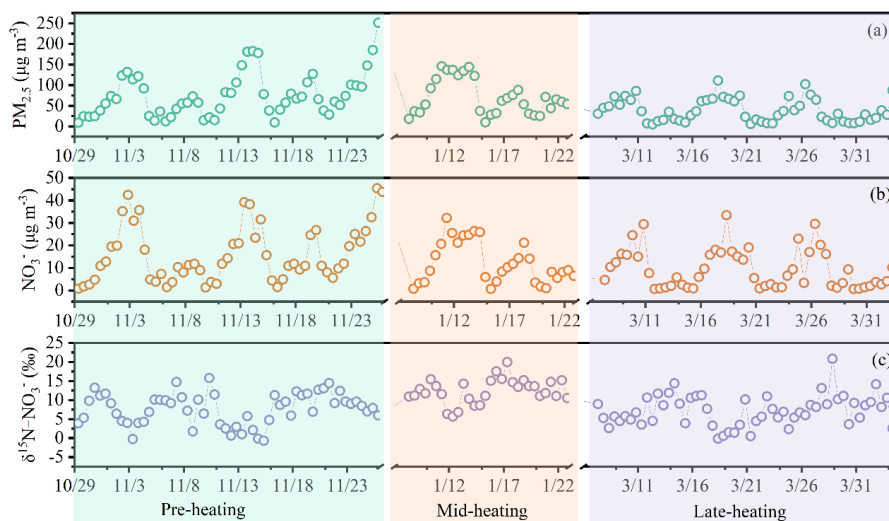
875 Table 2 Mean mass concentrations of PM_{2.5} and water-soluble inorganic ions as well as the δ¹⁵N-
876 NO₃⁻ in Tianjin urban areas at different sampling stages for 2018 ~ 2019 (av ± std)

Species	All days	Pre-heating	Mid-heating	Late-heating
	Average	Average	Average	Average
	(n = 142)	(n = 56)	(n = 30)	(n = 56)
PM _{2.5} (μg m ⁻³)	68.6 ± 62.4	75.3 ± 53.3	68.9 ± 43.2	39.0 ± 27.9
SO ₄ ²⁻ (μg m ⁻³)	4.9 ± 4.2	5.9 ± 4.2	6.1 ± 6.0	3.1 ± 1.9
NO ₃ ⁻ (μg m ⁻³)	12.7 ± 10.8	16.0 ± 12.4	11.9 ± 9.4	9.7 ± 8.7
NH ₄ ⁺ (μg m ⁻³)	7.7 ± 7.2	10.4 ± 9.0	7.9 ± 6.0	4.8 ± 4.0
Cl ⁻ (μg m ⁻³)	2.3 ± 2.1	2.7 ± 2.0	4.0 ± 2.5	0.9 ± 8.4
K ⁺ (μg m ⁻³)	0.7 ± 0.6	0.8 ± 0.7	0.9 ± 0.5	0.4 ± 0.3
Ca ²⁺ (μg m ⁻³)	0.2 ± 0.1	0.1 ± 0.1	0.1 ± 0.1	0.2 ± 0.1
Na ⁺ (μg m ⁻³)	0.2 ± 0.1	0.2 ± 0.1	0.3 ± 0.1	0.2 ± 0.1
Mg ²⁺ (μg m ⁻³)	0.01 ± 0.03	0.03 ± 0.02	0.03 ± 0.01	0.03 ± 0.02
δ ¹⁵ N (‰)	8.5 ± 4.4	7.7 ± 4.1	12.4 ± 3.3	7.1 ± 4.1



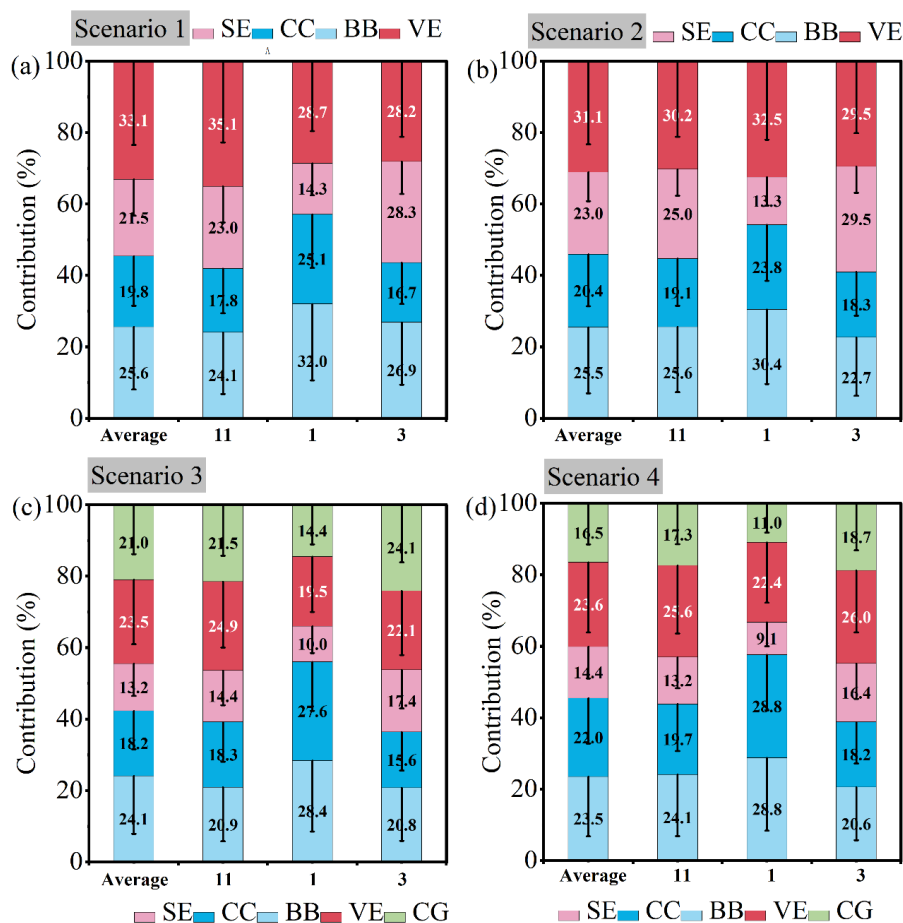
877

878 Figure 1 Concentration (a) and (b) $\delta^{15}\text{N}$ value of NO_x in each emission sources. The box-whisker
879 plot symbols represent the 25th–75th percentiles. The curved lines to the right of the box-whisker
880 plot symbols illustrate the probability distribution of the sample points, each of which represents
881 one sample.



882

883 Figure 2 Time series of the concentrations in PM_{2.5} (a) and NO₃⁻ (b), as well as the $\delta^{15}\text{N}$ values (c)
884 in NO₃⁻.

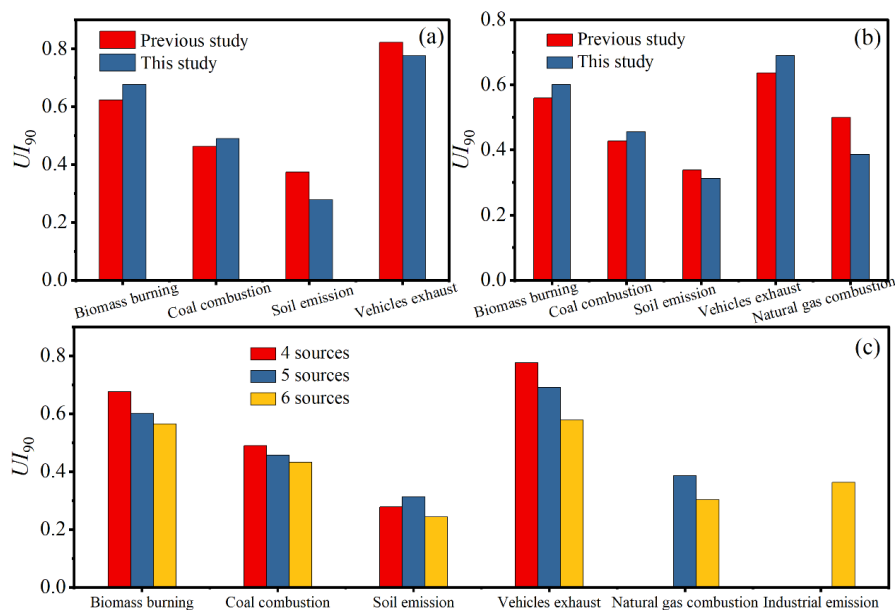


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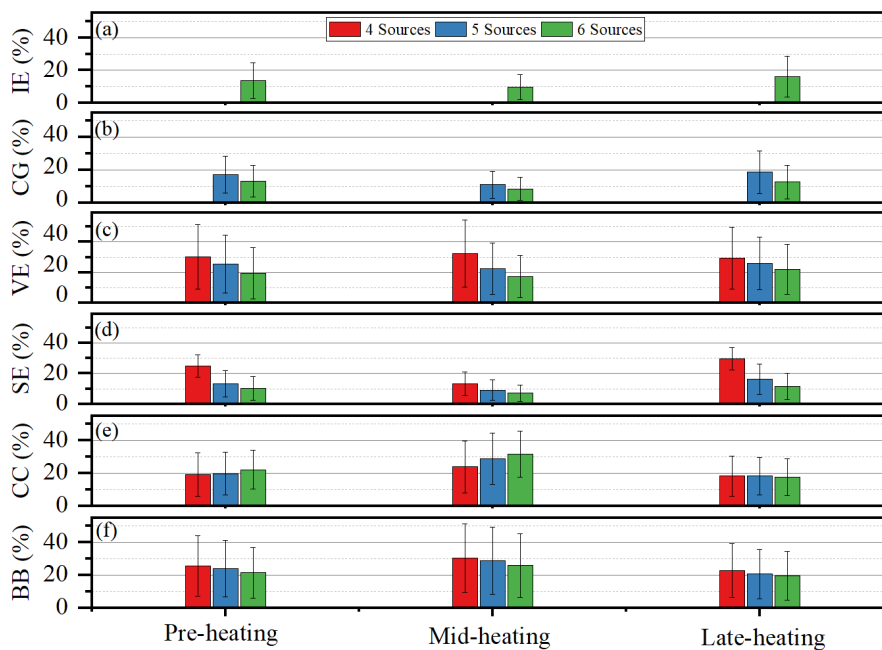
887 Figure 3 Comparison of fractional contributions of NO_3^- sources in $\text{PM}_{2.5}$ in Tianjin estimated by
 888 different $\delta^{15}\text{N}$ values of NO_x sources. The results of Scenario 1 and Scenario 3 were estimated
 889 using the $\delta^{15}\text{N}$ values of four and five NO_x sources obtained from previous studies, while the
 890 results of Scenario 1 and Scenario 3 were estimated using the $\delta^{15}\text{N}$ values of four and five NO_x
 891 sources obtained from this study. Also, SE = soil emission, CC = coal combustion, BB = biomass
 892 burning, VE = vehicle emission, and CG = combustion of natural gas.

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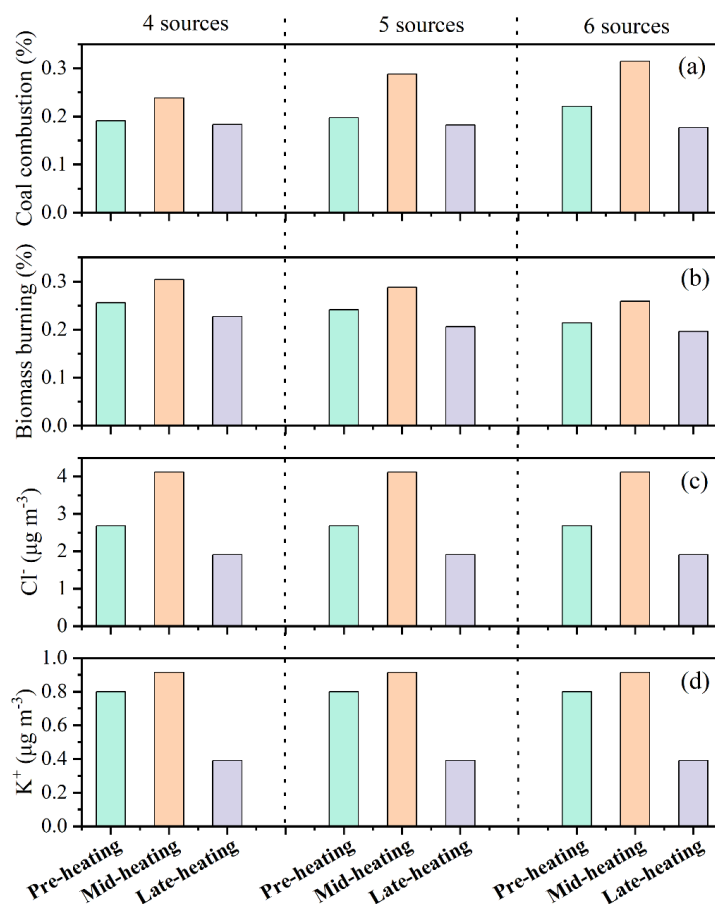
894

895 Figure 4 (a) The UI_{90} values of the contribution fraction of the four sources estimated by the
 896 isotopic fingerprint in NO_x sources obtained from previous studies and this study. (b) The UI_{90}
 897 values of the contribution fraction of the five sources estimated by the isotopic fingerprint in
 898 NO_x sources obtained from previous studies and this study. (c) The UI_{90} values of the
 899 contribution fraction of the four, five, and six sources estimated by the isotopic fingerprint in
 900 NO_x sources obtained from this study.



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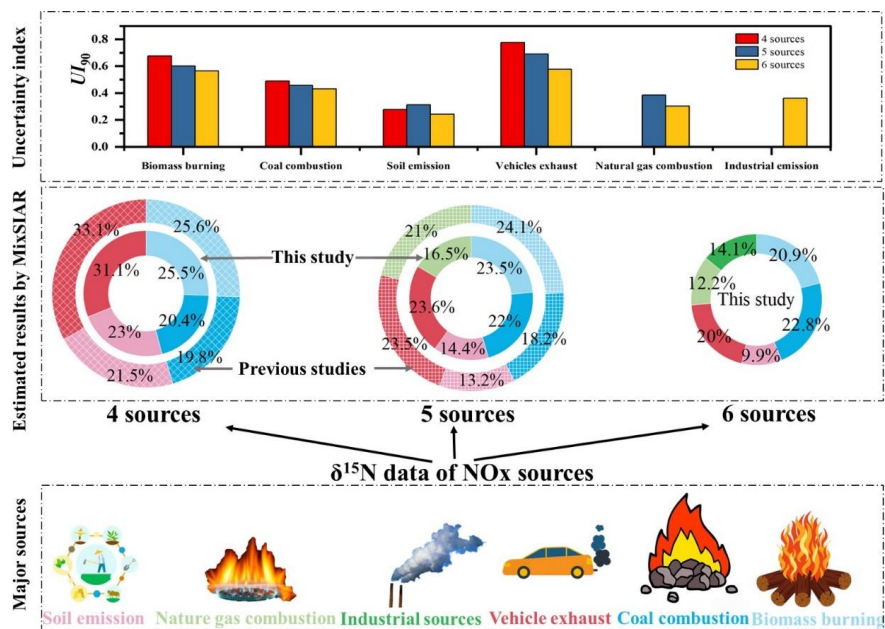
902 Figure 5 The contribution fraction of the four, five, and six sources in different periods estimated
903 by the isotopic fingerprint in NO_x sources obtained from this study. Also, SE = soil emission, CC
904 = coal combustion, BB = biomass burning, VE = vehicle emission, and CG = combustion of
905 natural gas.



906
 907 Figure 6 The version trend in contribution fractions of coal combustion (a) and biomass burning (b)
 908 in different periods estimated by the isotopic fingerprint in NO_x sources of four, five and six
 909 sources obtained from this study. (c) and (d) were the version trend in concentrations of Cl⁻ and
 910 K⁺ during different sampling periods.



911 **Graphical Abstract**



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