

# Contribution of Nitrogen Sources to Streams in Mixed-use Watershed Varies Seasonally in a Temperate Region

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## Research Article

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1 Contribution of nitrogen sources to streams in mixed-use  
2 watershed varies seasonally in a temperate region

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18

## 19 **Abstract**

20       The Beiyun river flows through a hot spot region of Beijing-Tianjin-Hebei in  
21 China that serves a majority of occupants. However, the region experiences severe  
22 nitrate pollution, posing a threat to human health due to inadequate self-purification  
23 capacity. In that context, there is an urgent need to assess nitrate levels in this region.  
24 Herein, we used  $\delta^{15}\text{N-NO}_3$ ,  $\delta^{18}\text{O-NO}_3$  isotopes analysis, and stable isotope analysis  
25 model to evaluate the nitrate source apportionment in the Beiyun river. A meta-analysis  
26 was then used to compare the potential similarity of nitrate sources among the Beiyun  
27 riverine watershed and other watersheds. Results of nitrate source apportionment  
28 revealed that nitrate originated from the manure & sewage (contribution rate: 89.6%),  
29 soil nitrogen (5.9%), and nitrogen fertilizer (3.9%) in the wet season. While in the dry  
30 season, nitrate mainly originated from manure & sewage (91.6%). Further, different  
31 land-use types exhibited distinct nitrate compositions. Nitrate in urban and suburban  
32 areas mostly was traced from manure & sewage (90.5% and 78.8%, respectively).  
33 Notably, the different nitrate contribution in the rural-urban fringe and plant-covered  
34 areas were manure & sewage (44.3% and 32.8%), soil nitrogen (26.9% and 35.7%),  
35 nitrogen fertilizer (23.5% and 29.4%), and atmospheric deposition (5.3% and 2.0%).  
36 Through a meta-analysis, we found nitrogen fertilizer, soil nitrogen, and manure &  
37 sewage as the main nitrate sources in the Beiyun riverine watershed or the other similar  
38 complex watersheds in the temperate. Thus, this study provides a scientific basis for  
39 nitrate source apportionment and nitrate preventive management in watersheds with  
40 complex land-use types in temperate regions.

## 41 **Keywords**

42 Nitrate isotope; Land-use; Source apportionment; SIAR; Beijing-Tianjin-Hebei region

## 1 Introduction

Excess loads of nitrate occur due to population growth and extensive human activities (Jiang et al., 2021), causing eutrophication of the water environment. Nitrates then get into the human body along the food chain, resulting in methemoglobinemia in newborns or stomach cancer (Zhang et al., 2018b; Li et al., 2019). Therefore, increasing interest has been geared towards controlling or preventing nitrate from ending up in the water (Hu et al., 2019). Similarly, the need for tracing the source of nitrate in the river has heightened.

Based on the current understanding, tracing the source of nitrate in the river is a topical issue. Nitrate contains stable natural isotopes of  $\delta^{15}\text{N-NO}_3$  and  $\delta^{18}\text{O-NO}_3$ , which has become a favorable premise for adopting isotope technique to identify nitrate pollution sources in the river (Jani and Toor, 2018). However, the obtained isotopic values may overlap when using dual nitrate isotopes to trace the source of nitrate (Li et al., 2019). The accuracy of traceability can be greatly improved using certain statistical methods or simulating models. For example, principal component analysis and cluster analysis could connect environmental factors (hydrochemical compositions) with social variables (e.g., population density, village percentage, or land-use type) to classify nitrate sources (Ma et al., 2015; Li et al., 2019). To obtain a more accurate nitrate source apportionment result, determining the contribution ratio of each source after source trace is necessary. Notably, stable isotope analysis in the R (SIAR) model has been proved as an excellent and flexible model in estimating the proportional contributions of nitrate sources. It not only can perform quantitative calculations between different sources (e.g., atmospheric deposition, soil nitrogen, nitrogen fertilizer, and manure & sewage), but also provide an estimate between different river locations (e.g., surface and underground water, or rivers in different areas) (Yi et al., 2017; Hu et al., 2019;

68 [Jiang et al., 2021](#)).

69 Nitrate source is closely linked with human behaviors and the characteristics of  
70 watersheds (e.g., the climate and land-use type) ([Hu et al., 2019](#); [Ma et al., 2019](#)). It is  
71 challenging to trace the source of nitrate in complex watersheds because, in such areas,  
72 the pollution sources show variability with the spatiotemporal variation ([Yi et al., 2017](#);  
73 [Hu et al., 2019](#); [Li et al., 2019](#)). Besides, it is more difficult to get reliable universal  
74 source analytic conclusions from single research. Therefore, to obtain a more general  
75 pattern of pollution sources, a meta-analysis is adopted as a quantitative analytic  
76 method ([Wang et al., 2021](#)). It can give a comparison of the target watershed with other  
77 watersheds to generate a reliable source apportionment conclusion. The Beiyun riverine  
78 is a complex watershed linked to Beijing, Tianjin, and Hebei Province, characterized  
79 by multiple land-use types and incorporated with various economic structures. Nitrate  
80 pollution inevitably rose due to the development of urbanization in the watershed and  
81 might be harmful to the inhabitants ([Zhang et al., 2020a](#)). Although tracing the nitrate  
82 source is necessary, the complex watershed factors make the entire process challenging,  
83 because most of the water in the Beiyun riverine watershed comes from the WWTPs,  
84 and the land-use type and human social activities around the river are complex ([Zhang  
85 et al., 2021](#)). Due to the large amount of WWTPs emission, the nitrate in the basin is  
86 likely to come from manure & sewage source, but at the same time, the contribution of  
87 other sources should also be considered.

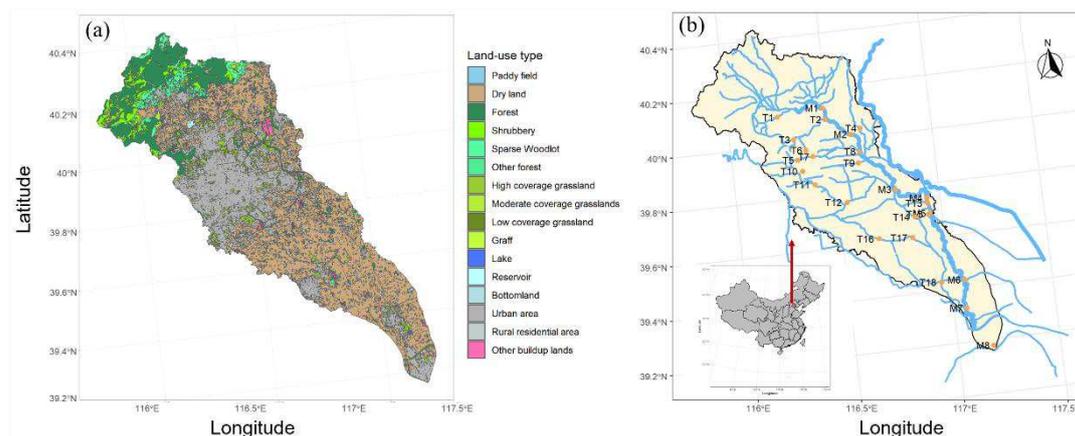
88 This present work mainly purposed to determine the source, migration, and  
89 transformation of nitrate in the Beiyun riverine watershed by analyzing the  $\delta^{15}\text{N}\text{-NO}_3$   
90 and  $\delta^{18}\text{O}\text{-NO}_3$  values. We calculated the contribution ratio of nitrate at each nitrate  
91 source using the SIAR model. Samples were collected from 26 sites located in Beijing,  
92 Tianjin, and Hebei in the mainstream and tributaries of the whole Beiyun riverine

93 watershed in the wet and dry seasons for four months. Mechanistically, we performed  
94 a meta-analysis of regions with similar geographical characteristics to the Beiyun  
95 riverine watershed and analyzed the various sources of nitrate under different climate  
96 and land-use types. Of note, the resolution of traceability had been improved through  
97 multiple statistical analyses.

## 98 **2 Materials and Methods**

### 99 **2.1 Study area and sampling design**

100 The Beiyun riverine watershed is located in a hotspot region of urbanization in the  
101 Beijing-Tianjin-Hebei region with complex land-use types and economic structures.  
102 Due to a shortage of water resources, wastewater from the WWTPs is imported to  
103 supplement the river course ([Zhang et al., 2021](#)). The whole watershed area is about  
104 6166 km<sup>2</sup>. The mountainous area and a vast forest cover the riverine source of the  
105 upstream which accounts for 16% and 8.7% of the watershed, respectively. The  
106 remaining area is plains, which consist of dry land and construction land (Fig. 1a), and  
107 the plain area is mainly composed of alluvial-diluvial fans along rivers ([Wu et al., 2020](#)).  
108 The upstream tributaries are the urban area of Beijing. The mainstream and tributaries  
109 of the downstream are dry land with villages in Tianjin and Hebei province ([Liu et al.,](#)  
110 [2018; Zhang et al., 2020](#)). Land-use data came from the Computer Network Information  
111 Center, Chinese Academy of Sciences ([www.gscloud.cn](http://www.gscloud.cn)). And the detailed hydrology  
112 and climate information are shown in SI.



**Fig.1. Study area and sampling sites in the Beiyun riverine watershed.**

A total of 26 sampling sites were selected in the Beiyun riverine watershed (Fig. 1b). They covered most of the land-use types in the humanities and natural environment. Specific information about the sampling sites is listed in Table S1. Sampling was conducted in June and September 2019 (wet season) and in November 2019 and January 2020 (dry season). We conducted grab sampling in the central part of each river.

## 2.2 Water quality analysis

The collected water samples were filtered through pre-combusted and pre-weighed glass fiber filters (Whatman, GF/F, 47 mm in diameter, GE, UK), and stored at 4°C for subsequent analyses. Measurements of pH, dissolved oxygen (DO), and electrical conductivity (EC) were taken in situ using the YSI electrode (Xylem Company, New York, USA). The NO<sub>3</sub>-N, NO<sub>2</sub>-N, NH<sub>4</sub>-N, and TN were detected using a UV-visible spectrophotometer (HACH DR 2800, USA). We conducted an ion chromatography (IC) system 90 (Dionex Corp, Sunnyvale, CA, USA) to measure the Cl<sup>-</sup>, with a precision below 5%.

Dual nitrate isotopes were tested in the Institute of Vertebrate Paleontology and Paleoanthropology, Chinese Academy of Sciences. The collection of dual nitrate isotopes was based on the ion-exchange method (Silva et al., 2000), which transferred

132 the dissolved NO<sub>3</sub>-N in water into the solid AgNO<sub>3</sub>. Then, AgNO<sub>3</sub> was analyzed for  
 133 δ<sup>15</sup>N-NO<sub>3</sub> and δ<sup>18</sup>O-NO<sub>3</sub> using a Flash 2000 HT and Fisher 253 Plus continuous flow  
 134 isotope ratio mass spectrometer (Thermo, USA), which was equipped the constant flow  
 135 device Conflo IV. The δ<sup>15</sup>N-NO<sub>3</sub> value was reported in parts per thousand or per mil  
 136 (‰) relative to the atmospheric N<sub>2</sub> and CO isotopic standard. The international isotopic  
 137 reference material USGS 25 (δ<sup>15</sup>N=-30.4‰, air N<sub>2</sub>), USGS 42 (δ<sup>18</sup>O=+8.56‰,  
 138 VSMOW), EMA P2 (δ<sup>18</sup>O=+26.88‰, VSMOW), IAEA-NO<sub>3</sub> (δ<sup>15</sup>N=+4.7‰, air N<sub>2</sub>,  
 139 δ<sup>18</sup>O=+25.6‰, VSMOW) were measured to monitor analytical accuracy. The standard  
 140 deviation for duplicate analysis was less than ±0.2‰ for δ<sup>15</sup>N-NO<sub>3</sub> and less than ±0.4‰  
 141 for δ<sup>18</sup>O-NO<sub>3</sub>. Stable isotope ratios were reported in per mil (‰) using the conventional  
 142 delta notation.

$$143 \quad \delta_{\text{sample}}(\text{‰}) = \left( \frac{R_{\text{sample}}}{R_{\text{standard}}} - 1 \right) \times 1000(\text{‰}) \quad (1)$$

144 Notably, δ<sub>sample</sub> denoted the stable isotope ratio in the water samples. R<sub>sample</sub> and  
 145 R<sub>standard</sub> denoted the ratios of <sup>15</sup>N/<sup>14</sup>N or <sup>18</sup>O/<sup>16</sup>O in water samples and the standards,  
 146 respectively.

## 147 **2.3 SIAR modeling**

148 The stable isotope analysis in the R (SIAR) model was adopted to estimate the  
 149 contributions of multiple nitrate sources in individual water samples. The equations  
 150 were as follows:

$$151 \quad X_{ij} = \sum_{k=1}^k p_k (S_{jk} + C_{jk}) + \varepsilon_{ij} \quad (2)$$

$$152 \quad S_{jk} \sim N(\mu_{jk}, \omega_{jk}^2) \quad (3)$$

$$153 \quad C_{jk} \sim N(\lambda_{jk}, \tau_{jk}^2) \quad (4)$$

$$154 \quad \varepsilon_{jk} \sim N(0, \sigma_k^2) \quad (5)$$

155 Where  $X_{ij}$  denotes the isotope value  $j$  of the water sample  $i$  ( $i=1, 2, 3, \dots, i$  and  $j =$   
156  $1, 2, 3, \dots, j$ ).  $S_{jk}$  denotes the source value  $k$  on isotope  $j$  ( $k=1, 2, 3, \dots, k$ ) and is normally  
157 distributed with mean  $\mu_{jk}$  and standard deviation  $\omega_{jk}$ .  $p_k$  denotes the proportion of source  
158  $k$ , estimated by the SIAR model.  $C_{jk}$  denotes the fractionation factor for isotope  $j$  of  
159 source  $k$  and is normally distributed with mean  $\lambda_{jk}$  and standard deviation  $\tau_{jk}$ .  $\varepsilon_{jk}$  denotes  
160 the residual error, representing additional unquantified variation between individual  
161 samples and is normally distributed with mean 0 and standard deviation  $\sigma_j$ . A more  
162 detailed description of the SIAR model can be found elsewhere (Jackson et al., 2019).

163 In this study,  $\delta^{15}\text{N-NO}_3$  and  $\delta^{18}\text{O-NO}_3$  ( $j=2$ ) values were applied to estimate the  
164 contribution of four predefined sources, including atmospheric deposition, fertilizer  
165 nitrification, soil nitrogen, and manure & sewage. The mean and standard deviation of  
166 each source was cited from literature, as indicated in Table S2 (Liu et al., 2018). The  
167 fractionation factors for all sources were set as zero ( $C_{jk}=0$ ) in the condition of the  
168 surface river (Jiang et al., 2021). Using the Kolmogorov-Smirnoff test, we examined  
169 the normality of potential source values.

## 170 **2.4 Statistical analysis**

171 One-way ANOVA analysis was used to test the differences in hydrochemical  
172 indicators between seasons and sites. Differences were considered significant for  $p$ -  
173 values less than 0.05. With cluster analysis, we used the squared Euclidean metric with  
174 Ward's method to explore the possible similar correlation of different nitrogen  
175 indicators and the land-use type among sites to sites. The raw data set was standardized  
176 to avoid incorrect clustering because different indicators had massively varying  
177 dimensions and units. The heatmap of cluster analysis revealed stronger similarity  
178 between the sites, the closer the matrix distance between them, and the bluer the color.  
179 Furthermore, for correlation analysis of different hydrochemical indicators, we used the

180 Pearson test by corrplot package in R. The correlation coefficient was reflected in  
181 different colors. Pearson test was used for all linear regressions.

182 To disentangle the impact of different factors such as the condition of temperate  
183 continental monsoon climate (CMC), complex urban and rural environment (CURE)  
184 on each nitrate source. A meta-analysis based on a linear mixed model was conducted  
185 (lme4 package in R was used to operate all the calculations). The relationship equation  
186 in linear mixed model was as follows:

187  $Result \leftarrow lmer(\ln(RR). Source \sim 'fixed\ variables\ 1 + fixed\ variables\ 2 + \dots' \sim 'fixed$   
188  $variables\ 1 \times fixed\ variables\ 2 \times \dots' + (1|random\ factor), Weights=wt. Source)$  (6)

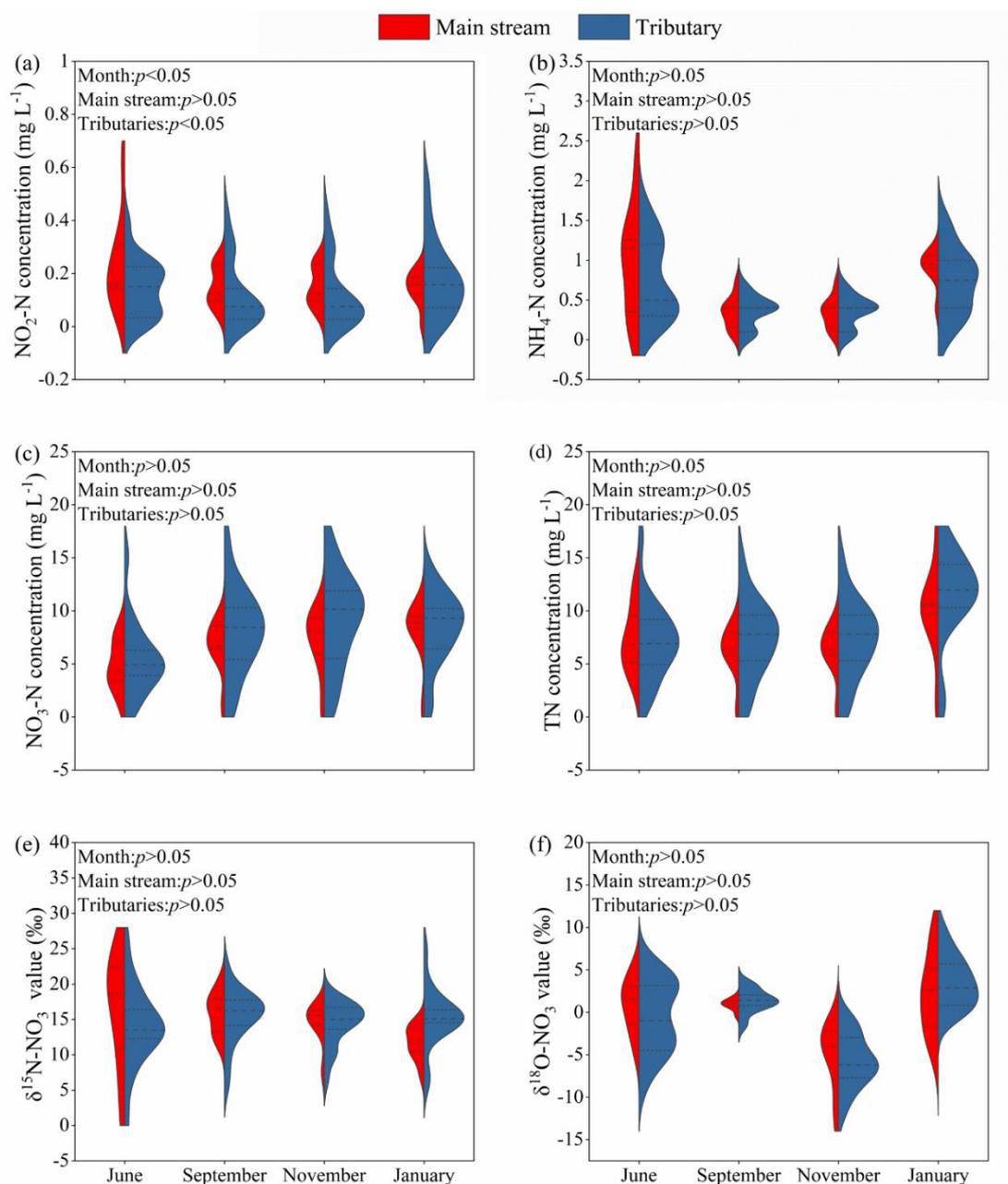
189 Where *Result* is a final effect value 'ln (RR)' of condition CMC or CURE. *ln (RR).*  
190 *Source* are each ln (RR) values of nitrogen fertilizer, soil nitrogen and manure & sewage,  
191 which calculation equation is equation (1) in SI. *fixed variables 1, 2, ...* include the type  
192 of CURE/CMC and its corresponding  $\delta^{15}N-NO_3$  value in each nitrate source. *random*  
193 *factor* is the number of samples included in this study, which can eliminate the  
194 autocorrelation within the same study. *Weights* are the weighting coefficient of the  
195 number of samples included in this study, which calculation equation is equation (2) in  
196 SI. All the statistical analyses were performed using R, version 3.6.3.

## 197 **3 Results and discussion**

### 198 **3.1 Spatiotemporal variations of nitrate**

199 The concentrations of dissolved inorganic nitrogen and nitrate isotope values at  
200 each site in the main streams (n=8) and tributaries (n=18) of the watershed are shown  
201 in Fig. 1. The average concentration of  $NO_2-N$  and  $NH_4-N$  was lower than  $0.20\ mg\ L^{-1}$   
202 and  $1.5\ mg\ L^{-1}$  (Fig. 2a, 2b) in the wet and dry seasons, respectively. However,  $NO_3-N$   
203 and TN in two seasons exceeded  $5.0\ mg\ L^{-1}$  (Fig. 2c, 2d), which was sufficient to cause  
204 eutrophication of surface water. The average concentration of  $NO_3-N$  was  $6.5\ mg\ L^{-1}$

205 and 8.3 mg L<sup>-1</sup> in the wet and dry season, respectively (Fig. 2c), which had exceeded  
206 the grade V of China surface water environmental quality standard (GB3838-2002). Of  
207 note, in all seasons, NO<sub>3</sub>-N was the main form of the nitrogen in the Beiyun river (Fig.  
208 S4). For δ<sup>15</sup>N and δ<sup>18</sup>O-NO<sub>3</sub>, the δ<sup>15</sup>N-NO<sub>3</sub> value mainly fluctuated between 0.6‰ to  
209 26‰ (Fig. 2e). The mean value in the wet season and dry season was 15.1±5.1‰ and  
210 14.4±2.9‰, respectively. And the δ<sup>18</sup>O-NO<sub>3</sub> value mainly fluctuated between -13.3‰  
211 to 9.9‰ (Fig. 2f). The mean value in the wet season and the dry season was 0.6±2.9‰  
212 and -5.6±3.3‰, respectively. Through ANOVA analysis, we revealed that from the  
213 temporal perspective, the concentration of NH<sub>4</sub>-N, NO<sub>3</sub>-N, and TN was not  
214 significantly different ( $p>0.05$ ) except NO<sub>2</sub>-N ( $p<0.05$ ), which might be attributed to  
215 the varying conversion reaction of nitrogen in different seasons (Zhang et al., 2018a).  
216 From the spatial aspect, NH<sub>4</sub>-N, NO<sub>3</sub>-N, and TN concentration were still not significant  
217 ( $p>0.05$ ), but NO<sub>2</sub>-N concentration showed significant difference ( $p<0.05$ ) in tributaries,  
218 which could be due to different pollution sources in the tributaries being more complex  
219 than the mainstream (Yi et al., 2017). And neither δ<sup>15</sup>N-NO<sub>3</sub> nor δ<sup>18</sup>O-NO<sub>3</sub> value  
220 showed a significant spatiotemporal difference in the main streams and tributaries  
221 ( $p>0.05$ ). However, it is too limited to discuss the difference of isotope values only from  
222 the main streams and the tributaries. Therefore, the discussion of different land use  
223 types was carried out in section 3.2 and 3.3.

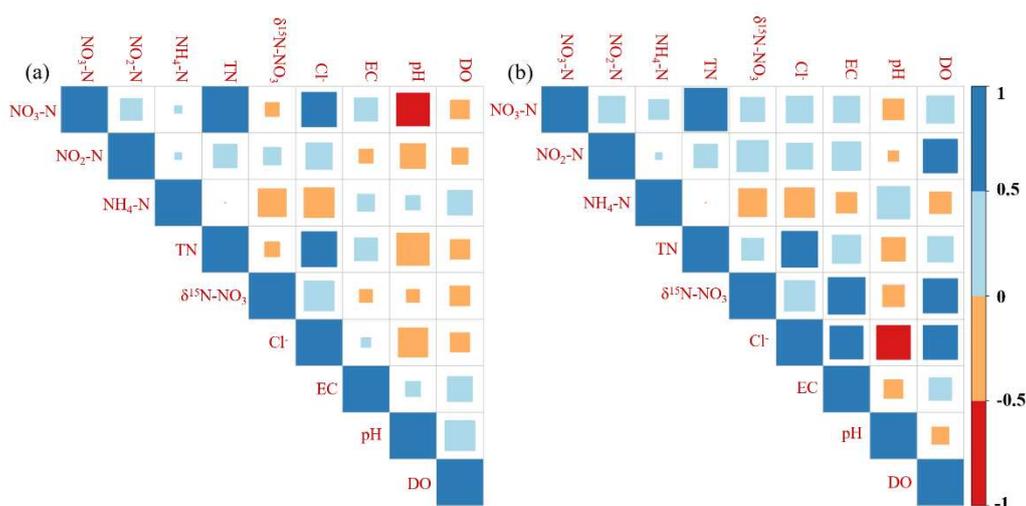


224

225 **Fig. 2. Spatiotemporal variations of inorganic nitrogen and nitrate isotopes (a) NO<sub>2</sub>-N (b)**  
 226 **NH<sub>4</sub>-N (c) NO<sub>3</sub>-N (d) TN (e) δ<sup>15</sup>N-NO<sub>3</sub> (f) δ<sup>18</sup>O-NO<sub>3</sub>. Dashed are the median line, dotted are**  
 227 **the lines of upper and lower quartiles, and the monitoring data points are concentrated in**  
 228 **the saturation region of violin plot.**

229 The Pearson correlation of nitrate isotopes and other hydrochemical indicators is  
 230 presented in Fig. 3. In the wet season (Fig. 3a), NO<sub>3</sub>-N had was positively correlated  
 231 with NO<sub>2</sub>-N, TN and Cl<sup>-</sup>, but it had a negative correlation with DO and δ<sup>15</sup>N-NO<sub>3</sub>.  
 232 Additionally, δ<sup>15</sup>N-NO<sub>3</sub> showed a positive correlation with NO<sub>2</sub>-N, whereas it showed

233 a negative correlation with  $\text{NH}_4\text{-N}$  and DO. There are two possibilities for this result:  
 234 (I) In the wet season, nitrification process transformed  $\text{NH}_4\text{-N}$  into  $\text{NO}_2\text{-N}$ . Then,  $\text{NO}_2\text{-N}$   
 235 N was oxidized into  $\text{NO}_3\text{-N}$  under the high DO condition (Liu et al., 2018). In  
 236 comparison, denitrification consumed  $\text{NO}_3\text{-N}$ , thereby increased the  $\delta^{15}\text{N-NO}_3$  value  
 237 (Yang and Toor, 2016; Bu et al., 2017). (II) For continuous anthropogenic emissions,  
 238 the amount of sewage discharged during the wet season was greater, which led to  
 239 stronger correlations between indicators. Notably,  $\text{Cl}^-$  is usually found in sewage, and  
 240 high  $\text{NO}_3\text{-N}$  concentration is usually accompanied by high  $\text{Cl}^-$  concentration (Yi et al.,  
 241 2017; Ma et al., 2019). The high correlation between  $\text{NO}_3\text{-N}$  and  $\text{Cl}^-$  in the wet season  
 242 also indicated that the amount of sewage discharged in the wet season was large. And  
 243 for a detailed discussion of  $\text{Cl}^-$  can be seen at section 3.2.1. However, in the dry season  
 244 (Fig. 3b),  $\text{NO}_3\text{-N}$  was positively correlated with DO and  $\delta^{15}\text{N-NO}_3$ . On the other hand,  
 245  $\delta^{15}\text{N-NO}_3$  was positively correlated with  $\text{NO}_2\text{-N}$  and DO, while it was negatively  
 246 correlated with  $\text{NH}_4\text{-N}$ . These results were contrary to those in the wet season, which  
 247 might be due to the lack of obvious denitrification during the dry season (Liu et al.,  
 248 2018).



249

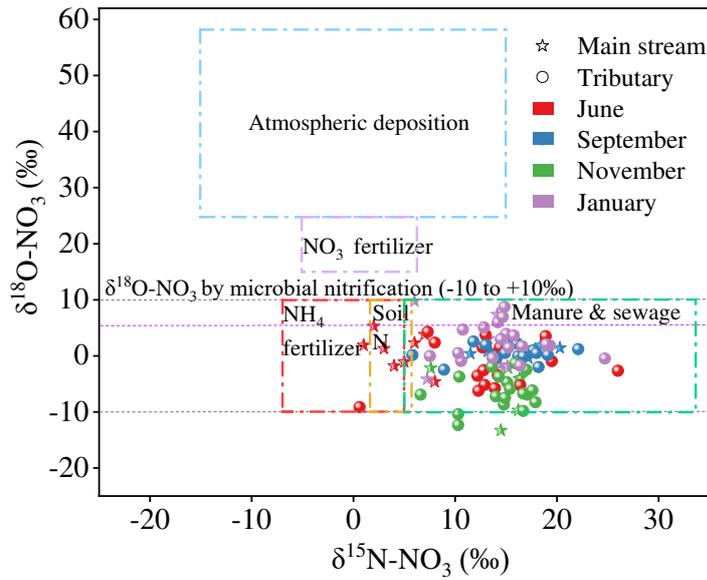
250 **Fig. 3. Correlation between nitrate isotopes and hydrochemical indicators in the (a) wet**  
 251 **season and (b) dry season.**

## 252 **3.2 Source apportionment of nitrate**

### 253 **3.2.1 Source apportionment of nitrate by isotopes and stable chemical** 254 **ion**

255 The nitrate sources in different seasons and different branches are shown in Fig. 4.  
256 Source apportionment of nitrate was obtained via isotope fractionation (Jani and Toor  
257 2018). Different nitrate sources showed different ranges of dual-isotope values (Fig. 4),  
258 including atmospheric deposition, NO<sub>3</sub>-fertilizer, NH<sub>4</sub>-fertilizer, soil nitrogen, and  
259 manure & sewage. The value of  $\delta^{15}\text{N-NO}_3$  ranged between +0.6‰ to +26.0‰ and +6.0‰  
260 to +24.7‰ in the wet season and the dry season, respectively. Besides, the value of  
261  $\delta^{18}\text{O-NO}_3$ , -8.6‰ to +5.3‰ and -13.3‰ to +9.9‰ in the wet season and the dry season,  
262 respectively. In the wet season, the nitrate originated from NH<sub>4</sub>-fertilizer, soil nitrogen,  
263 and manure & sewage, whereas they originated from manure & sewage in the dry  
264 season.

265 The fluctuating nitrate dual-isotope values were attributed to human activities and  
266 climatic changes. For instance, in the wet season, fertilizers were frequently used for  
267 agriculture in the watershed (Peters et al., 2019). A lot of nitrogen-containing soil  
268 particulates were flushed into the water aided by soil erosion (Li et al., 2019). Thus,  
269 fertilizer and soil nitrogen sources are considered to occur mainly in the wet season  
270 rather than in the dry season. In the dry season, all nitrate was traced from manure &  
271 sewage. Of note, the atmospheric deposition source did not show significant influence  
272 in both two seasons. A high  $\delta^{18}\text{O-NO}_3$  value usually appears in rainfall rather than the  
273 surface river (Hu et al., 2019), and the contribution of precipitation to surface water  
274 was, in most cases, low in the temperate watersheds. (Liu et al., 2018; Kruk et al., 2020).



275

276 **Fig. 4. Nitrate isotopic value in the Beiyun river together with typical nitrate isotope source**  
 277 **members. The theoretical  $\delta^{18}\text{O-NO}_3$  value of nitrification was in the range of  $-10\text{‰}$  to  $5.7\text{‰}$**   
 278 **(Li et al., 2014a; Liu et al., 2018). The various nitrate isotope sources in the plot are adapted**  
 279 **from previous studies (Shin et al., 2013; Jani and Toor, 2018).**

280 Furthermore, the microbial reaction contributed to the fluctuation of nitrate dual-  
 281 isotope values. Nitrification and denitrification were essential in the occurrence and  
 282 characteristics of the nitrate in the river ecosystem (Yang and Toor, 2016). In general,  
 283 microorganisms preferentially generate  $\delta^{14}\text{N-NO}_3$  in the nitrification process, this  
 284 explains why the measured value of  $\delta^{15}\text{N-NO}_3$  was low (Zhang et al., 2020b).  $\delta^{18}\text{O-}$   
 285  $\text{NO}_3$  in the nitrification process could be described by equation (7) (Li et al., 2019;  
 286 Fadhullah et al., 2020). Based on previous calculations (Li et al., 2014a; Liu et al., 2018).  
 287 the theoretical  $\delta^{18}\text{O-NO}_3$  value of nitrification in the Beiyun river was  $-10\text{‰}$  to  $5.7\text{‰}$   
 288 (Fig. 4), in which most of the sampling sites in the two seasons were located in this  
 289 range.

290 
$$\delta^{18}\text{O-NO}_3(\text{nitrification}) = \frac{1}{3} \delta^{18}\text{O-O}_2 + \frac{2}{3} \delta^{18}\text{O-H}_2\text{O} \quad (7)$$

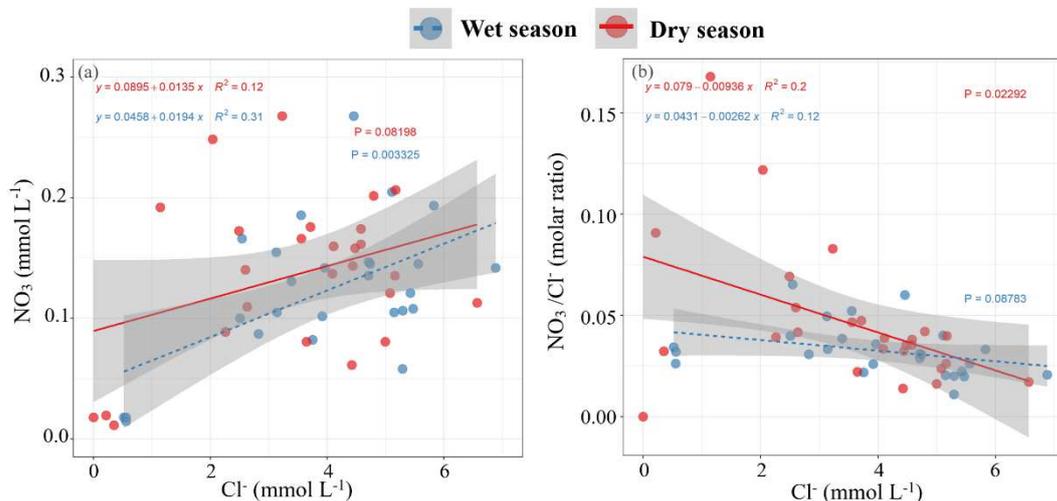
291 During denitrification, microorganisms eliminate nitrate and use  $\delta^{14}\text{N-NO}_3$  and

292  $\delta^{16}\text{O-NO}_3$  preferentially under the hypoxic environment (Aechana et al., 2018).  
293 Therefore, denitrification would increase  $\delta^{15}\text{N-NO}_3$  and  $\delta^{18}\text{O-NO}_3$  value at the same  
294 time. Notably, the theoretical denitrification ratio between  $\delta^{15}\text{N-NO}_3$  and  $\delta^{18}\text{O-NO}_3$  is  
295 1:1.3 to 1:2 (Divers et al., 2014). However, the denitrification in the Beiyun river was  
296 not evident because the DO concentration in the river was beyond  $2.0 \text{ mg L}^{-1}$  (Table S4)  
297 and the ratio did not meet the theoretical denitrification ratio (Fig. S4). But some weak  
298 denitrification potentially occurred in September since  $\text{NO}_3\text{-N}$  and  $\delta^{15}\text{N-NO}_3$  showed a  
299 negative correlation (Fig. S5). This denitrification might occur in submerged subsoil  
300 due to the rains in September, and in the riparian or hyporheic zone in the tributaries  
301 (Yi et al., 2017). In addition, the Beiyun river mainly received effluent from wastewater  
302 treatment plants (Zhang et al., 2020a), and the inflow of external sewage masked the  
303 signal of biochemical processes. Overall, a majority of the nitrate in Beiyun River  
304 originated from manure & sewage especially sewage.

305 Chloride is a stable ideal indicator which can be utilized to evaluate the extra  
306 sewage input and biogeochemistry. Its concentration varies only when the surface water  
307 is mixed with other sources of water (Li et al., 2019). Of note, when  $\text{Cl}^-$  positively  
308 correlates with  $\text{NO}_3\text{-N}$ , the  $\text{Cl}^-$  input is mainly influenced by the anthropogenic effect  
309 (Yi et al., 2017). The relationship between  $\text{Cl}^-$  and  $\text{NO}_3\text{-N}$  is highlighted in Fig. 5.  
310 During the wet season, the concentration of  $\text{Cl}^-$  and  $\text{NO}_3\text{-N}$  depicted a positive  
311 correlation ( $R^2=0.31$ , Fig. 5a). However, in the dry season, a weaker positive correlation  
312 was reported compared to the wet season ( $R^2=0.12$ , Fig. 5a). Beiyun riverine watershed  
313 was not characterized by typical sediment erosion, which had an implication that the  
314  $\text{Cl}^-$  primarily came from sewage, particularly during the wet season.

315 Manure & sewage source are, in most cases, characterized by high  $\text{Cl}^-$   
316 concentration and low  $\text{NO}_3/\text{Cl}^-$  molar ratio (Sui et al., 2020). Herein, the ratio of

317 NO<sub>3</sub>/Cl<sup>-</sup> in the wet season was lower than that in the dry season (Fig. 5b and S6.), which  
 318 implied that the manure & sewage mainly came from the wet season. Moreover, the  
 319 molar ratio of NO<sub>3</sub>/Cl<sup>-</sup> potentially reduced as the denitrification eliminated nitrates (Lu  
 320 et al., 2015) or the nutrients in the water are absorbed by plants (Liu et al., 2019). As  
 321 highlighted in Fig. S6, weak denitrification occurred in the wet season. Importantly, the  
 322 concentration of the Cl<sup>-</sup> was negatively correlated with NO<sub>3</sub>/Cl<sup>-</sup> molar ratio in both two  
 323 seasons, which implicated that the wastewater majorly originated from daily residential  
 324 sewage discharge (Zhao et al., 2019). Also, pollution was more severe in the dry season  
 325 since this correlation was significant.



326

327 **Fig. 5. Cross-plot of (a) Cl<sup>-</sup> and NO<sub>3</sub> molarity. (b) Cl<sup>-</sup> molarity and NO<sub>3</sub>/Cl<sup>-</sup> molar ratio.**

### 328 3.2.2 Source apportionment through statistical analysis

329 As mentioned above, the main source of nitrate pollution in the Beiyun riverine  
 330 watershed was manure & sewage, but there was still a problem, which was the  
 331 insignificant difference in nitrate isotope values between the main stream and the  
 332 tributary caused the unclear source of pollution in manure & sewage. To obtain a more  
 333 precise treatment plan, we need to clarify where the manure or sewage in the watershed  
 334 came from. Therefore, we used cluster analysis combined with hydrochemical  
 335 indicators and land-use type to explore the specific source of manure & sewage. In the

336 wet season, all sites were classified into 6 clusters (Fig. 6a and S7a.), including cluster  
337 I: M6, T10, T18 ( $\text{NO}_3\text{-N}=4.6\pm 0.7 \text{ mg L}^{-1}$ ), cluster II: M8, T5, T7 ( $\text{NO}_3\text{-N}=1.1\pm 0.1 \text{ mg}$   
338  $\text{L}^{-1}$ ), cluster III: M1, M2, T2, T8 ( $\text{NO}_3\text{-N}=5.9\pm 0.9 \text{ mg L}^{-1}$ ), cluster IV: T6, T11, T17  
339 ( $\text{NO}_3\text{-N}=10.1\pm 4.1 \text{ mg L}^{-1}$ ), cluster V: M7, T3, T4, T9, T12 ( $\text{NO}_3\text{-N}=7.9\pm 2.3 \text{ mg L}^{-1}$ )  
340 and cluster VI: M3-M5, T1, T13-T16 ( $\text{NO}_3\text{-N}=7.1\pm 1.2 \text{ mg L}^{-1}$ ). The sites in clusters IV  
341 and V contributed the most amount of nitrate. These sites were nearly located in the  
342 rural-urban fringe areas (land-use proportion: 62.5%), consisting of the villages and  
343 counties away from the urban center. Besides, they had a relatively large population  
344 following a report by field sampling and the interpretation of China Population and  
345 Employment Statistics Yearbook, 2019 (data.cnki.net). These sites were characterized  
346 by serious nitrate pollution because of the daily life practices of the inhabitants,  
347 agriculture, and livestock farming (especially in the downstream in Tianjin-Hebei  
348 region) during the wet season (Peters et al., 2019), low efficiency of wastewater  
349 treatment, and the lack of riverine management (Yi et al., 2017). Therefore, manure &  
350 sewage in these clusters were almost manure from the livestock farming in the wet  
351 season. Cluster I and II contributed the least amount of nitrate, and these sites were  
352 located in the urban center in the Beijing and Tianjin (urban type land-use proportion:  
353 66.7%). In these areas, wastewater treatment plants were highly efficient (Xian et al.,  
354 2016), as well as the management practices, such as channel cleanout, which was  
355 wholesome. Therefore, manure & sewage in these clusters were almost sewage from  
356 WWTPs emissions in the wet season. Sites in cluster VI and III were mainly in the  
357 suburban areas within the dry land (suburban type land-use proportion: 66.7%). These  
358 clusters contributed a moderate amount of nitrate and were located in an undeveloped  
359 region and they were associated with the complex land-use type. However, from the  
360 perspective of individual land-use types, most of the upstream cluster III is close to the

361 urban area of Beijing, while the downstream cluster VI is mostly in the center of the  
362 suburban areas. Therefore, manure & sewage in cluster III were almost sewage but in  
363 cluster III were almost manure in the wet season. Based on the heatmap (Fig. S7c.),  
364 most of the sites in the suburban area, urban area, and rural-urban fringe did not show  
365 apparent similarities, which means nitrate sources were complex in the wet season (Hu  
366 et al., 2019).

367 Similar to the wet season, the sites in the dry season were classified into 4 clusters  
368 (Fig. 6b and S7b.), including cluster I: M8, T5, T7 ( $\text{NO}_3\text{-N}=1.0\pm 0.2 \text{ mg L}^{-1}$ ), cluster II:  
369 M1, M3, T3, T4, T6, T8-T12 ( $\text{NO}_3\text{-N}=10.8\pm 1.8 \text{ mg L}^{-1}$ ), cluster III: T1, T13, T14, T17  
370 ( $\text{NO}_3\text{-N}=7.0\pm 1.8 \text{ mg L}^{-1}$ ), and cluster IV: M2, M4-M7, T2, T15, T16, T18 ( $\text{NO}_3\text{-}$   
371  $\text{N}=8.6\pm 1.1 \text{ mg L}^{-1}$ ). Sites in cluster II contributed the most amount of nitrate, which  
372 were located in the urban fringes (land-use proportion: 60.0%). Due to the daily life in  
373 the dry season, manure & sewage in this cluster was almost sewage from residential  
374 and WWTPs emissions in the dry season. Cluster III and IV ranked second after Cluster  
375 II, and these sites were mainly located in the suburban areas (land-use proportion:  
376 69.2%). And manure & sewage in this cluster was almost sewage from residential  
377 emissions because the livestock farming behavior became less frequent than the wet  
378 season. Cluster I provided the least amount of nitrate, and these sites were located in  
379 the urban center (land-use proportion: 100%) thus nitrate came from the sewage in  
380 WWTPs emissions. Based on the heatmap (Fig. S7d.), all sites exhibited significant  
381 similarity except for sites in the urban areas (T5, T7, and M8 in the urban center). In  
382 the dry season, the flow of the river was lower than in the wet season (Peters et al.,  
383 2019); also human activities were simplex. Therefore, pollution was severe in the dry  
384 season (Liu et al., 2018), and most sites had a similar pollution source which was  
385 sewage from residential emissions.

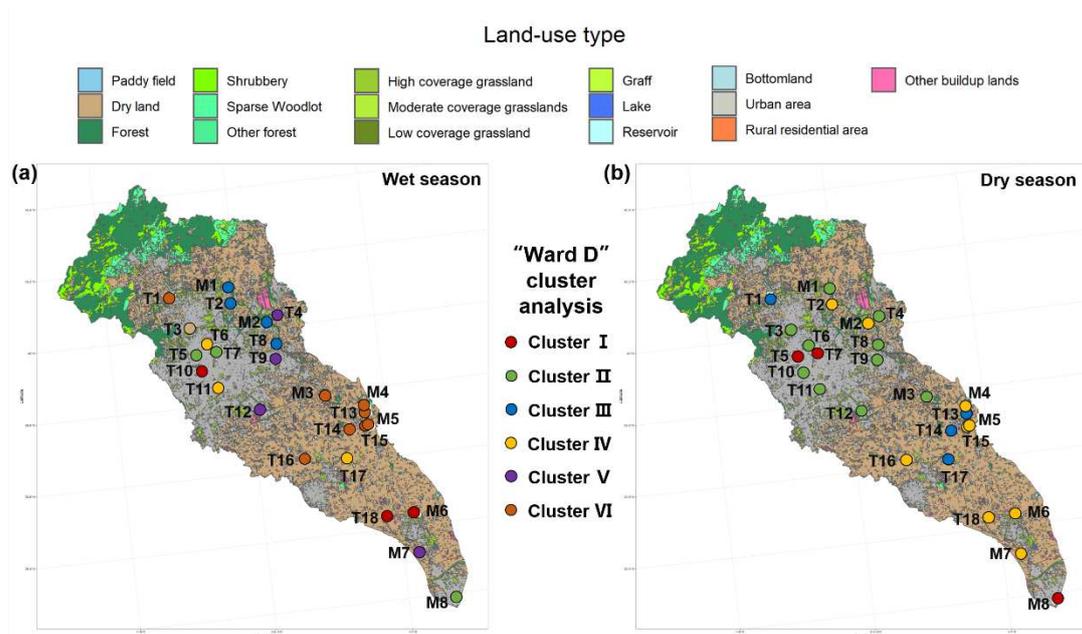
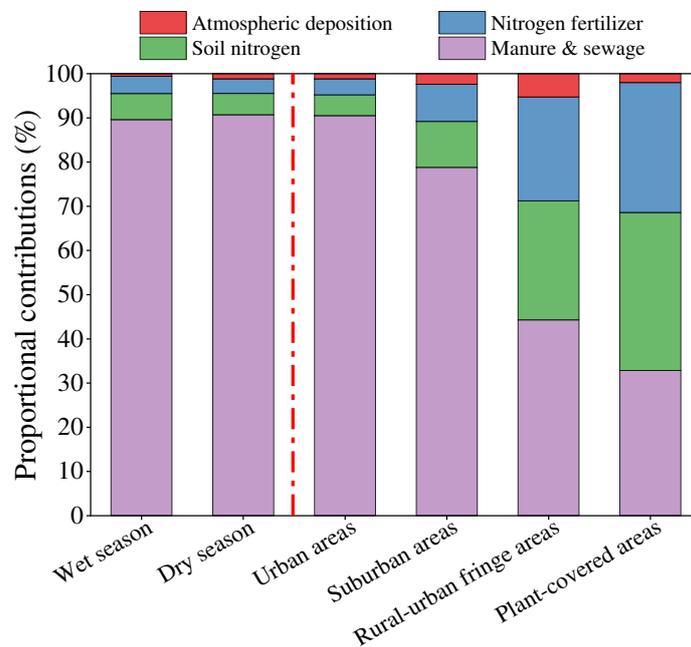


Fig. 6. Cluster map in the (a) wet season and (b) dry season.

### 3.3 Contributive proportion of different nitrate sources

The contributions of each nitrate source in all seasons were estimated via the SIAR model (Fig. 7). In the wet season, manure & sewage contributed most of the riverine nitrate, and the mean probability estimate (MPE) was 89.6%. They were followed closely by soil nitrogen (5.9%), nitrogen fertilizer (4.9%), and atmospheric deposition (0.6%). Compared to the wet season, the contribution of manure & sewage source increased slightly (MPE from 89.6% to 91.6%) in the dry season. Besides, the contributions of nitrogen fertilizer and soil nitrogen decreased (4.9% to 3.3%, and 5.9% to 3.9%, respectively), indicating that fertilizer usage and soil erosion reduced due to the low temperature and less amount of rainfall (Peters et al., 2019). The SIAR model showed that the contribution of manure & sewage was dominant. Also, it proved that daily human activities were the primary source of nitrate. However, the contributions of soil nitrogen and nitrogen fertilizer were relatively lower. Of note, the contribution of atmospheric deposition source was the least in all the seasons, which was consistent with other watersheds (Kruk et al., 2020). In this study, the sampling events occurred

403 in one year. The nitrate source may be associated with the dynamic changes which are  
 404 unexplainable using a one-year sampling. Moreover, climatic conditions, human  
 405 activities, and nitrate concentrations in water samples differed between the wet and dry  
 406 seasons (Yi et al., 2017). Therefore, long-term observation or multielement sampling  
 407 would better identify different contributions and demonstrate the dynamic change  
 408 process of nitrate sources in the watershed (Hu et al., 2019). In this study, we explained  
 409 this dynamic change process from the aspect of different land-use types.



410  
 411 **Fig. 7. The contribution rates of four potential nitrate sources at (a) different sampling**  
 412 **periods and (b) different land-use types.**

413 To distinguish the nitrate sources in different land-use areas, we classified the  
 414 respective watershed into four categories: Urban areas, suburban areas, the rural-urban  
 415 fringe areas, and plant-covered areas. The contributions of each nitrate source in the  
 416 four land-use types are presented in Fig. 7. Different regions showed different source  
 417 apportionment patterns. In the urban areas, manure & sewage contributed the most to  
 418 the nitrate sources (90.5%), followed by soil nitrogen (4.7%), nitrogen fertilizer (3.6%),

419 and atmospheric deposition (1.2%). Urban areas probably had intensive human  
420 activities, thus, the proportion of manure & sewage discharged was relatively high  
421 (Archana et al., 2018). A few investigations showed that the leaking of sewers and the  
422 rainfall-runoff were also dominantly linked to urban nitrate pollution (Divers et al.,  
423 2013; Hale et al., 2014). This pollution usually resulted from the roof, road, and  
424 greenbelt in a dead-end of urban pollution prevention and control. Therefore, except for  
425 the control of direct sewage discharge, the management of these dead-end should be  
426 given more attention in future assessments. In the suburban areas, the highest nitrate  
427 contributor was manure & sewage (78.8%), followed by soil nitrogen (10.4%), nitrogen  
428 fertilizer (8.4%), and atmospheric deposition (2.4%). The high manure & sewage ratio  
429 could be attributed to a large amount of incomplete treatment wastewater released into  
430 the river, revealing poor riverine management in suburban areas (Yi et al., 2017). In  
431 rural-urban fringe areas, manure & sewage contributed the most of nitrate (44.3%), the  
432 MPE of soil nitrogen and nitrogen fertilizer was 26.9% and 23.5%, respectively. In  
433 these areas, the population composition and human activities were complex (Yi et al.,  
434 2017). Also, the daily life of the residents contributed to most of the nitrate. The lack  
435 of proper environmental management may be associated with soil erosion (Lu et al.,  
436 2015) and irregular use of fertilizers (Li et al., 2019). The plant-covered areas highly  
437 contributed to soil nitrogen among the four land-use types (35.7%), followed by manure  
438 & sewage (32.8%), nitrogen fertilizer (29.4%), and atmospheric deposition (2.0%). The  
439 ratio of fertilizer and sewage inputs due to human activities were limited in these areas  
440 (Lu et al., 2015). The above results showed that different land-use types are nitrate  
441 sources. Among them, nitrate in densely populated areas mainly originated from  
442 sewage. In the untraversed areas such as plant-covered areas, nitrate was mainly derived  
443 from soil nitrogen. This finding provides a basis for nitrate control in the complex

444 watershed.

### 445 **3.4 Comparison of the nitrate source with other twenty-five** 446 **similar watersheds**

447 The nitrate source would show dynamic variation with the changing human  
448 activities and time sequences. The difference in the land-use structure was associated  
449 with different development levels and climate change, as a result, the nitrate source  
450 varied among different watersheds. Therefore, the quantitative comparison results  
451 among watersheds could be used as data support to predict the nitrate source. Notably,  
452 there was almost no  $\delta^{15}\text{N}\text{-NO}_3$  in the range of atmospheric deposition through the  
453 literature screening in the meta-analysis. Therefore, the final result was obtained based  
454 on the source of nitrogen fertilizer, soil nitrogen, and manure, and sewage. The contour-  
455 enhanced funnel chart demonstrated that except for atmospheric deposition, the  
456 literature reports on three sources were not associated with publication bias (Fig. S3).

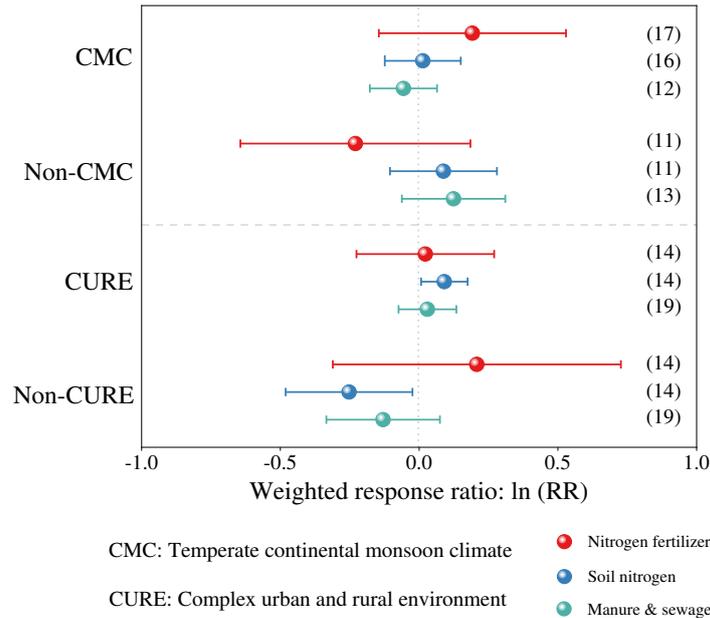
457 The  $\ln(\text{RR})$  values at different climate and land-use types are shown in Fig. 8. The  
458  $\ln(\text{RR})$  values of nitrogen fertilizer, soil nitrogen and manure, and sewage in the  
459 temperate continental monsoon climate were 0.19, 0.01, and -0.06, respectively. At the  
460 same time, the values of these sources in the non-temperate continental monsoon  
461 climate (close to subtropical monsoon climate) were -0.23, 0.09, and 0.12, respectively.  
462 The positive  $\ln(\text{RR})$  value indicated that the corresponding source was the main  
463 contributing source of nitrate and vice versa. For the nitrogen fertilizer source, the  
464  $\ln(\text{RR})$  value in the temperate continental monsoon climate was 0.42, which was higher  
465 than that of the non-temperate continental monsoon climate. Thus, we concluded that  
466 nitrogen fertilizer was the major source in the temperate continental monsoon climate.  
467 The watersheds in a temperate continental monsoon climate are more beneficial in  
468 developing dryland agriculture. For instance, nitrogen fertilizer was the primary nitrate

469 source of nitrate due to the use of nitrogen fertilizer in the North China and West Canada  
470 (Bu et al., 2017; Peters et al., 2019; Kruk et al., 2020). While in South China and North  
471 Malaysia (Hu et al., 2019; Fadhullah et al., 2020), nitrogen fertilizer was not the primary  
472 source of nitrate. For the soil nitrogen source, the  $\ln(\text{RR})$  value in the non-temperate  
473 continental monsoon climate was 0.08, higher than that of the temperate continental  
474 monsoon climate, an implication that soil nitrogen was the primary source in the non-  
475 temperate continental monsoon climate. The subtropical monsoon climate experience  
476 adequate rainfall, which might accelerate soil erosion. At the same time, paddy  
477 agriculture was an important reason that contributes to soil erosion in this climate type.  
478 This observation concurred with the results from the Xijiang River in China (Li et al.,  
479 2019) and the peninsular in Malaysia (Fadhullah et al., 2020), which contributed to  
480 more than 35% among the four sources. Moreover, the  $\ln(\text{RR})$  value of manure &  
481 sewage in the non-temperate continental monsoon climate was 0.18, higher than that of  
482 the temperate continental monsoon climate. This implicated manure & sewage as the  
483 primary source in the non-temperate continental monsoon climate. Of note, because of  
484 multiple population composition and high-density population distribution (Fig. S8),  
485 human activities in non-temperate continental monsoon climate were more complicated  
486 than temperate continental monsoon climate. A large amount of artificial sewage was  
487 also applied in this area. Previous studies showed that the contribution of manure &  
488 sewage to nitrate source could reach up to 90% in the non-temperate continental  
489 monsoon climate and densely populated area (e.g., Taihu Lake watershed, Panxi river)  
490 (Zhang et al., 2015; Yi et al., 2017).

491 In addition, the land-use type is an essential factor affecting the source of nitrate  
492 (Lu et al., 2015; Hu et al., 2019a). The  $\ln(\text{RR})$  values of nitrogen fertilizer, soil nitrogen  
493 and manure, and sewage in the complex urban and rural areas were 0.02, 0.09, and 0.03,

494 respectively. While the values of these sources in the non-complex urban and rural  
495 environment (almost agricultural land) were 0.21, -0.25, and -0.13, respectively. For  
496 the nitrogen fertilizer source, the  $\ln(\text{RR})$  value in the non-complex urban and rural areas  
497 was 0.19, higher than that of the complex urban and rural areas. Thus, these two land-  
498 use types, nitrogen fertilizer was the primary source in non-complex urban and rural  
499 areas due to advanced agricultural systems in these areas (Li et al., 2014b; Peters et al.,  
500 2019). For the soil nitrogen source, the  $\ln(\text{RR})$  value in the complex urban and rural  
501 areas was 0.34, higher than that of the non-complex urban and rural areas. Therefore,  
502 in these two land-use types, soil nitrogen was the primary source in the complex urban  
503 and rural areas. In the sophisticated urban and rural areas, soil erosion was caused by  
504 agriculture irrigation activities (Yi et al., 2017), urban rainwater runoff (Yang and Toor,  
505 2016), and sewer leaks (Divers et al., 2014) at the same time. The single agricultural  
506 land contributed less to nitrate from soil nitrogen. Soil nitrogen accounted for only 25%  
507 of the four sources in a recent study on the Huaihe River (Ma et al., 2019).

508 Moreover, the  $\ln(\text{RR})$  value of manure & sewage in the complex urban and rural  
509 areas was 0.16 higher than that of the non-complex urban and rural areas. Thus, we  
510 suggested that in these two land-use types, manure & sewage was the primary source  
511 in the complex urban and rural areas. Complex urban and rural areas had complex  
512 population composition and intensive population density, which led to the most  
513 artificial pollution. Moreover, manure & sewage in these areas could generally  
514 contribute more than 80% of nitrate (Yi et al., 2017; Liu et al., 2018). According to the  
515 comparison results among the Beiyun riverine watershed and other similar watersheds,  
516 nitrate mainly was derived from nitrogen fertilizer and soil nitrogen. Similarly, the  
517 amount of nitrate in manure & sewage continuously rose with the progression of future  
518 urbanization and the increase in human activities.



519

520 **Fig. 8. The weighted response ratios  $\ln(\text{RR})$  of climate type, land-use type, and different**  
 521 **sources of nitrate. The solid dots are the mean value of  $\ln(\text{RR})$ , the straight line is 95%**  
 522 **confidence intervals, and the sample size is in parentheses.**

## 523 4 Conclusion

524 This study adopted the nitrate dual isotopes technique integrated with  
 525 hydrochemical index and statistical methods to trace the nitrate in the Beiyun riverine  
 526 watershed. Based on the findings, nitrate was revealed to be the main form of nitrogen  
 527 pollution in the watershed, and it was more massive in the dry season. For the nitrate  
 528 source apportionment, nitrate in the wet season mainly originated from the rural-urban  
 529 fringe area in the Tianjin-Hebei region. On the contrary, nitrate came from the rural-  
 530 urban fringe area in the Beijing-Hebei region in the dry season. At the same time, the  
 531 SIAR model showed that manure & sewage were the primary sources in both two  
 532 seasons, reaching 89.6% and 91.6%. Moreover, for different land-use types, manure &  
 533 sewage was recorded at 90.5%, 78.8%, 44.3%, and 32.8% in urban areas, suburban  
 534 areas, the rural-urban fringe areas, and plant-covered areas, respectively. Through a  
 535 meta-analysis, the Beiyun riverine watershed, located in a region with a temperate

536 continental monsoon climate, was characterized by complex land-use types. Nitrate  
537 originated not only from human sewage but also from soil nitrogen and nitrogen  
538 fertilizer, especially NH<sub>4</sub>-fertilizer in the big picture. This study provides insights into  
539 the prevention and control of nitrate in the Beijing-Tianjin-Hebei region. In the future,  
540 taking into accounting the spatiotemporal variations of nitrate sources and the  
541 relationship with the isotopic composition of nitrate, watershed restoration and  
542 management strategies need to consider the potential for major changes in the source  
543 due to changes in climate and hydrological conditions. As a long-term strategy, it is  
544 possible to regulate the agriculture and livestock farming in downstream of the  
545 watershed, to improve the nitrogen fixation capacity of the soil on both sides of the  
546 river, and appropriately reduce the direct discharge of WWTPs to the river. Such an  
547 approach will also of great significance to improve the denitrification potential of  
548 nitrate in the watershed. However, in this study, some small-micro water bodies had  
549 dried up for a long time, so the source of them had not been traced. Therefore, it is  
550 recommended that these water bodies should be considered for nitrate trace or water  
551 source investigation in future assessments.

## 552 **Ethical Approval**

553 Not Applicable

## 554 **Consent to Participate**

555 Not Applicable

## 556 **Consent to Publish**

557 Not Applicable

## 558 **Authors Contributions**

559 Zuhong Lin: Experiment, Software, Writing- Original draft preparation.

560 Junchi Liu: Experiment, Data curation, Editing.  
561 Yong Xiao: Funding acquisition, Supervision  
562 Chaojie Yu: Experiment, Software  
563 Jinlan Zhang: Experiment  
564 Tingting Zhang: Funding acquisition, Writing-review & editing.

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## 569 **Competing Interests**

570 The authors declare that they have no competing interests

## 571 **Availability of data and materials**

572 All data is provided in full in the results section of this manuscript.

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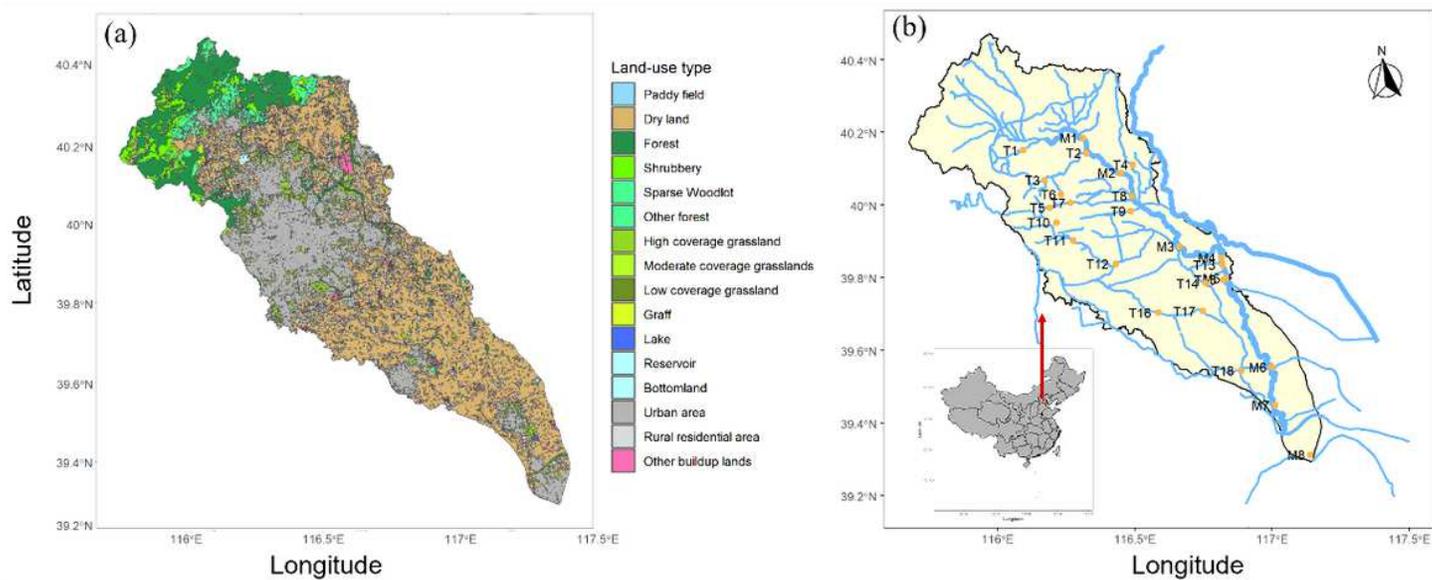
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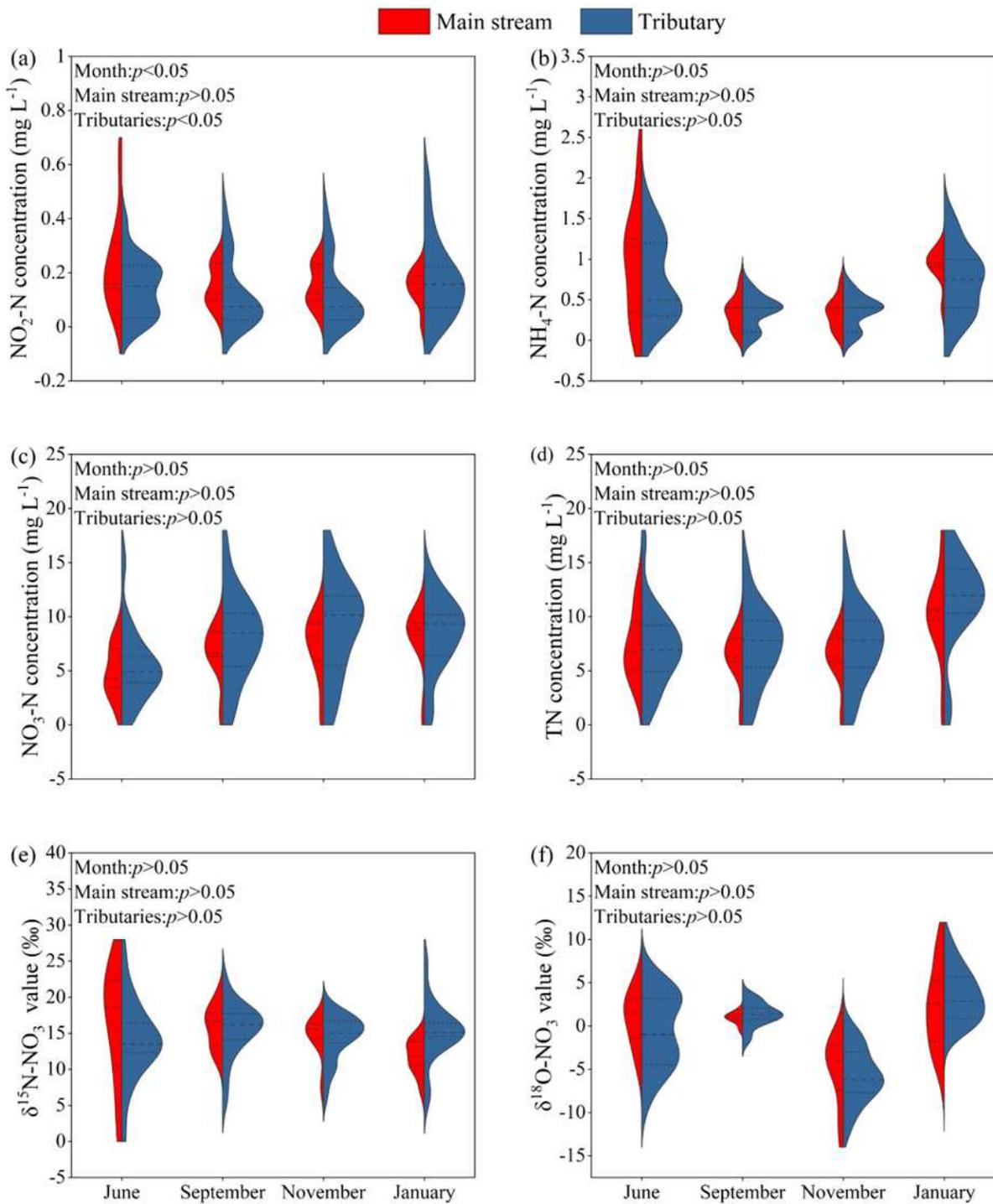
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# Figures



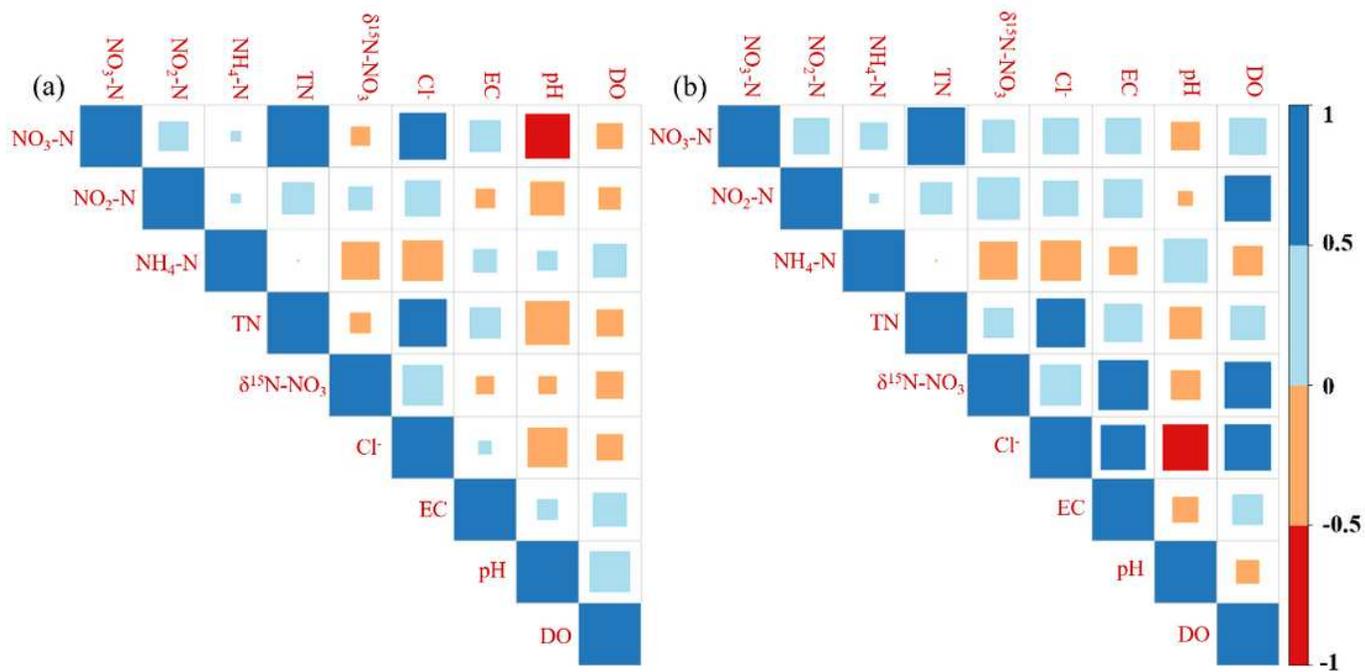
**Figure 1**

Study area and sampling sites in the Beiyun riverine watershed. Note: The designations employed and the presentation of the material on this map do not imply the expression of any opinion whatsoever on the part of Research Square concerning the legal status of any country, territory, city or area or of its authorities, or concerning the delimitation of its frontiers or boundaries. This map has been provided by the authors.



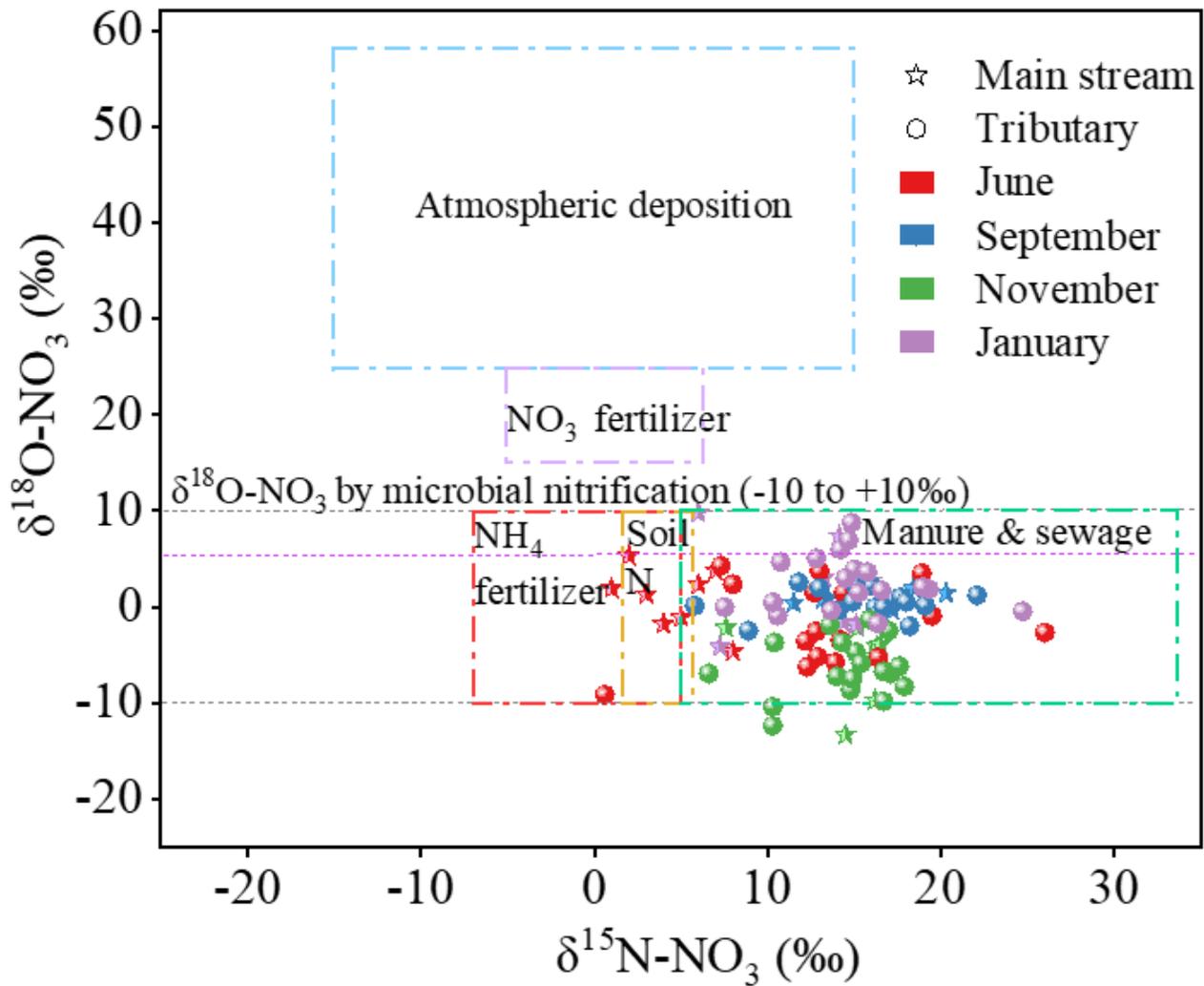
**Figure 2**

Spatiotemporal variations of inorganic nitrogen and nitrate isotopes (a) NO<sub>2</sub>-N (b) NH<sub>4</sub>-N (c) NO<sub>3</sub>-N (d) TN (e)  $\delta^{15}\text{N}-\text{NO}_3$  (f)  $\delta^{18}\text{O}-\text{NO}_3$ . Dashed are the median line, dotted are the lines of upper and lower quartiles, and the monitoring data points are concentrated in the saturation region of violin plot.



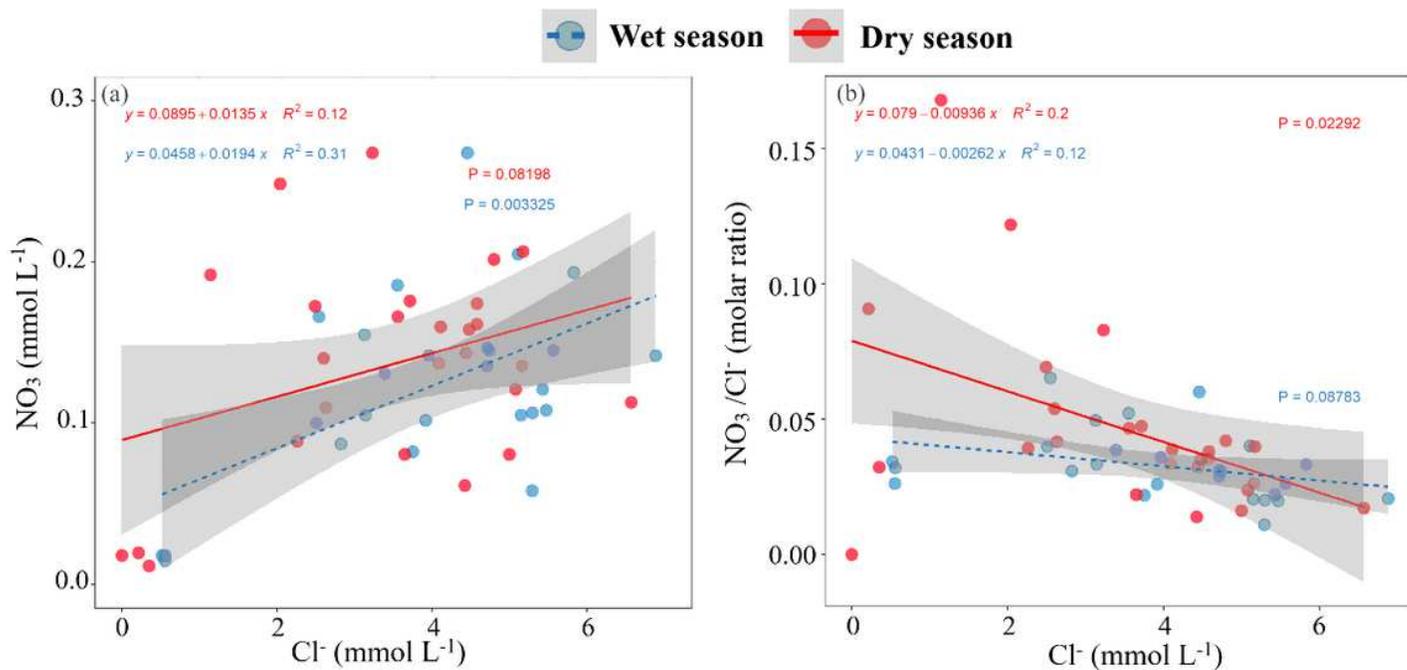
**Figure 3**

Correlation between nitrate isotopes and hydrochemical indicators in the (a) wet season and (b) dry season.



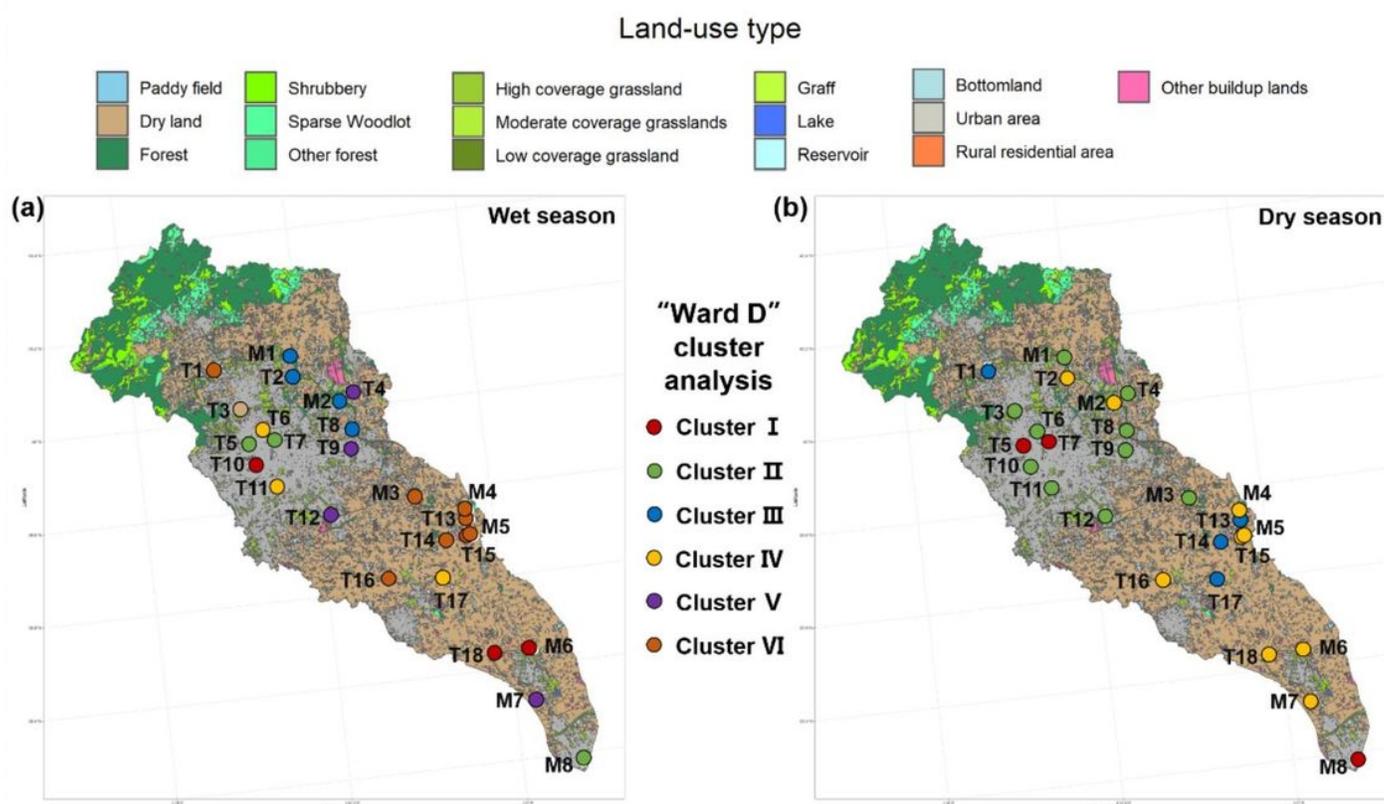
**Figure 4**

Nitrate isotopic value in the Beiyun river together with typical nitrate isotope source members. The theoretical  $\delta^{18}\text{O-NO}_3$  value of nitrification was in the range of -10‰ to 5.7‰ (Li et al., 2014a; Liu et al., 2018). The various nitrate isotope sources in the plot are adapted from previous studies (Shin et al., 2013; Jani and Toor, 2018).



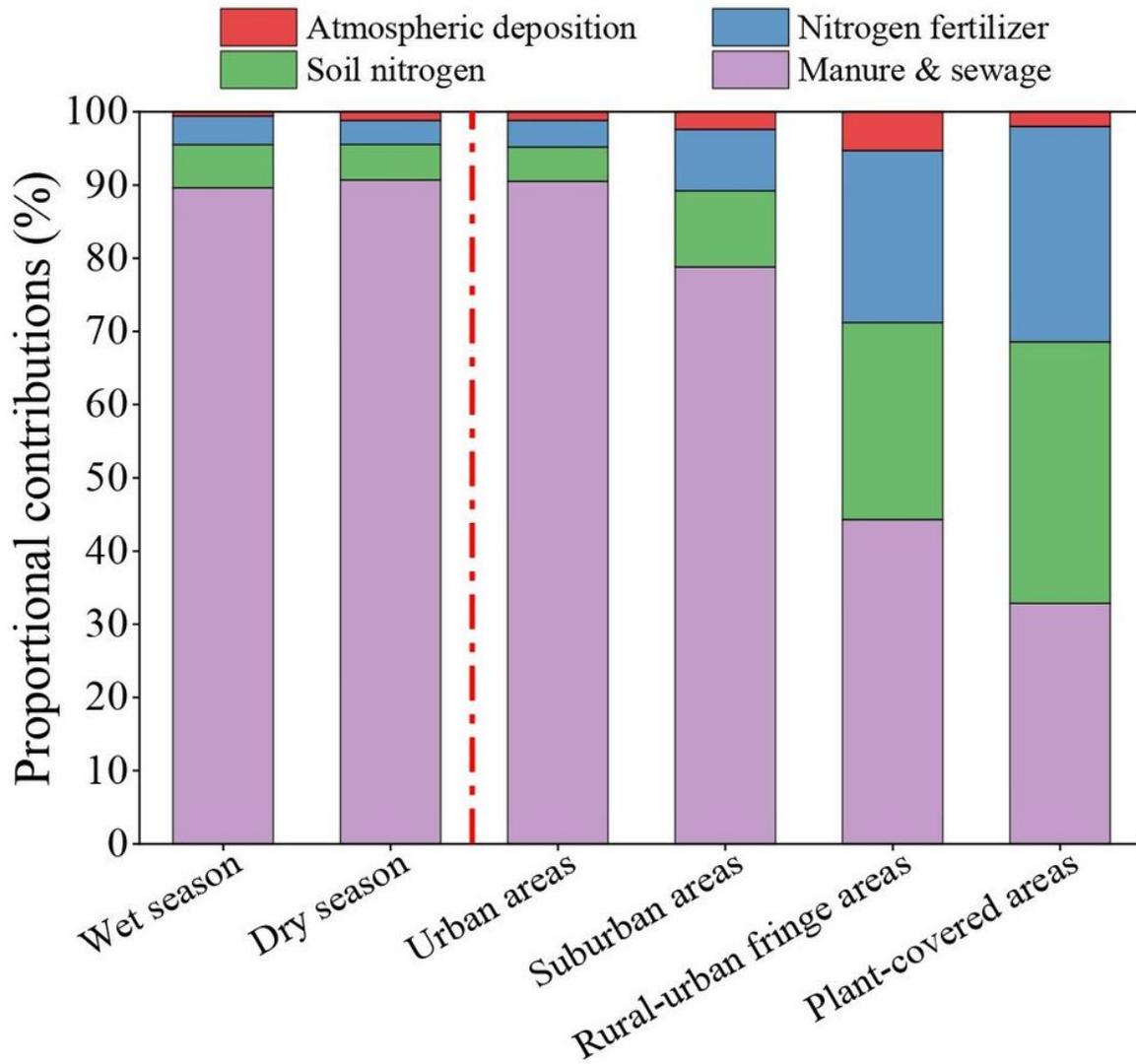
**Figure 5**

Cross-plot of (a) Cl- and NO<sub>3</sub> molarity. (b) Cl- molarity and NO<sub>3</sub>/Cl- molar ratio. 3.2.2 Source apportionment through statistical analysis



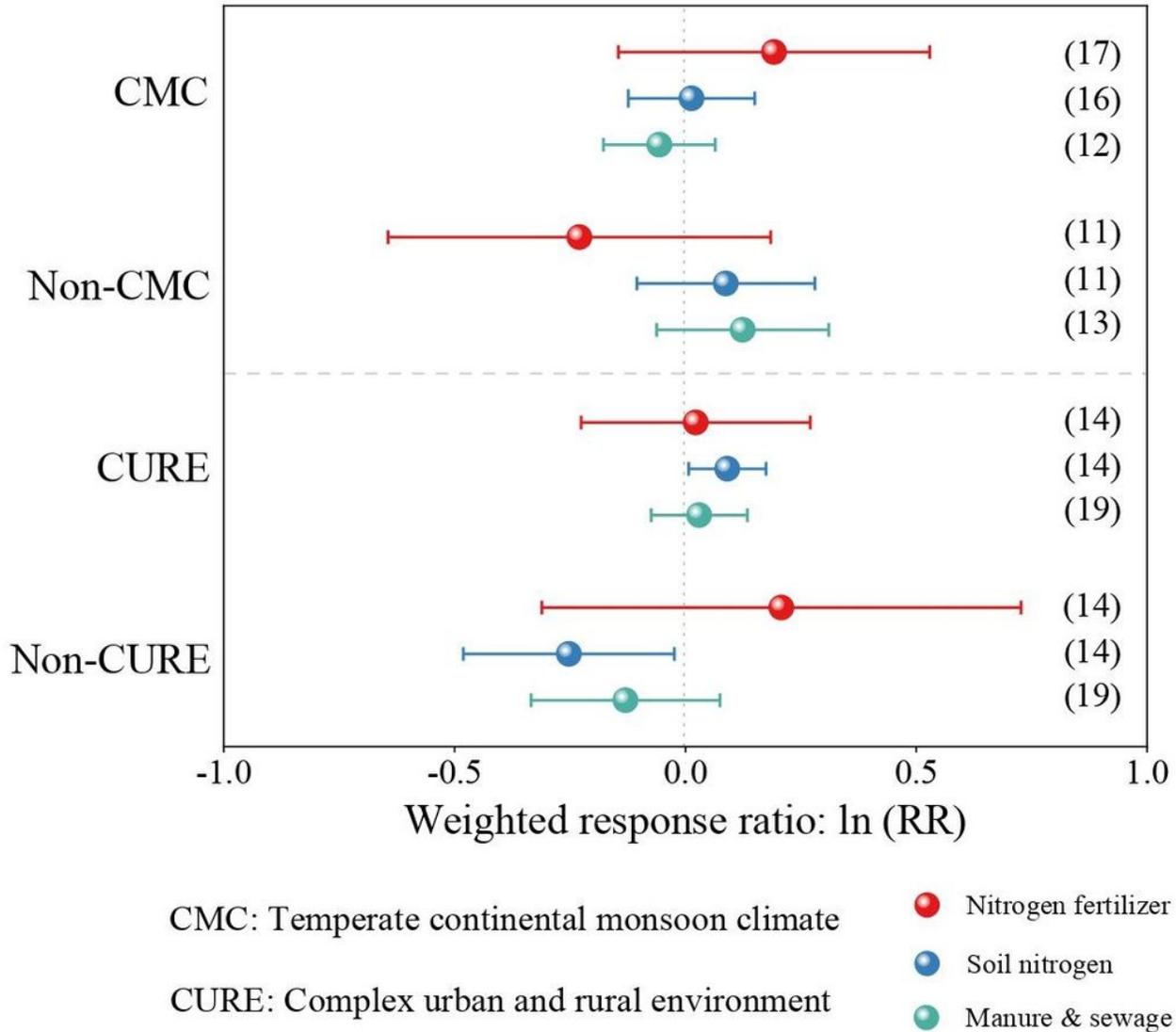
**Figure 6**

Cluster map in the (a) wet season and (b) dry season. Note: The designations employed and the presentation of the material on this map do not imply the expression of any opinion whatsoever on the part of Research Square concerning the legal status of any country, territory, city or area or of its authorities, or concerning the delimitation of its frontiers or boundaries. This map has been provided by the authors.



**Figure 7**

The contribution rates of four potential nitrate sources at (a) different sampling periods and (b) different land-use types.



**Figure 8**

The weighted response ratios  $\ln(\text{RR})$  of climate type, land-use type, and different sources of nitrate. The solid dots are the mean value of  $\ln(\text{RR})$ , the straight line is 95% confidence intervals, and the sample size is in parentheses.

## Supplementary Files

This is a list of supplementary files associated with this preprint. Click to download.

- [Izh04.23NitrateSupporting.docx](#)