

26 ($\geq 33\%$) and increased greatly. The proportion of food nitrogen increased from 10% to
27 21% during the study period. Subsequent decreases in anthropogenic nitrogen mainly
28 resulted from decreased fertilizer nitrogen consumption (to 20% of the total
29 consumption) from 2010 to 2015. Of the influencing factors, the inhibitory effect of
30 material intensity on Beijing's anthropogenic nitrogen consumption increased from 22%
31 to 37% during the study period; the promoting effect of per capita GDP gradually
32 weakened, but its contribution remained $>30\%$ of the total. By analyzing the dynamics
33 of Beijing's urban anthropogenic nitrogen consumption, we identified the main
34 socioeconomic drivers, thereby providing scientific support for exploring nitrogen
35 consumption patterns during different urban development stages and for the activities
36 required to regulate nitrogen consumption.

37 **Key words:** anthropogenic nitrogen, urban metabolism, consumption, influencing
38 factors, LMDI method, Beijing

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52 **1. Introduction**

53 During the 145 years from 1860 to 2005, the world's rate of anthropogenic
54 nitrogen production increased by more than 12 times (Galloway et al., 2008), and
55 human reactive nitrogen sources are ~ 5-fold greater than natural sources in 2002
56 (Galloway et al., 2015). Human activities significantly affected the global nitrogen
57 cycle. Unfortunately, this high nitrogen consumption has caused many ecological and
58 environmental problems (Billen et al., 2013, Gao et al., 2019). For example, global NH₃
59 and NO_x emission caused by food and energy production increased nearly threefold
60 between 1860 and 1990 (Galloway et al., 2004), adversely affecting human health and
61 regional sustainability (Luo et al., 2018). Due to the high concentration of people and
62 socioeconomic activities that occurs in cities, these problems become particularly
63 prominent at the scale of cities, and cities have become global hotspots of concern (Gu
64 et al., 2009). Urban areas account for 50% of all waste, generate 60 to 80% of all
65 greenhouse gas emissions, and consume 75% of natural resources, yet occupy only 3%
66 of the Earth's surface (UN-DEAS, 2015).

67 Beijing, China, is a global megacity whose high nitrogen inputs and nitrogen
68 pollution cannot be ignored. In 2015, Beijing's urban per capita food expenditure (7584
69 yuan/person) was 1.6 times the national average (4814 yuan/person) (BMBS, 2016;
70 NBSC, 2016d). Beijing's urban per capita energy consumption (3.2 tonnes coal
71 equivalent [tce]/person) was 1.1 times the national average (2.9 tce/person) (NBSC,
72 2016a). Increasing consumption of food and energy due to increasing urbanization and
73 socioeconomic development greatly increased nitrogen inputs, leading to serious
74 nitrogen pollution. The NO_x emissions from Beijing residents (19 143.0 t) was 3.9 times
75 the national average urban emission (4931.1 t) and the emission of ammonia and its

76 discharge into water by residents of Beijing (11 564.0 t) was 1.3 times the national
77 average urban emission (9172.6 t) (NBS and MEP, 2016). To control Beijing's nitrogen
78 pollution, we need to calculate the nitrogen consumption from the various sources,
79 clarify the structural characteristics of this consumption, and identify the main factors
80 that influence nitrogen consumption in Beijing. This knowledge will let managers
81 propose targeted policy recommendations to improve urban metabolic flows that lead
82 to healthier conditions for the citizens and the global nitrogen cycle.

83 Researchers have proposed a range of indicators for characterizing nitrogen
84 consumption to meet different research purposes. Agricultural researchers have
85 proposed indicators for nitrogen input in agricultural activities. For example, Jordan &
86 Weller (1996) proposed net anthropogenic nitrogen input. Billen et al. (2007) proposed
87 the concept of artificial autotrophic nitrogen and heterotrophic nitrogen, which reflect
88 the nutrient inputs in the early stage of agricultural production, local agricultural
89 production activities, and the population's geographical distribution (Zhang et al.,
90 2016b). Other researchers have proposed indicators for characterizing the nitrogen
91 inputs of the socioeconomic system. For example, Deng et al. (2007) and Ma et al.
92 (2010) used a similar partitioning method to classify regional nitrogen inputs into
93 reactive nitrogen and recirculating nitrogen. However, Ma et al. (2010) called reactive
94 nitrogen "new nitrogen" and did not incorporate atmospheric deposition of nitrogen
95 into the pool of circulating nitrogen.

96 As the scale and intensity of human activities has increased, anthropogenic
97 nitrogen indexes have been developed to quantify these flows. For example, in a
98 century-scale analysis of the creation and fate of reactive nitrogen in China, Cui et al.
99 (2013) accounted for biological nitrogen fixation, industrial nitrogen fixation, and fossil
100 fuel combustion as anthropogenic nitrogen. The accounting system of Gu et al. (2012)

101 was more detailed; they noted that an anthropogenic nitrogen index should include
102 fossil fuel nitrogen, fertilizer nitrogen, industrial nitrogen (e.g., in nylon, plastics, paints,
103 and dyes), nitrogen imports in food and livestock feed, and biological nitrogen fixation,
104 as these sources are closely related to human activities. They also studied the impact of
105 the urbanization process on the forms of nitrogen in Shanghai, China, and dynamic
106 mechanisms responsible for changes in these forms. The anthropogenic nitrogen index
107 proposed by Gu et al. was relatively comprehensive, but they did not separate biological
108 nitrogen fixation (natural nitrogen fixation) from agricultural nitrogen fixation. In
109 contrast with Gu et al.'s accounting system, Gao et al. (2014 a) did not consider fossil
110 fuels and industrial nitrogen in their net anthropogenic nitrogen index, but included
111 atmospheric nitrogen deposition and applied it to the calculation of nitrogen flows for
112 358 regional-level municipal administrative units in mainland China. The same
113 accounting system was also applied to the net anthropogenic nitrogen input in a study
114 in the Victoria Basin in East Africa (Zhou et al. 2014) and the Huaihe River Basin in
115 China (Zhang et al. 2016a). In addition, unlike previous studies, Luo et al. (2018)
116 considered nitrogen in industrial use, human consumption, and agriculture, and the
117 nitrogen recovered by the waste management system in coupled human–environment
118 nitrogen flows in China.

119 The dynamic changes in anthropogenic nitrogen consumption indicators are
120 driven by changes in socioeconomic factors. Two main methods for analyzing the
121 factors that influence nitrogen consumption have been widely used: correlation analysis
122 and factor analysis. Yu et al. (2012) used Pearson's correlation coefficient to analyze
123 the effects of factors such as per capita disposable income, Engel's coefficient, a food
124 price index, the university-level population, and the average household population on
125 food nitrogen consumption in Xiamen, China. Similarly, Gao et al. (2018) used

126 correlation analysis to study the effects of population growth, dietary changes, and
127 urban–rural migration on China's food nitrogen consumption. Correlation analysis
128 provides a flexible approach, but cannot comprehensively consider and quantify the
129 relative contribution of each factor. Factor analysis can accomplish both goals, and
130 among the available methods, structural decomposition analysis and index
131 decomposition analysis are the most common methods. Structural decomposition
132 analysis has certain limitations to its application because the data is based on input–
133 output tables, and this data is only available for a limited period in most regions, and
134 the decomposition results have residuals. The logarithmic mean divisia index (LMDI)
135 method, which is a form of index decomposition analysis, has the advantages of using
136 available data, performing a full decomposition of that data, having no residuals, being
137 easy to use, and being consistent with both multiplicative and additive decomposition
138 (Gu, 2011). Thus, it offers many advantages over simple correlation analysis and other
139 factor decomposition methods (Ang, 2004).

140 In the context of nitrogen, the LMDI method has mainly been applied to nitrogen
141 pollutant emission, with the goal of decomposing the factors that drive nitrogen
142 emission in terms of their structure, scale, efficiency, and intensity, while also
143 accounting for social and technological improvements. The structural effects used in
144 previous studies always included factors related to the economic and energy structure
145 of the system being studied (Wang, 2017) and its industrial structure (Lei et al., 2012).
146 The scale effect included factors such as the economic scale (Jia et al., 2017),
147 population (Gao et al., 2014b), and industrial scale (Li et al., 2012). The use of other
148 effects has been relatively rare, and mainly included factors such as energy efficiency
149 (Ding et al., 2017), energy intensity (Wang, 2017), and technological improvement
150 (Pang et al., 2013). Since emission results from consumption, analyzing the different

151 factors that influence emission can provide a reference for research on nitrogen
152 consumption. Liu et al. (2014) used the LMDI method to study the contribution rates
153 and the promotion or inhibition effects of factors such as population, economic scale,
154 nitrogen consumption intensity, and food efficiency on regional food nitrogen
155 consumption.

156 Previous studies using the LMDI method to study the factors that influence
157 nitrogen consumption began with the discharge end to explore the causes of nitrogen
158 pollution. However, emissions are usually derived from consumption. From the
159 perspective of consumption, researchers most often try to predict future nitrogen
160 problems, and their predictions can be used to guide efforts to solve the problem of
161 excessive resource consumption and thus reduce nitrogen pollution. However, few
162 scholars have combined the consumption of all types of urban anthropogenic nitrogen
163 with the LMDI method to study the influencing factors. Liu et al. (2014) used the LMDI
164 method to study the contribution ratio and direction of factors such as population,
165 economic scale, nitrogen consumption intensity and food efficiency to regional food
166 nitrogen consumption, but the type of nitrogen studied is too singular. Table S1
167 summarizes the history of previous research on nitrogen flows.

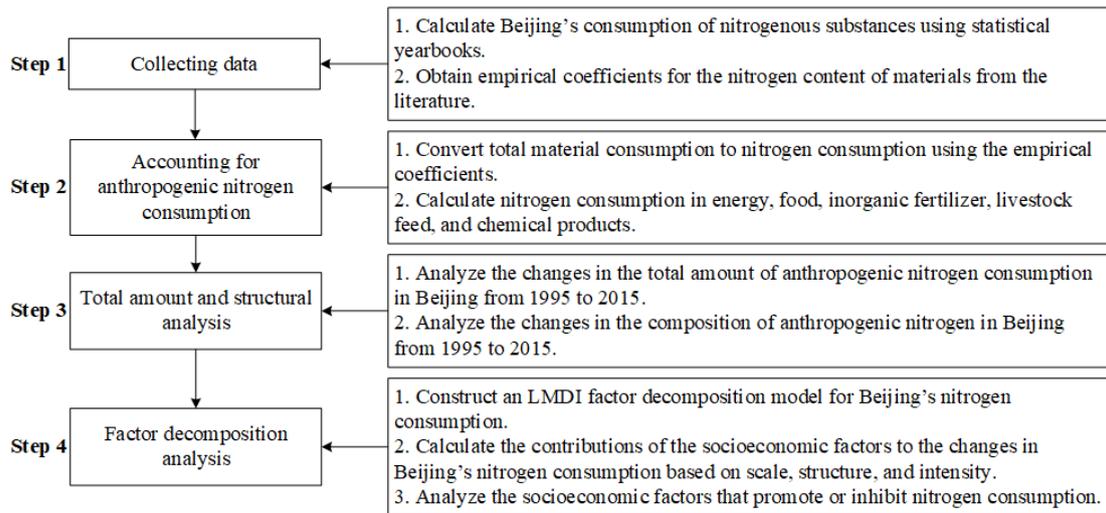
168 To provide some of the missing knowledge, we designed the present study to start
169 with consumption and develop an anthropogenic nitrogen index that characterizes the
170 most important nitrogen sinks affected by socioeconomic factors. We studied the
171 changes of total anthropogenic nitrogen consumption and its structural characteristics
172 in Beijing from 1995 to 2015. We used the LMDI method to construct a factor
173 decomposition model that included six factors: 1) the nitrogen content of the material,
174 2) the material intensity (i.e., the material consumption per unit of the output value), 3)
175 the industrial structure, 4) the per capita GDP, 5) the material consumption structure,

176 and 6) the population. These factors represent the intensive and extensive aspects of
177 Beijing nitrogen consumption in the context of current structural considerations. We
178 chose these factors based on our knowledge of Beijing's current situation, the problems
179 it is facing as a result of urban development, and the availability of reliable and
180 comparable data for the whole study period. We then examined this data to identify the
181 main factors that promoted or inhibited Beijing's consumption of reactive nitrogen. The
182 results provide scientific support for developing policies to control nitrogen
183 consumption, with the goal of promoting healthy and stable development of Beijing's
184 nitrogen system.

185 **2. Methodology**

186 In this study, we focused on Beijing's nitrogen consumption and changes in its
187 structural characteristics. We also focused on the main factors that influence Beijing's
188 nitrogen consumption and changes in their relative importance over time. We used
189 empirical coefficients for the nitrogen content of materials and statistical analysis to
190 calculate the inputs of anthropogenic nitrogen to Beijing's urban system from 1995 to
191 2015 to reflect the changes of total nitrogen consumption and their structural
192 characteristics. We used the LMDI method to construct a factor decomposition model,
193 and used the model to analyze the contribution of socioeconomic factors to
194 anthropogenic nitrogen consumption, and the strength of their promotion or inhibition
195 of the N flows (Fig. 1).

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198 **Fig. 1.** Overview of the steps in the research.
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200 **2.1 Accounting for anthropogenic nitrogen consumption**

201 The anthropogenic nitrogen index (N_a) is composed of the amount of energy
202 nitrogen (N_{energy} , primarily from combustion of fossil fuels), food nitrogen (N_{food}),
203 fertilizer nitrogen ($N_{fertilizer}$), livestock feed nitrogen (N_{feed}), and inorganic nitrogen
204 ($N_{inorganic}$):

205
$$N_a = N_{energy} + N_{food} + N_{fertilizer} + N_{feed} + N_{inorganic}$$

206 (1)

207 Based on this nitrogen accounting, we analyzed Beijing's total input of
208 anthropogenic nitrogen and the dynamic changes of the five anthropogenic nitrogen
209 components from 1995 to 2015. We calculated the quantity of nitrogen in each kind of
210 nitrogen input by multiplying the consumption data for materials in each category by
211 an empirical coefficient that defined the nitrogen content of the materials (Table 1).
212 Table S2 provides these coefficients or their sources for all the materials other than fuels
213 and food that we evaluated. We obtained most of our data from government statistical
214 yearbooks, and we obtained the nitrogen content of the materials from previous research

215 results. To more accurately and comprehensively calculate the amount of nitrogen
216 consumed by energy combustion, we used the NO_x emission data and Asian fuel NO_x
217 emission factors that were closest to Beijing's emission levels (Kato and Akimoto,
218 1992). Table S3 provides the emission factor values we used for different types of fuel.
219 Table S4 provides these factors for food. The nitrogen content of fertilizers was the
220 average nitrogen content reported for Chinese compound fertilizers (Ti et al., 2012).
221 Because most nitrogen fixation by Chinese crops results from fertilizer nitrogen (Gao
222 et al., 2014a), and because nitrogen-fixing leguminous crops represent less than 5% of
223 Beijing's total crop area (BMBS and NBS, 1996-2016), we did not include biological
224 nitrogen fixation in our calculations.

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Table 1 Accounting formulas and data source used to quantify anthropogenic nitrogen

Categories	Calculation formula	Data description	Data Sources	
$N_{\text{fertilizer}}$	$D_1 \times P_1$	D_1 : Fertilizer consumption P_1 : Fertilizer nitrogen content	NBSC, 2016d Table S2	
N_{feed}	N_{pet}	$D_4 \times D_5 \times 365 \times P_4$	D_4 : Number of pets per person D_5 : Beijing's population P_4 : Feed nitrogen consumption / pet / day	EBCAIY, 2016 BMBS and NBS, 1996-2016 Table S2
	$N_{\text{livestock \& poultry}}$	$D_6 \times P_5 \times P_6$	D_6 : Number of livestock and poultry P_5 : Feed nitrogen consumption of livestock and poultry / animal / day P_6 : The number of days of breeding of various types of livestock and poultry	NBSC, 2016c, EBCAIY, 2016; MAC, 2016 Table S2 Table S2
	$N_{\text{fisheries}}$	$D_7 \times P_7$	D_7 : Aquatic product production P_7 : Empirical coefficient for N content	MAC, 2016 Table S2
N_{energy}	$\sum D_{sf} \times P_{sf}$	D_{sf} : consumption of fuel type f in sector s P_{sf} : NOx emission factors of fuel type f in sector s	NBSC, 2016a; NBSC, 2016b Table S3	
N_{food}	$\sum D_m \times P_m$	D_m : consumption of food type m P_m : nitrogen content of food type m	BMBS and NBS, 1996-2016, NBSC, 2016c, EBCAIY, 2016 Table S4	
$N_{\text{inorganic}}$	$D_5 \times P_8$	D_5 : Beijing's population P_8 : industrial nitrogen flux per person	BMBS and NBS, 1996-2016 Table S2	

240 Sectors (s) include Household, Industry, Services, Construction, Transportation, and Other. Energy types (f) include coal, coke, crude oil, gasoline, kerosene, diesel,
 241 residual oil, liquefied petroleum gas, natural gas, gasworks gas, and refinery gas. Food types (m) include cereals, beans, vegetables, fruits, pork, beef, milk, mutton,
 242 eggs, and aquaculture products.

243 2.2 Constructing the nitrogen factor decomposition model

244 We used the LMDI method to construct a complete decomposition model for the
245 factors responsible for the changes of anthropogenic nitrogen consumption. As a global
246 megacity, Beijing has a high concentration of socioeconomic activities and a large
247 population. The per capita GDP and the population are therefore the factors that we
248 need to consider to account for the intensity of these activities. In addition, Beijing is
249 in a critical period of industrial transformation (e.g., closing industries with high energy
250 consumption or moving them to other parts of the country) and upgrading industries
251 through technological innovation; thus, the industrial structure must also be considered.
252 The city's high-intensity socioeconomic activities and deep industrial transformation
253 change the pressure created by resource consumption and its environmental impacts.
254 Therefore, reduced consumption of materials has become an urgent task, and material
255 intensity (the consumption of a material per unit output) has become a factor that must
256 be considered. In addition, the variety of urban industries, the complex dietary structure
257 of residents, and differences in consumption levels all affect the consumption structure
258 of materials, so we focused on the material consumption structure. Based on this review,
259 we identified the effects of six factors: 1) the nitrogen content of each material, 2) the
260 material consumption intensity, 3) material consumption structure, 4) industrial
261 structure, 5) per capita GDP, and 6) population on the changes of Beijing's
262 anthropogenic nitrogen.

263 We also examined the direction of the effect to determine whether these factors
264 promoted or inhibited nitrogen consumption (C_N). The calculation formula is as follows:

$$265 \quad C_N = \sum_{ij} N_{ij} = \left(\sum_i \frac{N_i}{M_i} \right) \times \frac{M_i}{M_j} \times \frac{M_j}{G_j} \times \frac{G_j}{G} \times \frac{G}{P} \times P \quad (2)$$

266 Where N_{ij} represents the amount of N in the i -th material from the j -th industry;

267 N_i represents the amount of N in the i -th material; M_i represents the consumption of the
 268 i -th material; M_j is the material consumption by the j -th industry; G_j represents the
 269 output by the j -th industry; G represents the regional GDP (the real GDP, inflation-
 270 adjusted values); and P represents the population. This equation can be further
 271 expressed as follows:

$$272 \quad C_N = \sum_{ij} N_{ij} = \sum_{ij} (F_i \times MS_i \times MI_j \times IS_j \times R \times P)$$

273 (3)

274 where F_i is the nitrogen content of the material, and most of the changes in this
 275 parameter are affected by changes in the composition of each material; MS_i is the
 276 material consumption structure, which represents the proportion of total consumption
 277 for the i -th material in the j -th industry in Beijing; MI_j is the material intensity, which
 278 represents the material consumption per unit of the output value of the j -th industry; IS_j
 279 is the industrial structure, which represents the ratio of the output value of the j -th
 280 industry to the total output value; R is the per capita GDP (the real GDP, inflation-
 281 adjusted values); and P is the population.

282 The change in anthropogenic nitrogen consumption from the base year (time = 0)
 283 to the target year (time = T) can be expressed as:

$$284 \quad \Delta N_{\text{tot}} = N_T - N_0 = \Delta N_F + \Delta N_{MS} + \Delta N_{MI} + \Delta N_{IS} + \Delta N_R + \Delta N_P$$

285 (4)

286 Where ΔN_{tot} represents the change in total anthropogenic nitrogen consumption
 287 from year 0 to year T ; N_T represents the anthropogenic nitrogen consumption in year T ;
 288 N_0 represents the anthropogenic nitrogen consumption in year 0; and ΔN_F , ΔN_{MS} , ΔN_{MI} ,
 289 ΔN_{IS} , ΔN_R , and ΔN_P represent the changes in anthropogenic nitrogen consumption
 290 caused by changes in the six factors listed above (nitrogen content of the material,
 291 material consumption structure, material intensity, industrial structure, per capita GDP,

292 and population). The equations obtained by means of the LMDI decomposition method
 293 are as follows:

$$294 \quad \Delta N_F = \sum_{ij} L(N_{ijT}, N_{ij0}) \ln \left(\frac{F_T}{F_0} \right) \quad (5)$$

$$295 \quad \Delta N_{MS} = \sum_{ij} L(N_{ijT}, N_{ij0}) \ln \left(\frac{MS_T}{MS_0} \right) \quad (6)$$

$$296 \quad \Delta N_{MI} = \sum_{ij} L(N_{ijT}, N_{ij0}) \ln \left(\frac{MI_T}{MI_0} \right) \quad (7)$$

$$297 \quad \Delta N_{IS} = \sum_{ij} L(N_{ijT}, N_{ij0}) \ln \left(\frac{IS_T}{IS_0} \right) \quad (8)$$

$$298 \quad \Delta N_R = \sum_{ij} L(N_{ijT}, N_{ij0}) \ln \left(\frac{R_T}{R_0} \right) \quad (9)$$

$$299 \quad \Delta N_P = \sum_{ij} L(N_{ijT}, N_{ij0}) \ln \left(\frac{P_T}{P_0} \right) \quad (10)$$

300 Where:

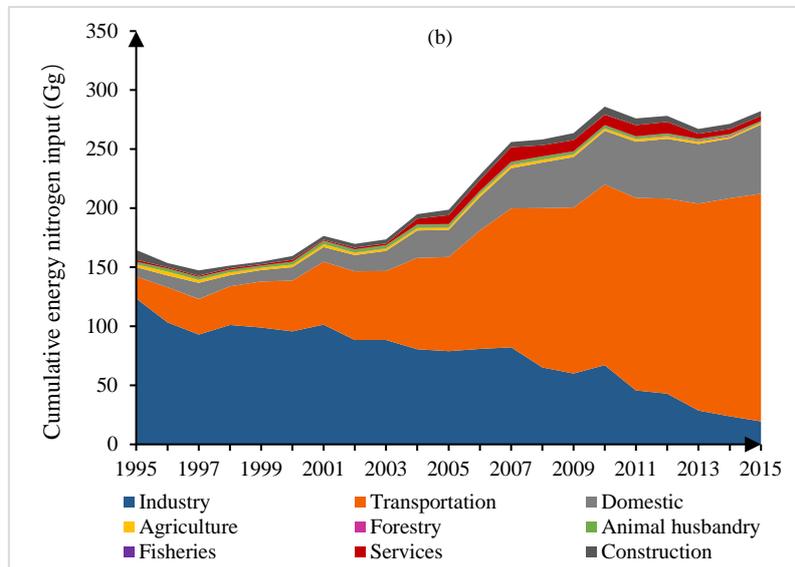
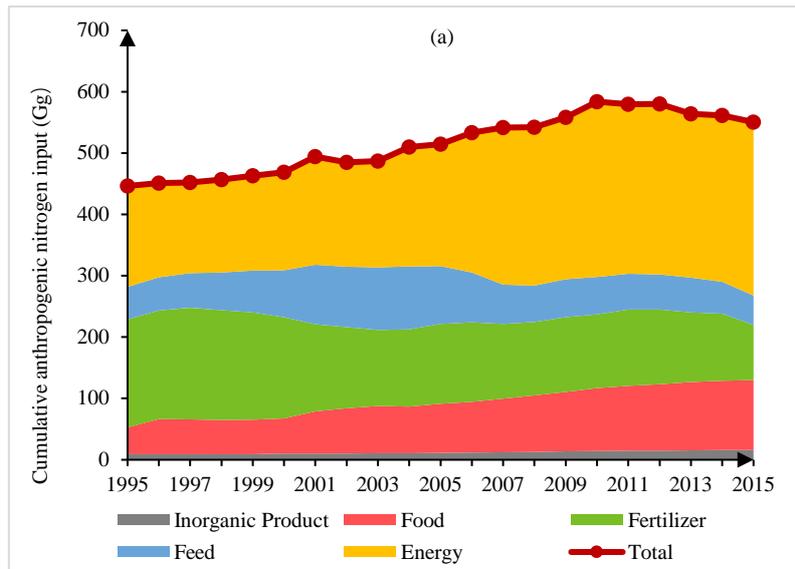
$$301 \quad L(N_{ijT}, N_{ij0}) = (N_{ijT} - N_{ij0}) / [\ln(N_{ijT}) - \ln(N_{ij0})] \quad (11)$$

302 We used these equations to analyze the scale effect (population), intensity effect
 303 (per capita GDP, material intensity), and structural effect (nitrogen content of the
 304 material, material consumption structure, industrial structure) generated by the various
 305 factors that affect Beijing's anthropogenic nitrogen consumption. The contribution of
 306 each effect to the total characterizes the magnitude of the effect, and the sign indicates
 307 the direction of the effect (+ = promotion, - = inhibition). The contribution of a given
 308 factor is divided by the sum of the absolute values of the contribution values of all
 309 factors (which total to 1), so the contribution is standardized to fall within the range of
 310 [-1, 1], which we then converted from a decimal value within [-1, 1] to a percentage
 311 value.

312 **3. Results**

313 **3.1 Analysis of Beijing's anthropogenic nitrogen consumption**

314 Beijing's consumption of anthropogenic nitrogen shows two distinct periods: first,
315 the total consumption increased steadily, with some variation, from 1995 to 2010,
316 followed secondly, by a slow decreased thereafter (Fig. 2). Energy nitrogen matched
317 this trend, but consumption of energy N proportion was always greater than 33% of the
318 total and continued to grow throughout the study period. (Table S5 provides the actual
319 values for Beijing's nitrogen consumption structure from 1995 to 2015.) The
320 proportions of energy nitrogen and fertilizer nitrogen at the beginning of the study were
321 roughly equal (at about 38%), but energy nitrogen increased to 51% of the total by the
322 end of the study period (Table S5). Growth of total nitrogen consumption also resulted
323 from food nitrogen, which increased from 10% at the beginning of the study period to
324 21% by 2015 (Table S5). The reduction of total anthropogenic nitrogen consumption
325 during the decreased period was mainly caused by the reduction of fertilizer nitrogen.
326 It decreased throughout the study period, and its' proportion during the later period was
327 below that of food nitrogen, at 16 and 20%, respectively (Table S5). Feed nitrogen
328 approximately doubled, but subsequently decreased to a value similar to that at the start
329 of the study period. However, inorganic nitrogen changed little, fluctuating between 2%
330 and 3% during the study period (Table S5).



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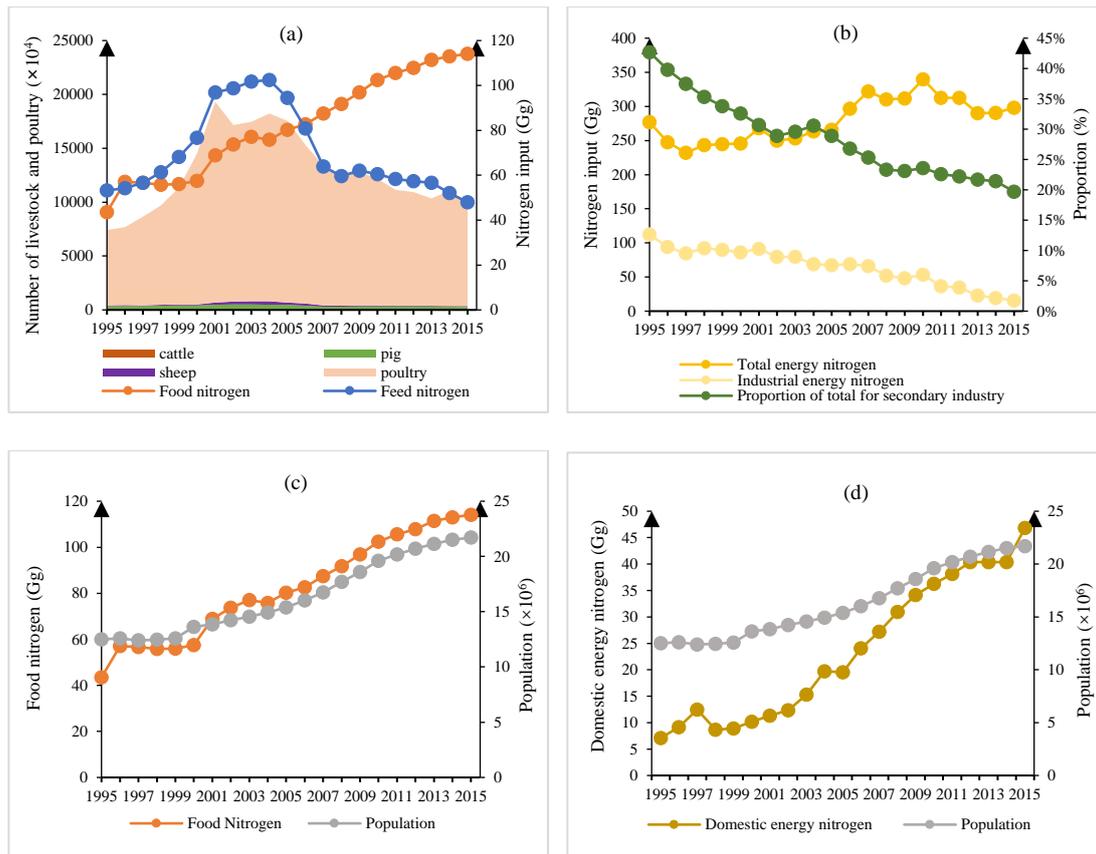
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333 **Fig. 2** (a) Total amount and structure of Beijing's anthropogenic nitrogen
 334 consumption and (b) energy nitrogen consumption by the main sectors. Table S5
 335 shows the changes over time in the % of the total accounted for by each consumption
 336 sector in (a).

337

338 Overall, there were two important inflection points in Beijing's anthropogenic
 339 nitrogen consumption, in 2001 and 2010 (Fig. 2a). Total nitrogen consumption
 340 increased significantly in 2001, mainly driven by increased consumption of food
 341 nitrogen (14% of the total), feed nitrogen (20%), and energy nitrogen (36%). This is

342 because Beijing's population has increased continuously during the study period (Fig.
343 3c), thereby increasing the demand for food (including animal products). In addition,
344 Beijing's population increased dramatically in 2000 (Fig. 3c), by 8.5% compared with
345 an average of 0.9% for the previous 4 years, and household income also continued to
346 increase, permitting greatly increased consumption of high-nitrogen food such as meat.
347 Beijing's total consumption of livestock and poultry peaked in 2001 (Fig. 3a), and its
348 growth rate in 2001 (33.2%) was much higher than the average for the previous 5 years
349 (14.6%). This increase naturally led to a sharp increase in total food nitrogen
350 consumption in 2001 (Fig. 3a), when the growth rate of food nitrogen consumption
351 reached 20.0%, which was much higher than the average for the previous 5 years (7.2%).
352 At the same time, the increased livestock and poultry breeding greatly increased the
353 feed nitrogen input, which was 27% higher than that in 2000. At the same time, the
354 population growth increased domestic energy nitrogen consumption (Fig. 3d). In
355 addition, during the early period of the 10th 5-year plan (2001-2005), which had a
356 planned target of 9% GDP growth, the energy nitrogen consumption of the industry and
357 transportation sectors both increased significantly in 2001, resulting in a rapid increase
358 of total energy nitrogen consumption (Fig. 2b). In summary, in 2001, the amount of
359 anthropogenic nitrogen in Beijing reached a peak under the influence of various factors.
360 Total domestic consumption increased along with the increasing population (Fig. 3c).
361



362

Fig. 3 Trends in Beijing's socioeconomic factors and nitrogen structures.

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364

During the study period, Beijing has always responded to the state's requirements for industrial restructuring, and the proportion of the secondary industry has continued to decline. In addition, the government began preparing for the 2008 Olympics starting in 2002, and the proportion of secondary industry in Beijing reached its lowest value (28.9%) during the 11th 5-year plan period (from 2000 to 2005) (Fig. 3b). As a result, the industrial energy nitrogen consumption also decreased greatly, and the total energy nitrogen consumption also decreased in 2002 (Fig. 3b).

371

From 2002 to 2010, the growth of anthropogenic nitrogen consumption in Beijing accelerated and the average annual growth rate (2.2%) was much higher than that in the previous period (1.0%). In 2010, the total amount of anthropogenic nitrogen consumption in Beijing reached its peak, which was closely related to the growth of

374

375 energy nitrogen (Fig. 2a). During the period of the 11th and 12th 5-year plans (2005 to
376 2010 and 2010 to 2015, respectively), construction of the urban transportation
377 infrastructure accelerated, causing the demand for energy nitrogen to increase greatly
378 (Fig. 2b). In 2010, Beijing's energy nitrogen consumption for transportation increased
379 by 221% compared with the value in 2001. At the same time, the household energy
380 nitrogen consumption also increased due to the continuous growth of Beijing's
381 population, which increased by 41.6% in 2010 compared to the value in 2001 (Fig. 3d);
382 as a result, household energy nitrogen consumption in 2010 increased by 2.2 times
383 compared with the value in 2001. Together, these factors caused energy nitrogen
384 consumption to increase rapidly and continuously. In addition, the population growth
385 also increased food nitrogen consumption. Beijing's food nitrogen consumption
386 increased by 48.5% between 2001 and 2010, and this component contributed greatly to
387 the growth of total nitrogen consumption (Fig. 2a).

388 From 2011 to 2015, total nitrogen consumption decreased by a total of 33.6 Gg.
389 These decreases resulted mainly from the reduction of feed, fertilizer and energy
390 nitrogen consumption (reduced by 30.7Gg, 12.5Gg, and 3.7Gg, respectively. Fig. 2a).
391 During the 12th 5-year plan period (2011 to 2015), the government planned further
392 adjustments of the industrial structure, with the goal of reducing the proportions of
393 primary and secondary industries and increasing the proportion of tertiary industries to
394 more than 78%. This greatly reduced the fertilizer nitrogen, feed nitrogen, and industrial
395 energy nitrogen required to support the primary and secondary industries, thus affecting
396 Beijing's total nitrogen consumption.

397 **3.2 Analysis of the factors that influenced Beijing's anthropogenic nitrogen** 398 **consumption**

399 Table 2 summarizes the promotion and inhibition of anthropogenic nitrogen

400 consumption by the six driving factors. We divided Beijing's anthropogenic nitrogen
401 consumption into three periods based on the two inflection points we observed (in 2001
402 and 2010): the first increasing period, the second increasing period, and the final
403 decreasing period. From the perspective of the scale, intensity, and structural effects,
404 the scale effect promoted the growth of anthropogenic nitrogen consumption, with the
405 degree of the effect first increasing and then decreasing. The contribution of population
406 to total N consumption was 5.5% during the first increasing period (1995-2000), 12.0%
407 in the second increasing period (2001-2010), and 8.0% during the decreasing period
408 (2011-2015), suggesting that the impact of population growth on Beijing's consumption
409 of anthropogenic nitrogen is too large to ignore. The direction of the intensity effect on
410 anthropogenic nitrogen consumption changed during the study period, from promotion
411 (with the material and per capita GDP intensity effects together totaling 19.9% of the
412 total) during the first increasing period (1995 to 2000) to inhibition (- totaling -4.1%)
413 during the decreasing period (2011 to 2015). This was mainly related to the continuous
414 increase of inhibitory factors such as material intensity (whose contribution increased
415 from 21.6% during the second increasing consumption period to 37.3% during the
416 decreasing period) and the gradual weakening of promoting factors such as the per
417 capita GDP (whose contribution decreased from 41.5% of the total during the first
418 increasing period to 33.2% during the decreasing period). The overall structural effect
419 (the sum of the nitrogen content, material consumption, and industrial structure
420 components) always inhibited the growth of anthropogenic nitrogen consumption, but
421 the magnitude of the inhibition decreased over time. This was caused by the fact that
422 the inhibitory effect of the industrial structure (accounted for >14.0%) was much greater
423 than the promotion effect of the nitrogen content of materials and the material
424 consumption structure (which together accounted for <7.0%), and the strength of the

425 inhibition of the industrial structure decreased greatly over time, while the strength of
 426 the promotion caused by the sum of the nitrogen content and material consumption
 427 structures increased.

428

429 **Table 2** Standardized contributions of the factors that affected consumption of
 430 anthropogenic nitrogen from 1995 to 2015.

Effect	Factor	Promotion (positive %) or inhibition (negative %)		
		1995-2000	2001-2010	2011-2015
	Nitrogen content of the material	2.14	3.63	6.90
Structure	Material consumption structure	2.41	0.20	0.02
	Industrial structure	-26.85	-17.87	-14.60
Intensity	Material intensity	-21.63	-28.44	-37.31
	Per capita GDP	41.53	37.85	33.21
Scale	Population	5.45	12.02	8.00

431

432 Of the six factors that influenced consumption, only the material intensity and
 433 industrial structure showed inhibitory effects; the other four factors showed obvious
 434 promotion of nitrogen consumption. Material intensity and the industrial structure had
 435 similar inhibitory effects during the first increasing period (1995-2000), both
 436 accounting for more than 20% of the overall contribution. However, the inhibitory
 437 effect of material intensity continuously increased, whereas the effect of the industrial
 438 structure continuously weakened, decreasing to less than one-half of the contribution
 439 of material intensity during the period with decreasing nitrogen consumption (Table 2).
 440 Per capita GDP was the main driving force behind the growth of Beijing's
 441 anthropogenic nitrogen consumption. The contribution of this factor (41.5%) during the
 442 first increasing period was close to the sum of the contributions of material intensity

443 and industrial structure. Although the contribution of per capita GDP decreased
444 thereafter, it remained greater than 30% of the total contribution throughout the study
445 period.

446 Population was also one of the main factors driving the growth of Beijing's
447 anthropogenic nitrogen consumption. However, the strength of its effect was volatile
448 during the study period, with the contribution first doubling and then decreasing to
449 about 67% of the peak value. The increase of the promotion effect also resulted from
450 the amount of nitrogen in the materials. During the first increasing period, this
451 promotion was similar to that of the structure of material consumption, with both
452 contributions around 2%. During the decreasing period, the contribution of the nitrogen
453 content of materials increased to 3.4 times its starting value, but the overall contribution
454 remained less than 10%. The promotion effect of the material consumption structure
455 decreased continuously, by 2 orders of magnitude. Taken together, the promotion effect
456 of these two factors was small.

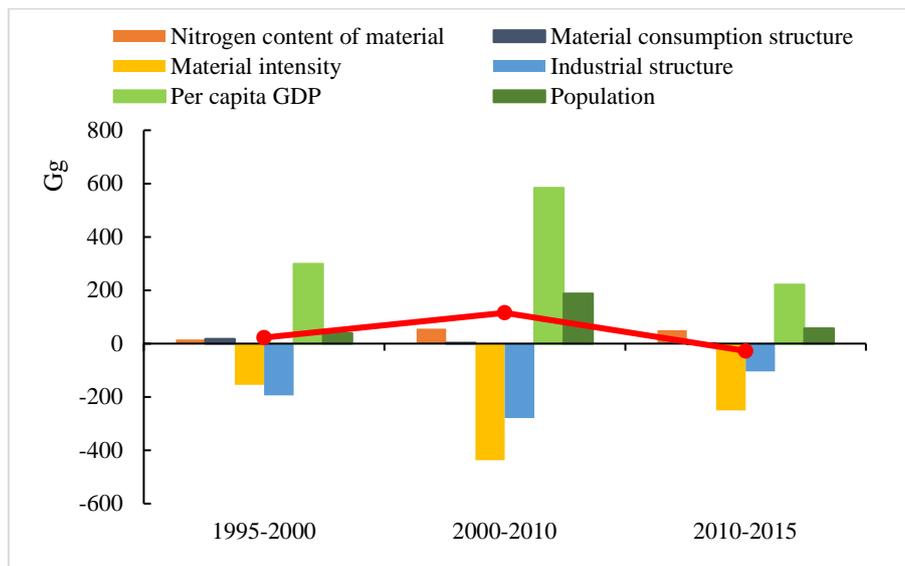
457 The promotion of the intensity effect mainly stems from the effects of per capita
458 GDP, which is related to both population and GDP. However, the GDP growth rate was
459 much larger than the population growth rate, and the ratio of GDP growth to population
460 growth has decreased over time. (The ratio was 11.5% from 1995 to 2000, 10.4% from
461 2001 to 2010, and 5.7% from 2011 to 2015.) The gradual reduction in the strength of
462 this effect can be attributed to the period of the 12th 5-year plan, during which China's
463 economic development was expected to enter a "new normal" period with a gradual
464 slowing of economic growth, accompanied by a focus on adjusting the economic
465 structure and paying more attention to the quality of the economic development. The
466 inhibitory effect of the material intensity factor, which represents the material
467 consumption per unit of GDP, increased mainly because of the increasing material

468 utilization efficiency. From 1995 to 2015, Beijing's energy consumption per unit GDP
469 continued to decline, from 2.344 tce in 1995 to 0.338 tce in 2015 (BMBS, 1996, 2016).
470 Meanwhile, Beijing's government issued a series of planning documents in 2017 to
471 promote the development of high-tech industries such as information technology,
472 integrated circuits, and the production of new energy-efficient automobiles with the
473 goal of promoting scientific and technological innovation and improving material
474 utilization efficiency. Thus, the inhibitory effect of material intensity factors will
475 continue to increase.

476 The decreasing N consumption by Beijing's industrial sector resulted mainly from
477 a change in the city's industrial structure. With the decreasing proportion of industry
478 accounted for by Beijing's primary and secondary industries, the fertilizer nitrogen and
479 feed nitrogen required by Agriculture and Animal Husbandry decreased by 48.9 and
480 9.9%, respectively (Fig. 2a). The energy nitrogen required by industrial production and
481 the inorganic product nitrogen also decreased (Fig. 2a, 3b). With the increasing
482 development of a tertiary industrial sector in the form of a service industry that
483 increased from 52.5% of Beijing's GDP in 1995 to 79.7% in 2015 (BMBS, 1996, 2016),
484 development of industries such as tourism, catering, and public transit would also lead
485 to significant consumption of anthropogenic nitrogen. This can explain the increased
486 consumption of food nitrogen and transportation energy nitrogen, which increased to
487 1.6 and 8.1 times the 1995 level, respectively (Fig. 2a,b). As a result, the strength of the
488 inhibition of Beijing's anthropogenic nitrogen consumption by industrial structure
489 factors decreased steadily, accounting for 26.9% of the inhibition during the first
490 increasing period but only 14.6% during the decreasing period (Table 2, Fig. 4). The
491 contribution of the material nitrogen content was consistently small (<10%), which may
492 be related to the change of the material composition of feed, energy, inorganic products,

493 and inorganic fertilizer. For example, as the standard of living improved due to growth
 494 in per capita GDP, the dietary structure of Beijing's residents underwent great changes.
 495 The proportion of food with a high nitrogen content (meat, eggs, and milk) increased
 496 from 15.5% in 1995 to 41.5% in 2015. The nitrogen content of materials also increased
 497 steadily, as did the corresponding promotion of consumption, resulting in a contribution
 498 of 2.1% in the first increasing period, 3.6% in the second increasing period, and 6.9%
 499 in the decreasing period (Table 2, Fig. 4). The effect of the material consumption
 500 structure was continuously small, accounting for less than 3.0% of the total, and less
 501 than 1.0% during the second increasing period and the decreasing period, which
 502 indicates that the changing material consumption structure had little influence on the
 503 increase of Beijing's anthropogenic nitrogen consumption.

504



505

506 **Fig. 4** Contributions of the factors that affected Beijing's nitrogen consumption from

507

1995 to 2015.

508

509 **4. Discussion**

510 Keeney (1979) proposed that it's essential that we be able to estimate nitrogen
511 inputs, accumulation, and outputs caused by human activities. Subsequent researchers
512 agreed. Vitousek et al. (1997) noted that systems constructed by humans, which differ
513 greatly from natural ecosystems, have greatly affected the global nitrogen cycle.
514 Galloway (1998) noted that the supply of reactive nitrogen in the global terrestrial
515 ecosystem has doubled since 1860 due to human activities, mainly due to increased
516 human demand for food and energy, resulting in extensive nitrogen accumulation.
517 Baker et al. (2001) proposed that a detailed nitrogen budget is the starting point for
518 understanding the nitrogen cycle of agricultural and urban ecosystems. Inputs lead to
519 accumulation and emission, and indicators of anthropogenic nitrogen flows can
520 characterize these flows from the source through consumption and emission, so
521 nitrogen accounting can quantify these flows. Due to the large demand for matter and
522 energy in cities, which function as concentrated areas of human activity, cities have
523 become the world's most concentrated nitrogen sinks (Kaye et al., 2006). At the same
524 time, analysis of the factors that influence anthropogenic nitrogen consumption has
525 become an important tool for guiding efforts to reduce and control nitrogen
526 consumption (Liu et al., 2014). Therefore, we analyzed anthropogenic nitrogen
527 consumption and its structural characteristics in the present study, with the goals of
528 identifying and quantifying the effects of the socioeconomic drivers behind this
529 consumption and providing scientific support for efforts to improve the healthy
530 development of urban ecosystems.

531 Table 3 compares the per capita anthropogenic nitrogen consumption in urban
532 areas between the present study and previous research. The per capita consumption was

533 greater than 32.0 kg annually in the three Chinese studies, including the present study.
534 Only Phoenix had a comparable value, at 29.6 kg annually, and this value was at least
535 8% lower than the Chinese values. Phoenix has only about 20% of Beijing's population,
536 and Phoenix's food, fertilizer, and energy consumption are less than 20% of Beijing's
537 corresponding consumption, resulting in proportionally smaller nitrogen consumption
538 in these categories. Shanghai's per capita anthropogenic nitrogen consumption was the
539 lowest of the Chinese values, at 32.04 kg annually, which is slightly lower than the
540 Chinese average level (32.12 kg annually in 2005). However, the accounting for
541 Shanghai's nitrogen was not as comprehensive as in the present study, since it did not
542 account for inorganic fertilizer nitrogen. The per capita anthropogenic nitrogen
543 consumption in Chinese cities was slightly higher than the global average (about 29.0
544 kg annually), but much higher than the Asian level in 1995 (19.9 kg annually). This is
545 because the level of urbanization in Asian countries is relatively low, leading to lower
546 food and energy nitrogen consumption than the global average. The average per capita
547 anthropogenic nitrogen consumption in Brazil at a national level was comparable to
548 that at a city level in 1995 (30.9 kg annually), but by 2002, it had increased to 53.7 kg
549 annually, which was much higher than the value in any of the other studies. This may
550 be because of Brazil's unique geographical and climatic conditions; the warm climate
551 leads to rapid plant growth and rapid decomposition of organic matter, and the poor-
552 quality soils cannot retain nitrogen, leading to greatly increased need for supplemental
553 nitrogen fertilizer. Even though its population was less than 15% of China's population
554 in 2005, the nitrogen consumption of its agricultural products increased greatly to
555 account for 94% of total nitrogen consumption, which is equivalent to nearly twice the
556 value for China.

557

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559

Table 3 Comparison of per capita anthropogenic nitrogen consumption in different regions of the world.

Area	Source	Time	Annual per capita anthropogenic N consumption (kg)
Global	Galloway et al. (2004)	1990	29.32
	Cui et al. (2013)	2005	28.77
Asia	Galloway & Cowling (2002)	1995	19.92
Brazil	Filoso et al. (2006)	1995	30.86
		2002	53.71
China	Cui et al. (2013)	2005	32.12
Phoenix	Baker et al. (2001)	1996	29.60
Hangzhou	Gu et al. (2009)	2004	34.02
Shanghai	Gu et al. (2009)	2004	32.04
Beijing	Present study	1996	35.82
		2004	34.16

560

561 Food and energy are two important components of the inputs of anthropogenic
562 nitrogen (Galloway et al., 2004). Most of the variation observed in different studies
563 (Table 4) can be attributed to different calculation methods as described below.
564 Therefore, as we collect more and more case studies of nitrogen accounting, it will be
565 useful to recommend standard methods. In 1996, Beijing's consumption of food
566 nitrogen was slightly higher than that in Phoenix (1.2 times) during the same period.
567 This resulted from different calculation methods for the nitrogen content in food. The
568 Phoenix research calculated the nitrogen content based on the amount of protein
569 required by different age groups, whereas the Beijing research calculated the nitrogen
570 content based on the patterns of food consumption and the estimated nitrogen contents

571 of the foods. Beijing's feed nitrogen consumption was more than 3 times that of Phoenix,
572 mainly due to the fact that the Phoenix study only included livestock feed nitrogen for
573 the production of dairy products, whereas the estimate for Beijing also included the
574 nitrogen in livestock and poultry feed for the production of meat, eggs, and dairy.
575 Hangzhou's food nitrogen in 2004 was about 70% of Beijing's value because the
576 Hangzhou research only considered the biological nitrogen fixation of agricultural
577 products, whereas the Beijing research included all food nitrogen consumption in
578 agricultural products, including meat, eggs, and milk, but excluded biological nitrogen
579 fixation. In contrast, the feed nitrogen consumption in Hangzhou was 1.5 times that of
580 Beijing, mainly due to the larger number of livestock in Hangzhou (2.6 times that in
581 Beijing), but the Beijing research also considered the nitrogen content of poultry and
582 fish, decreasing the gap between the two estimates. The populations of the two cities
583 also differed greatly, as Hangzhou's population was only 70% of Beijing's population
584 (HMBS, 2004; BMBS, 2004), and this would also have narrowed the gap. The per
585 capita food nitrogen consumption values for Xiamen, Shanghai, Toronto, and Paris
586 were all more than 1.0 kg annually greater than Beijing's value in the same year, mainly
587 due to the dietary structure of their residents. For instance, the proportion of nitrogen
588 in fish, meat, and eggs (high-nitrogen foods) in Paris was 1.59 times that of Beijing in
589 2006. Moreover, unlike in most studies, the Toronto study calculated the per capita food
590 nitrogen consumption based on protein consumption rather than the total diet.

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Table 4 Comparison of the per capita inputs of food nitrogen, livestock feed

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nitrogen, and energy nitrogen in cities around the world.

City	Source	Time	Urbanization rate (%)	Per capita food N (kg/year)	Per capita feed N (kg/year)	Per capita energy N (kg/year)
Paris	Billen et al. (2012)	2006	-	8.07	-	-
Phoenix	Baker et al. (2001)	1996	77	3.67	1.30	13.46
Toronto	Forkes (2007)	2001	-	6.40	-	-
		2004	-	6.35	-	-
Shanghai	Gu et al. (2012)	2004	81.16	8.33	-	13.78
Hangzhou	Gu et al. (2009)	2004	43.4	3.55	10.0	5.03
Xiamen	Huang et al. (2016)	2008	68.28	7.21	-	16.41
		1996	76.06	4.53	4.30	12.2
Beijing	Present study	2004	79.53	5.08	6.86	13.06
		2006	84.33	5.16	5.05	14.25
		2008	84.9	5.18	3.37	14.58

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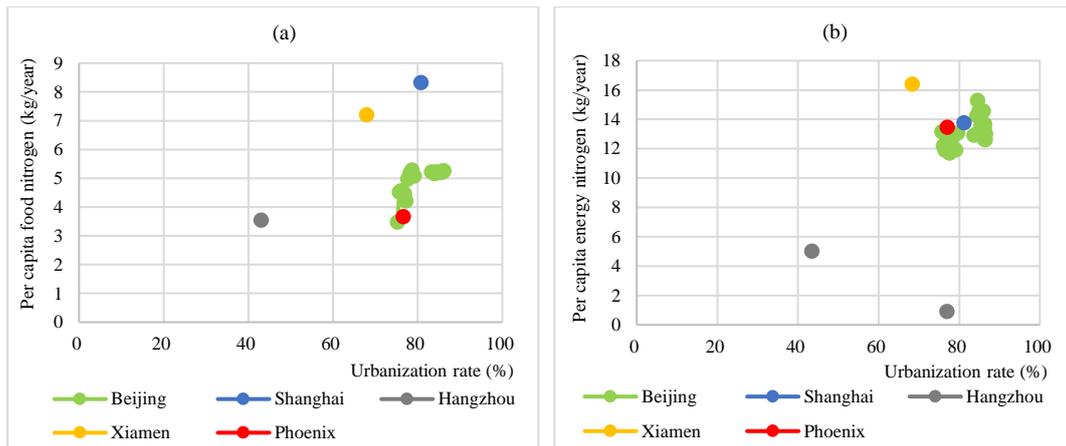
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In most cities, the per capita consumption of energy nitrogen was between 12 and 17 kg annually (Table 4). Hangzhou was the only exception, with a per capita energy nitrogen consumption only 40% of that in Beijing, whereas Shanghai had a slightly higher value than Beijing, at 1.06 times that of Beijing. These differences relate to differences in the energy consumption structure of each city. In 2004, the consumption of high-nitrogen oil accounted for 7.0% of Beijing's total energy consumption, at nearly double the proportion in Hangzhou (3.9%) (HMBS, 2004; BMBS, 2004). However, the consumption of low-nitrogen raw coal accounted for a large proportion of the total for Hangzhou (89.1%), resulting in a much lower per capita energy nitrogen consumption. Although Beijing's proportion of energy provided by oil was only 17% of the proportion in Shanghai, the proportion of high-nitrogen coke was much higher in Beijing (32.2% of the total, equivalent to 1.3 times the proportion in Shanghai, at 24.4%), greatly

611 reducing the gap in per capita energy nitrogen consumption. The per capita
612 consumption of energy nitrogen in Xiamen in 2008 was higher than in any other city,
613 at 16.41 kg annually, but the total energy nitrogen consumption was less than 20% of
614 that in Beijing during the same period, largely because Xiamen's population in 2008
615 was less than 20% of Beijing's population. These two effects compensated for each
616 other to some extent, thereby reducing the gap between the two cities.

617 Beijing's per capita food nitrogen consumption increased noticeably when the
618 urbanization rate was between 76 and 80%, whereas the per capita energy nitrogen
619 consumption increased noticeably at an urbanization rate of 80 to 86%, peaking at an
620 urbanization rate of 84.5% (Figure 5). At similar urbanization levels, Beijing's per
621 capita food and nitrogen consumption were lower than those of Xiamen and Shanghai,
622 but higher than that of Phoenix. Consumer-dominated cities such as Shanghai and
623 Xiamen can learn from the government regulations designed to slow and then reverse
624 Beijing's urbanization rate and per capita nitrogen consumption, as well as from the
625 city's energy consumption structure. Combining the results of the Hangzhou study (Gu
626 et al., 2009) with the present results suggests that with an increasing urbanization rate,
627 the per capita nitrogen consumption increased, but that the magnitude of the increase
628 differed among the urbanization levels. For example, when Hangzhou's urbanization
629 rate increased from 25.0% to 43.4%, the per capita food and energy nitrogen
630 consumption increased by about 0.06 kg annually for every 1% increase in urbanization
631 rate (Gu et al., 2009). In contrast, when Beijing's urbanization rate increased from 83.6%
632 to 86.5%, the per capita food nitrogen consumption increased by 0.12 kg/year for each
633 1% increase in urbanization, whereas the per capita annual consumption of energy
634 nitrogen increased by 0.03 kg/year.

635



636

637 **Fig. 5.** Comparison of (a) per capita food nitrogen and (b) energy nitrogen input in
 638 each city. Data and their sources are shown in Table 4.

639

640 In previous research on the factors that influenced nitrogen consumption, analysis
 641 based on the LMDI method was divided into scale, structure, and intensity effects. The
 642 scale effects usually led to increased nitrogen consumption and emission (Liu et al.,
 643 2014). The economic scale factor was the main factor responsible for consumption and
 644 emission of anthropogenic reactive nitrogen, and the contribution was usually greater
 645 than 40% (Jia et al., 2017; Wang, 2017). This high proportion is determined by the
 646 economic development needs of these artificial systems. Our findings support these
 647 conclusions, as the scale effect always drove the growth of Beijing’s anthropogenic
 648 nitrogen consumption (accounting for 5 to 12% of the total contribution). This is
 649 because we chose population as the size factor, and the economic scale was implicit in
 650 our choice of the per capita GDP factor. The per capita GDP was also the main factor
 651 (an intensity factor) driving the growth of Beijing’s anthropogenic nitrogen
 652 consumption, accounting for more than 32% of the total during the study period.

653 In addition, most studies suggested that technological effects (Ding et al., 2017)
 654 and intensity effects (Lei et al., 2012) inhibited the growth of nitrogen consumption and
 655 emission, whereas the material intensity factor in the present study also showed high

656 inhibition, accounting for more than 20% of the total. The direction of structural effects
657 in previous research was usually divided into phases in which the change either
658 promoted or inhibited consumption of reactive nitrogen (Wang, 2017), whereas the
659 industrial structural effect observed in the present study consistently inhibited the
660 growth of Beijing's anthropogenic reactive nitrogen consumption. This has resulted
661 from the government's adjustment of Beijing's industrial structure to create a shrinking
662 proportion of industries with high nitrogen consumption. This approach may be unique
663 to Beijing's political and cultural status and may not be possible in all cities.

664 In view of the current situation of nitrogen consumption in Beijing and the main
665 driving factors, our analysis suggests several possible policy recommendations. First,
666 the government should continue its efforts to reduce the city's population and reduce
667 the excessive resource consumption and environmental pollution caused by economic
668 development. Because Beijing's government has realized the harm caused by the recent
669 rapid population growth, and implemented a series of control measures, the city's
670 population growth has slowed during the past 5 years, and the population's promotion
671 of anthropogenic nitrogen consumption growth has decreased (Figure 4). For example,
672 on 11 August 2016, Beijing implemented a points-based household registration system
673 to further strengthen population control. However, since Beijing is China's capital and
674 since the population is so high, it will be difficult to decrease the population. Therefore,
675 we predict that population will continue to drive the growth of anthropogenic nitrogen
676 consumption in Beijing for many years, although the strength of its promotion of
677 nitrogen consumption will gradually decrease. Another future challenge is to scale up
678 the recommendations for Beijing to a global population, if we want to gain control over
679 nitrogen management.

680 In addition, in recent years, Beijing's attempts to develop a "circular" recycling

681 economy and high-end tertiary industries have achieved good environmental benefits.
682 The promotion of Beijing's anthropogenic nitrogen consumption by per capita GDP has
683 weakened (Table 2, Figure 4). Therefore, it is necessary to adhere to the “3R” principle
684 of a circular economy (reduce, reuse, recycle) and improve the material utilization
685 efficiency to reduce anthropogenic nitrogen consumption and the associated nitrogen
686 pollution. It is worth noting that in order to slow Beijing's economic development and
687 reduce the population pressure on its environment, China’s national government
688 officially established the Xiong’an New Area on 1 April 2017. This area will support
689 functions other than those related to national government. With the completion of this
690 separate area of the capital region, we expect that the promotion of anthropogenic
691 nitrogen consumption by per capita GDP and population will be greatly reduced.
692 Therefore, accelerating the move of Beijing residents to the Xiong'an New Area will
693 begin to mitigate the problem of nitrogen consumption in Beijing.

694 **5. Conclusion**

695 In this study, we used empirical coefficients to represent the nitrogen contents of
696 the materials consumed by Beijing’s urban system, and used statistical analysis to
697 determine the quantities of these materials from 1995 to 2015. Multiplying the two
698 values quantified Beijing’s anthropogenic nitrogen consumption and let us analyze the
699 changes of the consumption structure, thereby providing a deeper understanding of the
700 city’s consumption of anthropogenic reactive nitrogen. These results provide
701 important data to support efforts to control the city’s nitrogen consumption. The LMDI
702 method let us quantify the magnitude and direction of the impact of the socioeconomic
703 drivers on Beijing’s total nitrogen consumption, and provided important decision
704 variables to guide control measures for urban nitrogen consumption. For example, the

705 government's decision to replace primary and secondary industries with tertiary
706 industries greatly reduced the energy nitrogen consumption, and such forms of
707 management could be applied in other cities with a high energy nitrogen consumption.
708 Our results therefore demonstrate the usefulness of this method due to its ability to
709 reflect the changing characteristics of urban nitrogen consumption and the impacts of
710 human activities on this consumption. However, such efforts must be managed so that
711 they do not only move a problem to a new location. The adage of "think globally, act
712 locally" apply as we address nitrogen management at a global level. For example,
713 inefficient older technologies should be replaced by newer and more efficient
714 technologies that reduce nitrogen consumption and the associated pollution.

715 We found that Beijing's anthropogenic nitrogen consumption increased steadily
716 from 1995 to 2010, and then decreased steadily, mainly due to changes in consumption
717 of energy nitrogen, food nitrogen, and inorganic fertilizer nitrogen. The changes in
718 consumption of energy nitrogen, which accounted for more than 33% of the total
719 throughout the study period, had the greatest impact on the total consumption. Food
720 nitrogen continued to increase, reaching more than 20% of the total, whereas inorganic
721 fertilizer nitrogen decreased below 20% of the total. Beijing's increasing per capita
722 GDP greatly increased anthropogenic nitrogen consumption, accounting for more than
723 30% of the total, and the promotion effect of the material consumption structure
724 decreased by two orders of magnitude, reaching only 0.02% by the end of the study
725 period, whereas the inhibition that resulted from changes in the industrial structure
726 remained greater than 15% of the total. The inhibitory effect of the material intensity
727 on nitrogen consumption has been greater than 20% and continues to increase.

728 There are still some shortcomings in our research. Due to data limitations, we used
729 interpolation to estimate some missing data. The accuracy of the data also needs to be

730 improved. For example, the consumption of certain chemical substances in some years
731 was not available. We estimated the anthropogenic nitrogen consumption for these
732 missing chemical substances in combination with the proportion of population in
733 Beijing. There is also inadequate data for the city's recycling system. If the actual
734 chemical consumption data can be obtained through future empirical research, then
735 the accuracy of the results will improve. In addition, in terms of our analysis of the
736 factors that influence nitrogen consumption, our factor decomposition model
737 considered only six factors for which comprehensive data were available. If more
738 detailed data can be collected on additional factors, then the impact of factors such as
739 the industrial structure could be refined to account for more industrial sectors and more
740 types of nitrogen-containing materials, thereby providing finer resolution and deeper
741 insights into the structural characteristics of each sector and each category of materials.
742 This would let us establish a more detailed model that could be used to compare the
743 development characteristics of various cities, thereby improving our ability to
744 understand differences in the processes that drive urban ecological development.
745 Given the importance and frequency with which such studies are being conducted, we
746 also promote transparency and consistency of methods and data collection to make for
747 easier comparison of the various case studies. This improved data would also provide
748 greater support for efforts to identify industries with the greatest consumption of
749 nitrogen so that efforts could be made to reduce their nitrogen consumption.

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