



1 **Shifting patterns of Ozone Season due to policy and human activity in Beijing**
2 **between 2013 and 2023**

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9 **Abstract:** Since 2013, Beijing has implemented a series of stringent measures to control air
10 pollution, resulting in significant improvements in air quality. This study analyzed the variations
11 in ozone pollution in Beijing over the past decade, focusing on the influence of human activities
12 and environmental management policies from 2013 to 2023. Over this period, the duration of the
13 Ozone Season in Beijing has prolonged, with the onset of ozone pollution occurring earlier and
14 its cessation extending later during the year. Additionally, there has been a rise in the low
15 percentile concentrations of the maximum 8-hour moving average of ozone (MDA8), and the
16 overall exposure time to ozone has shifted to later over the years. While diurnal peak
17 concentrations during the Ozone Season have decreased, trough concentrations have increased,
18 resulting in a more subdued diurnal variation. Furthermore, both the maximum generation and
19 consumption rates of ozone have decreased in absolute terms, with the maximum generation rate
20 showing a tendency to occur earlier in the day. To better protect human health and enhance the
21 effectiveness of environmental policies, it is essential to closely monitor the evolving patterns of
22 urban ozone pollution.

23 **Keywords:** Ozone Season, exposure time, generation rate, ozone percentile concentration,
24 diurnal variation.

25 **Highlights:**

- 26 1. The Ozone Season in Beijing prolonged.
27 2. Summertime ozone exposure extends into the nighttime.
28 3. Both diurnal production and destruction rates dropped

29 **1.Introduction**

30 Urban ozone poses a significant threat to public health, with long-term exposure to elevated
31 ground-level ozone increasing the risks of respiratory, cardiovascular, and other
32 diseases(Nuvolone et al., 2018; Crouse et al., 2015; Zhang et al., 2019; Wang et al., 2020b; Liu
33 et al., 2018). Ozone formation is influenced by precursor pollutants, including volatile organic
34 compounds (VOCs) and nitrogen oxides (NOx), primarily originating from urban industrial and
35 traffic emissions. Climate conditions also play a crucial role in long-term ozone trends.(Sitch et
36 al., 2007; Bais et al., 2018; Bernhard et al., 2023).



37 Beijing, the capital of China, is located in the northern North China Plain and has a
38 population of nearly 22 million. As a major northern megacity and international metropolis,
39 environmental quality in Beijing has garnered substantial attention. (Huang et al., 2017; Qiang
40 and Hu, 2022; Li et al., 2020; Streets et al., 2007). Since 2013, the city has implemented
41 comprehensive governance measures to combat air pollution(Li et al., 2020; Wen et al., 2021;
42 Wang et al., 2023), achieving significant results acknowledged by the United Nations
43 Environment Programme as the “Beijing Miracle.” (Programme, 2019) However, improvements
44 in ozone concentrations have been less pronounced than those for other pollutants like PM_{2.5},
45 and the interannual variability of ozone levels suggests that addressing ozone pollution presents
46 greater challenges.

47 Amid these pollution control efforts, notable changes in the volume and composition of
48 atmospheric pollutant emissions have occurred in Beijing and its surroundings(Zhang et al., 2016;
49 Xue et al., 2020; Li et al., 2017; Wu et al., 2023). Thus, examining ozone variations over the past
50 decade is critical for evaluating the effectiveness of these measures.

51 Previous research on ozone in Beijing has primarily focused on the summer months(Xu et
52 al., 2011; Wang et al., 2020a; Zhang et al., 2021; Zhao et al., 2018), despite ozone pollution
53 occurring year-round, typically from March to October, with notable activity in spring and
54 autumn(Chen et al., 2019; Wang et al., 2020c; Wang et al., 2015).. Given the substantial
55 interannual variability in ozone levels, analyzing long-term trends can enhance our
56 understanding of overall changes in ozone concentrations. This study introduced the concept of
57 the Ozone Season to differentiate periods of concentrated ozone pollution across various years
58 and to facilitate analysis of its long-term trends.

59 The Ozone Season was first defined in North American studies(Cox and Shao-Hang, 1996),
60 where it was identified as June to September for northern cities and May to October for southern
61 cities. Notably, Carl (Cardelino et al., 2001)indicated that the typical Ozone Season in the U.S.
62 spans early May to the end of September, while Qin(Qin et al., 2004) defined it for Southern
63 California as June to October. In China, studies have generally referred to the warm season
64 (April to September) in analyzing ozone pollution(Lu et al., 2020; Li et al., 2021b; Gao et al.,
65 2021). However, due to regional variations, the duration of ozone pollution differs. In northern
66 cities of China, ozone pollution typically occurs from April to September, whereas in southern
67 cities like Guangzhou and Chengdu, it may extend to October or even November and
68 December(Wang et al., 2017; Li et al., 2021a; Wang et al., 2022). As a result, the warm season
69 does not fully encompass ozone pollution events across different areas. Thus, the Ozone Season
70 is defined as the months when ozone generation is most active, making it more suitable for
71 studying regional characteristics of ozone pollution.

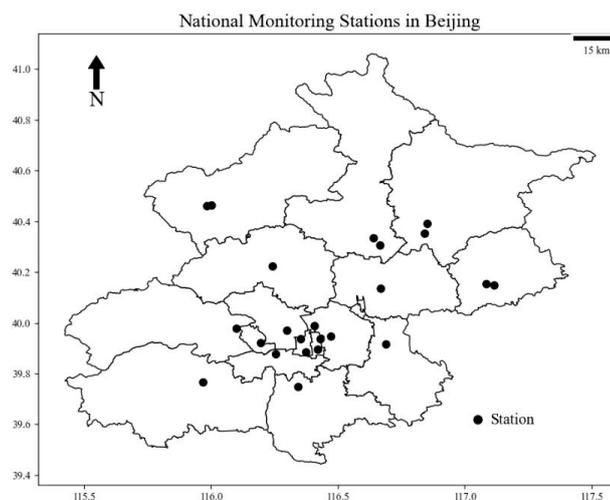
72 According to China’s Ecological Environment Department, a day is designated as an ozone
73 pollution day when the 8-hour moving average (MDA8) exceeds 160 $\mu\text{g m}^{-3}$ (生态环境部, 2012).
74 Based on this standard, this study defined the Ozone Season as the period from the first to the
75 last MDA8 pollution event. Utilizing ground-level ozone monitoring data from Beijing between
76 2013 and 2023, this research examined changes in the Ozone Season and the long-term trends in
77 ozone generation and consumption, evaluating the impact of pollution control strategies on
78 ozone pollution.

79 2. Data and methods



80 2.1 Data instruction

81 This study utilized daily and hourly ozone data from Beijing for the period 2013 to 2023,
82 obtained from the Beijing Municipal Ecological and Environmental Monitoring Center
83 (<http://zx.bjmemc.com.cn/timestamp=1693966844922>). Ozone concentrations were measured
84 using the Thermo-Fisher 49C ozone analyzer, which employs ultraviolet photometry to convert
85 measurements into standard mass concentration units ($\mu\text{g m}^{-3}$). Data was collected from 23
86 national monitoring stations strategically located to represent densely populated urban and
87 suburban areas. Hourly ozone levels for the city were calculated as the arithmetic mean of
88 measurements from these stations, with the maximum 8-hour moving average (MDA8) derived
89 from the highest hourly values. All measurements complied with the environmental air quality
90 standards (GB3095-2012) established by China's Ministry of Ecology and Environment.



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Figure 1 Spatial distribution of Beijing stations

93 2.2 Research methods

94 According to the standards set by China's Ministry of Ecology and Environment, days when
95 the daily maximum 8-hour average (MDA8) exceeded $160 \mu\text{g m}^{-3}$ were classified as ozone
96 pollution days. This research analyzed the trends in the first and last pollution days to determine
97 the duration of the Ozone Season based on the interval between these two dates. Additionally,
98 the study examined ozone level changes on typical pollution days over the past decade to
99 understand shifts in ozone generation and consumption in Beijing.

100 Typical ozone days were selected to evaluate the impact of specific weather events, such as
101 precipitation, strong winds, or overcast conditions, on daily ozone levels. Days with more than 0
102 mm of precipitation or wind speeds exceeding 5 m/s for more than two hours were excluded
103 from the analysis. After adjusting to weather effects, the proportion of typical ozone days during
104 the Ozone Season from 2013 to 2023 ranged from 54.3% to 76.7%. The year 2021 recorded the
105 shortest Ozone Season and the lowest effective data rate after accounting for weather exclusions.



106 By utilizing the remaining hourly ozone data, trends in typical diurnal variations in ozone levels
 107 were analyzed over the years

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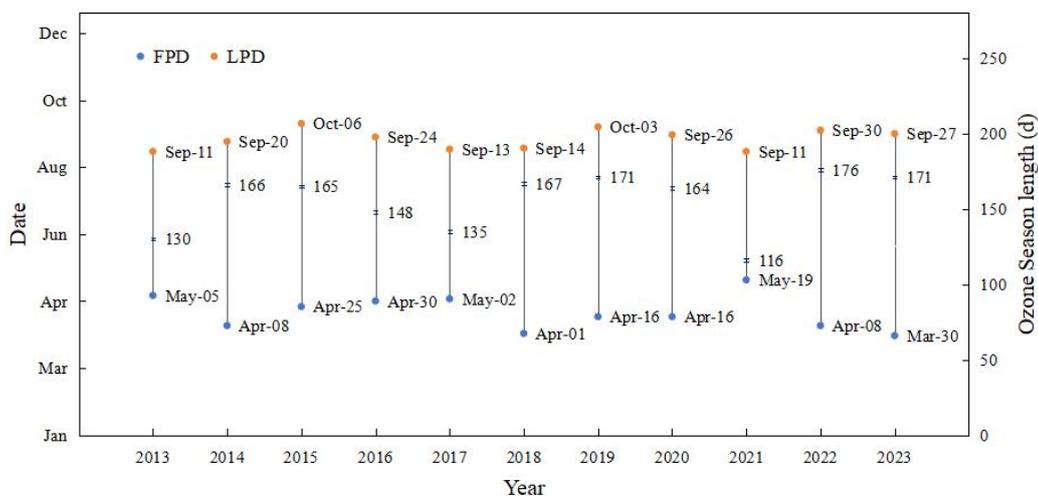
Table 1 Proportion of effective typical ozone days in Ozone Season from 2013 to 2023

Year	2013	2014	2015	2016	2017	2018	2019	2020	2021	2022	2023
Valid days	72	111	95	107	91	115	123	107	63	135	131
Total days	130	166	159	150	135	167	168	166	116	176	180
Effective rate (%)	55.4	66.9	59.7	71.3	67.4	68.9	73.2	64.5	54.3	76.7	72.8

110 **3. Results and discussion**

111 **3.1 Changes in the Ozone Season in Beijing**

112 Over the past decade, the date of the first pollution event has shifted to an earlier time in the
 113 year. Figure 2 illustrates the variations in the Ozone Season in Beijing from 2013 to 2023. Here,
 114 FPD denotes the first ozone pollution day of the year, marking the beginning of the Ozone
 115 Season, while LPD represents the last ozone pollution day, indicating the season's conclusion.
 116 The secondary axis displays the duration of the Ozone Season. Analysis shows that this event
 117 typically occurs between March and May. In 2023, the earliest date was March 30, while in 2021,
 118 the latest occurrence was on May 16. April has the highest frequency of first pollution days,
 119 totaling seven days, which accounts for 66% of all recorded pollution days. May follows with
 120 three days, and only one day was recorded in March. This trend reveals that the date of the first
 121 pollution event has advanced from May 5, 2013, to March 30, 2023, indicating an average shift
 122 of 38 days over 11 years, or approximately 1.38 days earlier each year.



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124 Figure 2 Changes in Beijing Ozone Season from 2013 to 2023

125 In contrast, the date of the last pollution event in Beijing has been delayed over the same
 126 period. The final pollution occurrences are recorded between September and October, with the



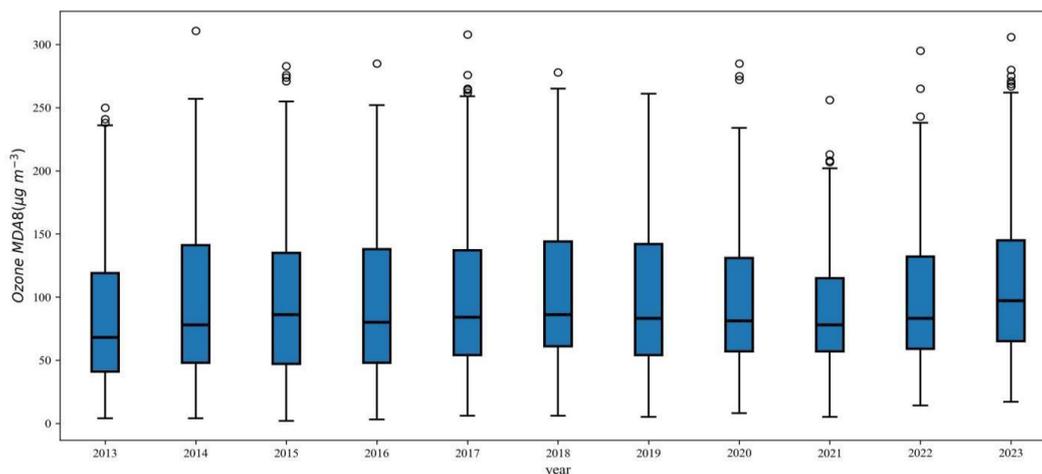
127 earliest date on September 11, 2013, and the latest on October 6, 2015. Unlike the first pollution
128 days, there is significantly less variability in the timing of the last pollution days, with 88%
129 occurring in September. The last pollution date has been postponed from September 11, 2013, to
130 September 27, 2023, representing a delay of 16 days and an average trend of 0.63 days per year,
131 which is slower than the trend observed for the first pollution event.

132 Furthermore, the duration of the Ozone Season in Beijing has increased over the past
133 decade. This season, defined as the interval between the first and last pollution days. It has
134 ranged from 116 to 176 days, with an average length of 155 days. The length of the Ozone
135 Season has varied significantly from year to year, with 2021 being the shortest and 2022 being
136 the longest. The earlier occurrence of the first pollution event and the later occurrence of the last
137 pollution event have collectively extended the Ozone Season by an average of 2.0 days per year,
138 which represents approximately 1.3% of the average season length.

139 Currently, international research has primarily focused on the characteristics of ozone
140 concentration (Chen et al., 2020; Yin et al., 2017; Cao et al., 2024), with insufficient studies
141 addressing the long-term changes in the duration of the Ozone Season. As the Ozone Season
142 represents a period of heightened ozone pollution, its extension poses additional health risks to
143 the population, necessitating greater attention to the impacts of ozone over extended periods. The
144 prolongation of the Ozone Season may be linked to climate change and alterations in pollutant
145 emission patterns (Schnell et al., 2016; Doherty et al., 2013; Sicard, 2021).

146 **3.2 Changes in MDA8 percentile concentrations in Beijing**

147 To examine the distribution characteristics of MDA8 concentrations across different years,
148 box plots for the period from 2013 to 2023 were generated. Fig. 3 illustrates the minimum, 25th
149 percentile, mean, median (50th percentile), 75th percentile, and maximum distributions of
150 MDA8 for each year. The mean MDA8 concentrations fluctuated between 85 and 111 $\mu\text{g m}^{-3}$,
151 with the lowest recorded in 2013 and the highest in 2023. This demonstrates considerable year-
152 to-year variability and an overall upward trend, averaging an increase of 0.94 $\mu\text{g m}^{-3}$ per year.
153 Notably, the outlier year of 2021 had a mean concentration of 87 $\mu\text{g m}^{-3}$, representing the second
154 lowest value during this period.



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Figure 3 Beijing day MDA8 box diagram from 2013 to 2023

157 Over the past decade, the lower percentile concentrations of MDA8 in Beijing have also
 158 increased. Specifically, the minimum MDA8 concentrations rose from $4 \mu\text{g m}^{-3}$ in 2013 to $14 \mu\text{g m}^{-3}$
 159 m^{-3} in 2023, reflecting a growth of 225% with an average increase of $1.11 \mu\text{g m}^{-3}$ per year.
 160 Similarly, the 25th and 50th percentile MDA8 concentrations increased by $24 \mu\text{g m}^{-3}$ and $31 \mu\text{g m}^{-3}$,
 161 m^{-3} , respectively, with growth rates of $1.94 \mu\text{g m}^{-3}$ per year and $1.30 \mu\text{g m}^{-3}$ per year. This rise in
 162 lower percentile concentrations suggests an increase in background ozone levels and an
 163 enhancement of atmospheric oxidizing capacity.

164 In contrast, high percentile MDA8 concentrations have exhibited no significant changes
 165 over the years. The maximum MDA8 concentration recorded was $311 \mu\text{g m}^{-3}$ in 2014, while the
 166 minimum was $256 \mu\text{g m}^{-3}$ in 2021. Fluctuations in the maximum and 75th percentile MDA8
 167 concentrations demonstrated weak trends over time, likely influenced by substantial variability in
 168 meteorological conditions. Notably, the 90th percentile MDA8 concentration has shown a
 169 declining trend of approximately $-2.45 \mu\text{g m}^{-3}$ per year. The correlation of changes in high-
 170 percentile ozone concentrations over the years has been relatively weak, possibly due to the
 171 significant impact of interannual meteorological fluctuations on high ozone values. This results
 172 in less pronounced long-term trends compared to lower concentration percentiles.

173 Recent studies have indicated that low percentiles (below the 25th percentile) of ozone
 174 concentrations have increased globally across all regions, while high percentiles (above the 75th
 175 percentile) have decreased in North America and Europe, with an overall increase noted in the
 176 Southern Hemisphere and Japan(Christiansen et al., 2022). Yan's research (Yan et al., 2018) also
 177 identified an increase in the 5th percentile of ozone concentrations in Europe, alongside a rise in
 178 the 95th percentile. Chen's study(Chen et al., 2020) on Beijing reported an upward trend in the
 179 10th and 25th percentile low concentrations since 2013, aligning with these global findings.
 180 However, changes in high-percentile concentrations in Beijing were found to be insignificant. As
 181 many studies have suggested, the observed rise in low percentile concentrations across various
 182 global regions may be linked to decreased emissions of ozone precursor substances, along with
 183 contributions from high-altitude ozone transport. The overall increase in average concentrations

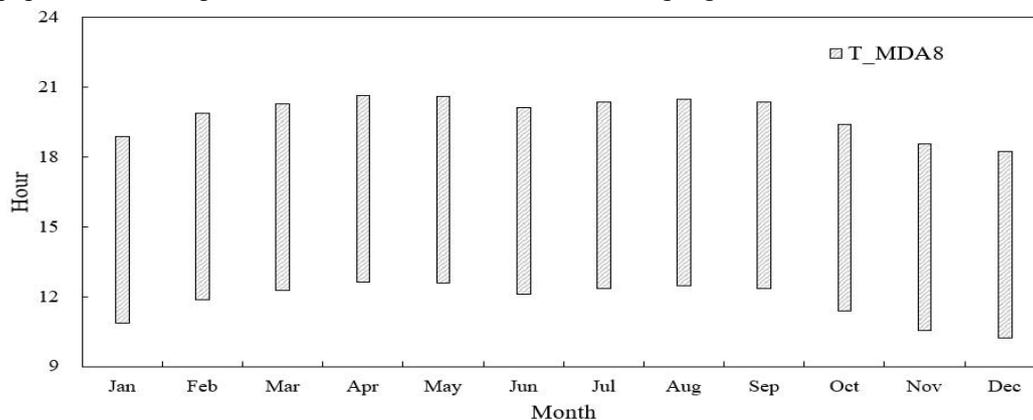


184 may indicate a worsening trend in ozone pollution, potentially connected to broader global
 185 climate changes that enhance ozone transport and create more favorable conditions for ozone
 186 generation under higher temperatures.

187 3.3 Changes in ozone exposure time in Beijing

188 In recent years, urban ozone pollution has posed a persistent threat to human health, with
 189 the maximum daily average of ozone (MDA8) during the warm season widely used to assess
 190 outdoor ozone exposure levels (Lu et al., 2018; Niu et al., 2022; Byun et al., 2022). Analyzing the
 191 temporal distribution of ozone MDA8 over the course of a day (referred to as ozone MDA8
 192 duration or exposure time, denoted as t_1 , t_2 , ..., t_8) can effectively provide health risk warnings
 193 for sensitive populations.

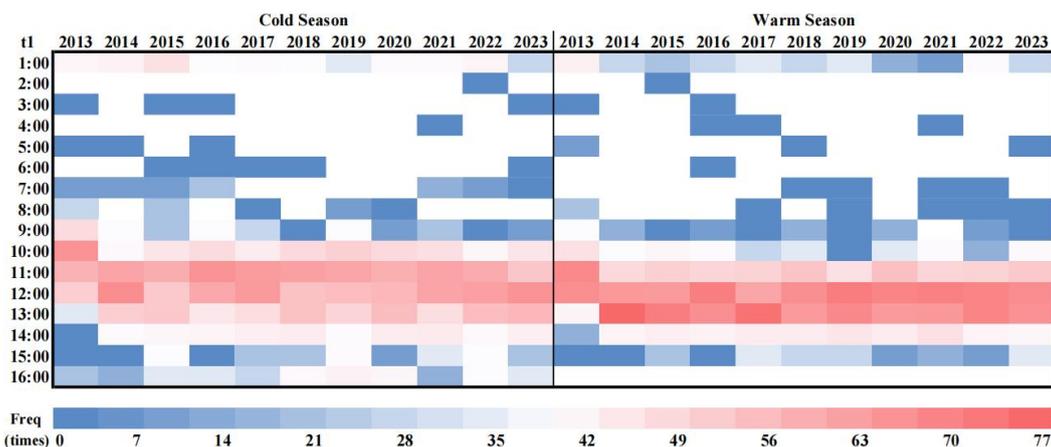
194 Fig. 4 reveals significant differences in ozone exposure time (T_{MDA8}) between the cold
 195 and warm seasons in Beijing. From November to January, the ozone exposure period ranges
 196 from 11:00 to 19:00. As temperatures rise, this exposure window shifts, with the duration
 197 extending from 14:00 to 21:00 during the months of April to September. This indicates that
 198 populations are exposed to elevated ozone levels even during nighttime in the warm season.



199

200 Figure 4 Average duration of MDA8 ozone in Beijing by month from 2013 to 2023

201 Over the years, there has been a noticeable trend of delayed ozone exposure times during
 202 the cold season (October to March). The starting time (t_1) of ozone exposure shifted from
 203 primarily occurring between 10:00 and 11:00 in 2013 to a new window of 12:00 to 13:00 by
 204 2023, indicating a postponement in the occurrence of high-concentration ozone during the cold
 205 season, as shown in Fig. 5. A similar trend is observed in the warm season, where the starting
 206 time (t_1) shifted from 11:00-12:00 in 2013 to 12:00-13:00 in 2023. However, this delay is less
 207 pronounced compared to that in the cold season, as shown in Fig. 7a.



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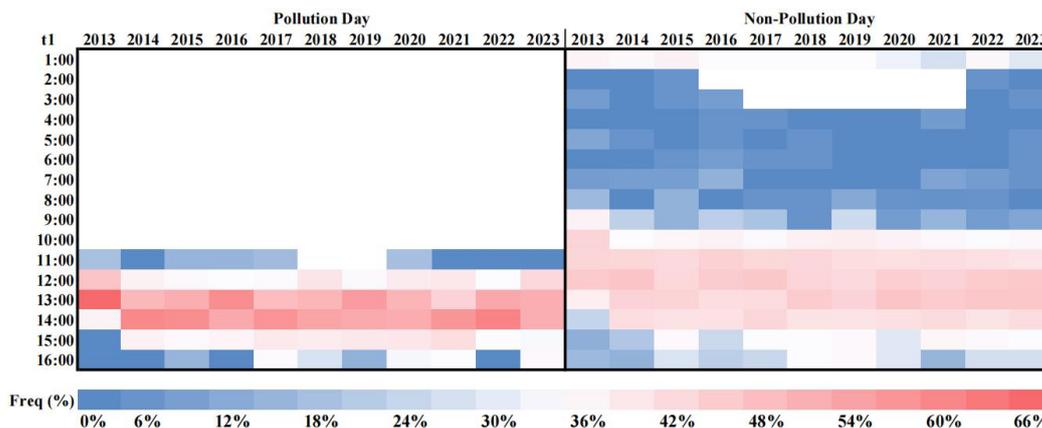
Figure 5 Variation in ozone exposure times (t_1) during the cold season and warm season from 2013 to 2023. The heatmap characterizes the frequencies of t_1 occurrences at different times over these years.

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This postponement of ozone exposure times suggested a delay in the generation of high ozone levels over the years, which may extend the impact on human health into the nighttime hours. Currently, there is a lack of long-term studies on ozone exposure times in China. The variations in ozone exposure time in Beijing were influenced by changes in local ozone generation characteristics, highlighting the importance of understanding these dynamics for evaluating the effectiveness of pollution control policies in addressing ozone levels in the city.

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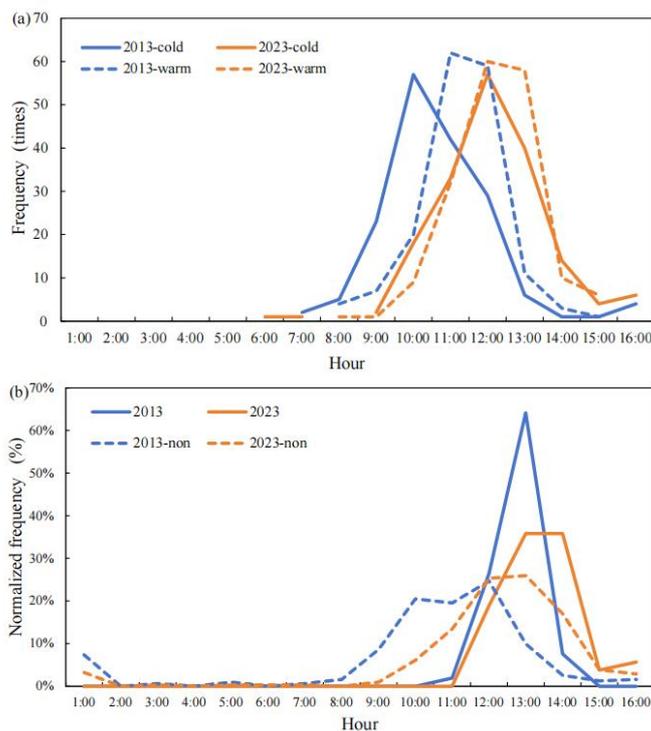
There were significant differences in ozone exposure times between pollution days (MDA8 exceeds $160 \mu\text{g m}^{-3}$) and non-pollution days. Because the number of pollution days in a year is much lower than that of non-pollution days, we normalized the frequency distribution to obtain normalized frequencies (expressed as a percentage), as shown in Fig.6. On pollution days, the starting time (t_1) of ozone exposure ranges from 11:00 to 16:00, with a peak occurring between 13:00 and 14:00. In contrast, on non-pollution days, the starting time (t_1) spans from 1:00 to 16:00, with the majority occurring between 10:00 and 15:00. This indicates that ozone exposure time on pollution days is more concentrated, primarily occurring from the afternoon to the evening. This time frame is critical for implementing protective measures for sensitive populations.



229

230 Figure 6 Variation in ozone exposure times (t_1) on pollution and non-pollution days from 2013
231 to 2023. The heatmap characterizes the normalized frequencies of t_1 occurrences at different
232 times over these years.

233 Over the years, there has been a noticeable delay in the starting time (t_1) of ozone exposure
234 on non-pollution days, shifting from 10:00-12:00 in 2013 to 11:00-14:00 in 2023. In contrast,
235 changes in t_1 on pollution days are relatively minor, as shown in Fig.7b. This may be attributed
236 to the significant influence of meteorological factors, particularly temperature, on ozone
237 generation during pollution days. Since pollution days predominantly occur in the warm season,
238 the timing of high temperatures tends to be more consistent, resulting in a more fixed ozone
239 generation period.



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241 Figure 7 Distribution frequencies of t1 in cold season and warm season for 2013 and 2023(a),
242 and distribution normalized frequencies of t1 in pollution days and non-pollution days(b)

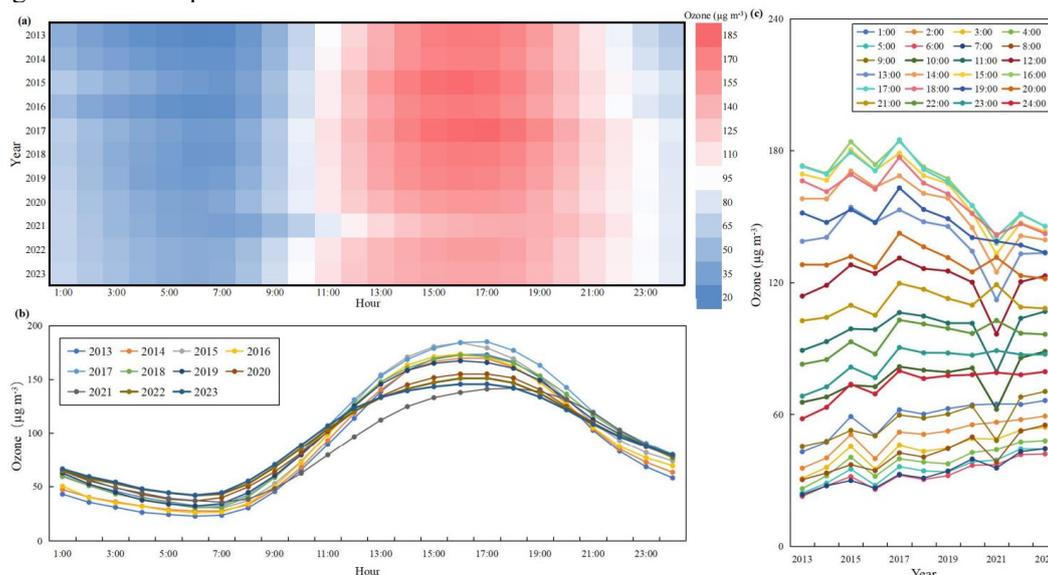
243 3.4 Diurnal variation of Ozone Season in Beijing

244 Based on hourly ozone data with meteorological influences removed during the Ozone
245 Season, typical diurnal variation patterns of ozone from 2013 to 2023 were analyzed. Each year's
246 diurnal variation in ozone levels displayed a clear unimodal pattern. It began at 01:00 with
247 decreasing ozone concentrations, reaching a low point between 06:00 and 07:00. The levels then
248 rose to a peak occurring between 16:00 and 18:00, followed by a decline, as shown in Fig. 8a
249 and 8b).

250 The analysis revealed a decreasing trend in peak ozone concentrations, accompanied by a
251 delay in their occurrence. In contrast, trough concentrations showed an increasing trend, which
252 occurred earlier over the same period. From 2013 to 2023, peak ozone concentrations during the
253 Ozone Season ranged from 137.8 to 184.5 $\mu\text{g m}^{-3}$, with a declining trend in diurnal peak values
254 at a rate of 3.6 $\mu\text{g m}^{-3}$ per year. Peak values typically occurred between 16:00 and 18:00, with a
255 noticeable delay over the years. Between 2013 and 2020 (excluding 2017), peak concentrations
256 were consistently recorded at 16:00, whereas from 2021 to 2023, they shifted to between 17:00
257 and 18:00. Trough values ranged from 23 to 42 $\mu\text{g m}^{-3}$, exhibiting an increasing trend at a rate of
258 1.7 $\mu\text{g m}^{-3}$ per year, with trough times occurring between 06:00 and 07:00. Notably, the trough
259 time shifted to 06:00 from 2017 to 2023 (excluding 2021).



260 A notable observation was that ozone concentrations decreased during the day and
 261 increased at night. The annual variation curves of hourly ozone concentrations (Fig. 8c) indicated
 262 a significant declining trend during the high-value period from 13:00 to 15:00 ($R = -0.54$ to -
 263 0.80), with the most substantial average decrease occurring at 16:00, averaging $3.7 \mu\text{g m}^{-3}$ per
 264 year. This trend remained consistent, except for some anomalous values recorded in 2021.
 265 Conversely, an increasing trend in ozone concentrations was observed during other periods,
 266 particularly during the low-value period from 22:00 to 09:00 ($R = 0.78$ to 0.94), with an average
 267 increase at 08:00 of $2.2 \mu\text{g m}^{-3}$ per year. This trend indicates a reduction in the difference
 268 between peak and trough ozone values throughout the day, decreasing from $150 \mu\text{g m}^{-3}$ in 2013
 269 to $104 \mu\text{g m}^{-3}$ in 2023, averaging a decline of $5.30 \mu\text{g m}^{-3}$ per year. The diurnal variation of
 270 ozone appears to be diminishing, suggesting a weakening of both daytime ozone generation and
 271 nighttime consumption.



272
 273 Figure 8 The diurnal variation of ozone in Beijing during the Ozone Season from 2013 to 2023
 274 (a. an hourly color chart, b. a diurnal variation curve chart, c. a yearly variation chart of hourly
 275 concentration)

276 Similar phenomena have been observed in the United States during the summer(He et al.,
 277 2020), where increases in morning and evening ozone concentrations are linked to reductions in
 278 anthropogenic NO_x emissions, which affect ozone titration. Chen(Chen et al., 2020) also noted a
 279 decrease in diurnal ozone variation amplitude in Beijing in recent years, particularly in lower
 280 concentration ranges. This study posits that significant reductions in NO_x emissions over the
 281 years have led to decreased nighttime NO concentrations, weakening ozone consumption at night
 282 and contributing to increased nighttime ozone concentrations. Conversely, the decline in daytime
 283 ozone peaks is likely associated with coordinated reductions in volatile organic compound (VOC)
 284 emissions in Beijing(Kang et al., 2021; Zhan et al., 2021; Wang et al., 2022). Since 2017, stricter
 285 VOC emission controls have been implemented in Beijing and surrounding cities, leading to a
 286 continuous decrease in VOC concentrations(Wang et al., 2022). This decrease inhibits ozone



287 generation during the day and contributes to the observed trend of lower concentrations in
288 valuable daytime ranges.

289 3.5 Variation of ozone generation and consumption rates during Ozone Season in Beijing

290 By calculating the difference in ozone concentration between consecutive hours, we derived
291 the hourly change rate of ozone ($V_i = P_i - P_{i-1}$), expressed in $\mu\text{g m}^{-3}$ per hour. A positive V_i
292 indicates a net generation of ozone, while a negative V_i reflects a net consumption state. A value
293 of zero signifies a balance between generation and consumption. We plotted heat maps and
294 curves of V_i for each year (Fig. 9a, 9b). The absolute value of V_i was lowest at 07:00, suggesting
295 that, on average, the increase in ozone concentration begins around this time. The primary net
296 generation of ozone occurred between 07:00 and 16:00, after which V_i became negative post-
297 17:00, indicating the onset of net consumption. This led to a decline in ozone concentration until
298 approximately 06:00 the following day.

299 Over the years, the maximum generation rate of ozone has exhibited a decreasing trend,
300 accompanied by an advancement in the timing of its occurrence. In contrast, the maximum
301 consumption rate has diminished without significant changes in its timing. The maximum value
302 of V_i (V_{max}), which represents the peak generation rate, occurred during the hour before and after
303 the most rapid generation period. Prior to 2016, the peak generation rate was concentrated
304 between 11:00 and 13:00; however, post-2016, it gradually shifted earlier to between 10:00 and
305 12:00, indicating an advancement in peak generation time. From 2013 to 2015, V_{max} increased
306 slightly from $24.7 \mu\text{g m}^{-3}$ per hour to $29.1 \mu\text{g m}^{-3}$ per hour, but subsequently declined to $18.2 \mu\text{g}$
307 m^{-3} per hour in 2023 (Fig. 9c). This reflects a decreasing trend in maximum ozone generation
308 rates after 2015, at a rate of $1.0 \mu\text{g m}^{-3}$ per year.

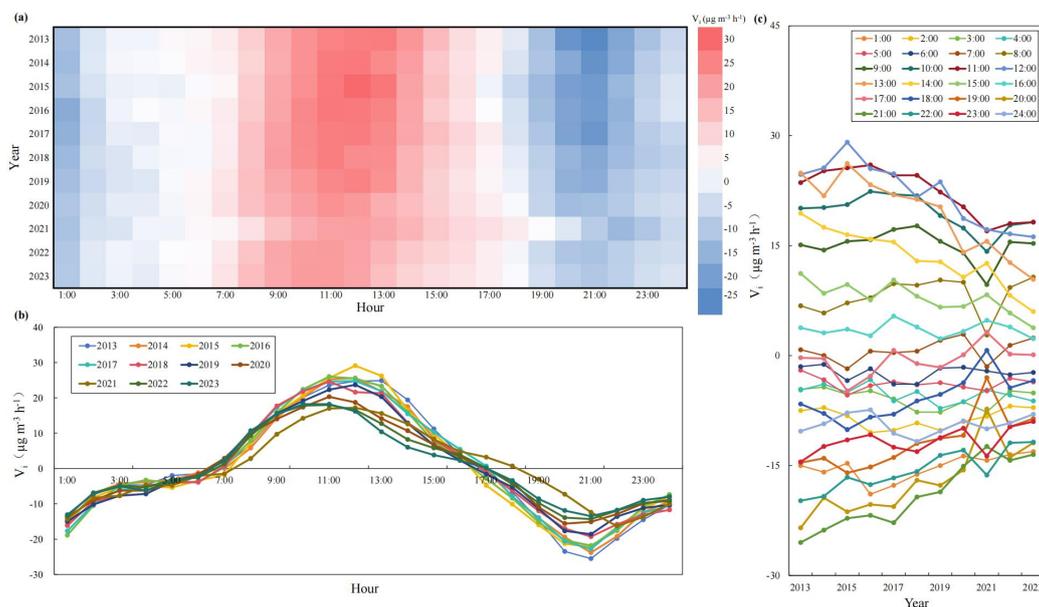
309 The minimum value of V_i (V_{min}) indicates the maximum consumption rate, which ranged
310 from $-25.5 \mu\text{g m}^{-3}$ per hour to $-13.5 \mu\text{g m}^{-3}$ per hour and was relatively low compared to the
311 maximum generation rate. V_{min} typically occurred between 20:00 and 22:00, with 9 out of 11
312 years recording occurrences at 21:00. Over the years, a clear upward trend in V_{min} was observed,
313 increasing at a rate of $1.2 \mu\text{g m}^{-3}$ per hour per year, suggesting a weakening of nighttime ozone
314 consumption.

315 On average, ozone generation rates have exhibited a downward trend, resulting in smoother
316 diurnal variations. The interval between the transition points of positive to negative V_i in the
317 morning and evening represents the duration of ozone generation (T), which averaged 9 to 11
318 hours, with the shortest duration of 9 hours recorded in 2015. By subtracting the trough value
319 from the peak value and dividing by the generation duration (T), we calculated the average
320 generation speed ($V_p = (V_{max} - V_{min})/T$) of ozone. Over the years, V_p ranged from 9.4 to $17.1 \mu\text{g m}^{-3}$
321 per hour, demonstrating a decreasing trend at a rate of $0.69 \mu\text{g m}^{-3}$ per hour per year. This
322 indicates that both the maximum generation and consumption rates of ozone in Beijing have
323 slowed, with the rate of change in consumption exceeding that of generation, resulting in a
324 reduced amplitude of diurnal variations.

325 The observed changes in ozone generation and consumption rates support the earlier
326 conclusions about diurnal variation. This indicates that the amplitude of diurnal ozone variation
327 is diminishing, along with a weakening in both ozone generation and consumption rates. Over
328 the years, reductions in exhaust emissions have changed the characteristics of ozone-related
329 photochemical reactions. Specifically, coordinated decreases in volatile organic compounds



330 (VOCs) and nitrogen oxides (NO_x) have led to lower diurnal average ozone generation rates.
 331 Additionally, the reduction in nighttime nitrogen oxides (NO) concentrations has diminished the
 332 titration effect on ozone during the night.



333

334 Figure 9 Daily rate of ozone change in Beijing during the Ozone Season from 2013 to 2023 (a.
 335 an hourly color chart, b. a diurnal variation curve chart, c. a yearly variation chart of hourly
 336 concentration)

337 3.6 Differences of diurnal variation between pollution days and Ozone Season in Beijing

338 To further investigate the variation in ozone pollution in Beijing over the years, we
 339 conducted an analysis of pollution days (MDA8 > 160 µg m⁻³) for each year (see Table 2). From
 340 2013 to 2023, the number of pollution days ranged from 24 to 74, demonstrating significant
 341 annual variability. More pollution days were observed from 2014 to 2019, peaking in 2019,
 342 followed by a substantial decline since 2020. The length of the Ozone Season varied from 115 to
 343 181 days. There is a weak correlation between the length of the Ozone Season and the number of
 344 pollution days, and a longer Ozone Season may be accompanied by more pollution days.

345 The peak and trough values on pollution days exhibited trends similar to those observed
 346 during the Ozone Season, characterized by lower peaks and elevated troughs. A comparison of
 347 diurnal variations between pollution days and the Ozone Season revealed that the timing of peaks
 348 and troughs aligned, with peaks primarily occurring around 16:00 and troughs between 06:00
 349 and 07:00. On pollution days, there was a discernible trend of decreasing peak values and
 350 increasing trough values, with peak decline rates of 2.5 µg m⁻³ per year, which is 30.9% lower
 351 than the peak reduction rate during the Ozone Season. In contrast, the trough increase rate of 2.4
 352 µg m⁻³ per year was 37.3% higher than the corresponding rate during the Ozone Season.



353 The similarity in diurnal variation patterns suggests that both ozone pollution days and
 354 typical days in Beijing are characterized by diminishing generation and consumption capabilities
 355 of ozone. The slower decline rate of peaks and faster increase rate of troughs on pollution days
 356 imply that favorable meteorological conditions lead to higher concentrations of precursors and
 357 NO in the atmosphere during these days, thereby enhancing ozone generation capacity, while
 358 nighttime conditions facilitate greater consumption.

359 Over the years, the concentration differences between pollution days and the Ozone Season
 360 have widened, with the ozone generation capabilities on pollution days remaining robust
 361 compared to those during the Ozone Season. Fig. 10 presents a heat map illustrating the
 362 concentration differences between pollution days and the Ozone Season. Hourly ozone
 363 concentrations on pollution days consistently exceeded those in the Ozone Season, with peak
 364 values surpassing 43 to 57 $\mu\text{g m}^{-3}$. In contrast, the differences in trough values were not
 365 significantly pronounced, ranging from 1 to 11 $\mu\text{g m}^{-3}$.

366 Notably, the hourly concentration differences between pollution days and the Ozone Season
 367 have shown an increasing trend over the years, with peak differences averaging an increase of
 368 0.97 $\mu\text{g m}^{-3}$ per year and trough differences increasing by 0.65 $\mu\text{g m}^{-3}$ per year. The correlation
 369 coefficients for these trends were 0.65 and 0.68, respectively. Additionally, nighttime
 370 concentration differences have become considerably more pronounced, rising from 19.2 to 34.2
 371 $\mu\text{g m}^{-3}$, with an increase rate of 1.33 $\mu\text{g m}^{-3}$ per year.

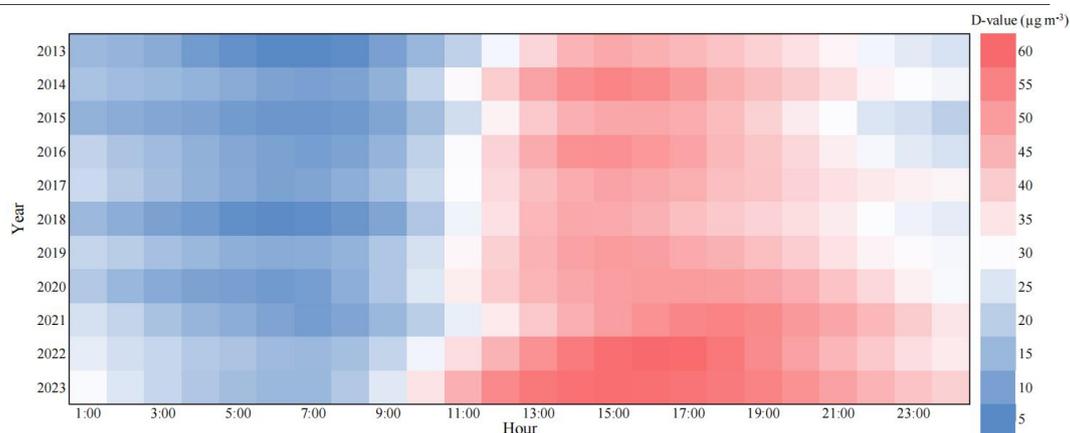
372 The increase in hourly concentration differences between pollution days and the Ozone
 373 Season suggests that while overall ozone generation capabilities are declining, the rate of
 374 reduction on pollution days is comparatively slower. This means that these pollution days still
 375 have a significant capacity for ozone generation.

376

377

Table 2 Ozone pollution days and Ozone Season in Beijing from 2013 to 2023

Year	2013	2014	2015	2016	2017	2018	2019	2020	2021	2022	2023
Ozone pollution days	53	73	69	69	60	67	74	54	24	52	53
Ozone Season	129	165	164	147	134	166	170	163	115	175	181



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Figure 10 Differences in diurnal variation between pollution days and Ozone Season in Beijing from 2013 to 2023



381 4. Conclusions

382 Beijing's stringent air pollution control measures over the years have significantly improved
383 air quality; however, the variation in ozone concentration in Beijing is not as pronounced as that
384 of PM_{2.5}. This article studied the evolution of ozone in Beijing from 2013 to 2023. Firstly, we
385 defined the concept of the Ozone Season, considering the period in which the maximum daily
386 average of 8-hour ozone (MDA8) exceeds 160 $\mu\text{g m}^{-3}$ as the urban Ozone Season. The study
387 found that over the years, the start of the Ozone Season in Beijing has advanced, while the end
388 has been postponed, resulting in an average extension of 2.01 days per year. Secondly, the
389 analysis indicates that the low percentile ozone concentrations in Beijing have increased, which
390 may be related to a decline in regional NO_x emissions, consistent with other international
391 research findings(Chen et al., 2020; Sicard, 2021; Niu et al., 2022); however, changes in high
392 percentile concentrations are not significant. Thirdly, the duration of ozone exposure, represented
393 by the duration of ozone MDA8, has been increasing in both the cold and warm seasons, with a
394 more notable extension in the cold season. In the warm season, ozone exposure can persist into
395 the nighttime, highlighting the importance of monitoring the potential health effects of nighttime
396 ozone levels. Finally, regarding the diurnal variation pattern, over the years, the typical peak
397 ozone concentrations during the ozone season in Beijing have decreased, while the valley
398 concentrations have increased, leading to a more gradual diurnal variation. International studies
399 suggest that the increase in nighttime ozone concentrations is associated with reducing NO_x
400 levels, resulting in weaker NO titration(He et al., 2020; Chen et al., 2020). The decrease in peak
401 concentrations benefits from coordinated emission reduction policies for regional VOCs and
402 NO_x(Wang et al., 2022). In correspondence with the annual changes in peak and valley values,
403 the ozone generation rate and consumption rate during the ozone season in Beijing has declined,
404 indicating a decrease in both generation and consumption capacity. The variation pattern of peak
405 and valley values on days with exceeded ozone levels is consistent with the Ozone Season;
406 however, the rate of decline for peak values is slower, while the rate of increase for valley values
407 is faster, indicating that exceeded days still have a strong ozone generation capacity.

408 The conclusions of this study indicate that the baseline ozone concentration in Beijing has
409 been rising over the years, the timing of ozone pollution events is advancing, and the city is
410 experiencing a longer Ozone Season, consequently extending the potential impact period on
411 human health. While trough values are rising, peak values are declining, ozone generation speeds
412 are decreasing, the start time for generation is advancing, and consumption speeds are also
413 dwindling, leading to a smoothing of diurnal variations. In recent years, there has been a
414 significant reduction in NO_x concentrations in Beijing, with NO₂ levels decreasing by 53.7% in
415 2023 compared to 2013(Beijing Municipal Bureau of Ecology and Environment, 2024), resulting
416 in weakened nighttime titration effects of NO on ozone and an increasing trend in trough and
417 nighttime ozone concentrations. The reduction in peak concentrations may be attributed to
418 stringent VOC controls, with coordinated reductions in VOCs and NO_x leading to diminished
419 ozone generation ability during the day. With the decrease in precursor emissions, significant
420 changes in ozone generation control zones across various regions and months in Beijing have
421 also been observed. The trends in ozone variation are influenced not only by changes in pollution
422 emissions, but also by climatic factors. Further comprehensive analyses are needed to explore the
423 causes, which will require the use of chemical models and experiments for simulation
424 verification to assess the relative contributions of emissions and climate changes.

425



426 **Data availability**

427 Hourly surface ozone observations are provided by the China National Environmental
428 Monitoring Centre (CNEMC) and are available at:<https://www.cnemc.cn/en/>(last access: 6
429 February 2025).

430 **Author contribution**

431 Qian Li: Data Curation, Methodology, Software, Writing-Reviewing and Editing
432 Xiaofei Dong: Conceptualization, Software, Writing-Reviewing and Editing
433 Yuanxi Guo: Conceptualization, Data Curation and Editing
434 Xiue Shen: Conceptualization, Supervision, Editing, Project administration
435 Zhang Zhang: Project administration
436 Chunshen Zhao: Topic Selection Guidance.

437 **Competing interests**

438 The authors declare that they have no known competing financial interests or personal
439 relationships that could have appeared to influence the work reported in this paper.

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