



1 **River-induced circulations alter ozone distribution, source**
2 **contributions, and chemical sensitivity in a river–valley city along the**
3 **Yangtze River**

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Abstract: Ground-level ozone (O_3) pollution in river–valley cities is influenced by interactions among photochemistry, boundary-layer processes, and terrain-induced circulations, yet their combined effects on O_3 distributions remain insufficiently understood. Using WRF–CAMx coupled with source apportionment and process analysis, we investigated the three-dimensional distribution, source contributions, and formation characteristics of O_3 over the Nanjing section of the Yangtze River. The altitude of the O_3 maximum decreased from ~ 5.0 km in winter to ~ 2.0 km in summer, indicating stronger near-surface photochemical production and boundary-layer processes during warm seasons. Distinct spatial heterogeneity was observed between the river corridor and adjacent urban areas. Daytime near-surface O_3 development was weaker over the river in summer, whereas the high- O_3 layer extended downward to greater depths in spring and autumn. Regional background transport accounted for most total O_3 , while suburban contributions increased during high- O_3 episodes, reaching 45.5% under O_3 concentrations of at least $160 \mu\text{g}/\text{m}^3$ in July. Transport and diffusion associated with river-breeze circulations played important roles in regulating O_3 variability within the river corridor. O_3 formation remained volatile organic compound (VOC)-limited in spring and autumn, whereas river-breeze-induced nitrogen oxide (NO_x) dilution shifted the river corridor to NO_x -limited conditions approximately two hours earlier than in the surrounding urban area in summer. These findings indicate that river-induced circulations can substantially modify O_3 distributions, source contributions, and chemical sensitivity within river–valley cities, and that city-averaged and monthly mean characterizations may not fully capture local O_3 variability in complex terrain.

Keywords: Ozone vertical distribution, terrain-induced circulation, source apportionment, process analysis, river–valley region



37 1. Introduction

38 Air pollution episodes result from complex interactions between intensive
39 anthropogenic emissions and meteorological conditions are harmful to the ecosystems
40 and human health (Quimbayo-Duarte et al., 2021; Cheng et al., 2024; Lyu et al., 2025a).
41 In recent years, ground-level ozone (O_3) has become an increasing environmental and
42 public health concern due to its persistently high concentrations, especially in densely
43 populated and industrialized urban areas (Zhang et al., 2025c; Tian et al., 2024; Zhang
44 et al., 2023). Prolonged O_3 pollution episodes have been frequently observed in the
45 Yangtze River Delta (YRD) and other major city clusters, where elevated precursor
46 emissions coincide with stagnant synoptic conditions and strong photochemical activity
47 (Liu et al., 2025; Wei et al., 2018; Xu et al., 2021; Gong et al., 2021; Mao et al., 2024).
48 Understanding the mechanisms that govern O_3 formation and accumulation,
49 particularly the interactions among chemical production, transport processes, and
50 meteorological modulation within complex terrain, is critical for identifying terrain-
51 specific drivers that enhance O_3 accumulation.

52 Tropospheric O_3 is a secondary pollutant formed through nonlinear photochemical
53 reactions involving precursors such as nitrogen oxides (NO_x) and volatile organic
54 compounds (VOCs). The rate and efficiency of O_3 formation are strongly regulated by
55 meteorological factors, including ambient temperature, solar radiation, humidity, and
56 wind speed and direction (Huszar et al., 2021; Qi et al., 2024). Consequently, O_3
57 exhibits strong spatial and temporal variability, particularly in regions with complex
58 terrain and terrain-induced atmospheric circulations (Lu et al., 2022; Li et al., 2023;
59 Zhang et al., 2025b).

60 Large river–valley regions present unique atmospheric environments where
61 intensive anthropogenic emissions interact with dynamic meteorological processes
62 shaped by the underlying terrain (Guo et al., 2024). The Yangtze River, the longest
63 river in China, forms an extensive river–valley system that significantly modulates local
64 boundary layer structures and atmospheric transport pathways. Unlike typical urban
65 plains, regions along the Yangtze River, such as the Nanjing river section, are
66 influenced by land–water thermal contrasts, topographic channeling, and river–breeze



67 circulations. These processes can enhance near-surface accumulation and vertical
68 stratifications of pollutants, including particulate matter and NO_x (Shao et al., 2024b;
69 Qi et al., 2024). Terrain-driven circulations, combined with enhanced photochemical
70 activity during the warm season, are likely to influence the frequency and intensity of
71 O₃ pollution events, although the quantitative mechanisms for O₃ specifically remain
72 unclear.

73 Nanjing is located at a key bend of the Yangtze River and is surrounded by low
74 mountains on three sides, creating a diverse and dynamic meteorological environment.
75 The interplay among river breezes, mountain–valley winds, urban heat island
76 circulations, and complex distributions of anthropogenic and biogenic emissions leads
77 to spatial heterogeneity in O₃ formation and vertical distribution. In addition to local
78 emissions, regional-scale transport and in situ chemical transformations play important
79 roles in the accumulation and persistence of O₃ (Li et al., 2021; Hou et al., 2024). Under
80 stagnant meteorological conditions with strong solar radiation and weak boundary layer
81 mixing, O₃ can accumulate over extended periods and across large areas (Zhang et al.,
82 2025c; Shi et al., 2021; Li et al., 2021), conditions that frequently occur in the YRD (Qi
83 et al., 2024; Shi et al., 2021; Xu et al., 2021) and complicate the assessment of source
84 contributions and pollution formation mechanisms. Furthermore, the vertical
85 distribution of O₃ is strongly influenced by boundary layer structure, turbulence, and
86 local circulations (Li et al., 2023; Zhang et al., 2025a), and terrain-induced circulations
87 in river–valley regions may further modulate vertical O₃ profiles, affecting the timing
88 and magnitude of peak surface O₃ events (Guo et al., 2024). However, the specific
89 mechanisms through which these terrain-induced meteorological processes regulate O₃
90 generation efficiency and vertical structure have not been sufficiently elucidated.

91 While prior studies have investigated O₃ pollution at the regional scale across the
92 YRD (Zhang et al., 2025c; Wu and An, 2025; Lyu et al., 2025b; Mao et al., 2024; Gong
93 et al., 2021; Shi et al., 2021; Wang et al., 2022), relatively few have systematically
94 examined how terrain-induced meteorological processes, especially vertical exchange,
95 affect O₃ distribution within specific subregions such as Nanjing. In particular, the
96 interplay between complex topography, mesoscale circulations, and precursor



97 emissions remains an open question with important implications for air quality
98 management and policy design.

99 To better understand the formation mechanisms and key influencing factors of O₃
100 pollution in this region, this study employs the Comprehensive Air Quality Model with
101 Extensions (CAMx) to simulate O₃ pollution over the Nanjing section of the Yangtze
102 River. By integrating source apportionment (SA) and process analysis (PA) techniques,
103 we aim to elucidate the roles of meteorological and photochemical processes in shaping
104 the spatiotemporal characteristics of O₃ pollution in this topographically complex
105 region.

106

107 **2. Materials and methods**

108 This study focuses on the Nanjing section of the lower Yangtze River. This
109 segment of the river flows through Nanjing from the southwest to the northeast before
110 turning eastward, with an average width of approximately 1.2 km and a maximum width
111 of about 2 km. The urban core of Nanjing is located to the southeast of the river, while
112 multiple industrial parks are distributed along both riverbanks, which are later
113 designated as source regions in the model configuration (Figure 1). Nanjing's
114 prevailing winds are typically easterly during the warm season and northerly in the cold
115 season, which can influence regional pollutant transport (Song and Shao, 2023). The
116 surrounding terrain is characterized by Mt. Laoshan to the west and Mt. Ningzhen to
117 the east, with elevations reaching up to 442 m. This complex topography plays a critical
118 role in shaping local airflow patterns and the dispersion of air pollutants (Song and
119 Shao, 2023).

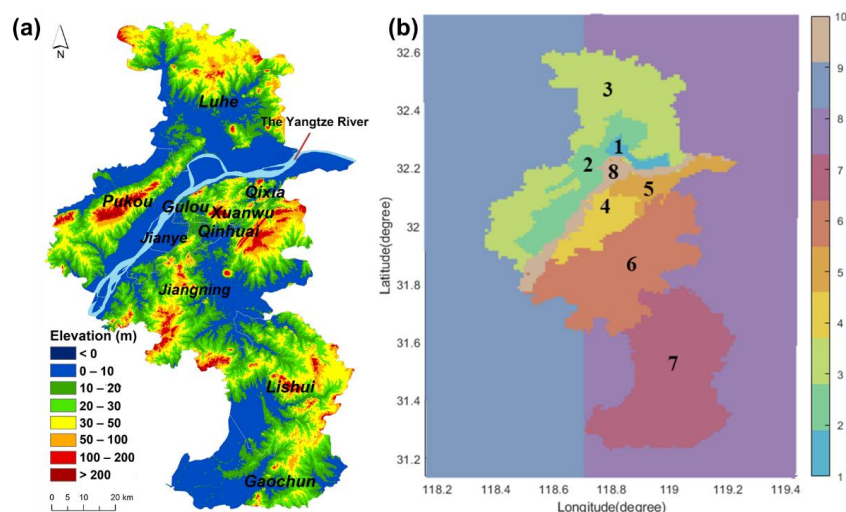


Figure 1. Terrain of the study area and source regions in CAMx. Region 1: Industrial park in Jiangbei New Area, north of the Yangtze River; Region 2: Remaining part of Jiangbei New Area (excluding Region 1), a national-level industrial zone; Region 3: Pukou and Luhe districts, north of the Yangtze River (excluding Regions 1 and 2); Region 4: Urban core of Nanjing (Gulou, Xuanwu, Qinhua, and Jianye districts); Region 5: Education district with an industrial park (Qixia district), south of the Yangtze River; Region 6: Jiangning district, a suburban area with multiple campuses and industrial parks; Region 7: Outer suburbs of Nanjing (Lishui and Gaochun district); Region 8: Nanjing section of the Yangtze River.

The Advanced Core of the Weather Research and Forecasting (WRF, version 4.3; Skamarock et al., 2019) was used to provide meteorological fields for the CAMx chemical transport model. Initial and boundary conditions for WRF simulation were obtained from the NCEP FNL global analysis data (0.25° horizontal resolution, 26 vertical levels; <https://doi.org/10.5065/D65Q4T4Z>). Three nested domains were configured, with the innermost domain set to a horizontal resolution of 1 km, considering the ~2 km width of the Nanjing section of the Yangtze River and the recommended lower limit for planetary boundary layer parameterization (Sueki et al., 2019). To improve terrain representation, the 90 m Shuttle Radar Topography Mission (SRTM-3) dataset (<https://lpdaac.usgs.gov/>) was used to replace the default WRF



140 topography and was interpolated to the inner domain. Spectral nudging (Von Storch et
141 al., 2000) was applied to wind fields above the planetary boundary layer using a
142 wavenumber of 4 in both zonal and meridional directions, allowing large-scale (>1000
143 km) features to be constrained. A nudging coefficient of 3.0×10^{-4} was used. Further
144 details on domain configuration and parameterizations are available in Shao et al.
145 (2024b).

146 The CAMx simulations employed the same domain structure as the WRF model,
147 with three additional buffer grids added to the nested domains (D2 and D3) to handle
148 internal lateral boundary conditions. The chemical mechanisms employed include
149 CB05 for gas-phase chemistry, RADM-AQ for aqueous processes, ISORROPIA for
150 inorganic thermodynamics, a fine/coarse aerosol scheme, and SOAPv2.2 for secondary
151 organic aerosol formation. Anthropogenic emissions were compiled from multiple
152 sources with varying resolutions: the Multi-resolution Emission Inventory for China for
153 the year 2017 (MEIC, 0.25°, Zheng et al., 2014; Li et al., 2017), the Jiangsu provincial
154 inventory (2017, ~3 km), and the Nanjing local inventory (2018, ~1 km). Emission
155 merging followed a hierarchical approach, using MEIC as the base while replacing
156 corresponding grid cells with Jiangsu and Nanjing data. A 5×5 filter was applied along
157 administrative borders to smooth transitions. MEIC emissions, treated as area sources,
158 were provided as monthly sectoral data, while the Jiangsu and Nanjing inventories
159 included detailed point-source information for industry and power plants and were
160 treated accordingly. The annual emissions from Jiangsu and Nanjing were temporally
161 allocated to monthly values using MEIC-derived ratios. To match CAMx input
162 requirements, NO_x was split into NO and NO₂ (85%/15%), PM_{2.5} was apportioned into
163 sulfate, nitrate, and primary inorganic matter (26%/14%/60%) (Dai et al., 2019; Luo et
164 al., 2023), and total VOCs were mapped to CB05 species using MEIC profiles due to a
165 lack of local VOC speciation. Biogenic emissions were generated using the Model of
166 Emission of Gases and Aerosols from Nature (MEGAN; Guenther et al., 2006, 2012).

167 To investigate the formation mechanisms of O₃, the CAMx model was applied
168 with integrated SA and PA tools. The SA module quantifies the contributions of
169 different source regions, sectors, and precursors (e.g., NO_x and VOCs) to ambient O₃



170 concentrations, while the PA module, comprising integrated process rate (IPR) and
171 chemical process analysis (CPA), assesses the roles of key physical and chemical
172 processes in O₃ production and depletion. Model simulations were conducted for four
173 representative months in 2019 (January, April, July, and October), which represent
174 winter, spring, summer, and autumn, respectively, with the configuration, input data,
175 and evaluation procedures consistent with our previous study (Shao et al., 2024b).

176 The spatial distribution of NO_x, VOC, CO, and PM_{2.5} emissions in Nanjing is
177 provided in the Supplementary Materials (Figure S1). Among these pollutants, NO_x
178 and VOC are the primary precursors of tropospheric O₃, while CO also contributes to
179 O₃ formation through HO_x cycling. PM_{2.5} is additionally included to present co-emitted
180 pollutants from combustion-related sources and to provide context for emission patterns
181 associated with O₃ precursors. Region 1 (Jiangbei industrial park) was the dominant
182 source of VOC emissions, accounting for 62% of the citywide total. This highlights the
183 strong potential for localized O₃ production driven by industrial activities emitting
184 highly reactive VOC species. Although biogenic emissions, estimated using the
185 MEGAN model, are present across the study domain, they are substantially lower than
186 anthropogenic sources, particularly in Region 1. As a result, the annual VOC emissions
187 in Region 1 significantly exceeded those of the other pollutants involved in different
188 atmospheric chemical processes (Shao et al., 2024b). Region 4 (urban core) contributed
189 29% of NO_x and 34% of VOC emissions, consistent with intense vehicular traffic and
190 energy consumption, and forming a key O₃ precursor mix in densely populated areas.
191 Region 8 (Yangtze River corridor) emitted 14% of NO_x, reflecting combustion-
192 dominated activities such as shipping and port operations. Although VOC emissions in
193 Region 8 were relatively low (4%), the elevated NO_x levels may support O₃ formation
194 under certain atmospheric conditions, particularly in downwind or transition zones.
195 Overall, the spatial mismatch between NO_x and VOC emissions across different
196 functional zones suggests that O₃ formation regimes in Nanjing are likely to be spatially
197 heterogeneous, which is consistent with our previous findings (Shao et al., 2024a).

198

199 **3. Results and discussion**



3.1 Model validation

The model performance was evaluated according to the established protocols of our previous studies (Shao et al., 2024b), which have demonstrated the reliability of the meteorological fields as well as the model configuration. In this study, the daily maximum 8-hour moving average (MDA8) O₃ concentrations simulated by the model were compared with observed values from nine monitoring stations across Nanjing, most of which are located in densely populated urban districts (Figure 1). Mean bias (Bias) and root mean square error (RMSE) were used to evaluate the performance of the model's ability in capturing MDA8 in four representative months (Figure S2).

In January, the model shows the best agreement with observations, with a Bias of 4.86 µg/m³ and an RMSE of 21.43 µg/m³, indicating high reliability during winter. Moderate overestimations are found in April (Bias = 13.82 µg/m³, RMSE = 32.94 µg/m³) and July (Bias = 6.13 µg/m³, RMSE = 36.85 µg/m³), while a slight underestimation occurs in October (Bias = -11.29 µg/m³, RMSE = 29.56 µg/m³). Overall, the biases remain within ±15 µg/m³, and RMSE values are within 20–40 µg/m³, suggesting that the model can reasonably reproduce the day-to-day variation and seasonal characteristics of MDA8 O₃ over Nanjing. This level of performance provides a reliable basis for subsequent source apportionment and process analysis.

3.2 Spatial distribution of simulated O₃ and meteorological factors

Gridded and regional averages of monthly mean O₃ concentrations across Nanjing are shown in Figure 2, revealing distinct spatial patterns. In January and October, O₃ concentrations are generally higher along the northern bank of the Yangtze River than along the southern bank. In contrast, in April and July, O₃ concentrations along the southern bank are slightly higher than those on the northern bank. During these warmer months, O₃ concentrations increase across most regions, with the urban core (Region 4) exhibiting the highest concentrations, reaching a monthly mean MDA8 of about 130 µg/m³ in July. Suburban and industrial zones (Regions 1–3) show moderately elevated O₃ levels. Such disparate seasonal patterns over the two banks of the Yangtze River may reflect potential impacts from background wind fields, local thermal



230 circulations and emission distribution.

231 Furthermore, distinct O₃ distributions are observed across different underlying
232 surfaces. The Yangtze River surface (Region 8) generally shows lower O₃
233 concentrations than surrounding land areas, particularly in October, which may be
234 related to higher surface humidity, insufficient precursors, and weaker photochemical
235 activity over water. The mountainous area (Region 6) exhibits slightly higher O₃
236 concentrations than the urban core in most months, possibly due to lower anthropogenic
237 emissions of NO_x that reduce O₃ consumption and large natural emissions of biogenic
238 VOCs that increase O₃ formation.

239 Some meteorological factors, including 10 m wind speed (WS10), 2 m relative
240 humidity (RH2), and planetary boundary layer height (PBLH) over the study domain
241 were analyzed in our previous study (Shao et al., 2024b). The current study expands
242 the analysis by incorporating additional meteorological factors, such as 2 m air
243 temperature (T2), daily maximum 2 m air temperature (max T2), downward shortwave
244 radiation (SW), and RH2 (Figure S3). July was chosen as the representative summer
245 month for analysis due to its typical summer characteristics, including higher
246 temperatures, stronger solar radiation, and more pronounced photochemical reactions,
247 making it a key month for studying O₃ concentration variability.

248 RH2 is an important meteorological factor influencing O₃ concentrations, as
249 higher humidity can suppress photochemical reactions and promote O₃ deposition.
250 Notably, RH2 along the Yangtze River surface is substantially higher than in other
251 regions, exceeding the Nanjing average by 5.8-14.2% and the urban core (Region 4) by
252 21.5-31.8% across the four months. The differences in PBLH across regions play a
253 crucial role in O₃ vertical distribution and surface accumulation, which will be further
254 discussed in the context of vertical profiles in the following section. The urban core has
255 the highest PBLH (535 m), which promotes stronger vertical mixing and the upward
256 dispersion of both O₃ and its precursors, thereby diluting surface O₃ concentrations to
257 some extent. Nevertheless, the abundant precursor emissions and high temperatures
258 in the urban core still result in the highest O₃ levels among all regions. In contrast, the
259 Yangtze River (Region 8) has the lowest PBLH (360 m), which limits vertical dilution



260 and supports pollutant accumulation near the surface. Industrial areas (Regions 1 and
261 2) exhibit moderately high PBLH values (462–471 m), which, combined with elevated
262 temperatures, create typical O₃ hotspots. Notably, Region 3, despite having relatively
263 low temperatures (27.7 °C), also has a low PBLH (434 m), which may limit vertical
264 mixing and contribute to higher surface O₃ concentrations despite weaker
265 photochemical conditions.

266 Interestingly, the Yangtze River (Region 8) records the second-highest average O₃
267 concentration in July, slightly lower than the urban core and 2.8% higher than the
268 citywide average. In contrast, during other months, Region 8 consistently shows
269 significantly lower O₃ concentrations than the citywide average, with the lowest
270 monthly mean O₃ levels in January (22.3 µg/m³). These patterns may be influenced by
271 local meteorological and topographical conditions, as will be further discussed in the
272 context of source apportionment in Section 3.4. Specifically, Region 8 has significantly
273 higher RH₂ and WS₁₀ than other regions, but a much lower PBLH (Shao et al., 2024b).
274 For instance, RH₂ is 7.8–14.2% higher than the city average and 21.1–31.8% higher
275 than the urban core; WS₁₀ is 11.1–21.2% higher than the city average and 23.6–38.0%
276 higher than the urban core. These meteorological conditions could prevent the
277 formation and enhance the transport of O₃. In contrast, PBLH is the lowest over the
278 river which is conducive to the accumulation of air pollutants.

279 O₃ accumulation in Region 8 may also be influenced by local thermal circulations
280 generated by the river, surrounding urban areas, and topography. Previous studies (e.g.,
281 Shao et al., 2024a) suggest that the thermal circulation over the river and its northwest
282 side is relatively weak, embedded within the dominant urban heat island circulation.
283 This configuration likely enhances subsidence over the river while enhancing upward
284 motion in the urban core. Combined with the lower PBLH over the river and
285 geostrophic wind patterns, these factors may limit both horizontal and vertical
286 dispersion, favoring O₃ accumulation during the summer. In other seasons,
287 strengthening northerly winds and increased land–river temperature differences may
288 enhance dispersion over the river corridor, potentially contributing to the lower O₃
289 concentrations observed in October.

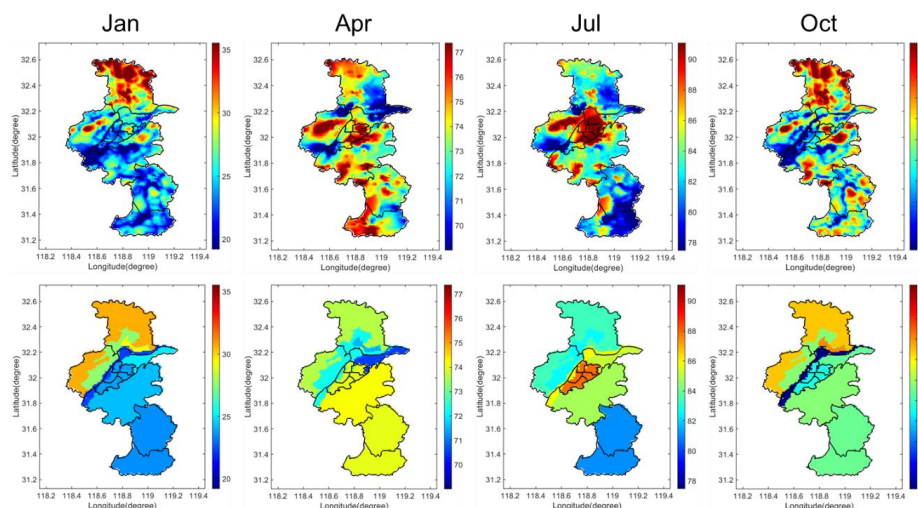


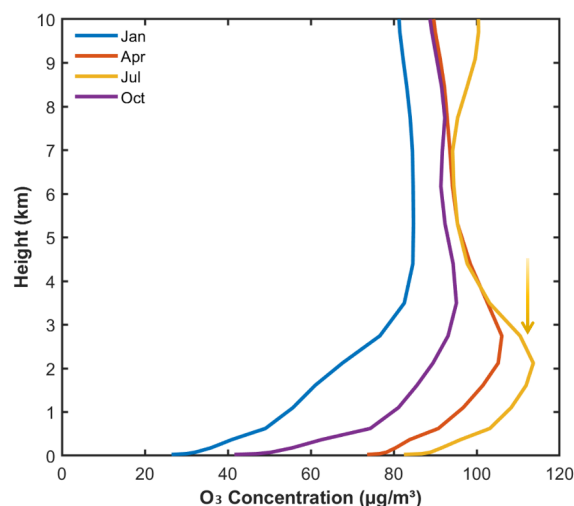
Figure 2. Monthly mean O_3 concentrations (first row, $\mu\text{g}/\text{m}^3$) and regional average O_3 levels (second row, $\mu\text{g}/\text{m}^3$) for each region defined in Figure 1.

3.3 Vertical distribution characteristics of O_3

Based on the simulation results, the domain averaged vertical O_3 profiles over the Nanjing section of the Yangtze River exhibits pronounced seasonal variability (Figure 3). Besides the relatively consistent increase in O_3 concentrations with altitude within the lower troposphere, the O_3 maximum shows a clear downward propagation from winter to summer. In January, O_3 concentration reaches a broad peak of $\sim 85 \mu\text{g}/\text{m}^3$ at $\sim 5.0 \text{ km}$; in April and July, the peaks descend to $\sim 2.7 \text{ km}$ (106.1) and $\sim 2.0 \text{ km}$ ($113.7 \mu\text{g}/\text{m}^3$), respectively; in October, an intermediate peak of $\sim 95.1 \mu\text{g}/\text{m}^3$ occurs at $\sim 3.5 \text{ km}$. Unlike the double-maxima vertical structure reported by Chen et al. (2023) for coastal southern China, our simulated summer O_3 profile over the Nanjing section shows a single pronounced peak at $\sim 2.0 \text{ km}$, likely reflecting differences in boundary layer dynamics between inland Nanjing and coastal southern China. Above approximately $5\text{--}6 \text{ km}$, O_3 concentrations in spring, summer, and autumn are relatively close within a range of $\sim 91\text{--}96 \mu\text{g}/\text{m}^3$, with little seasonal differentiation. Below this altitude, however, the profiles diverge markedly, with a difference of up to $\sim 24 \mu\text{g}/\text{m}^3$ at 2.1 km (Jul: 113.7 vs. Oct: $89.5 \mu\text{g}/\text{m}^3$), highlighting the dominant role of near-



310 surface photochemical production and boundary layer dynamics in driving warm-
311 season O₃ accumulation.



312
313 **Figure 3.** Vertical profiles of domain-averaged O₃ concentrations for January, April, July, and
314 October.

315 During summer, intense solar radiation drives active photochemical O₃ formation
316 within the boundary layer, while a deeper and more turbulent mixing layer facilitates
317 vertical redistribution, resulting in a pronounced O₃ maximum at ~2 km. During winter,
318 suppressed photochemical activity and a shallow, stable boundary layer reduce near-
319 surface O₃ concentrations. Meanwhile, the collapse of the nocturnal boundary layer
320 isolates the residual layer from the surface, allowing O₃ to accumulate aloft and be
321 gradually transported into the free troposphere, producing a broad and relatively
322 uniform O₃ distribution throughout the mid-troposphere (Zhang et al., 2021).

323 The diurnal evolution of O₃ anomalies (hourly concentration minus daily mean)
324 as a function of altitude for January, April, July, and October is provided in the
325 Supplementary Materials (Figure S4). A consistent diurnal pattern is observed in all
326 seasons, characterized by negative anomalies during nighttime and early morning and
327 positive anomalies during the daytime. However, substantial seasonal differences are
328 evident in the intensity, vertical extent, and temporal evolution of the anomaly field.

329 In January and October, the strongest positive and negative anomalies are
330 concentrated within the lower troposphere, with the amplitude of the diurnal cycle



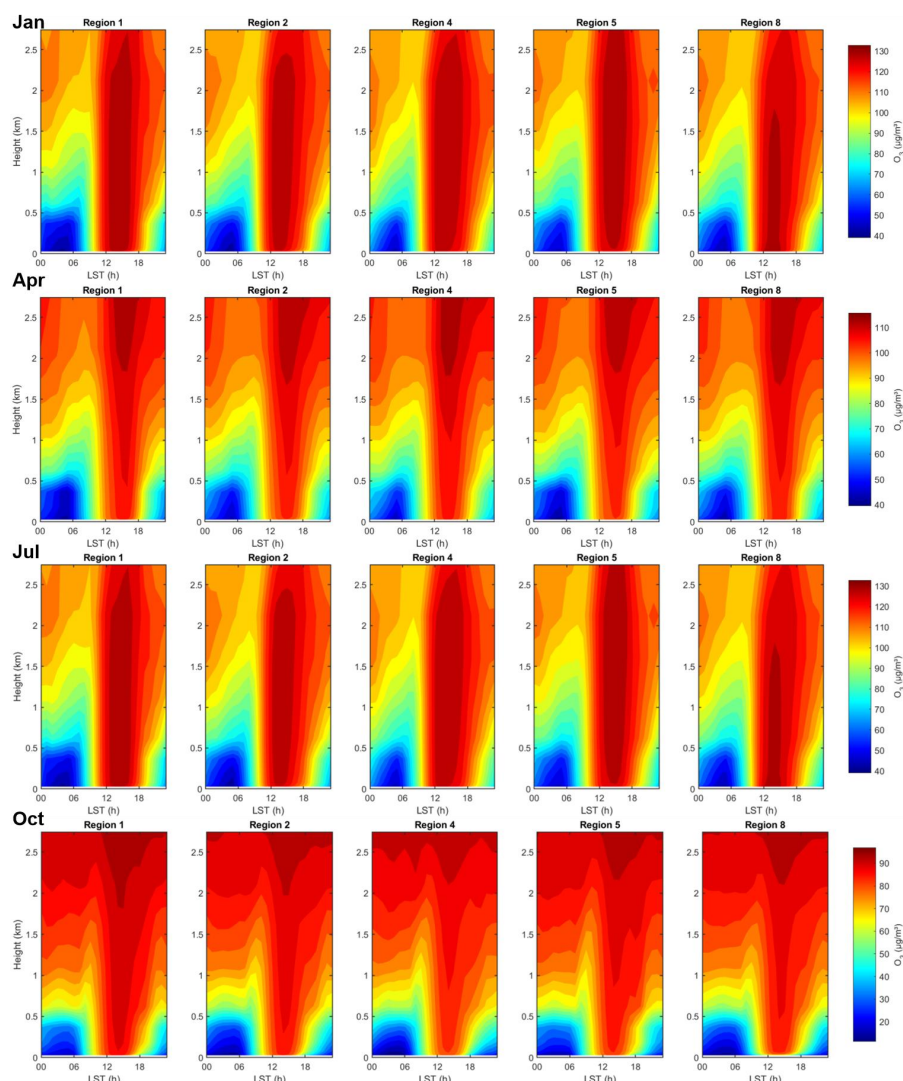
331 decreasing rapidly with height. In January, a notable feature is the persistent positive
332 anomaly between 1 and 2 km throughout much of the day, likely reflecting O₃ retention
333 within the residual layer where vertical mixing is suppressed under stable wintertime
334 conditions. In contrast, the influence of vertical exchange on the diurnal O₃ cycle
335 becomes much more pronounced in April and July. The anomaly signal extends to
336 nearly 3 km in April and exceeds 4 km in July, accompanied by substantially larger
337 anomaly magnitudes. These results indicate that the vertical extent of diurnal O₃
338 variability increases markedly during the warm season.

339 Another notable feature is the altitude-dependent timing of the anomaly transition.
340 In July, the O₃-anomaly boundary exhibits a clear upward tilt, with the transition from
341 negative to positive anomalies occurring earlier near the surface and progressively later
342 at higher altitudes. Meanwhile, the positive anomaly core first develops in the lower
343 atmosphere and subsequently expands upward. This increasing phase lag with height
344 suggests that the diurnal O₃ signal is initiated near the surface and gradually propagates
345 to higher altitudes. In comparison, the tilt of the zero-anomaly boundary is much weaker
346 in January and October, indicating a more limited vertical development of the diurnal
347 O₃ cycle. In addition, the persistence of weak positive anomalies in the middle and
348 upper layers during daytime in January implies that O₃ variability differs substantially
349 between the lower and upper atmosphere. Overall, the warm season is characterized not
350 only by larger anomaly amplitudes but also by more pronounced vertical expansion and
351 altitude-dependent phase shifts, reflecting a more complex vertical structure of the
352 diurnal O₃ cycle.

353 Figure 4 presents the seasonal diurnal vertical profiles of O₃ concentration over
354 different regions (the Yangtze River and surrounding typical regions in Nanjing are
355 selected for analysis). Overall, all regions exhibit a consistent vertical structure across
356 the four seasons, with higher O₃ concentrations in the upper layers (1–2.5 km) and
357 lower concentrations near the surface (0–0.5 km). Near-surface O₃ increases during
358 daytime in association with boundary layer development and decreases at night. In
359 terms of regional differences, the vertical development of near-surface O₃ over the
360 Yangtze River reach (Region 8) during daytime was notably weaker than that over the



361 surrounding urban areas in July, possibly related to the relatively slow daytime warming
362 of the river surface and the associated weaker boundary layer development. In April
363 and October, the high-value O₃ layer over the river region extended downward to
364 greater depths compared to the surrounding urban areas, suggesting a continued
365 modulating effect of land–river thermal contrasts on the vertical O₃ structure beyond
366 summer. In January, the vertical O₃ profiles across all regions became more uniform
367 with the smallest inter-region differences, which is consistent with the expected overall
368 lower O₃ concentrations, reduction in land–river thermal contrasts and local circulation
369 intensity during winter. These features suggest that local thermal circulation may be
370 one of the important factors governing the seasonal differences in the vertical
371 distribution of O₃ over the Yangtze River reach in Nanjing. These systematic differences
372 between the river corridor and the surrounding urban areas indicate that surface-based
373 or city-averaged analyses may not fully characterize the spatial and vertical
374 heterogeneity of O₃ in river–valley urban environments, particularly during summer
375 when the land–river contrast is strong.



376

377 **Figure 4.** Seasonal diurnal vertical profiles of O_3 concentration over the Yangtze River and
378 surrounding typical regions in Nanjing (January, April, July, and October).

379

380 To investigate the influence of topography and local circulations on the vertical
381 distribution of O_3 , we compared two cross-sections in Nanjing: a latitudinal transect at
382 32.032°N crossing the Yangtze River, the Ningzhen-Laoshan mountain system and
383 urban core, and a longitudinal transect at 118.842°E crossing the Jiangbei industrial
384 park, the Yangtze River, and Mt. Zijin, using the monthly mean wind fields from July



(Figure 5).

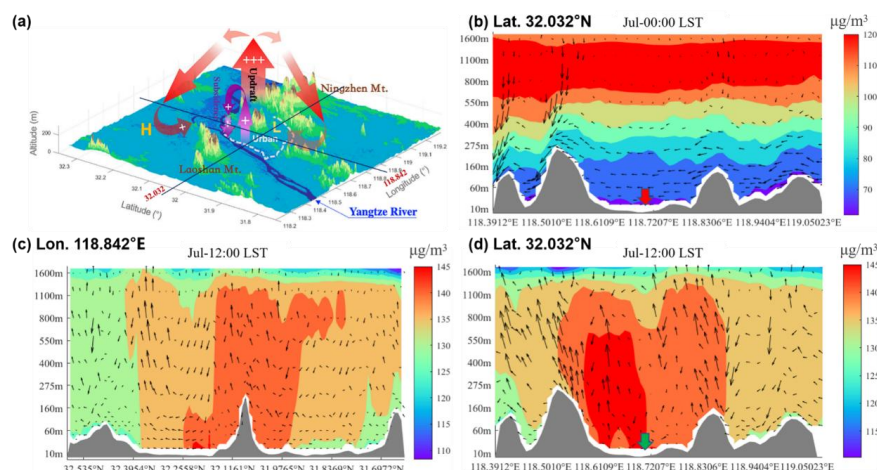


Figure 5. Topographic context and vertical O₃ distributions ($\mu\text{g}/\text{m}^3$) along cross-sections in Nanjing. (a) Regional terrain and schematic local circulations (Shao et al., 2024b); (b) July 00:00 LST at 32.032°N, showing nocturnal near-surface O₃ depletion under a stable, subsiding boundary layer and an elevated residual O₃ layer aloft (red arrow marks the Yangtze River); (c) July 12:00 LST at 118.842°E, showing moderate near-surface O₃ in the Jiangbei industrial sector, a pronounced vertical O₃ maximum over the Yangtze River and terrain-induced upslope lifting over Mt. Zijin; (d) July 12:00 LST at 32.032°N, highlighting a 0.4–1.0 km elevated O₃ layer driven by strong updrafts and a vertical O₃ high-value column at the green-arrow location.

At night along the latitudinal transect (Figure 5b, Jul-00:00 LST), near-surface O₃ concentrations are markedly suppressed ($\sim 70\text{--}80 \mu\text{g}/\text{m}^3$), with a pronounced depletion pocket near 118.63°E (red arrow) likely reflecting strong nocturnal NO_x titration under a stable, shallow boundary layer with weakened ventilation, as illustrated by the relatively weak east wind below 400 m, which could be the result of the combined effect from local thermal circulations shown in Figure 5(a). O₃ increases steeply with height, reaching $\sim 110\text{--}120 \mu\text{g}/\text{m}^3$ above 800 m within the residual layer, consistent with the suppression of vertical mixing and the absence of photochemical production at night.

During daytime along the same latitudinal transect (Figure 5d, Jul-12:00 LST), the



406 O₃ vertical structure is fundamentally altered by active local circulations. A persistent
407 elevated O₃ layer ($\sim 135\text{--}145\text{ }\mu\text{g/m}^3$) develops between 0.4 and 1.0 km, driven by
408 intense photochemical production and strong updrafts that transport precursors aloft, as
409 reflected by the pronounced upward wind vectors. At the green-arrow location, near-
410 surface O₃ ($\sim 130\text{--}135\text{ }\mu\text{g/m}^3$) extends upward into a distinct vertical high-value column,
411 consistent with concentrated convective lifting at that position.

412 Along the longitudinal transect at 118.842°E (Figure 5c, Jul-12:00 LST), near-
413 surface O₃ in the northern sector (Region 1 and Region 3, $\sim 32.4\text{--}32.5^\circ\text{N}$) remain
414 relatively moderate ($\sim 120\text{--}125\text{ }\mu\text{g/m}^3$), which may reflect the competing effects of
415 photochemical O₃ production and NO_x–VOC titration near the Jiangbei industrial
416 emission sources. A striking near-surface O₃ maximum ($\sim 145\text{ }\mu\text{g/m}^3$) is observed over
417 the Yangtze River and Baguazhou Island ($\sim 32.26^\circ\text{N}$), forming a pronounced vertical
418 high-value column extending from the surface to above 1000 m, driven by local upward
419 transport as evidenced by the strong upward wind vectors at this location. Further south,
420 the topographic rise of Purple Mountain generates vigorous daytime upslope winds
421 predominantly on its northern flank, as evidenced by the upward wind vectors, lifting
422 O₃-rich air from the lowlands to the north and contributing to elevated concentrations
423 aloft. The broad southern sector (Regions 5 and 6, south of 32°N) exhibits a persistently
424 high O₃ layer ($\sim 135\text{--}140\text{ }\mu\text{g/m}^3$) extending through the mid-troposphere, consistent
425 with active photochemical production and strong convective mixing under daytime
426 heating.

427 Comparing Figures 5(b) and 5(d) reveals a striking diurnal reversal at 32.032°N :
428 the nocturnal profile is characterized by surface depletion beneath a high-O₃ residual
429 layer, whereas the daytime profile shows an active elevated O₃ accumulation layer fed
430 by convective uplift. Comparing Figures 5(c) and 5(d) highlights the contrasting roles
431 of different local forcing mechanisms at the same local noon: the longitudinal transect
432 (5c) reveals how industrial emissions, local upward transport, and upward transport
433 jointly shape a pronounced near-surface O₃ maximum over Baguazhou, while the
434 latitudinal transect (5d) features a more horizontally uniform elevated layer driven by
435 strong updrafts and convective lifting over the urban core. Together, these contrasting



436 patterns demonstrate that the interplay of nocturnal stability, river breezes, urban
437 updrafts, and terrain-induced flows plays a critical role in shaping the vertical and
438 horizontal heterogeneity of O₃ across Nanjing.

439

440 **3.4 O₃ transport revealed through source apportionment technology**

441 The monthly mean local source contributions (excluding contributions from
442 regions outside Nanjing) provide useful information on the influence of local
443 circulations on O₃ accumulation and redistribution within the Yangtze River corridor
444 (Figure 6). It should be noted that the source contributions discussed here refer to the
445 locally attributed fraction only, which accounts for 12.8%, 44.9%, 59.2%, and 23.9%
446 of total O₃ in January, April, July, and October, respectively, with the remainder
447 dominated by regional background transport. Within this local fraction, the highest
448 contribution from Region 8 occurs in April, exceeding 60%. Because Region 8
449 represents the river corridor rather than a major industrial emission area, this elevated
450 contribution likely reflects favorable meteorological conditions for O₃ retention within
451 the river corridor rather than stronger local emissions. Favorable spring meteorological
452 conditions, including increasing solar radiation and relatively weak atmospheric
453 dispersion, may further enhance the retention of O₃ within the river corridor. During
454 the 14:00 period, when photochemical activity is the strongest, the contribution from
455 Region 8 increases further, reaching 65.2% in April and 59.7% in July, indicating
456 enhanced daytime O₃ formation within the river corridor.

457 Seasonal variations are particularly pronounced. In winter, O₃ concentrations are
458 primarily influenced by northerly winds that transport O₃ and its precursors from the
459 industrial areas north of the river, with monthly mean contributions from Region 1 and
460 Region 2 reaching 18.7% and 15.5%, respectively, together accounting for over a third
461 of the locally attributed O₃. Contributions from the urban area (Region 4) and southern
462 Qixia (Region 5) are comparatively modest, at around 9–11%. In spring, Region 8
463 becomes overwhelmingly dominant, while contributions from the northern industrial
464 regions (Region 1–3) decline markedly compared to winter, suggesting a seasonal shift
465 in large-scale circulation patterns from north wind to easterlies. In summer, stronger



photochemical activity sustains a high river surface contribution (56.9%), though enhanced vertical mixing and dispersion slightly reduce its relative share compared to spring. In autumn, the river surface contributes 26.4%, with Qixia (Region 5) and Jiangning (Region 6) accounting for 11.2% and 15.5%, respectively, reflecting a more dispersed source pattern under transitional circulation conditions.

Pronounced diurnal differences are also observed across all seasons, likely reflecting the influence of thermally driven local circulations. During the daytime, the local contribution from Region 8 itself is largest, reaching 31.5% in January and 60.1% in July, indicating that O_3 over the river is then dominated by local-scale processes, with cross-bank transport from surrounding regions contributing a correspondingly smaller share. At night, this local fraction drops markedly to 12.8% in January and 39.3% in July, and the contributions from the regions on both banks rise accordingly, indicating an increased role of transport from riverside source areas to the river receptor. In January, the nighttime contributions to Region 8 from Pukou and Luhe (Region 3), southern Qixia (Region 5), and Jiangning (Region 6) rise to 12.3%, 14.9%, and 9.5%, respectively, consistent with radiative cooling and boundary layer stabilization near emission sources. In July, the nighttime contributions to Region 8 from Region 3 and Region 6 increase to 4.6% and 15.0%, reflecting nocturnal accumulation under stable conditions and the possible terrain-induced recirculation. The transitional seasons of April and October exhibit the same diurnal regime, in which the local contribution over the river dominates during the daytime and the contributions from the regions on both banks rise at night, indicating that this pattern is a robust, year-round feature. These patterns suggest that thermally driven local circulations modulate the diurnal partitioning between local production over the river and transport from the regions along both banks, thereby shaping the source composition of O_3 within the Yangtze River corridor.

Under high O_3 concentration conditions, the influence of regional transport becomes more pronounced. In April, as O_3 concentrations increase, contributions from Jiangning (Region 6) and the suburban areas (Region 7) rise substantially from their monthly mean values of 5.3% and 2.4% to 14.8% and 23.3% under $\geq 120 \mu\text{g}/\text{m}^3$



496 conditions, and remain elevated at 13.4% and 22.6% under $\geq 160 \mu\text{g}/\text{m}^3$, while the river
497 surface contribution declines from 61.1% to 20.9% and 19.5%, respectively. This shift
498 suggests that elevated O_3 episodes in spring are associated with enhanced transport
499 from southern and suburban source regions rather than local circulation within the river
500 corridor. In July, under $\geq 160 \mu\text{g}/\text{m}^3$ conditions, the suburban contribution (Region 7)
501 rises substantially from its monthly mean of 4.4% to 45.5%, with Region 3 contributing
502 18.6% and the river surface declining from 56.9% to 15.1%; under $\geq 200 \mu\text{g}/\text{m}^3$, Region
503 7 further increases to 48.4% while the river surface decreases to 3.6%, indicating that
504 extreme summer O_3 pollution is driven primarily by enhanced regional transport. In
505 October, under $\geq 160 \mu\text{g}/\text{m}^3$ conditions, Qixia (Region 5) increases markedly from its
506 monthly mean of 15.5% to 32.6%, with Region 6 at 8.6% and the river surface at 22.3%;
507 under $\geq 200 \mu\text{g}/\text{m}^3$, Region 5 further rises to 40.0%, with Region 6 at 9.3% and the river
508 surface at 21.6%, indicating that autumnal high- O_3 episodes are largely driven by local
509 and nearby emissions under confined circulation from southeasterlies to easterlies.
510 Overall, the spatial and temporal variations in source contributions under high-pollution
511 conditions highlight the importance of both terrain-induced local recirculation and
512 enhanced regional transport in shaping O_3 accumulation along the Yangtze River
513 corridor. These episode-dependent shifts in the dominant source regions indicate that
514 source-contribution patterns derived from monthly mean conditions may not
515 adequately represent the processes governing high- O_3 episodes. Source attribution and
516 mitigation assessments should therefore account explicitly for pollution intensity and
517 the associated changes in regional transport.

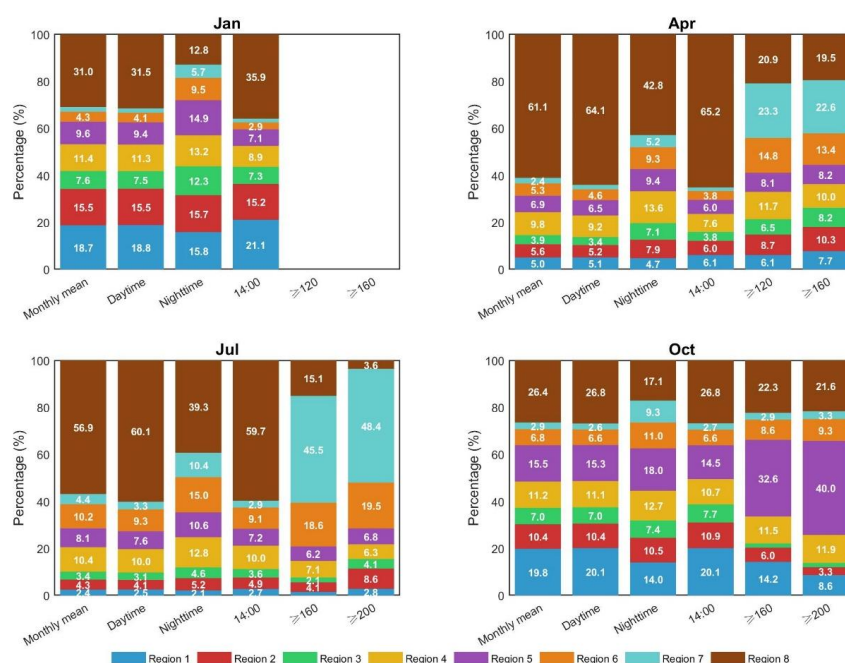


Figure 6. Monthly mean proportions (%) of local source contributions to O₃ along the Yangtze River (Region 8) under various conditions. The daytime period is defined as 08:00–18:59; nighttime includes both 00:00–07:59 and 19:00–23:59; 14:00 represents the monthly mean proportions of source contributions at 14:00 LST; ≥ 120 , ≥ 160 and ≥ 200 correspond to hours when the observed O₃ concentrations are ≥ 120 $\mu\text{g}/\text{m}^3$, ≥ 160 $\mu\text{g}/\text{m}^3$ and ≥ 200 $\mu\text{g}/\text{m}^3$, respectively.

3.5 O₃ formation revealed through process analysis technology

To further elucidate the mechanisms responsible for the distinctive source-contribution characteristics over the Yangtze River corridor, process analysis was conducted to quantify the contributions of different chemical and transport processes to O₃ formation. The results indicate that the Yangtze River region of Nanjing (Region 8) exhibits distinct process characteristics compared with the city-wide mean (Region 1–5 and 8) (Figure 7). Diffusion processes show consistently positive differences across all seasons, consistent with the generally lower O₃ concentrations over the river corridor than in adjacent urban areas, which favor net diffusive transport toward the river region.

Vertical and horizontal advection exhibit coherent diurnal variations, highlighting



the influence of boundary layer evolution and river-induced local circulations on O_3 transport. Vertical advection shows positive differences during daytime and negative differences at night, indicating enhanced daytime exchange between the river corridor and the overlying atmosphere as the boundary layer develops. Horizontal advection displays a clear diurnal reversal, with negative differences from morning to early afternoon and positive differences from late afternoon through nighttime. This pattern is consistent with the daytime development and nighttime weakening or reversal of river-breeze circulation driven by land–river thermal contrasts.

Deposition processes exhibit positive differences, most prominently in summer, reflecting distinct surface characteristics and atmosphere–surface interactions over the river corridor compared with the surrounding urban environment. Gas-phase chemistry shows relatively small differences between the Yangtze River corridor and the city-wide mean across all seasons. This suggests that the distinct O_3 characteristics of the river region are associated primarily with differences in transport and diffusion processes driven by local circulations, rather than substantial differences in net chemical tendencies. These results highlight that topography-induced airflow and land–river interactions play a crucial role in shaping the O_3 budget over the Yangtze River region.

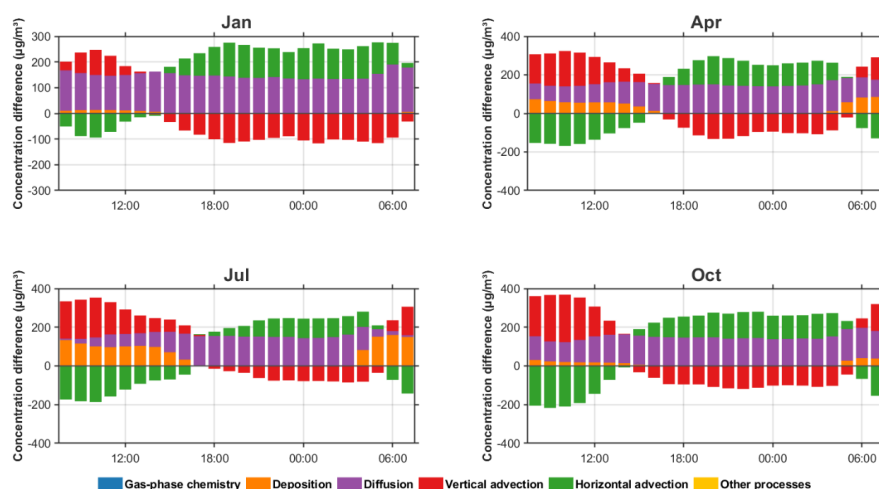


Figure 7. Differences in monthly mean diurnal O_3 concentration change rates: the Yangtze River (region 8) vs. average of regions 1–5 and 8 (excluding suburban areas) (LST, UTC+8).



556 The CPA approach was used to assess O₃ production sensitivity for April, July, and
557 October. Daily CPA outputs from the CAMx model were used to calculate the
558 production rates of H₂O₂ and HNO₃ ($P_{H_2O_2}/P_{HNO_3}$), which served as key indicators of
559 O₃ production sensitivity. January was excluded from the diurnal analysis as near-zero
560 $P_{H_2O_2}/P_{HNO_3}$ ratios throughout the day indicate negligible photochemical activity in
561 winter, rendering the CPA-based sensitivity diagnosis uninformative for that season.
562 Following thresholds adopted from previous studies (Li et al., 2022; Sillman, 1995;
563 Vermeuel et al., 2019; Liu et al., 2025), regimes were classified as VOC-limited when
564 $P_{H_2O_2}/P_{HNO_3} \leq 0.25$, transitional when 0.25–0.4, and NO_x-limited when >0.4 .

565 Figure 8 presents the diurnal variation of the monthly mean $P_{H_2O_2}/P_{HNO_3}$ ratio
566 for Region 8 (Yangtze River corridor) and the urban mean (Regions 1–5) during the
567 photochemically active period. In April and October, both Region 8 and the urban mean
568 remain well below the VOC-limited threshold (0.25) throughout the day. In April, the
569 two curves are nearly indistinguishable, with peak values of approximately 0.17 for
570 both, confirming uniformly VOC-limited conditions with negligible influence from
571 local circulations. In October, the urban mean peaks are slightly higher than Region 8
572 (~ 0.08 vs ~ 0.07), though both remain far below the sensitivity thresholds, indicating
573 that local circulations exert minimal influence on regime differentiation in this season
574 as well.

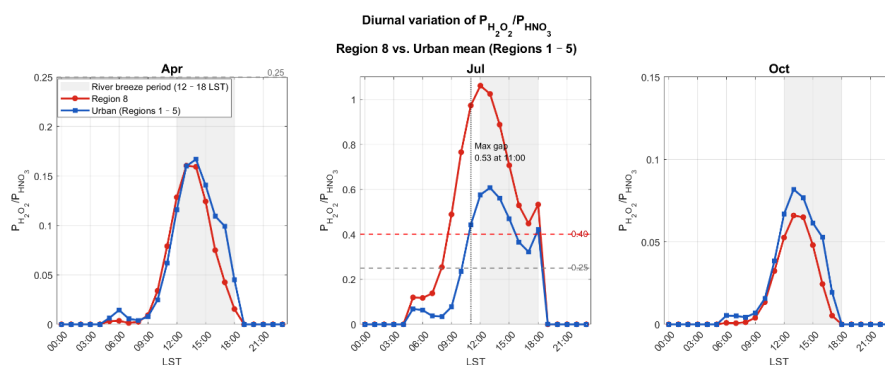
575 In contrast, July exhibits a pronounced diurnal pattern and a remarkable
576 divergence between Region 8 and the urban mean. Both curves rise sharply after sunrise,
577 but Region 8 peaks earlier ($\sim 12:00$ LST, $P_{H_2O_2}/P_{HNO_3} > 1.0$) and substantially exceeds
578 the urban mean throughout the morning, with a maximum gap of 0.53 at 11:00 LST.
579 The urban mean peaks later ($\sim 13:00$ LST, ~ 0.6), remaining lower than Region 8 for
580 most of the active period. Notably, Region 8 crosses the NO_x-limited threshold (0.40)
581 as early as 09:00 LST and sustains NO_x-limited conditions until $\sim 18:00$ LST, while the
582 urban mean crosses the same threshold approximately two hours later at 11:00 LST.
583 This earlier and stronger sensitivity shift in Region 8 is consistent with the role of the



584 Yangtze River breeze: the onset of the river breeze in the late morning dilutes NO_x
585 concentrations along the river corridor, shifting the VOC/NO_x balance toward NO_x-
586 limited conditions ahead of the broader urban area. The subsequent convergence of the
587 two curves after ~18:00 LST, when the river breeze weakens, further supports this
588 mechanism. The grey shading (12:00–18:00 LST) marks the peak photochemical period,
589 during which the divergence between Region 8 and the urban mean is sustained,
590 reinforcing the interpretation that local thermal circulations play a controlling role in
591 modulating O₃ production sensitivity during summer.

592 Overall, O₃ production in Nanjing is primarily VOC-limited, but NO_x-limited
593 conditions emerge in summer, particularly in the Yangtze River corridor where river-
594 breeze-induced NO_x dilution drives an earlier and more pronounced sensitivity
595 transition. These findings suggest that effective O₃ mitigation should combine VOC
596 control throughout the year with coordinated VOC–NO_x reduction strategies in summer,
597 with particular attention to the spatiotemporal modulation imposed by local
598 meteorological processes.

599



600

601 **Figure 8.** Diurnal variation of monthly mean $P_{H_2O_2}/P_{HNO_3}$ for Region 8 (red) and the urban mean
602 (Region 1–5, blue) in April, July, and October. Grey shading marks the peak photochemical period
603 (12:00–18:00 LST). Dashed lines indicate the VOC-limited/Transition (0.25, grey) and
604 Transition/NO_x-limited boundary (0.40, red) thresholds. The dotted vertical line in July marks the
605 hour of maximum divergence (0.53 at 11:00 LST). January is excluded due to negligible
606 photochemical activity.



607 **4. Conclusions**

608 This study investigated the spatial–temporal variability, vertical structure, and
609 driving mechanisms of O₃ pollution in the Nanjing section of the Yangtze River using
610 the WRF-CAMx model coupled with SA and PA. By integrating meteorological
611 simulations, emission inventories, and multi-scale analyses, we examined how
612 photochemical processes, boundary-layer dynamics, and terrain-induced circulations
613 jointly regulate O₃ distributions in a complex river–valley urban environment.

614 The results reveal pronounced seasonal and spatial heterogeneity in regional
615 surface O₃ concentration, with the Yangtze River corridor showing a dual role as both
616 a transport pathway and an accumulation region depending on seasonal meteorological
617 conditions and boundary-layer structure. The O₃ maximum shifts systematically
618 downward from ~5.0 km in winter to ~2.0 km in summer, reflecting intense near-
619 surface photochemical production and efficient vertical mixing in the warm season, in
620 contrast to suppressed boundary-layer development and limited vertical transport in
621 winter. Diurnal variations further demonstrate that boundary-layer evolution plays a
622 central role in regulating the vertical redistribution of O₃. Regional diurnal vertical
623 profiles further indicate that land–river thermal contrasts modulate the vertical O₃
624 structure across seasons, with the most pronounced regional differences occurring in
625 summer and the smallest in winter. Together with the contrasting near-surface O₃
626 development over the river corridor and surrounding urban areas, these results indicate
627 that near-surface O₃ varies systematically across this complex river–valley terrain and
628 cannot be fully represented by city-averaged characterizations. Cross-sectional
629 analyses reveal that terrain-induced circulations exert fundamental control on the three-
630 dimensional O₃ structure. Along the latitudinal transect at 32.032°N, nocturnal stability
631 suppresses near-surface O₃ beneath a high-O₃ residual layer, while daytime strong
632 updrafts drive an elevated O₃ accumulation layer between 0.4 and 1.0 km along the
633 transect. Along the longitudinal transect at 118.842°E, industrial NO_x–VOC
634 interactions in the Jiangbei sector, local upward transport over the Yangtze River, and
635 terrain-induced upslope lifting over Mt. Zijin collectively highlight the contrasting roles
636 of urban convective forcing and terrain-modulated transport in determining vertical O₃



637 distributions across Nanjing.

638 Source apportionment demonstrates that O₃ in the Yangtze River corridor is
639 predominantly influenced by regional background transport, while within the locally
640 attributed fraction, Region 8 itself contributes the largest share during daytime, with the
641 highest contribution occurring in April, exceeding 60% and further increasing to 65.2%
642 at 14:00 LST. Seasonal variations reflect shifts in large-scale circulation: northerly
643 winds in winter enhance contributions from the Jiangbei industrial zones (Regions 1
644 and 2, together >34%), while spring and summer favor local recirculation within the
645 river corridor. Under high-O₃ episodes, regional transport becomes increasingly
646 dominant, with suburban contributions (Region 7) rising to 45.5% under $\geq 160 \mu\text{g}/\text{m}^3$
647 conditions in July, indicating that extreme pollution events are driven primarily by long-
648 range transport rather than local production. This episode-dependent shift in dominant
649 source regions suggests that source-contribution patterns during high-O₃ episodes may
650 differ substantially from those inferred from monthly mean conditions, underscoring
651 the importance of resolving pollution-intensity-dependent changes in regional transport
652 and source attribution.

653 Process analysis demonstrates that O₃ variability in the Yangtze River region is
654 governed by coupled chemical–dynamical processes. Diffusion and advection
655 processes play important roles in modulating O₃ variability, driven by land–river
656 thermal contrasts and river-breeze circulations, while horizontal advection exhibits a
657 clear diurnal reversal associated with the onset and weakening of the river breeze. These
658 results confirm that O₃ in river–valley urban systems follows a coupled chemical–
659 dynamical framework in which photochemistry, boundary-layer processes, and terrain-
660 modulated circulations jointly determine both surface concentrations and vertical
661 distributions.

662 CPA-based sensitivity analysis indicates that O₃ production across Nanjing is
663 predominantly VOC-limited throughout the year. In summer, however, the Yangtze
664 River corridor transitions to NO_x-limited conditions as early as 09:00 LST,
665 approximately two hours ahead of the broader urban area, driven by river-breeze-
666 induced NO_x dilution. This result suggests that spatially uniform emission control



667 strategies may be insufficient during summer, and that coordinated VOC–NO_x
668 reduction measures accounting for local circulation effects are warranted in the river
669 corridor.

670 Overall, this study highlights the critical role of local circulation systems and
671 terrain effects in shaping the three-dimensional structure of O₃ pollution in Nanjing.
672 The findings emphasize that accurate representation of boundary-layer dynamics, land–
673 river thermal contrasts, and terrain-induced flows is essential for understanding,
674 simulating, and mitigating O₃ pollution in complex river–valley urban environments,
675 and provide a scientific basis for designing spatially differentiated emission control
676 strategies in regions with similarly complex terrain and circulation systems.

677

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682

683 **CRedit authorship contribution statement**

684 Yan Lu: Writing – review & editing, Writing – original draft, Formal analysis,
685 Visualization, Funding acquisition. Yiming Guo: Software, Data curation. Yan Zhang:
686 Resources, Conceptualization, Data curation. Min Shao: Data curation, Methodology,
687 Supervision, Funding acquisition.

688

689 **Declaration of competing interest**

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

693

694 **Data availability**

695 Data will be made available on request.

696



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