



1 **Primary sources and secondary formation of brown carbon in urban**
2 **Shanghai: Insights from bihourly measurements of brown carbon and**
3 **organic tracers**

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20 **Abstract**

21 Brown carbon (BrC) is a significant component of atmospheric carbonaceous aerosols and has
22 important influence on climate, atmospheric chemistry, and air quality. Our knowledge about
23 its sources and atmospheric evolution is limited due to the challenges of accurate estimation of
24 its mass concentrations. To address this gap, we examined concurrent measurements of bihourly
25 BrC and a suite of organic molecular tracers in urban Shanghai from March to August 2020,
26 BrC was determined by synergistically applying the Bayesian inference (BI) model to multi-
27 wavelength aethalometer and total carbon (TC) measurements. BrC constituted 38–40% of TC,
28 with pronounced seasonal differences in diurnal evolution. The source apportionment analysis
29 resolved 15 source factors and among them 7 are secondary sources, namely, secondary nitrate
30 and sulfate formation processes, aromatic secondary organic aerosol (SOA), α -pinene SOA, β -
31 caryophyllene SOA, isoprene SOA, oxygenated cooking OA, and secondary biomass burning.
32 Secondary BrC accounted for 42% and 49% of total BrC in spring and summer, respectively.
33 Seasonal contrast of the BrC contributions from primary and secondary sources were noticed.
34 The formation mechanisms of secondary BrC were investigated by isolating events with
35 continuous increment in secondary BrC concentrations, and the analysis suggested the diversity
36 of oxidative pathways governing secondary BrC production. This study demonstrates the
37 potential applicability of coupling the BI framework with online measurements of organic
38 tracers for robust, chemically resolved BrC source apportionment. Our field observations
39 provide the first quantitative source analysis and offer new insights into the primary sources
40 and secondary formation of BrC in the urban atmosphere.

41

42 **1. Introduction**

43 Brown carbon (BrC) is an important yet poorly understood component of atmospheric
44 carbonaceous aerosols, exerting profound impacts on climate, atmospheric chemistry, and air
45 quality (Laskin et al., 2015). BrC comprises a collective mixture of light-absorbing
46 organic substances and exhibits pronounced wavelength-dependent light absorption,
47 contributing approximately 20% of total carbonaceous aerosol light absorption (Chung et al.,
48 2012; Feng et al., 2013). BrC absorption can alter surface energy balance and meteorological
49 conditions, thereby modifying ground-level PM_{2.5} and O₃ concentrations (Wang et al., 2024).
50 In addition, certain BrC chromophores can act as photosensitizers, generating various oxidants
51 upon photon absorption (Liang et al., 2024; Lyu et al., 2026). Given these multiple and far-
52 reaching environmental effects, a detailed understanding of BrC sources and
53 atmospheric evolution is urgently warranted.



54 BrC can be divided into primary BrC and secondary BrC based on their emission sources.
55 Primary BrC is predominantly emitted directly from fossil fuel combustion and biomass
56 burning. In contrast, secondary BrC is formed in the atmosphere through diverse pathways,
57 including gas-phase reactions, aqueous and in-cloud reactions, and heterogeneous reactions,
58 which are driven by photochemistry, nonphotochemical reactions and droplet evaporation
59 (Hems et al., 2021). Unlike primary BrC, which exhibits relatively stable chemical properties,
60 secondary BrC has far more complicated formation pathways and greater variability in
61 chemical composition, and remains considerably less understood (Li et al., 2025). Previous
62 studies about secondary BrC have been confined to laboratory simulations of individual
63 reaction mechanism of single compound (Kitanovski et al., 2014; Vidovic et al., 2018) or have
64 focused on certain source type, such as biomass burning (Kuang et al., 2025), coal combustion
65 (Ni et al., 2021), and vehicle exhaust (He et al., 2025; Lui et al., 2023). Field-based
66 investigations, meanwhile, have largely relied on either online aerosol mass spectrometry
67 (AMS) measurements, which offer limited molecular-level information (Qin et al., 2018), or
68 offline filter-based analysis of molecular tracers that lack the temporal resolution to capture diel
69 variations (Li et al., 2020b, 2026; Xiao et al., 2025; Xu et al., 2022). These methodological
70 constraints have collectively hindered a comprehensive examination of the chemical evolution,
71 sources, and formation mechanism of secondary BrC under real atmospheric conditions.

72 As BrC is an operationally defined term without a universal chemical standard, its
73 separation from the bulk carbonaceous aerosol remains a significant challenge, yet it is essential
74 for investigating its sources and atmospheric evolution. Early studies commonly employed a
75 simple absorption Ångström exponent (AAE)-based approach to estimate BrC absorption in
76 both laboratory and field measurements (Qin et al., 2018; Wang et al., 2016). Subsequent
77 refinements, such as the BC-tracer and minimum R-squared (MRS) methods, were introduced
78 to further separate primary from secondary BrC absorption (Hu et al., 2026; Li et al., 2020a;
79 Wang et al., 2019a). However, these conventional approaches rely on two key assumptions:
80 that black carbon (BC) is the sole light-absorbing component at 880 nm, and that BC is
81 completely uncorrelated with deduced secondary BrC. Ambient aerosols are subjected to
82 common meteorological influences, such as regional transport and boundary layer dynamics.
83 Moreover, some secondary BrC species can be formed from precursors co-emitted with BC
84 during combustion processes, leading to a weak but non-negligible correlation between BC and
85 secondary BrC (Gentner et al., 2017; Jathar et al., 2013). The above approaches also lack the
86 ability to determine BrC concentrations. To overcome these limitations, the recently developed
87 Bayesian inference (BI) model enables the hourly determination of BrC mass concentrations
88 by synergistically integrating total carbon (TC) measurements with multi-wavelength
89 aethalometer data (Liao et al., 2024). This advancement provides a unique opportunity to delve



90 more deeply into the primary and secondary BrC. Complementarily, organic-tracer based
91 source apportionment using positive matrix factorization (PMF) model has been widely
92 employed to distinguish secondary organic carbon (SOC) from primary organic carbon
93 (POC)(Wang et al., 2017, 2019b). Notably, when combined with high-time-resolution
94 measurements of a comprehensive suite of organic molecular tracers, this method can resolve
95 contributions from specific emission sources-beyond bulk organic aerosol factors-and
96 elucidate their diel variations and formation processes (Li et al., 2020a; Zhu et al., 2021). Its
97 applicability has recently been extended to the separation of secondary versus primary organic
98 nitrogen as well (Yu et al., 2025). By integrating high-time-resolution organic tracer data with
99 BI-derived BrC mass concentrations, it is possible to separate secondary BrC and investigate its
100 formation mechanisms and driven factors under real atmospheric conditions.

101 In this study, we quantified hourly BrC concentrations in urban Shanghai from March to
102 August 2020 using the BI method, based on online measurements of multi-wavelength light
103 absorption and TC. Concurrently, a comprehensive suite of bihourly organic molecular tracers-
104 representative of distinct primary emission sources and secondary formation processes-were
105 measured alongside major aerosol chemical components and elemental tracers. These high time
106 resolution measurement data enabled us to quantitatively apportion BrC sources and examine
107 its dynamic evolution in the atmosphere, using an organic-tracer based source apportionment
108 model. Furthermore, we investigated the sources and chemical evolution of secondary BrC to
109 complement our current limited knowledge about its formation and atmospheric evolution.

110

111 **2. Methodology**

112 **2.1 Sampling site and measurement period**

113 The field measurements were conducted at the Shanghai Academy of Environmental
114 Sciences (SAES, 31.10°N, 121.25°E), located in the Xuhui district of urban Shanghai, China.
115 The sampling site can be regarded as a receptor site influenced by mixed sources emissions
116 from both local and regional contributions. Measurements were carried out from 1 March to 31
117 August 2020, encompassing the spring (March-May) and summer (June-August) seasons.

118 **2.2 Online attenuation measurement and BrC mass concentration estimation using the BI** 119 **modeling**

120 Online multi-wavelength light absorption data were measured using an Aethalometer
121 (AE30, Magee Scientific, U.S.A.). Raw Aethalometer measurements are subject to several
122 artifacts, including the filter matrix effect (multiple scattering), the loading effect (shadowing)
123 and the scattering effect. In this study, we applied the Weingartner correction method
124 (Weingartner et al., 2003) to correct the filter-loading effect associated with particle



125 accumulation on the filter, using Eq1-2. The aerosol light absorption coefficients in ambient air
126 (b_{abs}) were subsequently calculated by correcting the multiple-scattering effect caused by the
127 filter matrix, following Eq3.

$$128 \quad eBC_{\text{corrected}} = \frac{eBC_{\text{raw}}}{R(ATN)} \quad (1)$$

$$129 \quad R(ATN) = \left(\frac{1}{f} - 1 \right) \times \frac{\ln(ATN) - \ln(10)}{\ln(50) - \ln(10)} + 1 \quad (2)$$

$$130 \quad b_{\text{abs}} = \frac{eBC_{\text{corrected}} \times \sigma_{ATN}}{C} \quad (3)$$

131 Where $eBC_{\text{corrected}}$ denotes the corrected equivalent BC mass concentration, and eBC_{raw}
132 represents the raw equivalent BC concentrations prior to correction. ATN is the filter attenuation,
133 and f is an empirical compensation parameter for the filter loading effect. The parameter f was
134 determined using the Aethalometer Data Processor (ADP) developed on the Igor Pro platform
135 (Wu et al., 2018). Different f values were evaluated by examining the continuity and
136 smoothness of the corrected time series across filter change points. The optimal continuity for
137 the absorption coefficients at all wavelengths was achieved with $f = 1.15$, which was therefore
138 adopted in this study. σ_{ATN} is the mass absorption cross section of BC. C is the multiple-
139 scattering parameter, which depends on the filter material and the mixing state of the particles.
140 Following previous studies, a value of $C = 3.5$ was adopted herein (Wu et al., 2024a).

141 After obtaining the corrected b_{abs} data, hour-by-hour BrC mass concentrations were
142 subsequently estimated via the BI method, following Eq4-5. The BI model inputs included the
143 corrected seven-wavelength light absorption coefficients (i.e., b_{370} 、 b_{470} 、 b_{520} 、 b_{590} 、 b_{660} 、
144 b_{880} and b_{950}) and hourly TC concentrations, which were measured by an RT-4 carbon analyzer
145 (Sunset Laboratory Inc., U.S.A.).

$$146 \quad TC = BC + BrC + WtC \quad (4)$$

$$147 \quad b_{\lambda_i} = MAE_{\lambda_i}^{BC} \times BC + \left(K^{BrC} \times \lambda_i^{-AAE^{BrC}} \right) \times BrC, i = 1, 2, 3, \dots, 7 \quad (5)$$

148 Where TC, BC, BrC and WtC are the concentrations of TC and its three carbon
149 components. $MAE_{\lambda_i}^{BC}$ is the mass absorption efficiency of BC at wavelength λ_i . K^{BrC} is a sample-
150 dependent constant, and AAE^{BrC} describes the wavelength dependence of light absorption for
151 BrC. We adopted the likelihood function and prior distributions parameterization established in
152 previous studies (Li et al., 2026; Liao et al., 2024). Detailed principles of the BI model and its
153 parameter settings are described in Liao et al. (2024).

154 155 2.3 Online measurements of organic tracers and other supportive data



156 Bihourly organic markers were measured using an Aerodyne TAG coupled with a GC-MS
157 system (Agilent GC 7890B/MSD 5977B), and detailed instrumental specifications and data
158 quality assurance procedures are described in Wang et al. (2026) and Zhu et al. (2025) In this
159 study, 1-h ambient samples were collected and analyzed at every even hour. Due to instrument
160 maintenance, data were unavailable during 21/5-16/6 and 29/7-14/8. A comprehensive suite
161 of organic tracers was measured, including saccharides, nitroaromatic compounds (NACs),
162 polycyclic aromatic hydrocarbons (PAHs), fatty acids, hopanes and secondary organic aerosol
163 (SOA) tracers. Polar organic compounds were derivatized to their trimethylsilyl derivatives
164 under a helium stream saturated with the derivatization agent N-methyl-N-(trimethylsilyl)
165 trifluoroacetamide (MSTFA), whereas non-polar organic compounds were analyzed directly
166 after thermal desorption by GC-MS.

167 Complementary PM chemical speciation measurements included hourly PM_{2.5} mass
168 concentrations measured using a beta attenuation particulate monitor (FH62-C14, Thermo
169 Fisher, U.S.A.), water-soluble inorganic ions by MARGA (Metrohm, Switzerland), and trace
170 elements by a Xact 625 X-ray fluorescence multi-metal analyzer (Cooper Environmental,
171 U.S.A.). In addition, gaseous pollutants (CO, NO_x, SO₂, and O₃) and meteorological parameters
172 (wind direction, wind speed, temperature, and relative humidity) were concurrently monitored.

173 **2.3. Organic-tracer based source apportionment for BrC by PMF**

174 In this study, the EPA PMF 5.0 model was employed to apportion the sources of BrC.
175 Previous studies have demonstrated that incorporating source-specific organic tracers
176 enables more accurate source estimation of PM_{2.5} and OC (Wang et al., 2017, 2019b). Unlike
177 conventional PMF applications, our analysis specifically targeted the source apportionment for
178 BrC mass concentrations. We incorporated a comprehensive organic tracer data with the effort
179 to resolve more detailed sources for BrC, especially secondary BrC. The input species for the
180 PMF model included three BI-derived carbonaceous components (BC, BrC and WtC), three
181 water-soluble inorganic species (SO₄²⁻, NO₃⁻, and NH₄⁺), ten elements (K, Ca, Cr, Mn, Fe, Ni,
182 Zn, Se, Ba, and Pb), and ten organic molecular tracers measured by TAG (fatty acids, hopanes,
183 PAHs, NACs, saccharides, azelaic acid, aromatic SOA tracers, isoprene SOA tracers, α -pinene
184 SOA tracers, and β -caryophyllinic acid). A complete list of input species is provided in Table
185 S1.

186 To evaluate the stability of the PMF solution, bootstrapping (BS) and displacement (DISP)
187 analysis were performed. A BS mapping frequency exceeding 80% (with a correlation
188 coefficient $R \geq 0.6$ between the BS factors and the base-run factors) was considered indicative
189 of stable factor assignment. The DISP results were deemed acceptable when no significant
190 decrease in the scaled residual Q (i.e., %dQ < 1%) and no factor swapping were observed.



191

192 3. Results and discussion

193 3.1 Abundance and variations of BrC

194 The temporal variations in aerosol components, organic tracers, and meteorological
195 conditions over the entire field measurements are presented in Figure 1, with seasonal and
196 period-average concentrations summarized in Table S1. Throughout the study, PM_{2.5} mass
197 concentrations exhibited a wide range (3.6 to 111.1 µg/m³), with higher levels observed in
198 spring (33.0±20.9 µg/m³) compared to summer (26.0±15.3 µg/m³). TC concentrations ranged
199 from 0.89-19.9 µg/m³, averaging 4.95±2.71 µg/m³ in spring and 4.65±2.65 µg/m³ in summer,
200 contributing 12% and 16% to PM_{2.5} mass, respectively. BrC concentrations ranged from 0.25-
201 13.62 µg/m³, with average values of 1.47±1.23 µg/m³ in spring and 1.63±1.17 µg/m³ in summer.
202 BrC contributed 38% and 39% to TC mass and 4% and 6% to PM_{2.5} mass in spring and summer,
203 respectively. TAG-measured total organics were higher in summer (314.0±216.5 ng/m³) than
204 in spring (216.1± 141.1 ng/m³). The predominant species transitioned from fatty acids (42%)
205 and saccharides (36%) in spring to isoprene SOA tracers (36%) in summer, alongside fatty acids
206 (26%) and saccharides (23%). The naming and grouping of the organic tracers are shown in
207 Table S2.

208 The monthly diurnal variations of BrC are presented in Figure 2. Generally, the relative
209 abundance of BrC in total TC remained relatively stable throughout the study period,
210 contributing 38-40% to TC mass. In spring, obvious enhanced BrC concentrations was
211 observed from March to May, yet no apparent diurnal pattern was observed. In contrast, during
212 summer (June–August), BrC concentrations were comparable across months but exhibited
213 distinctly higher daytime levels, with a bimodal distribution characterized by a noontime peak
214 (11:00–15:00) and an evening peak (18:00–20:00). The noontime peak was most pronounced in
215 August, suggesting enhanced daytime formation. These contrasting seasonal behaviors
216 indicated that BrC in spring and summer are governed by different formation pathways and
217 emission sources. Accordingly, further investigations into the chemical composition, sources,
218 and atmospheric evolution of BrC—particularly its secondary fraction—are warranted.

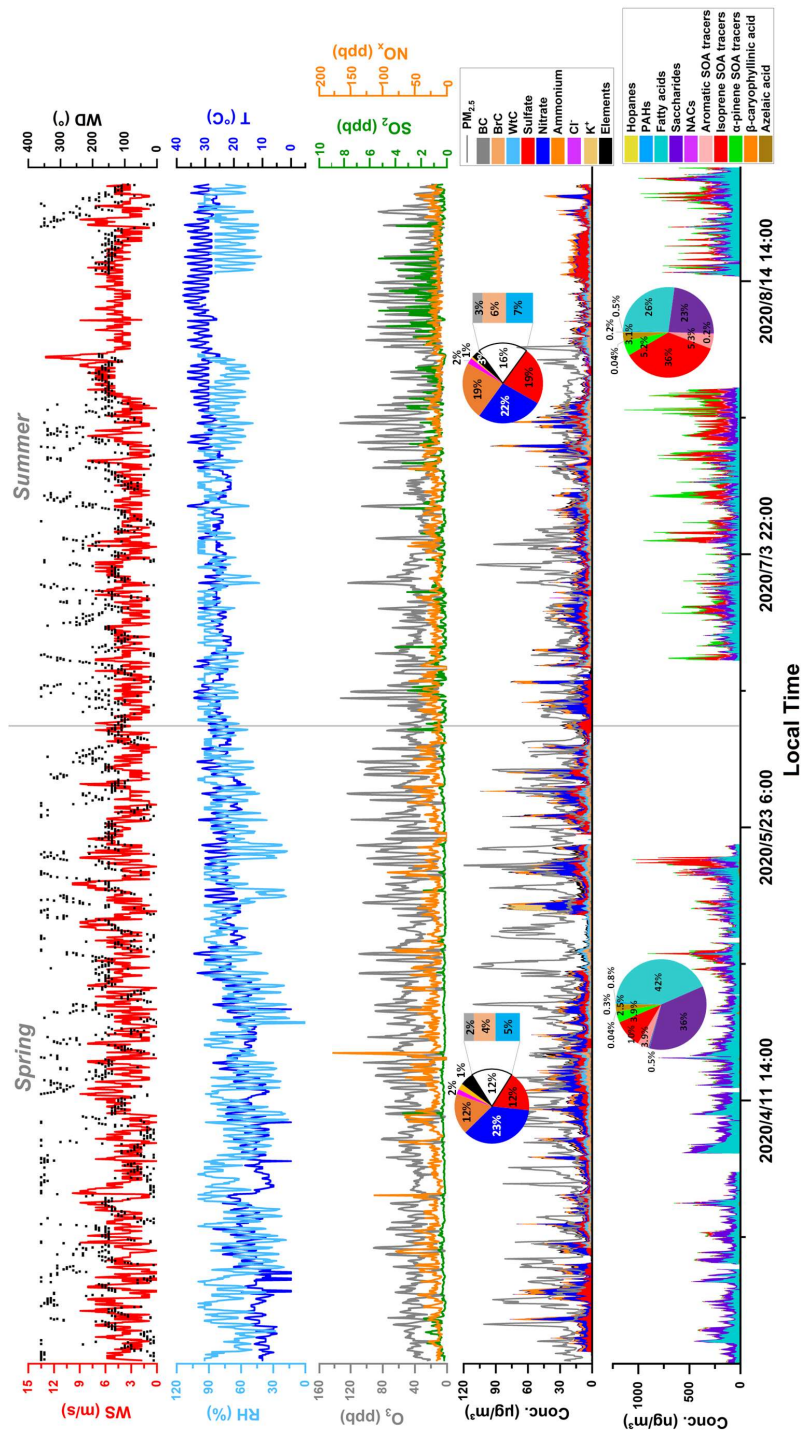


Figure 1. Temporal variations of PM_{2.5} bulk components, carbonaceous aerosols, organic tracers, gaseous pollutants (SO₂, NO_x, and O₃), and meteorological parameters (temperature-T, relative humidity-RH, and wind speed-WD) during the campaign period in Shanghai.

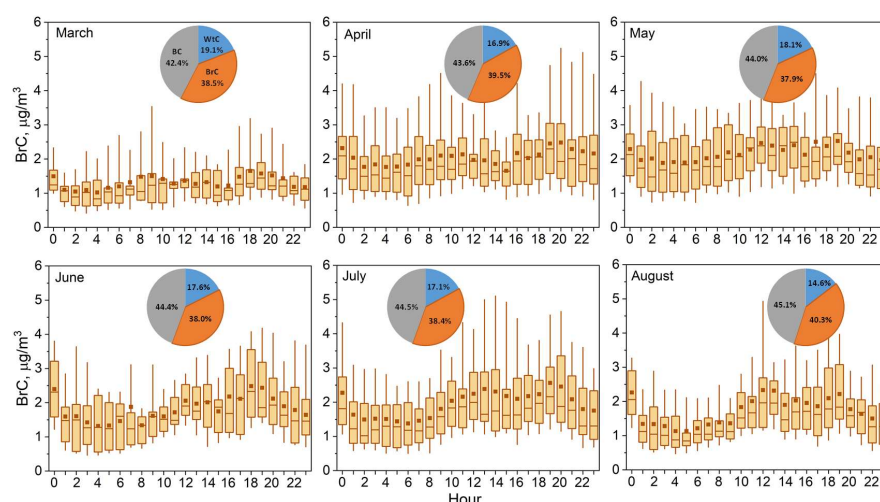


Figure 2. Monthly diurnal variations of BrC during the study period from 1/3/2020-31/8/2020 in Shanghai (squares and solid lines correspond to mean and median values, respectively; box indicates the 25th and 75th percentiles, and whiskers are the 10th and 90th percentiles). The insert pie chart shows the fraction of the three carbon components (i.e., BC, BrC and WtC).

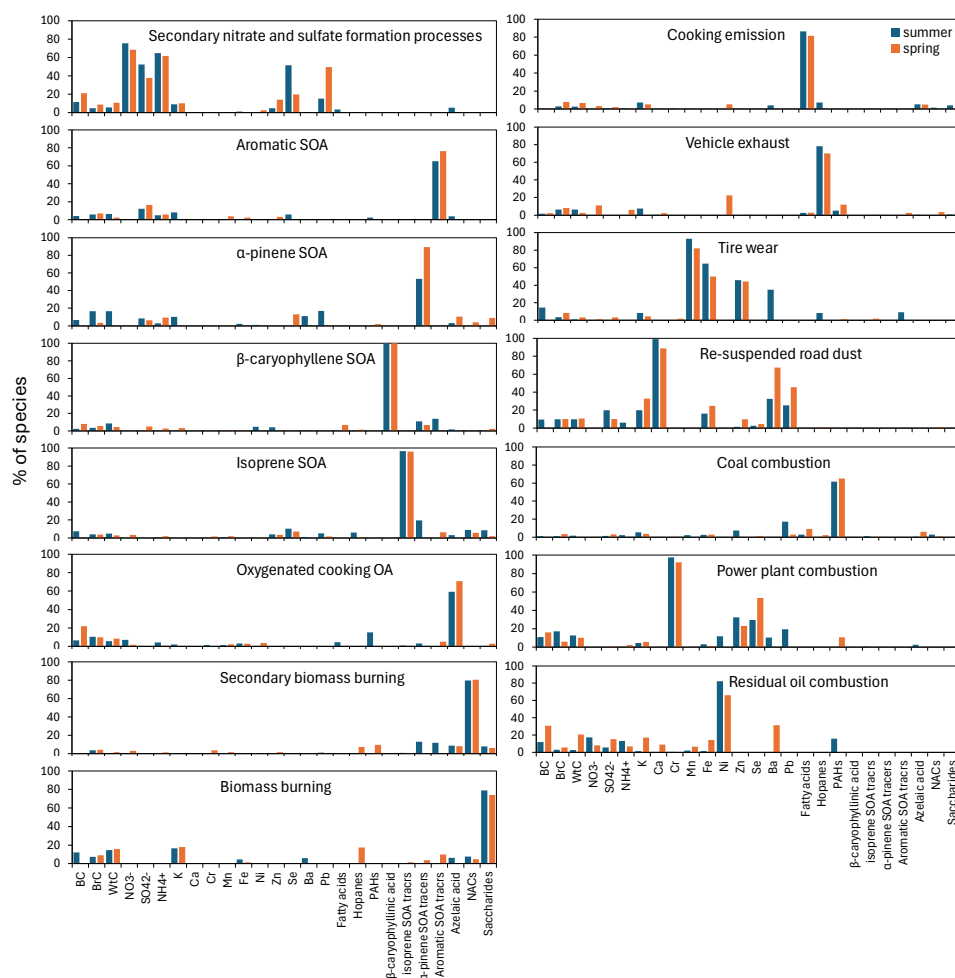
3.2. Source apportionment of BrC by PMF with organic and elemental tracers

The sources of BrC were evaluated using the PMF model, taking advantage of the comprehensive chemical speciation dataset, especially the high-time-resolution measurements of source-specific organic tracers and BI-derived BrC concentrations. To accentuate seasonal differences, spring and summer data were input separately into the PMF model. Unlike previous source apportionment studies in this region, which focused on bulk PM_{2.5} or OC, our analysis specifically targets BrC mass. The inclusion of a suite of bihourly source-specific organic and elemental tracers enabled us to resolve previously unidentified sources and capture rapid fluctuations in source activities and atmospheric processes. This facilitated robust diurnal pattern analysis of source contributions—a temporal resolution unattainable in earlier work and critical for deriving accurate source estimates (Wang et al., 2018). Five to eighteen factors were initially tested, and a fifteen-factor PMF solution was selected for both seasonal datasets. The error estimation results of the PMF runs (summarized in Tables S3&S4) indicated that the selected PMF runs passed the BS and DISP tests, confirming robust solutions. The PMF-predicted BrC mass agreed well with measured values, with slope of 0.82 and R_p of 0.91 (Figure S1). The factor profiles of the fifteen-factor solutions are shown in Figure 3 and temporal trends and diurnal variations of individual factor contributions are presented in Figures S2-S3, while Figure 4 highlights the diurnal variations of each factor's percentage contributions to BrC.

Factor identification was based on established organic and elemental tracers and is generally consistent with previous studies in this region (Wang et al., 2018; Zhu et al., 2021). Briefly, the secondary nitrate and sulfate formation process factor was identified by high loadings of sulfate,



248 ammonium and nitrate (Figure 3). BrC associated with this factor reflects formation pathways similar
249 to those of secondary inorganic aerosols. This factor exhibited higher percentage contributions during
250 nighttime hours, with more pronounced contributions in spring (Figure 4). Among SOA factors, we
251 resolved aromatic SOA factor, α -pinene SOA, isoprene SOA and β -caryphyllene SOA based on their
252 respective tracers, which trace back to specific volatile organic compound (VOC) precursors. Distinct
253 diurnal patterns were observed for these SOA factors. Aromatic SOA showed comparable seasonal
254 contributions with higher daytime values in both seasons. α -pinene SOA peaked at late afternoon hours
255 (16:00-20:00), particularly in summer. β -caryphyllene SOA contributed more in spring overall, but with
256 higher daytime contributions in summer. Isoprene SOA was substantially enhanced in summer, with
257 nighttime dominance. The oxygenated cooking OA factor was identified by azelaic acid, which was the
258 main oxidation products of unsaturated fatty acids such as oleic acid (Wang and Yu, 2021). This factor
259 showed clear noontime and dinner-time peaks, with higher contributions in summer (Figure 4). During
260 dinner hours (20:00-22:00), average contributions reached 15-20% of total BrC. Secondary biomass
261 burning was identified by NACs, and it showed comparable seasonal contributions with slightly higher
262 daytime values. Biomass burning was identified by saccharides and it contributed more during
263 nighttime hours, with similar magnitude across seasons. The cooking emission factor was identified by
264 fatty acids, and this factor showed higher contributions in spring, with distinct noontime and dinner
265 times peaks. Vehicle exhaust factor was identified by high loadings of hopanes, while tire wear was
266 characterized by high loadings of Mn and Fe, typical non-exhaust emission tracers (Wang et al., 2018).
267 Both factors correlated well with NO_x (Figure S4), and displayed clear morning rush-hour peaks (Figure
268 4), confirming their traffic origin. The two factors both showed higher contributions in spring. Re-
269 suspended road dust was identified by Ca and Ba and it showed bimodal distributions with higher
270 daytime contributions, indicating the resuspension of road dust caused by passing vehicles (Wang et al.,
271 2022). This factor showed comparable seasonal contributions. Coal combustion, identified by PAHs,
272 also showed higher contributions in spring. Power plant combustion, identified by Cr, Zn and Se,
273 exhibited higher contributions in summer. Residual oil combustion was identified by Ni, with higher
274 contributions in spring.



275

276 **Figure 3.** (a) Source profiles (percentage of species) of individual factors resolved by organic tracer-
277 based PMF model using measurement data in spring (March-May) and summer (June-August).

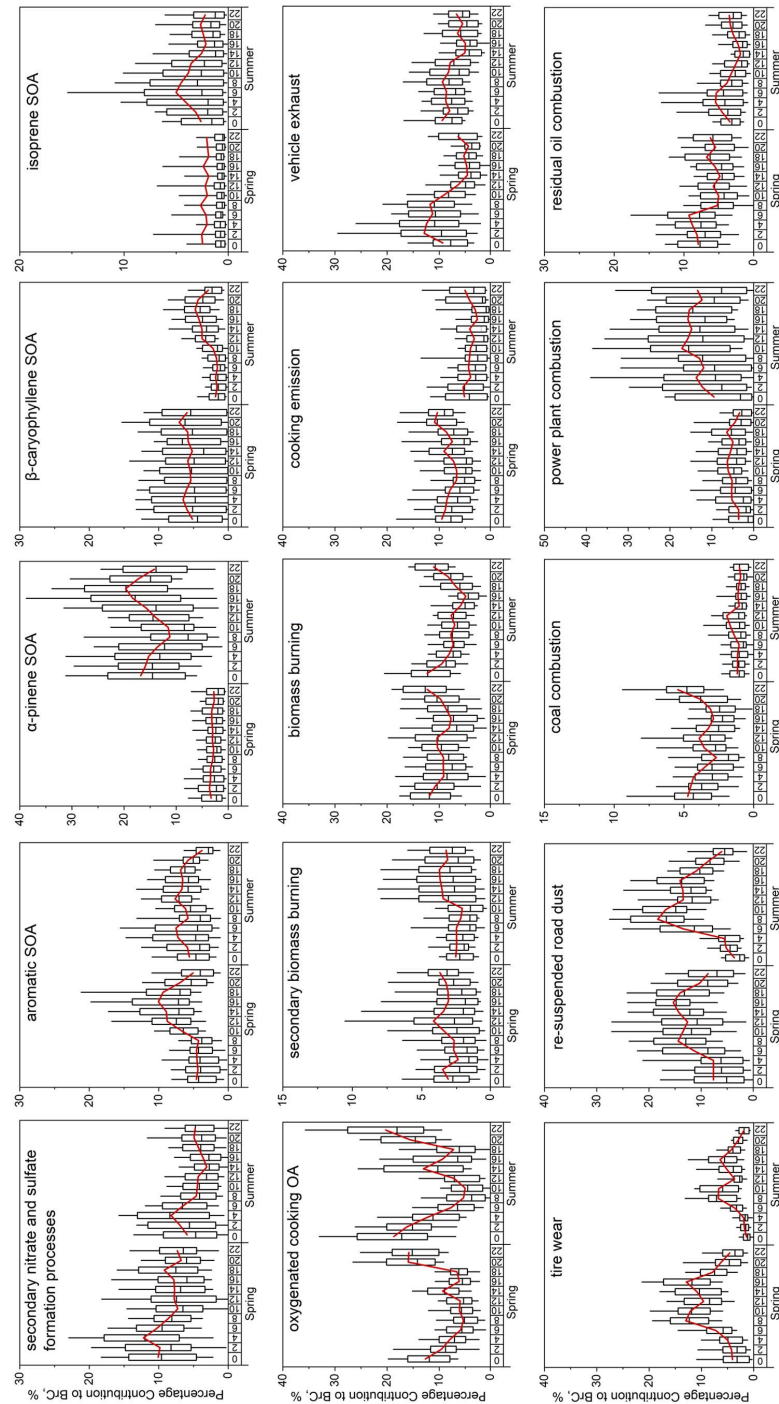


Figure 4. Diurnal variation of individual factor contributions to BrC from PMF results (25th and 75th percentile whiskers; the dashed line is the median value, and the solid red line is the mean value).



281 Figure 5a&b shows the seasonal and diurnal average of source contributions to BrC.
282 Briefly, BrC mass were dispersed into different sources, reflecting its diverse emission sources
283 in the complex urban atmosphere. BrC derived from the secondary sources are regarded as
284 secondary BrC, namely, secondary nitrate and sulfate formation processes, aromatic SOA, α -
285 pinene SOA, β -caryophyllene SOA, isoprene SOA, oxygenated cooking SOA, and secondary
286 biomass burning. Overall, 58% ($0.92 \mu\text{g}/\text{m}^3$) and 51% ($0.89 \mu\text{g}/\text{m}^3$) of the BrC mass was
287 attributed to primary emissions. Among the primary sources, re-suspended road dust, biomass
288 burning and vehicle exhaust were the major sources in spring, contributing to 10%, 9%, and 8%
289 of BrC, respectively. While in summer, power plant combustion, re-suspended road dust and
290 biomass burning were the major contributors, with contributions of 17%, 10%, and 7% of BrC,
291 respectively. Besides well-documented contributions of biomass burning and vehicle exhaust
292 to BrC, we identified significant portion of BrC from re-suspended road dust, suggesting the
293 importance of the non-exhaust emission to BrC. Figure 5c shows the variations of the source
294 contributions with increasing BrC mass. Among the primary sources, power plant combustion
295 showed both increased mass and enhanced percentage contribution with increasing BrC mass,
296 especially in summer, suggesting the importance of coal combustion in power plants as major
297 primary sources.

298 Secondary BrC accounted for significant proportions of the total BrC in both seasons,
299 with contributions of 42% ($0.67 \mu\text{g}/\text{m}^3$) and 49% ($0.85 \mu\text{g}/\text{m}^3$) in spring and summer,
300 respectively (Figure 5a). Seasonal contrast of the composition of the secondary BrC was noticed
301 between spring and summer. In spring, the major source contributors to secondary BrC were
302 oxygenated cooking OA and secondary sulfate and nitrate formation processes, contributing to
303 9.6% and 8.8% of BrC, respectively. In summer, the main contributors were α -pinene SOA and
304 oxygenated cooking OA, contributing to 16.5% and 10.4% of BrC, respectively. Decrease of
305 the total secondary BrC was noticed in the nighttime to early morning hours during 20:00-08:00,
306 while the total secondary BrC gradually increased from 08:00-14:00, especially in summer
307 (Figure 5b). Enhanced secondary proportion was observed with increased BrC mass, suggesting
308 the increasing significance of secondary production of BrC (Figure 5c). Among the seven
309 secondary sources, isoprene SOA and secondary biomass burning exhibited both increased
310 mass and enhanced percentage contribution with increasing BrC mass, suggesting their
311 important roles in secondary BrC formation.

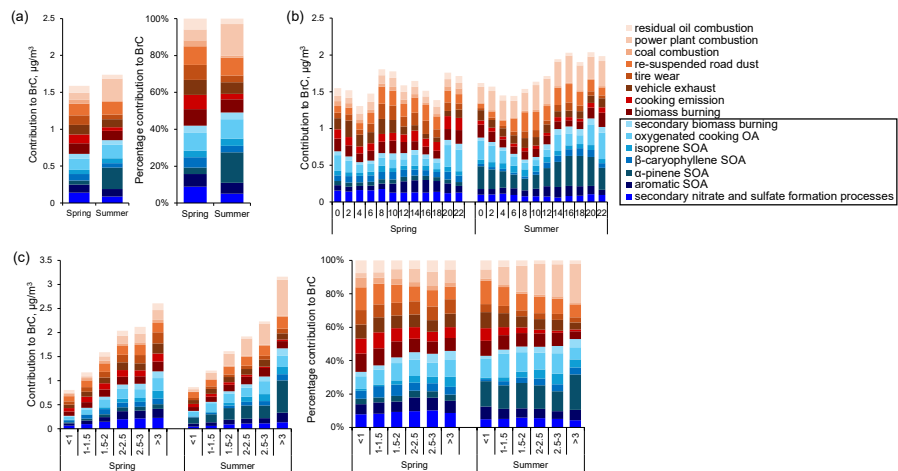


Figure 5. (a) Seasonal average of mass and percentage contributions of individual source factors to BrC; (b) diurnal variations of the source contributions to BrC; (c) average mass and percentage contributions of individual source factors to BrC grouped by different BrC mass concentrations.

3.3. Factors driven the increment of secondary BrC

To further investigate the formation mechanisms of secondary BrC under varying urban atmosphere, we focus on the cases where secondary BrC concentrations showed continuous increment for at least for 6 consecutive hours and remained above the period-mean abundance. Overall, we extracted a total of 26 such events and Figure S5 shows their temporal distributions. Summer accounted for the majority of these events (17 out of 26), indicating more frequent secondary BrC formation during the warmer season. To distinguish between local formation and regional transport, we classified events based on wind speed, following previous studies (Yu et al., 2025; Zhou et al., 2022). Wind speed exceeding 3 m/s were taken to indicate the impact from local air masses, thereby representing local secondary BrC formation. Under this criterion, a total of nine local formation events were observed, suggesting that regional transport was the dominant driver of secondary BrC enhancement, particularly in summer. In this study, we mainly focus on these nine local formation events in the following analysis. Based on their characteristic contributing sources, the nine events were further categorized into six distinct types and Table S5 summarizes the occurrence time and the associated gas pollutants and meteorological conditions for each of these events.

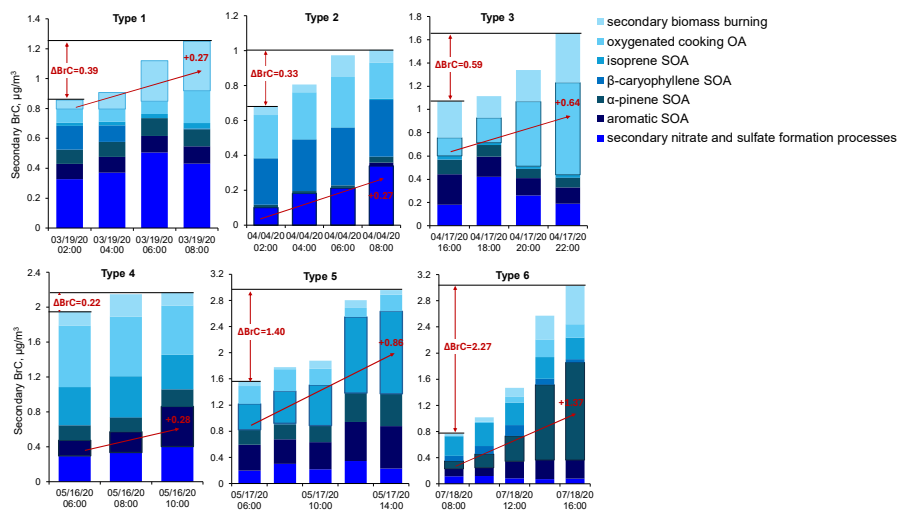
Figure 6 plots the source contributions to secondary BrC during the six types of local formation events. Type 1, observed from midnight to early morning in spring, exhibited a total BrC increment of 0.39 $\mu\text{g}/\text{m}^3$. This increase was predominantly driven by secondary biomass



burning, which contributed $0.27 \mu\text{g}/\text{m}^3$, accounting for 69% of the total secondary BrC increment. The elevated BrC can be attributed to enhanced formation of NACs, such as 4-nitrocatechol, through nitration of phenolic VOCs emitted by biomass burning via gas-phase or aqueous-phase pathways (Mayorga et al., 2021). Notably, the main sources of secondary BrC in this event is secondary nitrate and sulfate formation processes, which shared NO_x , a common precursor with NACs formation, suggesting a concurrent formation regime. Type 2 featured secondary nitrate and sulfate formation processes as the dominant driver of secondary BrC increment, accounting for 82% of the total increment ($0.33 \mu\text{g}/\text{m}^3$). This event also occurred from midnight to early morning, underscoring the importance of nocturnal nitrate formation processes (Zhou et al., 2022). This fraction of secondary BrC likely reflects the formation of organic nitrates, which are recognized as important BrC components (Wu et al., 2024b). Typical formation pathways of organic nitrates include NO_3 -initiated oxidation of alkenes, which proceeds efficiently during nighttime hours (Yu et al., 2019). Type 3 occurred from afternoon to nighttime with the largest increment during dinner hours (20:00-22:00) and it showed a total secondary BrC increment of $0.59 \mu\text{g}/\text{m}^3$. Oxygenated cooking OA was the predominant contributor, contributing to 108% of the total increment. This factor also dominated the overall secondary BrC composition during this event. Importance of cooking emissions to OC at this site has been reported in previous studies (Wang and Yu, 2021), the results in this study suggest that oxygenated cooking OA can contribute significantly to BrC, possibly due to nitration reactions of cooking-emitted unsaturated fatty acids, forming nitrogen-containing organics (Hung et al., 2005). Type 4 occurred in the morning and showed a moderate BrC increment ($0.22 \mu\text{g}/\text{m}^3$). This event was featured by aromatic SOA as the driving factor to secondary BrC increment, contributing to 127% of the net increase. The ambient conditions during this event showed high concentrations of NO_x , high RH, but notably low ozone concentrations (Table S5). The results suggested the importance NO_x -initiated oxidation of aromatic VOCs, producing nitrogen-containing organics which are known chromophores contributing to BrC. Type 5 occurred in daytime and persisted for 8 hours and was dominated by isoprene SOA, which contributed 61% of the total BrC increment. The largest increment occurred around noontime (12:00-14:00), coinciding with peak solar radiation. This event was characterized by high temperatures and elevated ozone concentrations, underscoring the dominant role of photochemical formation in producing isoprene SOA. Type 6 events, totaling four, occurred in summer. Figure 6 shows a representative case and the remaining three presented in Figure S6. These events occurred during daytime under elevated ozone levels and exhibited the largest secondary BrC increment ($2.27 \mu\text{g}/\text{m}^3$). α -pinene SOA was the predominant contributor, accounting for 60% of the total BrC increase. The maximum increment was recorded in the afternoon (14:00-16:00) with the highest ozone concentrations, indicating enhanced photochemical formation of α -pinene SOA under strong oxidative conditions.



374



375

376 **Figure 6.** Six types of secondary BrC increment events with different dominant formation
377 pathways observed across the field measurements. Type 1 was driven by secondary biomass
378 burning, type 2 by secondary nitrate and sulfate formation processes, type 3 by oxygenated
379 cooking OA, type 4 by aromatic SOA, type 5 by isoprene SOA and type 6 by α -pinene SOA.

380

381 4 Conclusions

382 Accurate estimation of BrC mass from the carbonaceous aerosols remains a significant
383 challenge, hindering robust evaluation of its climatic and air quality impacts. In this study, we
384 quantified hourly BrC mass concentrations in urban Shanghai from March to August 2020 by
385 synergistically applying the BI model to multi-wavelength aethalometer and TC measurements,
386 overcoming the methodological limitations inherent in conventional optical-based separation
387 approaches. The BI-derived BrC accounted for 38-40% of total TC across the study period,
388 with distinct diurnal patterns observed between spring and summer months, pointing to
389 seasonally varying sources and formation pathways. Taking advantage of a
390 comprehensive suite of concurrently measured bihourly organic and elemental tracers, we
391 apportioned BrC sources and disentangled primary versus secondary BrC using an organic-
392 tracer-based PMF model. A total of 15 factors were resolved, including 7 secondary sources,
393 each exhibiting characteristic diurnal profiles. Overall, secondary BrC contributed 42% and 49%
394 of total BrC in spring and summer, respectively. Seasonal contrast of the source contributions
395 to secondary BrC was observed, with dominant contributors of oxygenated cooking OA and
396 secondary sulfate and nitrate formation processes in spring and α -pinene SOA and oxygenated
397 cooking OA in summer. Case studies of secondary BrC increment events further revealed the



398 involvement of diverse precursors and chemical processes, underscoring the complexity of
399 secondary BrC formation and evolution in the urban atmosphere.

400 This study demonstrates the powerful applicability of integrating the BI model with
401 organic-tracer-based PMF analysis for source apportionment of atmospheric BrC. The high-
402 time-resolution quantification of secondary BrC from multiple sources provides unprecedented
403 insight into its dynamic formation mechanisms under ambient conditions, complementing
404 laboratory-based mechanistic studies. Our findings offer a scientific basis for
405 developing targeted mitigation strategies aimed at reducing BrC emissions and improving air
406 quality in urban environments.



407 **Data availability**

408 Data used in this study are available upon request from the corresponding author.

409

410 **Author contributions**

411 QW: conceptualization, formal analysis, writing-original draft; ZH and ZL: data curation; SZ:
412 measurements of the organic tracers, writing-review and editing. LQ, MZ, DH, HW, QF and
413 KL: data curation, and YJZ: writing-review and editing.

414

415 **Competing interests**

416 The contact author has declared that none of the authors has any competing interests.

417

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