



Chemical characteristics of brown carbon in atmospheric particles at a suburban site near Guangzhou, China

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Abstract:

Light-absorbing organic carbon (or brown carbon, BrC) in atmospheric particles has received much attention for its potential role in global radiative forcing. While a number of field measurement campaigns have differentiated light absorption by black carbon (BC) and BrC, the chemical characteristics of BrC are not well understood. In this study, we present co-located real-time light absorption and chemical composition measurements of atmospheric particles to explore the relationship between the chemical and optical characteristics of BrC at a suburban site downwind of Guangzhou, China from November to December 2014. BrC and BC contributions to light absorption were estimated using measurements from a seven-wavelength aethalometer, while the chemical composition of non-refractory PM₁ was measured with a high resolution time-of-flight aerosol mass spectrometer (HR-ToF-AMS). Using the Absorption Angstrom Exponent (AAE) method, we estimated that BrC contributed 23.6% to the total aerosol absorption at 370 nm, 18.1% at 470 nm, 10.7% at 520 nm, 10.7% at 590 nm, and 10.5% at 660 nm. Biomass burning organic aerosol (BBOA) has the highest mass absorption coefficient among sources of organic aerosols. Its contribution to total brown carbon absorption coefficient decreased but that of low-volatility oxygenated organic aerosol (LVOOA) increased with increasing wavelength, suggesting the need for wavelength-dependent light absorption analysis for BrC in association with its chemical makeup. Clear correlations of N-containing ion fragments with absorption coefficient were observed. These correlations also depended on their degrees of unsaturation/cyclization and oxygenation. While the current study relates light absorption by BrC to ion fragments, more detailed chemical characterization is warranted to constrain this relationship.



3 Introduction:

4 Atmospheric particles participate considerably in the global climate direct effect via their light-
5 scattering (e.g., sulfate) and/or light-absorbing components (e.g., black carbon, BC). BC is the
6 major contributor to light absorption that increases the atmospheric energy budget, but the
7 contribution of brown carbon (BrC) cannot be ignored. The BrC absorption contribution to total
8 aerosol forcing can reach 20–50% over regions dominated by seasonal biomass burning and
9 biofuel combustion (Feng et al., 2013). BrC absorbs light primarily at UV and short visible
10 wavelengths, absorbing negligible amounts at long visible wavelengths, while BC absorbs strongly
11 throughout the visible spectrum (Andreae and Gelencsér, 2006; Bergstrom et al., 2007; Bond and
12 Bergstrom, 2006). In global climate models, the direct radiative forcing of organic aerosols at the
13 top of atmosphere can shift from cooling (-0.08 Wm^{-2}) to warming ($+0.025 \text{ Wm}^{-2}$) when strong
14 BrC absorption is included (Feng et al., 2013). However, uncertainties in the sources, formation,
15 chemical composition, and absorption properties of BrC hinder more accurate estimations of
16 radiative forcing induced by atmospheric particles.

17 BrC is operationally defined and has many chemical constituents, which makes chemical
18 characterization quite challenging. Both primary and secondary organic aerosols can act as BrC
19 (Laskin et al., 2015). For example, biomass burning organic aerosol (BBOA) has been identified
20 as a contributor to BrC in rural areas in the southern United States (Di Lorenzo et al., 2017;
21 Washenfelder et al., 2015), while coal combustion organic aerosol (CCOA) contributes
22 substantially to BrC during winter in Beijing (Yan et al., 2017). Species from secondary formation
23 processes, such as humic-like substances (HULIS) formed by in-cloud processing (Rinco et al.,
24 2009), species from gas-phase photo-oxidation of volatile organic compounds (VOCs) in the
25 presence of NO_x , and species from reactions between carbonyl compounds and ammonia in the
26 aqueous film at the particle surface, can also contribute to BrC (Gen et al., 2018; Laskin et al.,
27 2010; Liu et al., 2015). Highly conjugated organics, nitro-aromatic compounds, imidazoles, and
28 other N-heterocyclic compounds have been found in BrC (Laskin et al., 2015; Lin et al., 2016).
29 Sun et al. (2007) also found that light-absorbing organic molecules in BrC are likely large (i.e.,
30 possessing > 18 carbon atoms); these molecules are generally highly unsaturated and contain three
31 or more oxygen atoms and/or one or more nitrogen atoms.

32 The Pearl River Delta (PRD) region, one of the most economically developed regions in China,
33 suffers under air pollution from a variety of sources (Chan and Yao, 2008; Li et al., 2017). Source



apportionment using positive matrix factorization (PMF) analysis of mass spectral data sets from high resolution time-of-flight aerosol mass spectrometry (HR-ToF-AMS) has revealed that the organic aerosol (OA) in this region arises from traffic emissions (i.e., hydrocarbon-like organic aerosol, or HOA), biomass burning (BBOA), cooking (COA), and secondary formation (i.e., oxygenated organic aerosols, or OOAs). In the PRD, HOA is often the largest contributor to OA at urban sites (He et al., 2011), while SOA plays a more important role at rural sites (Gong et al., 2012; Huang et al., 2011). BBOA has also been found to contribute significantly to total OA in the PRD region, with contributions of 24% at an urban site in Shenzhen (He et al., 2011) and 14% and 25% at rural sites in Heshan and Kaiping, respectively (Gong et al., 2012; Huang et al., 2011). Yuan et al. (2016) attributed 6-12% of the total aerosol absorption at 405 nm at a rural site in the PRD to BrC; the authors found higher BrC contributions during fall, which they ascribed to biomass burning (BBOA) activities nearby. However, the BrC components responsible for light absorption remain relatively unknown; this hinders a thorough understanding of the relationships between optical properties and chemical characteristics and, in turn, the realization of a generalized framework that can be extended to other sources and regions.

In this work, we present simultaneous measurements of aerosol chemical composition and light absorption of aerosol particles at a suburban site downwind of Guangzhou in the PRD, China. Contributions of BC and BrC to total aerosol light absorption were differentiated and quantified using measurements from a seven-wavelength aethalometer. Sources of OA, which were determined using PMF analysis, were correlated to BrC light absorption to identify the major contributor(s) to short-wavelength light absorption. More detailed chemical characteristics, such as N-containing ion fragments, the degree of unsaturation (indicated by the ion double bond equivalent, or ion DBE), and the degree of oxygenation (indicated by the number of oxygen atoms in ions), were also used to investigate the structural characteristics of BrC related to light absorption.

Methodology

1. Sampling site

We conducted field measurements at the Guangzhou Panyu Atmospheric Composition Station (GPACS, 23°00' N, 113°21' E), on the periphery of Guangzhou, China, from November 7, 2014



to January 3, 2015. The GPACS is located on top of a hill with an altitude of approximately 150 m a.s.l. (Cheung et al., 2016; Tan et al., 2013; Zou et al., 2015); it is approximately 15 km south of the city center and was downwind of the central city throughout the sampling period, during which north winds prevailed (Qin et al., 2017).

2. Measurements and data analysis

Aerosol light absorption was measured with a seven-wavelength aethalometer (Magee Scientific, model AE33) at 370, 470, 520, 590, 660, 880, and 950 nm. Ambient air was drawn through a 2.5- μm cut-off inlet at 2 L/min before entering the aethalometer; particles were collected on the filter substrate, and light attenuation at the wavelengths above was recorded continuously. The optical properties of the collected particles were determined by comparing light attenuation in particle-laden and particle-free filter areas (Weingartner et al., 2003). To convert aerosol particles light attenuation coefficients at the filter substrate to the light absorption coefficients suspended in the air, a real-time compensation parameter k and a fixed multiple scattering parameter C were used. The real-time loading effect correction was performed using two parallel measurements of optical attenuations at different accumulation rates. $C_{ref}=2.14$ for quartz filter and $C_{ref}=1.57$ for tetrafluoroethylene (TFE)-coated glass filter were recommended from previously studies for the fresh soot particles (Drinovec et al., 2015; Weingartner et al., 2003). However, with the presence of semi-volatile oxidation products, significantly higher values ($C=3.6\pm0.6$) were observed in the organic coating experiment using a quartz filter (Weingartner et al., 2003). Wavelength dependence of C has also been reported in the literature (Arnott et al., 2005; Schmid et al., 2006; Segura et al., 2014). A broad range of C (from 2.8 to 7.8) at several sites was also used by Collaud Coen et al. (2010). As the multiple scattering parameter (C) may be site specific, we further compared the absorption from AE33 with the co-located measurements. Here, we extracted the light absorption based on extinction and scattering measurements from cavity ring-down spectroscopy (CRD, Hexin XG-1000) and Nephelometer (TSI, 3563), respectively, as below.

$$b_{abs} = \sigma_{ext} - \sigma_{sp} \quad (1)$$

where b_{abs} , σ_{ext} and σ_{sp} are absorption coefficient, extinction coefficient and scattering coefficient.

The scatter plot of absorption at 532 nm from measurement from the aethalometer (AE33) and that calculated from CRD and Nephelometer (CRD-Neph) is displayed in Figure 1. AE 33 absorption



93 coefficient was higher than the absorption estimated from Eq. 1. by a factor of 2.10. Therefore, the
94 final multiple scattering parameter (C) was set to $C_{final} = C_{ref} \times 2.10 = 3.29$. This value is
95 comparable with previous aethalometer measurements ($C=3.48$) in the PRD region (Wu et al.,
96 2009, 2013).

97 The non-refractory chemical composition of submicron aerosols was measured with an Aerodyne
98 HR-ToF-AMS (Aerodyne Research Inc., Billerica, MA, USA). Briefly, the AMS collected five-
99 minute-average particle mass spectra for the high-sensitivity V plus particle time-of-flight (PToF)
100 mode and the high-resolution W mode. AMS data analysis was performed using the SQUIRREL
101 (v1.56D) and PIKA (v1.15D) toolkits in Igor Pro (WaveMetrics Inc., Lake Oswego, OR). Source
102 apportionment was performed via PMF analysis with Multilinear Engine 2 (ME-2) via the SoFi
103 interface (Canonaco et al., 2013). Five factors, including HOA, COA, BBOA, semi-volatile
104 oxygenated organic aerosol (SVOOA), and low-volatility oxygenated organic aerosol (LVOOA),
105 were resolved (Qin et al., 2017). The campaign average OA composition was dominated by
106 surrogates of SOA (SVOOA + LVOOA). However, freshly-emitted hydrocarbon-like organic
107 aerosols (HOA) contributed up to 40.0% of OA during high-OA periods; during nighttime, HOA
108 contributed 23.8% to 28.4% on average. BBOA contributed 9.6% ($1.87 \mu\text{g}/\text{m}^3$) of total OA in
109 November and 6.5% ($1.38 \mu\text{g}/\text{m}^3$) in December. AMS data treatment was discussed in detail in
110 Qin et al. (2017). Data from a thermo-optical elemental carbon and organic carbon (ECOC)
111 analyzer (Sunset Laboratory Inc.) were also used for comparison.

112 Results and discussion

113 1. Aerosol absorption

114 Figure 2a shows the box-whisker plot of aerosol absorption coefficients (b_{abs}) from 370 nm to 950
115 nm from the aethalometer measurements during the campaign. The campaign-average absorption
116 coefficients were 56.00 Mm^{-1} at 370 nm, 40.99 Mm^{-1} at 470 nm, 34.76 Mm^{-1} at 520 nm, 29.91
117 Mm^{-1} at 590 nm, 26.69 Mm^{-1} at 660 nm, 18.06 Mm^{-1} at 880 nm, and 16.71 Mm^{-1} at 950 nm.

118 In multi-wavelength absorption measurements, the total absorption Ångström exponent (AAE) can
119 be calculated by a power-law fitting of the absorption coefficient over all available wavelengths.
120 AAE of unity has been widely used for pure black carbon, while a shift to higher AAE value has
121 been observed with the presence of brown carbon. The reason behind is that BrC has a much
122 stronger absorption at UV and short visible wavelengths than at long visible wavelengths, which



123 yields a steeper curve (Andreae and Gelencsér, 2006; Bergstrom et al., 2007; Bond and Bergstrom,
 124 2006). The presence of non-absorbing OA shells over BC cores may also lead to a shift of AAE
 125 (Gyawali et al., 2009). This latter possibility is analyzed in a separated manuscript (Li et al., in
 126 preparation). As shown in Figure 2b, the AAE values, which average at 1.43, are almost always
 127 higher than 1, indicating appreciable contributions from BrC to particle light absorption at this site.

128
 129 To further explore the importance of BrC at this site, BrC absorption at a short wavelength λ_1
 130 (b_{BrC,λ_1}) can be derived by subtracting BC absorption (b_{BC,λ_1}) from the total aerosol absorption
 131 (Lack and Langridge, 2013) via:

$$132 \quad b_{BrC,\lambda_1} = b_{\lambda_1} - b_{BC,\lambda_1} \quad (2)$$

133 where absorption b_{λ_1} is the measured absorption at the short wavelength λ_1 . BC absorption at λ_1
 134 (b_{BC,λ_1}) can be obtained from the AAE value of BC (AAE_{BC}) via:

$$135 \quad b_{BC,\lambda_1} = b_{\lambda_2} \times (\lambda_2 / \lambda_1)^{AAE_{BC}} \quad (3)$$

136
 137 where b_{λ_2} is the absorption at a longer wavelength λ_2 (880 nm), which is assumed to have no
 138 contributions from BrC or dust (Drinovec et al., 2015; Zhu et al., 2017). The uncertainty involved
 139 in attributing BrC and BC absorption at short wavelengths has been explored explicitly by Lack
 140 and Langridge (2013).

141 Figure 3 shows the b_{abs} attributed to BC and BrC (b_{BC} and b_{BrC}) at different wavelengths. Aerosol
 142 light absorption coefficients were dominated by BC, but b_{BrC} was not negligible, especially at short
 143 wavelengths. The campaign-average b_{BrC} values were 13.67, 7.56, 4.49, 3.22, and 2.81 Mm⁻¹ at
 144 370, 470, 520, 590, and 660 nm, respectively; BrC absorption contributed 23.6%, 18.1%, 10.7%,
 145 10.7%, and 10.5% of the total absorption at the corresponding wavelengths. The proportions of
 146 BrC and BC in our campaign were slightly higher than those reported an earlier study in the PRD
 147 by Yuan et al. (2016). In their study, the average light absorption contributions of BrC during
 148 Shenzhen winter, Shenzhen fall, and Heshan fall campaigns were 11.7%, 6.3%, and 12.1% at 405
 149 nm and 10.0%, 4.1%, and 5.5% at 532 nm, respectively.

150 Figure 4 shows the diurnal variations of b_{BrC} at 370, 470, 520, 590, and 660 nm. At all wavelengths,
 151 b_{BrC} was relatively constant from 00:00 LT to 16:00 LT, at which time it began to increase, peaking



152 at 21:00 LT and then decreasing until 24:00 LT. These changes may be attributed to diurnal
153 changes in BrC sources, which most likely originated from crop residual burning in fall and winter
154 in nearby regions (Wang et al., 2017). The diurnal variations of the different wavelengths were not
155 significantly different, although short wavelengths exhibited more obvious diurnal variations.

156 2. Correlation of light absorption by BrC with OA components

157 To explore the possible sources of BrC, correlations were determined between b_{BrC} at 370 nm
158 ($b_{BrC,370}$) and various OA types. Data at 370 nm were chosen (over data at longer wavelengths) for
159 their higher signal-to-noise ratios and larger contributions of BrC to light absorption. Figure 5
160 shows that BBOA concentrations and $b_{BrC,370}$ were well correlated (Pearson's correlation
161 coefficient, $R_p = 0.58$). More interestingly, a moderate correlation ($R_p = 0.40$) was also found
162 between $b_{BrC,370}$ and the LVOOA mass concentration. Although the LVOOA factor was not further
163 resolved into OOA factors with biomass origins, it is likely that a portion of LVOOA was formed
164 from biomass burning precursors through either gas-phase oxidation or heterogeneous reactions.
165 Satish et al. (2017) found correlations between BrC absorption and both primary BBOA and
166 BBOA-related SVOOA factors. They also reported that the slope of the correlation between
167 $b_{BrC,370}$ and BBOA (slope = 1.35) was 4.8 times higher than that between $b_{BrC,370}$ and one of the
168 biomass burning SVOOA factors (slope = 0.28), indicating that aging may have reduced the
169 absorption capacity of biomass-related OA.

170 Multiple regression analysis was also used to resolve the correlation factors of each OA component
171 ($\text{m}^2 \text{g}^{-1}$) at each wavelength.

$$172 \quad b_{BrC} = a*[\text{HOA}] + b*[\text{COA}] + c*[\text{BBOA}] + d*[\text{SVOOA}] + e*[\text{LVOOA}] \quad (4)$$

173 where a, b, c, d, e indicates the correlation factors of each OA component ($\text{m}^2 \text{g}^{-1}$) and [...] indicates
174 the mass concentration of each OA component. These correlation factors obtained are equivalent
175 to MAC mass absorption coefficient (MAC) of each OA component. We will use these factors to
176 compare with MAC reported in the literature later.

177 Washenfelder et al. (2015) reported a MAC of $1.3 \pm 0.06 \text{ m}^2 \text{g}^{-1}$ using the b_{BrC} at 365 nm for
178 BBOA in the rural southeastern United States, which was 40 to 135 times higher than the MAC
179 values reported for other OA factors. Di Lorenzo et al. (2017) found that both BBOA and more-
180 oxidized oxygenated organic aerosol (MO-OOA) were associated with water soluble BrC and that



181 the MAC of BBOA doubled that of MO-OOA. However, Forrister et al. (2015) observed that BrC
182 in wildfire plumes had a lifetime of roughly 9 to 15 hours, probably due to conversion to SOA
183 with lower light absorption capacity. In our study, the MAC (correlation factor in Table 1) of
184 BBOA at 370 nm was $3.4 \pm 0.41 \text{ m}^2 \text{ g}^{-1}$, roughly 3.4 times that of LVOOA ($1.04 \pm 0.08 \text{ m}^2 \text{ g}^{-1}$).
185 Like the studies listed above (Forrister et al., 2015; Di Lorenzo et al., 2017; Washenfelter et al.,
186 2015), our results suggest that the absorption coefficient of nascent BBOA is higher than that of
187 its aged counterpart at short wavelength. However, it should be noted that LVOOA might consist
188 of some other non-absorbing SOA components with no biomass origin. It is therefore important to
189 consider chromophore lifetimes when modeling light absorption by BrC. As noted in Laskin et al.
190 (2015), the physicochemical properties of chromophores in BrC may exhibit dynamic changes that
191 are not yet sufficiently understood. In addition, the difference between MAC values of BBOA and
192 LVOOA decreased for longer wavelengths. The MAC values of BBOA were roughly 3.4, 1.8, 1.5,
193 1.48, and 0.80 times those of LVOOA at 370, 470, 520, 570, and 660 nm, respectively. The
194 contribution to total absorption coefficient also varied with wavelengths. The contribution from
195 BBOA decrease from 25.8% to 10.1% from 370 nm to 660 nm, while the contribution from
196 LVOOA increase from 49.3% to 60.2 % from 370nm to 660nm. The contribution of HOA was
197 more stable across different wavelengths but was also significant, likely due to the high mass
198 concentration of HOA. Altogether, these observations indicate that the wavelength-dependent light
199 absorption of different OAs must be considered in light absorption models.

200 3. Correlation of b_{BrC} with N-containing organic ions

201 The chromophores in BrC that are responsible for OA light absorption are not well characterized.
202 Structurally, light absorption depends on the extent of sp^2 hybridization, in which π electrons are
203 usually found (Bond and Bergstrom, 2006). Of the elements commonly found in OA, both C and
204 N have strong tendencies toward sp^2 hybridization. It has also been found that, despite their small
205 OA mass fraction contributions, N-containing organic species in OA can be responsible for
206 appreciable light absorption (Chen et al., 2016; Laskin et al., 2015). Thus, we examined the
207 correlations between b_{BrC} and N-containing ions from AMS measurements. These ion fragments,
208 including the $C_xH_yN^+$ and $C_xH_yO_zN^+$ families, likely originated from N-heterocyclic compounds.
209 Figure 6 shows that the mass loadings of $C_xH_yN^+$ and $C_xH_yO_zN^{++}$ families are correlated with b_{BrC}
210 at 370 nm and that correlations are stronger for fragments containing both N and O atoms. These
211 results are consistent with Chen et al. (2016), who suggested that organic compounds with O and



212 N atoms might contribute substantially to total light absorption and fluorescence in OA
 213 components.

214 The effects of oxygenation (as indicated by the number of O atoms in an ion) and
 215 unsaturation/cyclization (as indicated by the ion double bond equivalent, or ion DBE) were also
 216 examined for each $C_xH_yN^+$ and $C_xH_yO_zN^+$ ion family. Several studies found that species with high
 217 DBE values may have substantial network of conjugated double bonds and likely contribute to
 218 light absorption (Budisulistiorini et al., 2017; Laskin et al., 2014; Lin et al., 2016). The ion DBE
 219 represents the number of double bonds (unsaturation) or rings (cyclization) that an ion contains
 220 and is calculated on the basis of the elemental formula via the following equation:

$$221 \qquad \qquad \qquad DBE = C + 1 - H/2 - X/2 + N/2 \qquad \qquad \qquad (4)$$

222 where C, H, X, and N are the number of carbon, hydrogen, halogen (Cl, Br, I, and F), and nitrogen
 223 atoms present in the ion, respectively.

224 Figure 7a shows the correlation coefficients between $b_{BrC,370}$ and the mass loadings of each of the
 225 $C_xH_yN^+$ family at different DBE values. For the C_xH_yN family, R_p increased as DBE increased
 226 (except for ions with a DBE of 1), suggesting that $b_{BrC,370}$ was better correlated with fragments
 227 with higher degrees of unsaturation or cyclization. Indeed, in saturated organics, light absorption
 228 involves excitation of n electrons, which requires more energy and, therefore, shorter incident
 229 wavelengths (e.g., short UV). In unsaturated organics, the delocalized π electrons in clusters of sp^2
 230 hybrid bonds, as well as those in large conjugated systems, can extend absorption from short UV
 231 to longer wavelengths into the near-visible spectrum. These structural features may explain in part
 232 the increased correlation between mass loadings of the $C_xH_yN^+$ family and light absorption with
 233 decreasing ion saturation. For the $C_xH_yO_zN^+$ family, we did not observe obvious trends in
 234 correlation coefficient with changing degree of saturation/cyclization (Figure 7b). However, the
 235 overall correlation was higher than those with $C_xH_yN^+$.

236 Conclusions

237 This paper presents collocated, real-time atmospheric particle light absorption and chemical
 238 composition measurements at a suburban site in PRD, China. While BC dominated aerosol light
 239 absorption, BrC also contributed to absorption at short wavelengths. The aerosol light absorption
 240 coefficients of BrC were 13.67, 7.56, 4.49, 3.22, and 2.81 Mm^{-1} at 370, 470, 520, 590, and 660 nm,



241 respectively, and BrC contributed 23.6%, 18.1%, 10.7%, 10.7%, and 10.5% of the total absorption
242 at the corresponding wavelengths. Hydrocarbon-like organic aerosol (HOA), biomass burning
243 organic aerosol (BBOA) and low-volatility oxygenated organic aerosol (LVOOA) were also
244 substantial for the source of BrC. At short wavelength (370 nm), the mass absorption coefficient
245 of BBOA was higher than those of HOA and LVOOA. However, the difference between the mass
246 absorption coefficients of BBOA and other OA factors decreased with increasing wavelength. The
247 contribution of different OA sources to total absorption coefficient also varied with wavelengths.
248 Such a wavelength dependent trend is also observed for their contribution to total BrC absorption
249 coefficients. $C_xH_yN^+$ and $C_xH_yO_zN^+$, were likely the chromophores responsible for the observed
250 BrC light absorption. The mass loadings of $C_xH_yN^+$ and $C_xH_yO_zN^+$ ion families became better
251 correlated with the BrC light absorption coefficient as their degrees of unsaturation/cyclization and
252 oxygenation increased. This study shows wavelength-dependent light absorption by BrC is
253 strongly influenced by moderately specific molecular characteristics such as degrees of
254 unsaturation/ cyclization and oxygenation. An exploration of the absorptive properties of more
255 specific molecular features, such as the chemical identities of BrC constituents, would require a
256 more detailed chemical characterization of the highly complex OA composition.

257

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Table

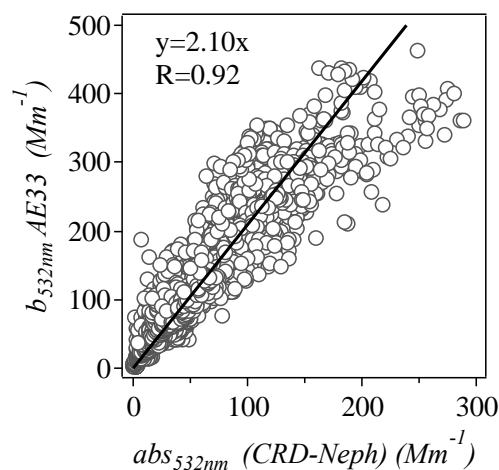
Table 1. Multilinear regression analyses between b_{BrC} at each wavelength and mass loading of different OA factors from AMS-PMF/ME-2.

	370 nm		470 nm		520 nm		590 nm		660 nm	
	Correlati on factor ($m^2 g^{-1}$)	Contribu tion to b_{BrC}	Correlati on factor ($m^2 g^{-1}$)	Contribu tion to b_{BrC}	Correlati on factor ($m^2 g^{-1}$)	Contribu tion to b_{BrC}	Correlati on factor ($m^2 g^{-1}$)	Contribu tion to b_{BrC}	Correlati on factor ($m^2 g^{-1}$)	Contribu tion to b_{BrC}
HOA	0.61 ±		0.38 ±		0.22 ±		0.16 ±		0.16 ±	
	0.05	22.7%	0.03	25.4%	0.02	24.5%	0.02	25.1%	0.01	27.9%
BBOA	3.4 ±		1.2 ±		0.63 ±		0.43 ±		0.21 ±	
	0.41	25.2%	0.26	15.9%	0.18	13.9%	0.14	13.4%	0.11	10.3%
LVOOA	1.04 ±		0.65 ±		0.41 ±		0.29 ±		0.26 ±	
	0.08	52.2%	0.05	58.7%	0.04	61.5%	0.03	61.5%	0.02	61.3%

Notes: 1) Correlation coefficient (R) for each regression analysis: 0.65 at 370 nm, 0.58 at 470 nm, 0.51 at 520 nm, 0.51 at 570 nm and 0.54 at 660 nm; 2) The correlation factors for COA and SVOOA are near zero at all wavelength, indicating a negligible contribution from these factors. So only the correlation factors for HOA, BBOA and LVOOA are listed in the table



427 Figures



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429 Figure 1. Scatter plot of absorption coefficients at 532 nm measured with aethalometer (AE33)

430 and those estimated from cavity ring-down spectroscopy (CRD) and Nephelometer measurements.

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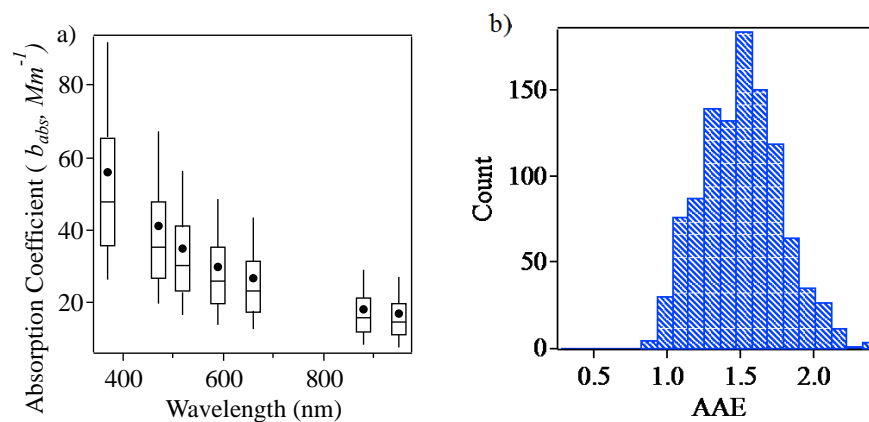
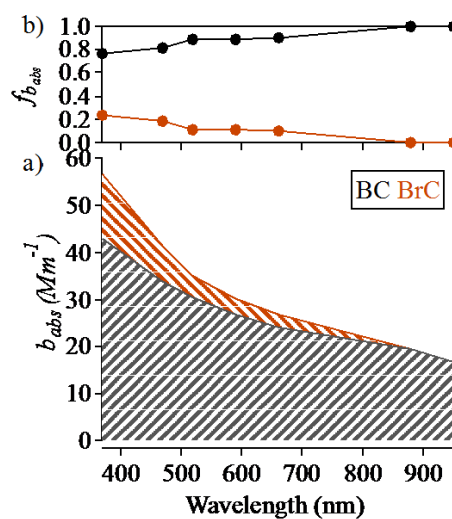


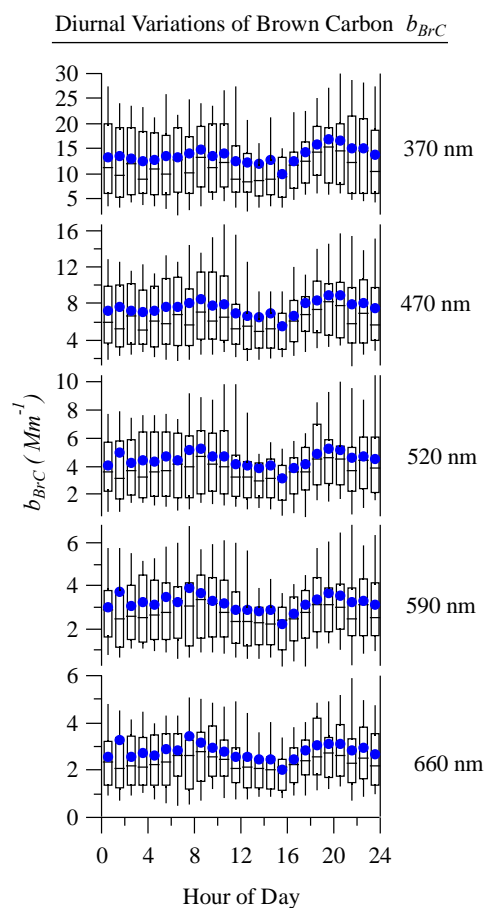
Figure 2. a) Box-whisker plot of absorption coefficient at seven wavelengths as measured with the AE33; b) Histogram of AAE values over the measurement campaign.



436

437 Figure 3. a) Fractions of BC and BrC contributions to aerosol particle light absorption at different
438 wavelengths; b) Contributions of BC and BrC to the total light absorption coefficient at different
439 wavelengths.

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441
 442 Figure 4. Diurnal variations of BrC light absorption coefficients (b_{BrC}) at different wavelengths.
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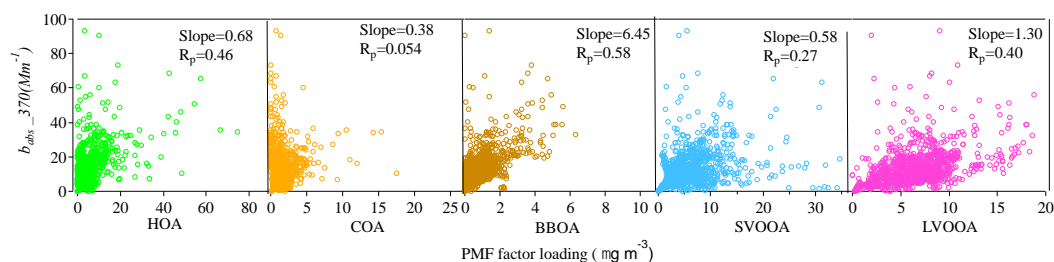
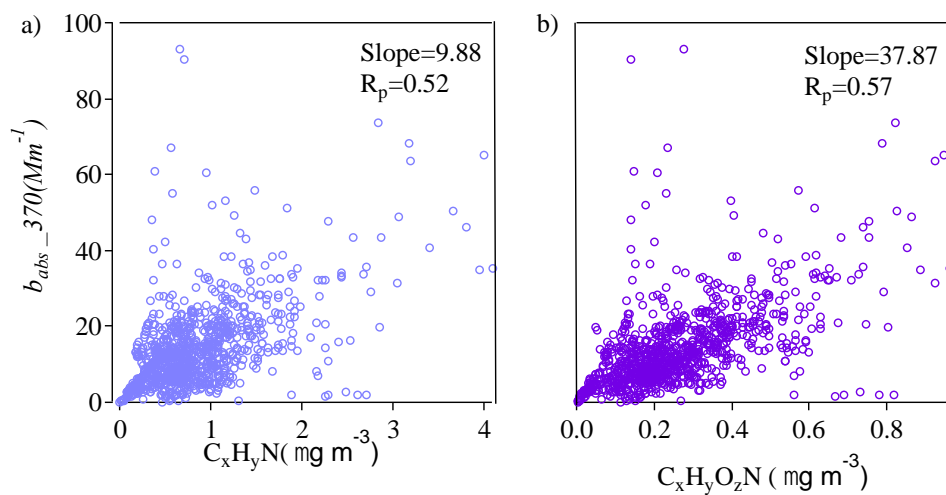


Figure 5. Correlations between the BrC absorption coefficients at 370 nm and the mass loadings of OA factors resolved by AMS-PMF/ME-2.



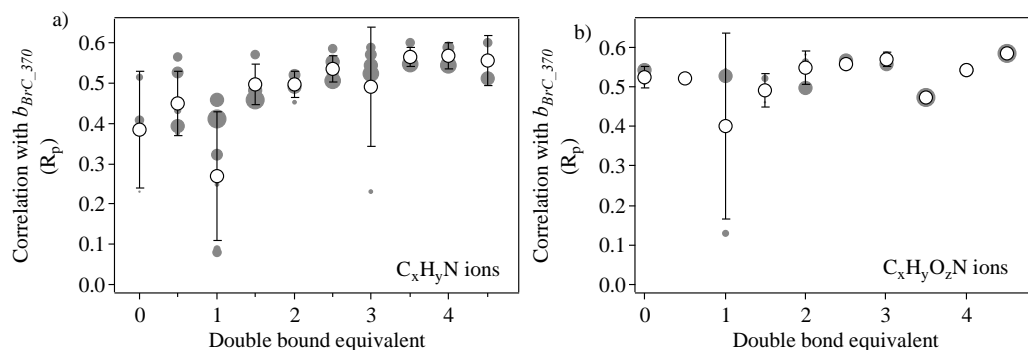
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452 Figure 6. Correlations between BrC absorption coefficients at 370 nm and mass concentrations of
 453 N-containing organic ion families.

454



455

456 Figure 7. Correlation coefficients between BrC absorption coefficient at 370 nm and N-containing
457 organic ion fragments grouped by double bond equivalence (panels a and b) and number of oxygen
458 atoms (panel c). Larger grey dots correspond to higher carbon numbers.