



Measurement Report: Optical Characterization, Seasonality, and Sources of Brown Carbon in Fine Aerosols from Tianjin, North China: Year-round Observations

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9 Abstract

10 To investigate the physicochemical characteristics and sources of brown carbon (BrC) in North China, we collected fine aerosols $(PM_{2.5})$ at an urban site in Tianjin over a 1-year period. We 11 measured the ultraviolet (UV) light absorption and excitation emission matrix (EEM) fluorescence 12 of the water-soluble BrC (WSBrC) and the water-insoluble but methanol-soluble BrC (WI-MSBrC) 13 in the PM_{2.5} using a three-dimensional fluorescence spectrometer. Average light absorption 14 efficiency of both WSBrC (Abs365, WSBrC) and WI-MSBrC (Abs365, WI-MSBrC) at 365 nm was found 15 16 to be highest in winter and distinct from season to season. Averages of biological index (BIX) and fluorescence index (FI) of WSBrC were lower in summer than in other seasons and opposite to 17 that of humification index (HIX), which implied that the secondary formation and further chemical 18 processing of aerosols were intensive during the summer period than in other seasons. Whereas in 19 20 winter, the higher HIX together with the higher BIX and FI of WI-MSBrC suggested that the BrC loading was mainly influenced by primary emissions and was relatively water-soluble. Based on 21 EEM, the types of chromophores in BrC were divided into humic-like substances (HULIS), 22 including low-oxygenated and high-oxygenated species, and protein like compounds (PLOM). 23 24 The direct radiation absorption caused by WSBrC and WI-MSBrC combinedly in the range of 300-400 nm was accounted for about 40% to the total radiation (range, 300-700 nm), which 25 emphasizes that the radiation balance of the Earth's climate system is substantially affects by the 26 BrC and should be considered in the radiative forcing models. 27

28

29 **1 Introduction**

Brown carbon (BrC) is a part of organic aerosol (OA) and has the ability to absorb solar radiation 30 in the near-ultraviolet (UV) to visible spectrum (Liu et al., 2013). In the range of near-UV/Vis 31 light (300–500 nm), BrC has a significant effect on radiative forcing in both regional and global 32 climate (Feng et al., 2013; Jo et al., 2016; Park et al., 2010). However, the warming effect of water-33 soluble BrC in the Arctic has been reported to be accounted for about 30% of that of the black 34 carbon (Yue et al., 2022). BrC not only affects the direct radiative forcing by OA, but also has a 35 36 potential impact on indirect radiative forcing due to its hydrophilicity, which influences the 37 formation of cloud condensation nuclei (CCN) (Andreae and Gelencs'er, 2006; Laskin et al., 2015). In addition, BrC is mostly composed of highly conjugated aromatic ring compounds (such as a 38 polycyclic aromatic hydrocarbons) and high molecular weight substances with a polar functional 39





40 group such as oxygen or nitrogen, or a humic-like substances (HULIS), which can cause a risk to 41 human health. *For example*, carbon-containing aromatic compounds can cause physical weakness, 42 decreased immunity, arteriosclerosis, etc., which will increase the mortality due to cardiovascular 43 and cerebrovascular diseases and a variety of cancers such as skin cancer, pharyngeal cancer and 44 nasal cancer (Diggs et al., 2011; Peters et al., 2008; Hecobian et al., 2010).

BrC can be emitted directly from primary sources and produced by chemical reactions of 45 volatile organic compounds (VOCs) in the atmosphere (Chakrabarty et al., 2010; Jacobson, 1999; 46 Sareen et al., 2010). Primary sources of BrC are combustion processes such as biomass burning 47 (Hoffer et al., 2006; Brown et al., 2021), fossil fuel combustion (Jo et al., 2016), automobile 48 exhaust (Liu et al., 2015) and non-combustion processes such as bioaerosols (plant debris and 49 50 fungi) and soil humus (Lin et al., 2014; Rizzo et al., 2013; Rizzo et al., 2011). On the other hand, 51 secondary BrC can be produced from complex chemical reactions of VOCs emitted from both anthropogenic and biological origin (Kasthuriarachchi et al., 2020; Li et al., 2020a). 52

After establishing the fact that organic compounds also absorb the light in recent times, the 53 researchers are paying significant attention to the estimations of physical (optical) and chemical 54 properties the BrC. Excitation emission matrix (EEM) fluorescence spectroscopy and ultraviolet 55 spectroscopy are common techniques for studying the optical absorption and fluorescence 56 57 chromophore optical and structural characteristics of complex organic materials (Chen et al., 2016b). Combined spectrophotometric measurement and chemical analysis has been applied to 58 study the BrC in Xi 'an, Northwest China from July 2008 to June 2009 (Huang et al., 2018). 59 Recently, the absorption spectroscopy of BrC has been used as a tool for understanding broader 60 composition and characteristics of the BrC (Satish and Rastogi, 2019). 61

62 EEM provides some information about the chromophores responsible for the light absorption 63 of organic matter. The fluorescence technique has been widely applied to measure organics in terrestrial and oceanic systems (Murphy et al., 2013; Yu et al., 2015), but has not been widely used 64 in the study of atmospheric aerosols. The composition of humic-like and protein-like components 65 66 have been identified from the analysis of chromophores of dissolved organic substances in aquatic environments (Xie et al., 2020). Fluorescence measurements with higher detection sensitivity are 67 more useful in classifying BrC compared to absorption measurements, which rely on the shape of 68 69 absorption spectra (Laskin et al., 2015). In recent times, the application of fluorescence technology 70 has been well established to study the chemical composition of atmospheric aerosols (Wu et al., 2021; Deng et al., 2022; Li et al., 2022; Cao et al., 2022). 71

72 However, the studies on BrC are very limited because of difficulties in quantitative measurement of organic components and the optical properties of the BrC (Corbin et al., 2019; 73 74 Wang et al., 2022b). In addition, traditional optical instruments do not provide any distinction between the light absorption by black and brown carbon. Therefore, the indirect approach to 75 76 explore the nature and sources of BrC has been developed through its light absorption characteristics. Of course, such research is just at preliminary stages, and much attention need to 77 be paid further such as long-term and continuous observations of light absorption characteristics 78 of water-soluble BrC (WSBrC) and their temporal and spatial variations (Izhar et al., 2020). 79 Moreover, the investigation of light absorption characteristics of water-insoluble BrC (WIBrC) 80 that can be extracted into a solvent with higher extraction efficiency is necessary to better 81 82 understand the impact of the BrC on climate change (Corbin et al., 2019). In fact, such studies are very scarce because the selection of solvents and determination of extraction efficiency are 83 difficult, although different polar chromophores could be extracted by solvent extraction according 84 to the polarity of solvent and methanol has been used as a common solvent (Chen et al., 2016a). 85





Therefore, the comprehensive study of the optical properties of WSBrC and WIBrC is highly necessary to better understand the types of chromophores and optical properties of atmospheric aerosols, as well as the processes of oxidation and transformation of chromophores at different locale over the world.

China is one of the most polluted areas in the world, and suffering from the absorption and 90 scattering of solar radiation by atmospheric aerosols that directly affect the energy balance of the 91 92 Earth's climate system, especially in North China Plain (Wang et al., 2022a). As an important port city in the North China Plain, Tianjin, which has a large population, has received a widespread 93 94 attention to address the atmospheric environmental issues. Previous studies have shown that BrC in the atmosphere contributes significantly to the light absorption by aerosols (Deng et al., 2022). 95 96 PM_{2.5} in the Tianjin area are extremely high and contain a lot of organic matter (OM) (Dong et al., 97 2023). In such an environment, BrC is likely to become an important light-absorbing component of atmospheric aerosols. However, the studies on physicochemical characteristics and sources of 98 99 BrC are very limited in the North China Plain, and to the best of our knowledge, the long-term observations have not been reported yet over the Tianjin region. 100

In this study, we measured the optical properties of WSBrC and water-insoluble but methanol-101 102 soluble BrC (WI-MSBrC) in fine aerosols (PM_{2.5}) collected from Tianjin, North China over a one year period during 2018-2019. We discuss the seasonal variations in optical properties of WSBrC 103 and WI-MSBrC and their chromophore composition assessed by three-dimensional fluorescence 104 spectroscopy. We also assess the relationship between BrC and chemical composition in PM_{2.5}, 105 the possible sources of BrC and the influence of photochemical reaction processes on the BrC. 106 Thus, this study provides a comprehensive understanding of the optical characteristics, seasonality 107 108 and sources of BrC in the Tianjin region, and the need to develop the prevention and control 109 strategies for the BrC emissions.

110 2 Materials and Methods

111 2.1 Aerosol sampling

Fine aerosol (PM_{2.5}) sampling was conduted in Tianjin, a coastal city located at the lower 112 reaches of the Haihe River and Bohai Sea and 150 km away from Beijing in the northern part of 113 114 China. The sampling took place on the rooftop of a six-storey building at Tianjin University (ND, 39.11°N,117.18°E) in an urban area of Nankai District, Tianjin. A high-volume air sampler (Tisch 115 Environmental, TE-6070DX) at a flow rate of 1.0 m³ min⁻¹ and pre-combusted (6 hours at 450°C) 116 117 quartz fiber filters (Pallflex 2500QAT-UP) were used for continuously collecting the PM_{2.5} samples for 3 days (\sim 72 hours) each during 5 July 2018 to 4 July 2019 (n = 121). Filter blanks 118 were collected twice per season during the sample period, using the same procedure as regular 119 sampling, but without turning on the sampler pump. The blank filters were left in the filter hood 120 for 10 minutes. Prior to and after sampling, each filter was dehumidified in a desiccator for 48 121 hours, and then stored in a pre-combusted glass jar with a Teflon-lined cap in the dark at -20° C 122 until analysis. 123

124 2.2 Chemical analysis

Details of the measurements of aerosol OC, EC, total carbon (TC), and WSOC were described by Wang et al. (Wang et al., 2019) and Dong et al. (Dong et al., 2023). Briefly, concentrations of the OC and EC were measured with a thermal-optical transmission analyzer (Sunset Laboratory





Inc, USA) following the IMPROVE protocol of the protective visual environment. Stable carbon
and nitrogen isotope ratios of total carbon and nitrogen were measured with an elemental analyzer
(EA, Flash 2000HT) coupled with stable isotope ratio mass spectrometer (IrMS, 253 Plus).
Concentrations of K⁺ and Cl⁻ were determined using ion chromatography (ICS-5000 System,
China, Dai An).

BrC was extracted into 30 ml ultrapure water (> $18.2M\Omega$ cm) using a sample filter disc of 22 mm in diameter under ultrasonication for 30 min. The extracts were filtered through a 0.45 μ m polytetrafluoron (PTFE) syringe filter to remove the water-insoluble compounds, and then transferred into another clean glass bottle. The extracts were used for the light absorption and fluorescence measurements of WSBrC. While the concentration of WSBrC was considered as the concentration of water-soluble organic carbon (WSOC).

After the extraction of WSBrC, the WI-MSBrC was extracted into 30 ml methanol using the same filter sample under ultrasonication for 30 min. The extracts were filtered using the same 0.45 μ m PTFE syringe filter to remove the insoluble particles and filter debris. The methanol extracts were used for the measurements of optical properties of WI-MSBrC. The concentration of waterinsoluble organic carbon (WIOC) was considered as the concentration of WI-MSBrC, which calculated as: WI-MSBrC = OC – WSOC.

- 145 2.3 Optical properties of brown carbon (BrC) analysis
- 146 2.3.1 Light absorption analysis

147 A three-dimensional fluorescence spectrometer (Aqualog, Horiba Scientific) was used to record the excitation-emission matrices (EEM) spectra and ultraviolet-visible (UV-Vis) 148 149 absorption spectra of the solution samples in 1×1 cm quartz cuvettes. The instrument parameters during sample analysis were as follows: The UV-Vis absorption spectra of extracts were recorded 150 151 in the wavelength range of 240-700 nm. The UV-visible absorption spectra of the solvents were also recorded to subtract their contributions from the extract spectra. The EEM was recorded in 152 the wavelength range of 240-700 nm for excitation and the integration time was 0.1 s with a 1 nm 153 increment. An increment of 8 pixels (5.04 nm) is used as the emission wavelength interval. Prior 154 to sample analysis, a fluorescence spectrometer wae used to anlyze the pure solvents of water and 155 MeOH to obtain the reference signal. 156

Based on the light absorption spectra, the absorption data are converted to the absorption coefficient (Abs: m^{-1}) following this formula:

159 Abs_λ

 $Abs_{\lambda} = (A_{\lambda} - A_{700}) \times V_{l} / V_{a} / L \times ln (10)$

where A₇₀₀ is the absorption at 700 nm, serving as a reference to account for baseline drift; 160 V_1 is the volume of water or MeOH used for extraction; V_a is the volume of sampled air; L is the 161 optical path length (0.01 m). A factor of $\ln(10)$ is utilized to convert the log base 10 to a natural 162 logarithm to obtain a base-e absorption coefficient. To compensate for any baseline shift that may 163 occur during analysis, absorption at wavelengths below 700 nm is compared to that of 700 nm 164 165 where no absorption occurs for ambient aerosol extracts. The average absorption coefficient between 360 and 370 nm (Abs₃₆₅) is used to represent BrC absorption in order to avoid any 166 interferences from non-organic compounds (e.g., nitrate) and to be consistent with the literature 167 values (Huang et al., 2018). 168

Absorption Ångström exponent (AAE, Å) represents the spectral dependence of aerosol light absorption, indicating that BrC has a great contribution to aerosol Absorption. The spectral





dependence of light absorption by chromophores in solution can be described by the followingequation:

173 $Abs_{\lambda} = C \times \lambda^{-AAE}$

174 where C is a concentration of extract; λ is the wavelength (nm). The AAE of the filter extracts 175 is calculated by a formula in the wavelength range of 300–500 nm. The selected range serves two 176 purposes: (1) to prevent any interferences from non-organic compounds at lower wavelengths; (2) 177 to ensure a sufficiented signal-noise ratio for the investigating samples (Huang et al., 2018).

178 The mass absorption efficiency (MAE: $m^2 g^{-1}$) of the filter extract at wavelength of λ can be 179 characterized as:

180 $MAE_{\lambda} = Abs_{\lambda}/M$

where M (μ g m⁻³) is the concentration of WSOC for water extracts and that of WIOC for methanol extracts.

183 The imaginary part (k) of the refractive index (m = n+ik) is derived with the following 184 equation:

185 $k_{\lambda} = (MAC \times \rho \times \lambda)/4\pi$

186 where MAC is the mass-absorption cross section of WSBrC or WI-MSBrC ($m^2 g^{-1}$), ρ is the 187 effective density, λ is the wavelength for the computed MAC including WSBrC and WI-MSBrC. 188 For this study, an effective density of 1.5 g m⁻³ is assumed for WSBrC and WI-MSBrC in the 189 derivation (Liu et al., 2013). MAC values are computed for 365 nm.

190 2.3.2 EEM and PARAFAC analysis

191 The raw EEMs were first calibrated for the correction of spectrometer factors, which reflect 192 the spectrometer deviation and light source, and then for the inner filter correction, following the procedure described elsewhere (Chen et al., 2019; Gu and Kenny, 2009). Briefly, the inner filter 193 correction of the EEMs was done based on the UV-Vis light absorbance of the extracts, which was 194 lower than 0.7 in the calibrated wavelength range and is appropriate (Gu and Kenny, 2009). The 195 signal intensity of the EEMs was then normalized to the Raman unit (RU) of water (Lawaetz and 196 197 Stedmon, 2009). The fluorescence volume (FV, RU-nm²/m³) of extracts present in the atmosphere was estimated based on the EEMs at the excitation wavelength ranging from 240 to 700 nm, and 198 then normalized it (i.e., NFV (RU-nm²- $[mg/L]^{-1}$)) by dividing the FV with the concentration of 199 WSOC and WIOC in the aerosol $[mg m^{-3}]$). 200

Various types of chromophores present in the PM_{2.5} samples were classified and identified
 based on the PARAFAC analysis of the EEMs using the SOLO, the data analysis software.
 PARAFAC analysis was performed for each extraction fluid in each season. Ultimately, three
 EEM components were determined and assigned to different types of chromophores.

Additionally, fluorescence index (FI) was determined by calculating the ratio of emission intensities at 450 nm and 500 nm after excitation at 370 nm. Contributions from local biological sources can be characterized by biological index (BIX), which was calculated using the ratio of emission intensities at 380 and 430 nm following 310 nm excitation (Gao yan and Zhang, 2018).

209 2.3.3 Simple forcing efficiency (SFE)

It is possible to make a rough estimate of the radiative forcing caused by aerosols using a simple forcing efficiency (SFE, W/g), which was assessed as described in the literature (Bond and Bergstrom, 2006; Deng et al., 2022):





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$$SFE = \int \frac{\mathrm{d}S(\lambda)}{d\lambda} \tau_{atm}^2 (1 - F_c) a_s MAE(\lambda) d\lambda$$

where dS/d λ is the solar irradiance, τ_{atm} is the atmospheric transmission (0.79), F_c is the cloud fraction (approximately 0.6), a is the surface albedo (average 0.19), β is the backscatter fraction, and MSE and MAE are the mass scattering (can be ignored) and absorption efficiency, respectively.

217 3 Results and discussion

218 3.1 Characteristics of ultraviolet light absorption of BrC

3.1.1 Absorption coefficient (Abs: Mm^{-1})

220 The annual and seasonal concentrations and optical properties of BrC are summarized in Table 1. Temporal variations in absorption coefficient of WSBrC and WI-MSBrC at 365 nm (i.e., 221 Abs_{365, WSBrC} and Abs_{365, WI-MSBrC}) together with their concentrations are depicted in Fig. 1. 222 Averages of all measured parameters peaked in winter (Abs_{365, WSBrC} = 10.4 ± 6.76 Mm⁻¹, Abs₃₆₅, 223 $_{MSBrC}$ = 10.0± 5.13 Mm⁻¹), followed by a decrease to autumn and spring and the lowest in summer 224 $(Abs_{365, WSBrC} = 1.47 \pm 0.77 \text{ Mm}^{-1}, Abs_{365, WI-MSBrC} = 0.74 \pm 0.25 \text{ Mm}^{-1})$. The lower absorbance in 225 summer might have been caused by extensive oxidation of organics and thus, the enhanced 226 decomposition of some BrC substances, due to high solar light intensity and ambient temperatures. 227 228 While the increase in the absorption coefficient of BrC in winter might be mainly due to the existence of large amounts of organic aerosols under the unfavorable meteorological conditions. 229 The seasonal variations of Abs₃₆₅ in Tianjin were similar to those reported in the southeastern 230 United States, but the Abs₃₆₅ was much higher than that $(0.3-3.0 \text{ Mm}^{-1} \text{ in } 2007)$ in the southeastern 231 United States (Hecobian et al., 2010) and that in Atlanta and Los Angeles (0.88 ± 0.71 and $0.61 \pm$ 232 0.38 Mm⁻¹, respectively) in summer 2010 (Zhang et al., 2011). However, compared with the 233 Abs₃₆₅ of WSBrC ($14.1 \pm 8.5 \text{ Mm}^{-1}$) in winter 2016 and summer 2017 ($2.1 \pm 1.0 \text{ Mm}^{-1}$) in Tianjin 234 (Deng et al., 2022), the Abs₃₆₅ has slightly decreased in this study. Spatially, the value and 235 contribution of Abs₃₆₅ in this study (Abs₃₆₅, $WSBrC = 10.4 \text{ Mm}^{-1}$, Abs₃₆₅, $WLMSBrC = 10.0 \text{ Mm}^{-1}$) in 236 winter were higher than those reported at different locations in southern China; Nanjing (Abs₃₆₅, 237 WSBrC = 4.84 Mm⁻¹, Abs_{365, MSBrC}= 7.75 Mm⁻¹) (Xie et al., 2020), Guangzhou in autumn (Abs_{365, MSBrC}= 7.75 Mm⁻¹) 238 $_{WSBrC} = 8.8 \text{ Mm}^{-1}$) (Li et al., 2018), and Lhasa in winter (Abs₃₆₅, $_{WSBrC} = 1.04 \text{ Mm}^{-1}$, Abs₃₆₅, $_{MSBrC} = 1.04 \text{ Mm}^{-1}$, Abs₃₆₅ 239 1.47 Mm⁻¹) (Zhu et al., 2018). Interestingly, the Abs₃₆₅ in Tianjin in winter is lower than that in 240 Beijing, Xi 'an, which are heavily polluted cities in northern China (Huang et al., 2020; Li et al., 241 2020b). The higher Abs_{365} in winter indicates that the light absorption of BrC in $PM_{2.5}$ may have 242 more significant effect on the climate and the photochemical reactions in the atmosphere over 243 244 Tianjin in winter than in other seasons.







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Figure 1. Time series of the light absorption coefficient of water-soluble brown carbon (WSBrC)
 and water-insoluble but methanol-soluble BrC (WI-MSBrC) at 365nm (Abs_{365, WSBrC} and Abs_{365, WSBrC} and Abs_{365, WSBrC}, respectively) and their concentrations in Tianjin, North China during 2018 and 2019.

250 Figure 2a shows the seasonal average absorption spectra of WSBrC and WI-MSBrC at wavelengths of 240-700 nm, which shows the common feature of BrC, i.e., the absorption of 251 shorter wavelengths increases sharply and significantly. Such feature is different from the 252 absorption characteristics of BC, whose AAE is close to 1 and weakly dependent on the 253 wavelength. Another evident feature of BrC absorption spectra shown in Figure 2a is that the 254 absorption coefficient of WI-MSBrC was always greater than that of WSBrC across the shorter 255 wavelengths, which is consistent with the previous studies (Huang et al., 2020; Li et al., 2020b). 256 This can be attributed to the difference in types and amounts of chromophores extracted, i.e., more 257 chromophores were soluble in methanol (e.g., PAHs from biomass burning and fossil fuel 258 259 combustion), but not in water. It is worthy to note that, $\pi - \pi *$ electron transitions in the double bonds of aromatic compounds are the primary cause of light absorption in the wavelength range 260 of 250-300 nm. Nitroaromatic compounds contribute 60% of absorbance in the 300-400 nm range 261 (Hems et al., 2021). According to most of the studies, the absorption of hydroxylation and ring 262 cleavage products formed from nitrophenol exceeds 400 nm and nitroaromatics have strong light 263 264 absorption in the visible region (Vidović et al., 2020; Satish and Rastogi, 2019). The electron transitions in phenolic arenes, aniline derivatives, polyenes and polycyclic aromatic hydrocarbons 265 with two or more rings are responsible for the absorbance in the bands between 270 and 280 nm 266 (Baduel et al., 2009). There was a peak of light absorption at 280 nm in WI-MSBrC spectra, but 267 not in that of WSBrC, probably because some polycyclic aromatic chromophores were insoluble 268 in water but soluble in MeOH. 269

Figs. 3 and 4 show the seasonal variations in the correlations between Abs_{365} and chemical components, including WSBrC and WI-MSBrC, K⁺, and Cl⁻, which are possibly emitted from biomass burning. In this study, the light absorption at the wavelength of 365 nm would not be





interfered by inorganic substances, so Abs at 365 nm was selected for analysis (Hecobian et al.,

- 274 2010). High correlations were found between Abs₃₆₅ and WSBrC, WI-MSBrC, except in summer,
- indicating that WSBrC and WI-MSBrC might have been derived from similar sources, except in
- summer, because the light absorption efficiency of organic compounds from different sources were
 significantly different. *For example*, precursors and reaction processes affect the light absorption
- significantly different. *For example*, precursors and reaction processes
 capacity of SOA in the atmosphere (Zhong and Jang, 2011).
- In fact, the Abs depends on the amount of BrC availability, but not of total OC content. The
 BrC content increases with increasing level of nitrogen containing organics (with aging in presence
 of NO₃⁻/NH₃ etc.). So, the higher levels of OC or WSOC might occur due to enhanced primary
- emissions and/or secondary formation on those particular days, but the BrC content in that high
- amount of OC or WSOC might be less due to either aging and/or less availability of N species to
- 284 produce N containing organics in summer.
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- 286
- 287
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		Sp	ning	Sum	mer	Autu	um	Win	ter	Annual	
		Range	Ave ± SD	Range	Ave \pm SD	Range	Ave \pm SD	Range	Ave \pm SD	Range	Ave \pm SD
					Concer	ntrations					
WSOC	C (μg m ⁻³)	0.69-4.03	2.48 ± 0.82	1.14-3.12	$1.88 {\pm} 0.53$	1.16-7.68	3.45±1.71	1.37 - 16.0	5.06±2.99	0.69 - 16.0	3.25 ± 2.18
WIOC	$(\mu g m^{-3})$	0.23-2.62	0.88 ± 0.63	0.00-1.33	0.43 ± 0.32	0.21-5.07	1.55 ± 1.04	0.00-8.93	3.74±2.09	0.00-8.93	1.68 ± 1.77
					Optical	parameters					
	$Abs_{365}(M m^{-1})$	0.66-13.3	3.45 ± 2.29	0.49 - 3.16	1.47 ± 0.77	0.55-13.5	3.71 ± 2.83	2.35-36.7	$10.4{\pm}6.76$	0.49-36.7	$4.74{\pm}5.10$
	$MAE_{365(m^2g^{-1})}$	0.52 - 3.41	1.31 ± 0.55	0.38 - 1.98	0.80 ± 0.44	0.40 - 1.76	0.96 ± 0.33	0.90-3.08	2.04 ± 0.46	0.38 - 3.41	1.28 ± 0.66
WSB	AAE(300-500 mm)	3.85-7.57	5.42 ± 0.74	3.90-6.88	5.17 ± 0.83	5.12-7.99	6.21 ± 0.65	4.50-7.39	5.88 ± 0.58	3.85-7.99	5.66±0.82
ų	FI	1.13-1.63	1.37 ± 0.09	1.16 - 1.49	1.31 ± 0.07	1.36 - 1.61	1.47 ± 0.07	1.29–1.44	1.37 ± 0.02	1.13-1.63	1.38 ± 0.09
	BIX	0.82-1.24	1.01 ± 0.11	0.79 - 1.04	0.91 ± 0.06	0.83 - 1.26	1.06 ± 0.08	1.03 - 1.39	1.20 ± 0.08	0.79-1.39	1.05 ± 0.13
	НІХ	1.84 - 3.76	2.76±0.47	2.47-3.98	3.12±0.44	2.11-4.17	3.11 ± 0.51	1.72-3.72	2.47 ± 0.43	1.72-4.17	2.87 ± 0.53
	k ₃₆₅	0.023-0.149	0.057 ± 0.024	0.017-0.086	0.035 ± 0.020	0.018-0.077	0.042 ± 0.015	0.039-0.134	0.089 ± 0.021	0.017-0.149	0.056 ± 0.029
	$SFE_{300-400(W\ g}^{-1})$	0.62-2.71	1.46 ± 0.52	0.60 - 2.99	1.21 ± 0.67	0.81-5.13	1.99 ± 0.84	1.40-4.76	3.12 ± 0.71	0.60-5.13	1.95 ± 1.02
	$SFE_{300-700(W~g^{-1})}$	0.98-6.36	$3.39{\pm}1.42$	1.22-10.5	3.68±2.58	1.48-12.5	5.12±2.17	3.75-13.1	7.60±2.17	0.98-13.1	4.97±2.71
	Abs ₃₆₅ (M m ⁻¹)	0.44-11.3	1.99 ± 1.95	0.40-1.26	0.74 ± 0.25	0.32-11.0	2.83±2.51	2.85-25.0	10.0±5.13	0.32-25.0	3.87±4.69
	$MAE_{365(m^2g^{-1})}$	0.42-5.81	2.41±1.28	0.89–7.05	2.50 ± 1.78	0.18-4.70	1.86 ± 1.02	2.01-3.42	2.69 ± 0.36	0.18-7.05	2.36 ± 1.26
-IW	$AAE_{(300-500 \text{ mm})}$	3.94-8.38	6.27 ± 0.90	4.27–9.19	5.49 ± 1.26	2.08-12.9	6.11 ± 1.86	5.49-6.76	6.30 ± 0.27	2.08-12.9	6.06 ± 1.23
IC N	FI	1.29–1.77	1.51 ± 0.11	1.34-1.92	1.58 ± 0.12	1.48-1.73	1.57 ± 0.06	1.61–2.24	1.73 ± 0.11	1.29–2.24	1.60 ± 0.13
	BIX	0.94-1.76	1.23 ± 0.18	0.92-1.65	1.32 ± 0.18	0.83-1.36	1.05 ± 0.14	1.20-1.62	1.43 ± 0.09	0.83-1.76	1.26 ± 0.21
	НІХ	0.11-1.26	0.42 ± 0.28	0.11-0.49	0.25 ± 0.08	0.30-2.38	1.23 ± 0.61	0.62 - 1.79	1.33 ± 0.30	0.11-2.38	$0.81 {\pm} 0.60$
	k ₃₆₅	0.018-0.253	0.105 ± 0.057	0.039-0.307	0.109 ± 0.079	0.008-0.205	0.081 ± 0.045	0.0870.149	0.117 ± 0.016	0.0010.307	0.077 ± 0.064
	$SFE_{300-400(W\ g}^{-1})$	0.64 - 8.84	3.61±1.91	0.60 - 2.99	1.21 ± 0.67	0.75 - 7.01	2.98±1.52	3.04-5.29	4.13 ± 0.57	0.64-8.84	2.98 ± 1.70
	SFEam-and and a -1	2.48-21.8	8.70±5.03	1.22 - 10.5	3.68 ± 2.58	0.92 - 51.3	8.69 ± 9.23	7.06-11.7	9.36 ± 4.51	0.92 - 51.3	7.58±5.75









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Figure 2. Seasonal averages of (a) absorption spectra in the wavelength range of 240–700 nm plotted on a linear scale, (b) absorption Ångström exponent (AAE), (c) ratio of MAE at 250 nm to that at 365 nm (E_2/E_3) and (d) mass absorption efficiency (MAE: m² g⁻¹) of WSBrC and WI-MSBrC in PM_{2.5} from Tianjin, North China.







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Figure 3. Scatter plots of Abs_{365, WSBrC} and Abs_{365, WI-MSBrC} with WSBrC and WI-MSBrC in
 PM_{2.5} from Tianjin in each season during 2018–2019. The WSOC and WIOC data is obtained
 from (Dong et al., 2023).

300

As shown in Fig. 4, considerable positive correlations were found between Abs_{365} and K^+ and 301 Cl⁻ in autumn and spring, indicating that biomass burning was a major source of BrC in those 302 seasons. In addition, the correlation between WSOC chromophores and K⁺ in autumn was stronger 303 304 than that between methanol-soluble photogenic groups, which again confirmed that most of the 305 chromophores generated by biomass burning were water-soluble photogenic groups. However, the correlation between WI-MSBrC and Cl⁻ was stronger than that between WSBrC and Cl⁻ in spring, 306 which might be due to enhanced contribution of a large number of BrC chromophores, which were 307 308 insoluble in water, from dust in spring.







310

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Figure 4. Scatter plots of $Abs_{365 WSBrC}$ and $Abs_{365, WI-MSBrC}$ with K⁺ and Cl⁻ in PM_{2.5} from Tianjin in each season during 2018–2019. The concentration of K⁺ and Cl⁻ from (Dong et al., 2023).

314 3.1.2 Absorption Ångström exponent (AAE)

The magnitude of the AAE can reflect the difference in BrC sources and atmospheric chemical processes (Lack et al., 2013). It has been reported that the AAE of light-absorbing organic species (i.e., BrC) is much larger than that of soot (BC). The AAE was found to be between 2 and for the particles containing both soot and BrC. AAE value of particulate matter was closely related to its chemical composition, mixing state, particle size and other factors.





320 It is important to note that the solvent extractant light absorption characteristics of organic components do not be affected by particle size and chemical composition of aerosols. The AAE 321 value of the extract mainly depends on the types of absorbable components in the extract. Hoffer 322 et al. (2006) isolated humic-like substances (HULIS) from particulate matter emitted by 323 324 combustion substances by combining water extraction with exchange column, and measured its AAE value as 7 (Hoffer et al., 2006). As shown in Fig. 2b, the seasonal average AAE of WSBrC 325 varied slightly between 3.85 and 7.99 with an average of 5.66, which was comparable to those 326 reported from New Delhi, Beijing and the outflow region of northern China (Lesworth et al., 2010). 327 The AAE of WSBrC in Tianjin was also similar to that (range, 6-8) reported in the off-line 328 329 particulate matter samples collected from the southeastern United States (Hecobian et al., 2010) 330 and downtown Atlanta (Liu et al., 2013). The AAE of WI-MSBrC (6.06 ± 1.23) was comparable with that of WSBrC, consistent with a previous study in urban Beijing during winter and Xi'an, 331 China. It has been reported that the AAE of BrC is increased with the increase in polarity (Chen et 332 333 al., 2016a). The higher AAE of the BrC implies that the OA is mostly polar in Tianjin.

334 3.1.3 Mass absorption efficiency (MAE: $m^2 g^{-1}$)

The average MAE₃₆₅ of both WSBrC and WI-MSBrC were higher in winter (1.28 and 2.36 335 m² g⁻¹, respectively). It is interesting to note that minimum value of MAE₃₆₅ of WSBrC appeared 336 in summer (0.80 \pm 0.44), which was opposite to that of WI-MSBrC, the least value was appeared 337 in autumn (1.86 \pm 1.02), which was similar with that reported in Xi'an (Li et al., 2020b). Such 338 large seasonal differences indicated that the BrC sources might be different in each season. During 339 340 winter, contributions of aerosols from coal and biomass burning were significantly higher than other seasons due to increased residential heating activities. The lower MAE₃₆₅ values observed 341 in summer and autumn may be attributed to biogenic sources and/or aged secondary BrC. Whereas 342 the largest MAE₃₆₅ appeared in cold period, which result in severe air pollution in the cold period. 343

344 3.2 Direct radiative forcing of BrC

Radiative forcing efficiency is calculated by integrating wavelengths from 300 nm to 700 nm. 345 346 In this study, SFE_{300–400} was integrated to estimate the radiative forcing efficiency of BrC, because 347 the BrC strongly absorbs light in the UV range. The temporal variations of SFE in different wavelength ranges in the two solvents were shown in Fig. 5. SFE₃₀₀₋₄₀₀ and SFE₃₀₀₋₇₀₀ showed 348 349 similar seasonal trend in both the solvents, which was the same as the seasonal variation of the k. In WSBrC, it was 61% and 52% larger in winter than those in summer, respectively, indicating 350 that BrC abundance and strong light absorption capacity in winter led to a significant increase in 351 352 direct radiative forcing of the BrC. The integrated average SFE for 300–400 nm (SFE₃₀₀₋₄₀₀) of 353 WSBrC and WI-MSBrC were 1.95 ± 1.02 and 2.98 ± 1.70 , respectively. The average SFE₃₀₀₋₇₀₀ of both WSBrC (4.97 ± 2.71) and WI-MSBrC (7.58 ± 5.75) were about 2.5 times larger than that 354 of the SFE₃₀₀₋₄₀₀. The SFE of WSBrC (0.98-13.1) and WI-MSBrC (0.92-51.3) in the range of 355 300–700 nm varied widely, which was much larger than the maximum SFE obtained in the range 356 of 300–400 nm. Furthermore, SFE_{300–400} accounted for 40% of SFE_{300–700} in the two extractants, 357 358 which are similar to that reported in Tianjin by Deng et al. (2022), which indicates that the light absorption by BrC in UV range play a significant role in the radiative forcing. The imaginary part 359 (k) is a significant parameter indicting the direct radiative forcing of aerosols in climate model. 360 The k of WSBrC and WI-MSBrC in Tianjin showed the similar variation tendency in seasons, with 361





- the largest value in winter with the averages of 0.089 and 0.117, respectively. The values are shown
- in Table 1 and the *k* of WI-MSBrC was larger than WSBrC in all seasons, which indicate that most





365

366 Figure 5. Temporal variations in SFE of WSBrC and WI-MSBrC from 300–400nm and 300–

- 367 700nm in PM_{2.5} from Tianjin.
- 368

369 3.3 Fluorescence characteristics of BrC

370 3.3.1 Fluorescent properties

The fluorescent properties of WSBrC and WI-MSBrC are presented in Table 1. The composition of chromophores in WSBrC and WI-MSBrC was analyzed by their fluorescence spectrum. By comparing the fluorescence intensity of chromophores in WSBrC and WI-MSBrC (Fig. 6), it was found that the proportion of water-soluble chromophores in Tianjin PM_{2.5} was





375 higher in autumn (35%), followed by summer (29%), winter (22%) and spring (22%). Previous studies have shown that biomass combustion produces more water-soluble chromophores 376 (Budisulistiorini et al., 2017; Lin et al., 2016; Song et al., 2018). The relative content of water-377 soluble chromophores in Tianjin samples was higher in autumn than that in winter, suggesting that 378 the BrC might mainly derived from biomass butning (BB) in autumn. Furthermore, the relative 379 proportion of water-soluble chromophores in SOA is increased with the increase in oxidation 380 degree (Updyke et al., 2012; Wong et al., 2017) and can reach up to 70% (Chen et al., 2020). The 381 content of SOA in Tianjin was relatively high due to enhanced aging in summer. Therefore, the 382 content of water-soluble chromophore in BrC in summer was higher than that in spring and winter. 383 We also caculated the humification index (HIX) and fluorescence index (FI), which further 384 385 supported that the water-soluble chromophores of BrC were significantly influenced by primary 386 emissions in autumn and the aging in summer.

The fluorescence spectrum of WSBrC was similar to that of HULIS, and the humification 387 388 index (HIX) is measured to reflect the degree of humification of the OA. It has been established that HIX and aromaticity show a consistent change law, that is, the value of HIX is higher, the 389 substance has a high polycondensation degree (Deng et al., 2022). The average HIX of WSBrC 390 and WI-MSBrC were 2.87 ± 0.53 (1.72–4.17) and 0.81 ± 0.60 (0.11–2.38) respectively, which 391 392 indicate that the BrC in Tianjin might be either humified or aromatic, more apparently soluble in water. Besides, the temporal variation of HIX of WSBrC was completely different to that of WI-393 MSBrC. The higher molecular weight and aromatic organic compounds contribute more to 394 WSBrC in summer and autumn while the contents of WI-MSBrC (winter > autumn > spring > 395 summer) were opposite. This phenomenon was comparable to that in Nanjing (WSOC: 7.07 ± 2.41 ; 396 MSOC: 4.84 ± 2.47) (Xie et al., 2020). This phenomenon demonstrates that the influence of 397 398 molecular composition on changes in optical properties. Interestingly, it has been reported that aging processes and HIX have a significant relation (Deng et al., 2022). HIX of WSBrC confirms 399 the BrC was significantly produced from aromatic compounds and subjected for significant 400 401 atmospheric aging in summer.

Fluorescence index (FI) plays an important role in exploring the source and aging of OA and 402 attracted much attention in recent times (Xie et al., 2020; Gao van and Zhang, 2018; Oin et al., 403 404 2018; Deng et al., 2022). On the other hand, FI has been considered as an indicator to assess the 405 terrestrially derived fulvic acids contribution to OA, the FI lower than 1.4 is associated with higher aromaticity (Gao yan and Zhang, 2018). The FI of WSBrC ranged from 1.13 to 1.63 with an 406 average of 1.38, which was comparable to that reported from Lanzhou, China (1.2 in summer and 407 1.7 in winter) (Gao yan and Zhang, 2018). Both FI and BIX of WSBrC in autumn have higher 408 values, indicating that the BrC was mainly derived from terrestrial organic matter that should have 409 largely consist of aromatic compounds. On the other hand, the variation of FI was related to 410 411 photobleaching. With the increase of aromatic substances during the aging of OA, FI decreased with light strength. In contrast, the FI of WI-MSBrC ranged from 1.29 to 2.24 (ave. 1.60), with the 412 lowest in spring (1.51 ± 0.11) and the highest in winter (1.73 ± 0.11) , which were higher than that 413 of WSBrC. The variation of HIX and FI of WSBrC and WI-MSBrC indicated that the fluorescence 414 substance contains mainly aromatic species and significantly subjected for the aging in summer, 415 416 whereas in autumn, that must have mainly derived from terrestrial organics, which were highly 417 water-soluble.

The BIX showed an obvious seasonal variations and the average value was 1.20 ± 0.08 for WSBrC and 1.43 ± 0.09 for WI-MSBrC in Tianjin PM_{2.5}, which were higher than those reported in the forest environment (1.01 ± 0.23) (Zhao et al., 2019). Furthermore, the BIX of WSBrC in





Tianjin PM_{2.5} was 1.20 ± 0.08 (1.03–1.39) in winter, 1.06 ± 0.08 (0.83–1.26) in autumn, $1.01 \pm$ 421 0.11 (0.82–1.24) in spring and 0.91 \pm 0.06 (0.79–1.04) in summer. Whereas the BIX of WI-422 MSBrC peaked in winter (1.43 ± 0.09) and showed the minimum value d in autumn (1.05 ± 0.14) . 423 The slightly rise in summer indicated that biological OM was more soluble in MeOH, which was 424 different from BrC contributed by biological matter in autumn. Such results indicate that the 425 chromophoros generated by primary sources in autumn were mostly soluble in water, while the 426 chromophoros generated in summer were mostly water-insoluble, which was closely related to 427 their molecular structure. Fig. 7 shows the seasonal variations of HIX, BIX and FI in WSBrC and 428 429 WI-MSBrC.



430

Figure 6. Relative contributions of the fluorescent volumes of the WSBrC and WI-MSBrC in
 PM_{2.5} from Tianjin.







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436

437 3.3.2 Chromophore identification

It has been reported that chromophores with different excitation emission wavelengths can distinguish the types and sources of chromophores, but the types and sources of a large number of chromophores have not been determined due to their complex chemical composition and sources. Here, we successfully separated several fluorescence components from the EEM data using the parallel factor analysis (PARAFAC) method, and the results are shown in Fig. 8. The fact of the





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value of core consistency is close to 100 in PARAFAC indicates that the more the individual components that are analyzed together, the more they make up 100% of the mixture, with no 444 445 unexplained residues. The core consistency of BrC extract in water was 89%, but the value can reach 95% together with that in MeOH. 446



449

Figure 8. Three-dimensional excitation-emission matrix of three fluorescent components with 450 emission and excitation spectra of each fluorescent component at peak emission and excitation 451 wavelengths in WSBrC (above) and WI-MSBrC (below) obtained by PARAFAC model analysis. 452





453 A total of three types of chromophores, two with fluorescence characteristics similar to those of humic-like substances (less oxygenated HULIS and highly oxygenated HULIS) and one with 454 fluorescence characteristics similar to those of protein compounds (PLOM), were identified in 455 Tianjin $PM_{2.5}$ by PARAFAC for EEMs. The types of chromophores obtained in this study together 456 with those from the literature are summarized in Table 2. Chromophore C1 in WSBrC has a 457 primary fluorescence peak at excitation/emission (Ex/Em): <240/393 nm, and a secondary 458 fluorescence peak at Ex/Em: 318/393 nm. C1 can be classified as a humus-like chromophore 459 because the bimodal distribution of the fluorescence spectrum is usually associated with humic-460 like substances (HULIS). The emission wavelength of C1 was closer to the UV region than that of 461 the second peak of C2 in WSBrC, indicating the existence of a large number of aromatic substances, 462 463 conjugate systems and nonlinear ring systems (Deng et al., 2022). C2 (Ex/Em ~251, 363 nm/462 nm) was identified as a common HULIS in aerosols, with higher oxidation, aromatization, 464 molecular weight, conjugation, and unsaturation due to its larger emission wavelength (Wen et al., 465 466 2021). The molecular weight of the fluorescent chromophore as well as its degree of conjugation tend to increase with the excitation wavelength, and such increase in size and the conjugation 467 degree may be attributed to the presence of highly aromatic conjugated structures containing 468 heteroatoms (Chen et al., 2019). Compared to C1 and C2, C3 also contains two peaks, with shorter 469 470 wavelengths (<380 nm) emission peak, which is usually associated with PLOM such as tryptophan and tyrosine, with low aromatic properties and small molecular size. 471

472

Table 2. Description and wavelength positions of PARAFAC components in this study and other
 repoerts. (PLOM = protein compounds; HULIS = humic-like substances)

Category	Components	Ex(nm)	Em(nm)	Substances	References
WSBrC WI- MSBrC	C1	<240, 318	393	low-oxygenated HULIS	
	C2	251, 363	462	high-oxygenated HULIS	
	C3	<240, 271	356.3	PLOM, such as tryptophan and tyrosine	
	C1	<240, 279	306	PLOM, tyrosine-like	this study
	C2	<240	379	uncertain	
	C3	251, 294	315	PLOM, tryptophan-like	
Water- soluble	C1	250, 315	396	low-oxygenated HULIS	
	C2	250	465	highly-oxygenated HULIS	
	C3	250	385	low-oxygenated HULIS	(Deng et al., 2022)
BrC	C4	250	340	PLOM, tryptophan-like	-
	C5	275	305	PLOM, tyrosine-like	
	C1	240, 315	393	low-oxygenated HULIS	
WGOG	C2	245, 360	476	highly-oxygenated HULIS	(1) (1) (2021)
wsoc	C3	<240, 290	361	PLOM, such as tryptophan and tyrosine	(wen et al., 2021)
	C4	275	311	PLOM, tyrosine-like	
	C1	255	415	HULIS-1 component	
WCM and	C2	220	340	tryptophan-like component	
W SIVI and	C3	255	385	HULIS-2 component	(Chen et al., 2019)
INISINI	C4	210	300	tyrosine-like component	
	C5	250	355	amino acid-like component	
WSOC	C1	245	410	HULIS, photodegradation of	
	CI	245	410	macromolecules	
	C2	235	398	HULIS, aromatic and saturated compounds	
	02	200	570	were presented	(Via at al. 2020)
		C3 250, 360	466	humic-like chromophores, more aromatic	
	C3			and consisted of more unsaturated	
				compounds produced by condensation	
	01	250, 295	122	reactions	(Xie et al., 2020)
	C4	250, 285	432	terrestrial numic-like chromophore	
MSOC	C5	<235	430	terrestriai numic-like substance,	
	C6	275	408	low ovidation humic like	
	C7	215	372	protein-like chromophore	
	07	233, 213	512	protein-like (tryptophan-like) may be	
	C8	260, 310	364	related to PAHs	





475 However, MeOH-soluble chromophore C1 might be tyrosine-like substance. C2 could be HULIS or PLOM, it's not quite certain because its emission wavelength <380nm fits the profile of 476 PLOM, but it is also close to the emission wavelength of HULIS. While C3 is a tryptophan-like 477 substance, which was reported to contain low aromatic and small molecular weight. In general, 478 phenols contribute significantly to C3 chromophore as they are the products of incomplete 479 pyrolysis of lignin and cellulose and are used as indicators of biomass burning (Wen et al., 2021). 480 The water-insoluble chromophores of all samples in this study can be classified as PLOM. This 481 indicates that the chromophores of protein substances mainly dissolve in solvents with high 482 polarity. As shown in Fig. 9, the water-soluble extracts contained more HULIS. In contrast, the 483 484 MeOH extracts contained more PLOM chromophores than those in the water-soluble extracts.

485 Surprisingly, according to the excitation emission wavelength, we classified the fluorescence component of WI-MSBrC substance as PLOM, but the correlation between their fluorescence 486 intensity and BIX ($R^2 = 0.06$, p < 0.05) was very small, far lower than that of WSBrC substance 487 and BIX ($R^2 = 0.18$, p < 0.05). On the contrary, the correlation between their fluorescence intensity 488 and HIX ($R^2 = 0.54$, p < 0.05) was much higher than that of WSBrC ($R^2 = 0.01$, p < 0.05). Although 489 PLOM may be associated with some polycyclic aromatic hydrocarbons (PAHs) or phenols from 490 491 fossil fuel combustion and biomass burning, especially in urban aerosols, the correlation is 492 puzzling.



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Figure 9. Relative abundances of the chromophores of the WSBrC and WI-MSBrC in PM_{2.5}
 from Tianjin.

497

498 Fig. 9 displays the average relative contributions of the fluorescent components of WSBrC 499 and WI-MSBrC during different periods. On average, the humic-like chromophores together contributed more than 60% to the fluorescence intensity in WSBrC, suggesting that humic-like 500 501 chromophores played a dominant role in fluorescence properties of WSBrC in Tianjin. Generally, 502 the low-oxygenated chromophores C1 made considerable contributions in each season. C2, as highly oxygenated HULIS, has a greater relative contribution in summer, which might be due to 503 504 the strong solar radiation in summer, which made some HULIS with little oxygen photodegraded 505 and form highly oxygenated HULIS through a series of oxidation reactions. In contrast, in WI-





506 MSBrC, the average contribution of PLOM to fluorescence intensity was higher than 70% in 507 spring (80.2%) and summer (77.9%), but C2 component dominated in winter and autumn. This 508 indicated that biological activities increased in spring and summer and the relative abundance of 509 bioaerosols was higher during that period.

510 3.4 Potential sources of BrC

The types of chromophores present in aerosols are numerous and their sources are complex. 511 A chromophore may originate from a single source or may be contributed by multiple sources. To 512 explore the potential sources of BrC, correlations of FV with chemical components and light 513 absorption of PM_{2.5} were studied. The total FVs of WSBrC and WI-MSBrC with SOC showed a 514 significant correlation in autumn ($R^2 = 0.80, p < 0.05$) and spring ($R^2 = 0.52, p < 0.05$). Furthermore, 515 the correlation between FVs and EC in each season was insignificant. Such relations suggest that 516 the secondary formation processes contributed more in autumn and spring. A good correlation 517 between FVs and Abs₃₆₅ of WSBrC and WI-MSBrC was found in all seasons, except in winter, 518 which indicate that most of light-absorbing materials would also have fluorescence character. 519

The relative contents of different chromophores in different polar extracts were also different. 520 The results showed that the overall optical properties of the different samples were different (Fig. 521 10). Recently, it has been reported that the aerosols derived from biomass burning and coal 522 combustion exhibit the highest NFV values, while SOA show the lowest NFV values (Chen et al., 523 2020). NFV in all samples studied in Tianjin during 2018–2019 was very similar to that of POA 524 and higher than that of SOA. Such result reveal that the chromophores in the Tianjin PM_{2.5} might 525 mainly be derived from a primary combustion sources. In addition, the NFVs of the Tianjin PM_{2.5} 526 were higher in winter than in summer, which is likely and can be attributed to the photolysis of 527 chromophores in summer. In addition, NFV in MeOH-soluble OC was much higher than that in 528 529 WSBrC, which indicated that chromophores were abundant in WI-MSBrC than in the WSBrC. Extraction of BrC by variety of solvents is a subject of our future research. 530



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Figure 10. The normalized fluorescence volumes (NFVs) of the WSBrC and WI-MSBrC of
 PM_{2.5} from Tianjin, North China.

In order to further identify the sources of the chromophores, the correlation between $\delta^{13}C_{TC}$ as well as $\delta^{15}N_{TN}$ and the optical parameters of BrC were analyzed. As shown in Fig.11, $\delta^{15}N_{TN}$ in Tianjin PM_{2.5} showed a negative correlation with Abs_{365, WSBrC} in autumn (R² = 0.61) and summer (R² = 0.55), whereas the $\delta^{13}C_{TC}$ showed a significant relation neither with Abs_{365, WSBrC} nor with Abs_{365, WI-MSBrC} in all seasons. Such relations indicated that some of N-containing substances





- 539 derived from biomass burning emissions, biological emissions and subsequent aging of aerosols
- in summer and autumn might contain BrC chromophores and were soluble in water (Satish and
- 541 Rastogi, 2019).



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Figure 11. Scatter plots between $\delta^{13}C_{TC}/\delta^{15}N_{TN}$ and optical parameters (Abs₃₆₅, AAE, MAE) in WSBrC and WI-MSBrC in PM_{2.5} from Tianjin. The $\delta^{13}C_{TC}/\delta^{15}N_{TN}$ data is obtained from (Dong et al., 2023).

546 **4. Summary and Conclusions**

This study presents the temporal variations in light absorption and fluorescence properties of water-soluble BrC (WSBrC) and the water-insoluble but MeOH-soluble BrC (WI-MSBrC) in





549 $PM_{2.5}$ collected from Tianjin, North China during July 5, 2018 – July 5, 2019. Based on correlation between BrC and aerosol chemical composition, the possible sources of BrC were 550 comprehensively analyzed. Light absorption properties of WSBrC and WI-MSBrC in Tianjin were 551 investigated and found to be distinct from season to season, which was lower in spring and summer, 552 compared with that in autumn and winter. The AAE of WI-MSBrC was comparable with that of 553 WSBrC and indicated that Tianjin PM_{2.5} contains more polar BrC. The Mass absorption efficiency 554 of WSBrC and WI-MSBrC (MAE₃₆₅) exhibited distinct seasonal variations, which was higher in 555 winter and lower in summer and autumn. Biologically derived or secondary BrC might be one of 556 the reasons for the lower MAE_{365} values in summer and autumn. The light absorption of BrC in 557 the range of 300-400 nm to the light absorption of WSBrC and WI-MSBrC in whole range (300-558 700 nm) was close to 40%, indicating that BrC plays an important role in climate warming and 559 atmospheric photochemical reactions. In order to better assess its impact on climate, further work 560 561 is needed through observations and laboratory simulations of BrC generation and aging.

In addition, based on PARAFAC analysis model, EEM data were comprehensively analyzed 562 563 to compare the types and abundance of different color clusters in different aerosol samples, and a portion of source of BrC chromophore was determined by different excitation-emission 564 wavelengths. In this study, BrC chromophore was divided into three categories: low-oxygenated 565 HULIS, high-oxygenated HULIS and protein-like compound (PLOM). The high-oxygenated 566 HULIS was more reactive than other categories in the atmospheric photooxidation. By comparing 567 the fluorescence fluxes of different polar extraction solutions, it was found that WI-MSBrC 568 substances contributed more than half of the fluorescence, indicating that there were more polar 569 BrC substances in Tianjin aerosol, which attributed from anthropogenic emissions. The correlation 570 571 between BrC optical properties and aerosol chemical composition indicated that fossil fuel combustion significantly contributed to BrC content in winter, while primary biological emission 572 and aging reaction significantly contributed to the BrC content in summer. These results illustrated 573 574 the light absorption properties of BrC in metropolis aerosols and emphasized its significant contribution to radiative forcing. 575

576 Declaration of competing intertest

577 The authors declare no competing intertest in this paper.

578 Data Availability Statement

The data used in this study can be found online at <u>https://doi.org/10.5281/zenodo.7316371</u> (Dong et al., 2022), and at <u>https://doi.org/10.5281/zenodo.5140861</u> (Dong et al., 2021).

581 Acknowledgments

This work was supported in part by National Natural Science Foundation of China (Grant No.
41775120 and 42277090) & National Key Research and Development Plan (Grant No.
2017YFC0212700), China. The author also thanks to Mr. Yunting Xiao's help for writing a code
to calculate the SFE.





586 Author contribution

- 587 ZD and CMP conceptualized this study. ZD and PL conducted the sampling. ZD conducted the
- chemical analyses, interpreted the data and wrote the manuscript. CMP supervised the research
- and acquired the funding for this study. XZ, ZXY and ZXM administrated the project. CMP, ZX,
- 590 DJ, PF and CQL contributed in discussing the results and review and editing the manuscript.

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