

1 **The density of ambient black carbon retrieved by a new method:**  
2 **implications to CCN prediction**

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25 **Abstract.**

26 The effective density of black carbon (BC) is a crucial factor relevant to its aging  
27 degree that would add uncertainty in evaluating its climate effect. Here, we have  
28 developed a new method to retrieve the effective density of internally mixed BC in the  
29 atmosphere combining field observations conducted during 15 November -14  
30 December 2016 in urban Beijing with the Köhler theory. The uncertainty of the retrieval  
31 method was evaluated within  $\pm 30\%$ , which is primarily caused by assumptions of the  
32 hygroscopic parameter of organics and the fraction of primary organic aerosols in non-  
33 hygroscopic or hygroscopic mode. Using the method, we obtain that the ambient  
34 internally mixed BC, accounting for  $80\pm 20\%$  of total BC aerosol particles, is retrieved  
35 with a campaign mean density of  $1.1\pm 0.6\text{ g cm}^{-3}$  during the observed periods. The  
36 retrieved result is comparable with that reported in the Literature. By applying a lower  
37 ( $0.14\text{ g cm}^{-3}$ ) and upper ( $2.1\text{ g cm}^{-3}$ ) limit of the retrieved BC density in cloud  
38 condensation nuclei (CCN) number concentrations ( $N_{\text{CCN}}$ ) estimation, we derived that  
39 neglect of such variations in BC density would lead to an uncertainty of  $-28\% \sim 11\%$   
40 in predicting  $N_{\text{CCN}}$  at supersaturations of  $0.23\%$  and  $0.40\%$ . We also find that the  $N_{\text{CCN}}$   
41 is more sensitive to the variations of BC density when it is  $< 1.0\text{ g cm}^{-3}$ . This illustrates  
42 a necessity of accounting for the effect of BC density on CCN activity closer to source  
43 regions where the BC particles are mostly freshly emitted. The CCN closure achieves  
44 when introducing the retrieved real-time BC density and mixing state. This study  
45 provides a unique way of utilizing field measurements to infer ambient BC density and

46 highlights the importance of applying variable BC density values in models when  
47 predicting CCN and assessing its relevant climate effect.

## 48 **1 Introduction**

49 Black carbon (BC) aerosols, as the major absorber of solar radiation, play a vital  
50 role in energy budget and climate of the earth-atmosphere system by affecting the  
51 radiative forcing and cloud properties (Flanner et al., 2007; Ramanathan and  
52 Carmichael, 2008). The light-absorbing capability induced by BC is related to its  
53 density and morphology (Zhang et al., 2008; Rissler et al., 2014), which can be  
54 modified after mixing with other atmospheric aerosol particles (Khalizov et al., 2009;  
55 Xue et al., 2009). Changes in its physicochemical properties would also regulate its  
56 ability to serve as cloud condensation nuclei (CCN) and further indirectly affect the  
57 radiative balance by affecting the clouds process (Yuan et al., 2008; Wang et al., 2011).  
58 Owing to the complex evolution of the mixing state, density and morphology of BC,  
59 the contribution of BC particles to CCN budgets is still not well understood.

60 BC particles, with diesel vehicles, industrial and residential coal combustion as  
61 major sources, are ubiquitous in urban environments (Bond et al., 2013; Dameto et al.,  
62 2017; Li et al., 2017; Liu et al., 2019a). The mixing state of BC describes the  
63 distribution of the bare BC and coating masteries among the aerosol population.  
64 Typically, freshly generated BC exists in the form of chain aggregates and initially  
65 uncoated, which is known as externally mixed BC (Ex-BC). When the BC particles  
66 were emitted, they generally mix with other materials by condensation, coagulation,

67 and other processes (Riemer et al., 2004; Zhang et al., 2008; Liu et al., 2013; Zhang et  
68 al., 2020a), forming the internally mixed BC (In-BC) particles consisting of BC core  
69 and other chemical components (Cheng et al., 2006; Zhang et al., 2016). The BC  
70 structure would be more compact with regular shapes (Pagels et al., 2009; Zhang et al.,  
71 2008; Wang et al., 2017), and the effective density of internally mixed BC are changed  
72 accordingly with the reconstruction (Liu et al., 2019b). The density and morphology of  
73 BC particles are closely related to its sources, mobility size, coating thickness, coating  
74 material and its chemical composition (Zhang et al., 2008; Pagels et al., 2009; Peng et  
75 al., 2016; Zhang et al., 2022). A wide range of BC density has been reported in previous  
76 studies (Lide 1992; McMurry et al., 2002; Park et al., 2004; Kiselev et al., 2010). Recent  
77 field measurements have indicated that the average BC density is  $\sim 1.2 \text{ g cm}^{-3}$  in the  
78 ambient atmosphere (Zhang et al., 2016). Field measurements have also indicated that  
79 a considerable fraction of externally mixed/uncoated BC exists (Clarke et al., 2004;  
80 Cheng et al., 2012), although a higher proportion of internally mixed/aged BC particles  
81 in the ambient atmosphere were observed (Schwarz et al., 2008; Massoli et al., 2015;  
82 Chen et al., 2020). In climate models, the BC was generally assumed completely  
83 internally mixed and treated to have a void-free spherical structure and a density value  
84 of  $1.8 \text{ g cm}^{-3}$  (Bond et al., 2013). This may lead to bias in estimating the climate effect  
85 driven by BC.

86 Previous study based on a case study show that when the aging degree of ambient  
87 particles is low, the BC density ( $\sim 1.8 \text{ g cm}^{-3}$ ) under the spherical assumption will lead  
88 to the overestimation of particle hygroscopicity by 40-50 % and the overestimation can

89 be explained almost 100 % using the effective density of fresh BC ( $\sim 0.45 \text{ g cm}^{-3}$ ) (Fan  
90 et al. 2020). This indicates the importance of using reasonable BC density values in the  
91 calculation of particle hygroscopicity. In addition, when estimating the CCN number  
92 concentration, a significant bias of  $-35 \% \sim +20 \%$  was found due to the assumption of  
93 particle mixing state (Ren et al., 2018). However, these studies have not yet accounted  
94 for such impact of BC density and mixing state on CCN prediction due to lack of real  
95 time measurement data.

96 The mixing state and the density of BC particles are usually directly measured by  
97 several techniques, such as an integrated system of a volatility tandem differential  
98 mobility analyzer and a single particle soot photometer (VTDMA-SP2) (Zhang et al.,  
99 2016), or a differential mobility analyzer with a SP2 (DMA-SP2) (Olfert et al., 2007;  
100 Rissler et al., 2014; Wu et al., 2019), and a differential mobility analyzer–centrifugal  
101 particle analyzer–single-particle soot photometer (DMA–CPMA–SP2) system (Liu et  
102 al., 2019b; Yu et al., 2020), etc. However, such techniques or measurements are not  
103 available in many previously conducted field campaigns. In this study, we develop a  
104 novel method for retrieving the mixing state and effective density of ambient BC  
105 particles by combining field measured hygroscopic growth factor and aerosol chemical  
106 composition and Köhler theory (Petters and Kreidenweis, 2007). The uncertainty of the  
107 new retrieval method was evaluated. The retrieved results were also compared and  
108 validated with existing observations. In addition, the effect of BC density and mixing  
109 state on prediction of CCN number concentrations is further evaluated through a  
110 sensitivity and closure test by accounting for the retrieved real-time variations of BC

111 density and mixing state.

## 112 **2 Field measurements and methodology**

### 113 **2.1 Field measurements**

114 Measurements in this study were conducted from 15 November to 14 December  
115 2016 at a typical urban site of Beijing (39.97°N, 116.37°E, 49 m above sea level). The  
116 site locates at the Institute of Atmospheric Physics, Chinese Academy of Sciences,  
117 which is mainly influenced by the surrounding cooking, road traffic and residential coal  
118 burning emissions during the home heating periods (Sun et al., 2016). The detailed  
119 information about the sampling site was presented in previous studies (Sun et al., 2015;  
120 Zhang et al., 2019). The number concentration of condensation nuclei (CN) at each size  
121 was measured by a scanning mobility particle sizer, which is equipped with a  
122 differential mobility analyzer (DMA; model 3081, TSI) and a condensation particle  
123 counter (CPC; model 3772, TSI). Subsequently, the mono-dispersed particles were  
124 introduced into a Droplet Measurement Technologies CCN counter (CCNc, DMT;  
125 Lance et al., 2006) to measure CCN number concentration. A hygroscopic tandem  
126 differential mobility analyzer (HTDMA) system was used to measure the hygroscopic  
127 growth factor (Gf) (Tan et al., 2013). Here, four diameters of 40, 80, 110, 150, and 200  
128 nm are selected in the campaign. Gf is defined as the ratio of the mobility diameter at  
129 the given RH to the dry diameter (Petters and Kreidenweis, 2007). The nonrefractory  
130 submicron aerosol chemical composition was measured by an Aerodyne high-  
131 resolution time-of-flight aerosol mass spectrometer (HR-AMS; Xu et al., 2019),

132 including sulfate, nitrate, ammonium, chloride, and organics. Two factors, including a  
 133 non-hygroscopic primary organic aerosol (POA) and hygroscopic secondary organic  
 134 aerosol (SOA) were classified by positive matrix factorization (PMF) with PMF  
 135 algorithm (v4.2) method (Paatero and Tapper, 1994) and followed the procedures  
 136 reported in Ulbrich et al. (2009). The refractory black carbon mass loading was  
 137 measured by an aethalometer (model AE33, Magee Scientific Corporation). Both the  
 138 nonrefractory materials and BC mass concentration were measured with diameters <  
 139 1.0  $\mu\text{m}$ . The detailed description of the instrument operation and data process have been  
 140 described in details elsewhere (Ren et al., 2018; Xu et al., 2019; Zhang et al., 2019; Fan  
 141 et al., 2020).

## 142 **2.2 Retrieving the mixing state and density of BC**

### 143 2.2.1 Retrieving the mixing state of BC

144 The Gf probability distribution function (Gf-PDF) for a specified diameter can be  
 145 retrieved firstly based on the TDMA<sub>inv</sub> algorithm (Gysel et al., 2009). The  $\kappa$ -PDF can  
 146 be further calculated based on the Gf-PDF (Fan et al., 2020). Size-resolved  $\kappa$  is derived  
 147 using  $\kappa$ -Köhler theory based on hygroscopic growth factor (Gf) (Petters and  
 148 Kreidenweis, 2007),

$$149 \quad \kappa_{gf} = (Gf^3 - 1) \cdot \left[ \frac{1}{RH} \exp\left(\frac{4\sigma_{s/a}M_w}{RT\rho_w D_d Gf}\right) - 1 \right] \quad (1)$$

150 where Gf is hygroscopic growth factor, RH is the relative humidity in the HTDMA  
 151 (90 %),  $D_d$  is the dry diameter,  $\sigma_{s/a}$  is assumed to be the surface tension of pure water,

152  $R$  is the universal gas constant,  $T$  is the temperature,  $M_w$  and  $\rho_w$  is the molecular mass,  
 153 and the density of water, respectively.

154 The  $\kappa$ -PDF patterns of particles in different sizes always present two modes: nearly  
 155 hydrophobic (NH) mode with  $\kappa_{gf} \leq 0.1$  and more hygroscopic (MH) mode with  $\kappa_{gf} >$   
 156 0.1 (Fig. S1). Firstly, based on the  $\kappa$ -PDF patterns, the number fraction (NF) of the total  
 157 nearly hydrophobic group with the boundary of [0, 0.1] was calculated according to the  
 158 following equation:

$$159 \quad NF = \int_0^{0.1} c(\kappa, D_p) d\kappa \quad (2)$$

160 here, the  $\kappa$ -PDF, represented by  $c(\kappa, D_p)$ , was normalized as  $\int c(\kappa, D_p) d\kappa = 1$ , where  
 161  $\kappa$  can be replaced by  $\kappa_{gf}$ ,  $D_p$  is the selected electrical mobility diameter in the campaign.

162 The nearly hydrophobic mode consists of both externally mixed POA (Ex-POA or  
 163 bare POA) and externally mixed BC (Ex-BC). Since the number fraction of the nearly-  
 164 hydrophobic POA would change with the emission and aging processes, in this study,  
 165 we have applied different values for the number fractions of hydrophobic POA (NH-  
 166 POA) under clean (91 %), moderately polluted (70 %), and heavily polluted conditions  
 167 (31 %) by referring the literature (Liu et al., 2021a), as shown in Fig. S2. The number  
 168 concentration of Ex-BC was then calculated using the total number fraction of NH  
 169 mode minus the number of NH-POA.

$$170 \quad N_{POA-containing} = N_{total} \times NF_{POA-containing}$$

$$171 \quad N_{bare-POA} = N_{POA-containing} \times NF_{bare-POA}$$

$$172 \quad N_{Ex-BC} = N_{NH} - N_{bare-POA} \quad (3)$$

173 where  $N_{POA-containing}$  and  $NF_{POA-containing}$  are the number concentration and fraction of



174 POA-containing particles,  $N_{\text{total}}$  is the total number concentration,  $N_{\text{bare-POA}}$  and  $NF_{\text{bare-}}$   
175  $\text{POA}$  are the number concentration and fraction of bare POA particles, and  $N_{\text{NH}}$  is the  
176 number of nearly hydrophobic group.

177 The number size distribution of the externally mixed BC ( $n_{\text{EX-BC}}(\log D_p)$ ) can be  
178 calculated based on the particle number size distribution (PNSD) and the number  
179 fraction of the hydrophobic mode of BC ( $NF_{\text{EX-BC}}$ ) as follows:

$$180 \quad n_{\text{EX-BC}}(\log D_p) = NF_{\text{EX-BC}} \times n(\log D_p) \quad (4)$$

181 where  $n(\log D_p)$  is the function of the aerosol number size distribution,  $D_p$  is the  
182 mobility diameter.

183 By assuming that the particles are spherical (Rader and McMurry, 1986), the mass  
184 size distribution of EX-BC ( $M_{\text{EX-BC}}$ ) was obtained as follows:

$$185 \quad M_{\text{EX-BC}}(\log D_p) = \frac{\pi}{6} D_p^3 \rho n_{\text{EX-BC}}(\log D_p) \quad (5)$$

186 where  $D_p$  is the mobility diameter,  $\rho$  is the effective density of EX-BC, and  $n_{\text{EX-BC}}(\log$   
187  $D_p)$  is the function of the number size distribution of EX-BC, respectively. By reviewing  
188 and summarizing the existing results, we show that typical values of density for the  
189 freshly emitted or externally mixed BC observed in the winter of urban Beijing or North  
190 China Plain span over 0.14-0.50 g cm<sup>-3</sup>, with mean of  $\sim 0.40 \pm 0.10$  g cm<sup>-3</sup> (Fig. S3), in  
191 the size range of 100 to 300 nm, where the mass concentration of externally mixed BC  
192 mostly concentrated (Geller et al., 2006; Peng et al., 2016, 2017; Wu et al., 2019; Liu  
193 et al., 2020; Zhao et al., 2022). Therefore, an average  $\rho_{\text{EX-BC}}$  of 0.4 g cm<sup>-3</sup> was used for  
194 calculating the mass concentration of externally mixed BC in our study. Uncertainty  
195 analyses due to the variations of  $\rho_{\text{EX-BC}}$  were given in section 2.3.

196 The mass size distribution of Ex-BC was fit using the log-normal distribution as  
 197 shown in Fig. S4 (Wu et al., 2017; Liu et al., 2019a; Zhao et al., 2022). Thus, the bulk  
 198 mass concentration of Ex-BC can be calculated from the integration of the mass size  
 199 distribution:

$$200 \quad m_{\text{Ex-BC}} = \int_{D_{\text{start}}}^{D_{\text{end}}} M_{\text{Ex-BC}}(\log D_p) d \log(D_p) \quad (6)$$

$$201 \quad m_{\text{In-BC}} = m_{\text{BC}} - m_{\text{Ex-BC}} \quad (7)$$

202 where  $D_{\text{start}}$  and  $D_{\text{end}}$  are the lower and upper size limit,  $M_{\text{Ex-BC}}(\log D_p)$  is the function  
 203 of the Ex-BC mass size distribution. We then obtained the bulk mass concentration of  
 204 internally mixed BC ( $m_{\text{In-BC}}$ ) by subtracting  $m_{\text{Ex-BC}}$  from the bulk BC mass  
 205 concentration measured by AE33 in equation 7. It should be noted that the mass  
 206 concentration of BC obtained from AE33 based on aerosol light absorption may lead  
 207 some uncertainty, as has been further addressed in Section 2.3.

### 208 2.2.2 Retrieving the density of BC

209 For retrieval of the density of BC, the principal idea is to use the measured  $\kappa_{\text{gf}}$  to  
 210 calculate the density of BC based on the Zdanovskii–Stokes–Robinson (ZSR) mixing  
 211 rule (Stokes and Robinson, 1966; Zdanovskii, 1948) with the chemical composition  
 212 measured by AMS (Petters & Kreidenweis, 2007). In the retrieval, several aspects are  
 213 concerned. First, since the ZSR rule assumes the aerosol particles are internally mixed,  
 214 the  $\kappa_{\text{gf}}$  value of the more MH mode ( $\kappa_{\text{gf-MH}}$ ) is thus applied for retrieving the density of  
 215 internally mixed BC. Second, since the size distribution of BC number concentration is  
 216 usually with peaks between 100 and 200 nm (Liu et al., 2019a; Yu et al., 2020; Zhao et

217 al., 2022), the  $\kappa_{gf-MH}$  value of particles in accumulation mode was averaged and applied  
 218 for the retrieval. Previous studies showed an independence of  $\kappa_{gf-MH}$  on particle size  
 219 when the  $D_p > 100$  nm during the campaign period (Fan et al., 2020). Therefore, the  
 220 average of  $\kappa_{gf-MH}$  in accumulation mode is reasonable for the determination of the In-  
 221 BC density. In addition, because the inversion including measurements from HTDMA  
 222 and HR-AMS, a total mass closure of the measured aerosol particles was conducted  
 223 between the two techniques by comparing the mass concentration of  $PM_{10}$  and the results  
 224 are well consistent (Fig. S6). The density of internally mixed BC (In-BC),  $\rho_{In-BC}$  is then  
 225 derived from the following equations:

$$226 \quad \kappa_{gf-MH} = \kappa_{chem} = \sum_i \varepsilon_i \kappa_i = \frac{v_{inorg}}{v_{total}} \kappa_{inorg} + \frac{v_{SOA}}{v_{total}} \kappa_{SOA} + \frac{v_{In-POA}}{v_{total}} \kappa_{POA} + \frac{v_{In-BC}}{v_{total}} \kappa_{BC} \quad (8)$$

227 where  $\kappa_{gf-MH}$  is the hygroscopic parameter of the more hygroscopic (MH) mode,  $\kappa_{chem}$   
 228 is the hygroscopic parameter of aerosol particles in the mixed composition and can be  
 229 calculated based on chemical volume fractions using a simple rule (Stokes and  
 230 Robinson, 1966; Petters & Kreidenweis, 2007),  $\kappa_i$  is the hygroscopic parameter of each  
 231 pure composition and  $\varepsilon_i$  is the volume fraction of the individual components in the  
 232 internally mixed particle.  $v_{inorg}$ ,  $v_{SOA}$  and  $v_{In-POA}$  are the volume of the inorganic, SOA  
 233 and internally mixed POA species, and can be calculated as follows:  $v_{inorg} = \frac{m_{inorg}}{\rho_{inorg}}$ ,  
 234  $v_{SOA} = \frac{m_{SOA}}{\rho_{SOA}}$ , and  $v_{In-POA} = \frac{m_{In-POA}}{\rho_{POA}}$ .  $v_{total}$  is the total volume of all the species and can be  
 235 written as  $v_{total} = \frac{m_{inorg}}{\rho_{inorg}} + \frac{m_{SOA}}{\rho_{SOA}} + \frac{m_{In-POA}}{\rho_{POA}} + \frac{m_{In-BC}}{\rho_{In-BC}}$ . In equation (8),  $\kappa_{BC}$  and  $\kappa_{POA}$  are  
 236 assumed to be 0. So, the total volume  $v_{total}$  can be further written as  $v_{total} =$   
 237  $\frac{v_{inorg} \kappa_{inorg} + v_{SOA} \kappa_{SOA}}{\kappa_{gf-MH}}$ . The volume of internally mixed  $v_{In-BC}$  can be calculated as follows,

$$238 \quad v_{In-BC} = \frac{v_{inorg} \kappa_{inorg} + v_{SOA} \kappa_{SOA}}{\kappa_{gf-MH}} - v_{inorg} - v_{SOA} - v_{In-POA}$$

$$239 \quad \frac{\frac{m_{inorg} \kappa_{inorg} + \frac{m_{SOA} \kappa_{SOA}}{\rho_{SOA}}}{\rho_{inorg} \kappa_{gf-MH}} - \frac{m_{inorg}}{\rho_{inorg}} - \frac{m_{SOA}}{\rho_{SOA}} - \frac{m_{In-POA}}{\rho_{POA}}}{\kappa_{gf-MH}} \quad (9)$$

240 Then, the  $\rho_{In-BC}$  can be calculated based on its mass concentration and volume as follows:

$$241 \quad \rho_{In-BC} = \frac{m_{In-BC}}{\left( \frac{m_{inorg} \kappa_{inorg} + \frac{m_{SOA} \kappa_{SOA}}{\rho_{SOA}}}{\rho_{inorg} \kappa_{gf-MH}} - \frac{m_{inorg}}{\rho_{inorg}} - \frac{m_{SOA}}{\rho_{SOA}} - \frac{m_{In-POA}}{\rho_{POA}} \right)} \quad (10)$$

242 where,  $m_{In-BC}$  is the mass concentration of internally mixed BC,  $m_{inorg}$  and  $m_{SOA}$  are the  
 243 mass concentrations of the inorganic species and SOA, which are measured by the AMS.  
 244  $m_{In-POA}$  is the mass concentrations of internally mixed POA and can be calculated  
 245 through subtracting the mass fraction of NH-POA from the total mass concentrations  
 246 of POA.  $\rho_{inorg}$ ,  $\rho_{SOA}$  and  $\rho_{POA}$  are the density of the inorganic species, SOA and POA.  
 247 Since the AMS measures the concentrations of the organic and inorganic ions, including  
 248  $SO_4^{2-}$ ,  $NO_3^-$ ,  $NH_4^+$ ,  $Cl^-$ . Here inorganic species were derived by applying a simplified  
 249 ion pairing scheme (Gysel et al., 2007) to convert mass concentrations of ions to the  
 250 inorganic salts as follows:

$$252 \quad n_{NH_4NO_3} = n_{NO_3^-}$$

$$253 \quad n_{NH_4HSO_4} = \min(2n_{SO_4^{2-}} - n_{NH_4^+} + n_{NO_3^-}, n_{NH_4^+} - n_{NO_3^-})$$

$$254 \quad n_{(NH_4)_2SO_4} = \max(n_{NH_4^+} - n_{NO_3^-} - n_{SO_4^{2-}}, 0)$$

$$251 \quad n_{H_2SO_4} = \max(0, n_{SO_4^{2-}} - n_{NH_4^+} + n_{NO_3^-}) \quad (11)$$

255 where  $n$  represents the number of moles, and the mass concentrations were obtained by  
 256 the number of moles times the molar mass of each inorganic salts. Because the value of  
 257 the  $n_{H_2SO_4}$  was zero in this campaign. Three inorganic salts including  $NH_4HSO_4$ ,  
 258  $(NH_4)_2SO_4$ , and  $NH_4NO_3$  were applied in our study. The densities for inorganic salts  
 259 were taken from previous studies (Gysel et al., 2007; Wu et al., 2016). Here the densities  
 260 for three inorganics are 1.78, 1.77 and 1.72 g cm<sup>-3</sup>, respectively. By summarizing the

261 previous studies (Gysel et al., 2007; Dinar et al., 2006),  $1.4 \text{ g cm}^{-3}$  was selected as the  
262 density of SOA ( $\rho_{\text{SOA}}$ ). The density of POA ( $\rho_{\text{POA}}$ ) is assumed to be  $1.0 \text{ g cm}^{-3}$  for urban  
263 environments, which is similar to the that of the lubricating oil (Wu et al., 2016). Since  
264 the cooking organic aerosols represent a high contribution to POA in urban  
265 environments, we choose the mean density of the rapeseed oil and oleic acid ( $\sim 0.85 \text{ g}$   
266  $\text{cm}^{-3}$ ) (Reyes-Villegas et al., 2018) to evaluated the result as shown in section 2.3. The  
267 values of  $\kappa$  for inorganic components are 0.56 for  $\text{NH}_4\text{HSO}_4$ , 0.48 for  $(\text{NH}_4)_2\text{SO}_4$  and  
268 0.58 for  $\text{NH}_4\text{NO}_3$ , along with the best-fit values for the three inorganic salts (Petters &  
269 Kreidenweis, 2007 and Gunthe et al., 2009). The  $\kappa_{\text{SOA}}$  is assumed to be 0.15 according  
270 to the field studies in urban areas (Chang et al., 2010; Kawana et al., 2016).

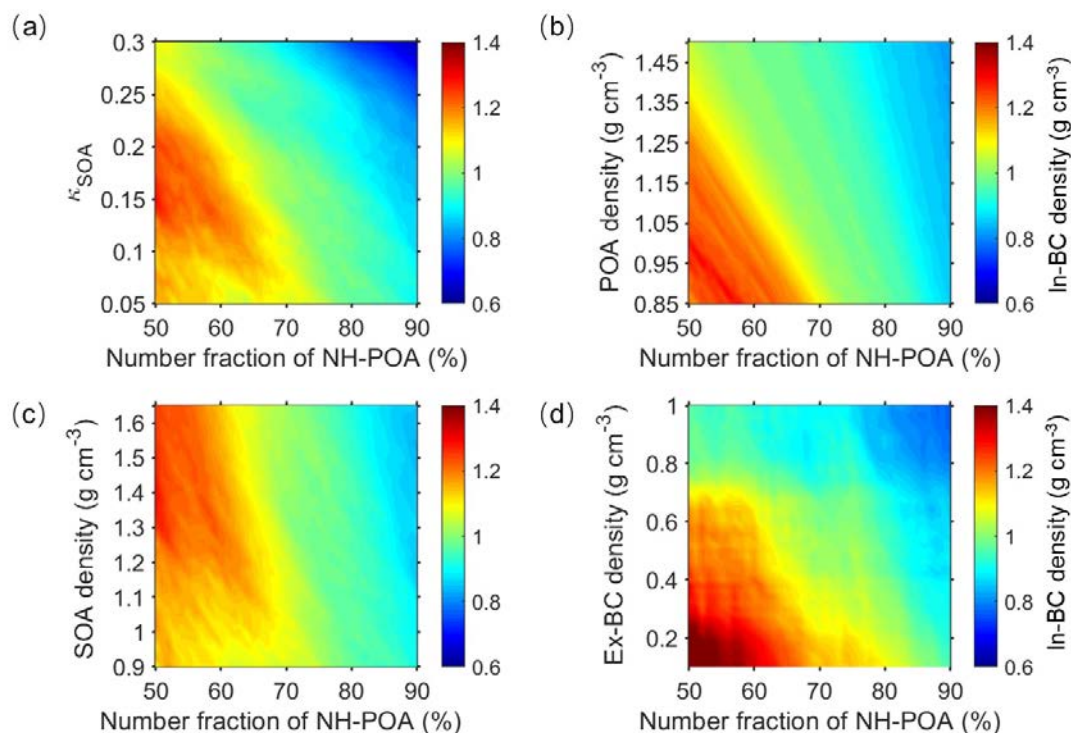
271 Note that the method fails to retrieve the BC density when organic accounts for a  
272 large fraction ( $>60\%$ ). This is because that a higher fraction of OA usually corresponds  
273 to lower total volume of all the species (Fig. S7), yielding negative values for  $v_{\text{In-BC}}$   
274 introduced in equation 9. As a result, 61 % of the data observed during the campaign  
275 were valid for calculating the BC density.

276 Similarly, the bulk density of BC ( $\rho_{\text{bulk-BC}}$ ) is calculated with the same method as  
277 that for calculating the  $\rho_{\text{In-BC}}$ . When calculating the  $\rho_{\text{bulk-BC}}$ , the bulk  $\kappa_{\text{gf}}$  value measured  
278 by HTDMA is applied assuming that all the aerosol particles are internally mixed.

### 279 **2.3 Uncertainties and limitations**

280 For the retrieval, the assumptions on the values of  $\kappa_{\text{SOA}}$ ,  $\rho_{\text{POA}}$ ,  $\rho_{\text{SOA}}$  and  $\rho_{\text{Ex-BC}}$  as  
281 well as the fraction of primary organic aerosols in non-hygroscopic or hygroscopic

282 mode would add uncertainty in the inferred values of ambient internally mixed BC  
 283 density. For example, the freshly emitted POA particles might consistently be coated  
 284 with the secondary particles during the aging process, resulting in changes of the  $NF_{NH-}$   
 285 POA. However, a real-time variation of the  $NF_{NH-POA}$  is not yet available due to the lack  
 286 of such measurements data. Applying only the rough fractions of hydrophobic POA for

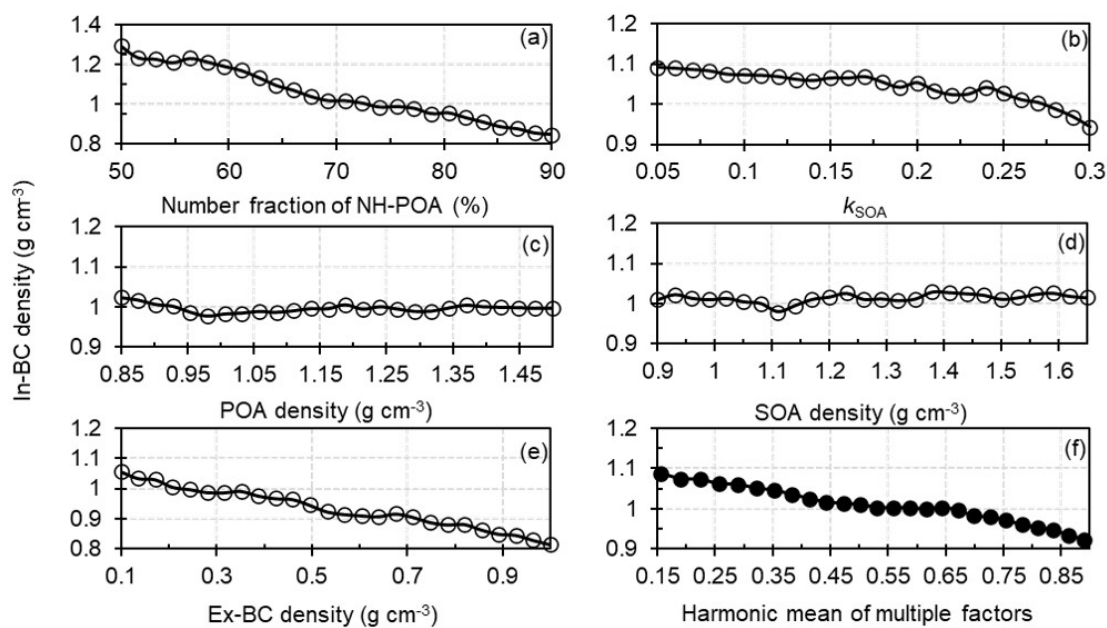


287

288 **Figure 1.** Sensitivities of In-BC density to the variations in the number fraction of  
 289 nearly hydrophobic (NH) POA and hygroscopic parameter of OA ( $k_{SOA}$ ) (a), POA  
 290 density (b), SOA density (c) and the externally mixed BC density (d).

291 three different atmospheric conditions could still cause uncertainties. Also, the densities  
 292 of POA and SOA may differ due to their precursors, emission sources and the formation  
 293 mechanisms in ambient atmosphere (Alfarra et al., 2006; Reyes-Villegas et al., 2018).  
 294 And the density of Ex-BC is generally characterized by the morphology and size (Wu  
 295 et al., 2019). In addition, the value of  $\kappa_{SOA}$  spans largely due to the variability in the

296 emissions of gas precursors and formation processes under different atmospheric  
 297 conditions (Zhang et al., 2015; Liu et al., 2021b). Therefore, we examined the  
 298 sensitivities of In-BC density to the variations of these factors, as exhibited in Fig. 1  
 299 and Fig.2.



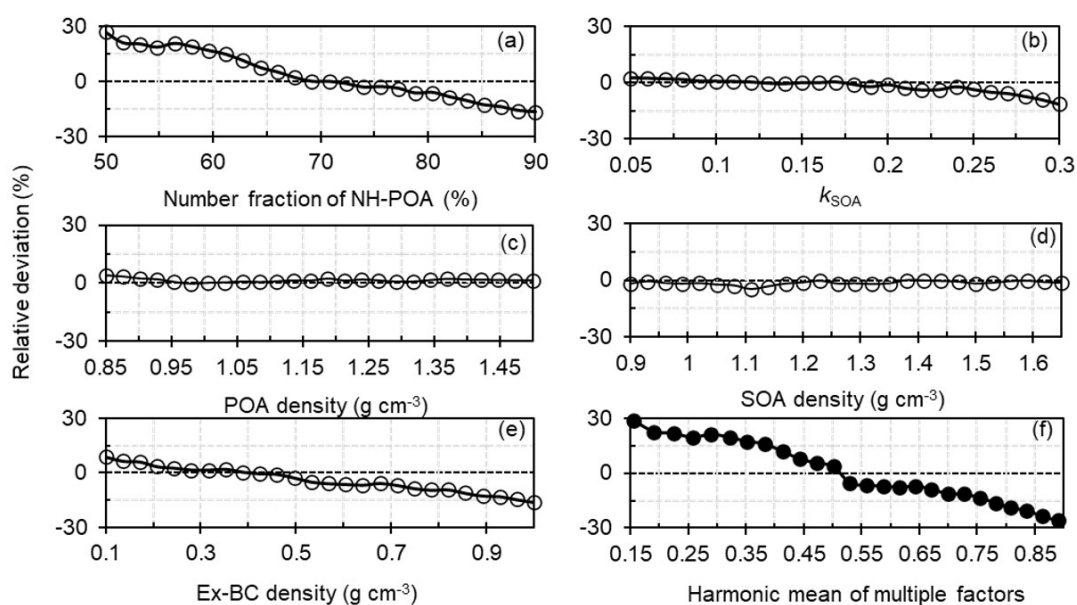
300

301 **Figure 2.** Sensitivity of the In-BC density to variations in the number fraction of nearly  
 302 hydrophobic (NH) POA (a), the hygroscopic parameter of SOA (b), the POA density  
 303 (c), the SOA density (d), the externally mixed BC density (e) and the harmonic mean  
 304 of multiple factors (f).

305 The figures show that the In-BC density gradually decreases with the increment of  
 306 the  $NF_{NH-POA}$ , implying the high fraction of bare POA particles correspond to the early  
 307 aging stage of aerosol particles. With increase of  $\kappa_{SOA}$ , the In-BC density is generally  
 308 reduced, but with small fluctuations (Fig.1a, Fig. 2b). This suggests a complex impact  
 309 of assumptions of  $\kappa_{SOA}$  on the retrieved BC density. In addition, the In-BC density  
 310 decreases slightly as  $\rho_{Ex-BC}$  increases (Fig. 2e), suggesting applying a larger  $\rho_{Ex-BC}$

311 would derive smaller values for In-BC density. The In-BC density is insensitive to the  
 312 changes of the density of POA and SOA, showing an almost negligible effect on the  
 313 retrieved results (Fig. 2c and d).

314 The uncertainty analysis shows that, by comparing the results based on the mean  
 315 fractions of the  $NF_{NH-POA}$  with a typical atmospheric observed range of 50-90 % for the  
 316  $NF_{NH-POA}$  (Liu et al., 2021a), we show that the assumption on  $NF_{NH-POA}$  can lead to  
 317 relative deviations (uncertainty) of -17 %~+27 % for the retrieved BC density (Fig.3a).



318

319 **Figure 3.** Relative deviations of the number fraction of nearly hydrophobic (NH) POA  
 320 to the In-BC density (a), the hygroscopic parameter of OA to the In-BC density (b), the  
 321 POA density to the In-BC density (c), the SOA density to the In-BC density (d), the  
 322 externally mixed BC density to In-BC density (e) and the combined deviations based  
 323 on multiple factors mentioned above (f).

324 In addition, unlike inorganics (eg.,  $NH_4HSO_4$ ,  $(NH_4)_2SO_4$  and  $NH_4NO_3$ ), which  
 325 the hygroscopicity has been already well-understood (Petters and Kreidenweis, 2007),



326 the hygroscopicity of organic species varies largely due to the complexity in organic  
327 aerosol constituents. Therefore, the assumption of the values of  $\kappa_{\text{SOA}}$  will add the  
328 uncertainty in the calculation of BC density. Previous studies have suggested that the  
329 organics has a wide range of  $\kappa$  values ranging from 0.05 to 0.3 (Jimenez et al., 2009;  
330 Mei et al., 2013). Thus, the sensitivity test has also been done to examine the effect due  
331 to changes in  $\kappa_{\text{SOA}}$  on calculating the density of BC (Fig. 1a). The result shows that the  
332 assumption of  $\kappa_{\text{SOA}}$  value can cause an average relative deviation of -10 %~+3 % in  
333 calculating the density of In-BC (Fig. 3b).

334 However, the sensitivity test shows that the impact of both the  $\rho_{\text{POA}}$  and  $\rho_{\text{SOA}}$   
335 variations on the BC density estimation is very small or even negligible (Fig. 1b, c). By  
336 varying the  $\rho_{\text{POA}}$  from 0.85 to 1.5 g cm<sup>-3</sup> and the  $\rho_{\text{SOA}}$  from 0.9 to 1.65 g cm<sup>-3</sup> according  
337 to the literatures (Noureddini et al., 1992; Alfarra et al., 2006; Reyes-Villegas et al.,  
338 2018; Cai et al., 2020; Kostenidou et al., 2007), the retrieval uncertainties in the BC  
339 density are both within  $\pm 5$  % (Fig. 3c, d). For  $\rho_{\text{EX-BC}}$ , it exhibits that the evolution of the  
340  $\rho_{\text{EX-BC}}$  could lead to an average deviation of -16 %~+9 % in calculating In-BC density  
341 (Fig. 3e) when increasing the values of  $\rho_{\text{EX-BC}}$  from 0.1 to 1.0 g cm<sup>-3</sup>, which represents  
342 a typical range in ambient atmosphere (Wu et al., 2019; Liu et al., 2020). A combined  
343 uncertainty ( $\delta$ ) caused by the multiple factors ( $\delta_i$ ), which is calculated by equation 12,  
344 is -26 %~+29 % as shown in Fig. 3f.

$$345 \quad \delta = \sqrt{\sum_{i=1}^n \delta_i^2} \quad (12)$$

346 In addition, it should be noted that the mass concentration of BC obtained from  
347 AE33 based on aerosol light absorption may lead some uncertainty. However, the

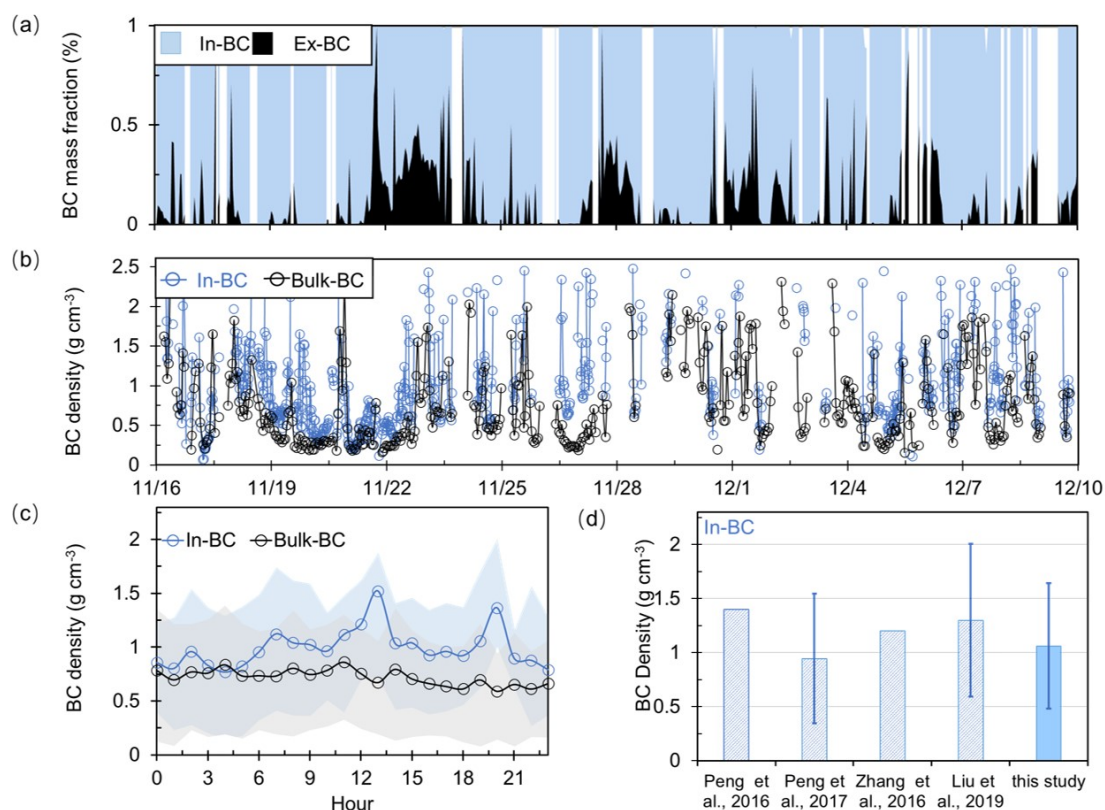
348 comparison of the simultaneously measured data by SP2 with that by AE33 during the  
349 campaign shows that the temporal variations of BC mass concentrations measured by  
350 the two techniques are well consistent (Fig S5). Note that the BC mass measured by  
351 SP2 is occasionally low probably because of the low detection efficiency in small size  
352 (McMeeking et al., 2010; Schwarz et al., 2006). In addition, the SP2 is unable to  
353 quantify the BC mass beyond a certain limit because of the saturation of electronic  
354 devices recording signals (Pileci et al., 2021). We show that, compared the results that  
355 retrieved if applying the BC mass measured by SP2, the BC density retrieved based on  
356 AE33 can be 18% higher. Given that the measurement bias from SP2, this  
357 overestimation indicates an upper limit of the uncertainty.

### 358 **3 Results and Discussion**

#### 359 **3.1 Retrieved mixing state and density of BC: comparison and validation**

360 Figure 4a shows retrieved time series of the mixing state of ambient BC during the  
361 campaign. Large temporal variations of the mass fraction of internally and externally  
362 mixed BC are presented during the observed period at the sites. The temporal changes  
363 should be related to the atmospheric aging process or diurnal variations of emissions  
364 (Liu et al., 2019a; Fan et al., 2020). Statistically, the average mass fraction of externally  
365 and internally mixed BC is  $20\pm 18\%$  and  $80\pm 20\%$  respectively, showing that most of  
366 the BC particles were aged and internally mixed with other components. Previous  
367 studies at urban sites have shown that the co-existence of the externally mixed BC in  
368 the ambient atmosphere (Schwarz et al., 2008; Cheng et al., 2012; Chen et al., 2020)

369 due to continuous combustion processes (e.g., vehicle exhaust and residential sector)  
 370 (Wang et al., 2017; Liu et al., 2019a). Our results are basically comparable with those

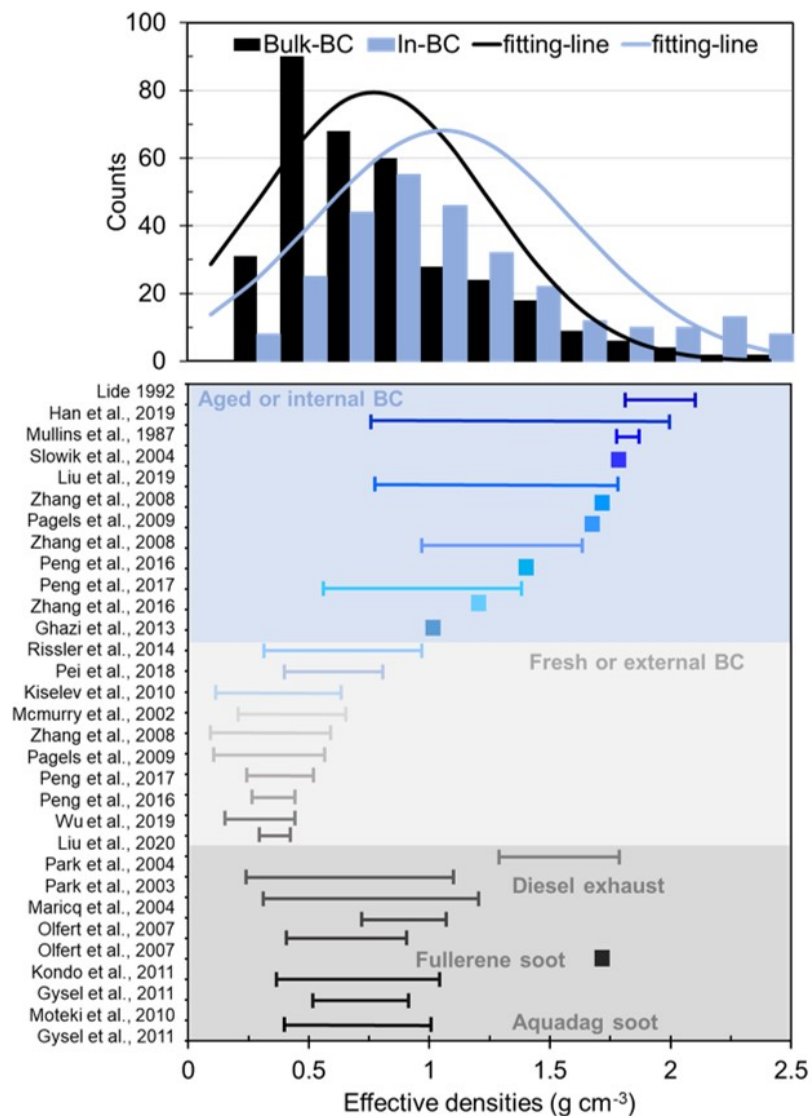


371  
 372 **Figure 4.** (a) Time series of the mass fraction of the retrieved internal- and external-  
 373 mixed BC; (b) Time series of the retrieved density of the bulk and internal- mixed BC  
 374 (In-BC); (c) Diurnal variation of the retrieved density of bulk and In-BC; (d)  
 375 Comparison of the results of the derived In-BC density in this study with that reported  
 376 in literatures.

377 previously reported results, which are directly measured or indirectly retrieved. For  
 378 example, Chen et al., 2020 found that the mass fraction of internally mixed BC particles  
 379 was nearly ~80–90 % in summer of Beijing based on VTDMA measurements. Liu et al.  
 380 (2020), using a tandem system with an aerodynamic aerosol classifier and SP2, reported  
 381 that the mass fraction of internally BC-containing particles would increase with

382 increasing size and reach ~70 % in Beijing. Overall, the mass fraction obtained in our  
383 study is comparable with those reported in urban Beijing. Previous studies also  
384 displayed that the significant diversity of the BC mixing state among emission  
385 conditions and coating process (Shiraiwa et al., 2008; Pan et al., 2017; Zhang et al.,  
386 2020b). Accordingly, the densities of the bulk and internally mixed BC present apparent  
387 fluctuations as shown in Fig. 4b, which is significantly affected by the variations of BC  
388 emission sources and its rapid aging process. The density of the In-BC during daytime  
389 was generally higher than that at night (Fig. 4c). The elevated BC density during  
390 daytime is likely due to that the strong photochemical processes promote the aging of  
391 BC particles, which resulted in a conversion from uncompact structure to compact  
392 and regular spherical shapes of BC (Qiao et al., 2018; Liu et al., 2019b; Zhou et al.,  
393 2022). The lift in BC density around 20:00 LT might indicate that the BC particles  
394 would be rapidly coated with the secondary inorganic aerosol (SIA) particles and  
395 continuously aged in the polluted period due to the heterogeneous reactions of SIA in  
396 urban regions (Zhang et al., 2016; Peng et al., 2017). Actually, following the haze  
397 evolution, the fraction of nearly hydrophobic group reduced rapidly (Fig. S8).  
398 Consequently, the average density of In-BC increased obviously from the clean  
399 conditions to the polluted periods (Fig. S9). A slight decrease was observed in the bulk  
400 BC density during traffic hours. This is likely associated with the continues emissions  
401 (e.g., vehicle exhaust) that lead to uncoated or uncompact BC particles in this period.  
402 The diurnal cycle in In-BC density is consistent with the coating thickness measured  
403 by a tandem CPMA-SP2-DMA-SP2 (Liu et al., 2020), demonstrating that the new

404 method can derive the density of ambient BC particles reasonably. Averagely, the bulk  
 405 and internally mixed BC densities are with campaign averaged values of  $0.7 \pm 0.5$  and  
 406  $1.1 \pm 0.6 \text{ g cm}^{-3}$  respectively, which are much less than  $1.8 \text{ g cm}^{-3}$ , implying that the BC  
 407 particles is not a void-free spheres in the urban atmosphere. The results of In-BC density  
 408 are comparable with that observed at the other sites in North China Plain (NCP) as  
 409 shown in Fig. 4d, illustrating that the BC effective density retrieved by this method is  
 410 within the range of field measurements.



411  
 412 **Figure 5.** The probability distribution function (PDF) of the retrieved density of bulk  
 413 and In-BC and the measured density distribution spectrum of BC from different sources

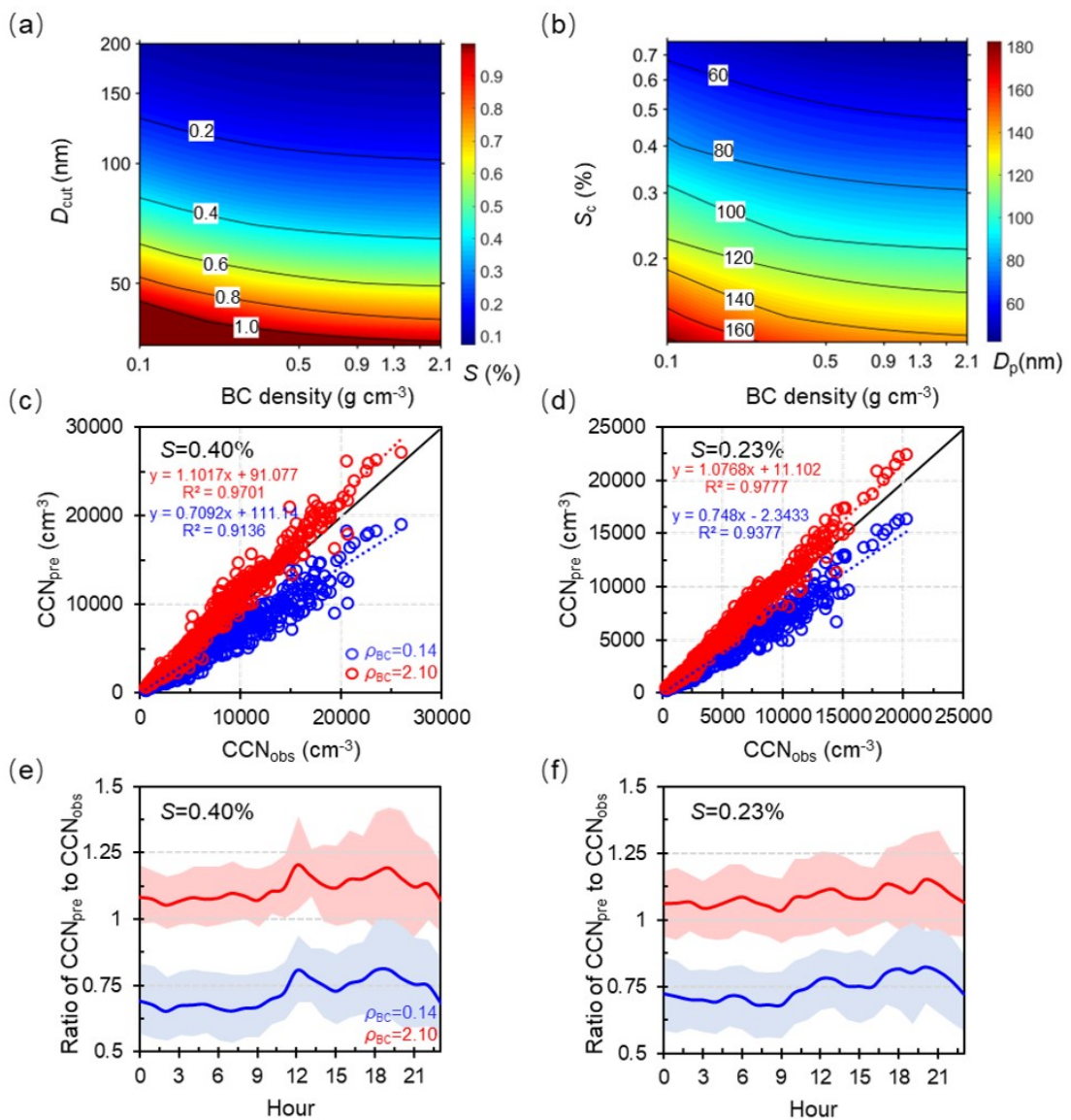
414 reported in literatures.

415       Based on both field measurements (e.g. Lide 1992; Zhang et al., 2016; Wu et al.,  
416 2019; Liu et al., 2019b) and laboratory studies (e.g. McMurry et al., 2002; Park et al.,  
417 2003, 2004; Olfert et al., 2007; Kiselev et al., 2010; Gysel et al., 2011, 2012), the BC  
418 density from diverse combustion sources or representing different aging degree has  
419 been obtained and ranges widely from 0.14 to 2.1 g cm<sup>-3</sup>, as has been summarized and  
420 shown in Fig. 5. Mean probability distribution function (PDF) of the density of bulk  
421 and In-BC retrieved by this study is also presented in Fig. 5. It shows that the retrieved  
422 density of bulk BC exhibits a dominant mode with a peak value of 0.7 g cm<sup>-3</sup>, which is  
423 situated between the typical density range of those externally mixed and internally  
424 mixed BC measured previously. For the In-BC, the PDF is with a peak value at 1.1 g  
425 cm<sup>-3</sup>, but ranges widely from ~0.5 to 2.5 g cm<sup>-3</sup>, which indicates various morphologies,  
426 different aging degree and compositions of ambient BC particles due to the complex  
427 impact of multiple local sources and aging processes during the observed period in  
428 urban Beijing. Overall, the retrieved values for In-BC density fall within the range of  
429 typical internal mixed BC reported in the literatures, verifying the reliability of our  
430 inversion results.

### 431 **3.2 Sensitivity of predicted $N_{CCN}$ to changes of BC density**

432       A previous study showed that the use of an inaccurate density value of BC particles  
433 would result in large bias in estimating  $\kappa$  of ambient aerosol particles with the ZSR  
434 mixing rule (Fan et al., 2020), as would further lead to uncertainties in prediction of

435  $N_{CCN}$  and relevant climate effects. Considering the large variation range of BC density  
 436 during the campaign, which is closely associated with its morphology or degree of its  
 437 aging, we further examine the sensitivity of critical supersaturation ( $S_c$ ), critical  
 438 diameter ( $D_{cut}$ ) and predicted  $N_{CCN}$  to variations of BC density (Fig. 6). Here, we use  
 439 the critical diameter and particle number size distribution to calculate  $N_{CCN}$ . The method  
 440 to derive the critical diameter is based on Köhler theory and ZSR rule.



441

442 **Figure 6.** Sensitivity of critical supersaturation ( $S_c$ ) (a) and diameter ( $D_{cut}$ ) (b) to the  
 443 variations in BC density; Predicted  $N_{CCN}$  as a function of measured  $N_{CCN}$  by varying the

444 density from 0.14 to 2.1 g cm<sup>-3</sup> at  $S=0.40\%$  (c) and  $S=0.23\%$  (d), the black solid line  
445 is the 1:1 line; Diurnal variations in the ratio of predicted-to-measured  $N_{CCN}$  at  $S=0.40\%$   
446 (e) and  $S=0.23\%$  (f).

447 The results show that, by varying the value of density from 0.14 to 2.1 g cm<sup>-3</sup> that  
448 represents the lower and upper limit of BC density in the atmosphere, the  $D_{cut}$  reduces  
449 apparently at a given supersaturation ( $S$ ) (Fig. 6a), or similarly, the  $S_c$  decreases rapidly  
450 for a given particle size (Fig. 6b). The results show that the changes of the  $D_{cut}$  and  $S_c$   
451 are more sensitive when the BC density is below 1.0 g cm<sup>-3</sup>. And the effects on the  $D_{cut}$   
452 and  $S_c$  both gradually weakened with the increase of BC density. This shows that it is  
453 critical to apply more accurate BC density for the aerosol particles with low aging  
454 degree in predicting CCN and its climate effect. Accordingly, the ratios of predicted-  
455 to-measured  $N_{CCN}$  ranged from 0.72 to 1.11 by varying the BC density from 0.14 to 2.1  
456 g cm<sup>-3</sup> at the typical  $S$  of 0.23 % and 0.40 % (Fig. 6c, 6d), showing an estimation  
457 uncertainty of -28 % ~ 11 % in  $N_{CCN}$  prediction.

458 The diurnal variations in the ratio of predicted-to-measured  $N_{CCN}$  at  $S=0.40\%$  and  
459 0.23 % are shown to examine the response of the BC density on  $N_{CCN}$  prediction at  
460 different time periods (Fig. 6e, 6f). By applying the lower limit of density value of 0.14  
461 g cm<sup>-3</sup>, the prediction is much worse compared to the use of the density of 2.1 g cm<sup>-3</sup> at  
462 nighttime (00:00-06:00 LT), when the latter is much closer to the real density of ambient  
463 BC (Fig. 4c). The prediction is improved substantially by applying the value of 0.14 g  
464 cm<sup>-3</sup> during evening rush hours (18:00-20:00 LT), during which the ambient BC  
465 particles is disturbed by the traffic emissions (Fig. 4c). And now, the prediction becomes



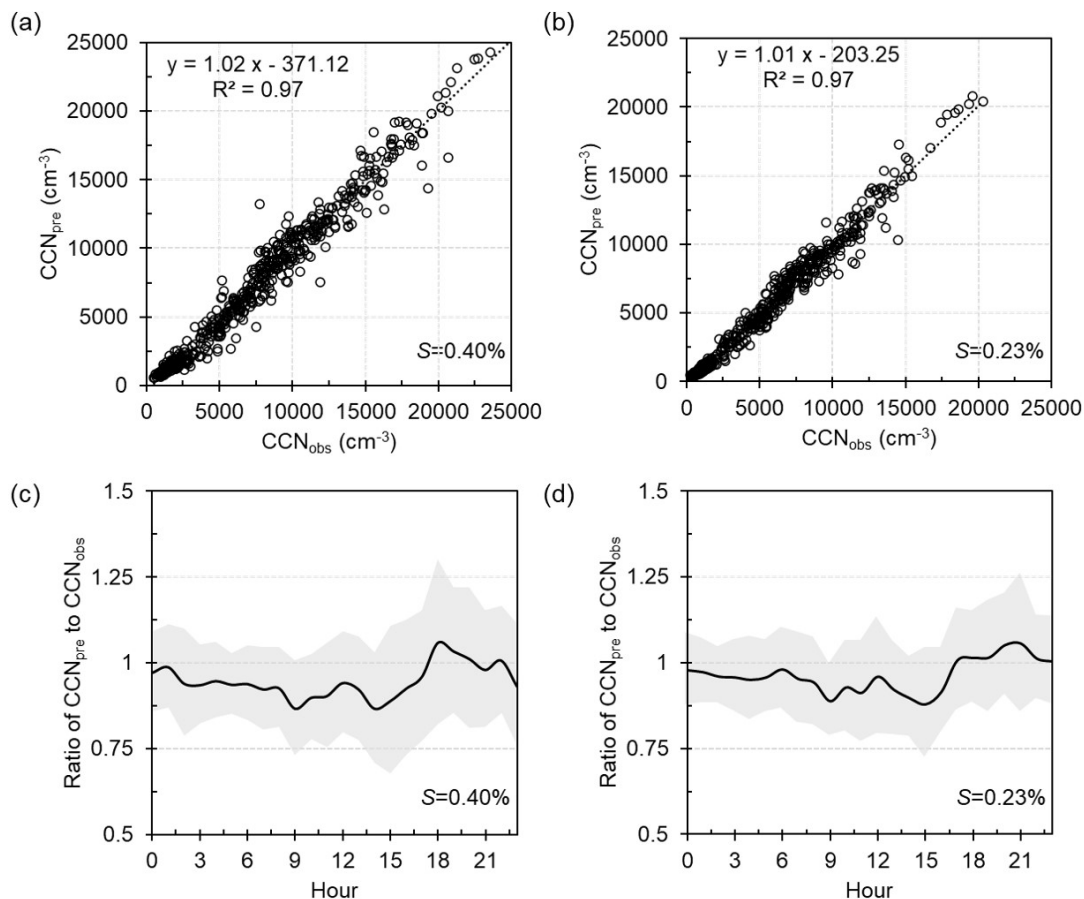
466 worse by applying the value of  $2.1 \text{ g cm}^{-3}$ , and an obvious overestimation by up to ~40 %  
467 is shown. The results further illustrate that it is critical to account for the real-time  
468 mixing state and density of BC particles in  $N_{\text{CCN}}$  prediction, particularly in those regions  
469 with heavy traffic and residential coal emissions.

470 It should be noted that the assumption of the surface tension of water would  
471 overestimate the critical diameter and underpredict CCN number concentration. While  
472 the surface tension depression might be more obvious for the small size particles (<60  
473 nm), as the fraction of organics are higher at small particles size (Meng et al., 2014; Cai  
474 et al., 2018). Here, in this study, we calculated the critical diameters at supersaturations  
475 of 0.40 % and 0.23 %, typical values in cloud, corresponding to larger sizes (> 70 nm  
476 and 90 nm) of aerosols. Therefore, the uncertainties from the application of the surface  
477 tension of pure water should be negligible (< 10 %). Here, three schemes were assumed  
478 to evaluate the effect of BC density and mixing state on prediction of CCN number  
479 concentrations. The detailed calculation methods are presented in the supporting  
480 information (SI: Methods) or referenced from Ren et al. (2018).

### 481 **3.3 Using the real-time variations of BC density and mixing state to predict $N_{\text{CCN}}$**

482 Figure 7 exhibits the comparisons between predicted and measured  $N_{\text{CCN}}$  at  $S$  of  
483 0.23 % and 0.40 % by accounting for the retrieved real-time variations of BC density  
484 and mixing state. It shows that the  $N_{\text{CCN}}$  can be well predicted with a slope of 1.01 and  
485 1.02 at  $S$  of 0.23 % and 0.40 % respectively (Fig. 7a, 7b), only presenting a slight  
486 deviation. The slight deviation is primarily due to the fixed value of the density for the

487 externally mixed BC caused by the retrieved method, especially during noontime and  
 488 evening rush periods (Fig. 7c and 7d).



489  
 490 **Figure 7.** Prediction CCN number concentration using the mixing state and In-BC  
 491 density derived from HTDMAs at  $S=0.40\%$  (a) and  $S=0.23\%$  (b). Diurnal variations  
 492 in the ratio of predicted-to-measured  $N_{CCN}$  at  $S=0.40\%$  (c) and  $S=0.23\%$  (d).

493 The diurnal variations in the ratio of predicted-to-measured  $N_{CCN}$  shows the  $N_{CCN}$   
 494 can be underestimated by up to 15 % at  $S=0.40\%$  during those periods. While, a slightly  
 495 overrated during the evening traffic hours and nighttime may be due to the  
 496 underestimation of the number fraction of Ex-BC. Overall, the dependence of the CCN  
 497 prediction on  $S$  is due to the size dependence of  $\kappa$  and mixing state (Zhang et al., 2017;  
 498 Liu et al., 2020; Xu et al., 2021). The better closure at  $S=0.23\%$  is because that the bulk

499  $\kappa$  of particles is closer to that the critical diameter corresponding to  $S=0.23$  %, with  $D_p$   
500 of 100-150 nm. Similarly, the effect on CCN prediction induced by the bulk mixing  
501 state would be more critical for smaller particles, corresponding to the critical diameter  
502 at high  $S$ .

503 Overall, when considering the effective density of BC relevant to its mixing state,  
504 the CCN closure achieves. Previous studies have shown that the fresh emitted BC  
505 particles may convert from fractal-like aggregates to a compact structure and its density  
506 would increase with the aging process (Pagels et al., 2009; Rissler et al., 2014; Peng et  
507 al., 2016; Liu et al., 2019b; Zhang et al., 2020a, 2022), but the actual density of In-BC  
508 may be lower than  $1.8 \text{ g cm}^{-3}$  in the ambient atmosphere according to this study.  
509 Therefore, the currently applied value represents a density of the void-free structure of  
510 BC particles may cause an overestimation in CCN prediction.

## 511 **4 Conclusions**

512 The mixing state and effective density of BC changed through heterogenous  
513 chemistry process and thus would cause uncertainty in evaluating its CCN activity. In  
514 this study, we develop a new method to retrieve the mixing state and effective density  
515 of ambient BC using field measurements and the Köhler theory. The uncertainty of the  
516 new retrieval method was evaluated within  $\pm 30$  %, which is primarily caused by  
517 assuming the value of  $\kappa_{\text{SOA}}$  and the fraction of primary organic aerosols in non-  
518 hygroscopic mode. The retrieved results show that most of the BC particles were aged  
519 and internally mixed with other components, with mean mass fraction of  $80 \pm 20$  %.

520 Averagely, the retrieved densities of the bulk and internally mixed BC are  $0.7\pm 0.5$  and  
521  $1.1\pm 0.6$  g cm<sup>-3</sup> respectively, but ranges widely from  $\sim 0.1$  to  $2.5$  g cm<sup>-3</sup>, indicating  
522 various morphologies, different aging degree and compositions of ambient BC particles  
523 due to the complex impact of multiple local sources and aging processes during the  
524 observed period. The retrieved results are basically comparable with the previous  
525 observations in North China Plain.

526 Further examination shows the  $N_{CCN}$  prediction is with uncertainties of  $-28\%$   $\sim 11\%$   
527 at the typical  $S$  of  $0.23\%$  and  $0.40\%$  by varying the BC density from  $0.14$  to  $2.1$  g cm<sup>-3</sup>  
528 <sup>3</sup> that represents the lower and upper limit of ambient BC particles. Moreover, the  
529 prediction is found more sensitive to the variability of BC density when it is  $< 1.0$  g cm<sup>-3</sup>  
530 <sup>3</sup>, suggesting a great significance to account for the effect of BC density for the aerosol  
531 particles with low aging degree when evaluating the climate effect. The CCN closure  
532 achieves when introducing the retrieved real-time BC density relevant to its mixing  
533 state. This work provides a unique way of utilizing field observations to infer ambient  
534 BC density and highlights the current assumption of a void-free structure of BC  
535 particles in models would cause large uncertainties in CCN prediction and in the  
536 relevant climate effect evaluation.

537 The method used to derive the ambient BC density has limitations. Since the  
538 assumptions on the values of  $\kappa_{SOA}$ ,  $\rho_{POA}$ ,  $\rho_{SOA}$  and  $\rho_{Ex-BC}$  as well as the fraction of  
539 primary organic aerosols in non-hygroscopic or hygroscopic mode would add  
540 uncertainty in the inferred values of ambient internally mixed BC density. It is thus  
541 necessary to examine observational data to verify this methodology in further studies.

542 However, the method and results of this study could provide the way for a more  
543 comprehensive understanding of the variability in BC density in Beijing. Additionally,  
544 it has the potential to reveal the uncertainties of usage of void-free structure of BC  
545 density in accessing the climate effects.

#### 546 **Data availability.**

547 All data needed to evaluate the conclusions in the paper are present in the paper and/or  
548 the Supplement. All data used in the study are also available from the corresponding  
549 author upon request (zhangfang2021@hit.edu.cn).

#### 550 **Author contributions.**

551 FZ and JR conceived the conceptual development of the manuscript. JR directed and  
552 performed of the experiments with JL, LC, and FZ. JR conducted the data analysis and  
553 wrote the draft of the manuscript. All authors edited and commented on the various  
554 sections of the manuscript.

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560 **Competing interests.**

561 The contact author has declared that neither they nor their co-authors have any  
562 competing interests.

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