

# **Optical and hygroscopic properties of black carbon influenced by particle microphysics at the top of anthropogenically polluted boundary layer**

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## 1 Abstract

2 Aerosols at the top of planetary boundary layer (PBL) could modify its atmospheric dynamics by redistributing  
3 the solar radiation, and start to be activated to form low-level cloud at this layer. Black carbon (BC), as an  
4 aerosol component efficiently absorbing solar radiation, can introduce heating and positive radiative effects at  
5 this sensitive layer, especially in the polluted PBL over the continent. This study presents continuous  
6 measurements of detailed BC properties at a mountain site locating at the top of polluted PBL over the North  
7 China Plain, during seasons (3 and 4 weeks of data during winter and summer, respectively) with contrast  
8 emission structure and meteorology. The pollution level was persistently influenced by local surface  
9 anthropogenic emission on daily basis through daytime convective mixing, but the concentration was also  
10 enhanced or diluted depending on air mass direction, defined as neutral, polluted and diluted PBL, respectively.  
11 Winter was observed to have a higher BC mass fraction (4-8%) than summer (2-7%). By resolving the detailed  
12 particle size-resolved mixing state of BC in optical and hygroscopic models, we found enhanced BC mass  
13 absorption cross section ( $MAC_{BC}$ ) for polluted PBL (up to  $13 \text{ m}^2\text{g}^{-1}$  at  $\lambda=550 \text{ nm}$ ), which was 5% higher during  
14 summer than winter due to smaller BC core size. The higher BC mass fraction in winter corresponded with a  
15 lower single-scattering albedo by 0.03- 0.09 than summer, especially the lowest for diluted winter PBL  
16 ( $0.86\pm0.02$ ). The water supersaturation (SS) required to activate half number of BC decreased from  $0.21\pm0.08\%$   
17 to  $0.1\pm0.03\%$  for winter diluted and polluted PBL; from  $0.22\pm0.06\%$  to  $0.17\pm0.05\%$  for summer. Notably, at  
18 the top of anthropogenically polluted PBL in both seasons, the enlarged BC with enhanced absorption capacity  
19 could be also efficiently droplet activated, e.g. winter (summer) BC with MAC of  $9.84\pm1.2$  ( $10.7\pm1$ )  $\text{m}^2\cdot\text{g}^{-1}$   
20 could be half activated at  $SS=0.13\pm0.06\%$  ( $0.18\pm0.05\%$ ). These BC at the top of the PBL can more directly  
21 interact with the free troposphere and be transported to a wider region, exerting important direct and indirect  
22 radiative impacts.

## 24 1. Introduction

25 Black carbon aerosol (BC) is strongly shortwave absorbing, wielding important climate warming impact in  
26 regional and global scale (Bond et al., 2013; Bond and Bergstrom, 2006). The emission of BC has large  
27 regional heterogeneity with higher impact over polluted regions (Ramanathan and Carmichael, 2008). The  
28 impacts due to BC heating are importantly determined by its vertical distribution in atmospheric column,  
29 which could lead to a more stable or convective planetary boundary layer (PBL) (Ding et al., 2016; Koch and  
30 Del Genio, 2010), e.g. an enhanced heating at higher level will depress the development of the layer below  
31 (Chung et al., 2002; Ramanathan et al., 2005; Hansen et al., 2005), while the heating can promote the  
32 convection above (Mcfarquhar and Wang, 2006; Rudich et al., 2003), e.g. BC was found to account for 43%  
33 of the total aerosol radiative forcing at the atmosphere in south Asia due to heating (Raju et al., 2020).  
34 Therefore, the properties of BC at the top of PBL are important, which may result in contrast impacts in  
35 perturbing atmospheric dynamics. In addition, surface emissions could serve regular cloud condensation  
36 nuclei (CCN) on daily basis through daytime convective mixing in the PBL (Bretherton and Wyant,  
37 1997; Wood and Bretherton, 2004). Aerosols can be uplifted to the top of PBL and subsequently activated to  
38 incorporate into clouds. However, the way of BC from surface sources to be activated, after the PBL  
39 processing during vertical transport, is yet to be explicitly understood.

40 Ground measurements of BC have been intensively conducted over the polluted North China Plain (NCP)  
41 region in last decades (Han et al., 2009; Cheng et al., 2011; Ji et al., 2018; Liu et al., 2019a), e.g. the seasonal  
42 variation of elemental carbon in urban Beijing during 2005-2006 and 2012-2013 (Han et al., 2009; Ji et al.,  
43 2018), the size-resolved mixing state of BC and aging mechanism at a suburban site in NCP (Cheng et al.,  
44 2011), and the contrast physical properties in urban Beijing between winter and summer (Liu et al., 2019a),  
45 were investigated in these studies. But these results were not able to represent the BC properties at the top of  
46 PBL. Additionally, recently conducted series of aircraft measurements provided comprehensive information  
47 about vertical distributions of BC over this region (Zhao et al., 2019; Ding et al., 2019a), but the manner of the  
48 aircraft measurement could not capture the variation of BC at certain level in sufficient time resolution. The  
49 nature of diurnal pattern of PBL means not only the surface concentration of pollutants is influenced by the  
50 daily evolution of PBL, but also the pollutants at the top of PBL will have diurnal variation which need stable  
51 measurements to be characterized. This is particularly the case if the top of PBL was continuously influenced  
52 by surface emissions. However such information is lack at the top of PBL over the polluted NCP region, and  
53 many models still reply on surface measurements to estimate the conditions at higher level (Guleria et al.,  
54 2014; Srivastava et al., 2012a).

55 Microphysical properties of BC importantly determine its optical and hygroscopic properties. For example,  
56 the presence of coatings associated with refractory BC (rBC) may enhance its absorbing capacity (Liu et al.,  
57 2017), also enhances its hygroscopicity (Liu et al., 2013) and particle size, thereby modifying the potential to  
58 be droplet activated (Chuang et al., 2002; Panicker et al., 2016; Ding et al., 2019b). This study is for the first  
59 time to characterize the detailed BC microphysics at a mountain site located at the top of PBL, influenced by  
60 surface emission on daily basis over the NCP region. We have conducted the experiments with intensive  
61 measurements lasting for one month for each of the representative seasons. We investigated the optical and  
62 hygroscopic properties of BC at this level, as influenced by microphysical properties. Such information will  
63 support to constrain the impacts of BC in influencing the PBL dynamics and low-level cloud formation over  
64 this anthropogenically polluted region.

## 66 2. Site description, meteorology, cluster classification

67 Experiments in this study were performed in winter (Feb. - Mar.) and summer (Jun. – Jul.) of 2019 at a  
68 mountain site (115.78°E, 40.52°N, 1344 m), locating on the north of Taihang ridge to the northwest of central  
69 Beijing, shown in Fig 1. (a). The site is away from any local primary emissions, but the only sources of  
70 pollutants are contributed by lower-level surface emissions and regional transport (the follow-up discussions).

71 Backward trajectories at the site are analyzed using the HYSPLIT 4.0 model (Draxler and Hess, 1998), for  
72 every 6-hour during the experimental period. The meteorological field uses the  $1^\circ \times 1^\circ$ , 3-hourly GDAS1  
73 reanalysis product and trajectories back to 48h are calculated. The backward trajectories are used for further  
74 cluster analysis, to group the backward trajectories with similar transport pathway, whereby the homogeneity  
75 of trajectories is maximized in each cluster, meanwhile the heterogeneity among different clusters is  
76 maximized (Makra et al., 2011). This is achieved by analyzing the spatial variance of each trajectory and the  
77 total variance in each pre-defined cluster. The iteration next simultaneously calculates and assigns the  
78 trajectories to the eventually merged clusters. This analysis has been widely used to identify the main transport  
79 pathways of air mass (Markou and Kassomenos, 2010;Philipp, 2009;Jorba et al., 2004;Grivas et al., 2008),  
80 and is performed using the built-in module in HYSPLIT model software.

### 82 3. Instrumentation

83 All aerosol measurements were performed behind a PM<sub>2.5</sub> impactor (BGI SCC1.829), and were dried by a  
84 Nafion tube prior to the sampling of the instruments. BC was measured by a single-particle soot photometer  
85 (SP2) (DMT Inc. USA). This instrument uses laser-induced technique to incandesce BC-containing particle  
86 (Schwarz et al., 2006;Liu et al., 2010). The measured incandescence signal of individual BC particle can be  
87 converted to a refractory BC (rBC) mass, which was calibrated using Aquadag® BC particle standard  
88 (Acheson Inc.), and a factor of 0.75 was applied to correct for the ambient rBC mass (Laborde et al., 2012).  
89 The core size ( $D_c$ ) of BC is calculated from the measured rBC mass by assuming a material density of BC of  
90  $1.8 \text{ g/cm}^3$  (Bond and Bergstrom, 2006). The scattering cross section of BC is derived by the leading edge only  
91 (LEO) method (Gao et al., 2007) on the measured scattering signal of individual BC particle. The entire  
92 particle size of BC-containing particle ( $D_p$ ) including coatings is determined by matching the measured  
93 scattering cross section with the modelled one based on core-shell assumption using a Mie lookup table (Liu  
94 et al., 2014;Taylor et al., 2015). This assumption is mostly valid for BC with thick coatings (Liu et al., 2017),  
95 but not considering the scenario in which BC may be attached to dust particle (Srivastava et al., 2018), given  
96 there was no dust event observed in this study. The bulk coating thickness ( $D_p/D_c$ ) in a given time window is  
97 calculated as the cubic root of the total volume of BC-containing particle weighted by the total volume of rBC  
98 (Liu et al., 2014):

$$99 \frac{D_p}{D_c} = \sqrt[3]{\frac{\sum_i D_{p,i}^3}{\sum_i D_{c,i}^3}} \quad (1),$$

100 where  $D_{p,i}$  and  $D_{c,i}$  are the diameters for the  $i^{\text{th}}$  single particle, respectively. The count (or mass) median  
101 diameter (CMD, or MMD) is derived from a number (or mass) size distribution, below and above which size  
102 the number (or mass) concentration is equal. Modelled mass absorption cross section (MAC) of individual  
103 BC-containing particle is calculated by applying the Mie theory (Bohren, 1998) with a core-shell mixing state  
104 assumption. The bulk MAC for a given time window can then be determined by the total MAC of each BC  
105 particle divided by the total rBC mass, expressed as:

$$106 \text{MAC} = \frac{\sum_i \text{MAC}_i \times m_{rBC,i}}{\sum_i m_{rBC,i}} \quad (2),$$

107 where  $\text{MAC}_i$  and  $m_{rBC,i}$  is the MAC and rBC mass for each particle respectively. An example to calculate  
108 the MAC from single particle information is shown in Fig. 5f. The absorption coefficient  $k_{abs}$  (in  $\text{Mm}^{-1}$ ) is

calculated as the MAC ( $\text{m}^2 \cdot \text{g}^{-1}$ ) multiplying the rBC mass concentration ( $\mu\text{g} \cdot \text{m}^{-3}$ ) in each size bin, then integrated throughout the size distribution:

$$k_{abs} = \sum_i MAC(D_{p,i}, D_{c,i}) m(\log D_{c,i}) \Delta \log D_{c,i} \quad (3),$$

where  $m(\log D_{c,i})$  is the BC mass concentration at each  $D_c$  bin.

the volume ratio between coating and rBC could be obtained from  $D_c$  and  $D_p$  of individual BC:

$$\frac{\varepsilon_{coating}}{\varepsilon_{rBC}} = \left(\frac{D_p}{D_c}\right)^3 - 1 \quad (4),$$

where  $\varepsilon_{coating}$  and  $\varepsilon_{rBC}$  is the volume fraction within BC particle. The hygroscopicity parameter of BC ( $\kappa_{BCc}$ ) could be calculated with known  $\kappa_{coating}$  and  $\kappa_{rBC}=0$ , based on Zdanovskii–Stokes–Robinson (ZSR) rule (Stokes and Robinson, 1966), expressed as,

$$\kappa_{BCc} = \varepsilon_{coating} \times \kappa_{coating} \quad (5),$$

In this study, the main focus is the coating abundance distribution across all BC size distribution, but the variation of coating composition is to a less importance, thus a constant  $\kappa_{coating}=0.3$  is used to represent typical environment containing aged aerosols (Pringle et al., 2010). An example to calculate  $\kappa_{rBC}$  from single particle information is shown in Fig. 5g.

Total aerosol size distribution was measured by a Scanning Mobility Particle Size (SMPS, TSI Inc. Model 3936) at mobility diameter 15-700 nm. The total particle mass below diameter 1  $\mu\text{m}$  ( $\text{PM}_{10}$ ) is derived from the SMPS size distribution by assuming a mean particle density of  $1.45 \text{ g cm}^{-3}$  (Liu et al., 2015; Cross and et al., 2007). The scattering cross-section  $\sigma_{sc}$  ( $\mu\text{m}^2$ ) of particle at all sizes is calculated by applying Mie calculation assuming a refractive index (RI) of  $1.48+0i$  (Liu et al., 2009) (a positive imaginary RI considering the BC mass fraction is tested to have a minor influence in total scattering within 3%), thereby calculating the scattering coefficient  $k_{sca}$  (in  $\text{Mm}^{-1}$ ) of all aerosols:

$$k_{sca} = \sum_i \sigma_{sc}(D_i) n(\log D_i) \Delta \log D_i \quad (6),$$

where  $n(\log D_i)$  represents the particle number concentration at the  $i^{\text{th}}$  size bin. Single-scattering albedo (SSA) is derived as the quotient of scattering coefficient ( $k_{sca}$ ) divided by extinction coefficient ( $k_{abs} + k_{sca}$ ).

## 4. Results and discussion

### 4.1 Classification of PBL

Clustered air masses for both seasons are shown in Fig. 2, and three clusters are classified for each season. For both seasons, Cluster 1 (C1) represents the air masses from the most intensive anthropogenically influenced regions according to the BC emission inventory (Fig. 1b). The seasonal difference is the winter pollution was transported from the west over Shanxi and Hebei province, while was southerly in summer mainly from the North China Plain over Hebei province. Cluster 2 (C2) passed over similar regions in both seasons from the cleaner north. Cluster 3 (C3) both had a longer transport than other clusters, from northwest and northeast in winter and summer respectively. The diurnal variations of PBL height (PBLH) corresponding with periods of each cluster are shown in Fig. 2(d, h), with pronounced diurnal pattern. Apart from C3, winter had a lower PBLH than summer, i.e. the mountain site was slightly above or below the well-developed PBL top in winter and summer, respectively. The consistent diurnal variation of PBL means the mountain site was persistently influenced by the surface sources through daytime convective mixing, when pollutants were transported in the polluted PBL. However, the actual concentration will depend whether the site had been contributed by additional sources or dilution (Fig. 1c).

149 Fig. 3 shows the temporal evolution of BC mass and PM for both seasons classified by air mass clusters,  
150 with right panels showing the frequency under each cluster. Fig. 4 shows their diurnal variations. For all  
151 experimental period, the concentration level of BC mass generally positively correlated with the PM mass,  
152 both indicating the pollution levels. Among the three clusters, C2 had the medium mass concentration, with  
153 over 85% frequency of the air masses contributed by local regions ( $\pm 1^\circ$  around the measurement site), and  
154 additional air masses were from the cleaner northerly direction, similar for both seasons (Fig. 2). It is likely  
155 that this cluster was mainly contributed by local emission, and occasionally diluted to some extent by the air  
156 mass from less polluted region. Here this cluster is defined as “neutral PBL”, to be discriminated with the  
157 other two clusters. In winter C2 showed clear diurnal variation of BC and PM<sub>1</sub> concentration with significant  
158 enhancement in the daytime (Fig. 4b and e) when fully developed PBL (Fig. 2d), with the diurnal pattern  
159 consistent with a previous study conducted in the Indian Himalayan foothills (Srivastava et al., 2012b). This  
160 diurnal pattern on the mountain was contrast with the usual surface measurement, when the daytime PBL  
161 development could dilute the concentration (Liu et al., 2019a; Han et al., 2009). This opposite trend on the  
162 mountain site was consistent with the fully developed PBLH at 12:00-16:00 (Fig. 2d) when the top of PBL  
163 reached the mountain site at this time, and pollutants were transported through convective mixing from the  
164 surface sources (Fig. 1c). In midnight, the nocturnal depressed PBL trapped the surface pollution towards  
165 mountain, and the subsiding cleaner air in free troposphere may have diluted the concentration of pollutants  
166 on the mountain site (Sullivan et al., 1998; Bennett et al., 2010). The enhanced concentration from midday in  
167 summer was also observed (on the mean, Fig. 4a) but not as pronounced as winter, probably due to some wet  
168 removal during the daytime vertical transport from the surface, given the high RH in the summer (Fig. S1).

169 Consistent with the combined back-trajectory and emission analysis above, C1 had for both seasons the  
170 highest BC ( $1.0 \pm 0.5$  and  $0.4 \pm 0.2 \mu\text{g m}^{-3}$  for winter and summer, respectively) and highest PM mass ( $23.8 \pm$   
171  $10.3$  and  $13.4 \pm 9.5 \mu\text{g m}^{-3}$ ). Compared to C1, for C2, the concentration of BC mass was enhanced by a factor  
172 of 2.8 (1.7) higher than that in C2 for winter (summer), with winter having mass concentration frequently  
173 exceeding  $1 \mu\text{g m}^{-3}$ . C1 clearly shows the diminished diurnal variation compared to the neutral PBL of C2,  
174 but all increased throughout the day and night (Fig. 4a and d), particularly for winter. This is because besides  
175 the persistent influence of daytime convective mixing as the neutral cluster in C2, C1 cluster had additional  
176 contribution from wider polluted regions, hereby defined as “polluted PBL” (Fig. 1c). This contribution by  
177 regional transport was not related to a diurnal pattern. The less concentration in summer mountain may also  
178 result from the lower surface emission in the season.

179 C3 had the lowest pollution level among all air mass clusters with a lower BC ( $0.09 \pm 0.03 \mu\text{g m}^{-3}$ ) and PM<sub>1</sub>  
180 mass ( $1.8 \pm 0.4 \mu\text{g m}^{-3}$ ) than C2 by a factor of 2-4, within a similar range of a previous study in western and  
181 central Himalayas (Nair et al., 2013). C3 represented the air masses from regions with low emissions (Fig.  
182 1b). In addition, the faster transport (shown as the longest path for back-trajectories among clusters, Fig. 2c)  
183 and the highest PBLH (Fig. 2d) in C3 could efficiently dilute the pollution in the PBL, hereby termed as  
184 “diluted PBL”. Compared to C2, C3 can efficiently disperse and reduce the pollutants being vertically  
185 transported to the mountain site from the surface, thus with no apparent diurnal pattern of pollution  
186 concentrations neither (Fig. 4c).

187 BC mass fraction in PM<sub>1</sub> was overall higher in winter than summer, on average at  $5.1 \pm 1.7\%$  and  $3.6 \pm 2.3\%$   
188 respectively, with both seasons showing a frequency distribution skewed to higher values up to 10% (Fig. 3 k  
189 and l). Note that in summer the BC mass fraction among clusters had no discernible differences with only C2  
190 showing to be slightly higher. The overall higher BC mass fraction in winter may result from the seasonal  
191 variation on emission structure, that the additional primary emissions from heating activities may have  
192 introduced more fraction of BC (Chow et al., 2011; Liu et al., 2018). However the lowered BC mass fraction  
193 for the polluted PBL in winter (with significant reduction for fraction  $>7\%$ ) may result from the enhanced  
194 secondary formation under polluted environment (Volkamer et al., 2006; Hallquist et al., 2009). The

comparable BC mass fraction between C1 and C3 in summer (but all lower than neutral PBL) may result from the dominant process of enhanced secondary formation (reducing  $PM_{10}$ ) and particle scavenging (reducing BC), for polluted and diluted PBL, respectively. There was a notably higher BC mass fraction at  $6.7 \pm 1.5\%$  for the diluted PBL in winter, suggesting a much reduced secondary aerosols in less-polluted environment, and the removal process of BC had been less efficient than other substances (Koch and Del Genio, 2010).

## 4.2 Particle microphysics of BC

BC core size showed no variation among all PBL types in both seasons. The mass (count) median diameter of BC core is  $203 \pm 12$  nm ( $106 \pm 7$  nm) and  $167 \pm 11$  nm ( $85 \pm 5$  nm) for winter and summer respectively. The BC core size could be used to discern emission sources, such as BC from solid fuel burning tended to have larger MMD compared to those from traffic sources (Liu et al., 2014). The larger MMD in winter than summer was consistent with previous observation over this region (Ding et al., 2019a; Hu et al., 2020), which may indicate additional sources from residential solid fuel burning for heating in cold season.

The coatings relative to BC, as reflected by  $D_p/D_c$ , was positively correlated with the pollution level of the PBL (represented by  $PM_{10}$  mass loading) in winter (Fig. 5a), and in summer from neutral to polluted PBL (Fig. 5b). The polluted PBL in winter had the highest  $D_p/D_c$  ( $1.76 \pm 0.3$ ), in line with the most polluted condition. For both neutral and diluted PBL, winter had higher BC coatings than summer. Apart from some periods in summer, the diluted PBL occasionally showed higher  $D_p/D_c$  up to 1.8, comparable with the high end of that for polluted PBL.

The warmer temperature in summer may have caused a more likely tendency for some semi-volatile particle species to evaporate, hereby reduced coatings on BC than in winter even at the same pollution level, which is consistent with previous ground studies over this region (Liu et al., 2019a). The highest coatings were associated with the most polluted condition, implying that the regional transport of air mass from wider polluted region may have advected both primary emissions and gas-precursors, during when some gas partitioning processes may have occurred on BC during transport and caused the high coatings. Under clean environment, summer showed remarkably higher coatings than winter, which may result from a more intense solar radiation received at the mountain site in summer, where photochemical reactions may have caused significant formation of secondary particulate matter (Xu et al., 2017; Bao et al., 2018; Liu et al., 2019b).

The detailed size distributions of uncoated and coated BC are shown in Fig. 5 c-e. Here three typical examples are chosen to represent the polluted and diluted PBL in winter (case 1 and case 2), and polluted PBL in summer (case 3). Comparing between case 1 and case 2, it showed the polluted period had caused increased size for all particle from peak diameter ( $d$ ) less than  $d=30$  nm to the accumulation mode of  $d=120$  nm. Coated BC diameter peaked from 150 to 220 nm. It means the condensation process had occurred on all particles and enlarged their sizes including BC. The coated BC in most polluted PBL has significantly extended its coated size up to  $d=400-700$  nm. Note that for the clean PBL in winter, the coated BC was populated at  $d=150$  nm, leading to a higher BC number fraction of 22% at this size. For polluted PBL in summer, peaking diameter of all particles ( $d=450$  nm) was lower than winter, and coated BC also peaked at a smaller size ( $d=153$  nm). Fig. S3 shows almost consistent coated BC sizes in summer (120-130 nm), which was smaller than winter because of the smaller core size (though a higher  $D_p/D_c$ ).

Detailed core-size resolved mixing states, expressed in a space of coated versus uncoated BC diameter, are shown in Fig. 5 f-h, corresponding to the three cases above.  $D_p=D_c$  indicates no coatings on BC and coating increases when  $D_p$  is larger than  $D_c$ . For polluted PBL in winter, most BC population lied between 100-200 nm core diameter and 200-300 nm coated diameter, in contrast with the diluted PBL that a significant fraction of uncoated BC and coated diameter at 100-140 nm. Summer polluted PBL showed reduced fraction of bare

BC but a range of coating thickness for coated BC. Such analysis in mapping the size-resolved mixing state of single BC particle on the space of uncoated-coated size, can resolve the optical (contour in Fig. 5f) and hygroscopic (contour in Fig. 5g) properties that BC particle microphysics could influence, which will be discussed next.

### 4.3 Optical properties of BC

Fig. 6 a-b and Fig. S4 show the mass absorption cross section (MAC) of uncoated and coated BC for different PBL types in both seasons. Summer showed systematically higher MAC ( $7.2\pm 0.1 \text{ m}^2\cdot\text{g}^{-1}$ ) than winter ( $6.6\pm 0.3 \text{ m}^2\cdot\text{g}^{-1}$ ) for uncoated BC, because the BC core was smaller in summer than winter (Fig. S2 and Fig. S3). The MAC for coated BC was largely modulated by coatings, showing positive correlation with  $\text{PM}_{10}$  in winter ( $\text{MAC}_{\text{BC,coated}}=0.09\times\text{PM}_{10}+8.7$ ,  $r=0.79$ ) and summer ( $\text{MAC}_{\text{BC,coated}}=0.12\times\text{PM}_{10}+9.5$ ,  $r=0.5$ ), corresponding with the diluted to polluted PBL types. The enhanced absorption efficiency of coated BC with increased pollution level was consistent with previous studies over this region (Zhang et al., 2018; Ding et al., 2019a). The mean  $\text{MAC}_{\text{BC,coated}}$  for polluted PBL in summer ( $11\pm 1 \text{ m}^2\cdot\text{g}^{-1}$ ) was higher than that in winter ( $10.7\pm 0.9 \text{ m}^2\cdot\text{g}^{-1}$ ) by 2%. The neutral and diluted PBL also had higher MAC in summer than winter (by 8% and 22% respectively). **The overall higher absorption efficiency of BC in summer (especially in diluted PBL) was due to the smaller core size, leading to a higher baseline MAC for uncoated BC by 10% than winter. This effect prevailed the even lower coating amount and associated absorption enhancement in summer (Fig. 5b).** Notably, the  $\text{MAC}_{\text{BC}}$  for diluted summer PBL had been enhanced by both reduced BC core size and increased coatings (Fig. 5b) reaching almost equivalent MAC compared to winter neutral PBL. This means at the top of the clean PBL in summer, there was a BC layer with high absorbing capacity (in contrast to winter with much lower MAC), which may efficiently absorb the strong solar radiation.

The single-scattering albedo at  $\lambda=550\text{nm}$  ( $\text{SSA}_{550}$ ) in winter was systematically lower for all PBL types (Fig. 6 c-d and Fig. S4), lowered by 0.06, 0.05 and 0.08 than summer for diluted, neutral and polluted PBL, respectively. The decreased  $\text{SSA}_{550}$  was in line with the increased BC mass fraction (Fig. 3), and also influenced by the absorbing efficiency. Our winter results here were comparable to previous aircraft measurements over Beijing region in cold season of 2016, with  $\text{SSA}$  ranging from 0.8 to 0.98 from clean to heavily polluted period in the PBL (Tian et al., 2020). For the diluted PBL in winter,  $\text{SSA}_{550}$  could reach as low as  $0.86\pm 0.02$  when BC mass fraction reached  $7\pm 1.5\%$  (Fig. 3k). This was within the range of that study in clean period at  $\text{SSA}=0.8-0.85$  in the PBL, and the neutral and polluted PBL were within similar range in transition and fully polluted PBL at  $\text{SSA}=0.85-0.98$ , suggesting the clusters here may represent different development stages of pollution events. The lower  $\text{SSA}$  in winter PBL than summer tended to induce radiative effects towards more positive effect (Hansen et al., 1981; Haywood and Ramaswamy, 1998) at the top of PBL, in particular for the clean winter PBL.

### 4.4 Hygroscopic properties of BC

The droplet activation of BC is determined by the particle size and hygroscopicity, where the coatings play roles in enlarging entire BC size (Dusek et al., 2006a; Dusek et al., 2006b) and increasing its hygroscopicity (Liu et al., 2013). Both factors can be obtained by our observation of size-solved mixing state of BC. The coated BC diameter based on number concentration (coated CMD) is shown in Fig. 7 a, b. The CMD of coated BC in winter polluted PBL was  $0.19\pm 0.05 \mu\text{m}$ , which were the largest among PBL types. Generally, coated BC CMD was in positive correlation with the  $\text{PM}_{10}$ , in winter fitted as  $\text{CMD}=0.003\times\text{PM}_{10}+0.14$  ( $r=0.69$ ) and in summer as  $\text{CMD}=0.001\times\text{PM}_{10}+0.11$  ( $r=0.73$ ). The coated BC CMD in winter PBL was larger than summer by 14 nm, 35 nm and 56 nm for diluted, neutral and polluted PBL, respectively.

283 The hygroscopicity parameter of BC-containing particle ( $\kappa_{BCc}$ ) at the size of CMD is positively correlated  
284 with coating content. In winter  $\kappa_{BCc}$  was at  $0.15\pm 0.02$ ,  $0.20\pm 0.03$  and  $0.24\pm 0.03$  for diluted, neutral and  
285 polluted PBL respectively, while the corresponding values were  $0.19\pm 0.03$ ,  $0.20\pm 0.03$  and  $0.22\pm 0.03$  in  
286 summer, consistent with the reduced  $D_p/D_c$  from polluted PBL to diluted PBL for both seasons.  $\kappa_{BCc}$  could be  
287 fitted as  $\kappa_{BCc}=0.003\times PM_{10}+0.17$  ( $r=0.77$ ) and  $\kappa_{BCc}=0.004\times PM_{10}+0.17$  ( $r=0.49$ ) for winter and summer  
288 respectively. Note that summer diluted PBL had significantly higher  $\kappa$  ( $0.19\pm 0.03$ ) than winter for the same  
289 PBL type.

290 After obtaining the CMD of coated BC and the corresponding  $\kappa_{BCc}$ , a critical water supersaturation (SS) could  
291 be derived from the Köhler model (Fig. S5) for BC at the size of CMD to be activated. By assuming that all  
292 of the population larger than CMD could also be consequently activated (because of the larger particle size  
293 and higher hygroscopicity), the SS obtained above is thus the lower estimate for half of the number population  
294 of BC to be activated, termed as  $SS_{half}$ . In line with the increased coated BC size and particle hygroscopicity,  
295  $SS_{half}$  decreased with increased pollution level, from  $0.21\pm 0.08\%$  to  $0.1\pm 0.03\%$  for winter diluted to polluted  
296 PBL; from  $0.22\pm 0.06\%$  to  $0.17\pm 0.05\%$  for summer. This highlights the lowest possible SS required to activate  
297 BC in polluted winter PBL, and for the same PBL type, summer will need a higher SS, apart from occasionally  
298 some lower  $SS_{half}$  for summer diluted PBL. This potential CCN ability of BC is derived from the physical  
299 properties of BC itself, but the actual activation of BC depends on the ambient supersaturation condition which  
300 is determined by the size distribution of existing droplets and other aerosols competing CCN (Pruppacher et  
301 al., 1998; McFiggans et al., 2005). The results here generally consistent with a previous surface measurement  
302 of BC CCN-activation in urban Nanjing as constrained by size-resolved compositions (Wu et al., 2019), when  
303 an activation fraction of 33% at  $SS=0.1\%$  was found. Previous study using flight measurements over NCP  
304 region (Ding et al., 2019a) found a  $SS=0.08\%$  required to activate half of the BC number in heavy pollution  
305 condition, consistent with the polluted PBL here.

## 307 5. Conclusion

308 By performing continuous measurement on a mountain site located at the top of planetary boundary layer  
309 (PBL) over the north China Plain region in winter and summer, the optical and hygroscopic properties of BC  
310 were investigated. We identified three types of PBL, all persistently influenced by surface anthropogenic  
311 emission on daily basis through daytime convective mixing, but could be either enhanced or diluted subject  
312 to received air masses. By investigating the detailed microphysical properties of BC, this study provides a  
313 clear picture of optical and hygroscopic characteristics of BC at the top of anthropogenically influenced PBL.  
314 Highlighted information includes higher BC mass fractions in winter than summer, corresponding with a lower  
315 single-scattering albedo by 0.05-0.08, especially the lowest for diluted winter PBL ( $0.86\pm 0.02$ ); both mass  
316 absorbing efficiency and CCN ability of BC are positively correlated with the pollution level of PBL, due to  
317 enhanced coating content under more polluted environment, e.g. from diluted to polluted PBL, coating content  
318 increased by 39% (11%), absorbing efficiency increased by 31% (10%), and the water supersaturation in  
319 activating half number of BC decreased by 53% (26%) for winter and summer respectively. It clearly  
320 demonstrates that BC with higher coating content could be efficiently incorporated into liquid clouds, and  
321 meanwhile these BC had high absorbing capacity, which means these highly-absorbing BC may have great  
322 potentials for in-cloud heating (Jacobson, 2012; Nenes and et al., 2002).

323 Compared to surface measurement, the results here are more directly linked to the aerosol properties closer  
324 to the condensation level which is subsequently CCN-activated. BC located at this layer more importantly  
325 determines its heating impacts due to receiving a stronger solar radiation. Rather than being subject to  
326 significant scavenging processes of low-level emissions, BC transported to the lower free troposphere may be  
327 transported to a wider region (Weinzierl, 2008; Yang et al., 2018b; Govardhan et al., 2017), exerting regional

328 direct and indirect radiative impacts.

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333 There are no potential conflicts of interest.

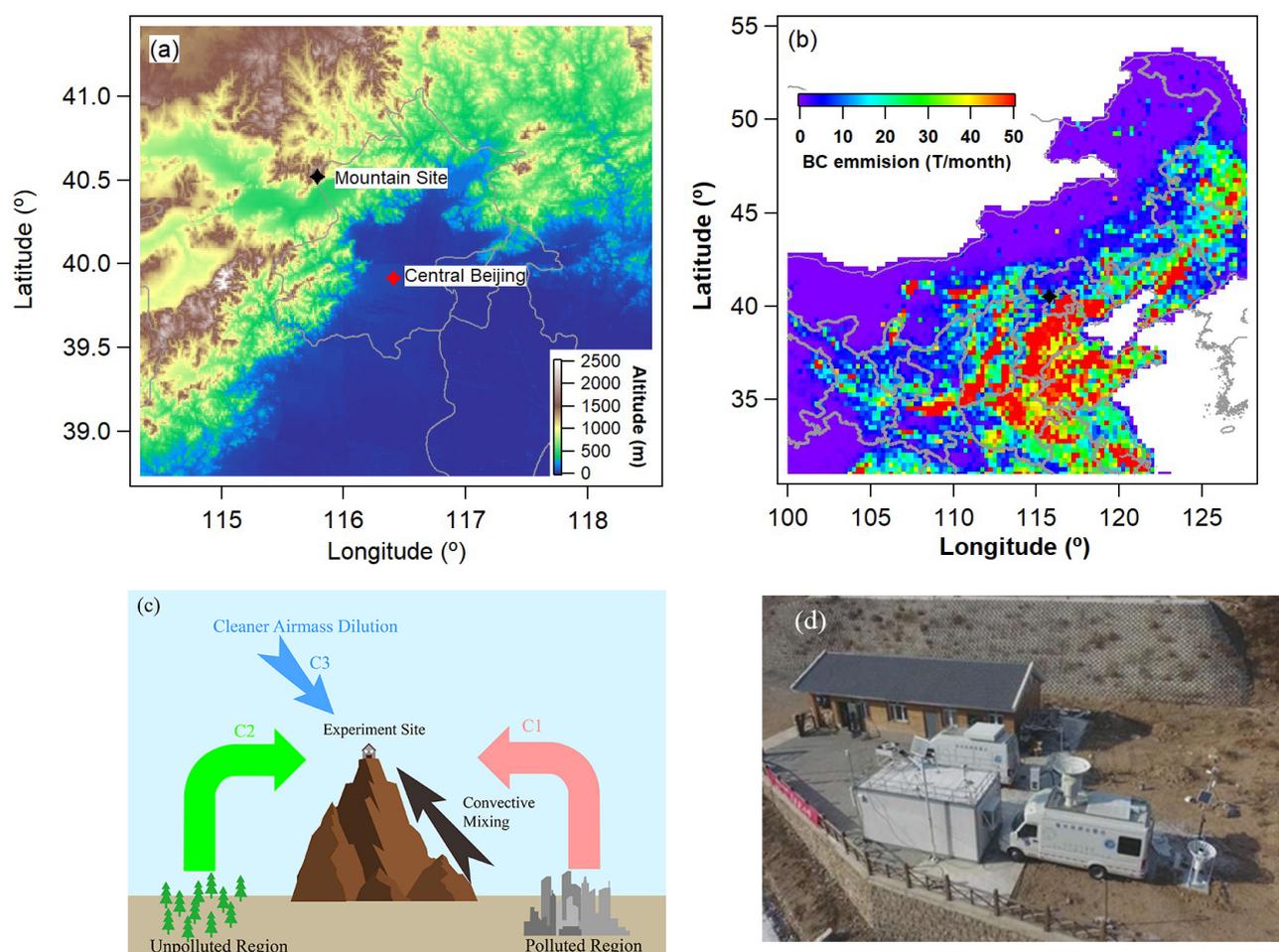
334 The data in this study are available from the corresponding author upon request  
335 (dantongliu@zju.edu.cn).

### 336 **Author Contributions**

337 DL, DZ and DD led and designed the study. SD, DL, DZ, KH, PT, RL, YC, FW, HH, and MH set up and  
338 conducted the experiment. SD, DL and KH contributed to the data analysis. SD, DL wrote the paper.

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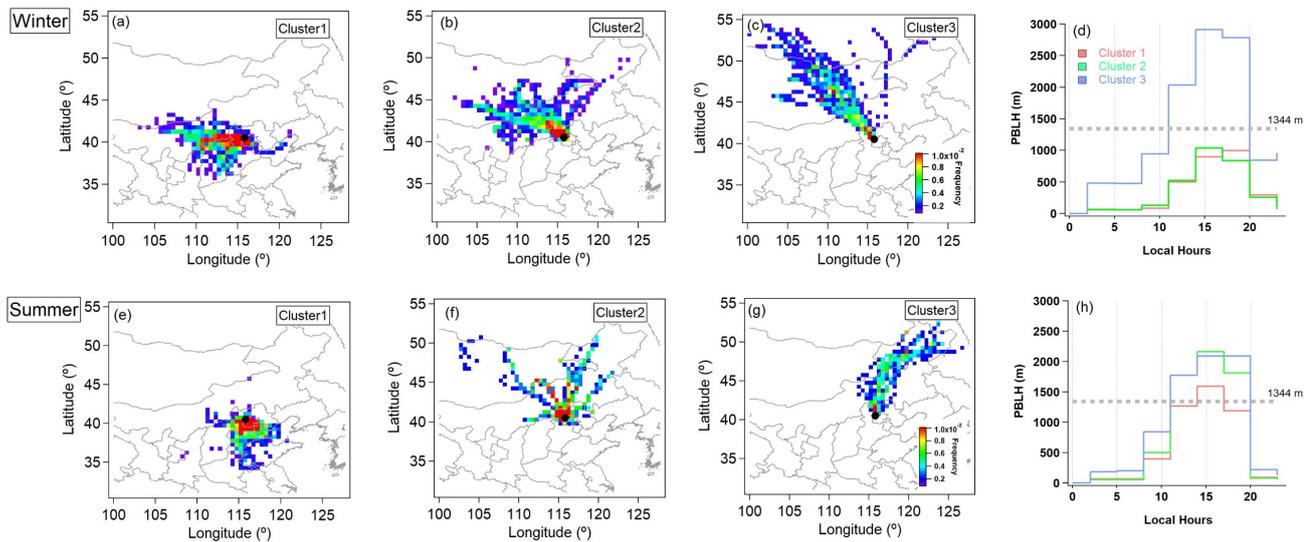
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343 Fig. 1. Experimental site descriptions. (a) The location of the experimental site and central Beijing, marked with  
 344 black and red star respectively, where the color bar denotes the terrain height. (b) the monthly BC emission  
 345 inventory in China (Li et al., 2017). (c) Schematic illustration for different types of PBL defined in this study.  
 346 **(d) Photo of the mountain station.**

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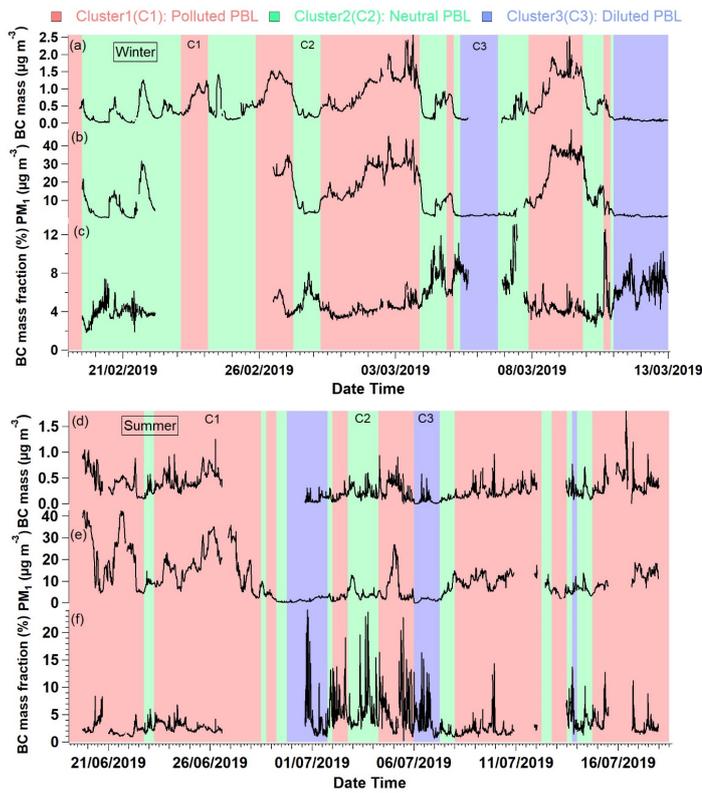
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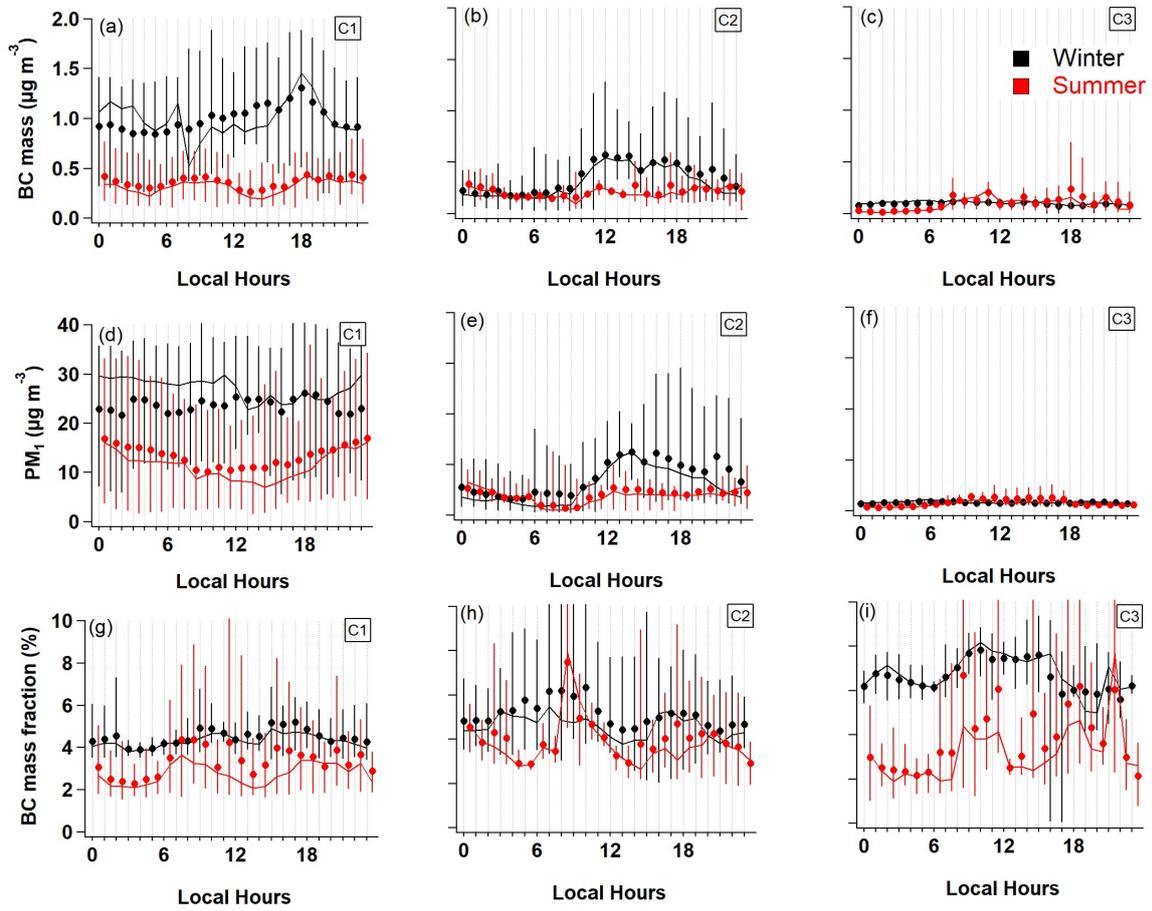
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Fig. 2. The clustered backward trajectories from HYSPLIT model in both seasons: (a)-(c) for winter and (e)-(g) for summer, colored by occurrence frequency in each geographic grid. (d) and (h) are the diurnal variation of the height of PBL for the three clusters in both seasons, with the dashed line denoting the mountain site altitude.



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357 Fig. 3. Time series of BC mass (a)(d), **PM<sub>1</sub> derived from the SMPS size distribution** (b)(e), BC mass fraction  
 358 (c)(f) at both seasons, shaded by the periods in identified three clusters, by red, green and blue corresponding  
 359 to cluster 1 (C1), cluster 2 (C2), cluster 3 (C3) respectively. Frequency histograms of BC mass (g)(h), PM<sub>1</sub>  
 360 (i)(j), and BC mass fraction (k)(l) for each cluster in both seasons.



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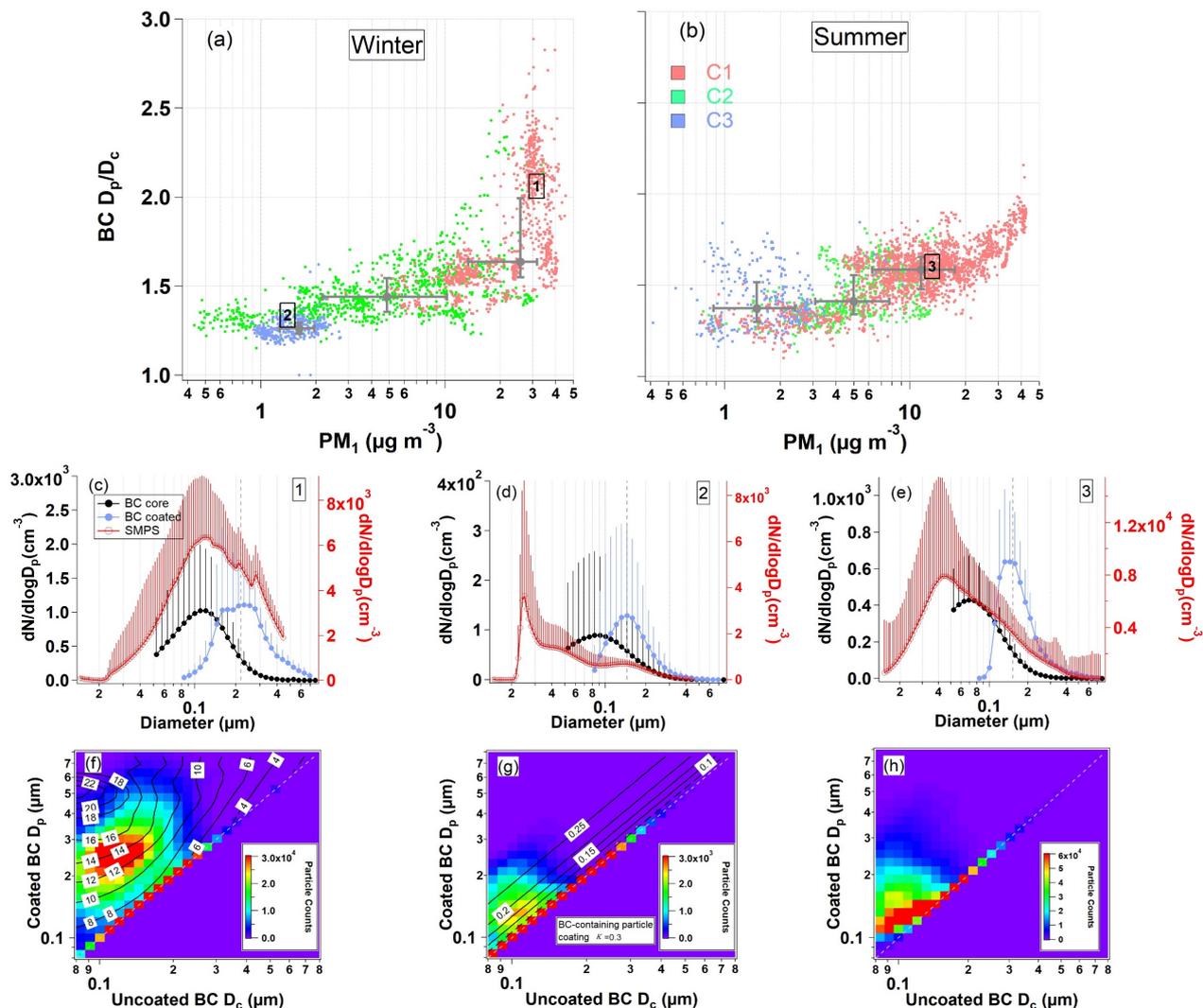
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Fig. 4. Diurnal variation of BC mass (a-c),  $PM_{10}$  (d-f) and BC mass fraction (g-i) for the three PBL types in both seasons, where black and red denote the winter and summer respectively. The solid circles, lines and whiskers denote the mean, median, 25<sup>th</sup>, 75<sup>th</sup> percentile respectively.



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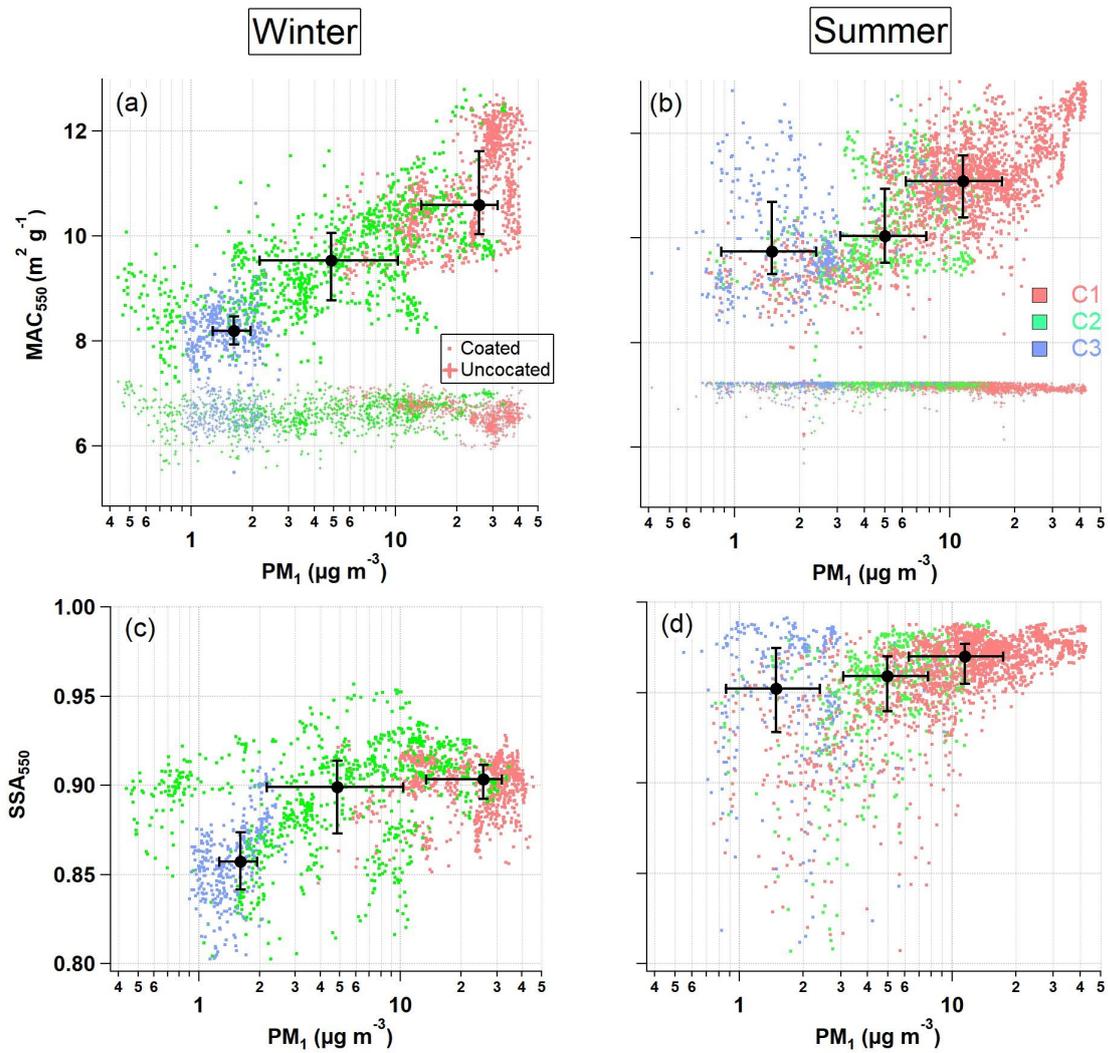
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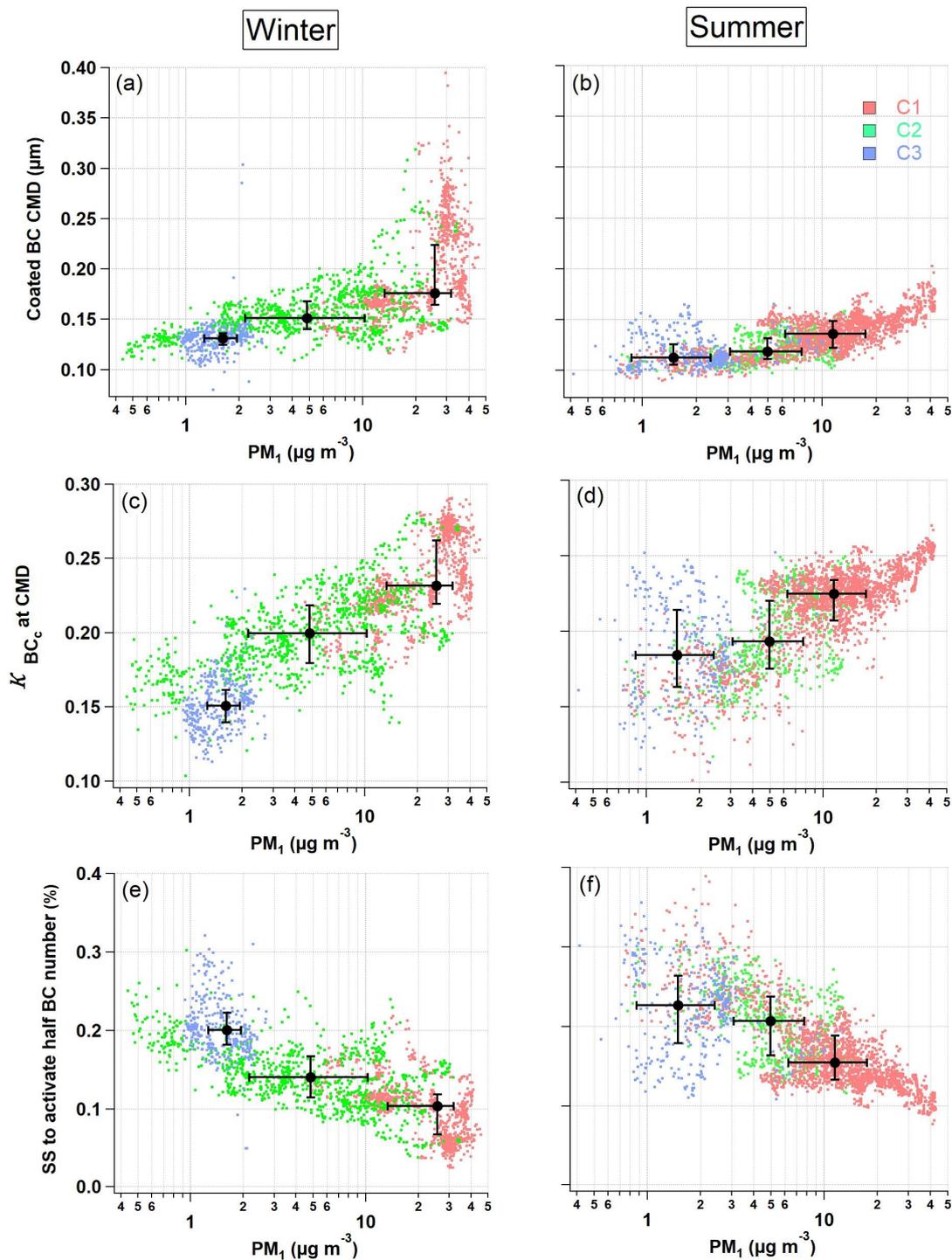
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Fig. 5. Size-resolved mixing state of BC. The bulk relative coating thickness ( $D_p/D_c$ ) as a function of  $PM_{10}$  in winter (a) and summer (b) for the three PBL types, with solid circles, whiskers denoting the median, 25<sup>th</sup>, 75<sup>th</sup> percentiles respectively. Three typical periods, as marked as 1-3 in (a) and (b), are extracted for size distribution analysis. (c),(d) and (e) are the corresponding number size distribution of all particles, uncoated and coated BC for period 1-3 respectively. The bottom panels are coated BC diameter as a function of uncoated BC diameter, colored by number density of single particle, where (f) and (g) are mapped with contour lines numbered by the MAC and  $\kappa_{BCc}$  respectively.



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Fig. 6. Optical properties of BC for the three PBL types in both seasons. (a)(b) are mass absorption cross section at  $\lambda=550$  nm ( $MAC_{550}$ ), with dot and plus markers denoting coated and uncoated BC respectively. (c)(d) are single-scattering albedo at  $\lambda=550$  nm ( $SSA_{550}$ ). In each panel, the solid circles and whiskers denote the median, 25<sup>th</sup> and 75<sup>th</sup> percentile respectively.



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Fig. 7. Hygroscopic properties of BC for the three PBL types in both seasons. (a)(b) are the count median diameter of coated BC; (c)(d) are the  $\kappa_{BCc}$  assuming  $\kappa_{coating}=0.3$ ; (e)(f) are the supersaturation (SS) to activate half of the BC number population. In each panel, the solid circles and whiskers denote the median, 25<sup>th</sup> and 75<sup>th</sup> percentile respectively.

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