

# A study of the morphology and effective density of externally mixed black carbon aerosols in ambient air using a size-resolved single-particle soot photometer (SP2)

Yunfei Wu<sup>1\*</sup>, Yunjie Xia<sup>1, 2</sup>, Rujin Huang<sup>3</sup>, Zhaoze Deng<sup>4</sup>, Ping Tian<sup>5</sup>, Xiangao Xia<sup>4</sup>,  
Renjian Zhang<sup>1\*</sup>

<sup>1</sup> Key Laboratory of Regional Climate-Environment for Temperate East Asia (RCE-TEA), Institute of  
Atmospheric Physics, Chinese Academy of Sciences, Beijing 100029, China

<sup>2</sup> University of Chinese Academy of Sciences, Beijing, 100049, China

<sup>3</sup> Key Laboratory of Aerosol Chemistry and Physics, State Key Laboratory of Loess and Quaternary Geology,  
Institute of Earth and Environment, Chinese Academy of Sciences, Xi'an 710061, China

<sup>4</sup> Key Laboratory of Middle Atmosphere and Global Environment Observation (LAGEO), Institute of  
Atmospheric Physics, Chinese Academy of Sciences, Beijing 100029, China

<sup>5</sup> Beijing Weather Modification Office, Beijing 100089, China

*Correspondence to:* Yunfei Wu (wuyf@mail.iap.ac.cn) and Renjian Zhang (zrj@mail.iap.ac.cn)

## Abstract

The morphology and effective density of externally mixed black carbon (*extBC*) aerosols, important factors affecting the radiative forcing of black carbon, were studied by using a tandem technique coupling a differential mobility analyzer (DMA) with a single-particle soot photometer (SP2). The study extended the mass-mobility relationship to large *extBC* particles with a mobility diameter ( $d_{\text{mob}}$ ) larger than 350 nm, a size range was seldom included in previous tandem measurements of BC aggregates in the atmosphere. The experiment was conducted at an urban site in Beijing during a 19-day winter period from 23 January to 10 February 2018. Ambient dry particles were selected by the DMA, and the size-resolved *extBC* particles were distinguished from particles with a thick coating (internally mixed) according to the time delay between the incandescence signal peak and the scattering peak detected by the SP2. The masses of the *extBC* particles were then quantified. The time differences between the DMA

size selection and the SP2 measurement were processed previously. The normalized number size distributions were investigated at the prescribed  $d_{\text{mob}}$  sizes in the range of 140–750 nm to provide the typical mass of *ext*BC at each  $d_{\text{mob}}$ . On this basis, the mass-mobility relationship of the ambient *ext*BC was established, inferring a mass-mobility scaling exponent ( $D_{\text{fm}}$ ) (an important quantity for characterizing the morphology of fractal-like BC aggregates) with a value of  $2.34 \pm 0.03$  in the mobility range investigated in this study. This value is comparable with those of diesel exhaust particles, implying a predominant contribution of vehicle emissions to the ambient *ext*BC in urban Beijing. Compared to the clean period, a higher  $D_{\text{fm}}$  value was observed in the polluted episode, indicating a more compact BC aggregate structure than that in the clean period. The effective densities ( $\rho_{\text{eff}}$ ) of the *ext*BC in the same  $d_{\text{mob}}$  range were also derived, with values gradually decreasing from  $0.46 \text{ g cm}^{-3}$  at 140 nm mobility to  $0.14 \text{ g cm}^{-3}$  at 750 nm mobility. The  $\rho_{\text{eff}}$  values were slightly lower than those measured using the DMA-aerosol particle mass analyzer (APM) system. The difference in  $\rho_{\text{eff}}$  values was likely due to the lower BC masses determined by the SP2 compared to those measured by the APM at the same mobility, since the SP2 measured the refractory BC (rBC) mass instead of the total mass of the BC aggregate, which consists of both rBC and a possible fraction of nonrefractory components measured by the APM. Higher  $\rho_{\text{eff}}$  values were observed in the 280–350 nm  $d_{\text{mob}}$  range, and were much closer to the values for soot aggregates reported in the literature. The higher  $\rho_{\text{eff}}$  values might be related to the more compact structure of BC aggregates in this range, resulting from the reconstruction effect by volatile and/or semivolatile components in the atmosphere. The reconstruction effect might also result in a hiatus in the increased dynamic shape factor in the range of 200–350 nm which generally increased from 2.16 to 2.93 in the 140–750 nm  $d_{\text{mob}}$  range.

## 1 Introduction

Black carbon (BC), a byproduct of incomplete combustion, is the main light-absorbing component in atmospheric aerosols. BC can lead to positive radiative forcing only second to  $\text{CO}_2$  and thus warming of the earth's atmosphere (IPCC, 2013). However, there remains a large amount of uncertainty regarding the radiative forcing induced by

BC due to its complexity and variability in morphology, mixing state and hygroscopicity. Freshly emitted BC particles usually exhibit as fractal-like aggregates made up of a number of primary carbon spherules (Park et al., 2004; Sorensen, 2011), which are generally hydrophobic. The condensation of organic and/or inorganic components leads to the collapse of the fractal-like aggregates and, in turn, a compact structure of BC particles (Slowik et al., 2007; Zhang et al., 2008). Changes in the morphology of BC particles affect their optical properties. Encasement by organic and/or inorganic coatings also increases the absorption of BC particles through the lensing effect (Shiraiwa et al., 2010; Peng et al., 2016). In addition, water-soluble coatings increase the hydrophilic ability of the BC particles (Zhang et al., 2008; McMeeking et al., 2011), indirectly affecting the radiative forcing by affecting the cloud processes.

Laboratory studies indicate that freshly emitted BC particles can be thickly coated within a few hours in the atmosphere (Pagels et al., 2009; Peng et al., 2016). Thus, many studies have focused on the optical properties and radiative forcing of thickly-coated BC particles (Jacobson, 2001; Khalizov et al., 2009; Liu et al., 2017). However, *in situ* measurements have shown that a great number of uncoated and/or thinly-coated BC particles exist in the ambient atmosphere, with a fraction even higher than that of the aged BC particles (Schwarz et al., 2008). In general, thickly-coated BC particles account for <50% of the BC-containing particles in urban areas based on single-particle soot photometer (SP2) measurements (Huang et al., 2012; Wang et al., 2014; Wu et al., 2016). The existence of a large fraction of uncoated and/or thinly-coated BC particles is likely due to continuous emission from combustion processes such as vehicle exhaust (Wang et al., 2017). Therefore, studies on the radiative forcing of BC particles without thick coatings are also essential, especially in urban areas. First, the morphologies and sizes of these quasi-bare BC particles, which are the essential quantities for calculating the optical properties of BC particles in numerical models, should be investigated (Scarnato et al., 2013; Bi et al., 2013).

The morphology of fractal-like BC aggregates is generally characterized by a quantity called ‘fractal dimension’ ( $D_f$ ), which has been well documented in the review literature

(Sorensen, 2011). The ideal diffusion-limited cluster aggregation (DLCA), to which the BC aggregates belong, has a  $D_f$  value of  $1.78 \pm 0.1$ . Recent studies have also reported a similar  $D_f$  value of  $\sim 1.82$  for bare-like soot particles by using transmission electron microscopy (TEM) analysis of aerosol samples collected in four different environments (Wang et al., 2017). A significant increase in the  $D_f$  was observed when the soot particles were partly coated or embedded. In the past two decades, the morphologies of the BC aggregates were also widely studied by using tandem mobility techniques (Park et al., 2008). Measurements obtained by using an impactor (e.g., the electrical low-pressure impactor (ELPI)) or a particle mass analyzer (e.g., the aerosol particle mass analyzer (APM), the centrifugal particle mass analyzer (CPMA)) connected in tandem with a differential mobility analyzer (DMA) revealed the relationship between particle mass and mobility (Park et al., 2003; Maricq and Xu, 2004; Olfert et al., 2007; Rissler et al., 2014; Sorensen, 2011; and associated references therein). The derived mass-mobility scaling exponents ( $D_{fm}$ ) which were also called ‘fractal dimensions’ in some of these references varied in a wide range of 2.2–2.8 for diesel exhaust particles. These values were inherently higher than the virtual  $D_f$  due to the improper interpretation of mobility measurements, which was demonstrated in detail in Sorensen (2011). The  $D_f$  of diesel particles obtained using TEM is  $\sim 1.75$ , corresponding to a large  $D_{fm}$  value of  $\sim 2.35$  obtained from the mass-mobility relationship (Park et al., 2004). The mobility size-dependent effective densities ( $\rho_{eff}$ ) of BC aggregates were also determined from the DMA-ELPI or DMA-APM (or CPMA) measurements which were difficult to characterize using the TEM techniques.

The previous tandem measurements generally provided the mass-mobility relationship of particles with a mobility diameter ( $d_{mob}$ ) not exceeding 350 nm due to the system detect limit (Park et al., 2003; Maricq and Xu, 2004; Olfert et al., 2007; Rissler et al., 2014). A condensation particle counter (CPC) is connected next to the DMA-APM system to measure the number concentrations of mobility size-selected particles at various APM voltages. The voltage is proportional to the particle mass, and the voltage resulting in the maximum concentration is considered the typical voltage, in turn, of the mass of particles with a prescribed mobility size. Because the larger particles (e.g.,

$d_{\text{mob}} > 350$  nm) are less abundant in the atmosphere than the smaller particles, larger uncertainties exist in the DMA-APM-CPC measurements for these larger particles (Geller et al., 2006). The applicability of the mass-mobility relationship established on the basis of tandem measurements of smaller mobility diameters (e.g.,  $d_{\text{mob}} < 350$  nm) to larger particles (e.g.,  $d_{\text{mob}} > 350$  nm) is insufficient.

The SP2 was developed on the basis of the laser-induced incandescence technique and provides an advantage to the study of individual BC particle properties, including mass, size and mixing state. The SP2 determines the refractory BC (rBC) mass from particle to particle, thus providing the masses of BC aggregates throughout a wide size range (70–500 nm mass-equivalent diameter claimed by the manufacturer) with high sensitivity and accuracy (Schwarz et al., 2006). Recently, a tandem system consisting of an SP2 connected next to a DMA was developed to study the properties of size-resolved BC aerosols in the atmosphere. The mass distributions and mixing states of the size-selected BC were investigated in northern India by using a DMA-SP2 tandem system (Raatikainen et al., 2017). Coupling an SP2 with a volatility tandem DMA (VTDMA), rBC core size distributions of internally mixed BC and those measured by the VTDMA were compared at the prescribed mobility size ranges. Subsequently, the morphology and effective density of the internally mixed BC particles were studied (Zhang et al., 2016). The hygroscopic properties of BC particles were studied by using a hygroscopicity tandem DMA (HTDMA)-SP2 coupling system (McMeeking et al., 2011; Liu et al., 2013). Few studies have been performed on the morphology and effective density of fractal-like BC aggregates uncoated by other components using the DMA-SP2 measurement, especially in the ambient atmosphere.

Using the DMA-SP2/CPC system, Gysel et al. (2012) revealed that the SP2 was unable to reliably detect BC particles from a PALAS spark discharge soot generator due to the lower detection limit of the SP2 for loosely packed agglomerates made up of small primary spherules (~5–10 nm in diameter). However, they also claimed that a well-aligned SP2 was expected to have a detection efficiency adequate to measure the BC aggregates (e.g., diesel exhaust soot) in the atmosphere because these BC aggregates have larger primary spherules and substantially higher effective densities than the

agglomerates made up of small primary spherules. Therefore, in this study, a DMA-SP2 tandem system was built to examine the mass-mobility relationship (from which the morphology and effective density were further derived) of uncoated BC aggregates, especially in the large particle size range (e.g.,  $d_{\text{mob}} > 350$  nm) which was seldom included in previous tandem measurements. Moreover, the uncoated BC aggregates were distinguished from the thickly-coated BC particles by using the SP2, allowing the study on the mass-mobility relationship of ambient BC aggregates in different atmospheric environments. Previous DMA-ELPI or APM tandem measurements were mainly conducted in the laboratory or in the source environments (e.g., in the tunnel) where fresh BC aggregates were predominant.

Beijing, the capital of China, has suffered from severe air pollution issues in recent years. Studies have revealed that emissions from coal combustion and/or biomass burning for industry activities and residential heating have played a predominate role in the particulate pollution in Beijing, especially in the polluted episodes (Zhang et al., 2013; Huang et al., 2014; Wu et al., 2017; Ma et al., 2017a,b). Thus, the variation in the mass-mobility relationship of uncoated BC aggregates was also compared for a polluted episode and a clean episode to examine the possible influence of source change on the morphology of these BC aggregates. In addition, a better mobility size resolution (33 logarithmic size bins from 20 to 750 nm) was set for our DMA-SP2 system than that used in previous similar studies in which only a few mobility diameters in the range of ~150–350 nm were selected (Zhang et al., 2016; Liu et al., 2013; McMeeking et al., 2011). Similar to the study presented in Raatikainen et al. (2017), the high size resolution provides an advantage for calculating the BC mass and number size distribution in the polluted region in our future studies.

## **2 Measurements**

### **2.1 Experimental setup**

A tandem system comprises a size selection unit and a measurement section was built and deployed in an ambient experiment that was conducted on the roof of a building (approximately 8 m above the ground) on the campus of the Institute of Atmospheric

Physics, Chinese Academy of Sciences (IAP, CAS) during the winter from 23 January to 10 February 2018 (19 days in total). The site is located in an urban area of Beijing; it is a few hundred meters away from two main roads and thus may be significantly affected by vehicle emissions. More information about the measurement site is described in previous studies (e.g., Wu et al., 2016, 2017).

As shown in Fig. 1, polydisperse aerosols in the sample air were drawn through the size selection unit (a model 3087 neutralizer, a model 3080 classifier and a model 3081 DMA, TSI Inc., Shoreview, MN, USA) to generate quasi-monodisperse particles with a certain electrical  $d_{\text{mob}}$ . Before entering the system, the ambient air was dried prior to passing through a 12-inch-long Nafion dryer (model MD-700-12F-3, Perma Pure LLC, Toms River, NJ, USA). A vacuum pump was used to draw the dry sheath air (e.g., particle-free indoor air) opposite to the flow direction of the sample air to provide an appropriate vacuum degree required for the dryer. The size-selected particles were delivered to the measurement section for analysis by various methods, including an SP2 (Droplet Measurement Technologies, Boulder, CO, USA), a CPC (model 3776, TSI Inc., Shoreview, MN, USA) and two microaethalometers (model AE51, AethLabs, San Francisco, CA, USA). The operational flow rates were set to 0.1, 0.3 and 0.15 LPM (STP) for the SP2, CPC and two AE51s, respectively. The sheath flow rate was set to 3 LPM, resulting in a ratio of sheath-to-sample flow rate of 4.3:1 for the DMA. Particles in the range of 15–750 nm in mobility diameter could be selected. The flow rate for each instrument was calibrated using a soap film flowmeter (model Gilian Gilibrator-2, Sensidyne, Petersburg, FL, USA) before the experiment to ensure the accuracy of the selected particle sizes and measurements. The scientific purpose of this experimental setup was to study the mixing states of size-selected BC particles, the mass and number size distribution of BC, as well as the morphology and effective density of the uncoated BC aggregates that are discussed in the current study. Since only the DMA and SP2 were involved in the measurements presented in this study, the setting and operation of the two instruments were described and discussed in detail.

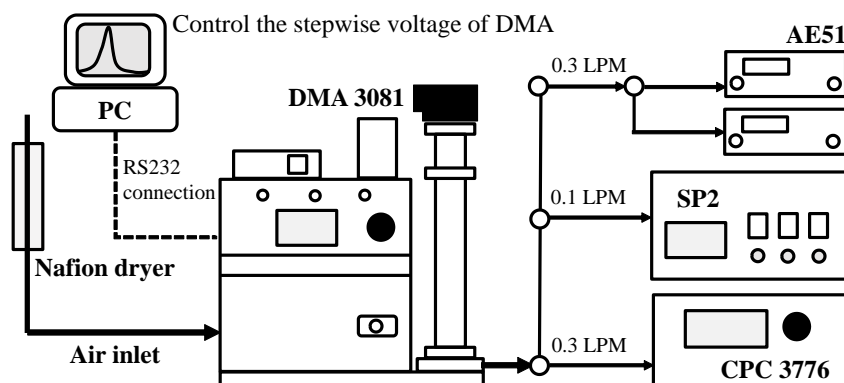


Fig. 1 Schematic of the experimental setup for size-resolved measurements of black carbon.

## 2.2 Particle size selection

The DMA was connected to an external computer on which a program was run to control the voltage of the DMA, i.e., the particle mobility diameter ( $d_{mob}$ ). Thirty-three mobility diameters were set in the program to cyclically control the particles selected by the DMA and gradually increased from 20 nm to 750 nm at the logarithmic scale. Stepwise size selection was repeated until the operator stopped the program. A short cycle with each of the 33 diameters lasting for 18 s and a long cycle with each size lasting for 36 s were set to alternately operate in this experiment (Fig. S1 in the supplemental file). The purpose of this setting was to identify the time difference between the size selection and the subsequent measurement, as described in the following sections.

## 2.3 Black carbon measurement

The individual particulate rBC mass was measured by the SP2 according to the laser-induced incandescence signal when the particle passed through the intense Nd:YAG intracavity continuous laser beam (Schwardz et al., 2006) with a Gaussian distribution. The rBC mass in the SP2 detection range ( $\sim 0.3$ –250 fg in this study, dependent on the laser intensity of a specific instrument) is proportional to the peak of the incandescence signal independent of the mixing state of the BC particles. If a BC particle is coated with nonrefractory components, the coating will evaporate before the rBC core



incandescence, leading to a time lag between the peaks of incandescence and scattering signals that are synchronously detected by the SP2 (Moteki and Kondo, 2007). According to the frequency distribution of the time lag, there was a significant distinction between thickly-coated (i.e., internally mixed) BC particles (*intBC*) and thinly-coated or uncoated (i.e., externally mixed) BC particles (*extBC*) (Fig. S2) with a minimum frequency at  $\sim 2$   $\mu$ s. BC-containing particles with delay times shorter than 2  $\mu$ s were identified as *extBC*. The delay time threshold might vary slightly from one SP2 to another, e.g., Zhang et al. (2016) reported a short time lag of 1.6  $\mu$ s. However, the delay time threshold should be constant for a given instrument. In previous measurements using the same SP2 employed in this study, the critical delay time was maintained at 2  $\mu$ s regardless of the ambient conditions, such as the pollution level (Wu et al., 2016, 2017). A fraction of BC-containing particles with thin or even moderate coatings might also be recognized as *extBC* using the time-delay approach (Laborde et al., 2012). The effects of these thinly or even moderately coated BC particles will be discussed in Section 3.2 by reducing the delay time threshold from 2  $\mu$ s to 1.2  $\mu$ s and 0.4  $\mu$ s, respectively.

The scattering signal of a single particle synchronously detected by the SP2 can be used to estimate the optical size of the particle. The mixing state of a BC-containing particle can be deduced by comparing the optical size of the particle and the mass-equivalent size of the rBC core. Since the nonrefractory coating of a BC-containing particle is evaporated due to the light absorption and heating of the rBC core when it passes through the laser beam, the scattering cross-section of this particle, which is proportional to the scattering intensity at a given incident light intensity, is gradually decreased. To estimate the initial optical size of this particle, an approach called leading-edge-only (LEO) fitting was developed (Gao et al., 2007). A small fraction of the measured scattering signal at its initial stage before the particle is perturbed by the laser is employed in the LEO fitting to reconstruct the expected scattering distribution of the initial particle. In this method, the location of the leading edge in the beam is also required, which is determined from a two-element avalanche photodiode (APD) signal. Unfortunately, the notch in the two-element APD of our SP2 failed to fix in an adequate

position (e.g., before the peak location of the laser beam) in this experiment. Thus, the optical size and the consequent coating thickness of the BC-containing particle cannot be estimated. However, the coating thickness is not a crucial quantity in our current study on the morphology and density of uncoated BC aggregates. The coating thickness can provide a validation of our discrimination of *ext*BC but should have little influence on our final analysis and the discussion presented in the following sections.

Before the experiment, the incandescence signal was calibrated using DMA-selected monodisperse Aquadag particles. The effective densities of the mobility size-selected Aquadag particles were referred to the polynomial equation as a function of the  $d_{\text{mob}}$  reported in Gysel et al. (2011). The incandescence signal is more sensitive to the Aquadag particles than to the ambient BC particles, i.e., the Aquadag particle induces a higher incandescence signal peak (by a factor of ~25%) than fullerene soot or an ambient BC particle with the same mass (Laborde et al., 2012). Thus, the peak intensity of the incandescence signal was reduced by a factor of 25% when calculating the calibration coefficient. The same calibration was performed again after the experiment. The calibration factors varied little (<3%), indicating the stability of the SP2 measurement during the entire experiment (Fig. S3). The uncertainty in the individual rBC mass determination is estimated to be ~10% due to the uncertainties in the rBC mass calibration and the effective density of the calibration material. An additional uncertainty may also arise in the determination of *ext*BC masses when the time-delay approach is used to distinguish the mixing state of BC particles. The uncertainty will be further discussed in Section 3.2.

### **3 Data processing**

#### **3.1 Identifying the time difference between the size selection and the SP2 measurement**

There exists a considerable difference between the time recorded by the size selection program and that recorded by the SP2, due to the time cost of the particles transmitting from the DMA to the SP2, as well as the system clock difference between the computer on which the size selection program runs and that for the SP2 data acquisition. As

shown in Fig. S1, the SP2 measurement occurs significantly later than the size selection. We develop two methods to identify the time difference. The first method is to find the time difference between the local peak in the particle number concentration (including both scattering and incandescence) detected by the SP2 and the beginning of the corresponding size selection cycle. During the experiment, stepwise size selection was cyclically performed to produce quasi-monodisperse particles with sizes gradually increasing from 20 nm to 750 nm. Thus, at the beginning of each new cycle, the voltage of the DMA should first drop drastically from a high value to a low one to make the particle size decrease from 750 nm to 20 nm. As a result, some particles with sizes in the SP2 efficiently detectable range (~100–500 nm) are measured during the descent period, producing a local peak in the number concentration. Since it takes only a few seconds for the descent, identifying the occurrence time of the local peak position in the SP2 clock and the beginning time of the size selection in the external computer clock will provide the time difference of each cycle.

The other method is to check the consistency of the number and/or mass size distributions between the short-duration cycle and long-duration cycle. Although the durations of each size in the short cycle and long cycle are different (18 s vs. 36 s), the time difference between the size selection and the measurement should be uniform for adjacent short and long cycles. Setting an initial time difference and calculating the mean number and/or mass concentration of each particle size, the number and/or mass size distributions are obtained. Then, the correlation coefficients between the size distributions during short and long cycles are calculated. Changing the time difference gradually, we can obtain a set of correlation coefficients as functions of the time differences. The time difference resulting in the maximum correlation coefficient is considered the difference between the size selection and the measurement.

Since the detection efficiency of the SP2 decreases dramatically in the small particle range (Fig. S4), the size distributions of the SP2-detected particles are inadequate for further calculation of the correlation coefficients. Therefore, the former method was employed in current study to identify the time difference between the size selection and the SP2 measurement. The latter method will be used to examine the time difference

between the size selection and the AE51/CPC measurements in our future study on the number and mass size distributions of BC.

### 3.2 Determination of the typical masses of *ext*BC at prescribed mobility sizes

Particles in a certain size range are selected by the DMA instead of absolutely monodisperse particles at a given mobility size due to the effect of the transfer function. In addition, larger particles with multiple charges are also selected. The frequency and number size distributions of *ext*BC as a function of the mass-equivalent diameter of rBC ( $d_{me}$ ) at different mobility sizes are presented in Fig. S5 and S6, respectively. Note that the number size distribution has been normalized by the peak value of the corresponding distribution. Since the frequency and number size distributions of *ext*BC are quite insufficient at small particle sizes ( $d_{me} < 70$  nm) due to the low detection efficiency of the SP2 (Fig. S4), only the distributions with a  $d_{mob}$  larger than 140 nm are presented. In our following study, we mainly address the morphology and effective density of *ext*BC in the 140–750 nm  $d_{mob}$  range. The normalized number size distributions at five representative  $d_{mob}$  (e.g., 140, 225, 350, 500, 750 nm) are also shown in Fig. 2. The *ext*BC particles having a considerable  $d_{me}$  range were observed for a certain  $d_{mob}$ , indicating a wide transfer function of the DMA due to the relatively low ratio of sheath-to-sample flow (4.3:1). Multicharged particles also affected the size distribution, especially in the  $d_{mob}$  range of 100–400 nm (Ning et al., 2013). As shown in Fig. S6 and Fig. 2, a minor peak is obviously observed at the right tail of the major peak at each size distribution with a  $d_{mob} < 350$  nm.

As mentioned above, a fraction of thinly and/or moderately coated BC particles might also be recognized as *ext*BC according to the time delay between the SP2 incandescence and scattering signal peaks. These particles also have impacts on the size distribution of *ext*BC at a given mobility size. A thinly-coated BC particle can be expected to have a larger mass than a bare BC with the same mobility due to the restructuring of the thinly coated BC particle by coating materials. These thinly coated BC particles will increase the size distribution at their right tail when mixed with the effect of multicharged particles. It is difficult or even impossible to separate the effects of the

thinly coated and multicharged particles based on the size distribution of *extBC* at the current stage. To examine the possible effect of these thinly coated particles, we tightened the criterion of the delay time for the discrimination of *extBC*, gradually decreasing from  $<2.0\ \mu\text{s}$  to  $<1.2\ \mu\text{s}$  and  $<0.4\ \mu\text{s}$ . As shown in Fig. S5 and S6, a decrease in the delay time threshold results in a significant reduction in the data volume used in the analysis but has few effects on the major peak location of the distribution, which is used as the typical  $d_{\text{me}}$  of *extBC* at a given mobility size. The typical  $d_{\text{me}}$  values, determined as the mode values of the lognormal function that are employed to fit the major peak of the size distribution at a certain mobility size, vary little with the delay time thresholds (Table S1). The maximum discrepancy in the  $d_{\text{me}}$  is  $<3\%$  throughout the prescribed mobility size range in this study (140–750 nm). The delay time threshold-caused change mainly appears at the right tail of the normalized number size distribution. Reducing the delay time threshold to  $0.4\ \mu\text{s}$  results in a significant decrease in the fraction of particles with a large  $d_{\text{me}}$  compared to the  $2.0\ \mu\text{s}$  and  $1.2\ \mu\text{s}$  thresholds (Fig. S6). These large particles are likely attributed to thinly and/or even moderately coated BC particles whose structures are relatively more compact than the absolutely bare BC particles. Therefore, we propose that thinly and/or even moderately coated BC and multicharged particles should both have effects on the size distribution of *extBC*, mainly at its right tail, while having little influence on the typical  $d_{\text{me}}$  that is considered as the peak  $d_{\text{me}}$  of the distribution at a given mobility size. The uncertainty in the typical  $d_{\text{me}}$  due to the time-delay approach that was utilized to distinguish the *extBC* is approximately 3% at a given  $d_{\text{mob}}$ , which is in turn  $\sim 10\%$  in the corresponding mass of *extBC*. Combining the uncertainty in the rBC mass determined by the SP2 ( $\sim 10\%$ ), the total uncertainty in the determined mass of *extBC* should be  $\sim 20\%$  in the studied mobility range of 140–700 nm. For the adequate data volume used in the analysis, the results and discussion presented in the following sections are based on the database of *extBC* discriminated as BC-containing particles with delay times lower than  $2.0\ \mu\text{s}$ , unless otherwise specified.

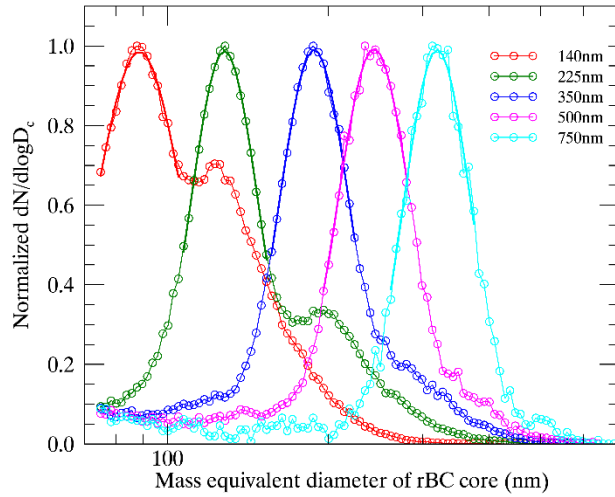


Fig. 2 Campaign average number size distribution of the mass-equivalent diameter of the rBC core of *extBC* normalized by the peak value at five represented mobility diameters (140, 225, 350, 500 and 750 nm) selected by the DMA. Lognormal fitting is performed for the major peak of each distribution.

### 3.3 Theoretical calculation of the morphology and effective density

The structure of *extBC*, agglomerated by primary spherules with diameters of 20-60 nm (Alexander et al., 2008), can be characterized by its mass-mobility relationship, which is approximately expressed as a power-law relationship between the mass of the agglomerate particle ( $m$ ) and its mobility diameter ( $d_{mob}$ ), expressed as

$$m = k \cdot d_{mob}^{D_{fm}} \quad (1)$$

where the prefactor  $k$  is a constant and  $D_{fm}$  is the mass-mobility scaling exponent, which was sometimes erroneously called the ‘fractal dimension’ in previous studies (e.g., Park et al., 2003). This quantity corresponds well to the virtual  $D_f$  and represents the morphology of the BC aggregates (Sorensen, 2011). The  $D_{fm}$  value of a sphere is 3. Thus, the morphology of a particle becomes increasingly closer to that of a sphere as the  $D_{fm}$  increases gradually to 3.

The effective density ( $\rho_{eff}$ ) of the *extBC* particles is calculated as the ratio of the BC mass ( $m$ ) measured using the SP2 and the BC volume, which is based on the  $d_{mob}$  selected by the DMA, expressed as

$$\rho_{eff} = \frac{6m}{\pi d_{mob}^3} \quad (2)$$

Combining Eq. 1 and 2,  $\rho_{eff}$  can also be expressed as a function of  $d_{mob}$ ,

$$\rho_{eff} = K \cdot d_{mob}^{D_{fm}-3} \quad (3)$$

where  $K$  is a constant, corresponding to the prefactor  $k$  in the mass-mobility relationship.

The dynamic shape factor is also calculated to indicate the morphology of the *extBC* particles. It is derived from the ratio of the slip-corrected mass-equivalent diameter ( $d_{me}$ ) and  $d_{mob}$ , expressed as

$$\chi = \frac{d_{mob} \cdot C_c(d_{me})}{d_{me} \cdot C_c(d_{mob})} \quad (4)$$

where  $d_{me}$  is calculated from the BC mass ( $m$ ) by assuming the BC particle to be a compact sphere with a density of  $1.8 \text{ g cm}^{-3}$  (Taylor et al., 2015), and  $C_c$  is the Cunningham slip correction factor parameterized by particle diameter ( $d$ )

$$C_c(d) = 1 + \frac{2\lambda}{d} [\alpha + \beta \exp(-\frac{\gamma d}{2\lambda})] \quad (5)$$

where  $\lambda$  is the mean free path of the gas molecules, which is set to 65 nm in this study according to Zhang et al. (2016). The values of the three empirical parameters  $\alpha$ ,  $\beta$  and  $\gamma$  are 1.257, 0.4 and 1.1, respectively (Eq. 9.34 on page 407 in Seinfeld and Pandis, 2006).

## 4 Results and discussion

### 4.1 Mass-mobility relationship of the ambient *extBC*

A power-law relationship was applied to the  $d_{mob}$ -determined *extBC* mass values, delivering the mass-mobility scaling exponent ( $D_{fm}$ ) of the ambient *extBC* (Fig. 3). In the  $d_{mob}$  range of 140–750 nm, the fitted  $D_{fm}$  is 2.34, with one standard deviation of 0.03. The fitted  $D_{fm}$  is close to the lower limit of the  $D_{fm}$  values of diesel exhaust particles presented in the literature, indicating the dominant contribution of diesel exhaust to the *extBC* in our measurement site in urban Beijing. Depending on the fuel type, engine type and load, the  $D_{fm}$  of diesel exhaust particles measured by the DMA-APM or DMA-ELPI systems ranged between 2.22 and 2.84 (Olfert et al., 2007; Maricq and Xu, 2004; Park et al., 2003 and references therein). The higher  $D_{fm}$  values in the

literature are likely attributed to the higher fraction of volatile and/or semivolatile components (e.g., sulfate) in the diesel exhaust (Park et al., 2003; Olfert et al., 2007). Accompanied by these volatile and/or semi-volatile components would result in a more compact structure of the particle, leading to a higher  $D_{\text{fm}}$  value compared to the bare BC aggregate. Since the rBC mass instead of the whole particle mass of *ext*BC was measured by the SP2, the relatively low  $D_{\text{fm}}$  was expected and reasonable in this study. In addition, the relatively low  $D_{\text{fm}}$  value observed in urban Beijing is also likely to imply high fuel quality (e.g., low sulfur content) and efficient combustion in vehicle engines, which decrease the organic and/or inorganic fractions in diesel exhaust particles. The  $D_{\text{fm}}$  value for the ambient soot agglomerates measured with a DMA-APM system near a diesel truck-dominated highway was 2.41 (Geller et al., 2006), slightly higher than the value in our study.

According to Sorensen (2011), the ideal fractal-like DLCA with a virtual  $D_f$  of approximately 1.78 should have an expected  $D_{\text{fm}} \approx 2.2$  in the slip flow regime in which the BC aggregates are generally observed. The slightly larger  $D_{\text{fm}}$  value of ambient *ext*BC (2.34) in the current study might indicate a more compact structure than the ideal fractal-like DLCA due to the reconstruction effect by other components in the atmosphere. The reconstruction effect appears to be more significant in the smaller particle range than in the larger particle range. The smaller BC particles are more likely to be coated by volatile and/or semivolatile materials, which will be discussed in detail in the next section. We piecewise fitted the mass-mobility relationship using the power law function in the mobility ranges of 140–350 nm and 350–750 nm. A  $D_{\text{fm}}$  of  $2.51 \pm 0.04$  that was obtained in the smaller mobility range (140–350 nm) was obviously larger than the fitted value in the whole size range (140–750 nm). In contrast, a much lower  $D_{\text{fm}}$  with value of  $2.07 \pm 0.02$  was observed in the larger mobility range (350–750 nm). These results indicate that the ambient *ext*BC particles with larger mobility diameters were likely less influenced by the reconstruction effect than those with smaller mobility diameters.



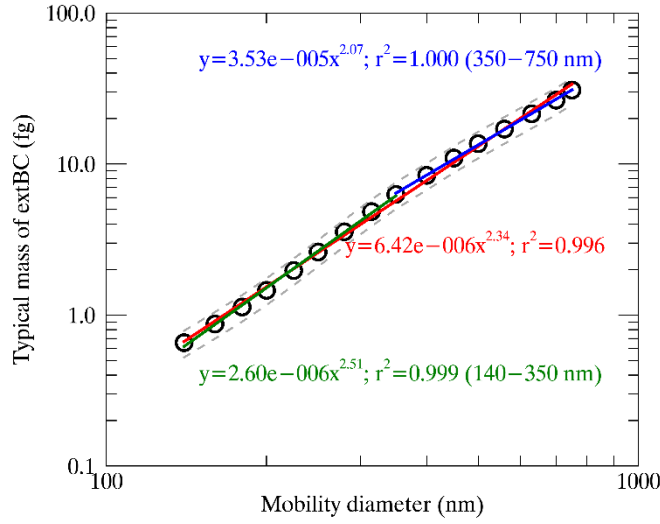


Fig. 3 The mass of *extBC* particles as a function of the mobility diameter in the range of 140–750 nm (black circles), fitted by a power-law relationship (red line). The power law functions piecewise fitted in the 140–350 nm mobility range (green line) range and in the 350–750 nm mobility range (blue line) are overlaid. The dashed lines represent in the uncertainties in the determined *extBC* masses.

Table 1 The typical mass-equivalent diameters ( $d_{me}$ ) and corresponding masses of *extBC* at different mobility sizes ( $d_{mob}$ ) selected by the DMA in the whole campaign, in a polluted episode and in a clean period. The effective densities ( $\rho_{eff}$ ) and dynamic shape factors ( $\chi$ ) at the  $d_{mob}$  selected by the DMA in the whole campaign are also presented.

$d_{mob}$ (nm)	$d_{me}$ (nm)			mass (fg)			$\rho_{eff}$ (g cm <sup>-3</sup> )	$\chi$
	total	polluted	clean	total	polluted	clean		
140	88.8	87.2	88.5	0.66	0.63	0.65	0.46	2.16
160	97.5	96.9	98.1	0.87	0.86	0.89	0.41	2.27
180	106.2	106.1	107.0	1.13	1.13	1.15	0.37	2.35
200	115.6	116.1	115.5	1.46	1.48	1.45	0.35	2.40
225	127.9	128.6	128.4	1.97	2.01	1.99	0.33	2.41
250	140.5	142.2	141.0	2.62	2.71	2.64	0.32	2.41
280	155.8	158.0	154.4	3.56	3.72	3.47	0.31	2.41
315	172.6	174.8	170.6	4.85	5.04	4.68	0.30	2.40
350	188.2	191.8	185.9	6.28	6.65	6.05	0.28	2.41
400	207.4	213.7	207.4	8.41	9.20	8.41	0.25	2.43
450	226.4	232.3	225.9	10.94	11.81	10.87	0.23	2.50
500	243.8	251.4	242.2	13.65	14.98	13.39	0.21	2.62
560	262.6	271.1	260.1	17.06	18.77	16.58	0.19	2.71
630	283.2	293.5	282.5	21.42	23.83	21.25	0.16	2.81

700	305.1	312.7	305.0	26.76	28.83	26.73	0.15	2.89
750	319.6	328.8	323.5	30.76	33.49	31.92	0.14	2.93

470

471 The variation in the morphology of *extBC* was further examined by comparing the  
472 mass-mobility relationship in a polluted episode and in a consecutively clean period.  
473 As shown in Fig. S7, a polluted episode rapidly formed at 14:00 (local time, if not  
474 specified) on 26 January and lasted one and a half days to 0:00 on 28 January 2018.  
475 The mean  $PM_{2.5}$  mass concentration was  $72.1 \pm 23.1 \mu g m^{-3}$  in this polluted episode,  
476 three times the campaign average value ( $23.0 \pm 26.7 \mu g m^{-3}$ ). The  $D_{fm}$  value is  $2.42 \pm 0.09$   
477 in the polluted episode, higher than that ( $2.33 \pm 0.06$ ) observed in the consecutively clean  
478 period from 1:00 on 28 January to 18:00 on 31 January 2018, during which the average  
479  $PM_{2.5}$  concentration was merely  $8.9 \pm 2.7 \mu g m^{-3}$  (Fig. S8). The higher  $D_{fm}$  in the polluted  
480 episode is mainly due to the increase in the masses of *extBC* at large mobility sizes (e.g.,  
481  $d_{mob} > 250$ ). As shown in Table 1, the typical masses of *extBC* in the 280–700 nm  $d_{mob}$   
482 range in the polluted episode are ~7–13% larger than those in the clean period.  
483 Although the differences might result from the uncertainty (~20%) in the mass  
484 determination of *extBC*, the commonly larger *extBC* masses (in the 280–700 nm  $d_{mob}$   
485 range) to some degree still imply a possibly more compact structure of *extBC*  
486 aggregates in the polluted episode, which might relate to changes in the dominant  
487 sources and the ambient environment. Previous studies have revealed that regionally  
488 transported pollutants emitted from coal combustion and/or biomass burning played an  
489 important or even predominant role in polluted episodes in Beijing (Wu et al., 2017;  
490 Ma et al., 2017a). Thus, a considerable fraction of *extBC* aggregates from these sources  
491 is likely to coexist with the local vehicle-emitted BC aggregates in the polluted episode,  
492 even though the proportion of *extBC* in the total BC-containing particles decreased (Fig.  
493 S9). These transported BC aggregates originating from coal combustion and/or biomass  
494 burning might have a more compact structure than those from vehicle exhaust due to  
495 the differences in the combustion environments and efficiencies. In addition, the BC  
496 aggregates might also become more compact due to the reconstruction effect by the  
497 volatile and/or semivolatile components which are generally abundant in polluted

episodes. Both possible factors are likely to result in the larger  $D_{\text{fm}}$  values in the polluted episode.

## 4.2 Size-resolved effective densities of the ambient *extBC*

In contrast to the mass of *extBC* ( $m$ ), the effective density of the *extBC* particles ( $\rho_{\text{eff}}$ ) showed a significant decreasing trend as the  $d_{\text{mob}}$  increased from 140 nm to 750 nm (Fig. 4 and Table 1). The highest  $\rho_{\text{eff}}$  of  $0.46 \text{ g cm}^{-3}$  was observed in the 140 nm  $d_{\text{mob}}$ , likely because the BC aggregates at the smallest size are made up of the fewest primary spherules. When the  $d_{\text{mob}}$  increased to 750 nm,  $\rho_{\text{eff}}$  decreased to as low as  $0.14 \text{ g cm}^{-3}$ , approximately one-third of that at 140 nm. The very low  $\rho_{\text{eff}}$  values agree well with the fractal-like nature of the *extBC* particles.

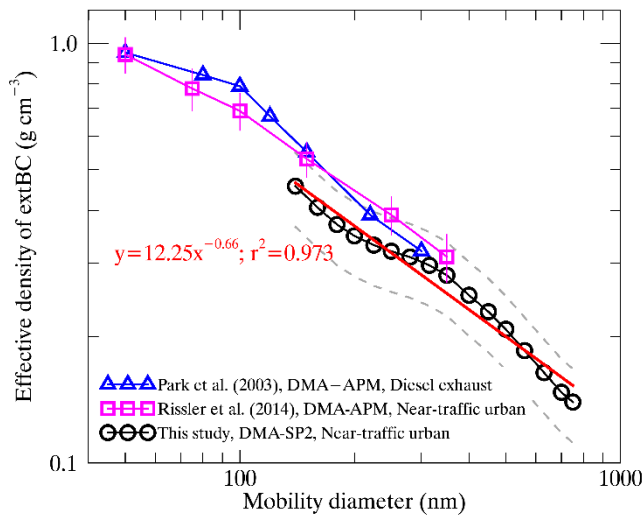


Fig. 4 The effective density ( $\rho_{\text{eff}}$ ) of the *extBC* particles as a function of the mobility diameter ( $d_{\text{mob}}$ ) (black circles). The red line represents the power-law fitting of  $\rho_{\text{eff}}$  against  $d_{\text{mob}}$ . The variations of  $\rho_{\text{eff}}$  with  $d_{\text{mob}}$  measured for the soot agglomerates from diesel exhausts (Park et al., 2003) and near-traffic urban environments (Rissler et al., 2014) are also presented as blue triangles and red squares, respectively. The dashed lines represent in the uncertainties in the determined  $\rho_{\text{eff}}$ .

The  $\rho_{\text{eff}}$  values obtained by the DMA-SP2 measurements are close to those of the lower limits of diesel exhaust particles measured by the DMA-APM (or CPMA) or DMA-

ELPI systems. Park et al. (2003) reported a decrease in the  $\rho_{\text{eff}}$  of diesel exhaust particles under a moderate (50%) engine load from  $0.95 \text{ g cm}^{-3}$  to  $0.32 \text{ g cm}^{-3}$  as the mobility diameter increased from 50 nm to 300 nm (Fig. 4). The  $\rho_{\text{eff}}$  values presented in Park et al. (2003) are approximately 1.25, 1.18 and 1.05 times those in our study at  $\sim 150$  nm, 220 and 300 nm in mobility diameter, respectively. The differences in  $\rho_{\text{eff}}$  values between our study and the literature are generally within the uncertainty ( $\sim 20\%$ ) in the mass determination of *ext*BC at prescribed mobility sizes. However, the commonly lower  $\rho_{\text{eff}}$  values are also likely due to the techniques used to determine the mass of BC aggregates. Some previous studies on the  $\rho_{\text{eff}}$  of diesel exhaust particles using the DMA-APM or DMA-ELPI tandem measurements also showed a slightly larger  $\rho_{\text{eff}}$  throughout the comparable mobility ranges (e.g.,  $\sim 150\text{--}350$  nm) than that measured in this study (Maricq and Xu, 2004; Olfert et al., 2007). The masses of the bare BC particles were determined by the laser-induced incandescence technique of the SP2. In a previous tandem system, the APM (or CPMA) or ELPI was utilized to determine the typical mass of BC aggregates at a given mobility, and the BC aggregates are likely composed of a fraction of volatile and/or semivolatile components in addition to the bare primary particles. These volatile and/or semivolatile components increase the mass of the whole particle, resulting in a larger  $\rho_{\text{eff}}$  value at a certain mobility and cause a compact structure of the BC aggregate. For example, Olfert et al. (2007) found that the  $\rho_{\text{eff}}$  of diesel exhaust particles coated with minor sulfate and water contents ( $\sim 2\%$  of the total particle mass) was  $\sim 0.4 \text{ g cm}^{-3}$  at 299 nm, only slightly larger than the value of diesel exhaust particles ( $0.32 \text{ g cm}^{-3}$ ) measured in Park et al. (2003) and that of *ext*BC in the urban atmosphere ( $0.31 \text{ g cm}^{-3}$ ) in our study at the same mobility size. However, the  $\rho_{\text{eff}}$  value increased significantly to  $\sim 0.71 \text{ g cm}^{-3}$  at a relatively high engine load of 40% due to the high sulfate levels ( $\sim 30\%$  of the total particle mass) in the diesel exhaust particles (Olfert et al., 2007).

The  $\rho_{\text{eff}}$  of ambient soot aggregates also showed a similar decreasing trend with increasing  $d_{\text{mob}}$  based on the DMA-APM system (Geller et al., 2006; Rissler et al., 2014). Rissler et al. (2014) showed a decrease in the average  $\rho_{\text{eff}}$  of BC aggregates from  $0.94 \text{ g cm}^{-3}$  to  $0.31 \text{ g cm}^{-3}$  in the near-traffic urban environment as the  $d_{\text{mob}}$  increased

from 50 nm to 350 nm (Fig. 4), similar to that of the freshly emitted diesel exhaust particles presented in Park et al. (2003). However, based on the same method, the  $\rho_{\text{eff}}$  values of the ambient BC aggregates that mostly originated from diesel exhausts (Geller et al., 2006) are substantially different from those presented in Rissler et al. (2014), especially in the large particle size range. The  $\rho_{\text{eff}}$  at ~350 nm was 0.17 g cm<sup>-3</sup> in Geller et al. (2006), approximately half of the value presented in Rissler et al. (2014). The reason for the discrepancy might be related to the large measurement uncertainties of the DMA-APM system for large particles, e.g., with sizes greater than 300 nm in the  $d_{\text{mob}}$ , since these large particles are less abundant in the ambient atmosphere (Geller et al., 2006). Compared to the results presented in Rissler et al. (2014), the  $\rho_{\text{eff}}$  values of ambient *extBC* aggregates in our study are slightly lower, e.g., by ~17%, ~18% and ~6% in 150 nm, 250 nm and 350 nm  $d_{\text{mob}}$ , respectively. The relatively higher  $\rho_{\text{eff}}$  values are also likely attributed to the effects of volatile and/or semivolatile components in the soot aggregates. Rissler et al. (2014) found that the residual mass fraction of volatile and/or semivolatile materials in the soot aggregates was ~10%, even when the sample air was heated to 300 °C before entering the system for measurement.

It is interesting to note that the  $\rho_{\text{eff}}$  values appear to be closer to the values presented in the literature using the DMA-APM measurements in the 280–350 nm  $d_{\text{mob}}$  range (Fig. 4). As shown in Fig. 3, larger typical masses of *extBC* in this range are also observed beyond the logarithmic scaled linear curve that is fitted to the mass-mobility relationship. The relatively larger masses and  $\rho_{\text{eff}}$  values might imply a more compact structure of *extBC* aggregates in this range which is likely resulted from the reconstruction effect by the ambient volatile and/or semivolatile components. As shown in Fig. S9, the size-resolved number fractions of *extBC* exhibit a minimum in the 280–350 nm  $d_{\text{mob}}$  regardless of whether they are associated with the polluted episode or the clean period. This finding indicates that particles in this mobility range are more likely to be thickly coated by other components compared to those in the smaller or larger mobility ranges. Zhang et al. (2016) also observed an increased coating thickness of the BC-containing particles in the mobility range of 200–350 nm (Table 1 in the literature) using the VTDMA-SP2 measurement at a suburban site ~70 km away from our

observation site, although the variation in the coating thickness in the larger mobility range was not investigated. It should be noted that the number fraction of *extBC* at each mobility size presented in Fig. S9 is roughly calculated as the ratio of the *extBC* number concentration to the sum of *extBC* and *intBC*, in which the multiply charged effects were not corrected. Although the *extBC* particles without and/or with thin coatings are the focus of the current study, the higher fraction of thickly coated BC particles in the 280–350 nm  $d_{\text{mob}}$  range implies a higher possibility that these *extBC* particles in the same range were affected by volatile and/or semivolatile materials in the atmosphere, in turn resulting in a more compact structure of these BC aggregates. Further detailed studies of the size distribution of BC (including *extBC*, *intBC* and both) and non-BC particles based on the combined measurements of SP2 and CPC are needed in our further work to reveal the potential mechanism for this phenomenon.

Although the  $\rho_{\text{eff}}$  of *extBC* at small sizes ( $d_{\text{mob}} < 140$  nm) cannot be determined due to the lower limit of the DMA-SP2 system, we extended the  $\rho_{\text{eff}}$  of *extBC* to a large size range ( $350 < d_{\text{mob}} < 750$  nm), which was barely investigated in previous studies using tandem measurements. A continuous decrease in  $\rho_{\text{eff}}$  with increasing  $d_{\text{mob}}$  was observed even in the large size range between 350 nm and 750 nm (Fig. 4). It is reasonable to infer that the structure of the *extBC* particles becomes looser when the fractal-like aggregates built up by the primary spherules increase.

### 4.3 Dynamic shape factors of the ambient *extBC*

Due to their fractal-like structures, the *extBC* particles generally have large dynamic shape factors ( $\chi$ ) with values in the range of 2.16 to 2.93 (Table 1), much larger than those of *intBC* with an average value of  $\sim 1.2$  (Zhang et al., 2016). The  $\chi$  value declined exponentially as a function of coating thickness of BC-containing particles (Zhang et al., 2016). In contrast to the decrease in  $\rho_{\text{eff}}$ , the  $\chi$  values of *extBC* generally increase as the  $d_{\text{mob}}$  increases from 140 nm to 750 nm (Fig. 5). The *extBC* particles 750 nm in mobility diameter have a mean  $\chi$  value of 2.93, approximately 1.36 times that for 140 nm  $d_{\text{mob}}$  particles (Table 1). The larger particles have looser structures, resulting in higher  $\chi$  values. However, the  $\chi$  values appear to vary slightly in a narrow range between

2.40 to 2.41 in the size range of 200 nm to 350 nm (Fig. 5). The hiatus in the gradual increase in  $\chi$  should also relate to the more compact structure of *ext*BC particles in the 280–350 nm mobility range, which has been discussed in detail in the previous sections. .

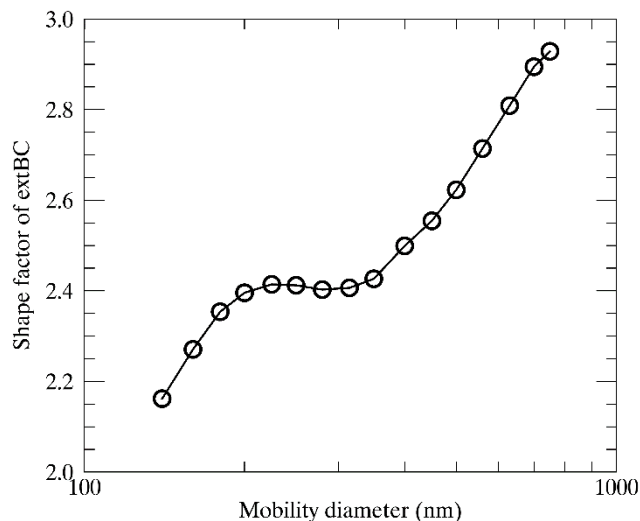


Fig. 5 The dynamic shape factor of the *ext*BC particles as a function of the mobility diameter in the range of 140–750 nm.

## 5 Conclusions

The DMA-SP2 system was established to study the morphology and effective density of the ambient *ext*BC particles, especially in the larger mobility size range, i.e.,  $350 < d_{\text{mob}} < 750$  nm, which was seldom investigated in previous tandem measurements. Quasi-monodisperse particles in the  $d_{\text{mob}}$  range of 20–750 nm were stepwise selected using the DMA and then delivered to the SP2 for rBC mass measurement and mixing state discrimination. The time difference between the size selection and the SP2 measurement was previously processed using the local peak approach. The normalized number size distribution of *ext*BC, distinguished as having a delay time between the incandescence signal peak and the scattering peak detected by the SP2 of less than 2  $\mu\text{s}$ , as a function of  $d_{\text{me}}$  was investigated at each prescribed mobility size in the range of 140–750 nm. The size distributions at smaller mobility sizes were not presented due to the lower limit of the rBC mass determined by using the SP2. The peak  $d_{\text{me}}$ , calculated

as the mode value of a lognormal function fitted to the major peak of the size distribution, was determined as the typical  $d_{me}$  value at each mobility size. Consequently, the typical mass of *extBC* at each mobility size was identified. Reducing the delay time threshold employed to discriminate the *extBC* had few effects on the determined masses of *extBC*, implying the reliability of our study for the *extBC* particles. The uncertainty in the determined *extBC* masses was ~20%, combining the uncertainty in the SP2-measured rBC mass with that related to the time-delay approach. On this basis, the mass-mobility relationship of ambient *extBC* in urban Beijing was investigated. The campaign average  $D_{fm}$  value was estimated to be  $2.34 \pm 0.03$  by fitting the derived *extBC* masses as a power-law function of  $d_{mob}$  in the range of 140–750 nm, close to the lower-limit  $D_{fm}$  value of diesel exhaust particles. A relatively larger  $D_f$  value was observed in the polluted episode than in the clean period ( $2.42 \pm 0.09$  vs.  $2.33 \pm 0.06$ ), implying a more compact structure of BC aggregates in the polluted episode.

A decrease in  $\rho_{eff}$  with increasing  $d_{mob}$  was observed, with the  $\rho_{eff}$  value decreasing from  $0.46 \text{ g cm}^{-3}$  at 140 nm mobility to  $0.14 \text{ g cm}^{-3}$  at 700 nm. The  $\rho_{eff}$  values derived using the DMA-SP2 measurement were slightly lower than those based on the DMA-APM measurement. This difference was most likely due to the bias in the *extBC* mass determination using the SP2 and APM techniques. The pure rBC mass determined using the SP2 in this study was generally lower than the total mass of the BC aggregate, which comprises both rBC and a possible fraction of nonrefractory components. The  $\rho_{eff}$  values in the 280–350 nm mobility range appeared to be much closer to the values for soot aggregates reported in the literature by using the DMA-APM tandem measurement. This finding might be related to the more compact structure of BC aggregates in this range, which was likely influenced by the reconstruction effect of volatile and/or semivolatile components in the atmosphere. The reconstruction effect might also result in a hiatus in the gradually increased  $\chi$  value in the range of 200–350 nm. Large  $\chi$  values generally increased from 2.16 to 2.93 with increasing  $d_{mob}$ , further implying the high fractal structure of *extBC* particles.

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