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# Impact of cloud process in the mixing state and microphysical properties of soot particles

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#### 1 Impact of Cloud Process in the Mixing State and Microphysical

#### 2 Properties of Soot Particles: Implications in Light Absorption

#### 3 Enhancement

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#### 24 Key Points:

- Cloud processing contributes to the increase of organic coating on soot aggregates,
- 26 especially for those with fully embedded structure.
- The sulfate coating causes more compaction of soot aggregates than the organic
  coating upon cloud processing.
- 29 Changes in the microphysical properties of soot particles driven by one cloud event
- 30 increase their absorption enhancement by 1.29 times.

#### 31 Abstract

32 The radiative forcing of soot is dependent on the morphology, mixing state and structure. Cloud processing has been predicted to affect their mixing properties but little is known 33 about the resulting light absorption properties. We collected ambient particles in the 34 pre-cloud period, the cloud residues and interstitials in the in-cloud period at Mt. 35 Tianjing (southern China). The morphology parameters of soot aggregates with varying 36 mixing materials (sulfate (S) and organics (OM)) and mixing structures were 37 investigated by a transmission electron microscope, and their absorption cross section 38 were calculated based on discrete dipole approximation. We found that the number 39 contribution of soot-S decreased from 45% in the pre-cloud period to 32% in the in-40 cloud period, and that of soot-OM increased from 44% to 60%. Moreover, the number 41 proportion of soot-OM with fully embedded structure increased remarkably in the in-42 cloud period (29%), compared with that in the pre-cloud period (3%). In addition, the 43 soot-S aggregates became denser after in-cloud aqueous process. However, for soot-44 OM aggregates, the morphology remained relatively constant. The distinctly different 45 change of soot-S and soot-OM in morphology highlights the chemically resolved 46 reconstruction of soot morphology. Theoretical calculation further shows that the 47 changes of soot particles in the mixing state and morphological characteristics by the 48 cloud process resulted in the light absorption enhancement increase from 1.57 to 2.01. 49 This study highlights that the evolution of microphysical properties upon cloud 50 processing should also be considered in climate models to more accurately evaluate the 51 impacts of soot particles. 52

#### 53 Plain Language Summary

While soot particles are the main component of aerosols that produce positive radiative 54 forcing in clouds, the impact of in-cloud processes on key factors (mixing state and 55 microphysical property) for evaluating the optical properties of soot particles is unclear. 56 Here, we report the detailed information on several parameters required to calculate the 57 optical properties of soot particles, throughout the cloud events. And we found that 58 changes in the mixing state, mixing structure, and morphology of soot particles under 59 the influence of in-cloud processes lead to a significant light absorption enhancement. 60 The results also highlight the role of in-cloud aqueous formation of secondary 61 compositions in reshaping the soot particles, which has substantial implications for the 62 climate impact of soot particles. Given that ~70% of the Earth's surface is covered by 63 clouds, taking the mixing state and microphysical properties of soot particles into 64 account in climate models may help constrain the contribution of soot particles to global 65 radiative forcing. 66

#### 67 **1 Introduction**

Soot, also known as black carbon (BC) or elemental carbon (EC) [Buseck et al., 68 2014], is deeply concerning because it has a multitude of effects on the global 69 atmosphere and Earth's surface. It is the second largest contribution to warm the 70 atmosphere after carbon dioxide [Jacobson, 2001]. Soot particles in the atmosphere 71 exhibit complexity in size, composition, morphology, and mixing structure, which 72 results in the high uncertainties in climate models when predicting their optical 73 properties [Lack and Cappa, 2010; Liu et al., 2017a; Zhang and Mao, 2020] and CCN 74 activity [Li et al., 2018; Liu et al., 2013]. 75

The chemical and physical properties of soot particles are dynamic and vary with 76 aging processes during atmospheric transport. They are sensitive to the formation of 77 78 secondary components and atmospheric conditions, leading to complex and everchanging mixing state and mixing structure of soot particles [Liu et al., 2017b; 79 Zelenyuk et al., 2010; Zhang et al., 2018]. Fresh soot particles emitted from biomass 80 burning and fossil fuel combustion are hydrophobic with bare-like structure, which 81 generally shows the chain-like structure composed of several nanospheres with onion-82 like and graphene-like layers of carbon [Buseck et al., 2014; Li and Shao, 2009]. As 83 the degree of aging increases, the soot aggregates are wrapped thicker and become more 84 compact, resulting in more partly coated and/or fully embedded soot particles [China 85 et al., 2014; China et al., 2015b; Wang et al., 2017; Xu et al., 2020], and higher 86 absorption enhancement [Wu et al., 2018]. The mixing structure and morphology 87 parameters of soot particles are key factors to calculate their optical properties [Adachi 88

et al., 2010; Cappa et al., 2012; Yu et al., 2019]. From the bare-like structure to being 89 gradually coated by other components, the light absorption of soot particles will be 90 significantly enhanced by factors ranging from 1 to 3.5 [Wu et al., 2018]. And, the 91 optical properties of the bare-like soot aggregates with diverse fractal degrees are also 92 different [Radney et al., 2014; Wang et al., 2021b]. Additionally, soot aggregates coated 93 by various materials may redistribute after liquid-liquid phase separation (LLPS) under 94 high relative humidity, which could lead to an inverted core-shell structure (soot 95 aggregates are distributed in the outer layer of the two-phase particle) [Brunamonti et 96 97 al., 2015]. Consequently, the core-shell model (concentric spheres composed of soot nuclei and coating) assumed in current climate models results in higher uncertainty of 98 light absorption compared to observations, either overestimation [Cappa et al., 2012; 99 100 Wu et al., 2018] or underestimation [Kelesidis et al., 2022]. Therefore, an accurate understanding of the mixing structure and morphology parameters of soot particles is 101 crucial for the climate model to evaluate their radiative forcing. 102

103 Previous studies have shown that cloud could modify the mixing state and morphology of atmospheric particles [China et al., 2015a; Liu et al., 2018], through 104 collision/coalescence and Brownian capture as well as aqueous reactions. The 105 reconstruction of soot aggregates has been found in high humidity environments such 106 as fog and cloud events [Bhandari et al., 2019; China et al., 2015a], which is affected 107 by the mixing state of soot particles [Khalizov et al., 2009; Qiu et al., 2012; Zhang et 108 109 al., 2008]. High humidity condition during cloud process can promote the formation of various species including inorganic (such as nitrate, sulfate, and ammonium) and 110

organic substances (such as oxalic acid, organosulfate) [Kim et al., 2019; Schneider et
al., 2017; Zhang et al., 2017b]. While the physical and chemical properties of organic
matter have been observed to bring about varying mixing structure and structural
reorganization of soot particles [Chen et al., 2020; Chen et al., 2016; Sharma et al.,
2018], how the cloud processing driven changes in the mixing state of soot particles
affects their microphysical properties is poorly understood yet.

In order to study the effects of cloud processes on mixing state and microphysical 117 properties of soot particles, samples during pre-cloud and in-cloud periods at a remote 118 119 high-altitude site in southern China were collected and analyzed. We investigated the changes of morphology parameters (i.e., fractal dimension, aspect ratio, roundness, and 120 size) of soot aggregates with different mixing states and mixing structures from pre-121 122 cloud to in-cloud periods. The possible influencing factors such as different coating materials and mixing structures were discussed. Finally, the effect of cloud processing 123 on the light absorption of soot particles was evaluated. 124

#### 125 2 Methods

#### 126 **2.1 Sampling and Instrumentation**

A field observation focused on the cloud events was conducted from May 8 to June 3, 2018 at an atmospheric observation station (112 53'56" E, 24 41'56" N; 1690 m above sea level) on the top of Mt. Tianjing. There is a pristine forest covering 273 km<sup>2</sup> and few anthropogenic emissions around the sampling site. Cloud events are prevalent due to the influence of warm and humid air masses from the South China Sea [Lin et al., 2019]. The cloud events investigated in this study were mainly affected by local

133	biogenic sources and long-range transport from the southwest air masses ( <b>Fig. S1</b> ). Soot
134	particles mainly come from combustion activities in Southeast Asia and industrial
135	emissions in the urban agglomeration of southern China [Zhang et al., 2017a].
136	A ground-based counterflow virtual impactor (GCVI, model 1205, Brechtel Mfg.
137	Inc., USA) was used to introduce cloud droplets larger than 7.5 $\mu$ m into the subsequent
138	system [Shingler et al., 2012]. During cloud processes, cloud droplets and unactivated
139	particles are introduced into the inlet of the GCVI, a wind tunnel, which can accelerate
140	droplets or particles to 100 m s <sup>-1</sup> . The flow rate of the filtered and heated add-flow can
141	be adjusted in the range of 16-23 L min <sup>-1</sup> to ensure the cut size of 7.5 $\mu$ m with the
142	transmission efficiency of 50%. The flow rate of sample-flow is kept at a constant 15 L
143	min <sup>-1</sup> for multiple instruments downstream. The cloud droplets went through an
144	evaporation chamber (40 $^{\circ}$ C) to remove the associated water, leaving the cloud residual
145	(RES) particles for the follow-up particle sampling or on-line analysis. The add-flow
146	with high temperature indirectly controls the sample-flow temperature of evaporation
147	chamber. Some semi-volatile organic compounds will be lost under heating, and the
148	loss at 40 $^{\circ}$ C may be less than 1% [Cao et al., 2018]. In addition, a PM <sub>2.5</sub> cyclone inlet
149	followed by a silica gel diffusion dryer was used for the collection of inactivated
150	interstitial (INT) particles during the cloud events and the ambient particles during free-
151	cloud periods.

A DKL-2 sampler (Genstar Electronic Technology Co., Ltd., China) employing a single-stage cascade impactor with a 0.5 mm diameter jet nozzle was used to collect individual particles on copper grids coated by carbon film (300 mesh, Beijing 25 Zhongjingkeyi Technology Co., Ltd., China) with the airflow of 1 L min<sup>-1</sup>. The effective size  $d_{50}$  is 0.5 µm for particles with a density of 2 g cm<sup>-3</sup>. The DKL-2 sampler was described in detail by Li et al. [2011]. The sampling duration varied from 5 to 10 min based on the number concentration of particles. After collecting, samples were stored in a sealed plastic box and placed in a desiccator (RH (relative humidity) < 30%) at 25 °C for later analysis.

A transmission electron microscope (TEM, FEI Talos F200S, USA) operated at 161 200 kV was used to observe the morphology of particles on the copper grids, which 162 was coupled with an energy-dispersive X-ray spectrometer (EDS) to obtain the 163 elemental composition including carbon and heavier elements ( $Z \ge 6$ ). The distribution 164 of particles on the copper grids is not uniform. The diameter of particles distributed in 165 166 the center is larger than that in the edge. Therefore, in order to ensure that particles analyzed are representative within the entire particle size range, 3-4 areas were selected 167 from the center to the edge on each copper grid. The electron beam of TEM was focused 168 on the particles when the soot aggregates were coated. The components with weak 169 thermal stability were lost under the electron beam, but the refractory components 170 remain unchanged, so the morphology of soot aggregates could be clearly captured (Fig. 171 S2). An image analysis software, ImageJ (https://imagej.nih.gov/), was used to obtain 172 the morphology parameters of all particles by analyzing TEM images. 173

During the observation period, the mass concentrations of PM<sub>2.5</sub>, O<sub>3</sub>, SO<sub>2</sub> and NO<sub>X</sub> were monitored in real time by tapered element oscillating microbalance (TEOM 1405, Thermo Fisher Scientific Inc., MA, US), O<sub>3</sub> analyzer (Model 49i, Thermo Fischer

177	Scientific Inc., USA), pulsed UV fluorescence (Model 43i-TLE, Thermo Fischer
178	Scientific Inc., USA), and NO-NO <sub>2</sub> -NO <sub>X</sub> analyzer (Model 42i-TL, Thermo Fischer
179	Scientific Inc., USA), with details described elsewhere [Gong et al., 2018].

180 **2.2 Division of cloud periods and meteorological characteristics** 

This field observation spanned two complete non-precipitation cloud processes, 181 which were named as cloud events #1 and #2. Both cloud events formed at night and 182 dissipated at noon of the next day. During the cloud events, prevailing wind direction 183 was from the southwest, and wind speed was in the range of 4.1-9.4 m s<sup>-1</sup>. The mass 184 concentration of PM<sub>2.5</sub> was 2-23  $\mu$ g m<sup>-3</sup> during cloud event #1 and 4-47  $\mu$ g m<sup>-3</sup> during 185 cloud event #2. Two periods were defined according to the visibility (Vis) and RH [Lin 186 et al., 2019]: pre-cloud period (Vis > 3 km or RH < 95%) and in-cloud period ( $Vis \le 3$ 187 km and RH > 95%) (Fig. S3). Due to rapid development of formation and dissipation 188 of cloud, INT particles were only collected in the stability period with low visibility 189 (*Vis* < 0.1 km) and the mass concentration of PM<sub>2.5</sub> (< 5  $\mu$ g m<sup>-3</sup>) [Yang et al., 2021]. 190 The average visibility and RH during the stability period of cloud processes were 38  $\pm$ 191 13 m and 100  $\pm$  0.2 %, which were 600  $\pm$  890 m and 99  $\pm$  0.7 % in the non-stability 192 (formation and dissipation) period respectively. In the following text, particles in the 193 in-cloud period refer to all the RES particles during cloud processes, except as 194 specifically noted. Overall, 4569 particles were analyzed by TEM/EDS including 1188 195 particles in the pre-cloud period and 3381 particles in the in-cloud period. Standard 196 errors for the number fraction of particles were estimated assuming Poisson distribution 197 [Pratt et al., 2010]. 198

During two periods of cloud event #1, there was little change for the 199 concentrations of  $SO_2$  and  $O_3$  in the atmosphere. Differently, they changed dramatically 200 during cloud event #2. The average concentrations of  $SO_2$  and  $O_3$  reduced from 3.1 µg 201  $m^{-3}$  and 188.2 µg  $m^{-3}$  in the pre-cloud period to 1.5 µg  $m^{-3}$  and 82.1 µg  $m^{-3}$  in the in-202 cloud period, respectively. Due to the cloud scavenging of particulate matter, the 203 average concentration of PM<sub>2.5</sub> was significantly reduced from 20.4 µg m<sup>-3</sup> in the pre-204 cloud period and to 5.1  $\mu$ g m<sup>-3</sup> during the in-cloud period for cloud event #1 and from 205 32.7  $\mu$ g m<sup>-3</sup> to 12.3  $\mu$ g m<sup>-3</sup> for cloud event #2. The average concentration of NO<sub>X</sub> was 206 higher during cloud event #2 (10.5  $\mu$ g m<sup>-3</sup>) than cloud event #1 (3.8  $\mu$ g m<sup>-3</sup>). 207

#### 208 2.3 The calculation of morphology parameters of soot aggregates

Fractal dimension  $(D_f)$  is a morphology parameter used to characterize the mass-209 based fractal properties, which can quantify the fractal degree of soot aggregates 210 [Samson et al., 1987]. Brasil et al. [1999] linked the structural properties between 211 computer-simulated three-dimensional aggregates 212 and their two-dimensional projection images, which can be used to infer morphology parameters (such as  $D_{f}$ ) of 213 three-dimensional aggregates from analysis of two-dimensional electron microscopy 214 images. This method has been frequently used in the calculation of soot aggregates 215 morphology parameters [Wang et al., 2017; Wentzel et al., 2003]. The  $D_f$  follows the 216 statistical scaling law: 217

$$N = k_g \left(\frac{2R_g}{d_p}\right)^{D_f} \tag{1}$$

where *N* and  $d_p$  represent the number and average diameter of monomers within a certain soot aggregate, respectively.  $R_g$  refers to the gyration radius of the soot aggregate, and  $k_g$  is the fractal pre-factor. The calculation method of  $D_f$  is described in detail in the supporting information (Text S1). Aspect ratio (AR) and roundness (RN) are also calculated to quantify the morphology of soot aggregates, which can be obtained by equations (2) and (3):

$$AR = \frac{L_{max}}{W_{max}} \tag{2}$$

$$RN = \frac{4A_a}{(\pi L_{max}^2)}$$
(3)

where  $L_{max}$  and  $W_{max}$  are the maximum length and width of a bounding box.  $A_a$  is the projected area of the soot aggregate. For a spherical particle:  $D_f = 3$ , and AR = RN = 1. For a nonspherical particle: 1 (linear particle)  $\leq D_f < 3$ , AR > 1, and RN < 1. In addition, the equivalent area diameter ( $D_{eq}$ ) represents the size of particle, which can be obtained by equation (4).

$$D_{eq} = \sqrt{\frac{4A_a}{\pi}} \tag{4}$$

#### 229 2.4 The calculation of optical properties of soot particles

The absorption, scattering and extinction cross sections of soot particles at 532 nm were calculated by discrete dipole approximation (DDA) (http://ddscat.wikidot.com/), which has been widely applied to calculate the optical properties of soot particles with different coating materials and mixing structures [Draine and Flatau, 1994]. The input parameters are refractive index of material, the shape and effective radius of particle  $(D_f, N, d_p)$ . The refractive indices are 1.76+0.63*i*, 1.53+0*i* and 1.48+0*i* for soot

236	aggregate, sulfate coating and organic coating, respectively [Luo et al., 2019;
237	Nakayama et al., 2010; Worringen et al., 2008]. Shape and effective radius can be
238	obtained based on the images from TEM. Absorption enhancement $(E_{abs})$ is the ratio of
239	$C_{abs}$ (absorption cross section) of soot particles to soot aggregates, which is described
240	in detail in the supporting information. In this study, the Electron-Microscope-to-BC-
241	Simulation (EMBS) tool, recently developed by Wang et al. [2021b], was applied to
242	build realistic soot shape models with diverse morphology and mixing structures. The
243	average number and diameter of monomers of soot aggregates in the pre-cloud and in-
244	cloud periods are 96, 102 and 45 nm, 44 nm, respectively. So soot aggregate is defined
245	as 100 monomers with the diameter of 44 nm in the theoretical calculation. The
246	variation of $E_{abs}$ with the number of monomers is less than 3% (Fig. S4).

#### 247 **3 Results and discussions**

#### 248 **3.1** The impact of cloud process on the mixing state and structure of soot particles

Three components were identified within soot particles based on element 249 composition and morphology, including soot, sulfate and organic matter [Li et al., 2016]. 250 251 Soot was identified by chain-like structure in morphology and abundant carbon in elemental composition. Organic matter exhibited spherical or irregular shape with 252 abundant C and minor O. Sulfate was dominated by S and O, and some were 253 254 accompanied by a small amount of N, K and Na. It is often bubbly appearance due to the loss of volatile materials (such as ammonium nitrate) by high-energy electron beams 255 during TEM/EDS analysis. Therefore, the inorganic component is identified according 256 257 to the bubble-shape and S-peak, so sulfate represent inorganic components here. Soot

258	particles contributed to 12-26% of all analyzed particles by number, which were divided
259	into three classes based on the mixing materials directly contacting with soot aggregates
260	(soot fraction in the whole particle), including bare-like soot aggregate with negligible
261	coating (Fig. 1a), soot aggregate coated by sulfate (soot-S) (Fig. 1b, c, d), or by organic
262	matter (soot-OM) (Fig. 1e, f). Such a classification stresses chemical components in
263	direct contact with soot aggregates, which is slightly different from the classification
264	based on the mixing state of the whole particle [Yuan et al., 2019]. According to various
265	mixing structures between soot aggregates and other materials, soot particles were
266	divided into four classes (Fig. 1), including bare-like (Fig. 1a), attached (Fig. 1b),
267	partly coated (Fig. 1c), and fully embedded (Fig. 1d-f) [China et al., 2013; Liu et al.,
268	2015]. Attached soot particle was soot aggregate adhering to the surface of the host
269	particle. Partly coated and fully embedded soot particles referred to part and full of soot
270	aggregate wrapped by other materials. Given the limited number of soot particles and
271	similar air mass sources of two cloud events, the following results and discussions are
272	based on a merged dataset from two cloud events.



Figure 1. TEM images of soot particles with different mixing structures including barelike (a), attached (b), partly coated (c) and fully embedded (d-f). The scale in the images
is 200 nm.

277 It can be seen in Fig. 2 that mixing states and structures of soot particles exhibit distinctly different characteristics between the pre-cloud and in-cloud periods. Soot-278 OM particles have a higher fraction in the in-cloud period ( $60 \pm 2.6\%$ ) than that in the 279 pre-cloud period ( $44 \pm 5.1\%$ ), but soot-S particles account for lower proportion in the 280 281 in-cloud period  $(31 \pm 3.7\%)$  than pre-cloud period  $(45 \pm 5.1\%)$ . Compared with precloud period, the proportion of soot particles with fully embedded structure in the in-282 cloud period shows a considerable increase (from  $14 \pm 2.8\%$  to  $38 \pm 2.9\%$ ). Specifically, 283 284 the proportion of soot particles fully embedded in OM, which increase from  $3 \pm 1.3\%$ in the pre-cloud period to  $29 \pm 2.6\%$  in the in-cloud period. Soot particles with partly 285 coated structure reduce from 54  $\pm$  5.7% in the pre-cloud period to 37  $\pm$  2.9% in the in-286

cloud period. The contribution of bare-like and attached soot particles is lower, ranging from 9  $\pm$  1.4% to 21  $\pm$  3.4%. The proportion of soot particles with LLPS was 2  $\pm$  1.0% and 11  $\pm$  1.6% in the pre-cloud and in-cloud period respectively, which were mainly completely coated by OM (**Fig. 1e-f**).



Figure 2. The number fraction of soot particles with different mixing structures coated
by sulfate (soot-S) or organics (soot-OM) in the pre-cloud and in-cloud periods.

291

The increase of soot-OM fraction in the in-cloud period is most likely attributed 294 to the cloud processing involving abundance of ozone and volatile organic compounds 295 (VOCs) [Lv et al., 2019; Wang et al., 2021c], which may also be attributed to the 296 preferential activation of soot-OM particles, but it is unlikely important. As observed 297 by Zhang et al. [2017a] at the same site, soot-OM particles are less activated than soot-298 S particles. More soot-OM particles than soot-S particles during the in-cloud period 299 may be related to LLPS, in which the soot aggregates are distributed in the organic 300 phase with similar polarity rather than inorganic phase [Brunamonti et al., 2015]. 301 Furthermore, as shown in Fig. 3, from the pre-cloud to in-cloud period, the average 302

303	coated fraction ( $F$ , the area ratio of soot aggregate embedded in host particle to soot
304	aggregate) increased from 46 $\pm$ 15% to 67 $\pm$ 14% for soot particles with partly coated
305	structure, and average relative coating thickness $(D_p/D_c)$ , the diameter ratio between
306	particle and soot aggregate) increased from 2.3 $\pm$ 1.2 to 4.4 $\pm$ 3.6 for soot particles with
307	fully embedded structure. Consistently, the average $D_{eq}$ of soot particles increased from
308	845 ±417 nm to 1214 ±898 nm after cloud processing. The increase of F, $D_p/D_c$ and
309	$D_{eq}$ indicates that soot aggregates obtain thicker coating due to cloud processing.



310

**Figure 3.** The distribution of F (0 < F < 1) for partly coated soot particles (a) and  $D_p/D_c$ 

312 (> 1) for fully embedded soot particles (b) in the pre-cloud and in-cloud periods. With 313 the increase of *F* and  $D_p/D_c$ , the volume ratio of the coated soot aggregates is higher,

314 and the coating layer is thicker.



315 **3.2** The impact of cloud process on the morphology of soot aggregates



Figure 4. The  $D_f$  (a, d, g), AR (b, e, h) and RN (c, f, i) of soot aggregates including overall soot aggregates, soot-S and soot-OM in the pre-cloud and in-cloud period. The number (a) is the amount of soot aggregates used to calculate the morphology parameters.  $D_f$  error bars are the error in the fitting of N and  $2R_g/d_p$  when calculating  $D_f$ . Box and whisker plot shows lower, median, and upper lines, denoting the 25th, 50th, and 75th percentiles, respectively; the lower and upper edges denote the 10th and 90th percentiles, respectively.

The morphology parameters of overall soot aggregates, including  $D_f$ , AR and RN, show a limited change from the pre-cloud to in-cloud period (**Fig. 4**). Consistently, the RES and INT soot aggregates during the stability period of cloud process also exhibit similar morphology with similar  $D_f$ , AR, and RN (**Fig. S5**). The above result indicates limited restructuring of soot aggregates upon cloud processing, which is inconsistent with previous studies reporting that high humidity condition facilitates the restructuring of soot aggregates [Qiu et al., 2012; Zhang et al., 2008], leading to larger  $D_f$  and RN, and lower AR.

Such inconsistency might be attributed to the chemically resolved reconstruction 332 of soot aggregates due to cloud processing. As shown in Fig. 4, the  $D_f$  of soot-S 333 aggregates was 2.16  $\pm 0.14$  in the pre-cloud period, and increased to 2.26  $\pm 0.07$  in the 334 in-cloud period. Differently, the  $D_f$  of soot-OM aggregates between the pre-cloud and 335 in-cloud periods were quite similar (2.17  $\pm$  0.11 and 2.16  $\pm$  0.06). Similar trend was 336 337 also observed for the AR and RN of soot aggregates (Fig. 4), with larger changes of AR and RN for soot-S aggregates from the pre-cloud to in-cloud periods. Such difference 338 indicates that organics lead to less compaction of soot aggregates, rather than sulfate. 339 340 The restructure of soot aggregates depends on the uptake of water by the coating materials [Guo et al., 2016], and the following evaporation of water [Enekwizu et al., 341 2021; Ma et al., 2013]. Complete encapsulation of organic coating produces lower 342 surface tension than partly coated structure and sulfate coating during water evaporation 343 [Schnitzler et al., 2017], resulting in less degree of reconstruction between monomers 344 of soot aggregates fully embedded in organics. Such phenomenon is similar to that 345 reported by Cross et al. [2010], who found that sulfuric acid coating caused a more 346 compact shape of soot aggregates than DOS (dioctyl sebacate) coating in laboratory 347 experiments. Therefore, with the increase contribution of soot-OM in the in-cloud 348 period, in particular the fully embedded structure (> 50%) (Fig. 2), the overall soot 349 aggregates show similar morphology parameters between pre-cloud and in-cloud 350

351 period.

The differences in morphology, mixing state and mixing structure from the 352 inactivated INT to activated RES particles during the stability period of cloud events 353 can also support the above hypothesis. The proportion of soot-OM in the RES particles 354  $(68 \pm 4.6\%)$  was higher than that in the INT particles  $(48 \pm 7.1\%)$ , and the proportion 355 of soot-OM particles with fully embedded structure in the RES particles  $(37 \pm 3.4\%)$ 356 was about 4 times that in the INT particles  $(9 \pm 3.5\%)$  (Fig. S6). Furthermore, the  $D_f$  of 357 soot-OM aggregates in the in-cloud period was smaller than that of the soot-S 358 359 aggregates for the RES particles. Higher proportions and lower  $D_f$  value of soot-OM aggregates lead to the limited change in the morphology of overall soot aggregates 360 between the RES and INT particles. Our previous study also found a phenomenon 361 362 inconsistent with the general concept that lower  $D_f$  of soot aggregates in the RES particles than that in the INT particles at the same site [Fu et al., 2020], which is most 363 likely due to the higher fraction of soot-OM in the RES particles (58  $\pm$  6.2%) than that 364 in the INT particles  $(28 \pm 5.0\%)$ . 365

#### **366 3.3 Effect of cloud processing in light absorption of soot particles**

Fig. 5 shows the  $E_{abs}$  of soot particles in the pre-cloud and in-cloud periods, based on the observed morphology, mixing state, and mixing structure. In order to illustrate the changes in the light absorption of soot particles within a representative size range upon cloud processing, five groups of  $D_p/D_c$  were selected, ranging from 1.5 to 3.9 in the pre-cloud period and from 3.1 to 5.5 in the in-cloud period (**Table S1**). The selection of the  $D_p/D_c$  range is based on the observed particles, as detailed in the supporting

373	information (Text S3). For bare-like soot particles, the $D_f$ of soot-S aggregates increases
374	from 2.16 $\pm$ 0.14 in the pre-cloud period to 2.26 $\pm$ 0.07 in the in-cloud period, resulting
375	in a limited absorption enhancement with the $E_{abs}$ of 1.02. As reported elsewhere, the
376	enhancement of light absorption of soot particles with attached structures is limited
377	$(E_{abs} < 1.1)$ [Adachi and Buseck, 2013; Schnaiter et al., 2003; Wang et al., 2021b].
378	Differently, the light absorption increased significantly for soot particles with partly
379	coated and fully embedded structures (Fig. 5a, b), associated with the increase of
380	coating degree including coated fraction and thickness [Adachi et al., 2010; Guo et al.,
381	2016]. With the increase of F and $D_p/D_c$ after cloud processing, $E_{abs}$ are 1.76 ±0.29 in
382	the pre-cloud period and 2.36 $\pm$ 0.38 in the in-cloud period for soot particles with partly
383	coated structure. For soot particles with fully embedded structure, $E_{abs}$ are 2.35 $\pm 0.28$
384	in the pre-cloud period and 2.63 $\pm 0.08$ in the in-cloud period. The $E_{abs}$ of soot particles
385	with LLPS was 1.78 $\pm$ 0.14 and 1.93 $\pm$ 0.07 in the pre-cloud and in-cloud period
386	respectively, which was smaller than that of soot particles without LLPS, with an
387	average of 26% over different $D_p/D_c$ ( <b>Fig. S8</b> ). The $E_{abs}$ of soot particles with different
388	mixing structures vary greatly, which may be one of the reasons for the lower $E_{abs}$ of
389	soot particles in some field investigation cases [Cappa et al., 2012; Fu et al., 2021], that
390	is, the attached and partly coated structures soot particles may account for the main
391	proportion. In the pre-cloud period, the average $E_{abs}$ of partly coated soot particles (1.76)
392	$\pm 0.29$ ) and the average $E_{abs}$ of fully embedded soot particles (2.35 $\pm 0.28$ ) were both
393	within the range reported by current laboratory studies (1-1.9 for partly coated structure
394	and 2.2-2.5 for fully embedded structure) [Chakrabarty and Heinson, 2018; Scarnato et

395	al., 2013], which were lower than the average $E_{abs}$ of soot particles with partly coated
396	$(2.36 \pm 0.38)$ and fully embedded $(2.63 \pm 0.08)$ structure in the in-cloud period.
397	Additionally, the $E_{abs}$ of soot-S and soot-OM particles with different mixing structures,
398	<i>F</i> and $D_p/D_c$ is in the range of 1.0-2.7 and 1.0-3.0 respectively, which is consistent with
399	previous studies [Peng et al., 2016; Schnaiter et al., 2003; Schnaiter et al., 2005].



400

Figure 5. Shape models of soot particles with different mixing structures, and  $E_{abs}$  of soot particles in the pre-cloud and in-cloud periods.

For the overall soot particles, the cloud process likely induces a pronounced increase of light absorption based on theoretical calculations. Corresponding to the changes in the proportion of soot particles with various mixing states and structures upon cloud processing, the  $E_{abs}$  of all soot particles increased from 1.57 ±0.16 in the pre-cloud period to 2.01 ±0.12 in the in-cloud period (**Fig. 5d**), and the cloud process

408	resulted in a factor of 1.29 $\pm$ 0.06 increase in $E_{abs}$ . Our calculated $E_{abs}$ of soot particles
409	in the pre-cloud period is higher than that in urban areas [Healy et al., 2015; Lan et al.,
410	2013; Nakayama et al., 2014], which may be due to the higher degree of aging of the
411	soot particles at this remote site. Higher $E_{abs}$ of soot particles (2.1) has also been
412	observed at the cloudy Mt. Tai in northern China [Wang et al., 2021a]. As indicated by
413	Peng et al. [2016], the $E_{abs}$ of soot particles could increase by a factor of 2.4 after several
414	hour's aging in polluted urban air. Our study indicates that cloud processing during one
415	event could increase the $E_{abs}$ of soot particles by 1.29 times, which underlines the
416	potential effect of cloud on rapid aging of soot particles.

# 417 3.4 A conceptual model for the impact on the mixing state and microphysical 418 properties of soot particles of cloud process

We came up with a conceptual model, as illustrated in **Fig. 6**, to reflect the changes 419 of mixing state and microphysical properties of soot particles from the pre-cloud to in-420 cloud period. In the pre-cloud period, soot particles come from long-range transport 421 422 and are mainly partly coated. Aged soot particles would be activated and grow into cloud droplets during cloud events. The mixing structure of soot particles is expected 423 to change since the water-soluble components mixed with the soot aggregates will be 424 425 dissolved in the cloud droplets. In addition, secondary organic compositions could also be formed through uptake and aqueous processing of VOCs [Fu et al., 2020; Zhang et 426 al., 2017a]. After the evaporation of cloud droplets, LLPS occurs and would lead to 427 two-phase solid particles composed of outer organic phase and inner inorganic phase 428 [Shiraiwa et al., 2013], and soot aggregates will redistribute in organic phase with 429

similar polarity. Although not emphasized, the soot aggregates have been found to be
dominantly embedded in the organic phase in the remote region [Yu et al., 2019], with
a large fraction (61%) of soot-OM aggregates distributed in outer organic phase likely
due to cloud processing. The production of organic matter in cloud and the occurrence
of LLPS correspond to the significant increase of soot-OM particles with fully
embedded structure, which would significantly enhance the light absorption of soot
particles.



437

Figure 6. Schematic diagram showing the change in morphology, mixing state, andmixing structure of soot particles throughout cloud processing.

#### 440 **4 Atmospheric implications and conclusions**

This study emphasizes that it is necessary to consider the encapsulating materials and mixing structures for better understanding of the impact of cloud on soot particles. Attributed to cloud processing, the soot-S aggregates become more compact, while the soot-OM aggregates do not. Meanwhile, the changes in morphology of soot aggregates,

445	mixing state and mixing structure of soot particles driven by cloud processing would
446	have substantial implications for the optical properties of soot particles. Theoretical
447	calculation shows that the $E_{abs}$ of soot-particles processed by cloud is as high as 2.01 $\pm$
448	0.12, which is 1.29 $\pm$ 0.06 times that of the pre-cloud period. Given that clouds cover
449	nearly 70% of the Earth [King et al., 2013], such a significant increase in $E_{abs}$ indicates
450	that cloud processing may represent a critical factor, which has not been revealed in the
451	evolution of light absorption of soot. The results also support the significance of
452	morphology, mixing state and mixing structure of soot particles in model calculations
453	to evaluate the climate impact of soot particles [Penner et al., 2006; Zhuang et al., 2010].
454	While such information is accounted for in particle-resolved aerosol model [Fierce et
455	al., 2020], it is still not considered in most climate models [Cooke and Wilson, 1996;
456	Park et al., 2011; Zhang et al., 2019]. In addition, field observations found high
457	uncertainty in the abundance of soot particles in ice clouds [Cozic et al., 2008;
458	Kupiszewski et al., 2016]. Our observations indicate that the morphological evolution
459	of soot aggregates due to warm cloud processing was mainly driven by the coating of
460	organic compounds, which may have potential influence on the ice nucleation activities
461	[Nichman et al., 2019]. Laboratory simulation experiments have shown a significant
462	enhancement of ice nucleation activity of soot particles processed by cloud, most likely
463	attributed to the modification of morphology by cloud processing [Mahrt et al., 2020].
464	Our results at the remote site surrounded by a large area of forest may represent the
465	mixing state and morphological characteristics of soot particles in the area with
466	significant biogenic VOCs precursors, and thus can be used as a reference for the

467 climate model to access the climatic impact of soot particles in similar regions.

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  Conflict of Interest
- There are no conflicts of interest in the article.

#### 476 Data Availability Statement

Data supporting the results are available in the supporting information. The 477 processed data presented in this available Zenodo 478 paper are on (https://doi.org/10.5281/zenodo.7073072) [Fu et al., 2022], including the number 479 fraction of soot particles with different mixing states and structures, the distribution of 480 F and  $D_p/D_c$ , morphology parameters of soot aggregates, and  $E_{abs}$  of soot particles in 481 the pre-cloud and in-cloud periods. The back trajectories data are calculated with hybrid 482 single-particle Lagrangian integrated trajectory 483 model (https://www.ready.noaa.gov/HYSPLIT\_hytrial.php) [NOAA, 2022]. The source code 484 of EMBS is from Wang et al. [2021b]. The source code of DDA developed by Bruce T. 485 Draine and Piotr J. Flatau, and the version used in this study is DDSCAT 7.3.3, which 486 can be obtained online (http://ddscat.wikidot.com/) [Draine and Flatau, 2019]. 487

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Figure1.



Figure2.

### a) pre-cloud

## b) in-cloud



Figure3.

*A<sub>coated</sub>* (the projected area of soot aggregate embedded in the host particle)

 $A_a$  (the projected area of soot aggregate)



# $A_p$ (the projected area of particle)

Figure4.



Figure5.



Figure6.



# \* inorganics organics soot

# long-range transport