



- 1 Atmospheric nanoparticles hygroscopic
- ² growth measurement by combined surface
- ³ plasmon resonance microscope and
- 4 hygroscopic-tandem differential mobility

5 analyzer

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22 ABSTRACT

23 The hygroscopic growth of atmospheric aerosols plays an important role in regional





radiation, cloud formation and hence climate. Aerosol hygroscopic growth is often 24 characterized by humidified tandem differential mobility analyzers (HTDMA), and Xie et 25 26 al. (2020) recently demonstrated that hygroscopic growth measurements of single-particle are possible using a surface plasmon resonance microscope-azimuthal rotation illumination 27 (SPRM-ARI). The hygroscopic properties of ambient aerosols are not uniform and often 28 exhibit large RH and size variabilities, due to different chemical compositions and mixing 29 states. To better understand the contribution of different aerosol components and establish 30 the link between the apparent hygroscopic properties of bulk aerosols and single-particle, 31 we conduct combined hygroscopic growth measurements of single-particle by a SPRM-32 ARI and bulk particles by an HTDMA. The atmospheric nanoparticles were grouped into 33 34 four subgroups labeled as EC, fly ash, OC and AS+OC based on the energy dispersive spectroscope results (Experimental information: 100nm~200nm, at noon, September 28th, 35 2021 and March 22th, 2022 in Hefei China). The relationship between the chemical 36 37 composition of a single nanoparticle in each subgroup and its hygroscopicity was characterized using SPRM-ARI. Then, the HTDMA data were shown to be fitted and 38 reconstructed by the constitutive particle size distributions calculated by the SPRM-ARI 39 measured GFs (growth factor), and the percentage of four subgroups in atmospheric 40 particles could also be found through the fitting. Based on the test results, we found the OC 41 content of AS+OC nanoparticles increased with the increase of particle size, and the OC 42 condensation may play a promoting role in the particle growth process. Lastly, this fitting 43 44 reconstruction method has a good correlation with the quantitative results of membrane 45 sampling, and can be used for reference to analyze the contribution of particle hygroscopicity and the growth mechanism of nanoparticle. 46

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48 Keywords: single atmospheric aerosols, hygroscopic growth, surface plasmon,49 nanoparticles, in situ imaging.





51 1. Introduction

The hygroscopicity of aerosol particles plays an important role in the haze and cloud 52 53 formation, and the climate change in the solar radiation and precipitation (Sloane and Wolff, 1985; Penner et al., 1993). Aerosols can be simply classified as hygroscopic and non-54 hygroscopic aerosols, which denotes the ability of aerosol particles to form a haze or cloud 55 56 (Abbatt et al., 2005). In addition, aerosol hygroscopicity can be further complicated due to the mixing or/and heterogeneous reaction of aerosol particles, consequently affecting their 57 abilities in the solar radiation absorption and cloud formation (Shi et al., 2012; Pilinis et 58 59 al., 1995; Agarwal et al., 2010). The recent research on the atmospheric convective clouds in the Amazon area has shown that nanoparticles can rapidly deliquesce and form the 60 clouds, which further enhances atmospheric convection and promotes the precipitation 61 (Fan et al., 2018). Because of the high concentration, the hygroscopic property of these 62 nanoparticles and its potential contribution to the cloud condensation is believed significant 63 (Tan et al., 2017). It thus becomes very important to understand the relationship between 64 the physicochemical property and the hygroscopic property of these nanoparticles, and the 65 contribution of the above relationship to the overall aerosol hygroscopicity growth process. 66 The technology for the hygroscopic growth characteristics of aerosols can be classified 67 as: ensemble particle and single-particle. A hygroscopic-tandem differential mobility 68 analyzer (HTDMA) commonly uses to measure the hygroscopic growth of multiple 69 particles in a specific electrical mobility size (Lei et al., 2014; Lei et al., 2018). Although 70 71 the HTDMA is reliable, the sizes of particles which could be analyzed is typically less than 72 300 nm (due to the DMA design) and the measured data represent the average of an 73 ensemble particle. For polydisperse particles, the result measured by the ensemble particle technique is the overall average of multiple particle measurements. The technique cannot 74 be used to measure the hygroscopic growth of particles in the large sizes of the size 75 distribution, which has significant contribution to the visibility, weather and climate studies, 76 77 but cannot be represented by the average (Morris et al., 2016). In contrast, the single-





particle technique offers the qualitative characterization of moisture absorption change due 78 79 to the chemical composition and material phase of individual particles (Krieger et al., 2012). 80 Depending on the particle capture methods, the single-particle hygroscopic growth imaging technologies can be grouped as the plate-deposition imaging and suspension 81 imaging (Hiranuma et al., 2008; Peng et al., 2001). The plate-deposition imaging by 82 traditional 2D imaging methods (e.g., Raman spectroscopy; environmental scanning 83 electron microscopy, ESEM; surface-enhanced Raman spectroscopy) will be affected by 84 the imaging angle and orientation(Ebert et al., 2002; Gupta et al., 2015; Craig et al., 2015; 85 Gen et al., 2017), making it difficult to measure the height change of imaging particles after 86 the hygroscopic growth. The particle imaging by the current 3D method (i.e., atomic force 87 88 microscopy) requires to scan the imaging particle for a long time period, resulting in a long measurement time and increasing the chance of particle puncture by the scanning probe 89 (Harmon et al., 2010; Morris et al., 2015). Without the issue encountered in the plate-90 91 deposition imagining (Braun et al., 2001; Lv et al., 2018), the suspension imaging methods (i.e., electric balance, optical tweezers) are however limited for particles in the sizes larger 92 than 500 nm, making it very challenging to measure the size change of nanoparticles during 93 the hygroscopic growth. More, it is difficult to assess the contribution of the hygroscopic 94 characteristics of single-particle in the atmosphere by the single-particle techniques (Li et 95 al., 2017; Mikhailov et al, 2015). Although ESEM/environmental transmission electron 96 microscopy (ETEM) can be used to estimate the concentrations of nanoparticles by 97 counting them on the ESEM/ETEM images, the process is very time-consuming and only 98 99 limited numbers of particles being counted. An efficient and accurate method for measuring the hygroscopic growth of an ensemble of atmospheric particles is required to 100 overcome the deficiencies experienced in the current methods. 101

The surface plasmon resonance microscopy (SPRM) can continuously perform the
imaging measurements of single binding events (Wang et al., 2010; Huang et al.,) and the
light intensity is directly related to the volume of the object (without the photo-bleaching





and fluorophore scintillation) (Young et al., 2018; Halpern et al, 2014). SPRM has been 105 used widely in the research involving biological targets (including cells, bacteria, viruses, 106 107 DNA molecules and proteins) and the local electrochemical reactions and catalytic reactions of nanomaterials (Syal et al., 2016; Maley et al., 2016; Wang et al., 2012). More, 108 the influence of the relative humidity on SPRM is very minor, *i.e.*, the imaging is not 109 affected by the water vapor on the imaging particle surface (Fang et al., 2016). In the 110 previous study, we used the azimuthal rotation illumination (ARI) to improve the single-111 direction SP imaging resolution, which enables a clear imaging of 50 nm PSL particles 112 (Kuai et al., 2019). The in situ SPRM-ARI imaging method was then applied to measure 113 the hygroscopic growth of 90 nm lab-generated particles (Xie et al., 2020). The above 114 115 example demonstrates that the SPRM-ARI can distinguish the size change of particles in the sizes less than the diffraction limit of the illumination light and accurately characterize 116 the volume change ratio of nanoparticles after the hygroscopic growth (Kuai et al., 2020). 117 Therefore, using the SPRM-ARI to perform an accurate hygroscopicity measurement of 118 atmospheric single nanoparticles and comparing it with the data measured by HTDMA are 119 expected to provide a rapid method to measure the contribution of hygroscopicity of 120 individual atmospheric particles to the overall hygroscopic growth of atmospheric particles. 121 In this work, the in situ SPRM-ARI imaging method was used in combination with the 122 HTDMA technique to characterize the hygroscopic growth of atmospheric nanoparticles 123 in the sizes of 100, 150 and 200 nm. The chemical compositions of atmospheric 124 125 nanoparticles were measured by the scanning electron microscopy (SEM) with an energy 126 dispersive spectrometer (EDS) and quartz-filter sampling analysis. By recombining the results measured by the HTDMA and the in situ SPRM-ARI, a rapid method was developed 127 to characterize the hygroscopic contribution of different subgroups atmospheric 128 nanoparticles. 129

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131 2. Materials and methods





132 2.1 Atmospheric nanoparticle collection and component analysis.

The collection of atmospheric nanoparticles was conducted at the Hefei Institute of Physical Science (Figure S1), Chinese Academy of Sciences, in Hefei, China (31° 54′ 31″ N, 117° 9′ 36″ E) at the noon of September 28th, 2021 and March 22th, 2022. As shown in Figure S1, the site is located in the northwest of Hefei City, where both high-temperature heat sources (thermal power plants) and residential areas are present. The collected nanoparticles can be considered as representative nanoparticles of inland cities in China.

As shown in Figure 1a, the sampled atmospheric particles were passed through a diffusion dryer (TSI 3062) to reduce the relative humidity of sampled stream. Particles with the electrical mobility sizes of 100, 150 and 200 nm were selected by a DMA (TSI 3081) operated by the DMA platform (TSI 3080). The atmospheric nanoparticles size distribution in the above two days was shown in Figure S2, and the median particle size was in the range of 100~150nm, which was consistent with the settled screening particle size.

For atmospheric nanoparticle on September 28th, 2021, classified particles were 145 collected on the substrate surface in the sample cell. Substrates of two types (in the same 146 size) were used: one is with the 45-nm-thickness gold coating, which is used for the *in situ* 147 SPRM-ARI hygroscopic growth measurement, and the other is commercial silicon wafer 148 used for the SEM measurement. The gold-coated surface (with thickness deviation of $\pm 5\%$ 149 within a 4 in² area) was prepared by an e-beam evaporator (K.J. Lesker, Lab 18) on a 150 standard microscope cover glass (thickness: 0.17 mm) at a vacuum pressure of $< 10^{-3} \text{ mTorr}$. 151 152 The size and element distributions of atmospheric nanoparticles were measured by the 153 SEM (SU8220, Hitachi, Japan) with an EDS (Aztec, Oxford, UK).

For atmospheric nanoparticle on March 22^{th} , 2022, except the gold coating substrate, the nanoparticles screened by DMA were collected by quartz filter (Tisch Environmental TE-20-301QZ). The sampling flow was 1.5L/min, and the collected nanoparticles were used for organic carbon (OC), elemental carbon (EC) and SO₄²⁻ content measurement. The content of OC and EC were measured by the traditional thermooptical method (Chow et





al., 2004).In the environment of pure gas He and mixed gas He/O2, the quartz filter 159 membrane was heated gradiently, and the CO₂ produced by catalytic oxidation was 160 quantitatively analyzed by laser detector (Ding et al., 2014). For the SO_4^{2-} measurement, 161 the quartz filter membranes with atmospheric nanoparticles were extracted with organic-162 free Milli-Q water (Direct-Q3, Millipore)) using an ultrasonic bath for 20 min, and the 163 164 content of SO₄²⁻ in the extract was measured by ion chromatography (ICS-3000, Dionex). The concentration of OC, EC, and SO42- reported here were corrected by the blank 165 membrane, and the concentration was converted into $\mu g/m^3$. 166

167 2.2 SPRM-ARI hygroscopicity measurement system.

As shown in Figure 1a, a Nafion dryer, a Nafion humidifier (Perma Pure, USA) and a 168 169 proportional-integral-differential (PID) controller were used to control the relative humidity in the sample cell. The Nafion exchangers enables users to obtain the dry gas (5% 170 RH) and the wet gas (95%RH). A close loop control with the feedback of measured RH of 171 172 the gas (via a RH sensor) was applied by varying the mixing ratio of dry and wet gases to achieve the set RH. The mixed gas with the desired RH is then directed into the sample 173 cell to humidify the DMA-classified atmospheric nanoparticles deposited on the Au-coated 174 surface. The particle deposition and humidification processes were consequently 175 performed via a two-way switch valve to reduce the interference of impurities during the 176 177 growth measurement.

Also shown in Figure 1a is the schematic diagram of the in situ SPRM-ARI system, 178 179 where the illumination source is a 635 nm parallel laser with the power of 54 mW. Two 180 orthogonal polarizers are used to eliminate reflected laser signals, allowing the surface plasmon (SP) signals to be collected as far as possible via a charge-coupled device camera 181 (Andor, Neo, UK). Using an objective $(100 \times \text{numerical aperture (NA) of } 1.49;$ Nikon, 182 183 Japan) and a pair of scanning galvanometers, the laser beams could be focused on any position in the back focal plane (BFP). In this configuration (as shown in Figure 1b), the 184 laser beam can rotate around the Au film at a specific angle (θ), which is called as the 185





azimuthal rotational illumination. Figure S3 shows the reflection BFP image of the 45 nm 186 Au film. The presence of the symmetrical dark arc on the image verified the existence of 187 188 the p-polarized SPs. The SP signals of atmospheric nanoparticles on the Au film were recorded as the cell RH was increased. Under the ARI mode, split circular spots are formed 189 if the particle size is less than the diffraction limit. By combining with the information of 190 the DMA classification and SEM measurement, the initial sizes of selected atmospheric 191 nanoparticles can be clearly determined (Xie et al., 2020). The statistics of the gray 192 intensity (GI) on the SP images is applied for the SP image processing (Huang et al., 2007). 193 It is because the GI is positively correlated with the volumes of imaging particles, and the 194 GF (growth factor) of imaging atmospheric nanoparticles can be obtained by the cube root 195 196 of the GI.

For the reference to the Köhler theory (Petters et al., 2007; Fan et al., 2020), the hygroscopicity parameter κ can be calculated using the GF measured by the SPRM-ARI system.

200
$$\kappa = \left(\frac{\exp\left(\frac{A}{D_d Gf}\right)}{RH} - 1\right)(Gf^3 - 1)$$
 (1)

$$201 \qquad A = \frac{4\sigma_{s/a}M_W}{RT\rho_W} \tag{2}$$

202 where Gf is the growth factor measured using the SPRM-ARI system, D_d is the dry diameter of the atmospheric particles, RH is the relative humidity in the sample cell (RH: 203 84%) and $\sigma s/a$ is the surface tension of the solution/air interface (s/a=0.0728 Nm⁻²). M_w is 204 the molecular weight of water, R is the universal gas constant, T is the environmental 205 temperature (298 K) and ρ_w is the water density. The deliquescence droplet was selected 206 as the default well-mixed solution. Note that the Zdanovskii-Stokes-Robinson (ZSR) 207 208 model was not used to calculate the k value because of the complex chemical composition of atmospheric particles. 209

210 **2.3 HTDMA**

The HTDMA was used to measure the hygroscopic growth of the above two days atmospheric nanoparticles in a narrow electrical mobility size distribution as those





- measured using SPRM-ARI. Figure S4 shows the HTDMA including a long DMA (TSI 213 3081), a humidification chamber and a scanning mobility particle sizer (TSI DMA 3081 214 215 and WCPC 3788) system. After passing through the diffusion dryer and particle charge neutralizer, atmospheric particles were introduced into the DMA1 to select atmospheric 216 particles in the electrical mobility sizes of 100 nm, 150 nm and 200 nm. Atmospheric 217 218 particles in the selected sizes were humidified in a Nafion pipe (at the flow rate of 0.3 L/min) with a sheath gas who's RH is controlled in the same manner as that in the SPRM-219 220 ARI humidification system. The same RH-controlled gas was also used for the sheath flow for the DMA2 operation. The sheath gas of the DMA2 was circulated via an air pump with 221 an air filter (Parker 9922-11-AQ). 222
- 223

224 3. Results and discussion

225 3.1 Combined SPRM-HTDMA measurements of 100 nm ambient aerosols

226 Figure 2 shows the SEM images of typical 100nm particles and their EDS mapping results on September 28th, 2021. According to the morphology and EDS mapping, atmospheric 227 particles were grouped into four subgroups labeled as: EC (Figure 2a), OC (Figure 2b), fly 228 ash (Figure 2c) and AS+OC (ammonium sulfate) (Figure 2d). The EDS of the 100 nm 229 atmospheric nanoparticles (given in Figure 2a) showed the dominant C element signal and 230 no obvious presence of the O element signal. It can be concluded that the 100 nm 231 atmospheric particulate shown in Figure 2a shall be in the EC group, which are mainly 232 233 produced by the incomplete combustion of fossil fuels (Jacobson et al., 2000). As for 234 nanoparticles in the OC group (in Figure 2b), an obvious O element signal was present in addition to the obvious C element signal. The sources of OC particles are very diverse. The 235 OC particles could be either from the direct emission of pollution sources or the secondary 236 237 formation of atmospheric volatile organic compounds (VOCs) (Zhang et al., 2017). In Figure 2c, the EDS mapping was mainly the Fe and O element signals. Note that the Si 238 element signal cannot be used to identify the particles because of the Si substrate. The 239





particle morphology in Figure 2c shows a cluster of spherical particles, and the Fe and O 240 element signals are evenly distributed over the whole SEM-ed particle. The particle shown 241 242 in Figure 2c is thus grouped as fly ash. The source of fly ash particles is likely from the high temperature combustion (Bondy et al., 2018). Atmospheric nanoparticles, shown in 243 Figure 2d, are ones containing OA and AS particles, which are widely distributed in rural 244 245 and urban areas. The EDS of the OA+AS particles shows obvious S element signals in addition to the C and O element signals. The unique characteristics of the particle 246 morphology (shown in Figure 2d) is the brighter color, which is due to the presence of 247 sulfate (because of the high conductivity of AS particles). The image also evidenced that 248 the mixing of OC and AS in the particle is not uniform in 100nm atmospheric nanoparticles. 249 250 Figure 3 shows the measurement of the hygroscopic growth of 100 nm atmospheric particles by in situ SPRM-ARI. The SPRM grayscale images are provided at the RH levels 251 of 30%, 60%, 80% and 90%. By collecting the GI of the SPRM images under various RH 252 253 conditions, the cube root ratio of the GI can represent the GF for the particle moisture absorption growth. It is found that, during the hygroscopic growth process of 100 nm 254 atmospheric nanoparticles, the *in situ* SPRM-ARI results were split circular spots, similar 255 to those obtained for the previous in situ SPRM-ARI obtained for the hygroscopic growth 256 of nanoparticles in a pure composition (Xie et al., 2020; Kuai et al., 2020). The above 257 observation also indicates that the atmospheric nanoparticles involved in this work were 258 less than the diffraction limit. The size of the measured particles was determined to be 100 259 260 nm by SEM.

As the RH increased, the *in situ* SPRM-ARI results can be grouped into three growth types depending on the GI variation. In the first growth type, the GI did not obviously change, and the speckled spots on the SPRM images basically remained their shapes at low RH, indicating that the GF of this 100 nm atmospheric particle did not change as the RH increased. According to the previous experience, this series of *in situ* SPRM-ARI results should be for particles either in the EC or fly ash group. In the second growth type, the GI





of split circular spots was gradually changed, *i.e.*, the GI of the spots slowly increased while 267 the circular spots remained segmented, indicating the size of the atmospheric particle 268 269 during the hygroscopic growth remained less than the diffraction limit. Compared to that obtained for particles in the first growth type, the SPRM-ARI results of particles in this 270 type shows the brightness of the spots had been increased. In other words, the GF of 271 272 atmospheric particles in this group was small, and their sizes were slowly increased during the hygroscopic growth. The GF of this nanoparticle was 1.25 when the RH reached 90%. 273 274 Based on the previous result⁴², this atmospheric particle should be in the OC group of atmospheric particles. The last growth type for the SPRM-ARI result is for the cases where 275 the shape of split circular spots had obviously changed during the hygroscopic growth, i.e., 276 277 the intensity of the spots had become bright and the split segments of the spots had merged, indicating that the particle size has obviously changed. No obvious phase transition of the 278 particle was however observed during the hygroscopic growth of particles in this last 279 280 growth types, *i.e.*, no obvious deliquescence relative humidity (DRH) detected. The GF was 1.4 when the RH reached 90%. Particles in the last growth type should be in the 281 AS+OC group of atmospheric particles and the deliquescence of the AS has obviously been 282 affected by the presence of liquid OC. 283

Subsequently, the 100nm bulk hygroscopic growth was analyzed synchronously by 284 HTDMA at 84% RH (i.e., after the hygroscopic growth Fig4). The particle size 285 distributions of 100nm EC/fly ash, OC, and AS+OC particles after the hygroscopic growth, 286 287 calculated using the measured GF, were also shown in the same figure. The HTDMA-288 measured size distribution was also fitted by the linear combination of the size distributions of EC/Fly ash, OC and AS+OC particles (after the hygroscopic growth), and the result of 289 the fitted size distribution is also given. By the fitting reconstruction, the percentages of 290 291 EC/Fly ash, OC and AS+OC particles in the HTDMA-measured size distribution can be obtained. It is found that 100 nm atmospheric particles primarily consisted of OC and 292 AS+OC particles, and the ratios of OC and AS+OC particle areas were 45.9% and 47.1%, 293





294 respectively.

In this part of the study, we classified the 100 nm atmospheric particles into four groups using the SEM images and EDS spectrum on September 28th, 2021. The GFs of these nanoparticles had then been measured by *in situ* SPRM-ARI and HTDMA. The hygroscopic growth of these 100nm particles in different groups can be observed at the ambient pressure by the SEM and SPRM-ARI techniques, and the proportion of different groups can be obtained by HTDMA peak fitting reconstruction.

301 3.2 Size-dependence of SPRM-HTDMA derived chemical composition.

Figure 5 and Figure 6 shows the SEM and SPRM-ARI results of atmospheric particles in 302 the 150 nm and 200 nm size on September 28th, 2021, and their associated EDS mapping 303 results are given in Figure S5-S6. Like the 100 nm atmospheric particles, 150nm and 304 200nm atmospheric particles can also be classified into four groups according to their 305 SEM+EDS mapping results. Compared with the results for the 100 nm atmospheric 306 307 nanoparticles, no obvious difference in each group was found. The only observable 308 changes were found in the SEM images of particles in the fly ash and AS+OC groups. The clustering status of particles in the fly ash group and the asymmetric shell structure of 309 particles in the AS+OC group becomes very obvious. Especially for 200 nm particles, the 310 AS was found only at the center of these particles (while the OC was widely distributed). 311

Figure 5b and 6b shows the SPRM-ARI results for 150nm and 200nm atmospheric 312 particles. The SPRM imaging results of these particles (shown in Figure S6 and S8) can 313 314 also be grouped into three growth types: no obvious gray signal change for EC/fly ash 315 nanoparticles; the gray signal enhancement but no obvious shape change in the gray circular spots for OC nanoparticles; and gray signal enhancements and clear shape fusion 316 for AS+OC nanoparticles. When compared with the SPRM-ARI results of 100 nm particles, 317 318 no observable change in those EC/fly ash and OC particles. However, for the AS+OC particles, their hygroscopic GF decreased as the particle size increased, particularly in the 319 high RH range (>80%). Especially for 200nm AS+OC particles, the GF at the 90% RH 320





decreased from 1.58 to 1.46. Combined with SEM images and EDS mapping results, he reason for the decrease of GF may be the gradual increase of organic content in AS+OC particles.

To clearly show the growth trend of AS+OC particles, the kappa (κ) values for the 324 particle sizes of 100-200 nm were calculated at 84% RH (given in Figure 7). At the 84% 325 326 RH, AS+OC particles would have been completely deliquesced under the assumption of homogeneous liquids. The κ value of pure ammonium sulfate (AS) particles in the same 327 328 size range was also given. It is found that the change of the κ value for OC and EC/fly ash particles is negligible in the calculated size range. For AS+OC particles, the κ value 329 decreases with the increase of particle size, which indicates that the proportion of organic 330 components (OCs) contained in these particles gradually increases. Thus, the above 331 observation of the κ value for AS+OC particles further confirms that, in the studied size 332 range of the aggregates (100-200 nm), the OC was grown on the sulfate core by the 333 334 adsorption and condensation.

Subsequently, the HTDMA was also used to analyze bulk hygroscopic growth of 150nm 335 and 200nm atmospheric particles at 84% RH, and the hygroscopic particle size spectrum 336 was fitted and reconstructed (Figure 8). It can be see that, as the dry atmospheric particle 337 size increased, the peak separation for OC and AS+OC particles after the hygroscopic 338 growth have changed obviously. The percentage of OC particles in selected atmospheric 339 particles gradually increased and reached 78.2% for 200 nm atmospheric particles. And, 340 341 the percentage of AS+OC particles in selected atmospheric particles gradually decreased 342 and, *i.e.*, most of AS+OC nanoparticles occurred at the border between the Aitken (10 nm-100 nm) and the condensation modes (100 nm-300 nm). The increase of the OC content in 343 AS+OC particles observed in both the SEM and SPRM measurements also concluded in 344 345 the HTDMA analysis, *i.e.*, the AS+OC hygroscopic particle peak moved to small particle size as the increase of the dry particle size, which also indicated that OC an important role 346 347 in the AS+OC nanoparticles growth.





348 **3.3** Comparisons of OC, EC and SO₄⁻

In order to determine the feasibility of combining SPRM atmospheric single nanoparticle 349 350 test results with HTDMA to evaluate OC, EC and AS+OC contents, the atmospheric nanoparticle hygroscopic growth characteristics on March 22, 2022 have been tested again, 351 and the OC, EC and SO₄⁻ content of different particle sizes were quantitatively analyzed. 352 Figure S9 was the SPRM test results of 100nm, 150nm and 200nm single-particle 353 hygroscopic growth. It can be seen that the atmospheric particulates can also be divided 354 into three categories according to the hygroscopic capacity: EC/flyash without hygroscopic 355 growth, OC with weak hygroscopic growth, and AS+OC with strong hygroscopic growth, 356 and with the increase of particle size, the hygroscopic capacity of AS+OC nanoparticles 357 358 decreased gradually. Comparing the hygroscopic growth results of atmospheric nanoparticles in two days, we found the GF of AS+OC nanoparticles on March 22, 2022 359 was higher, which may be due to the more SO₄-content of the mixed particles in this 360 361 experiment. Then, based on the SPRM measurement results, the HTDMA hygroscopic particle size spectrum in the same period could also be divided into three normal 362 distribution peaks (figure S10) and the GF results of SPRM are consistent with the peak 363 position of HTDMA at RH84%. Compared with fitting results on September 22, 2021, the 364 number concentration of atmospheric nanoparticles on March 22, 2022 was lower, and the 365 peak distribution of the three categories were relatively independent. According to the peak 366 area ratio, we found, with the increase of particle size, the proportion of EC was basically 367 368 about 14%, the proportion of OC gradually increased from 20% to 29%, and the content of 369 AS+OC gradually decreases from 65% to 56.4%, which indicated that the condensation of OC could play an adhesive role in the growth of AS+OC nanoparticles. Subsequently, by 370 measuring the EC, OC and SO_4^- contents of nanoparticles collected by the quartz film at 371 372 the same period (Figure 9), we found, with the increase of particle size, the OC content increased from 33% to 41.8%, and the SO_4^- content decreased from 56% to 46.96%. In 373 contrast, the OC content obtained by HTDMA peak splitting method was slightly less than 374





that of the quartz film sampling, which may be due to the OC content obtained by quartz film have included OC in AS+OC category and OC without hygroscopic capacity in EC/flyash category (such as dicarboxylic acid nanoparticles). Comparing the HTDMA peak fitting results and the quartz film sampling results, the analysis method based on the classification of particle hygroscopic characteristics is reliable, which may be helpful to analyze the hygroscopic contribution and growth mechanism of different types atmospheric nanoparticles.

382

383 4. Conclusions

The measurement of the hygroscopic growth of single nanoparticles is important for the analysis of the chemical composition and hygroscopic characteristics of atmospheric particles, and for the scientific studies involving atmospheric particles. The SPRM imaging technology offers its advantages in the hygroscopic growth measurement of single nanoparticles over the existing methods (e.g., SEM and AFM), particularly for irregular shaped particles. It is because the gray signal of the SPRM-ARI imaging can be positively correlated with the volume of the imaged particles.

In this work, atmospheric nanoparticles in the electrical mobility sizes of 100, 150 and 391 200 nm were classified by a DMA and collected for both single-particle and bulk 392 hygroscopic growth measurements. For single-particle measurements, based on the SEM-393 394 EDS data, atmospheric particles in a selected size could be grouped into four enabled as 395 EC, fly ash, OC and AS+OC groups. The hygroscopic growth factor of particles in each 396 above group were measured by the SPRM-ARI, and the hygroscopic growth of atmospheric particles due to the very minor change in the chemical composition (e.g., AS+ 397 OC particles) could be detected by the above measurements. 398

For bulk hygroscopic growth measurement, this work further demonstrates that the HTDMA-measured size distribution of atmospheric particles at a high RH (i.e., after the hygroscopic growth) could be reconstructed by the linear combination of the calculated





- size distributions of constitutive particles at a high RH. Besides, the HTDMA peak fitting experiment on March 22, 2022 shows that there was a good correlation between the method of HTDMA peak fitting reconstruction and the quartz film sampling. And, the experimental results of atmospheric nanoparticles hygroscopic growth for two days show that the OC condensation plays an important role in the growth of AS+OC nanoparticles. This reconstruction method has potential significance in predicting the contribution of atmospheric particulate hygroscopicity and particle growth mechanism.
- 409

410 Author contributions

- Zhibo Xie: Methodology, Validation, Visualization, Writing original draft, Writing –
 review & editing. Huaqiao Gui: Conceptualization, Resources. Jiaoshi Zhang: Funding
 acquisition, Methodology. Yang Liu: Methodology. Bo Yang: Investigation. Haosheng
 Dai: Data curation. Hang Xiao: Visualization. Douguo Zhang: Methodology, Writing –
 original draft, Investigation. Da-Ren Chen: Conceptualization, Validation. Jianguo Liu:
 Conceptualization, Resources, Funding acquisition.
 Competing Interest
- 419 The authors declare no competing financial interest.
- 420

421 Financial support

- 422 This work was supported by the National Natural Science Foundation of China (41905028,
- 423 91544218), the National Key R&D Program of China (2017YFC0209504), the Science
- and Technological Fund of Anhui Province (1908085MD114, 2108085MD139), and the
- 425 HFIPS Director's Fund (Nos. YZJJ2022QN04, BJPY2021A04).
- 426

427 Supplement

- 428 Figures S1–S10 are described in the text (a PDF is available).
- 429





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587 Figures Caption





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589 Figure 1. Schematic diagram of the *in situ* SPRM-ARI single nanoparticle moisture

absorption system: (a) for the complete system setup, and (b) for the gold-coated glass
substrate used for *in situ* SPRM-ARI.







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593 Figure 2. SEM and EDS mapping of typical 100 nm atmospheric particles collected in

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this study.









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atmospheric particles.







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Figure 4. HTDMA and peak fitting reconstruction for 100 nm atmospheric particles at
84% RH on September 28th, 2021.



Figure 5. (a) SEM images and (b) hygroscopic growth factors of atmospheric particles in
the 150 nm size.







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Figure 6. (a) SEM images and (b) hygroscopic growth factors of 200 nm atmospheric

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Figure 7. κ results for the 100 nm, 150 nm and 200 nm atmospheric particles at RH on September 28th, 2021.











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Figure 9. Quantitative results of atmospheric nanoparticles subgroups collected by quartz
filter membrane on March 22th, 2022.