# **1** Theoretical Framework for Measuring Cloud Effective

# 2 Supersaturation Fluctuations with an Advanced Optical System

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# 31 Abstract

Supersaturation is crucial in cloud physics, determining aerosol activation and influencing cloud droplet size distributions, yet its measurement remains challenging and poorly constrained. This study proposes a theoretical framework to simultaneously observe critical activation diameter and hygroscopicity of activated aerosols through direct measurements of scattering and water induced scattering enhancement of interstitial and activated aerosols, enabling effective supersaturation measurements. Advanced optical systems based on this framework allows minute- to second-level effective supersaturation measurements, capturing fluctuations vital to cloud microphysics. Although currently limited to clouds with supersaturations below  $\sim 0.2\%$  due to small scattering signals from sub-100 nm aerosols, advancements in optical sensors could extend its applicability. Its suitability for long-term measurements allows for climatological studies of fogs and mountain clouds. When equipped with aerial vehicles, the system could also measure aloft clouds. Therefore, the proposed theory serving a valuable way for both short-term and long-term cloud microphysics and aerosol-cloud interaction studies.

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### 59 **1. Introduction**

60 Clouds and fogs play critical roles in weather patterns and climate change, influencing both 61 precipitation and the radiative balance of the Earth's atmosphere. As such, they are central to accurate 62 weather and climate predictions. Despite their importance, representing clouds accurately in 63 atmospheric models remains a significant challenge (Seinfeld and Pandis, 2016). Supersaturation, 64 defined as the difference between the actual water vapor pressure (e) and the saturation vapor pressure 65 (es) which is typically expressed as a dimensionless quantity (e-es)/es, is a key parameter that links 66 aerosols to clouds through the process of aerosol activation, making it fundamental to cloud physics (Seinfeld and Pandis, 2016). Despite its importance, supersaturation is difficult to measure and remains 67 68 poorly understood and constrained (Yang et al., 2019). Previous studies have highlighted that other 69 than the mean supersaturation, supersaturation fluctuations also play critical roles in aerosol activation 70 and cloud droplet growth, ultimately influencing the evolution of cloud droplet size distributions 71 (Kaufman and Tanré, 1994;Sardina et al., 2015;Chandrakar et al., 2018;Chandrakar et al., 2020;Shaw 72 et al., 2020). For instance, cloud chamber experiments have shown that supersaturation fluctuations 73 promote aerosol activation and enhance aerosol activity (Shawon et al., 2021; Anderson et al., 2023), 74 particularly when the magnitude of these fluctuations is comparable to the mean supersaturation (Prabhakaran et al., 2020). Both experimental and theoretical analyses suggest that supersaturation 75 76 fluctuations can broaden cloud droplet size distributions (Chandrakar et al., 2016;Abade et al., 77 2018;Saito et al., 2019).

78 Supersaturation fluctuations arise not only from turbulent variations in the temperature and vapor 79 pressure fields but also from the growth and evaporation of droplets, which drive mass and heat 80 exchange between droplets and the surrounding air. As noted by Shaw et al. (2020), measuring 81 supersaturation remains a formidable challenge due to its extreme sensitivity to variations in water 82 vapor pressure and temperature. Although current techniques of water vapor and temperature measurements could not achieve accurately measurements of supersaturation, however, direct 83 84 measurements of water vapor pressure and temperature were previously used to estimate 85 supersaturation fluctuations, and obtained results have demonstrated that the supersaturation is indeed 86 a fluctuating quantity (Ditas et al., 2012;Siebert and Shaw, 2017).. Currently, cloud and fog 87 supersaturation are typically retrieved from aerosol activation measurements (Ditas et al., 2012) or 88 estimated from vertical velocity measurements and droplet size distribution measurements (Siebert 89 and Shaw, 2017; Cooper, 1989). Supersaturation parameterizations based on vertical velocity are 90 common in models (Abdul-Razzak et al., 1998), while field measurements often rely on aerosol

activation data to investigate supersaturation fluctuations and evolutions in clouds and fogs (Ditas et al., 2012;Hammer et al., 2014;Shen et al., 2018;Mazoyer et al., 2019;Zíková et al., 2020;Wainwright et al., 2021;Kuang et al., 2024). In addition, supersaturations were also estimated using the closure between cloud droplet number and cloud condensation nuclei (CCN) measurements at various supersaturations (Yum et al., 1998;Sanchez et al., 2016;Sanchez et al., 2021;Saliba et al., 2023).

96 In summary, direct measurements of water vapor pressure and temperature are essential for 97 quantifying supersaturations; however, they are nearly impossible with current technologies. 98 Supersaturation measurements from aerosol and cloud microphysics monitoring often reflect an 99 effective supersaturation that drives aerosol activation, which is indeed critical in cloud physics. The 100 complexity of cloud formation and evolution and the central role of supersaturation in these processes 101 underscore the need for precise measurement and representation of supersaturation. Advancements in 102 measuring and understanding supersaturation are essential for improving the accuracy of models and 103 reducing uncertainties in weather and climate predictions. In this study, we propose a theoretical 104 framework for using optical methods to observe effective supersaturations based on aerosol activation 105 in clouds and preliminarily validated utilizing data obtained from field campaigns. The feasibility of 106 employing an advanced optical system to measure supersaturation fluctuations were also explored and 107 discussed.

## 108 **2. Methods and Materials**

#### 109 **2.1 Observing effective supersaturations on the basis of κ-Köhler theory**

110 The concept of effective supersaturation was introduced based on aerosol activation 111 measurements (Hudson and Yum, 1997;Hudson et al., 2010), which could be defined as the 112 supersaturation in CCN chamber (CCN activation under constant supersaturation conditions) that 113 resulted in the same aerosol activation fraction with the observed aerosol activation fraction in clouds. 114 Quick fluctuations in supersaturation would result in the effective supersaturation, which directly 115 determined by aerosol activation, differs from the mean supersaturation which is determined by 116 average water vapor content and temperature. However, the concept of  $\kappa$ -Köhler theory is established 117 according to a constant supersaturation scenario, therefore provides a framework for deriving effective 118 supersaturation from aerosol activation measurements in clouds (Petters and Kreidenweis, 2007):

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$$S = \frac{D^3 - D_d^3}{D^3 - D_d^3 (1 - \kappa)} \cdot \exp\left(\frac{4\sigma_{s/a} \cdot M_{water}}{R \cdot T \cdot D_p \cdot g \cdot \rho_w}\right)$$
(1)

120 where S is the saturation ratio over an aqueous solution droplet with a diameter of D,  $D_d$  is the dry diameter,  $\sigma_{s/a}$  is the surface tension of solution/air interface, T is the temperature,  $M_{water}$  is the 121 molecular weight of water, R is the universal gas constant,  $\rho_w$  is the density of water, and  $\kappa$  is the 122 hygroscopicity parameter. The ĸ-Köhler theory tells that if the critical diameter of aerosol activation 123 ( $D_a$ ) and corresponding aerosol hygroscopicity parameter  $\kappa$  are known, the surrounding 124 supersaturation can be retrieved based on air temperature measurements and by assuming  $\sigma_{s/a}$  the 125 126 surface tension of water (as shown in Fig.S1a). Note that  $D_a$  and  $\kappa$  are not independent with each other, 127 average  $\kappa$  of aerosols with diameter  $D_a$  is needed. Previous studies have shown that the reduction in 128 surface tension (Nozière et al., 2010;Gérard et al., 2016;Ovadnevaite et al., 2017) associated with 129 surfactants in atmospheric aerosols can affect aerosol activation and, consequently, the derivation of 130 effective supersaturation. However, if the derivation of  $\kappa$  (as done in this study) assumes a constant 131 water surface tension, the impact of surface tension changes is minimized, as these effects are already 132 incorporated in the k calculation. Nonetheless, differences in surface tension between supersaturated 133 and subsaturated conditions (Davies et al., 2019;Petters and Kreidenweis, 2013;Liu et al., 2018), and 134 their impact on effective supersaturation, still exist. Additionally, prior research has suggested that 135 slightly soluble components in aerosols can influence k values under both supersaturated and 136 subsaturated conditions (Ho et al., 2010;Petters and Kreidenweis, 2008;Lee et al., 2022;Han et al., 137 2022;Riipinen et al., 2015;Wang et al., 2019;Whitehead et al., 2014). Therefore, κ observed under 138 subsaturated conditions would affect the derivation of effective supersaturation.

However, the simultaneous measurements of  $D_a$  and  $\kappa$  of activated aerosols with diameters around  $D_a$  are indeed challenging. The direct measurements of size-resolved activation ratio (AR) in clouds are essential for  $D_a$  retrievals through the following equation:

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$$AR(D_{p}) = \frac{MAF}{2} \left( 1 + erf\left(\frac{D_{p} - D_{a}}{\sqrt{2\pi\sigma}}\right) \right)$$
(2)

Where  $D_p$  is the particle diameter, MAF is the maximum activation fraction and  $D_a$  is critical activation diameter,  $\sigma$  is associated with the slope of the size-resolved AR curve near  $D_a$  and mostly influenced by the heterogeneous distribution of aerosols near  $D_a$  as well as supersaturation fluctuations (note that not effective supersaturation fluctuations). This formula was previously proposed by Rose et al. (2008) to fit the AR measurements and widely used in AR parameterizations (Tao et al., 2018b). Therefore, it typically requires a unique inlet system and a suite of instruments that measure the aerosol size distribution of both interstitial and total aerosol populations (Hammer et al., 2014;Zíková et al., 150 2020). Consequently, this is rarely done, even in ground fog measurements. Instead,  $D_a$  was usually 151 estimated from aerosol measurements and fog droplet size distributions measurements which 152 indirectly provides the number concentrations of activated aerosols therefore could be used in retrieving  $D_a$  through assuming that all aerosols larger than  $D_a$  are activated (Mazoyer et al., 153 154 2019; Wainwright et al., 2021; Shen et al., 2018) which brings uncertainty in  $D_a$  derivations due to that 155 not all aerosols larger than  $D_a$  are activated, because the MAF in Eq.2 does not equal to unit although 156 usually very close to (Tao et al., 2018b). For the effective supersaturation measured in aloft clouds, 157 the aerosol number size distributions inside and outside the cloud as well as cloud droplet number concentrations were used by Ditas et al. (2012) to derive  $D_a$ , and other approaches were also used 158 159 (Gong et al., 2023). The κ values were usually retrieved from size-resolved cloud condensation nuclei 160 measurements under certain supersaturations (Hammer et al., 2014; Mazoyer et al., 2019) or from 161 growth factor measurements (Wainwright et al., 2021) or sometime assumed due to the lack of 162 measurements. The  $\kappa$  of activated aerosols were not directly measured in these studies due to the 163 difficulty of the direct sampling of activated aerosols as well as subsequent hygroscopicity 164 measurements.

165 Two types of supersaturation fluctuations have been previously identified. The first type involves 166 fluctuations in supersaturation directly governed by water vapor pressure and temperature, as described by Siebert and Shaw (2017). These fluctuations are linked to turbulence and water phase 167 168 changes that influence water vapor pressure and temperature. The second type concerns fluctuations 169 in effective supersaturation, which are associated with the activation and deactivation processes of 170 aerosols, as noted by Ditas et al. (2012). The first type of fluctuations dictates the instantaneous growth 171 and evaporation of droplets, thereby controlling the activation and deactivation of cloud droplets. As 172 such, the second type of fluctuation is inherently driven by the first type. The theoretical framework 173 proposed in this study enables the measurement of fluctuations in effective supersaturation.

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# 175 **2.2 Field measurements**

176 Kuang et al. [2024] developed an advanced aerosol-cloud sampling system designed to measure 177 fog and cloud activation processes. This compact, integrated system can automatically switch between 178 different inlets, including PM<sub>1</sub> (particles and droplets with an aerodynamic diameter  $< 1 \mu m$ ), PM<sub>2.5</sub> 179 (particles and droplets with an aerodynamic diameter  $< 2.5 \mu m$ ) impactor, and Total Suspended 180 Particles (TSP, encompassing all particles and droplets) (as shown in Fig. S2). When combined with instruments that measure aerosol physical, optical, and chemical properties, this system is well-suited
for investigating cloud microphysics and chemistry. It was utilized in the AQ-SOFAR campaign,
dedicated to studying AQueous Secondary aerOsol formation in Fogs and Aerosols and their Radiative
effects in the North China Plain (Kuang et al., 2024).

185 During this campaign, several radiation fog events were observed, enabling the measurement of 186 size-resolved AR curves, aerosol hygroscopicity as well as chemical compositions of interstitial and 187 activated aerosols within fogs. These measurements provided insights into the evolution of 188 supersaturations (Kuang et al., 2024). Notably, aerosol hygroscopicity was determined using a 189 humidified nephelometer system, located downstream of the inlet system. This system measured 190 multiwavelength scattering coefficients (450 nm, 525 nm, 635 nm) under both nearly dry (RH<20%) 191 and humid conditions (RH~84%), offering aerosol hygroscopicity data based on the optical theory 192 proposed by Kuang et al. (2017). The size-resolved AR curves and aerosol chemical compositions 193 were obtained through the aerosol size distribution and the aerosol mass spectrometry measurements 194 downstream of the inlet system. A schematic of the inlet system and associated instruments is provided 195 in Fig. S1. Further details about the entire experimental setup, size-resolved AR calculations as well 196 as data analysis about mass spectrometer measurements can be found in Kuang et al. (2024).

197 In addition, the particle number size distributions (PNSDs) in dry state, which range from about 198 10 nm to 10 µm, were jointly measured by a Twin Differential Mobility Particle Sizer (TDMPS, 199 Leibniz-Institute for Tropospheric Research, Germany) or a scanning mobility particle size 200 spectrometer (SMPS) and an Aerodynamic Particle Sizer (APS, TSI Inc., Model 3321) in six field 201 campaigns conducted on the North China Plain which are detailed in Kuang et al. (2018). The mass 202 concentrations of black carbon (BC) were measured using a Multi-Angle Absorption Photometer 203 (MAAP Model 5012, Thermo, Inc., Waltham, MA USA) or an aethalometer (AE33) (Drinovec et al., 204 2015) in these field campaigns. Details about these measurements and quality assurance was 205 introduced in Kuang et al. (2018).

#### 206 **2.3 Method of simulating scattering coefficients of interstital aerosols and activated aerosols**

For each paired PNSD and BC mass concentration, the size distribution of dry-state  $PM_1$  was obtained using the following formula (the penetration curve shape from Gussman et al. (2002) was also included for considering the non-ideality cutoff of the impactor, and assuming aerosol density of 1.6 g/cm<sup>3</sup> for converting aerodynamic diameter to mobility diameter) :

211 
$$PNSD(D_p)_{PM_1} = PNSD(D_p) \times R(D_p)$$
 (3)

212 Where R(Dp) is the penetration ratio of aerosols as a function of particle diameter  $D_p$  of the PM<sub>1</sub> impactor. Further, PNSD  $(D_p)_{PM_1}$  and the BC mass concentration was used to simulate the size-213 resolved aerosol scattering coefficients  $(d\sigma_{sp}/dlogDp)$  at 450 nm, 525 nm and 636 nm that is 214 215 consistent with the angular truncation and light source nonideality of Auora 3000 nephelometer 216 (Müller et al., 2011), where  $\sigma_{sp}$  represents aerosol scattering coefficient. In this Mie calculation, the 217 shape of black carbon mass size distributions are consistent with the one used in simulations of Kuang 218 et al. (2017) assuming fractions of BC mass that are externally mixed is 0.5. Details about the Mie 219 theory calculations can also be found in Ma et al. (2011) and Kuang et al. (2017).

With given size-resolved AR curve that produced using Eq.2, the size-resolved aerosol scattering coefficients of interstitial aerosols can be calculated using the following formula:

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$$d\sigma_{sp,inter}/dlog D_{p} (D_{p}) = d\sigma_{sp}/dlog D_{p} (D_{p}) \times (1 - AR(D_{p}))$$
(4)

223 The size-resolved aerosol scattering coefficients of activated aerosols can be calculated using:

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$$d\sigma_{sp,act}/dlog D_{p}(D_{p}) = d\sigma_{sp}/dlog D_{p}(D_{p}) - d\sigma_{sp,inter}/dlog D_{p}(D_{p})$$
 (5)

Scattering coefficients of total aerosol populations (interstitial plus activated) and interstitial aerosols can be derived through integration of  $d\sigma_{sp}/dlogD_p$  (D<sub>p</sub>) and  $d\sigma_{sp,inter}/dlogD_p$  (D<sub>p</sub>).

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# **3. Theoretical Framework and Concept Design of the Advanced Optical System**

#### **3.1 Theory of Observing Critical Activation Diameter Using Scattering Measurements**

230 The typical shape of size-resolved AR curves observed in atmospheric fogs and clouds is 231 illustrated in Fig. 1a (Ditas et al., 2012;Hammer et al., 2014;Zíková et al., 2020;Wainwright et al., 232 2021;Kuang et al., 2024). In clouds, aerosols can be classified as either activated aerosols, which form 233 cloud droplets, or inactivated aerosols, which remain as interstitial aerosols. The critical diameter that 234 distinguishes interstitial aerosols from cloud or fog droplets varies depending on the supersaturation 235 (Kuang et al., 2024). A diameter of 2.5 µm is typically suitable for surface fogs with relatively lower 236 supersaturations (<0.1%), while 1 µm is more appropriate for aloft clouds with higher supersaturations 237 (>0.1%) (Mazoyer et al., 2019;Kuang et al., 2024;Lu et al., 2020). The typical AR curve shows that most aerosols larger than  $D_a$  are activated, while most smaller aerosols remain inactivated. As a result, 238

- the scattering properties, such as size-resolved scattering coefficients (Fig.1a), the scattering Ångström
- 240 exponent (SAE) and its wavelength dependence, which are directly related to aerosol size distribution,
- 241 differ significantly between interstitial and activated aerosols.



**Figure 1**. (a)The typical shape of size-resolved aerosol activation ratio (AR) curve produced using the function of Eq.2, with the Da of 400 nm, the MAF of 0.95 and the  $\sigma$  of 30 (as an example). The average PNSD observed in the North China Plain from six campaigns as introduced in Sect2.2 and the example AR curve was used to simulate an example of the size-resolved aerosol scattering ( $\sigma_{sp}$ ) distributions of interstitial and activated aerosols at 525 nm; (b) Relations between observed  $D_a$  and  $f_{sp}$  during the AQ-SOFAR campaign using 1 and 2.5 µm as the threshold of interstital aerosols, with the scatter points are colored with corresponding SAE of total dry state PM<sub>1</sub> aerosols. (c) Comparisons of all prescribed  $D_a$  and predicted  $D_a$  values represented by scatter points, they are further binned with interval of 50 nm, averages and standard deviations represented by purple squares and their error bars, black squares represent relative uncertainty of the right axis at each bin; (d) The comparisons of  $D_a$  retrieved using activation ratio observations and those predicted using scattering observations as inputs of the trained model, dashed lines represent 1:1 lines.

- If we focus on PM<sub>1</sub> of the total dry aerosol population (the reasoning for this is discussed in Sect.
- 243 S1 of the supplement), the scattering fraction of interstitial aerosols in the total dry PM<sub>1</sub> population,
- 244 defined as  $f_{sp} = \sigma_{sp,PM_1,inter}(dry, 525 nm) / \sigma_{sp,PM_1,all}(dry, 525 nm)$ , where
- 245  $\sigma_{sp,PM_1,inter}(dry, 525 nm)$  is the scattering coefficient of PM<sub>1</sub> interstitial aerosols in a dry state at a
- wavelength of 525 nm, and  $\sigma_{sp,PM_1,all}(dry, 525 nm)$  is that of all PM<sub>1</sub> aerosols, is likely to be highly

correlated with  $D_a$ . Generally, the larger the  $D_a$ , the higher the  $f_{sp}$ . This relationship was directly confirmed using  $D_a$  and the scattering properties of dry PM<sub>1</sub> interstitial and total aerosols during the AQ-SOFAR campaign, as shown in Fig. 1b, that observed  $D_a$  correlates highly with observed  $f_{sp}$ (R=0.88). However, at a given  $D_a$ ,  $f_{sp}$  can vary significantly, and these variations are closely related to the SAE of all dry PM<sub>1</sub> aerosols, which are mainly determined by aerosol size distribution. In fact, aside from the size distribution of the total aerosol population that determines SAE, the shape of the AR curve also plays a significant role in the variations of  $f_{sp}$ .

254 The nephelometer measures the aerosol scattering coefficient at three wavelengths, enabling 255 direct measurements of the SAE for both the total dry-state PM<sub>1</sub> aerosols and the interstitial aerosols. Therefore, the relationship between  $f_{sp}$  and  $D_a$  can be further constrained by the SAE of interstitial 256 257 and activated aerosols, as well as their wavelength dependence. This implies that a simple formulaic relationship between  $f_{sp}$  and  $D_a$  may not exist. However, the six scattering parameters 258  $\sigma_{sp,PM_{1},inter}(dry,\lambda)$ —at 450 nm, 525 nm, 635 nm, and  $\sigma_{sp,PM_{1},all}(dry,\lambda)$  at 450 nm, 525 nm, 635 259 nm—contain both the  $f_{sp}$  information and the SAE characteristics of both aerosol groups, thus 260 261 potentially be used to accurately retrieve  $D_a$ . Machine learning techniques, which are well-suited for 262 handling complex relationships, can be applied to this problem.

263 This assumption was tested using Mie theory, based on aerosol size distributions sampled during 264 six campaigns conducted in the North China Plain region (Kuang et al., 2018). For each aerosol size 265 distribution, we randomly assumed different activation curves using Eq.2. That is, for each PNSD from 266 those campaigns, the scattering coefficients of submicron interstitial and activated+interstital aerosols 267 at wavelengths of 450 nm, 525 nm and 635 nm corresponding to nephelometer case under 100 size-268 resolved AR scenarios were simulated using the procedure. And each size-resolved AR curve was 269 produced by using randomly produced  $D_a$ ,  $\sigma$  and MAF as inputs of Eq.2. In the random step, the range of  $D_a$  is 100-700 nm, the range of  $\sigma$  is 1-30, the range of MAF is 0.5-1. In each pair, simulated 270 271  $\sigma_{sp,PM_{1},inter}(dry,\lambda)$ —at 450 nm, 525 nm, 635 nm, and  $\sigma_{sp,PM_{1},all}(dry,\lambda)$  at 450 nm, 525 nm, 635 nm was the x values of the random forest model, corresponding D<sub>a</sub> is the y value of the random forest 272 273 model, and the random forest package from Python Scikit-Learn machine learning library 274 (http://scikit-learn.org/stable/index.html) is used for this purpose. With these configurations, more 275 than million pairs are simulated. To preliminarily validate this approach, we randomly selected 75% 276 of the simulated data pairs for training the model, while the remaining 25% were used for validation.

277 The results, shown in Fig. 1c, indicate that this approach could retrieve  $D_a$  with an uncertainty of 278 less than 10% for  $D_a$  larger than 250 nm, and even as low as ~6% for  $D_a$  larger than 350 nm. However, the uncertainty increases as  $D_a$  decreases, particularly for  $D_a$  smaller than 250 nm. The larger 279 280 uncertainty at smaller  $D_a$  is since aerosols smaller than 250 nm typically contribute less than 10% to 281 total scattering in the dry state, making  $f_{sp}$  less sensitive to variations in  $D_a$ . This issue becomes more 282 pronounced when  $D_a$  is less than 100 nm, as aerosols smaller than 150 nm generally contribute 283 negligibly to total aerosol scattering [Kuang et al., 2018]. This method was further validated using 284 observations from the AQ-SOFAR campaign. In this validation,  $D_a$  values were first predicted using 285 aerosol scattering observations with the trained model and then compared with  $D_a$  values retrieved 286 from size-resolved AR measurements, as shown in Fig. 1d. It should be noted that the impactor 287 operates in a sequence of PM<sub>1</sub>, PM<sub>2.5</sub>, TSP, and then back to PM<sub>1</sub>, with the flow alternating between 288 a thermodenuder and bypass every 10 minutes for each inlet. To calculate size-resolved AR curves, 289 we assumed that aerosol populations remained unchanged during the 30-minute period (based on 290 comparisons between PM1/PM2.5 and TSP inlets), which can sometimes introduce significant 291 uncertainties in the size-resolved AR calculations. When using PM<sub>2.5</sub> as the threshold, the much lower 292 number concentrations of aerosols larger than 400 nm can introduce more uncertainty in  $D_a$  retrievals, partially explaining the lower performance in Fig. 1d when using the PM<sub>2.5</sub> threshold. 293

# 294 **3.2 Method of observing Hygroscopicity of Activated Aerosols**

Measuring the hygroscopicity  $\kappa$  of activated aerosols at the critical activation diameter  $D_a$  under 295 varying supersaturations is challenging, not only due to technical limitations but also because of the 296 297 inherent variability in  $D_a$ . Kuang et al. (2017) introduced a novel optical method for observing aerosol 298 hygroscopicity by using the aerosol light scattering enhancement factor f(RH) that associated with 299 aerosol hygroscopic growth. This method is particularly suitable for the objectives outlined here. The 300 method requires SAE and light scattering enhancement factors f(RH) of activated aerosols as inputs, 301 and retrieved  $\kappa$  can be termed as  $\kappa_{act,f(RH)}$  which represents the overall hygroscopicity of activated 302 aerosols and can be understood as the average  $\kappa$  of activated aerosols with the scattering contribution of each aerosol particle as the weight (Kuang et al., 2020). The scattering coefficients of activated 303 304 aerosols at multiwavelength can be calculated as  $\sigma_{sp,PM_{1},act}(dry,\lambda) = \sigma_{sp,PM_{1},all}(dry,\lambda) - \sigma_{sp,PM_{1},all}(dry,\lambda)$  $\sigma_{sp,PM_1,inter}(dry,\lambda)$ , therefore corresponding SAE can be obtained. The f(RH) of activated aerosols 305 306 at 525 nm can be calculated as the following:

$$307 \quad f(RH)_{act} = \frac{\sigma_{sp,PM_{1},all}(RH,525\,nm) - \sigma_{sp,PM_{1},inter}(RH,525\,nm)}{\sigma_{sp,PM_{1},all}(dry,525\,nm) - \sigma_{sp,PM_{1},inter}(dry,525\,nm)} \tag{6}$$

During the AQ-SOFAR campaign, a humidified nephelometer system consisting of two 308 309 nephelometers—one measuring aerosol scattering in the dry state and the other at a fixed RH of 84%— 310 was placed downstream of the PM<sub>1</sub> impactor. This setup allows for the humidification of dry-state 311 interstitial aerosols and total aerosol populations to a high RH (e.g., above 80%), facilitating the 312 required measurements, therefore severs one choice. The Retrieved  $\kappa_{act,f(RH)}$  under different  $D_a$ 313 conditions are shown in Fig.2a, demonstrating significant variations in  $\kappa_{act,f(RH)}$  and its variations 314 need to constrained. Also, the derived  $\kappa_{act,f(RH)}$  are compared those estimated from aerosol chemical compositions measurements ( $\kappa_{act,chem}$ , details about calculation methods can refer to Kuang et al. 315 (2020)), as shown in Fig.2b and in general agree. Note that the mass spectrometer could not identify 316



**Figure 2.** (a) Retrieved  $\kappa_{act,f(RH)}$  under different  $D_a$  conditions; (b) Comparison between  $\kappa$  of activated aerosols retrieved from the optical method ( $\kappa_{act,f(RH)}$ ) and estimated from aerosol chemical composition measurements ( $\kappa_{act,chem}$ ) ;(c) Comparisons between effective supersaturations (SSs) derived from size-resolved AR measurements as well as  $\kappa_{act,chem}$  (SS<sub>AR</sub>) and from the optical measurements (SS<sub>opt</sub>). Dashed red lines represent 1:1.

all aerosol components, and assumptions about the mixing rule as well as densities of components would bring uncertainties (Kuang et al., 2021). The comparisons between effective supersaturations derived from size-resolved AR measurements as well as  $\kappa_{act,chem}$  and from the optical method are shown in Fig.2c. On average, 0.002% of SS bias are observed due to the bias of  $D_a$  which associated more with assumptions made in  $D_a$  retrievals as previously discussed. As demonstrated by Kuang et al. (2024), for the fog case in the campaign, the threshold of 2.5 µm should be used, however, does not affect the comparisons here.

Qiao et al. (2024) developed an advanced outdoor nephelometer system that measures aerosol
 dry scattering coefficients and scattering coefficients at nearly ambient RH without the need for

humidifying the sample air by placing the entire nephelometer system in ambient air, with the instruments protected by a specially designed enclosure. This innovative design offers new insights into the hygroscopicity measurements of activated aerosols. Under cloud conditions, where the ambient RH is close to 100%, aerosol scattering under subsaturated conditions can be measured directly by applying heater.

# 331 **3.3 Concept Design of the Advanced Optical System for Measuring Effective**

332 Supersaturations



**Figure 3**. Concept design of the advanced optical system with different number of optical sensors, (a) using two nephelometers or other optical sensors; (b) using four nephelometers or other optical sensors. The heater upstream of the sample is used to reduce the relative humidity (RH) to below 60%, ensuring the evaporation of most of the water content, to make sure the consistency of needed PM<sub>1</sub> cut. The cooler upstream of the 'wet' nephelometer increases the sample RH to approximately 90%, allowing hygroscopicity measurements under conditions close to supersaturation.

Based on the proposed optical methods for measuring  $D_a$  and  $\kappa_{act,f(RH)}$ , a conceptual design for outdoor instruments capable of measuring effective supersaturation with relatively high time resolution can be envisioned, as shown in Fig. 3a. The aerosol-cloud sampling system includes two inlets: one equipped with a PM<sub>1</sub> or PM<sub>2.5</sub> impactor (depending on cloud type) to sample interstitial aerosols, and another with a TSP inlet to sample both interstitial aerosols and cloud/fog droplets. A PM<sub>1</sub> impactor is placed downstream of the inlet system, where the RH of the sample air is reduced to 70% (as discussed in Sect. S1 of the manuscript) through heater. Downstream of the PM1 impactor, 340 the sample flow is split into two streams: one is further dried to an RH below 10% before aerosol 341 scattering coefficients are measured by the "dry" nephelometer, and the other is passed through an 342 intelligent cooler to ensure the sample RH in the "wet" nephelometer remains close to 90%. The 343 sample air is automatically switched between the interstitial inlet and the TSP inlet at set intervals, 344 such as one minute for each inlet, enabling minute-level measurements of effective supersaturations. 345 While the nephelometer can output scattering measurements every second, reliable data can only be 346 achieved at intervals of around 30 seconds (exact values can be determined through future testing) due 347 to the residence time of aerosols in the nephelometer and potential light source instability. If four 348 nephelometers are available, a more advanced optical system can be designed (Fig. 3b) that does not 349 require switching between the interstitial inlet and the TSP inlet. Instead, two nephelometers would be 350 placed downstream of the interstitial inlet and two downstream of the TSP inlet, enabling higher time 351 resolution effective supersaturation measurements. Other types of optical instruments exist that can 352 achieve stable second-level aerosol scattering or extinction measurements with a stable laser light 353 source [Moise et al., 2015; Zhou et al., 2020]. Therefore, with the development of suitable optical 354 instruments, it may be possible to achieve second-level effective supersaturation measurements.

# **4. Discussions on Limitations and Advantages**

356 The proposed theoretical framework enables simultaneous measurements of  $D_a$  and  $\kappa$  for 357 activated aerosols, leveraging the high time resolution of optical instruments to potentially provide 358 second-level measurements of supersaturation. However, several limitations should be discussed and 359 might be improved upon: (1) Shape of size-resolved AR curve: Cloud chamber studies have shown 360 that supersaturation fluctuations can lead to the coexistence of particles with the same critical 361 supersaturation as both interstitial aerosols and cloud droplets (Shawon et al., 2021). This results in 362 size-resolved AR curves deviate more from stepwise shape, a phenomenon also observed in some field 363 measurements (Henning et al., 2004; Mertes et al., 2007). Despite this, a critical diameter  $D_a$  still exists, 364 and such non-ideal curves can be treated a high standard deviation  $\sigma$  in the activation error function 365 (Eq. 2), which does not fundamentally undermine the proposed framework, however, should be further 366 checked for different cloud types. (2) Measurement of  $\kappa$ : Although the framework measures the 367 overall  $\kappa$  of activated aerosols, the  $\kappa$  needed for supersaturation calculations is that of aerosols near  $D_a$  ( $\kappa_{D_a}$ ). For  $D_a > 200$  nm, the derived  $\kappa_{act,f(RH)}$  can provide a first-order estimate of  $\kappa_{D_a}$ , based on 368 369 observed size-dependent characteristics of  $\kappa$  values (Liu et al., 2014;Shen et al., 2021;Wang et al., 370 2024), though more comprehensive evaluations are needed. Additionally,  $\kappa$  measured under

371 subsaturated conditions differs from that under supersaturated conditions (Tao et al., 2023) might also 372 bring some uncertainties. However, as shown in Fig. S1b, even a bias of 0.1 in  $\kappa$  only result in a ~0.01% 373 bias when SS is ~0.1% and a ~0.005% bias when SS is ~0.05% in supersaturation retrievals, making the first-order estimates of  $\kappa_{D_a}$  from optical measurements generally suitable for supersaturation 374 375 observations. (3) Limitations in  $D_a$  Retrievals: Current techniques using aerosol scattering 376 measurements at visible wavelengths (e.g., nephelometers) are reliable only for  $D_a > 100$  nm as shown 377 in Fig.1a, limiting effective supersaturation measurements to less than 0.21% (assuming a typical  $\kappa$  of 378 0.3). This restriction makes the technique most applicable to fog and stratus or stratocumulus cloud 379 measurements. However, incorporating scattering measurements at ultraviolet wavelengths could 380 improve sensitivity to smaller  $D_a$  and lower  $\kappa$ , enabling measurements in conditions with higher 381 effective supersaturation and a broader range of cloud types in the future.

382 The uncertainty in effective supersaturation observations using this framework primarily arises 383 from the uncertainties in deriving  $D_a$  and  $\kappa_{D_a}$ . The uncertainty in  $D_a$  observations using the Aurora 384 3000 nephelometer as the optical sensor under varying conditions is detailed in Fig. 1c. Factors affecting the accuracy of  $\kappa_{D_{\alpha}}$  include: (1) the size dependence of  $\kappa$  of activated aerosols; (2) 385 uncertainties related to surface tension, slightly soluble components, and other factors that lead to 386 387 differences in  $\kappa$  differences under subsaturated and supersaturated conditions. Based on previous 388 studies on the size dependence of  $\kappa$  (Peng et al., 2020) and the differences between subsaturated and 389 supersaturated conditions (Whitehead et al., 2014;Liu et al., 2018;Tao et al., 2023), a 50% uncertainty 390 (three times the standard deviation) was assumed in the derivation of  $\kappa_{D_a}$  for the uncertainty analysis. 391 Using this approach, the uncertainty in effective supersaturation measurements, estimated through the 392 Monte Carlo method, is shown in Fig. 4. The analysis indicates that applying this framework with the 393 Aurora 3000 nephelometer as the optical sensor results in an uncertainty of approximately 5%. The 394 precision of effective supersaturation measurements is directly linked to the accuracy of the optical 395 sensor's scattering signal. For example, the Aurora 3000 has an accuracy of 1 Mm<sup>-1</sup>, which leads to 396 different levels of precision in  $D_a$  and hygroscopicity measurements depending on the scattering signal 397 strength. If the scattering signal from the total aerosol population is 100 Mm<sup>-1</sup>, the precision of the 398 observed interstitial aerosol scattering fraction  $f_{sp}$  is about 1%. Based on the relationship between  $f_{sp}$ 399 and  $D_a$  shown in Fig. 1b, this leads to a precision of approximately 3 nm for  $D_a$ , which results in an effective supersaturation precision of ~0.01% when supersaturation is near 0.2%, or ~0.0002% when 400 401 supersaturation is near 0.02%. However, if the scattering signal is lower (e.g., 10 Mm<sup>-1</sup>), a bias of 1 Mm<sup>-1</sup> could result in effective supersaturation bias to as much as ~0.07% when supersaturation is near 402

403 0.2%, making the measurements unreliable. In summary, while the proposed framework demonstrates

404 the feasibility of observing effective supersaturation with an advanced optical system, the accuracy



**Figure 4**. The standard deviations of effective supersaturations under different effective supersaturation (SS) levels.

and precision depend on the resolution of the optical sensors, the scattering parameters being measured, and the scattering signal levels of aerosols in clouds. Enhancing the sensor precision to 0.1 Mm<sup>-1</sup> or even 0.01 Mm<sup>-1</sup>, and incorporating ultraviolet wavelengths and multiple scattering angles, might enable high-accuracy supersaturation measurements across a broad range of supersaturation conditions, especially in cleaner environments.

410 As mentioned in Sect. 2.1, the theoretical framework proposed in this study is designed to observe 411 effective supersaturation fluctuations, rather than supersaturation fluctuations themselves. While there 412 are non-negligible uncertainties associated with observing effective supersaturation using the proposed 413 theory, the size and hygroscopicity distributions of total interstitial and activated aerosol populations 414 remain nearly constant when measured with second-scale or shorter time resolution. The parameter 415 that changes over time is the dynamic exchange between interstitial and activated aerosols. 416 Consequently, fluctuations in the scattering signals of interstitial and activated aerosols can reflect this 417 exchange at high temporal resolution. Since effective supersaturation fluctuations result from 418 underlying supersaturation variations, they could, in principle, provide insights into the causes of these 419 fluctuations, such as turbulence, though this would require further investigation and endeavor. In 420 addition, for size-resolved AR, both  $\sigma$  and MAF are crucial parameters. However, using scattering 421 coefficients at just three wavelengths of Aurora 3000 nephelometer is insufficient for accurately 422 retrieving  $\sigma$  and MAF. If  $\sigma$  and MAF could be measured more precisely through the extended optical 423 framework, it would provide deeper insights into supersaturation fluctuations.

424 Despite these limitations, the proposed theoretical framework represents the first system capable 425 of directly providing high time resolution measurements of effective supersaturations using a single 426 instrument. This system is particularly well-suited for surface fog and mountain cloud observations, 427 and when coupled with aerial vehicles, it could also be employed for measurements in aloft clouds. 428 The system offers several advantages for cloud and fog measurements: (1) High-Resolution 429 **Supersaturation Measurements:** The system can provide measurements of effective supersaturations 430 at even a second-level resolution, making it feasible for observing effective supersaturation 431 fluctuations and supporting investigations into fog and cloud evolution mechanisms. (2) Long-Term 432 Measurement Capability: The optical measurements, such as those from the nephelometer system, 433 are well-suited for long-term observations, making it possible to acquire climatological data on the 434 variability of fogs and mountain clouds. (3) Comprehensive Aerosol and Cloud Data: In addition to 435 measuring effective supersaturations, the system directly captures the scattering and hygroscopic 436 properties of both interstitial and activated aerosols. With further algorithm development, it could also 437 retrieve the number concentrations of available cloud condensation nuclei (CCN) at certain 438 supersaturations, as well as cloud droplet number concentrations, based on previous studies that have 439 observed CCN using optical methods (Tao et al., 2018a). (4) Monitoring Aerosol Hygroscopic 440 Behavior: The system continuously monitors aerosol hygroscopic behavior under subsaturated 441 conditions along with the corresponding optical properties. This allows for clear documentation of the 442 formation and dissipation of fog/cloud events, as well as the variation in aerosol optical and 443 hygroscopic properties. Overall, the datasets generated by this system are well-suited for in-depth 444 investigations of cloud physics and aerosol-cloud interactions. This system has the potential to 445 significantly advance fundamental research on clouds and fogs. However, further theoretical studies 446 are needed to refine and optimize this type of system.

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457	
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460	
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462	L, WX and WeX participated the field campaign and conducted measurements of aerosol chemical
463	and physical properties. YS, PL, CZ reviewed and commented on the paper.
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