



1 A novel method to derive the aerosol hygroscopicity parameter based only on

2 measurements from a humidified nephelometer system

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12 Abstract

13 Aerosol hygroscopicity is crucial for understanding roles of aerosol particles in atmospheric 14 chemistry and aerosol climate effects. Light scattering enhancement factor $f(RH,\lambda)$ is one of the parameters describing aerosol hygroscopicity which is defined as $f(RH, \lambda) =$ 15 16 $\sigma_{sp}(RH,\lambda)/\sigma_{sp}(dry,\lambda)$ where $\sigma_{sp}(RH,\lambda)$ or $\sigma_{sp}(dry,\lambda)$ represents σ_{sp} at wavelength λ under certain RH or dry conditions. Traditionally, an overall hygroscopicity parameter κ can be retrieved 17 18 from measured $f(RH, \lambda)$, hereinafter referred to as $\kappa_{f(RH)}$, by combining concurrently measured 19 particle number size distribution (PNSD) and mass concentration of black carbon. In this paper, a new 20 method is proposed to directly derive $\kappa_{f(RH)}$ based only on measurements from a three-wavelength humidified nephelometer system. The advantage of this newly proposed novel approach is that it 21 22 allows researchers to estimate $\kappa_{f(RH)}$ without any additional information about PNSD and black 23 carbon. Values of $\kappa_{f(RH)}$ estimated from this new method agree very well with those retrieved by using the traditional method, the average difference between $\kappa_{f(RH)}$ derived from newly proposed 24 method and traditional method is 0.005 and the square of correlation coefficient between them is 0.99. 25 26

27 1. Introduction

Atmospheric aerosol particles play vital roles in visibility, energy balance and the hydrological cycle of the Earth-atmosphere system and have attracted a lot of attention in recent decades. Aerosol





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30 particles suspended in the atmosphere directly influence radiative transfer of solar radiation and indirectly affect cloud properties, therefore, have large impacts on climate change. Especially, 31 uncertainties in direct aerosol radiative forcing due to anthropogenic aerosols and in aerosol indirect 32 33 forcing caused by aerosol interaction with clouds contribute most to the total uncertainty in climate forcing (Boucher et al., 2013). One of the most import factors affect these uncertainties is the 34 interaction between aerosol particles and ambient atmospheric water vapour (Zhao et al., 2006;Kuang 35 et al., 2016b). Under supersaturated conditions, aerosol particles serve as cloud condensation nuclei 36 (CCN) and hence influence cloud properties. Under subsaturated conditions, with respect to typical 37 aerosol compositions, liquid water content condensed on aerosol particles usually constitute about half 38 of the total aerosol mass at relative humidity (RH) of 80% (Bian et al., 2014). Liquid water usually 39 dominates the total aerosol mass in most aerosol types when RH is above 90% (Bian et al., 2014). The 40 amounts of condensed water content in ambient aerosols and cloud droplets depend both on water 41 uptake abilities of the aerosol components and ambient RH. 42

Traditionally, the Köhler theory (Petters and Kreidenweis, 2007) is widely used to describe the hygroscopic growth of aerosol particles and successfully used in laboratory studies for single component and some multicomponent particles. However, it is found that most atmospheric aerosol particles usually consist of both organic and inorganic constituents (Murphy et al., 1998) rather than consist of a single component. Given this, a modified version of Köhler theory called κ-Köhler theory is proposed by Petters and Kreidenweis (2007) and widely used in recent ten years to study the hygroscopic growth of aerosol particles. The formula of this theory is expressed as the following:

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

where S is the saturation ratio, D is the diameter of the droplet, D_d is the dry diameter, $\sigma_{s/a}$ is the 51 52 surface tension of solution/air interface, T is the temperature, M_{water} is the molecular weight of water, R is the universal gas constant, ρ_w is the density of water, and κ is the hygroscopicity parameter. 53 This theory is not only applicable to single-component aerosol particles, but also to multicomponent 54 aerosol particles. With regard to a multicomponent aerosol particle, the Zdanovskii, Stokes, and 55 Robinson assumption can be applied. The hygroscopicity parameter κ of multicomponent aerosol 56 particle can be derived by using the following formula: $\kappa = \sum_i \varepsilon_i \cdot \kappa_i$, where κ_i and ε_i represent the 57 58 hygroscopic parameter and volume fraction of each component. In recent ten years, this hygroscopicity





59 parameter κ has received much attentions and turns out to be a very effective parameter to study aerosol hygroscopicity. This hygroscopicity parameter κ makes the comparison of the aerosol 60 hygroscopicity at different sites around the world and different time periods more convenient. In 61 62 addition, hygroscopicity parameter κ also facilitates the intercomparison of aerosol hygroscopicity derived from different techniques and measurements made at different RHs. This hygroscopicity 63 parameter κ is widely used to account the influence of aerosol hygroscopic growth on aerosol 64 optical properties as well as aerosol liquid water contents (Tao et al., 2014;Kuang et al., 2015;Brock 65 et al., 2016; Bian et al., 2014; Zieger et al., 2013) and to examine the role of aerosol hygroscopicty in 66 CCN (Chen et al., 2014;Gunthe et al., 2009;Ervens et al., 2010). Therefore, the derived κ values from 67 field campaigns and laboratory studies will further our understanding in aerosol hygroscopicity and 68 help estimate the influences of aerosol hygroscopic growth on different aspects of atmospheric 69 70 processes.

Currently, several types of instruments are widely used in field campaigns to study the aerosol 71 72 hygroscopicity through different aspects of aerosol properties. The Humidity Tandem Differential 73 mobility Analyzer (HTDMA) operates below water saturation and directly measures the aerosol 74 hygroscopic growth factor of selected particles which have certain diameters at specified RH points. 75 The aerosol hygroscopicity parameter κ can be directly derived from measurements of HTDMA by 76 applying equation (1) (Liu et al., 2011; Wu et al., 2016). Through relating the aerosol hygroscopicty to 77 CCN properties, measurements of size resolved CCN efficiency spectra can also be used to infer the 78 hygroscopicity parameter κ at different diameters (Gunthe et al., 2009;Petters et al., 2009;Rose et al., 2010;Su et al., 2010). These two methods can both provide insights into the aerosol hygroscopicity at 79 different aerosol diameters, however, they can only be used to derive aerosol hygroscopicity parameter 80 81 κ within certain size range (usually less than 300 nm). Thus, these two methods are not capable of providing more details about aerosol hygroscopicity of aerosol particles which contribute most to 82 aerosol optical properties and aerosol liquid water contents (their diameters usually ranging from 200 83 nm to 1µm) (Ma et al., 2012;Bian et al., 2014). The effect of aerosol water uptake on the aerosol 84 particle light scattering (σ_{sp}) (sometimes aerosol extinction coefficient (Brock et al., 2016)) is usually 85 measured with a humidified nephelometer system. Measurements from a humidified nephelometer 86 system can also be used to calculate the aerosol hygroscopicty parameter κ if the dry aerosol particle 87 number size distribution (PNSD) is measured simultaneously (Chen et al., 2014). The enhancement 88





89 factor $f(RH,\lambda)$ which is defined as $f(RH,\lambda) = \sigma_{sp}(RH,\lambda)/\sigma_{sp}(dry,\lambda)$, is usually used as an indicator of how much the RH impacts on σ_{sp} , $\sigma_{sp}(RH,\lambda)$ or $\sigma_{sp}(dry,\lambda)$ represents σ_{sp} at 90 wavelength λ at a certain RH or under dry conditions. In this research, f(RH) is referred to as 91 92 f(RH, 550 nm) and f(80 %) represents the f(RH) at 80 % RH. The nephelometer measures aerosol optical properties of the entire aerosol size distribution, thus, the deduced κ value from 93 measurements of $f(RH, \lambda)$ represents an overall, optically weighted κ . This κ is more suitable to be 94 used to account the influences of aerosol hygroscopic growth on aerosol optical properties compared 95 to aerosol hygroscopicity derived from HTDMA and CCN measurements. 96

Traditionally, as mentioned before, the way of deriving κ values from f(RH) measurements 97 require measurements of PNSD at dry state and may also need the mass concentrations of black carbon 98 (BC) to account the influence of BC on aerosol refractive index. However, the instruments of 99 measuring the PNSD and BC at dry state are expensive, and during field campaigns their information 100 is sometimes not available. In this paper, with measurements from a field campaign on the North China 101 102 Plain (NCP), we first derived κ values from measurements of f(RH) with the traditional method and then compared them with the κ values derived from High Humidity Tandem Differential 103 104 Mobility Analyzer (HH-TDMA). HH-TDMA is a system very similar with HTDMA but is capable of 105 operating at higher RH points (Liu et al., 2011). The relationships between κ values derived from f(RH) measurements and parameters used to fit measured f(RH) curves are further examined and 106 107 analyzed. Finally, basing on finished analysis about the relationship between κ and f(RH) fitting 108 parameters, a novel method to directly derive the aerosol hygroscopicity parameter κ based only on measurements from a humidified nephelometer system is proposed. This newly proposed approach 109 makes it more convenient and cheaper for researchers to conduct aerosol hygroscopicity research with 110 111 measurements of f(RH).

112 2. Site description and instruments

In this study, the main part of used datasets is from the field campaign conducted at Wangdu ($38^{\circ}40'N$, $115^{\circ}08'E$) during summer on the North China Plain (NCP). This field campaign was jointly conducted by Peking University, China and Leibniz-Institute for Tropospheric Research, Germany. Wangdu site is located in the suburban district of Wangdu County, Hebei Province, China and situated adjacent to farmland and residential areas, it belongs to the typical region of the NCP. This observation campaign lasted for about one month from 4 June, 2014 to 14 July, 2014. The measured $f(RH, \lambda)$





119 dataset was available from June 21^{st} , 2014, to July 1^{st} , 2014.

For datasets from Wangdu campaign. The chemical compositions of the aerosol particles with an 120 aerodynamic diameter of less than 2.5 µm (PM2.5) were analyzed based on the samples collected on 121 122 quartz and Teflon filters. Other instruments share one inlet which is placed on the roof of the container. Regarding this inlet system, aerosol particles first entered an impactor which selected the aerosol 123 particles with an aerodynamic diameter of less than 10 μ m, and then passed through a dryer which is 124 capable of reducing the RH of the sample air to lower than 30 %. In succession, the sample air passed 125 through a splitter and was allotted to different instruments according to their required flow rates. The 126 PNSD at dry state ranging from 3nm to 10µm was observed jointly by a Twin Differential Mobility 127 Particle Sizer (TDMPS, Leibniz-Institute for Tropospheric Research (IfT), Germany; Birmili et al. 128 (1999)) and an Aerodynamic Particle Sizer (APS, TSI Inc., Model 3321) with a temporal resolution of 129 130 10 minutes. The absorption coefficient at 637 nm was measured using a Multi-angle Absorption Photometer (MAAP Model 5012, Thermo, Inc., Waltham, MA USA) with a temporal resolution of 1 131 132 minute, and further used to calculate the mass concentrations of black carbon (BC) with a constant mass absorption efficiency (MAE) of 6.6 m^2g^{-1} . The growth factors of aerosol particles at six 133 selected particle diameters (30 nm, 50 nm, 100 nm, 150nm, 200 nm and 250 nm) at 98% RH condition 134 135 were obtained from the measurements of the HH-TDMA (Leibniz-Institute for Tropospheric Research (IfT), Germany; Hennig et al. (2005)). The $f(RH, \lambda)$ curves of aerosol particles with RH ranging from 136 137 about 50% to 90% were measured by a humidified nephelometer system which consists of two threewavelength integrating nephelometers (TSI Inc., Model 3563) and a humidifier. The humidifier was 138 used to moisten the air which will be sampled into the second nephelometer. Details of this humidified 139 nephelometer system please refer to (Kuang et al., 2016a). 140

141 PNSDs at dry state and mass concentrations of BC derived from MAAP measurements measured at both Wuqing from 12 July to 14 August in 2009 and Xianghe from 9 July to 8 August in 2013 are 142 also used in this study to examine the influence of PNSD and BC on derivation of κ values from 143 f(RH) measurements and other relationships. Additionally, σ_{sp} values which were observed during 144 these three field campaigns introduced before with a three-wavelength integrating nephelometer (TSI 145 Inc., Model 3563) are also used in Sect.4.3. Both Wuqing and Xianghe are representative regional 146 background sites of the NCP and locates in the northern part of the NCP. Details about these two 147 campaigns can be found in papers published by Kuang et al. (2015) and Ma et al. (2016). 148





149 **3. Methodology**

3.1 Calculations of hygroscopicity parameter κ from measurements of f(RH) and HH-TDMA 150 Research of Chen et al. (2014) demonstrated that if the PNSD at dry state is measured, then 151 152 measurements of f(RH) can be used to derive the aerosol hygroscopicity parameter κ by conducting an iterative calculation with the Mie theory and the κ -Köhler theory. To reduce the 153 influence of random errors of observed f(RH) at a certain RH, all valid f(RH) measurements in a 154 complete humidifying cycle is used in the derivation algorithm. The retrieved κ is the κ value which 155 can be used to best fit the observed f(RH) curve. Details about this retrieval algorithm is described 156 in Chen et al. (2014). Of particular note is that in this research the mass concentration of BC is also 157 considered in the retrieval algorithm to account for the influence of BC on refractive indices of aerosol 158 particles at different sizes. The BC is considered to be homogeneously mixed with other aerosol 159 components, and the mass size distribution of BC used in Ma et al. (2012) which is observed on the 160 NCP is used in this research to account the mass distributions of BC at different particle sizes. The 161 used refractive index and density of BC are 1.80 - 0.54i and $1.5g \, cm^{-3}$ (Kuang et al., 2015). Used 162 refractive indices of non light-absorbing aerosol components (other than BC) and liquid water are 163 $1.53 - 10^{-7}i$ (Wex et al., 2002) and $1.33 - 10^{-7}i$ (Seinfeld and Pandis, 2006), respectively. 164

The HH-TDMA measures hygroscopic growth factors of particles at different sizes at 98% RH condition. The measured hygroscopic factors can be directly related to κ with equation (1). For a specified size of selected aerosol particles, a distribution of growth factors can be measured, and thus can be used to derive a probability distribution of κ and finally come to the calculation of average κ value corresponding to this size of aerosol particles. The method on how to derive average κ value of certain size of aerosol particles from HH-TDMA measurements is elaborately described in Liu et al. (2011).

172 **3.2** Parameterization schemes for f(RH)

Due to the complex chemical compositions of ambient aerosol particles and the challenge in precisely measuring their molecular compositions, it is difficult to directly describe the influence of RH on σ_{sp} . Some simplified parameterization schemes are usually used to describe f(RH) as a function of RH. The most frequently used parameterization scheme is a power-law function which is known as "gamma" parameterization (Quinn et al., 2005) and the formula of this single-parameter representation is written as the following:





179	$f(RH) = \left[\frac{(100 - RH_0)}{100 - RH}\right]^{\gamma} (2)$
180	where RH_0 is the RH of dry condition, and γ is a parameter fitted to the observed $f(RH)$. In this
181	study, we estimated γ values with observed $f(RH)$ curves and for the first time to our knowledge,
182	we further examined the relationship between γ and κ retrieved from $f(RH)$ measurements.
183	Recently, a new physically based single-parameter representation was proposed by Brock et al.
184	(2016) to describe $f(RH)$. Their results demonstrated that this proposed parameterization scheme can
185	better describe $f(RH)$ than the widely used gamma power-law approximation (Brock et al., 2016).
186	The formula of this new scheme is written as:
187	$f(\text{RH}) = 1 + \kappa_{sca} \frac{RH}{100 - RH} $ (3)
188	where κ_{sca} is a parameter fitted to observed $f(RH)$. Here, we give a brief introduction about the
189	physical understanding of this alternative parameterization scheme. Regardless of the curvature effects
190	for particle diameters larger than 100 nm, the hygroscopic growth factor for aerosol particles can be
191	approximately expressed as the following (Brock et al., 2016): $gf_{diam} \cong (1 + \kappa \frac{RH}{100 - RH})^{1/3}$.
192	Moreover, σ_{sp} is usually proportional to total aerosol volume (Pinnick et al., 1980) which means that
193	the relative change in σ_{sp} due to aerosol water uptake is roughly proportional to relative change in
194	aerosol volume. The enhancement factor in volume can be expressed as the cube of gf_{diam} , thus lead
195	to the formula form of $f(RH)$ expressed in equation (3). More details about the discussion of this
196	new expression form of $f(RH)$ can be found in the paper published by Brock et al. (2016). In this
197	paper, the performance of this newly proposed scheme is investigated, values of κ_{sca} are estimated
198	from observed $f(RH)$ curves and their relationship with κ values retrieved from $f(RH)$
199	measurements is also examined.

200 These two parameterization schemes which are introduced here are referred to as γ -Method and 201 κ_{sca} -Method respectively in the following paragraphs.

202 4. Results and discussions

203 4.1 Derived κ values from f(RH) and HH-TDMA measurements

During this field campaign, the aerosol physical, chemical and optical properties are synergistically observed with different types of instruments. They provide valuable datasets to perform an insightful analysis about aerosol hygroscopicity and its relationship with other aerosol properties.





207 The time series of σ_{sp} at 550 nm at dry state are shown in Fig.1a, and values of σ_{sp} at 550 nm shown 208 in Fig.1a are corrected from measurements of TSI 3563 nephelometer (the truncation errors are corrected using Mie theory with measured PNSD and mass concentrations of BC). The results show 209 that this observation period has experienced varying degrees of pollution levels, with σ_{sp} at 550 nm 210 ranging from 15 to 1150 Mm^{-1} . The aerosol chemical compositions also change a lot during the 211 observation period. The relative contributions of mass concentrations of organic matter to total PM2.5 212 mass concentrations range from 2% to 42%. Moreover, the relative contributions of mass 213 concentrations of sulfate, nitrate and ammonium to total PM2.5 mass concentrations range from 5 to 214 50 %, 2 to 27 % and 1 to 21 %, respectively (Kuang et al., 2016a). These results imply that during this 215 observation period, the aerosol hygroscopicity changes a lot whereafter corroborated by f(RH)216 measurements. Overall, f(80%) values range between 1.1 and 2.3 with an average of 1.8. Periods 217 when deliquescent phenomena occur, f(80%) values are relatively higher with a variation range of 218 1.7 to 2.3 and their average is 2.0. This is because of the dominance of ammonium sulfate during 219 220 periods when deliquescent phenomena occur. More detailed analysis about the frequently observed 221 deliquescent phenomena during this field campaign please refer to (Kuang et al., 2016a).

222 Furthermore, κ values derived from f(RH) measurements by combining measurements of 223 PNSD at dry state and mass concentrations of BC are shown in Fig.1b. During deliquescent phenomena periods, f(RH) jumps when sample RH in the cavity of the nephelometer mainly ranges from 60 % 224 225 to 65 %. Therefore, for a humidifying cycle which shows jump phenomenon in f(RH), only f(RH)226 points when RHs are greater than 70% (after the jump point) are used to retrieve κ . The results 227 demonstrate that κ derived from f(RH) measurements (hereinafter referred to as $\kappa_{f(RH)}$) lie between 0.06 and 0.43. The lowest $\kappa_{f(RH)}$ values are found when the air quality is relatively clean 228 $(\sigma_{sp} \text{ at 550 nm is lower than 100 } Mm^{-1})$ on 27 and 28 June. During these two days, organic matter 229 dominates the mass concentration of PM2.5 which results in the low hygroscopicity of aerosol particles. 230 On the contrary, the largest $\kappa_{f(RH)}$ values are found during periods when deliquescent phenomena 231 occur and inorganic chemical compositions dominate the mass concentrations of PM2.5, especially, 232 sulfate is highly abundant during these periods. Of particular note is that during relatively polluted 233 periods (σ_{sp} at 550 nm larger than 100 Mm^{-1}) aerosol particles are generally very hygroscopic which 234 imply that aerosol water uptake can exert significant impacts on regional direct aerosol radiative effect 235





and ambient visibility during this observation period. On the whole, the average $\kappa_{f(RH)}$ during this observation period is 0.28.

On the basis of the average size-resolved κ distribution from Haze in China (HaChi) campaign 238 239 (Liu et al., 2014), κ values change a lot for aerosol particles whose diameters are less than 250 nm, however, κ values vary relatively smaller for aerosol particles whose diameter range from 250 nm to 240 241 1 μ m. In addition, the results from HaChi campaign also demonstrate that aerosol particles whose 242 diameter range from 200 nm to 1 μ m usually contribute more than 80% to σ_{sp} at 550 nm during summer on the NCP (Ma et al., 2012). To compare κ values derived from measurements of 243 humidified nephelometer system and HH-TDMA, average κ values corresponding to aerosol 244 particles at only 250 nm which are derived from HH-TDMA measurements are also shown in Fig.1b. 245 In the following, average κ which is derived from HH-TDMA measurements for aerosol particles 246 247 having particle size of 250 nm is referred to as κ_{250} . During this observation period, values of κ_{250} range from 0.11 to 0.56, with an average of 0.34 which is very close to average κ_{250} observed during 248 HaChi campaign (Liu et al., 2011). The results shown in Fig.1b suggest that, in general, $\kappa_{f(RH)}$ values 249 250 agree well with κ_{250} values, however, are usually lower than κ_{250} values. To quantitatively compare 251 these two types of κ values, they are plotted against each other and shown in Fig.2. It can be seen that they are highly correlated but the κ_{250} values are systematically higher than $\kappa_{f(RH)}$ values, and the 252 253 average difference between κ_{250} and $\kappa_{f(RH)}$ is 0.06. The statistical relationship between κ_{250} and 254 $\kappa_{f(RH)}$ is also shown in Fig.2. This relationship may be useful for researchers if they want to estimate 255 the influences of aerosol water uptake on aerosol optical properties and aerosol liquid water contents when only HH-TDMA or HTDMA measurements are available. 256

257 A model experiment is conducted to better understand the relationship between κ_{250} and $\kappa_{f(RH)}$. 258 During HaChi campaign, size-resolved κ distributions are derived from measured size-segregated chemical compositions (Liu et al., 2014) and their average is used in this experiment to account the 259 size dependence of aerosol hygroscopicity which is shown in Fig. 3a. With this fixed average size-260 resolved κ distribution, all observed PNSDs at dry state along with mass concentrations of BC which 261 262 are observed at three different representative background sites of the NCP during summer are used to simulate the retrieval of $\kappa_{f(RH)}$ under different PNSD and BC conditions. Field campaigns conducted 263 at these three site is introduced in Sect.2. The treatment of BC is the same with the way in the process 264





265 of deriving $\kappa_{f(RH)}$ which is introduced in Sect.4.1. The used PNSDs shown in Fig.3b show that large varying types of PNSDs are considered in the simulative experiment. The probability distribution of 266 simulated $\kappa_{f(RH)}$ is also shown in Fig.3a. The standard deviation of retrieved $\kappa_{f(RH)}$ is about 0.01 267 268 which suggests that if the size-resolved κ distribution is fixed, then $\kappa_{f(RH)}$ varies little. Due to $\kappa_{f(RH)}$ represents an overall, optically weighted κ , it is clearly shown in Fig.3a that in most cases 269 $\kappa_{f(RH)}$ values are located between κ values of aerosol particles ranging from 200 nm to 1µm. 270 271 Moreover, about 70% of simulated $\kappa_{f(RH)}$ values are less than κ_{250} which to some extent explains the observed difference between κ_{250} and $\kappa_{f(RH)}$ mentioned before. However, the simulated 272 average difference between κ_{250} and average $\kappa_{f(RH)}$ is about 0.01 which is far less than the observed 273 averaged difference between κ_{250} and $\kappa_{f(RH)}$ which is 0.06. Except that uncertainties from 274 275 measurements of instruments, for example, the uncertainty of RH in measurements of HH-TDMA and 276 uncertainties of measuring f(RH) (details about the uncertainty sources of f(RH) measurements can be found in the paper published by Titos et al. (2016)), there are other two reasons may be 277 278 associated with this discrepancy. The first one is that configurations of size-resolved κ distributions 279 and PNSDs during this field campaign are far different from the model experiment. The second one is 280 that in the real atmosphere, κ values at different RH conditions may be different (You et al., 2014) 281 and most of f(RH) measurements are conducted when RH is lower than 90%, however, the measurements of HH-TDMA are conducted when RH is equal to 98%. Overall, the observed general 282 consistency between κ values derived from measurements of f(RH) and HH-TDMA confirms the 283 reliability of κ values derived from f(RH) measurements. 284

285 **4.2 Relationships between** κ derived from f(RH) measurements and f(RH) fitting 286 parameters

In the previous section, the overall properties of ambient aerosol particles are introduced, derived $\kappa_{f(RH)}$ values are characterized and compared with κ_{250} values. These results demonstrated that derived $\kappa_{f(RH)}$ values can commendably represent variations of aerosol hygroscopicty of ambient aerosol populations. In this section, the relationship between derived $\kappa_{f(RH)}$ values and f(RH)fitting parameters are further examined to investigate their relationships.

Two parameterization schemes of f(RH) are discussed in this paper, including the currently widely used γ -Method and newly proposed κ_{sca} -Method by Brock et al. (2016) and both methods are introduced in Sect.3.2. A fitting example of these two methods is shown in Fig.4A. For f(RH)





295 cycles observed during this field campaign, they are fitted by using both γ -Method and κ_{sca} -Method, corresponding values of γ and κ_{sca} are also deduced. For cycles during deliquescent periods, only 296 f(RH) points with RH higher than 70% are used to perform fitting processes. The fitting performance 297 298 of these two methods are further investigated by conducting the comparison between measured and fitted f(85)% values. Probability distributions of the ratio between fitted and measured f(85)% by 299 using these two methods are shown in Fig.4B. The results indicate that in most cases both γ -Method 300 and κ_{sca} -Method fit observed f(RH) cycles well with γ -Method performs slightly better which is 301 contrary to the results introduced by Brock et al. (2016), their results demonstrate that κ_{sca} -Method 302 can better describe observed f(RH) than γ -Method. That is to say, f(RH) curves observed at 303 different places or time periods may require different parameterization schemes to fit them best, 304 305 however, in general both γ -Method and κ_{sca} -Method are good approaches to fit observed f(RH)306 curves.

Concerning γ -Method, previous studies usually examine the relationship between γ and aerosol 307 308 chemical compositions and established several parameterization schemes to fit γ with mass fractions 309 of different aerosol chemical compositions, including organic materials, sulfate and nitrate (Quinn et 310 al., 2005; Titos et al., 2014; Zhang et al., 2015). However, to obtain a reliable estimation of γ , complete 311 information of aerosol chemical compositions may be required which is difficult to get, and it is also hard to find a comprehensive description of γ based on those complicated chemical compositions. 312 313 Single aerosol hygroscopicity parameter κ can represent overall hygroscopicity of aerosol particles 314 which contains influences of different chemical compositions on aerosol hygroscopicity, therefore may 315 be used to better fit γ . In view of this, the relationship between $\kappa_{f(RH)}$ and γ is investigated and shown in Fig.4C. It is found that a pretty good linear relationship exists (square of correlation 316 317 coefficient is 0.95) between $\kappa_{f(RH)}$ and γ , especially when $\kappa_{f(RH)}$ is larger than 0.15. This correlation is far better than previously found relationships between γ and aerosol chemical 318 compositions (Quinn et al., 2005; Titos et al., 2014; Zhang et al., 2015) and statistical parameters which 319 can be used to parameterize γ with $\kappa_{f(RH)}$ is also shown in Fig.4C. During this field campaign, fitted 320 γ ranges from 0.15 to 0.63 with an average of 0.46. 321

Furthermore, during this field campaign, fitted κ_{sca} ranges from 0.05 to 0.3 with an average of 0.2. The relationship between $\kappa_{f(RH)}$ and κ_{sca} is also investigated and it is found a strong linear





324 relationship also exists (square of correlation coefficient is 0.98) between $\kappa_{f(RH)}$ and κ_{sca} . This 325 linear relationship is even better than the linear relationship between $\kappa_{f(RH)}$ and γ . Not only that, the statistically fitted line almost passes though zero point which implies that a proportional relationship 326 327 may exist between $\kappa_{f(RH)}$ and κ_{sca} . This strong correlation should be intrinsic due to the idea of κ_{sca} -Method is from the linkage between total aerosol volume and σ_{sp} as introduced in Sect.3.2 and 328 329 the increase of total aerosol volume due to aerosol water uptake is directly linked to the overall aerosol hygroscopicity parameter κ . It seems that this promising linear relationship can help bridge the gap 330 between f(RH) and κ . However, results from Brock et al. (2016) demonstrated that the relationship 331 332 between $\kappa_{f(RH)}$ and κ_{sca} is much more sophisticated and it is affected by both aerosol hygroscopicity and PNSD at dry state. In the paper published by Brock et al. (2016), κ_{ext} and κ_{chem} 333 334 are used and correspond to κ_{sca} and $\kappa_{f(RH)}$ in this research, the difference between κ_{ext} and κ_{sca} 335 is that κ_{ext} is used to fit the light enhancement factor of aerosol extinction coefficient, κ_{chem} and $\kappa_{f(RH)}$ actually means the same because both them are overall and size independent hygroscopicity 336 337 parameters. Results from Brock et al. (2016) concluded that the ratio $\kappa_{ext}/\kappa_{chem}$ generally lies 338 between 0.6 to 1 which implies that the ratio $\kappa_{sca}/\kappa_{f(RH)}$ (in the following, this ratio is referred to as R_{κ}) also should have large variations and shares the similar variation range. By revisiting the 339 340 relationship between $\kappa_{f(RH)}$ and κ_{sca} found in this research, it can be found that R_{κ} during this field campaign ranges from 0.6 to 0.77 with an average of 0.7. This result suggests that if we directly 341 342 establish a linkage between $\kappa_{f(RH)}$ and κ_{sca} with an average R_{κ} can result in a non-negligible bias 343 (relative difference can reach about 15%). Besides, this range of R_{κ} only represents the relationship between $\kappa_{f(RH)}$ and κ_{sca} during a short time period and at only one site. 344

To better understand the relationship between $\kappa_{f(RH)}$ and κ_{sca} , all PNSDs at dry state (shown 345 346 in Fig.3a) along with mass concentrations of BC observed from three different representative background sites of the NCP during summer which is introduced in Sect.2 are used to simulate the 347 relationship between $\kappa_{f(RH)}$ and κ_{sca} with Mie and κ -Köhler theories. During simulating processes, 348 for each PNSD, we change $\kappa_{f(RH)}$ from 0.01 to 0.6 with an interval of 0.01 to examine the influence 349 of aerosol hygroscopicity on R_{κ} . The way of treating BC is same with the simulation experiment 350 introduced in Sect.4.1. Simulated results are shown in Fig.5a and the probability distribution of 351 simulated R_{κ} values is shown in Fig.5b. The results show that R_{κ} primarily ranges from 0.55 to 0.82 352 with an average of 0.69 which is very close to the average R_{κ} measured during the field campaign of 353





- this research. These results also indicate that the relationship between $\kappa_{f(RH)}$ and κ_{sca} is much more complex than a simple linear relationship and more information about aerosol properties are necessary
- to gain insights into the variation of R_{κ} .
- 4.3 A novel method to directly derive κ from measurements of a humidified nephelometer system

A robust linear relationship is first found between $\kappa_{f(RH)}$ and κ_{sca} in Sect.4.2 and then it turns 359 360 out that the relationship between $\kappa_{f(RH)}$ and κ_{sca} is much more complex than that shown in Fig.4D. The complexity comes from large variations of R_{κ} and both PNSD at dry state and aerosol 361 hygroscopicity have impacts on R_{κ} . Generally, used nephelometer of a humidified nephelometer 362 system have three wavelengths (Titos et al., 2016) and the spectral dependence of σ_{sp} is usually 363 described by the following Ångström formula: $\sigma_{sp}(\lambda) = \beta \lambda^{-\alpha_{sp}}$, where β is the particle number 364 concentration dependent coefficient, λ is the wavelength of light and α_{sp} represents the Ångström 365 366 exponent of σ_{sp} (Zieger et al., 2014). Thus, Ångström exponent can be directly inferred from the measurements of σ_{sp} at different wavelengths. Of particular note is that Ångström exponent can 367 not only be used to account the spectral course of σ_{sp} , it also reveals information about PNSD. In 368 general, larger value of Ångström exponent corresponds to smaller aerosol particles. That is, 369 Ångström exponent can be a proxy of PNSD at dry state and be used in the processes of estimating 370 the impacts of PNSD on R_{κ} . On the other hand, with regard to aerosol hygroscopicity, although R_{κ} 371 varies within certain range, value of κ_{sca} can still be used to represent the overall hygroscopicity of 372 373 aerosol particles. Given this, simulated R_{κ} values introduced in the last paragraph of Sect.4.2 are 374 spread into a two dimensional gridded plot. The first dimension is Ångström exponent with an interval of 0.02 and the second dimension is κ_{sca} with an interval of 0.01, average R_{κ} value within 375 each grid is represented by color and shown in Fig.6a. Values of Ångström exponent corresponding 376 different PNSDs are calculated from concurrently measured σ_{sp} values at 450 nm and 550 nm from 377 378 TSI 3563 nephelometer. Basing on results shown on Fig.6a, the different impacts of aerosol 379 hygroscopicity and PNSD at dry state on R_{κ} can be clearly distinguished. The results demonstrate that PNSD at dry state dominates the variation of R_{κ} , nevertheless, aerosol hygroscopicty has non-380 negligible impacts. Overall, larger value of Ångström exponent corresponds to higher R_{κ} . However, 381





aerosol hygroscopicty exhibits different influences on R_{κ} when Ångström exponent values are different. Generally speaking, higher κ_{sca} corresponds to lower R_{κ} if Ångström exponent is smaller than about 0.8 and higher κ_{sca} corresponds to higher R_{κ} if Ångström exponent is larger than about 1.6.

In addition, the percentile value of standard deviation of R_{κ} values within each grid divided by 386 387 their average is shown in Fig.6b. In most cases, these percentile values are less than 6% (about 90%) which demonstrates that R_{κ} varies little within each grid shown in Fig.6a. This implies that results of 388 Fig.6a can be used as a look up table to estimate R_{κ} . As what's introduced before, currently widely 389 used nephelometer of a humidified nephelometer system usually have three wavelengths (Titos et al., 390 2016), thus can provide information about Ångström exponent, and κ_{sca} can be directly fitted from 391 observed f(RH) curve. Even only one f(RH) point is measured κ_{sca} can still be calculated from 392 393 equation (3). Therefore, using results shown in Fig.6a as a look up table, R_{κ} values can be directly predicted from measurements of a humidified nephelometer system. With this method, R_{κ} values 394 395 during this Wangdu field campaign are predicted (values of Ångström exponent are calculated from measured σ_{sp} values at 450 nm and 550 nm under dry conditions) and compared with measured R_{κ} 396 values, the results are shown in Fig.7a. The Ångström exponent during this field campaign ranges 397 398 from 0.63 to 1.96 with an average of 1.4. It can be seen from Fig.7a that majority of points lie nearby 399 1:1 line and 92% points have relative differences less than 6% which is consistent with results shown in Fig.6b. This result is quite promising and can be further used to derive $\kappa_{f(RH)}$ values by combining 400 401 fitted κ_{sca} and predicted R_{κ} . The results of predicted $\kappa_{f(RH)}$ values are shown in Fig.7b and a robust 402 correlation between predicted $\kappa_{f(RH)}$ values and $\kappa_{f(RH)}$ values retrieved by using the traditional method introduced in Sect.3.1 is achieved (square of correlation coefficient is 0.99). All points shown 403 404 in Fig.7b lie nearby 1:1 line, average difference between $\kappa_{f(RH)}$ derived from newly proposed method and traditional method is -0.005. This result demonstrates a quite good estimation of $\kappa_{f(RH)}$ can be 405 achieved by using only measurements from a humidified nephelometer system. 406

It should be noted that the look up table shown in Fig.6a already covers large variation ranges of Ångström exponent and κ_{sca} . Which means that this look up table can be used under different conditions. However, it should be pointed out that the look up table shown in Fig.6a is from simulations of measured continental aerosols without influences of desert dust, and it might not be suitable for





being used to estimate $\kappa_{f(RH)}$ when sea salt or dust particles prevail. In summary, this approach allows researchers to directly derive aerosol hygroscopicity from measurements of f(RH) without any

413 additional information about PNSD and BC which is quite convenient for researchers to conduct

- 414 aerosol hygroscopicity researches with measurements from a humidified nephelometer system.
- 415 **5.** Conclusions

416 During the field campaign introduced in this paper, which is conducted in summer at a background site of the NCP, integrative aerosol information including aerosol chemical, optical and 417 physical properties are observed. Among them, aerosol hygroscopicty is crucial for understanding 418 roles of aerosol particles in air pollution and aerosol climate effects. In this paper, values of aerosol 419 hygroscopicity parameter κ are first derived from measurements of f(RH) by combining 420 measurements of PNSD at dry state and BC. The results show that during this field campaign, aerosol 421 hygroscopicity varies a lot, and $\kappa_{f(RH)}$ ranges from 0.06 to 0.43 with an average of 0.28. Retrieved 422 $\kappa_{f(RH)}$ values are further compared with κ_{250} which is derived from measurements of HH-TDMA 423 and good consistency is achieved. Results show that κ_{250} is systematically higher than $\kappa_{f(RH)}$ and 424 425 the average of their difference is 0.06. A simulative experiment is conducted to better understand their 426 difference and partially explained the observed discrepancy, however, still not enough and possible 427 reasons are discussed in Sect.4.1.

Relationships between $\kappa_{f(RH)}$ and f(RH) fitting parameters γ and κ_{sca} are further 428 429 investigated in Sect.4.2 which is for the first time to our knowledge. Good linear relationship exists 430 between $\kappa_{f(RH)}$ and γ , and the correlation between $\kappa_{f(RH)}$ and γ is far better than previously found relationships between γ and aerosol chemical compositions. This results demonstrate that κ should 431 432 be a better choice to parameterize f(RH) fitting parameters than mass fractions of aerosol chemical 433 compositions which is so far widely used. The relationship between $\kappa_{f(RH)}$ and κ_{sca} is then also 434 examined, and it is found that a better linear relationship than the relationship between $\kappa_{f(RH)}$ and γ exists between $\kappa_{f(RH)}$ and κ_{sca} , and $\kappa_{f(RH)}$ may be proportional to κ_{sca} . However, through 435 detailed analysis about the relationship between $\kappa_{f(RH)}$ and κ_{sca} , it turns out that their relationship 436 is more complicated than what is found at the very beginning and the ratio $\kappa_{sca}/\kappa_{f(RH)}$ (R_{κ}) varies a 437 438 lot. Results show that both PNSD at dry state and aerosol hygroscopicity have impacts on value of R_{κ} . In Sect.4.3, by introducing Ångström exponent as a proxy for PNSD, impacts of PNSD and 439 aerosol hygroscopicity on R_{κ} are distinguished and then discussed. In succession, a look up table 440





441 based on Ångström exponent and κ_{sca} is developed to estiamte R_{κ} . With this look up table, R_{κ} can be directly estimated from measurements of a humidified nephelometer system. This method is 442 further verified with measurements of this field campaign. Results show that great consistency is 443 achieved between predicted and measured R_{κ} values (92% points have relative difference less than 444 6%). Given this, the linkage between $\kappa_{f(RH)}$ and κ_{sca} is directly established and further used to 445 estimate $\kappa_{f(RH)}$. The comparison results demonstrate a pretty good agreement is achieved, all points 446 447 lie nearby 1:1 line. The average absolute difference between $\kappa_{f(RH)}$ derived from newly proposed method and traditional method is -0.005 and the square of correlation coefficient between them is 0.99. 448 This newly proposed novel approach allow researchers to estimate $\kappa_{f(BH)}$ without any additional 449 information about PNSD and BC. This new finding directly links κ and f(RH) and will make the 450 humidified nephelometer system more convenient when it comes to aerosol hygroscopicity research. 451 Finally, findings in this research may facilitate the intercomparison of aerosol hygroscopicity derived 452 from different techniques, help for parameterizing f(RH) and predicting CCN properties with optical 453 454 measurements.

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457 Acknowledgments

This work is supported by the National Natural Science Foundation of China (41590872, 41375134).

459 The data used are listed in the references and a repository at <u>http://pan.baidu.com/s/1c2Nzc5a</u>.

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Figure 1. (a) The time series of σ_{sp} at 550 nm; (b) The time series of κ values derived from f(RH)measurements ($\kappa_{f(\text{RH})}$) by combining information of PNSD and BC, and time series of average κ values of aerosol particles at 250 nm (κ_{250}) which is calculated from measurements of HH-TDMA.

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Figure 2. The comparison between κ values derived from f(RH) measurements ($\kappa_{f(\text{RH})}$) and average κ values for aerosol particles with a diameter of 250 nm (κ_{250}) which are derived from measurements of HH-TDMA. R^2 is the square of correlation coefficient, m is the slope and b is the intercept.

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Figure 3. (a) The thick black line represents the average size-resolved κ distribution from HaChi campaign. The solid gray line represents the probability distribution of retrieved κ values with this size-resolve κ distribution by using all PNSDs shown in figure (b), and the horizontal dashed line represents their average. The vertical dashed red line represents the position of 250 nm. (b) All PNSDs which are observed from three different representative background sites of the NCP during summer, they are used to model relationship between size-resolved κ and retrieved κ values from f(RH) measurements, and the gray color represents the frequency of PNSD, darker point corresponds to higher frequency, red and green line represent mean of median values of all observed PNSDs.







Figure 4. (A) Fitting example of two discussed parameterization schemes, and title shows the observation time of this f(RH) curve; (B) The fitting performance of two discussed parameterization schemes, x-axis represents the ratio between fitted f(85%) and measured f(85%) and y-axis represents the probability distribution. (C) The linear relationship between values of $\kappa_{f(RH)}$ and fitted γ , R^2 is the square of correlation coefficient, k is the slope and b is the intercept; (D) The linear relationship between values of $\kappa_{f(RH)}$ and fitted κ_{sca} .

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Figure 5. (a) Simulated relationships between $\kappa_{f(RH)}$ and κ_{sca} under different PNSD conditions (all PNSDs shown in Fig.3a are used as inputs to conduct the simulation experiment), gray color represents the frequency and darker point corresponds to higher frequency, the slope of two dashed lines are 0.55 and 0.81; (b) The probability distribution of R_{κ} ($\kappa_{sca}/\kappa_{f(RH)}$).









Figure 6. (a) Colors represent R_{κ} values and the color bar is shown on the top of this figure, x-axis represents Ångström exponent and y-axis represents κ_{sca} . (b) Meanings of x-axis and y-axis are same with them in (a), however, color represents the percentile value of the standard deviation of R_{κ} values within each grid divided by their average.

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Figure 7. (a) The comparison between measured and predicted R_{κ} values, colors represent values of Ångström exponent, texts with red color show the percentile of points with relative difference (Rdiff) less than 6%, two dashed line are lines with absolute relative difference (Rdiff) equal to 6%; (b) the comparison between retrieved $\kappa_{f(RH)}$ values by using traditional method introduced in Sect.3.1 and predicted $\kappa_{f(RH)}$ by using the new method introduced in Sect.4.3, R^2 is the square of correlation coefficient, k is the slope and b is the intercept.