



Technical Note: Real-Time Diagnosis of the Hygroscopic Growth Micro-Dynamics of Nanoparticles with Two-Dimensional Correlation Infrared Spectroscopy

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15 Abstract

Nanoparticles can absorb water to grow up and this will affect the light scattering behavior, cloud condensation nuclei properties, lifetime, and chemical reactivity of these particles. Current techniques usually assume the shapes of nanoparticles to be spherical in calculation of aerosol liquid water content (ALWC), which may result in large uncertainties when the shapes of nanoparticles show large deviations to the spherical assumptions. Furthermore, current techniques are also difficult to identify the intermolecular chemical interactions of phase transition micro-dynamics during nanoparticle deliquescence process because their limited temporal resolutions are unable to capture the complex femtosecond-level intermediate states. In this study, the hygroscopic growth properties of nanoparticles with electrical mobility diameter of approximately 100 nm and their phase transition interaction dynamics on molecular scale are characterized on real time by using the Fourier transform infrared (FTIR) and the two-dimensional correlation infrared (2D-IR) spectroscopic techniques. With the FTIR spectroscopy, we develop a novel real-time method for ALWC by constructing the absorption spectra of liquid water, and realized real-time measurements of water content and dry nanoparticle mass to characterize the hygroscopic growth factors (GF) which show discrepancies to the extended aerosol inorganics model (E-AIM). We further explore the difference that the deliquescence points of sodium nitrate (SN) and oxalic acid (OA) compounds are lower than that of AS by using the 2D-IR spectroscopic analysis technique. We also identify the occurrence sequential order of



the hydration interactions and investigate the dynamic deliquescence process of the functional groups for AS and its mixture compounds. Both SN and OA compounds lower the deliquescence point of AS, but only AN can change the hydrolysis reaction mechanism for AS in AS/AN and AS/OA mixtures. This study can not only provide
40 important information with respect to the difference in phase transition point under different conditions, but also improve current understanding of the chemical interaction mechanism between nanoparticles (particularly for organic particles) and medium, which is of great significance for haze control across China.

Keywords: Nanoparticles; phase transition micro-dynamics; two-dimensional
45 correlation infrared spectroscopy; hydration interactions; functional groups

1. Introduction

Nanoparticles have long atmospheric lifetimes of weeks to months. As the increase in relative humidity, the sizes of nanoparticles will grow up due to the absorption of water, which may have complex phases and mixing states (Riemer et al., 2019) that
50 influence the light scattering behavior, cloud condensation nuclei properties, lifetime, and chemical reactivity of the particles (Lee and Allen, 2012; Vogel et al. 2016; Abbott and Cronin, 2021). An improved knowledge of these complex phases and states are crucial for investigating the gas–particle interactions in the atmosphere. Since the particle size vs. water uptake relationship is influenced by mixing characteristics of
55 various inorganic and organic compounds (Nguyen et al., 2016; Steinfeld and Pandis, 2016), characterizing the water-aerosol interactions is also critical for identifying the fate and transport of trace species in the Earth’s system and their effects on air quality, radiative forcing, and regional hydrological cycling (Carlton et al., 2020; Fan et al., 2018).

60 Ammonium sulfate is an important constituent and a major source of atmospheric nanoparticles originated from anthropogenic activities (Ruehl et al., 2016; Kirkby et al., 2011; Xu et al., 2020). Various techniques such as the hygroscopic tandem differential mobility analyzer (H-TDMA), the electrodynamic balance (EDB), and the environmental scanning electron microscope (ESEM) have been used to investigate the



65 hygroscopicity of ammonium sulfate (Tang and Munkelwitz, 1977; Tang and
Munkelwitz, 1994; Gysel et al., 2002; Matsumura and Hayashi 2007). These methods
can characterize the deliquescence or phase transition processes of particles down to
nanoscale. However, they usually assume the shapes of nanoparticles to be spherical in
calculation of aerosol liquid water content (ALWC), which may result in large
70 uncertainties when the shapes of nanoparticles show large deviations to the spherical
assumptions. Furthermore, current techniques are also difficult to identify the
intermolecular chemical interactions of phase transition micro-dynamics during
nanoparticle deliquescence process because their limited temporal resolutions are
unable to capture the complex femtosecond-level intermediate states.

75 Recent studies concluded that the phase transition processes of particles may
include multiple intermediate states and are more complex than those indicated in
previous results. These intermediate states differ from one to the other and last less than
10 ms (Esat et al., 2018). A label-free photonic microscope which uses Bloch surface
waves as its illumination source for imaging and sensing is capable to provide real-time
80 measurements of the hygroscopic growth process of a single aerosol with particle
diameter of less than 100 nm (Kuai et al., 2020). This method can provide valuable
insights into the deliquescence and phase transition mechanisms of particles but cannot
determine chemical composition information of particle deliquescence or growth or
phase transition processes. It is necessary to develop a method to characterize the
85 intermolecular interaction mechanisms during hygroscopic growth of nanoparticles,
which is crucial to understand the physicochemical properties of atmospheric aerosol
and the nanoparticle-water interactions in hygroscopic growth, and further for haze
control purpose.

In this study, the hygroscopic growth properties of mixed nanoparticles
90 containing $(\text{NH}_4)_2\text{SO}_4/\text{NaNO}_3$ (ammonium sulfate (AS)/sodium nitrate (AN)) and
 $(\text{NH}_4)_2\text{SO}_4/\text{oxalic acid}$ (AS/OA) and the phase transition interactions of these particles
on molecular scale are characterized on real time by using the Fourier transform
infrared (FTIR) and the two-dimensional correlation infrared (2D-IR) spectroscopic
techniques. We use a FTIR spectrometer and an extended aerosol inorganics model (E-



95 AIM) to characterize and predict the hygroscopic growth of pure AS particle and the
AS/AN and AS/OA mixed particles, respectively. We further use the 2D-IR
spectroscopic technique to analyze the intermolecular interactions of the phase
transition with respect to different levels of relative humidity (RH). This study can not
only provide important information with respect to the difference in phase transition
100 point under different conditions, but also improve current understanding of the
chemical interaction mechanism between nanoparticles (particularly for organic
particles) and medium, which is of great significance for haze control across China.

2. Material and method

2.1 Experiment description

105 The experimental system includes a nanoparticle generation system, a
humidification system, and a FTIR analysis system. Nanoparticles with diameters of
~100 nm (volume equivalent diameter (D_{ve})) are aerosolized by an atomizer (model
255, MetOne), dried by a diffusion dryer (model 3062, TSI), sorted into specific
diameters (D_{ve}) by a differential mobility analyzer (DMA; model 3082, TSI), and
110 finally deposited onto a 3 cm × 3 cm zinc selenide (ZnSe) substrate (Figure 1) inside a
sample cell through a cone-shaped hole. The sheath-to-sample flow ratio of the DMA
is set to be 10:1 (the sheath flow is 10 L/min and the sample flow is 1 L/min), which can
produce an effective mobility for the measured aerosol with size ranging from 14.9 to
673.2 nm. The nanoparticles with a D_{ve} of ~100 nm are selected for deposition. After
115 about a deposition time of 12 h, the substrate is sealed inside the sample cell to obtain
a stable humidity condition for subsequent analysis. The humidification system (Kuai et
al., 2020) can provide a specific RH for the sample cell with a precision of 0.1%. The
FTIR spectrometer (Tensor 27, Bruker Optics, Germany) starts to take absorption
spectra of the samples approximately 5 min after the injection of each designated RH.
120 This time interval is used to stabilize the atmospheric condition inside the sample cell.

The FTIR spectrometer is equipped with a KBr beam splitter and a liquid nitrogen-cooled mercury cadmium telluride (MCT) detector for measuring the absorption spectra of the samples. A He-Ne laser metrology keeps the FTIR instrument in a good optical alignment. The FTIR spectrometer saves middle infrared (MIR) spectra with a spectral
125 range of 800 to 4000 cm^{-1} , spectral resolution of 4 cm^{-1} , and repeat times of 64. The
infrared spectra are first subjected to a baseline correction with Opus 7.0 software, and



then are used to derive the liquid water content using the optical constants of water in the infrared provided by Downing and Williams (Downing and Williams, 1975). We quantify the nanoparticles masses using a simple procedure described in our previous
130 studies without any treatment to the substrates (Wei et al., 2019).

After baseline correction, the infrared spectra are normalized into 2D-IR spectra with the 2D Shige software (Kwansei-Gakuin University, Japan) (Noda and Ozaki, 2014). The wavenumber regions ranging from 2800–3800 cm⁻¹ and from 800–1400 cm⁻¹ which cover the absorption features of almost all identifiable functional
135 groups of interest are selected for analysis. In present work, the red and blue colors in the 2D-IR spectra represent positive and negative correlations, respectively.

2.2 Sample description

In this study, all chemical reagents are produced by Aladdin Reagent Inc. (reagent grade, 99.8% purity), and the water is obtained from an ultrapure water system (Direct-
140 Q3, Millipore). Table 1 lists all chemicals used in the experiment and their concentrations. The single components were dissolved individually in ultrapure water with a concentration of 4.0 g/L. The mixture (including AS/AN and AS/OA) solutions were prepared by mixing the two required single components with a mass ratio of 1:1. AS is selected as the representative inorganic salt and OA is an important water-soluble
145 organic compound contained in atmospheric aerosols. We select AS as the representative inorganic salt because it is a significant component of the submicron-scale aerosol mass in the atmosphere. In addition to an important water-soluble organic compound contained in atmospheric aerosols (Wang et al., 2019), OA is also the dominant dicarboxylic acid in both urban and remote atmospheric aerosols (Richards
150 et al., 2020).

2.3 Methodology

The hygroscopic growth factor (GF), indicating the water uptake ability of aerosol particles, is defined as $GF = D_{wet}/D_0$, where D_{wet} (cm) is the mean diameter of the particles at the designated RH and D_0 (cm) is the mean initial diameter of the dry
155 particles at room temperature. In present work, room temperature is assumed to be 25°C and the RH varies from 50% to 95%. The GF used for investigation of hygroscopic growth properties of nanoparticles can be calculated via equations (1) to (4),



$$V_{water} = \frac{M_{water}}{\rho_{water}} \quad (1)$$

$$V_0 = \sum_i \left(\frac{M_i}{\rho_i} \right) = \sum_i (V_i) \quad (2)$$

$$V_{wet} = V_0 + V_{water} \quad (3)$$

$$GF = \frac{D_{wet}}{D_0} = \left(\frac{V_{wet}}{V_0} \right)^{1/3} \quad (4)$$

Where V_0 (cm^3) is the initial volume of the dry nanoparticle at approximately 25°C , and V_{water} (cm^3) is the water volume contained in the nanoparticle at the designated RH; M_{water} (g) and M_i (g) are the calculated water mass and the mass of the i^{th} pure component at the designated RH, respectively; ρ_{water} (g/cm^3) (approximately $1 \text{ g}/\text{cm}^3$) and ρ_i (g/cm^3) are the densities of water and the i^{th} pure component, respectively, and i is the number of pure component.

We use the E-AIM (UNIFAC) following the Zdanovski-Stokes-Robinson (ZSR) method to predict GF (<http://www.aim.env.uea.ac.uk/aim/aim.php>). The basis of this method is described as,

$$GF_{\text{mix}} = \sum_i (\varepsilon_i GF_i^3)^{1/3} \quad (5)$$

$$\varepsilon_i = \frac{V_i}{\sum_i V_i} \quad (6)$$

Where ε_i is the volume fraction of the i^{th} pure component in the dry mixture, GF_i is the GF of the i^{th} pure component.

3. Results and discussion

3.1 Spectral characteristics of nanoparticles during hygroscopic growth process.

Figure 2 shows the FTIR spectral characteristics of the AS nanoparticles under humidity conditions from 45% to 92%. Figure 3 compares the predicted M_{water}/M_0 (M_{water} is the mass of liquid water in the nanoparticles; M_0 is the initial mass of nanoparticles) ratio after deliquescence from E-AIM (UNIFAC model) (<http://www.aim.env.uea.ac.uk/aim/aim.php>) and the measured hygroscopic growth properties from the FTIR spectra for the AS particles. The results show that the



185 predicted and measured M_{water}/M_0 results are generally consistent throughout the
humidification process. The strong peaks observed at 3250 cm^{-1} and 1112 cm^{-1} at the
initial RH of 45% are the stretching vibration peak of OH and the symmetrical
stretching vibration (ν_s) peak of the sulfate, respectively (Wang et al., 2017; Nájera and
Horn, 2009; Gopalakrishnan et al., 2005). With the increase in RH between 45% and
80%, the peak position of the symmetrical stretching vibration of the sulfate (1112 cm^{-1})
190 starts to redshift slowly (Figure 3), which indicates that water molecules have been
attached to the surface of the solid AS, and the sulfate is then bonded with these water
molecules to form a hydrogen bond during this hydration process (Yeşilbaş and Boily,
2016). The area of OH reflects the liquid water content in the ZnSe substrate. We find
that, in the meantime, the area and position of the OH stretching peak did not change
195 significantly, which indicates that no hygroscopic growth of the AS nanoparticles
occurs. All these behaviors are captured on real time by the FTIR spectra. (Wang et al.,
2019; Tang et al., 2016; Nájera and Horn 2009; Martin 2000)

When the RH reaches 80%, the peak position of the sulfate shifts to 1099 cm^{-1} , the
O-H stretching peak is still the same as that in initial humidity condition (45%) but the
200 area of the peak increase abruptly from 0.25 to 5.47 (Figure 3). This indicates that the
nanoparticles have absorbed water rapidly and transformed from the crystalline phase
to the aqueous phase. According to the E-AIM predictions and the results from previous
studies (Estillore et al., 2016; Cruz and Pandis, 2000; Tang 1982), this process is called
the deliquescence, and the RH at this stage is referred to as the deliquescence RH (DRH).
205 When deliquescence occurs, NH_4^+ molecules hydrated with SO_4^{2-} are replaced with
 H_2O molecules, which leads to the redshift in the symmetrical stretching vibration peak
for the sulfate (Dong et al., 2007). Tang et al. (1982), Cruz and Pandis (2000), and
Estillore et al. (2016) have used the photonic microscope to observe hygroscopic
growth properties of big-size particles. Our method and the size of particle are different
210 from previous studies, but we obtained a consistent DRH to those in Tang et al. (1982),
Cruz and Pandis (2000), and Estillore et al. (2016). Since the particle size ($\sim 100\text{ nm}$) in
this study is much smaller than those in previous studies and is not influenced by Kelvin
effect, we can capture the hygroscopic growth properties of nanoparticles on real time
with the FTIR spectroscopy.

215 The AS nanoparticle continues to be humidified after deliquescence, resulting in a
further increase in OH area due to continuous water uptake. However, the peak position



of the sulfate keeps constant regardless of RH, indicating that the AS is still in the aqueous phase after deliquescence. As the increase in RH, the nanoparticle volume increases but its mass keeps constant, resulting in a decrease in concentration and peak area. Figure S1 compares the predicted M_{water}/M_0 (M_{water} is the mass of liquid water in the nanoparticles; M_0 is the initial mass of nanoparticles) ratio from E-AIM (UNIFAC model) (<http://www.aim.env.uea.ac.uk/aim/aim.php>) and the measured hygroscopic properties (Measured M_{water} and M_0 are calculated from the IR spectroscopy in Sect. 2.1) from the FTIR spectra for the AS particles with a dry diameter of 100 nm. The results show that the predicted and measured M_{water}/M_0 results are consistent after deliquescence, indicating continuous particle water uptake with the increase in RH. It indicated FTIR could be a method to quantitative analysis M_{water} and M_0 .

Figure 4 shows the FTIR spectral characteristics of the OA nanoparticles under humidity conditions from 40% to 90% (RH). The results for the OA nanoparticle differ from those for AS. Throughout the humidification processes, the O-H stretching peak at 3250 cm^{-1} for liquid water was not detected, indicating that liquid water is not absorbed by the OA. The peaks at 3400 cm^{-1} and 1240 cm^{-1} are for O-H and the C=O stretching vibration of OA (Jing et al., 2016), respectively. It shows that the positions and areas of these peaks are also independent of RH. This verifies that no water is absorbed and that no deliquescence transition occurs within the whole RH range.

Figure 5 compares the predicted and measured M_{water}/M_0 results for the AS/OA and AS/AN nanoparticle mixtures during the humidification processes from 60% to 95% (RH). The predicted and measured M_{water}/M_0 values showed similar behaviour during these humidification processes. This means that the liquid water absorbed by pure and mixed particles could be measured on real time using the FTIR spectroscopy.

3.2 Hygroscopic growth of pure and mixed-component nanoparticles

With the results derived from the FTIR measurements, we calculated the GFs for both pure and mixed nanoparticles via equation (4) and investigated their variabilities with respect to the changes in RH. Figure 6 compares the measured and predicted GF for both pure and mixed nanoparticles under the humidity conditions from 50% to 95%. The measured and predicted GF are in good agreement. The GF can be obtained precisely using the H-TDMA technique via a direct measurement to the aerosol diameter. In this study, the GFs for both pure and mixed compounds are calculated with liquid water content and the relative masses of dry compound obtained from FTIR



250 measurements. Though with different methods, the DRH and GF for different
components in this study are in good agreement with those from previous studies(Jing
et al., 2016; Braban et al., 2003).

The GF curves can be used to investigate the sensitivity of particle volume to RH.
If the RH is less than 80%, the AS nanoparticles are in a stable crystal state that is
255 immune to water and the size of these particles keeps constant. At the RH of $79.9 \pm$
 0.10% , deliquescence occurs, the nanoparticle volume grows up sharply by up to
approximately 3.1 times and transforms from the crystalline to aqueous phase. As RH
keeps increasing after deliquescence, the AS nanoparticles become fully liquid droplets,
and their volumes keep increase due to further water uptake.

260 Since both the AS/AN and AS/OA mixed nanoparticles absorb liquid water below
their DRH, their GF curves differ from the pure AS particle, and their DRH values were
lower than that of the AS. The results are in good agreement with previous
studies(Seinfeld and Pandis, 2016) which measure GF by H-TDMA. As a result, FTIR
measurement technique in this study provide a real-time method to characterize the
265 hygroscopic growth of aerosols.

3.3 Phase transition dynamics of pure AS nanoparticles

Although FTIR measurements can be used to characterize the liquid water content
and functional groups contained in the nanoparticles during the humidification process,
it is difficult to separate the absorption peaks of the nanoparticles (especially for organic
270 compounds) since these absorption peaks are overlapped. In contrast, 2D-IR
spectroscopic technique can resolve the overlapping peaks(McKelvy et al., 1998; Du et
al., 2021) and, more importantly, can provide detailed information about the dynamic
deliquescence processes of the functional groups(Noda and Ozaki, 2014). Synchronous
correlation maps reflect the simultaneous changes that occur in the two separate spectral
275 intensity variations. Asynchronous spectra can be used to identify the occurrence
sequential order of the hydration interactions caused by external perturbations (Jing et
al. 2016).

Figure 7 shows the synchronous and asynchronous correlation maps derived from
the 2D-IR measurements for the pure AS compounds. The corresponding correlation
280 maps are not shown for the OA nanoparticles because they absorbed no water and thus
presented no deliquescence transition during the humidification process. From the



synchronous map, one main red/positive (3250, 1097) auto-peak was observed for the AS nanoparticles in the 50–90% RH range, which indicated the existence of coherent variation in those spectral intensities. In addition, the existence of coupling of the spectral intensity variations for the O-H stretching peak for liquid water and the symmetrical stretching vibration for the sulfate in the aqueous AS is also possible. Furthermore, two main blue/negative (1112, 1097) and (3250, 1112) auto-peaks were also observed for the AS nanoparticles, which indicates that the O-H stretching peak intensity is increasing, while the symmetrical stretching vibration for the sulfate when hydrated with NH_4^+ in the solid is decreasing. The blue/negative (1112, 1097) auto-peak indicates that the intensity of the symmetrical stretching vibration for the sulfate in the aqueous AS increased, while that in the solid AS decreased, and these two chemical bonds can be converted into each other. This behavior can thus be explained by the fact that NH_4^+ particles hydrated with SO_4^{2-} are being replaced by H_2O molecules with increase in RH.

In addition to the synchronous map, the asynchronous map indicates the sequential changes in the spectral intensities in response to the hygroscopic activities. Two main red/positive (3250, 1097) and (1112, 1097) and two main blue/negative (3250, 1112) and (1097, 1112) auto-peaks are observed for the AS nanoparticles, which indicated that the peaks changed in the order from (1112) cm^{-1} > (3250) cm^{-1} > (1097) cm^{-1} . The intensity of the symmetrical stretching vibration for the sulfate when hydrated with NH_4^+ in the solid would decrease, and then water molecules would attach to the surface of the solid $(\text{NH}_4)_2\text{SO}_4$ (Yeşilbaş and Boily, 2016); finally, NH_4^+ particles hydrated with SO_4^{2-} are replaced by the H_2O molecules and the AS nanoparticles then become fully liquid droplets. This indicates that the surface-limited processes may control the water transport to the AS.

3.4 Phase transition dynamics of mixed nanoparticles

Figure 8 shows the synchronous and asynchronous correlation maps for the AS/AN mixture nanoparticles. In the synchronous map, one main red/positive (3250, 1097) and two blue/negative (1320, 1112) and (3250, 1112) auto-peaks were observed for the AS/AN nanoparticles (mass ratio of 1:1) in the RH range from 50–90%. This can be explained by the fact that NH_4^+ particles hydrated with SO_4^{2-} and NO_3^- are replaced by the H_2O molecules with increasing RH. In the asynchronous map, three main red/positive (3250, 1097), (1097, 1112), and (1320, 1097) and two main blue/negative



315 (3250, 1320) and (1112, 1097) auto-peaks are observed, which indicates that the peaks
change in the order from (1320) cm^{-1} > (3250) cm^{-1} > (1097) cm^{-1} > (1112) cm^{-1} . This
indicates that the nitrate would be in the aqueous solution at a lower RH than the sulfate
because the AN has a lower DRH (RH=74.3±0.4%, (Seinfeld and Pandis, 2016; Tang
and Munkelwitz, 1993)), and the characteristics of the nitrate when hydrated with water
320 differ from those of the sulfate. Furthermore, the hydrolysis reaction mechanism for the
sulfate in AS/AN may differ from that for the pure sulfate. One possible explanation
for this phenomenon is that the nitrate would begin to absorb water at low RH, which
enhances the dissolution of the AS. Therefore, the NH_4^+ particles that would be
hydrated with the sulfate are replaced by the H_2O molecules, and the intensity of the
325 symmetrical stretching vibration for the sulfate in the solid AS nanoparticles would then
decrease (Jing et al., 2016).

Figure 9 shows the synchronous and asynchronous correlation maps for the
AS/OA mixture nanoparticles. In the synchronous map, one main red/positive (3260,
1080) and two main blue/negative (1112, 1050) and (3250, 1112) auto-peaks were
330 observed for the AS/OA nanoparticles in the RH range from 50–90%. The two
blue/negative auto-peaks are transformed into each other, and the intensity of the
symmetrical stretching vibration for the sulfate in aqueous form increases while that in
the solid form decreases. In the asynchronous map, one main red/positive (3250, 1080)
and one main blue/negative (3250, 1112) auto-peaks are observed, which indicated that
335 the peaks change in the order from (1112) cm^{-1} > (3250) cm^{-1} > (1080) cm^{-1} . Therefore,
the hydrolysis reaction mechanism for the sulfate in AS/OA may be similar to that for
the pure sulfate. The 2D-IR measurements could thus provide a real time method to
characterize the dynamic variability of the nanoparticles during the hygroscopic growth
process.

340 4. Conclusions

In this work, we demonstrate use of FTIR spectroscopy to measure the hygroscopic
growth properties of assembled nanoparticles and combine this technique with 2D-IR
spectroscopy to identify the occurrence sequential order of the hydration interactions
and provide detailed information about the dynamic deliquescence processes of the
345 functional groups. This approach enabled measurement of the water content and the dry
nanoparticle mass to characterize the hygroscopic GF and also further investigation of
the deliquescence process, with results that were matched well with those obtained from



the E-AIM and the H-TDMA technique in the 50–95% RH range. Furthermore, we used
2D-IR spectroscopic technique to resolve the overlapping peaks and provide detailed
350 information about the dynamic deliquescence processes of the functional groups. For
pure AS, the intensity of the symmetrical stretching vibration for the sulfate when
hydrated with NH_4^+ in the solid would decrease, and water molecules would then attach
to the surface of solid AS before the NH_4^+ particles hydrated with SO_4^{2-} are finally
replaced by the H_2O molecules and the AS nanoparticles become fully liquid droplets.
355 For the AS/AN and AS/OA mixtures, both the AN and OA compounds could lower the
deliquescence point for AS. However, AN may have changed the hydrolysis reaction
mechanism for the sulfate in AS/AN while the OA did not, which resulted in differences
between the results obtained for the sulfates in the pure and mixed nanoparticles.

Therefore, 2D-IR spectroscopic technique represents a suitable method for study
360 of the hygroscopic growth micro-dynamics of nanoparticles and would provide insight
into the intermolecular interactions that govern the physicochemical properties of the
aerosol and enable better understanding of the nanoparticle-water interactions during
the phase transitions.

Author contribution

XW designed the experiment and wrote the paper with contributions from all co-
365 authors; HG contribute to science discussions and suggested analyses; HD and JZ
prepared for the humidification system; YC, JW, YY and JL contributed to this work by
providing constructive comments; YS contributed to this work by providing
constructive comments, review, and editing.

Competing interests

The authors declare that they have no conflict of interest that could have appeared
370 to influence the work reported in this paper.

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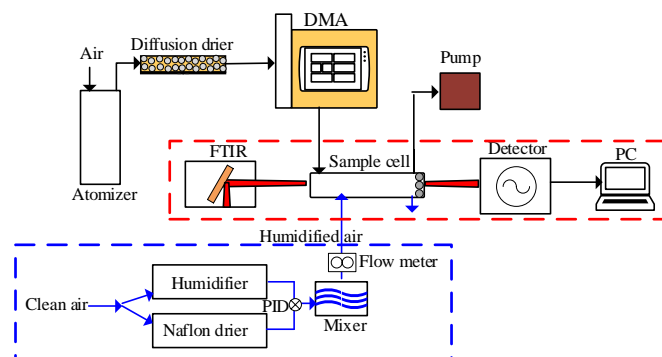
Table

Table 1. Properties of chemicals used in this study

Chemical compound	Mol wt, g/mol	Density, g/cm ³	Solubility, g per 100 cm ³ H ₂ O, 20 °C
(NH ₄) ₂ SO ₄ (AS)	132.14	1.769	75.4
NaNO ₃ (AN)	84.99	2.257	88
Oxalic acid (OA)	90.04	1.900	9.52

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Figures



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Figure 1. Diagrammatic sketches of the experimental system used to measure nanoparticle hygroscopicity.

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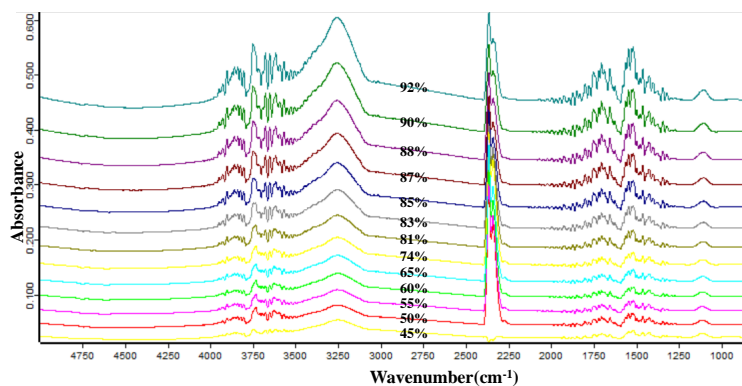


Figure 2. FTIR spectral characteristics of the AS nanoparticles under humidity conditions from 45% to 92%.

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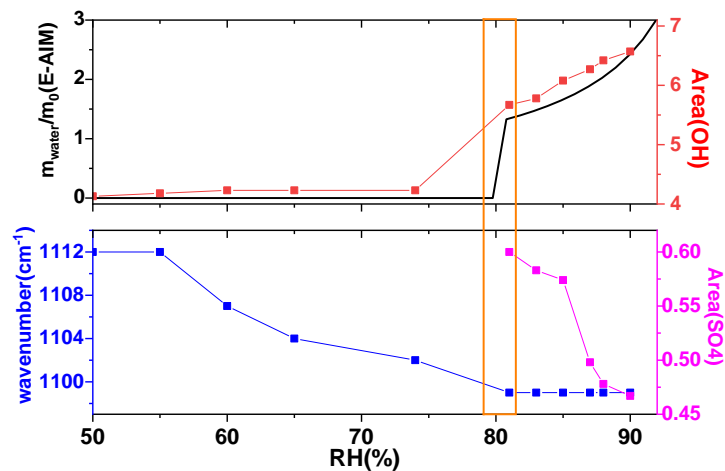


Figure 3. Comparison of the predicted m_{water}/m_0 and measured hygroscopic properties of AS particles from FTIR with a dry diameter of 100 nm in the humidification process as a function of RH. The black curves show the E-AIM (UNIFAC) predictions.

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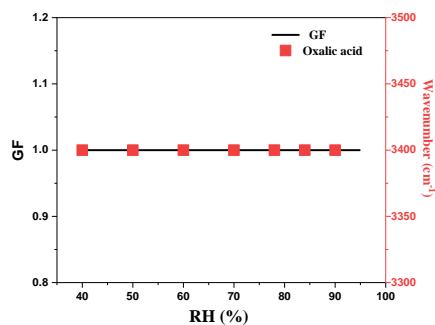


Figure 4. FTIR spectra of OA nanoparticles with a dry diameter of 100 nm.

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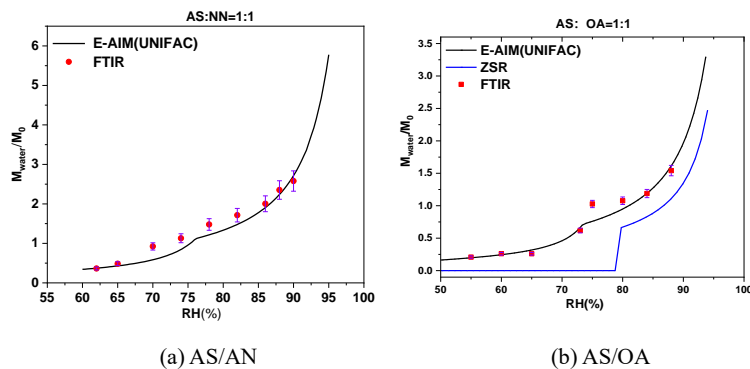
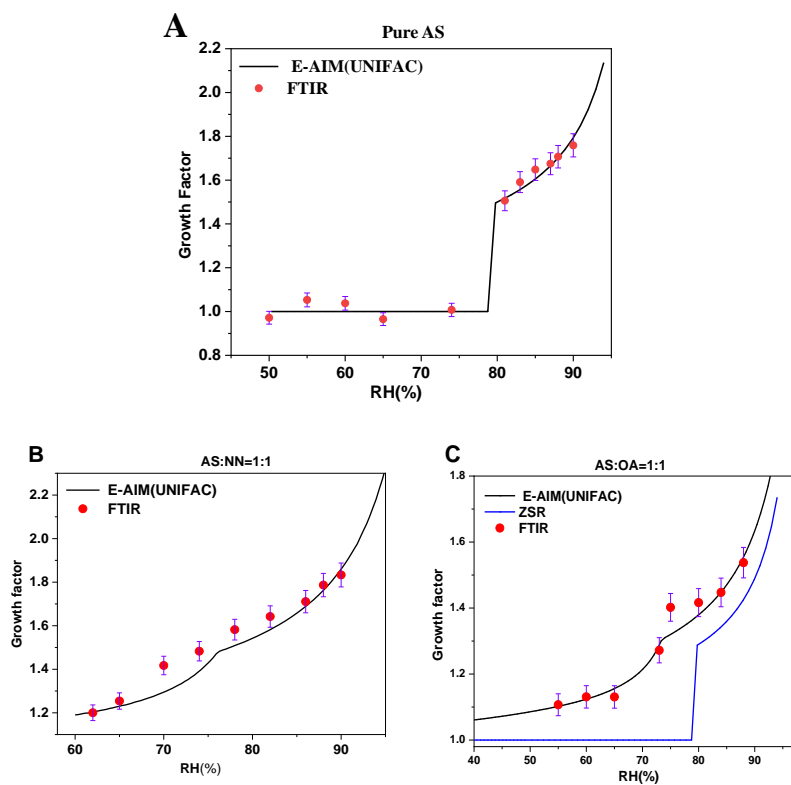


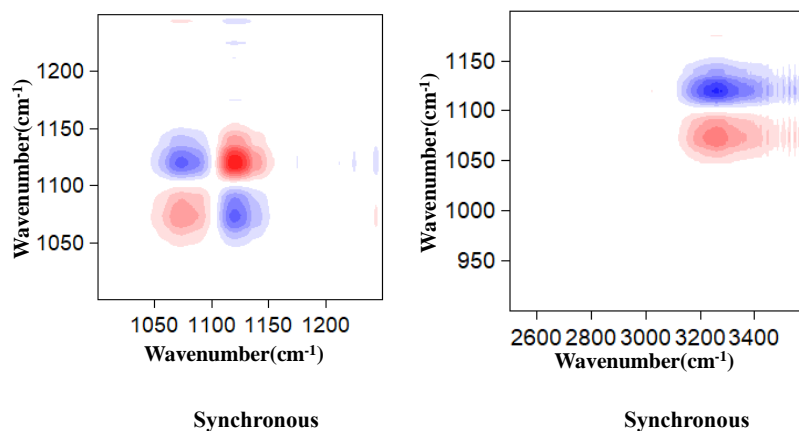
Figure 5. Comparison of the predicted M_{water}/M_0 results and measured hygroscopic properties from the FTIR spectra of (a) AS/OA and (b) AS/AN particles with a dry diameter of 100 nm during the humidification process as a function of the RH. The black curves represent the E-AIM (UNIFAC) predictions.

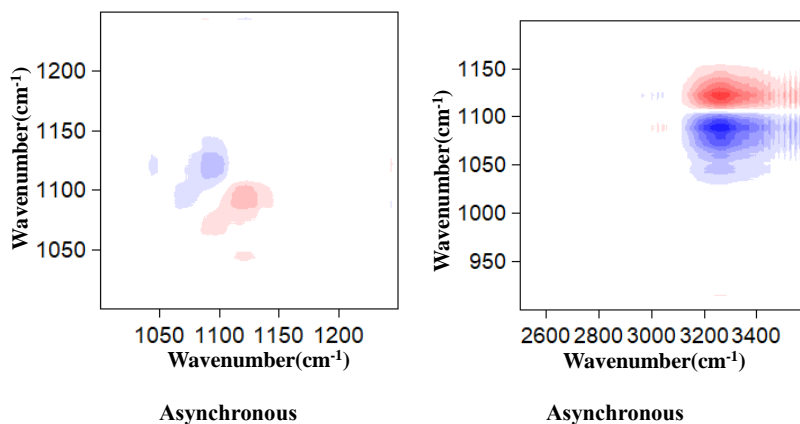
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545 **Figure 6** Comparison of the measured and predicted growth factor (GF) values of different component nanoparticles: (A) pure AS; (B) AS/AN; and (C) AS/OA. The error bars are shown.

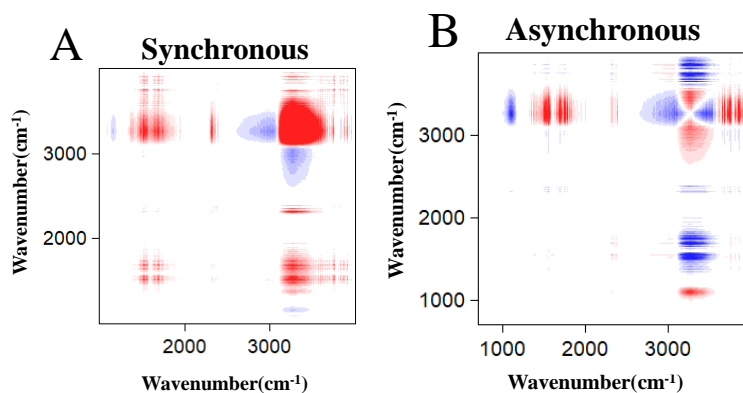
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555 **Figure 7** Aynchronous and asynchronous two-dimensional correlation maps generated from the 4000–800 cm^{-1} region of the FTIR spectra for AS. Red and blue represent the positive and negative correlations, respectively.

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565 **Figure 8.** Synchronous and asynchronous two dimensional correlation maps generated in the 800 – 4000 cm^{-1} region of the FTIR spectra for AS/AN. Red and blue represent the positive and negative correlations, respectively.

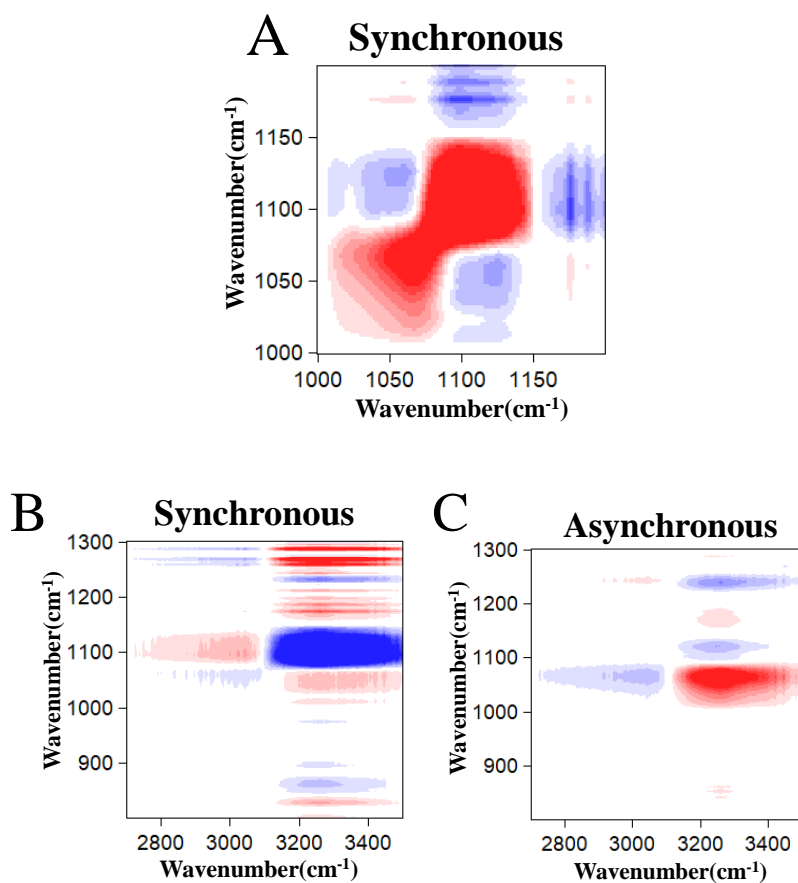
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Figure 9. Two dimensional synchronous and asynchronous correlation maps generated in the 800 – 4000 cm^{-1} region of the FTIR spectra for AS/OA. Red and blue represent positive and negative correlations, respectively. (A) Synchronous 2D-IR correlation spectrum; (B) synchronous 2D-IR correlation spectrum; (C) asynchronous 2D-IR correlation spectrum;

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