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\*CORRESPONDENCE Mijung Song, 🛙 mijung.song@jbnu.ac.kr

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# Morphology and phase state of PM<sub>2.5</sub> in urban and coastal-rural areas during summer

Sanjit Gaikwad<sup>1</sup>, Daeun Kim<sup>1</sup>, Rani Jeong<sup>1</sup>, Ji Yi Lee<sup>2</sup>, Kwangyul Lee<sup>3</sup>, Junyoung Ahn<sup>4</sup>, Kyoung-Soon Jang<sup>5</sup>, Changhyuk Kim<sup>6</sup> and Mijung Song<sup>1.7</sup>\*

<sup>1</sup>Department of Environment and Energy, Jeonbuk National University, Jeonju-si, Republic of Korea, <sup>2</sup>Department of Environmental Science and Engineering, Ewha Womans University, Seoul, Republic of Korea, <sup>3</sup>Division of Climate and Air Quality Research, National Institute of Environmental Research, Chungcheong Region Air Quality Research Center, Seosan, Republic of Korea, <sup>4</sup>Department of Atmospheric Environment Research, National Institute of Environmental Research, Seoul, Republic of Korea, <sup>5</sup>Bio-Chemical Analysis Team, Korea Basic Science Institute, Cheongju, Republic of Korea, <sup>6</sup>School of Civil and Environmental Engineering, Pusan National University, Busan, Republic of Korea, <sup>7</sup>Department of Earth and Environmental Sciences, Jeonbuk National University, Jeonju-si, Republic of Korea

The morphology and phase state are critical physical properties of aerosol particles. However, studies related to the analysis of these properties primarily focus on laboratory experiments, and studies on real aerosol particles are limited. Herein, fine particulate matter (PM<sub>2.5</sub>) filter samples were obtained to investigate and compare the morphology and phase state of ambient aerosol particles in South Korea. The  $PM_{2.5}$  samples were collected in the summer of June 2021 from two different environments: Seoul (urban) and Seosan (coastal-rural). Optical microscopy was combined with the poke-and-flow technique to determine the morphology and phase state of the  $PM_{2.5}$  as a function of relative humidity (RH) at 293 + 1 K. At both sites, the PM<sub>2.5</sub> droplets, which were extracted in purified water, showed a multiphase nature that was dependent on the RH and chemical composition. Based on the results and ambient average RH in Seoul, most of the PM<sub>2.5</sub> was observed in a liquid state on polluted days under an inorganic-dominant condition, but in a semisolid state on clean days under an organic carbon-rich condition. In Seosan, the PM<sub>2.5</sub> predominantly existed in a liquid state, due to the high RH caused by proximity to the Yellow Sea. Our study provides fundamental physical properties of PM<sub>2.5</sub> for both urban and coastal-rural environments. The results have strong applications for atmospheric chemistry and predicting particle size distributions.

KEYWORDS

liquid, semisolid, solid, air pollution, aersol

#### 1 Introduction

In Asia, rapid industrialization and infrastructure developments have resulted in environmental issues associated with an increase in air pollution and a decrease in air quality (Masson-Delmotte et al., 2021). Among the various atmospheric pollutants, fine particulate matter ( $PM_{2.5}$ ) significantly affects climate change and human health (Song Y. et al., 2019; Bhattarai et al., 2020; Masson-Delmotte et al., 2021). These effects are influenced by the physicochemical properties of  $PM_{2.5}$ , including chemical composition, size, phase state, and morphology (Seinfeld and Pandis. 2016). Field studies have reported that  $PM_{2.5}$  is predominately comprised of a mixture of thousands of organic molecules and some inorganic substances (Jimenez et al., 2009; Zhang et al., 2011; Kim et al., 2022).

 $PM_{2.5}$  can undergo phase transitions in the atmosphere, resulting in different morphologies and phase states. Depending on the relative humidity (RH), temperature, and particle chemical composition,  $PM_{2.5}$  morphology can shift between being homogeneous, core-shell, or partially engulfed (Reid et al., 2011; Song et al., 2013). Studies using atmospherically relevant particles have shown that aerosol particles often exhibit a phase-separated morphology when the oxygen-to-carbon ratio (O: C) of their organic materials is less than 0.8 (Bertram et al., 2011; Krieger et al., 2012; Song et al., 2012; Zuend and Seinfeld. 2012). These different morphologies can affect the heterogeneous chemical reaction rate, water uptake, and gas-to-particle partitioning (Zuend and Seinfeld. 2012; Lam et al., 2021; Mikhailov et al., 2021).

PM<sub>2.5</sub> can exist in a liquid, semisolid, or solid phase state in the atmosphere, and the phase state is vital for predicting the size distribution, mass concentration, heterogeneous reactivity, and ice nucleation efficiency of its particles (Shiraiwa et al., 2013; Kim et al., 2019; Knopf et al., 2018; Li et al., 2018; Zaveri et al., 2018). The phase state of  $PM_{2.5}$  can be determined by the range of viscosity, where liquid (viscosity  $< 10^2$  Pa s), semisolid (viscosity of  $10^2 - 10^{12}$  Pa s), and solid (viscosity >  $10^{12}$  Pa s) (Koop et al., 2011). Various laboratory studies have shown that the RH, water affinity, and chemical composition of aerosol particles significantly impact their phase states (Koop et al., 2011; Grayson et al., 2016; Rothfuss and Petters. 2017; Song M. et al., 2019; Champion et al., 2019; Petters et al., 2019; Song et al., 2021; Ham et al., 2019; Jeong et al., 2022). However, comparatively few field studies have observed the phase states of real-world aerosol particles (Bateman et al., 2016; Liu et al., 2021b; Cheng et al., 2021; Song et al., 2022). More data on the morphologies and phase states of real-world aerosol particles are required to accurately describe the impact of aerosols on atmospheric chemistry and the climate.

To achieve this,  $PM_{2.5}$  was simultaneously collected at two different sites in South Korea in June 2021 including Seoul (urban) and Seosan (coastal-rural). Seoul is a highly populated urban area and one of the world's megacities, whereas Seosan is a coastal-rural area surrounded by an agricultural complex, the Yellow Sea, and coal power plants. Morphologies and phase states of  $PM_{2.5}$  droplets were observed at  $293 \pm 1$  K upon dehydration, using optical microscopy and a poke-and-flow technique. The results of these two methods were combined with ambient RH conditions to estimate and compare the phase states of  $PM_{2.5}$  in these urban and coastal-rural areas during summer.

#### 2 Materials and methods

#### 2.1 Measurement sites

 $PM_{2.5}$  filter samples were simultaneously collected in Seoul (37.61°N, 126.93°E) and Seosan (36.78°N, 126.49°E) in South Korea during June 1–30, 2021 (Supplementary Figure S1). Seoul is a megacity with heavy traffic and dense residential areas (Kim et al., 2022). The sampling site in Seoul was operated by the National Institute of Environmental Research in Bulgwang-dong,

Eunpyeong-gu. Seosan is a coastal-rural area surrounded by agricultural clusters, ~15 km from the Yellow Sea, and ~26 km from petrochemical complexes. This site has one of the highest annual  $PM_{2.5}$  levels in Korea, even though it is a rural area (Ju et al., 2020). The Seosan measurement site was operated by the National Institute of Environmental Research in Suseok-dong, Seosan-si, Chungcheongnam-do.

#### 2.2 Collection and generation of PM<sub>2.5</sub>

 $PM_{2.5}$  was collected on quartz filters (8 × 10 inches, Pall Co., United States) every 23 h (from 10:00 a.m. to 09:00 a.m., local time) using high-volume air samplers at a flow rate of ~1000 L/m (HV-1000R, SIBATA, Japan). The samples were immediately stored in a freezer at ~255 K after collection. We focused on samples with high PM<sub>2.5</sub> concentrations at least one of the two sites, i.e., a daily mean concentration  $\geq$  35 µg/m<sup>3</sup>, which is the standard daily level of PM<sub>2.5</sub> in Korea (Ministry of Environment, 2021). Based on this, six cases (Cases 1-6) were selected from both sites (yellow shaded regions in Supplementary Figure S2), which included high PM<sub>2.5</sub> episodes. The samples in Cases 1-6 that were considered unsuitable for analysis were excluded, such as the sample collected in Seosan on 28 June 2021, owing to the considerably low surface tension of the PM<sub>2.5</sub> droplets on the substrate. In total, 17 filter samples (nine from Seoul and eight from Seosan) were investigated for phase states. Table 1 provides information on the daily mean concentrations, chemical compositions (Supplementary Section S1), O:C (Supplementary Section S2), and aerosol liquid water content (Supplementary Section S3) of PM<sub>2.5</sub> for Cases 1-6 in Seoul and Seosan. An overview of the measurements at the two different sites is provided in Supplementary Section S4. The filter samples for Cases 1-6 were extracted as water-soluble organic and inorganic compounds in deionized water (18.2 MΩ cm, Merck Milli-Q<sup>®</sup>, Millipore, United States) for morphology and phase experiments within 3 months after collection. Previous studies showed that water-soluble organic and inorganic species were comprised of more than ~70% in PM<sub>2.5</sub> (Huang et al., 2012; Liu et al., 2021a). A nebulizer (MEINHARD®, United States) was used to nebulize the extracted PM2.5 droplets onto a hydrophobic substrate for morphology observation (Section 2.3) and poke-and-flow experiments (Section 2.4).

#### 2.3 Optical microscopy for PM<sub>2.5</sub> droplets

A flow-cell was used to perform temperature- and RHcontrolled measurements for  $PM_{2.5}$  droplets on a hydrophobic substrate (Song et al., 2012; Jeong et al., 2022). The  $PM_{2.5}$ droplets were equilibrated at ~100% RH and 293 ± 1 K for ~20 min at the start of the experiment. The RH was then lowered at a rate of 0.5% RH/min. Morphological analysis was carried out using an optical microscope; detailed procedures and methods are described in previous reports (Gaikwad et al., 2022; Song et al., 2022). An optical microscope (BX4 × 3, ×40 objective; Olympus, Japan) was used to monitor and capture morphology changes at 10 s intervals during the dehydration process, using a camera with a charge-coupled device (CCD) (DigiRetina 16, Tucsen,

TABLE 1 A summary of the average daily mass concentration, chemical composition, oxygen-to-carbon ratio (O:C), and aerosol liquid water content (ALWC) of PM<sub>2.5</sub>, and ambient relative humidity (RH) based on filter sampling intervals in seoul and seosan for Case 1–6 in 2021. Phase state of the bulk of PM<sub>2.5</sub> at mean ambient RH is also included.

Date	PM <sub>2.5</sub>	${\sf NH_4}^+$	$NO_3^-$	SO4 <sup>2-</sup>	OC	EC	O:C	ALWC	Ambient RH	Phase state	
	(µg/m³)	(µg/m³)	(µg/m³)	(µg/m³)	(µg/m³)	(µg/m³)		(µg/m³)	(%)	At mean RH	
Seoul											
06.05	45.9	7.9	12.4	10.0	5.1	1.2	0.45	41.2	71.1	Liquid	
06.09	33.0	2.2	3.9	3.3	8.1	1.8	0.49	6.0	56.7	Semisolid	
06.12	15.5	0.9	1.0	2.0	3.9	0.7	0.49	3.9	72.0	Semisolid	
06.13	24.7	2.4	3.0	4.1	5.2	1.0	0.45	10.0	72.0	Semisolid	
06.14	42.6	6.0	12.7	5.4	8.0	1.5	0.45	21.8	68.1	Semisolid	
06.19	40.3	7.1	11.2	8.9	4.8	0.7	0.44	31.5	71.0	Semisolid	
06.20	51.2	9.9	17.1	11.1	5.0	1.0	0.50	61.2	74.4	Liquid	
06.24	37.8	5.9	8.9	7.8	4.3	0.8	0.46	24.5	70.3	Semisolid	
06.28	15.9	1.6	1.0	4.0	3.2	0.6	0.51	7.5	77.1	Semisolid	
Mean	34.1	4.9	7.9	6.3	5.3	1.0	0.47	23.1	70.3		
Seosan											
06.05	45.7	6.8	11.7	7.5	5.9	0.8	0.47	94.4	84.0	Liquid	
06.09	31.5	3.7	3.8	5.1	8.2	1.0	0.46	23.2	66.9	Semisolid	
06.12	24.3	4.0	6.5	4.4	4.8	0.6	0.46	44.2	79.8	Liquid	
06.13	20.5	3.8	4.1	5.4	2.6	0.4	0.46	130.9	85.6	Liquid	
06.14	24.3	4.5	6.1	5.4	3.6	0.6	0.47	28.1	82.3	Liquid	
06.19	33.9	6.4	9.9	7.0	3.2	0.4	0.47	187.9	83.3	Liquid	
06.20	48.7	9.1	15.3	9.2	5.2	0.8	0.51	152.1	81.3	Liquid	
06.24	26.0	4.2	6.8	4.5	4.0	0.5	0.47	132.9	82.3	Liquid	
Mean	31.9	5.3	8.0	6.1	4.7	0.7	0.47	105.4	80.7		

China). The RH in the flow-cell was calibrated at 293  $\pm$  1 K by measuring the deliquescence RH of K<sub>2</sub>CO<sub>3</sub> (at 44% RH) and NaCl (at 76% RH) (Winston and Bates. 1960), resulting in RH uncertainty of  $\pm$ 1.5%. The RH in the flow-cell was adjusted by the ratio of dry N<sub>2</sub> gas to saturated H<sub>2</sub>O gas (total flow rate: 500 sccm). The temperature range of the experiment (293  $\pm$  1 K) was similar to the actual mean temperature in Seoul (297  $\pm$  3 K) and Seosan (295  $\pm$  3 K).

# 2.4 Poke-and-flow technique for PM<sub>2.5</sub> droplets

A poke-and-flow technique was adopted to analyze the  $PM_{2.5}$  phase state as semisolid or solid, hereafter referred to as (semi) solid as described by Renbaum-Wolff et al. (2013); Song M. et al. (2019). The procedure was detailed in previous studies (Renbaum-Wolff et al., 2013; Gaikwad et al., 2022). The  $PM_{2.5}$  droplets were conditioned at ~ 100% RH. Subsequently, the RH was decreased to ~40% at a rate of ~1% RH/min, and the RH was

then adjusted from approximately 40% to 0% at ~ 10% decrements. At a given RH, the droplets were conditioned for ~2 h before being poked. A sharp needle (Jung Rim Medical Industrial, South Korea) was used to poke the droplets at each decrement to determine the RH at which the particles cracked. Subsequently, the geometry was observed for ~3 h to observe the occurrence of fluid flow. Based on previous studies using the poke-and-flow technique, when no flow was observed, the viscosity was determined to be >  $\sim 1 \times 10^8$  Pa·s (Song et al., 2015; Grayson et al., 2016). However, this technique did not allow for measurements in the semisolid viscosity range of 10<sup>2</sup>-10<sup>8</sup> Pa·s because the PM<sub>2.5</sub> was supersaturated with inorganic substances such as ammonium sulfate and ammonium nitrate upon dehydration. The PM2.5 droplets were observed with an optical microscope (CKX5 × 3, ×40 objective; Olympus, Japan) before, during, and after being poked; the process was captured using a CCD camera (C11440-42U30, Hamamatsu, Japan). A temperature of  $\sim 293 \pm 1$  K was maintained during the experiments, which reflected the ambient temperature range recorded at the two sampling sites.

	Seoul				В		Seosa	n	
Date	Liquid	Liquid- liquid	Liquid- liquid- (semi)solid	(Semi)solid	Date	Liquid	Liquid- liquid	Liquid- liquid- (semi)solid	(Semi)solio
6/05	88.0%	87.8%	63.9%	Ø 38.3%	06/05	94.0%	85.0%	68.8%	<b>0</b> 36.2%
			•	٠				•	•
6/09	85.3%	84.7%	77.9%	NA	06/09	90.5%	90.2%	<b>0</b> 7,2.2%	<b>0</b> 24.1%
0.09			-					•	٠
6/12	89.0%	88.7%	83.8%	NA	06/12	90.5%	89.0%	*	•
		0	0						
	93.3%	92.7%	82.9%	43.3%	06/13	87.5%	87.0%	75.2%	<b>0</b> 47.4%
6/13			0	•					•
	84.5%	84.0%	75.2%	26.8%	06/14	89.0%	88.7%	73.6%	40.7%
6/14			0	•			0	•	•
	82.9%	81.0%°	0 74.6%	Q 43.2%	06/19	90.8%	90.0%	62.5%	39.4%
6/19			0	•				•	•
	88.9%	88.0%	67.4%	41.4%	06/20	95.0%	94.9%	<b>0</b> 61.4%	() 41.7%
6/20			•					•	•
ļ	85.7%	85.3%	78.8%	<b>0</b> 38.2%	06/24	83.0%	82.8%	76.2%	<b>0</b> 39.7%
06/24		•	0	•			•	0	•
	87.3%	86.9%	<b>82.2%</b>	37.0%	• 1	iquid orga iquid inorg	ganic-rich	phase	
28				0.070		iquid orga Semi)solid	nic-rich ph inorganic-i		

#### FIGURE 1

Optical images of the morphology changes of  $PM_{2.5}$  droplets at 293  $\pm$  1 K with decreasing relative humidity (RH) for **(A)** seoul and **(B)** seosan. "*NA*" denotes the droplet morphology that was not observed optically. Cartoons are provided to assist in the interpretation of the observed morphologies. Cyan: liquid organic/inorganic phase; blue: liquid inorganic-rich phase; green: liquid organic-rich phase; dark yellow: (semi) solid inorganic-rich; and dark grey: (semi) solid organic/inorganic phase. The scale bar in the optical images denotes 20  $\mu$ m.

# 3 Results and discussion

#### 3.1 Morphology of PM<sub>2.5</sub> droplets

PM<sub>2.5</sub> was collected in the summer of 2021 in the urban and coastal-rural environments of Seoul and Seosan, respectively, including high PM2.5 episodes. The samples for each site were labeled as Cases 1-6 (per site), and the morphology of the PM<sub>2.5</sub> was studied at a temperature of  $293 \pm 1$  K. Figures 1A, B show the changes in PM<sub>2.5</sub> morphology during the dehydration process in Seoul and Seosan, respectively, for each date. All components were dissolved in the droplets at an RH of ~100-90%, exhibiting a single liquid state (as shown in the second column in Figures 1A, B). The evaporation of water from the droplets caused the size to decrease with decreasing RH. At an average of ~87-89% RH, all PM<sub>2.5</sub> droplets showed liquid-liquid phase separation (LLPS) (third column in Figures 1A, B). This LLPS has been observed in numerous laboratory studies and modeling work, and commonly occurs when the O: C ratio of organic materials in the presence of inorganic salts is below 0.8 (Bertram et al., 2011; Song et al., 2012; Zuend and Seinfeld. 2012). LLPS has also been observed in ambient aerosol particles from different environments, within a specified range of O: C ratios (Pöhlker et al., 2012; You et al., 2012; Gaikwad et al., 2022; Song et al., 2022). In this study, the average O: C of the PM<sub>2.5</sub> droplets was ~0.47 at both sites (Table 1), which is within the appearance range for LLPS.

The equilibrium morphology of liquid-liquid-phase separated droplets (i.e., core-shell or partially engulfed) can be determined by the surface and interfacial tensions and spreading coefficients of the two phases (Kwamena et al., 2010; Song et al., 2013). In the droplets from both sites, a core-shell morphology was observed on a hydrophobic substrate. Previous studies have shown that liquid-liquidphase-separated particles with a core-shell morphology predominantly consist of organic and inorganic species on their outer and inner phases, respectively (Ciobanu et al., 2009; Reid et al., 2011; Song et al., 2013). This can be explained by the fact that organic compounds possess a lower surface tension than inorganic salts (Ciobanu et al., 2009).

With a further decrease in RH, crystals abruptly appeared inside the PM<sub>2.5</sub> droplets (fourth column of Figures 1A, B), leading to a three-phase coexistence of a liquid-liquid-(semi) solid state, occurring at an average RH range of ~76-27% for Seoul and ~71-33% for Seosan. The crystals may be solid organic materials or inorganic substances such as ammonium sulfite and ammonium nitrate. This morphology has not yet been observed in laboratory-made aerosol particles. However, recently, the coexistence of the three phases consisting of liquid-liquid-(semi) solid has been discovered in the PM<sub>2.5</sub> of different environments (Gaikwad et al., 2022; Song et al., 2022). This suggests that atmospheric aerosol particles could display more complicated and multi-phase morphologies than their laboratory counterparts. This finding can be used to predict more accurate results for heterogeneous reactions and in atmospheric chemistry (Riemer et al., 2019). As shown in Figure 1 (last column), a further decrease in RH led to the efflorescence of a large portion of the inorganic fractions.

#### 3.2 Phase states of PM<sub>2.5</sub> as a function of RH

To determine a (semi) solid state of the  $PM_{2.5}$ , a poke-and-flow experiment was performed at ~293 ± 1 K. All  $PM_{2.5}$  droplets cracked when poked by a needle at average RHs of ~27% and ~33% for particles collected in Seoul and Seosan, respectively (Figure 2). After cracking, no flow was observed for a period of ~3 h, indicating a viscosity lower limit of ~10<sup>8</sup> Pa·s (Song et al., 2015; Grayson et al., 2016), which corresponds to a (semi) solid state (Koop et al., 2011).

From the result of the optical microscopy and poke-and-flow experiments, the phase states of the "bulk" of PM2 5 were determined as a function of RH at a temperature of ~293  $\pm$  1 K. The bulk of the PM<sub>2.5</sub> was characterized as "liquid" for single liquid and liquidliquid phase separated particles, "semisolid" for liquid-liquid-(semi) solid particles (although not all phases in the particles were necessarily semisolid), and "(semi) solid" for semisolid or solid particles (Song et al., 2022). Based on this characterization, Figure 3A presents the phase states of PM2.5 in Cases 1-6 from the two study sites (dates are shown for increasing daily PM2.5 concentrations). The bulk of the PM<sub>2.5</sub> from Seoul exhibited a liquid state at mean RHs >  $\sim$ 87%, semisolid state at  $\sim$ 27% < mean RHs < ~76%, and (semi) solid state at mean RHs < ~27%. In Seosan, the bulk of the  $PM_{2.5}$  was a liquid state at mean RHs > ~89%, semisolid state at ~33% < mean RHs < ~71%, and (semi) solid state at mean RHs < ~33%. The average RH range of the liquid state was similar in the two sites, while the RH range of the (semi) solid state was slightly higher in Seosan (~33%) than that in Seoul (~27%).

Interestingly, a clear difference in the RH boundary of semisolid and (semi) solid state was observed in Seoul. It was ~38% RH on polluted days (PM<sub>2.5</sub>  $\geq$  35 µg/m<sup>3</sup>), but the RH value was dropped down to ~13% on clean days ( $PM_{2.5} < 35 \,\mu g/m^3$ ) as shown in Figure 3A. This is most likely due to the different chemical compositions of Seoul PM2.5 on polluted and clean days; Figure 3B and S3a illustrate the abundance of major chemical compositions of PM2.5 in Seoul for polluted versus clean days, including organic carbon (OC), elemental carbon (EC), and inorganic substances (sulfate, nitrate, and ammonium). A distinct difference in PM2.5 chemical compositions was monitored in Seoul that inorganic fraction increased to ~81% on polluted days while it was decreased to ~55% with enhancement of organic fraction on clean days. Recent laboratory studies have shown the effect of inorganic salts on viscosity and phase state in aerosol particles (Richards et al., 2020; Jeong et al., 2022). Jeong et al. (2022) showed that the viscosity of inorganic-rich particles (i.e., ammonium sulfate) was approximately 8 orders of magnitude higher than that of organic-rich particles at low RH levels close to their efflorescence RH. In the current study, the effect of inorganic substances on phase state in real-world aerosol particles was consistent with the results of previous laboratory studies.

In contrast to the Seoul urban area, in Seosan, a significant variation on the RH boundaries for the phase states of the  $PM_{2.5}$  was not observed on the polluted *versus* clean days (Figure 3A). This could be resulted from the similar chemical compositions during the entire periods. Figure 3B and S3b show that the abundances of the major chemical species of the  $PM_{2.5}$  was insensitive depending on the concentrations. This can be extrapolated to a similar range in the RH boundary of the phase states over the entire period in the coastal-rural area.



cases 1-6. The scale bar represents 10 µm

#### 3.3 Estimated phase states of PM<sub>2.5</sub> in urban and coastal-rural areas

The primary impact on the phase state of aerosol particles on RH has been previously studied (Renbaum-Wolff et al., 2013; Song et al., 2015; Reid et al., 2018; Rovelli et al., 2019). From these studies, they explained that aerosol viscosity and phase states are strongly RHdependent. To estimate the phase state of the bulk of the PM<sub>2.5</sub>, we first related our results to the ambient RH condition of the two sites. Box plots in Figure 3A display the daily ambient RH in Seoul and Seosan. The mean ambient RH during summer was ~70% in Seoul and ~81% in Seosan, with some variations (Figure 3A; Table 1).

Based on the measured phase states of the bulk of the PM2.5 (Section 3.2) and mean ambient RH in Seoul (box plot of Figure 3A), PM<sub>2.5</sub> was estimated in a liquid or semisolid state. The liquid phase state of PM<sub>2.5</sub> became more dominant as the PM<sub>2.5</sub> concentration increased when the RH and ammonium nitrate were enhanced. The ambient RH in Seoul (Figure 3A) ranged higher than the deliquescence RH of ammonium nitrate (65.5% RH at 293 K) (Winston and Bates. 1960). This indicates the high ambient RH led to liquefy the PM2 5 dominated by ammonium nitrate (Seinfeld and Pandis. 2016). The result is consistent with findings of our recent study of Song et al. (2022) in Seoul during winter where the liquid phase state was dominant on high PM2.5 days and a semisolid state was dominant on low PM2.5 days. Liu et al. (2017) observed a similar phenomenon where the particle phase state was liquid

during heavy haze events in Beijing. Under high RH conditions, rapid chemical reactions can occur between PM<sub>2.5</sub> and surrounding gas molecules, accelerating the production of high PM2.5 mass concentrations.

Most of the PM<sub>2.5</sub> in Seosan was in a liquid state at the mean ambient RH values, except on June 9, when the RH value was relatively low with an average of ~67% (Figure 3A; Table 1). This coastal-rural area is close to the Yellow Sea (~15 km); therefore, high ambient RH conditions are common. Due to the geographic characteristics of Seosan, PM2.5 was commonly existed in a liquid phase state.

In addition to RH, the chemical composition of PM2.5 is another important parameter for determining phase states. Several studies have shown that the phase states of aerosol particles were determined by the presence of organic materials, inorganic salts, and their ratios (Rovelli et al., 2019; Richards et al., 2020; Jeong et al., 2022). Using the RH and PM<sub>2.5</sub> chemical compositions (Supplementary Section S3), the aerosol liquid water content (ALWC) at the two sites were calculated (Figure 3B). As discussed above, a high fraction of inorganic substances in PM2.5 was observed at both sites during high PM2.5 episodes (Supplementary Figure S3). High inorganic composition and RH could result in abundant liquid water molecules in the PM2.5, leading to PM2.5 pollution (Supplementary Figure S4). Moreover, a distinct difference in ALWC was observed at the two different sites, with Seosan exhibiting a significantly greater ALWC than Seoul, resulting in a predominantly liquid state of PM2.5 in Seosan. To gain more



Daily average measurement results for PM<sub>2.5</sub> in Seoul and Seosan on clean (PM<sub>2.5</sub> < 35  $\mu$ g/m<sup>3</sup>) and polluted (PM<sub>2.5</sub> ≥ 35  $\mu$ g/m<sup>3</sup>) days in cases 1–6. (A) Phase states of the bulk of PM<sub>2.5</sub> as measured at 293 ± 1 K. Green: liquid; blue: semisolid; and grey: (semi) solid. The box plot indicates daily ambient relative humidity (RH). (B) PM<sub>2.5</sub> mass concentrations, and chemical compositions (minor ions: Cl<sup>-</sup>, Na<sup>+</sup>, K<sup>+</sup>, Mg<sup>2+</sup>, and Ca<sup>2+</sup>) and aerosol liquid water content (ALWC). (C) Ambient temperature. In the box plot, the box represents the mean, 25th, and 75th percentiles, and the whisker represents the minimum and maximum values. Dates are arranged from low to high PM<sub>2.5</sub> mass concentrations for cases 1–6.

comprehensive results of the effect of chemical composition on the phase state of ambient aerosol particles, further studies are required with more extensive datasets. In addition, environmental factors such as wind and precipitation could also affect phase variation of  $PM_{2.5}$ . These parameters should be also considered to explore phase behavior of  $PM_{2.5}$ .

# 4 Conclusion and implications

In this study, optical microscopy was combined with the poke-andflow technique to determine the morphology and phase state of  $PM_{2.5}$  at 293 ± 1 K collected in Seoul (urban) and Seosan (coastal-rural) in June 2021. Upon dehydration, the  $PM_{2.5}$  droplets from Seoul and Seosan exhibited different morphologies and phases, including single liquid, semisolid, and (semi) solid states. Based on the ambient average RH level and the results obtained from the laboratory experiments at 293 ± 1 K, which is considered similar to ambient temperature, the phase states of bulk  $PM_{2.5}$  in the urban and rural areas were estimated. The  $PM_{2.5}$  in Seoul was to be in both liquid and semisolid states and results showed that a liquid state was abundant during highly polluted summer days. However,  $PM_{2.5}$  was to be present in a liquid state due to the high ALWC, as well as meteorological and geographic characteristics of Seosan. Our results could have several limitations in providing of quantification of viscosity for  $PM_{2.5}$  particles, and potential effects of water-insoluble materials on the morphology and phase state. Therefore, to obtain more concrete conclusion for the phase state of  $PM_{2.5}$ , more experimental dataset and incorporation with different methods are required.

The phase state of aerosol particles can be affected by particle size distribution. Several recent laboratory and modeling studies demonstrated that liquid particles allow the partitioning of gas molecules into the volume of the whole particle with fast reaction/ uptake of ambient gas molecules (Shiraiwa et al., 2013; Slade and Knopf. 2014; Berkemeier et al., 2016; Houle et al., 2018). However, for solid particles, gas molecules can only partition onto the surface of the particles. As a result, the phase states of particles can influence particle growth, internal mixing, and particle size distribution (Zaveri et al., 2014; Song et al., 2022). To build on the results from this study, more detailed data is needed to understand the fundamental physical properties of PM<sub>2.5</sub>, and its environmental consequences, which are still largely unknown, and how the physical properties are linked to the chemical compositions that cause PM<sub>2.5</sub> pollution.

# Data availability statement

The original contributions presented in the study are included in the article/Supplementary Material, further inquiries can be directed to the corresponding author.

# Author contributions

This study is designed by MS. All of the authors took measurements and analyzed the data. The manuscript was prepared by MS, SG, and DK with contributions from all co-authors. The published version of the manuscript has been read and approved by all authors.

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### Conflict of interest

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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#### Supplementary material

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fenvs.2023.1142941/ full#supplementary-material

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