

1 **Measurement report: Hygroscopicity of Size-Selected Aerosol  
2 Particles in the Heavily Polluted Urban Atmosphere of Delhi:  
3 Impacts of Chloride Aerosol**

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15 **Abstract.** Recent research has revealed the crucial role of winter-time, episodic high chloride (H-Cl) emissions  
16 in the Delhi region, which significantly impact aerosol hygroscopicity and aerosol-bound liquid water, thus  
17 contributing to the initiation of Delhi fog episodes. However, these findings have primarily relied on modeled  
18 aerosol hygroscopicity, necessitating validation through direct hygroscopicity measurements. This study presents  
19 the measurements of non-refractory bulk aerosol composition of PM<sub>1</sub> from an Aerodyne aerosol chemical  
20 speciation monitor and for first-time size-resolved hygroscopic growth factors (Nucleation, Aitken, and  
21 Accumulated mode particles) along with their associated hygroscopicity parameters at 90% relative humidity  
22 using a hygroscopic-tandem differential mobility analyzer at the Delhi Aerosol Supersite. Our observations  
23 demonstrate that the hygroscopicity parameter for aerosol particles varies from 0.00 to 0.11 (with an average of  
24  $0.03 \pm 0.02$ ) for 20 nm particles, 0.05 to 0.22 ( $0.11 \pm 0.03$ ) for 50 nm particles, 0.05 to 0.30 ( $0.14 \pm 0.04$ ) for 100  
25 nm particles, 0.05 to 0.41 ( $0.18 \pm 0.06$ ) for 150 nm particles, and 0.05 to 0.56 ( $0.22 \pm 0.07$ ) for 200 nm particles.  
26 Surprisingly, our findings demonstrate that the period with H-Cl emissions displays notably greater hygroscopicity  
27 ( $0.35 \pm 0.06$ ) in comparison to spans marked by high biomass burning ( $0.18 \pm 0.04$ ), high hydrocarbon-like  
28 organic aerosol ( $0.17 \pm 0.05$ ), and relatively cleaner periods ( $0.27 \pm 0.07$ ). This research presents initial  
29 observational proof that ammonium chloride is the main factor behind aerosol hygroscopic growth and aerosol-  
30 bound liquid water content in Delhi. The finding emphasizes, ammonium chloride's role in aerosol-water  
31 interaction and related haze/fog development. Moreover, the high chloride levels in aerosols seem to prevent the  
32 adverse impact of high organic aerosol concentrations on cloud condensation nuclei activity.

33 **1. Introduction**

34 The Intergovernmental Panel on Climate Change (IPCC) (Intergovernmental Panel on Climate Change, 2023)  
35 reported that the interaction between aerosols and clouds is not completely comprehended, and there are  
36 significant uncertainties in gauging global radiative budgets. In order to overcome and elucidate these  
37 uncertainties, the role of aerosol hygroscopicity is crucial. Hygroscopicity is a critical factor in comprehending  
38 how aerosol particles function as cloud condensation nuclei (CCN) and create fog droplets/haze under sub-  
39 saturated/nearly saturation conditions, as well as forming cloud droplets at atmospheric supersaturation levels  
40 (McFiggans et al., 2006; Topping and McFiggans, 2012). Its comprehension is vital to better predicting the aerosol  
41 size distribution and scattering properties with more accuracy in global models under varying atmospheric  
42 humidity (RH) conditions (Randall et al., 2007). Hygroscopicity at higher RH results in an increase in the cross-  
43 sectional area of the aerosol, leading to efficient light scattering by the aerosol particles (Tang and Munkelwitz,  
44 1994). This phenomenon is primarily dependent on the chemical composition and particle size. Generally,  
45 ammonium salts of sulfate, nitrate, and chloride, which are inorganic salts, exhibit high hygroscopicity (Hu et al.,  
46 2011; Petters and Kreidenweis, 2007). In contrast, organic aerosols (OAs) have relatively lower hygroscopicity  
47 (Jimenez et al., 2009; Kroll et al., 2011), and dust particles and black/elemental carbon particles are known to be  
48 hydrophobic (Seinfeld and Pandis, 2006). The increased atmospheric humidity during winter and monsoon  
49 seasons promotes the development of more oxidized secondary organic aerosol (SOA) through aqueous-phase  
50 (Ervens et al., 2011) and heterogeneous reactions (McNeill, 2015). This process leads to a heightened organic  
51 aerosol hygroscopicity (Jimenez et al., 2009; Mei et al., 2013), which negatively impacts the local visibility (Li et  
52 al., 2016; Liu et al., 2012). Conversely, aerosol loading has an inverse effect on aerosol hygroscopicity (Mandariya  
53 et al., 2020a). In addition, aerosol loading plays a critical role in determining cloud lifetime, which impacts the  
54 amount of rainfall in the region (Albrecht, 1989; Lohmann and Feichter, 2005).

55 Over the past few decades, researchers have extensively measured aerosol hygroscopicity using a hygroscopic  
56 tandem differential mobility analyzer (H-TDMA) (Massling et al., 2005; Gysel et al., 2007; Mandariya et al.,  
57 2020; Swietlicki et al., 2008; Yeung et al., 2014; Kecorius et al., 2019) and a CCN counter (Bhattu and Tripathi,  
58 2015; Gunthe et al., 2011; Massoli et al., 2010; Ogawa et al., 2016) under sub- and supersaturated conditions,  
59 respectively. Petters and Kreidenweis (2007) introduced the hygroscopicity parameter, kappa ( $\kappa$ ), to correlate  
60 aerosol hygroscopicity with its chemical composition. Hygroscopicity of OA may differ according to their  
61 chemical properties such as solubility, extent of dissociation in aerosol water, and surface activity, which can pose

62 challenges in quantifying OA hygroscopicity (Hallquist et al., 2009; Jimenez et al., 2009). As a result, this  
63 introduces further discrepancies in predicted and measured aerosol hygroscopicity. Therefore, there is a  
64 requirement to investigate the measurement-based aerosol hygroscopicity of Delhi's atmosphere to gain a better  
65 understanding of the recurring occurrences of haze and cloud formations.

66 In recent decades, rapid economic growth and industrialization in the Indo-Gangetic Plain (IGP) have resulted in  
67 significantly poor air quality during the winter season (Wester et al., 2019). Local and regional air pollution issues  
68 may potentially affect Delhi during this time (Arub et al., 2020; Bhandari et al., 2020; Gani et al., 2019; Prakash  
69 et al., 2018). Recent studies have indicated that chloride significantly contributes to the degradation of air quality  
70 in the Delhi region and favors haze/fog formation during winter (Gunthe et al., 2021). Gani et al. (2019) and Rai  
71 et al. (2020) support these findings. Trash and biomass burning for heating and waste degradation have been  
72 identified as major sources of chloride in Delhi (Rai et al., 2020). A recent study conducted in Delhi revealed that  
73 frequent high chloride events promote high levels of aerosol liquid water content under elevated humid conditions.  
74 This leads to haze and poor visibility in the city (Chen et al., 2022). Additionally, Gunthe et al. (2021) found that  
75 higher chloride levels also enhance aerosol hygroscopicity. However, it is important to note that this particular  
76 study was based on theoretical hygroscopicity. Therefore, it is crucial to study the effects of chloride on aerosol  
77 hygroscopicity and its ability to increase the amount of aerosol-bound liquid water based on field measurements.  
78 In addition, the heavily polluted urban atmosphere, with its highly complex composition, severely limits the  
79 hygroscopicity of the aerosol particles. This is particularly evident in cities like Delhi, located in the IGP of India,  
80 where air quality deteriorates significantly during haze/fog-dominated periods. To the author's best knowledge,  
81 this study is the first to explore the complex atmosphere of IGP in Delhi, India, using aerosol hygroscopicity  
82 measured by H-TDMA.

83 **2. Experimental Methods**

84 **2.1 Aerosol Measurements**

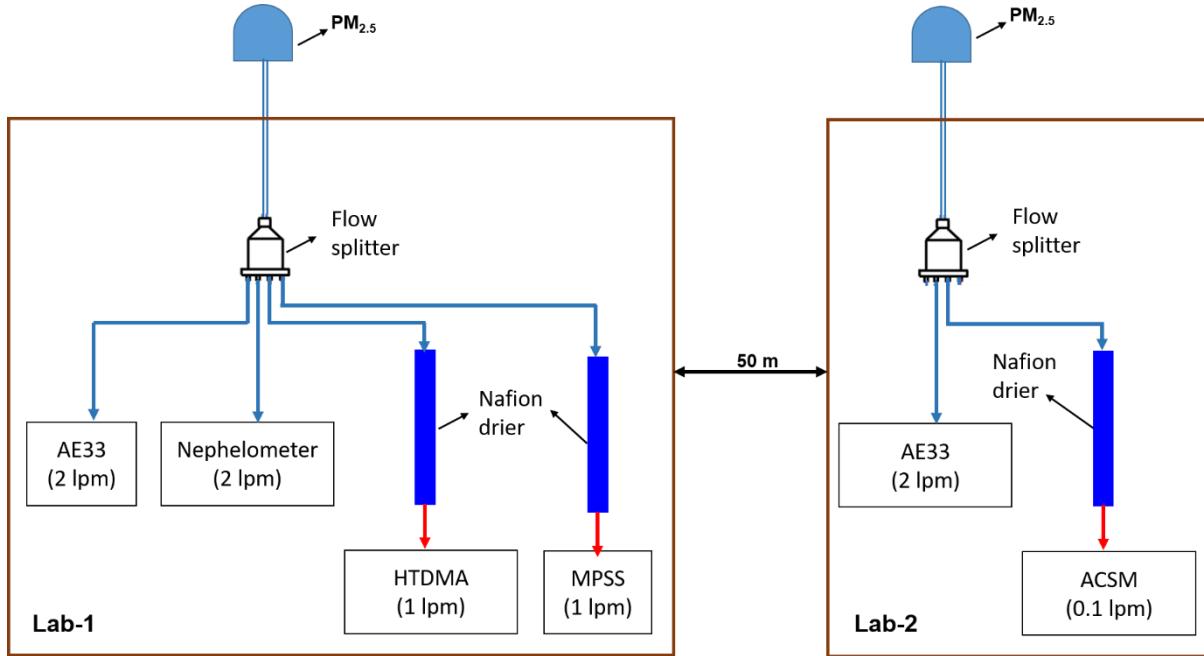
85 Real-time measurements of atmospheric aerosols were conducted during winter (February 1, 2020 to March 20,  
86 2020) at Indian Institute of Technology (IIT) Delhi, Block 5. H-TDMA, TROPOS-type Mobility Particle Size  
87 Spectrometer (MPSS), and Aerodyne Aerosol Chemical Speciation Monitor (ACSM) from Aerodyne Research  
88 in Billerica, MA were used simultaneously at a height of approximately 15 meters above ground level (a.g.l.) as  
89 depicted in Fig. 1. Lab-2 is located 50 meters away from Lab-1. The ACSM is utilized to quantify mass

90 concentrations of organic aerosol (OA), ammonium ( $\text{NH}_4$ ), sulfate ( $\text{SO}_4$ ), nitrate ( $\text{NO}_3$ ), and chloride (Cl) in non-  
91 refractory particulate matter less than 1  $\mu\text{m}$  (NR-PM<sub>1</sub>).

92 The hygroscopic growth of size-resolved particles at 90 % RH was investigated using the HTDMA system in this  
93 study. The HTDMA system has been utilized in numerous field campaigns before (Massling et al., 2007; Wu et  
94 al., 2013b; Zhang et al., 2016). The HTDMA system (TROPOS, Germany) consists of two Differential Mobility  
95 Analyzers (DMAs) of the Hauke-median type (TROPOS, Germany), along with a Condensation Particle Counter  
96 (CPC) Model 3772 by TSI Inc. (USA), and a humidifier system situated between the two DMAs. The initial  
97 DMA's function is to choose quasi-monodisperse particles at a dry diameter ( $D_p, \text{dry}$ ) of 30% RH. Technical  
98 abbreviations will be explicated at their first usage. After passing through a humidity conditioner, the humidity of  
99 the size-selected particles can be adjusted from 30% to 90% RH by mixing dry air with RH<5% and moist air  
100 with ~95% RH via regulating aerosol and sheath air flow (Maßling et al., 2003). The associated uncertainties with  
101 RH measurement at 90% RH are 1.0%. The particle hygroscopic growth distribution at a specific humidity and  
102 dry size ( $D_p, \text{dry}$ ) can be conveniently determined through CPC. There are two humidity sensors (Vaisala) in the  
103 system for aerosol flow and sheath flow respectively. The sensors in the second DMA were calibrated  
104 automatically every 30 min at 90% RH using 100 nm ammonium sulfate ( $(\text{NH}_4)_2\text{SO}_4$ ) particles to analyze stability  
105 at high RH. The measurement error of the HTDMA depends mainly on RH measurement and control uncertainties  
106 within the system (Su et al., 2010). All RH sensors were calibrated using the Vaisala salt kit containing LiCl,  
107 NaCl, KCl and so forth, before the measurement campaign. Size calibration for both DMAs involved the  
108 application of Latex particles of standard size, 200 nm prior to measurement. The number concentration peak  
109 occurred at 203 nm, which attests to the accuracy of DMAs' size selection at 1.5%. The HTDMA system was  
110 used to measure the hygroscopic growth factors (HGFs) of particles with  $D_p, \text{dry}$  of five different sizes (20, 50,  
111 100, 150 and 200 nm), at 90% RH. The full scan covering all five sizes had a time resolution of approximately 30  
112 minutes.

113 Particle number size distributions (PNSDs) and particle volume-size distributions (PVSDs) were measured using  
114 a MPSS.

115



116

117 **Figure 1: Schematic diagram of the inlet systems for aerosol sampling instruments. The blue and red**  
 118 **sampling lines indicate the ambient air and dehumidified (RH<25%) ambient air, respectively.**

119 **2.2 Meteorological and Gas Data**

120 The gas data was obtained from the R.K. Puram-DPCC monitoring station, a continuous ambient air quality  
 121 monitoring station managed by the central control room for air quality management (Delhi-NCR). The data was  
 122 downloaded from the CPCB website (<https://app.cpcbccr.com/CCR/#/CAAQM-Dashboard/CAAQM-Landing/Data>). R.K.  
 123 Puram is situated 3.5 km northwest of IIT Delhi. The automatic weather station (Watch Dog 2000 series)  
 124 continuously measured wind speed (WS), wind direction (WD), temperature (T), and relative humidity (RH). The  
 125 station is installed on the rooftop of the 9<sup>th</sup>-floor building at IITD.

126 **2.3 Data Analysis**

127 **2.3.1 H-TDMA**

128 Overall, we conducted 1483 cycles of HTDMA scans. After each cycle, we calculated the percentage difference  
 129 between the measured and theoretical growth factors ( $\Delta q$ ) for 100 nm ammonium sulfate particles. Only those  
 130 cycles with  $\Delta q \leq \pm 5\%$  were included for further data analysis, while the remaining cycles were discarded  
 131 (Kecorius et al., 2019). As a result, we obtained 1102 HTDMA scan cycles that passed this data quality check.  
 132 Regarding good scan cycles, we conducted 1449, 1431, 1438, 1470, and 1420 successful H-TDMA scans for  
 133 particles of sizes 20, 50, 100, 150, and 200 nm particles, respectively, for further analysis. Subsequently, we

134 applied TDMAinv Toolkit, a piecewise linear TDMAinv algorithm developed by Gysel et al. (2009) and written  
135 in IgorPro, to perform post-data processing on the raw HGF data. The measured distribution function is a  
136 smoothed and skewed integral transformation of actual probability density functions for growth factors (GF-  
137 PDFs). Gysel et al. (2009) provides a detailed account of the raw data processing in the TDMAinv toolkit for the  
138 measurement of real HGFs. The TDMAinv toolkit was successfully employed in various studies across the globe  
139 (Gysel et al., 2007; Liu et al., 2012; Sjogren et al., 2007; Wang et al., 2018a), including Kanpur, India (Mandariya  
140 et al., 2020a). Furthermore, the RH in DMA2 generally reached the designated 90% value and remained stable  
141 within  $\pm 1\%$ . However, on occasion, it experienced significant drifts. To address this issue, all growth factors  
142 measured between 88% and 92% RH were adjusted to the target value of 90% (HGF\_90%) (Gysel et al., 2007)  
143 with the kappa-model recommended in the TDMAinv toolkit (Gysel et al., 2009). This approach effectively  
144 minimized the RH drifts in DMA2. After conducting scans at target RH for aerosol particles of 20, 50, 100, 150,  
145 and 200 nm, 979, 957, 972, 969, and 966 of these scans were respectively corrected. The corrected scans were  
146 then averaged for a 60-minute time resolution, resulting in 425, 429, 419, 424, and 417 scans.

147 Furthermore, using the kappa-Köhler theory (Mandariya et al., 2020a; Petters and Kreidenweis, 2007), we  
148 calculated the size-resolved hygroscopicity factors (kappa,  $\kappa$ , say  $\kappa_{H-TDMA\_90\%}$ ) from the corresponding size-  
149 resolved target RH corrected HGFs, based on equation (1).

$$150 \quad \kappa_{H-TDMA\_90\%} = (HGF\_90\%^3 - 1) \left[ \frac{1}{RH} \exp \left( \frac{4\sigma M_w}{RT \rho_w D_o HGF_{90\%}} \right) - 1 \right], \quad (1)$$

151 Where,  $\kappa_{H-TDMA\_90\%}$  represents the hygroscopicity factor at 90% RH, while HGF\_90% is the size-resolve HGF at  
152 90% RH. RH stands for atmospheric relative humidity expressed as a fraction, and  $\sigma$  denotes the surface tension  
153 of the aerosol liquid droplet-air interface at the droplet surface measured in N/m, assumed to be nearly to pure  
154 water. R represents the universal gas constant, expressed in units of  $J K^{-1} mol^{-1}$ .  $M_w$  denotes the molecular mass  
155 of water while T signifies the ambient temperature in Kelvin (K).  $\rho_w$  signifies the density of water in  $kg/m^3$ .  $D_o$   
156 denotes the dry mobility diameter of the particle in meters (m).

### 157 2.3.2 MPSS

158 The electrical mobility distribution is measured by MPSS and then converted to PNSD in the 8 to approximately  
159 800 nm mobility diameter range. This is achieved by utilizing an inversion algorithm to correct for multiple  
160 charged aerosol particles (Wiedensohler, 1988; Pfieffer et al., 2014) and diffusional losses (Wiedensohler et al.,  
161 2012; 2018).

162 **2.3.3 ACSM**

163 For a detailed account of the ACSM setup, please refer to Arub et al. (2020). The ACSM operated in a temperature-  
164 controlled laboratory at almost 0.1 lpm and 1-minute time resolution. It was set to measure mass-to-charge ratio  
165 (m/z) from 10 to 140. The PM<sub>1</sub> aerosol beam was concentrated and directed towards the vaporizer at 600 °C. The  
166 flash-vaporized compounds were then ionized through impact ionization at 70 eV electrons and detected using a  
167 quadrupole mass spectrometer (Ng et al., 2011). The study employed a 200 millisecond amu<sup>-1</sup> scan speed and a  
168 pause setting of 125 for a sampling duration of 64 seconds to collect aerosol mass spectra using the ACSM  
169 technique. Refer to Gani et al. (2019) for comprehensive guidance on the ACSM operational procedures. For  
170 ACSM calibration and data processing, please refer to Patel et al. (2021). Positive matrix factorization (PMF) was  
171 conducted on the data, resulting in a four-factor solution: hydrocarbon-like OA (HOA), biomass burning OA  
172 (BBO), less-oxidized OA (LO-OOA), and more-oxidized OA (MO-OOA), as shown in Fig. S1. More information  
173 regarding PMF analysis can be found in section S.1 and Fig. S2 of the Supplementary information. Three different  
174 events were identified based on the temporal variation of mass concentration peaks of BBOA, HOA, and Cl (see  
175 Fig. 2): 1) a high-residential or biomass burning period (H-BB); 2) a high-hydrocarbon-like OA period (H-HOA);  
176 and 3) a high-chloride period (H-Cl). Additionally, the “Clean Period” was defined as a period where the PM<sub>1</sub>  
177 loading was less than the 25<sup>th</sup> percentiles ( $\leq 38.7 \mu\text{g m}^{-3}$ ) for the sampling period. The event’s starting and ending  
178 times were determined by the initial increase in concentration and subsequent return to the starting values as the  
179 concentration decreased.

180 **2.3.4 Derived Secondary Inorganic Salts**

181 The ACSM measures OA, NO<sub>3</sub>, SO<sub>4</sub>, NH<sub>4</sub>, and Cl. A simplified ion-pairing scheme from Gysel et al. (2007) was  
182 adopted. However, NH<sub>4</sub>Cl was not included in their ion-pairing scheme; therefore, we modified it to integrate  
183 ammonium chloride into the calculation. Thus, our modified ion-pairing scheme includes NH<sub>4</sub>Cl (ACl), NH<sub>4</sub>NO<sub>3</sub>  
184 (AN), (NH<sub>4</sub>)<sub>2</sub>SO<sub>4</sub> (AS), NH<sub>4</sub>HSO<sub>4</sub> (ABS), and H<sub>2</sub>SO<sub>4</sub> (SA) as shown below:

185 **Case-1  $R_{SO_4}$  ( $NH_4$  to  $SO_4$ )  $\leq 1$**

186  $SA = 98.0795 \times \max(0, (n_S - n_A))$

187  $ABS = 115.11 \times n_A$

188  $AS = 0$

189 AN = 0

190 ACl = 0

191 **Case-2 1 <  $R_{SO_4}$  < 2**

192 SA = 0

193 ABS =  $115.11 \times ((2 \times n_S) - n_A)$

194 AS =  $132.1405 \times (n_S - n_A)$

195 AN = 0

196 ACl = 0

197 **Case-3  $R_{SO_4} \geq 2$**

198 SA = 0

199 ABS = 0

200 AS =  $132.1405 \times n_S$

201  $AN = \left( \min \left( \left( n_A - \left( \frac{ABS}{115.11} \right) - \left( \frac{(2 \times AS)}{132.1405} \right) \right), n_N \right) \right) \times 80.0434$

202  $ACl = \left( \min \left( n_C, \left( n_A - \left( \frac{ABS}{115.11} \right) - \left( \frac{2 \times AS}{132.1405} \right) - \left( \frac{AN}{80.0434} \right) \right) \right) \right) \times 53.54$

203 Here, “n” represents the number of moles, while “A”, “N”, “S”, and “C” represents the species NH<sub>4</sub>, NO<sub>3</sub>, SO<sub>4</sub>,  
 204 and Cl. Inorganic salts concentrations were also predicted using the NH<sub>4</sub>, SO<sub>4</sub>, NO<sub>3</sub>, and Cl components of the  
 205 ISORROPIA v2.1 model. Our results show a strong correlation and nearly unit slope (0.9999) between the  
 206 calculated and modeled inorganic salts, as presented in Fig. S3. This strongly justifies the new ion-pairing scheme  
 207 utilized in this study.

208

209 **2.3.5 Windrose and Potential Source Contribution Function (PSCF)**

210 The windrose plot was generated using the openair package in R (<http://www.r-project.org>, <http://www.openair-project.org>). An offline based Hybrid Single-Particle Lagrangian Integrated Trajectory (HYSPLIT4) model  
211 developed by NOAA/Air Resources Laboratory (ARL) (Draxler and Hess, 1997) was used to estimate the 48-  
212 hour back trajectory of air masses that reached DSL at 500 m above ground for the entire study period at hourly  
213 intervals.. The meteorological data used for back trajectories was obtained from ARL's Global Data Assimilation  
214 System archive, specifically the GDAS 0.5 degree archive (<http://ready.arl.noaa.gov/archives.php>). We used  
215 these estimated back trajectories and the measured mass fraction of chemical species of bulk aerosol as input in  
216 conducting Potential Source Contribution Function (PSCF) analysis. This analysis was carried out with the aid of  
217 Zefir (version 3.7), a tool written in Igor Pro (WaveMetrics). The Zefir tool is described in detail elsewhere (Petit  
218 et al., 2017). Additionally, this tool was used to create the box plots discussed in the following section. To calculate  
219 the aerosol liquid water content (ALWC) as a function of inorganic species mass concentration, ambient T, and  
220 RH, the ISORROPIA-II model (Fountoukis and Nenes, 2007) was utilized.  
221

222 **3. Result and Discussions**

223 **3.1 Overview of meteorology, trace gases, and aerosol characterization**

224 Fig. 2 depicts the hourly-resolved temporal changes of various meteorological parameters, including RH, T, WD,  
225 and WS, PNSD, PVSD, principal components of non-refractory PM<sub>1</sub>, and OA with their corresponding fractional  
226 mass contributions. In addition, Fig. S4 exhibits the temporal fluctuations of atmospheric gases, specifically  
227 nitrogen oxides (NOx), carbon monoxide (CO), and sulfur dioxide (SO<sub>2</sub>). Delhi's winter climate is mainly affected  
228 by a depression caused by Western Disturbances, resulting in cold waves in the region. The ambient RH and T  
229 vary within the range of 24.2% to 96.6% and 9.0 °C to 28.5 °C, respectively. The average values of RH and T are  
230  $56.0\% \pm 18.2\%$  and  $18.7\text{ }^{\circ}\text{C} \pm 4.2\text{ }^{\circ}\text{C}$ , respectively. These fluctuations indicate a shift in Delhi's atmosphere  
231 transitions from being damp and chilly in February to dry and relatively warm in March. Nighttime conditions are  
232 consistently cooler and more humid than daytime conditions throughout the sampling period. Ambient RH  
233 exhibits a diurnal pattern, with a peak occurring during the early morning hours (06:00-07:00) and a valley  
234 appearing around midday (13:00-15:00). Conversely, ambient temperature follows an opposing trend, increasing  
235 at midday, which can be correlated with higher solar radiation during those hours (refer to Fig. 3a & b). The high  
236 ambient temperature and peak O<sub>3</sub> concentration observed during midday (see Fig. 3(i)) indicate the possibility of  
237 daytime photo-oxidation processes according to research carried out by Nelson et al. (2023). Fig. S5 displays the

238 variation of WS and WD, ranging from 0.0 to 5.6 (with an average of  $1.0 \pm 1.0$  m/s and 4.0 to 345.7 (with an  
239 average of  $197.1 \pm 84.4$ ) degrees from the North, respectively. The majority of wind directions were in the WNW-  
240 WSW and E-ESE direction. These patterns indicate that the air quality in Delhi remained relatively stagnant  
241 throughout the study period. The measured aerosols are likely to be a result of local emissions and aerosol  
242 chemistry.

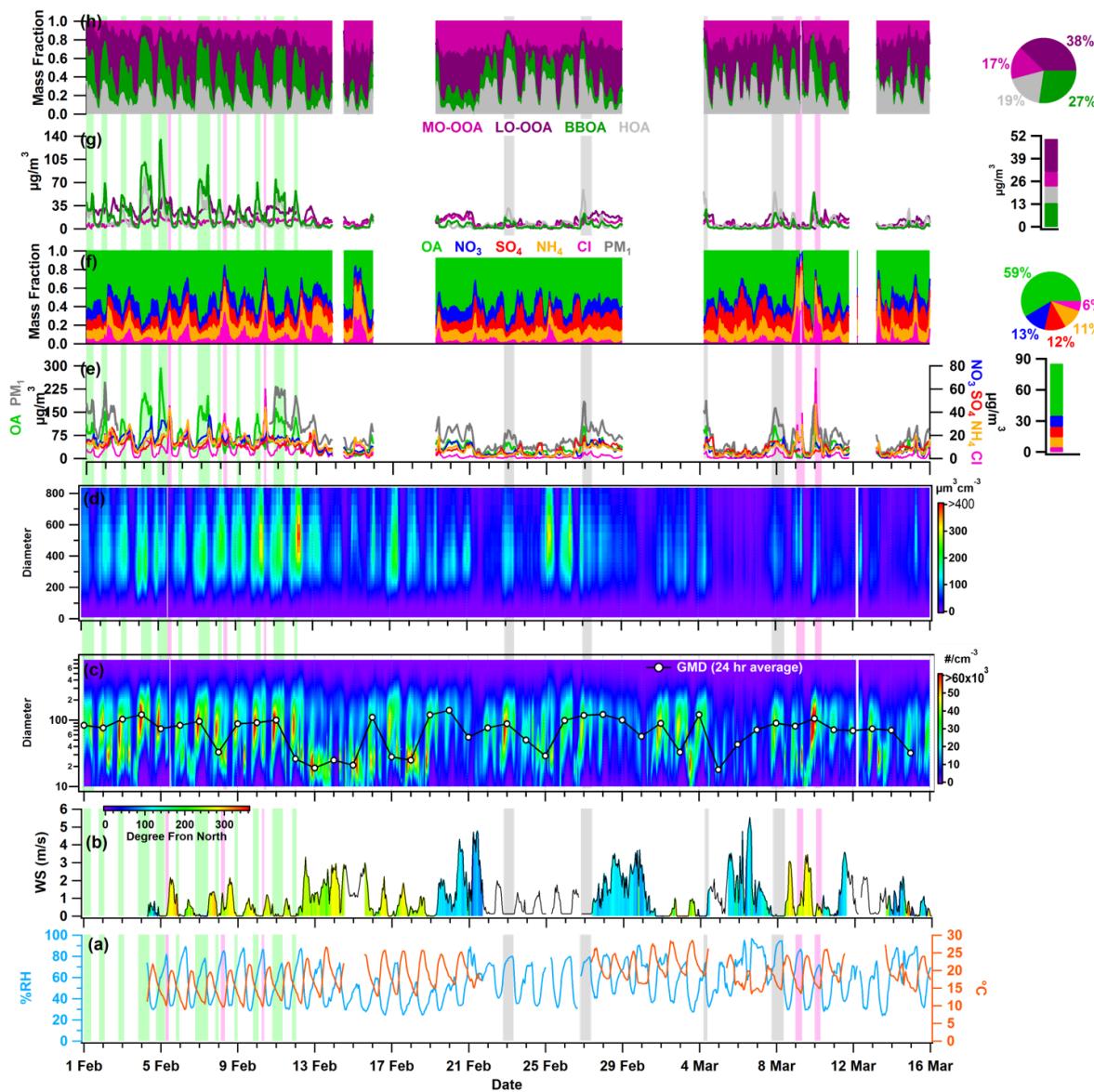
243 Throughout the sampling period, ambient trace gases NOx and CO demonstrate notable variability, peaking from  
244 local burning activities. During intense biomass burning activities, ambient NOx levels reach a maximum of 421.2  
245 ppb ( $58.4 \pm 61.9$ ). CO concentrations also reach maximum levels during similar periods as NOx, varying from  
246 0.0 to 7.66 ppm ( $0.58 \pm 0.79$ ), as illustrated in Fig. S4. The time-specific changes in the levels of these trace gases  
247 are illustrated in Fig. 3 (f, g, h, and i). The graph indicates two crests (06:00-08:00 and 17:00-20:00 hours), which  
248 are attributed to local biomass/trash burning emissions that happen in the morning and heavy traffic during  
249 nighttime rush hours. Conversely, SO<sub>2</sub> demonstrates a distinct pattern, with varying concentrations ranging from  
250 0.46 to 9.55 ppb ( $4.41 \pm 1.20$ ). Notably, it exhibits peaks during the morning (09:00-12:00 hours) and at midnight  
251 (21:00-02:00 hours), which are connected to local industrial stack emissions.

252 The PM<sub>1</sub> particle number concentration ranges from 408 to 29,845 particles/cm<sup>3</sup> ( $11319 \pm 5552$ ). Elevated particle  
253 number concentrations are commonly linked to local burning incidents. The particle concentration sees a rise in  
254 the evening (at 06:00 PM) and peaks at midnight, implying an increase in residential burning activity and traffic  
255 exhaust emissions. These activities likely contribute to the decrease in the geometric mean diameter (GMD) of  
256 the PNSD, which is around 47 nm. However, this value increases to nearly 87 nm, as shown in Fig. 3(t), indicating  
257 the organic aerosol's nighttime aging. Fig. 3(y) depicts that the hourly averaged mean diurnal GMD of PVSD  
258 varies from about 274 to 324 nm, with a mean value of  $309.1 \pm 33.1$  nm. This average is similar to the higher-end  
259 particle size of 200 nm hygroscopicity measurement used in this study. Therefore, the ACSM bulk aerosol  
260 composition is the most appropriate option for discussing the hygroscopicity of these particles.

261 The PM<sub>1</sub> concentration, also known as hourly time-resolved NR-PM<sub>1</sub>, ranged from 9.0 to 357.9  $\mu\text{g}/\text{m}^3$  with an  
262 average of  $81.2 \pm 56.6 \mu\text{g}/\text{m}^3$ . This range is consistent with the 12.7-392  $\mu\text{g}/\text{m}^3$  (NR-PM<sub>1</sub>) boundary previously  
263 reported by Gani et al. (2019) at the same sampling location. Prakash et al. (2018) found that PM<sub>1</sub> mass  
264 concentration accounts for 83% of PM<sub>2.5</sub>, indicating the prevalence of combustion-based particles. Additionally,  
265 we observed a high correlation ( $r^2 = 0.83$ ,  $p < 0.05$ ) between PM<sub>1</sub> measured by ACSM and MPSS, assuming an  
266 effective aerosol density of 1.6 g/cm<sup>3</sup> (refer to Fig. S6). The OA ranged from 1 and 293 ( $46.5 \pm 39.6$ )  $\mu\text{g}/\text{m}^3$ , with

267 PM<sub>1</sub> being the predominant fraction. These findings are consistent with the range of 53.3 to 166 (112)  $\mu\text{g}/\text{m}^3$   
268 observed during the winter months (December–February) at the same location (Gani et al., 2019). However, the  
269 decrease in average OA concentration during the measuring period of February–March can be explained by the  
270 reduction in aerosol loading after its peak in December–January (Gupta and Mandariya, 2013). The campaign  
271 average fractional contribution of OA to PM<sub>1</sub> was 56%, with a range of 1 to 84%. This high OA concentration in  
272 fine particulate matter (PM<sub>1</sub>) aligns with findings from prior studies in the IGP, including those conducted by  
273 Chakraborty et al. (2016a), Gani et al. (2019), and Mandariya et al. (2019), as well as those conducted worldwide,  
274 such as by Jimenez et al. (2009) and Zhang et al. (2007). Peak OA mass concentrations were observed between  
275 9:00 PM and 11:00 PM (figure 2(k)), which is in line with observations made at the same site by Gani et al. (2019)  
276 and Rai et al. (2020). The average mass concentration of NO<sub>3</sub> during the campaign was  $10.1 \pm 7.0 \mu\text{g}/\text{m}^3$ ,  
277 exhibiting diurnal variation with distinct peaks in the morning and at midnight (Fig. 3(l)). Additionally, SO<sub>4</sub>  
278 demonstrated a slight enhancement at 08:00 hr, and its concentration remained relatively stable from noon to  
279 17:00 hr (Fig. 3(m)). Conversely, Cl experienced significant fluctuations, ranging from 0.13 to 77.83  $\mu\text{g}/\text{m}^3$ , with  
280 higher concentrations of Cl occurring episodically throughout the campaign. The Cl concentration aligns with  
281 Gani et al. (2019)'s previously reported value of 0.1–66.6  $\mu\text{g}/\text{m}^3$  at the same location. Fig. 2(g and h) illustrates  
282 the temporal variation of various OA factors. The mass concentration of BBOA peaks during the nighttime and  
283 morning hours (Fig. 3(r)). On the other hand, LO-OOA exhibits a peak in the morning and remains relatively  
284 stable at noontime, indicating a steady formation. Meanwhile, MO-OOA exhibited a slight rise around midday,  
285 suggesting daytime photooxidation formation (Mandariya et al., 2019; Sun et al., 2016). During the sampling  
286 period, oxygenated organic aerosol (OOA) comprised the majority of OA. The BBOA mass concentration during  
287 H-BB events varied dynamically, ranging from 16.3 to 134.7  $\mu\text{g}/\text{m}^3$ , with an average of  $50.7 \pm 24.0 \mu\text{g}/\text{m}^3$ .  
288 Concurrently, these events displayed higher levels of HOA, ranging from 9.6 to 109.4  $\mu\text{g}/\text{m}^3$ , indicating a likely  
289 similarity in the sources of HOA during this particular incident. However, during H-HOA events, concentration  
290 of HOA were higher, ranging from 4.8 to 58.9  $\mu\text{g}/\text{m}^3$ , although these amounts were notably lower than those  
291 observed during H-BB events. Nonetheless, the fractional mass contribution of HOA to OA was the largest of all  
292 OA categories. Additionally, during H-Cl events, there were increased concentrations of both primary organic  
293 aerosol HOA and BBOA. BBOA made up about 40.0%, 21.1%, 32.5%, and 13.1% to OA during H-BB, H-HOA,  
294 H-Cl, and relatively clean events, respectively, indicating varied sources of BBOA. Furthermore, the average  
295 contribution of H-HOA was the highest during the H-HOA event, at 41.6%. During the H-Cl event, Cl's

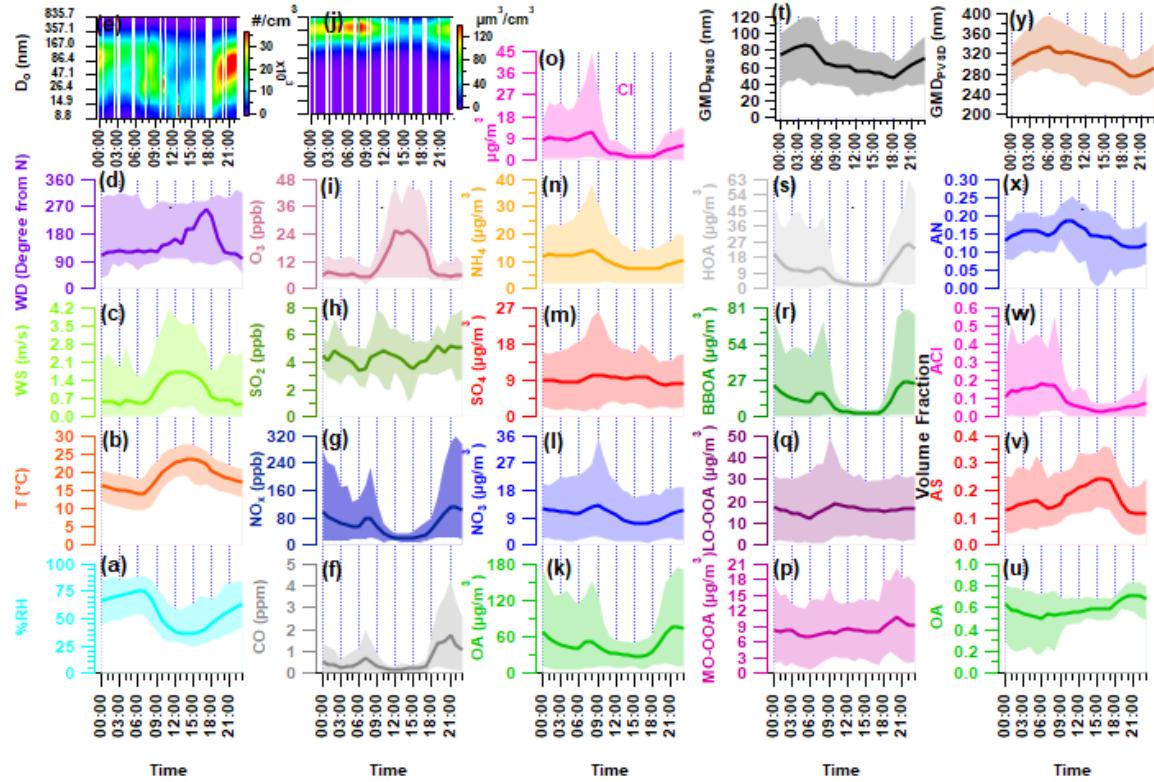
296 contribution to the fractional mass in  $PM_1$  peaked up to 44.9%, which was higher than the contributions of 21.2%  
 297 in H-BB events and 7.3% in H-HOA events.



298  
 299 **Figure 2: Temporal variability of ambient (a) relative humidity (RH), temperature (T), (b) wind speed (WS), wind**  
 300 **direction (WD), (c) particle number-size distribution (PNSD), 24-average geometric mean diameter (GMD), (d) particle**  
 301 **volume-size distribution (PVSD), (e) particulate matter (PM<sub>1</sub>), organic aerosol (OA), nitrate (NO<sub>3</sub>), sulfate (SO<sub>4</sub>),**  
 302 **ammonium (NH<sub>4</sub>), chloride (Cl), (f) fractional contribution of OA, NO<sub>3</sub>, SO<sub>4</sub>, NH<sub>4</sub>, and Cl in PM<sub>1</sub>, (g) more oxidized-**  
 303 **oxidized OA (MO-OOA), less oxidized-oxygenated OA (LO-OOA), biomass burning OA (BBOA), hydrocarbon like-**  
 304 **OA (HOA), and (h) fractional contribution of MO-OOA, LO-OOA, BBOA, and HOA in OA. The pie chart sub-plot**  
 305 **represents the overall average contribution of species, and the bar sub-plot represents the overall campaign average**  
 306 **value of different species. All other species are represented with specific color coding mentioned in legends. The light**

307 green, grey, and pink color shaded vertical line indicates the high-BBOA (H-BBOA), high-HOA (H-HOA), and high-Cl  
 308 (H-Cl) events, respectively. The discontinuity in the data points marks the missing data or non-sampling time.

309



310

311 Figure 3: Diurnal variation of ambient meteorological parameters (a) % ambient relative humidity (RH), (b)  
 312 temperature (T), (c) wind speed (WS), (d) wind direction (WD), and (e) particle number size distribution (PNSD), mass  
 313 concentration of ambient trace gases (f) carbon mono-oxide (CO), (g) nitrogen oxides (NOx), (h) sulfur dioxide (SO₂),  
 314 and (i) ozone (O₃), (j) particle volume size distribution (PVSD), mass concentration of aerosol constituents (k) organic  
 315 aerosol (OA), (l) nitrate (NO₃), (m) sulfate (SO₄), (n) ammonia (NH₄), and (o) chloride (Cl), mass concentration of  
 316 organic aerosol species (p) more oxidized-oxygenated OA (MO-OOA), (q) less oxidized-oxygenated OA (LO-OOA), (r)  
 317 biomass burning OA (BBOA), and (s) hydrocarbon like-OA (HOA), (t) geometric mean diameter of particle number  
 318 size distribution (GMD<sub>PNSD</sub>) and volume fractional contribution of (u) organic aerosol (OA), (v) ammonium sulfate  
 319 (AS), (w) ammonium chloride (ACl), and (x) ammonium nitrate (AN) in PM<sub>1</sub>, and (y) geometric mean diameter of  
 320 particle volume size distribution (GMD<sub>PVSD</sub>). Upper and lower boundary of shaded area represents the 95<sup>th</sup> and 5<sup>th</sup>  
 321 percentile values of respective species.

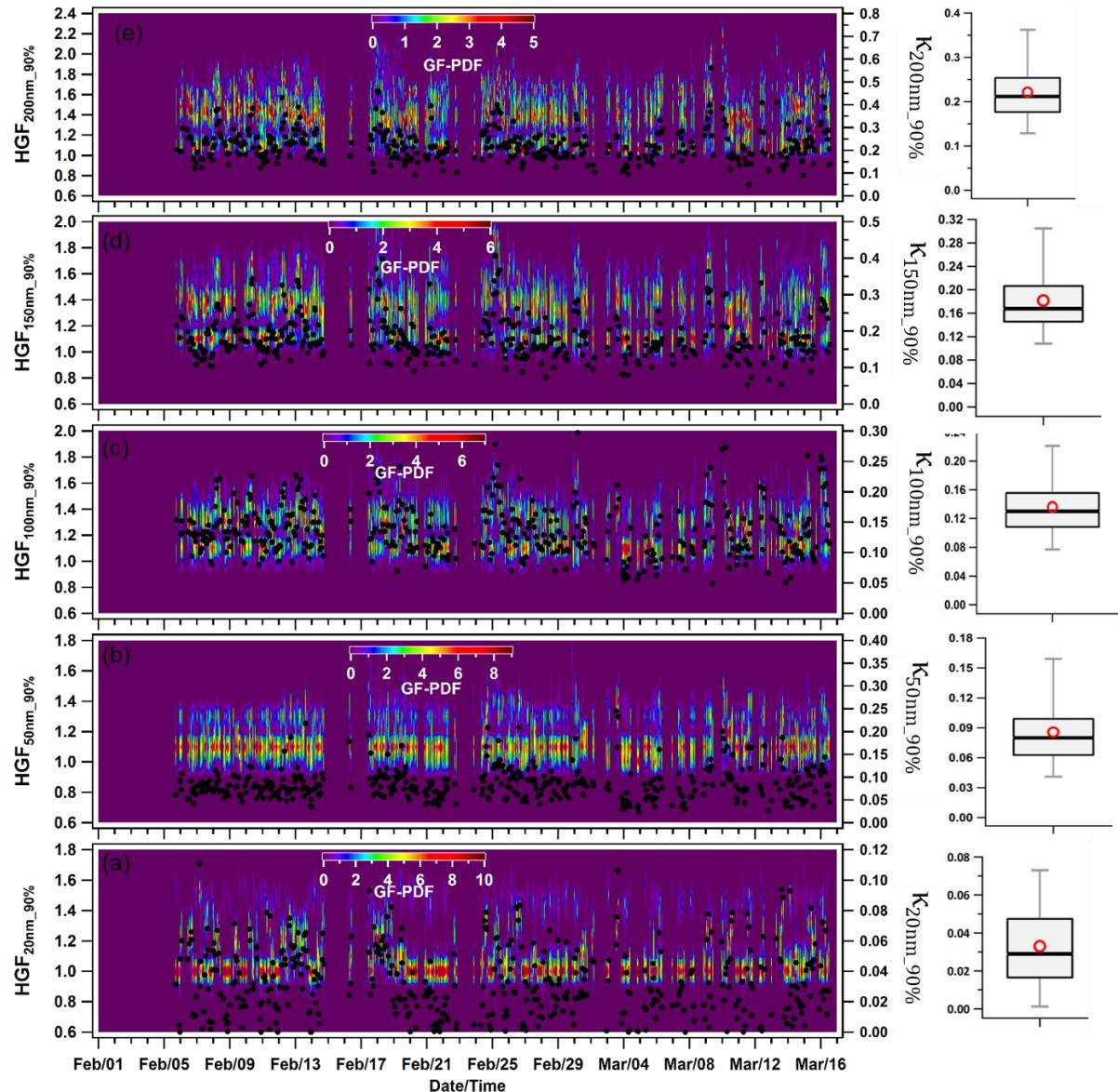
### 322 3.2 Hygroscopicity of Nucleation, Aitken, and Accumulation Mode Particles

#### 323 3.2.1 Temporal variability

324 Fig. 4 displays the hourly averaged dynamic variability of  $HGF_{90\%}$  and  $\kappa_{H-TDMA\_90\%}$  (kappa) for aerosol particles  
325 in the Nucleation, Aitken, and Accumulation modes at 90% ambient relative humidity. The hygroscopic growth  
326 factors of particles sized at 20 ( $HGF_{90\%\_20nm}$ ), 50 ( $HGF_{90\%\_50nm}$ ), 100 ( $HGF_{90\%\_100nm}$ ), 150 ( $HGF_{90\%\_150nm}$ ), and 200  
327 nm ( $HGF_{90\%\_200nm}$ ) varied between 1.00-1.41, 1.05-1.39, 1.11-1.49, 1.12-1.63, and 1.12-1.79. The averaged  
328 hygroscopic growth factors of the 20, 50, 100, 150, and 200 nm aerosol particles were  $1.14 \pm 0.09$  (average  $\pm$   
329 standard deviation),  $1.16 \pm 0.06$ ,  $1.27 \pm 0.07$ ,  $1.35 \pm 0.09$ , and  $1.41 \pm 0.09$ , respectively. These values indicate  
330 statistical significance ( $p < 0.05$ ) between the different hygroscopic growth factors. Moreover, the hygroscopicity  
331 values ( $\kappa_{20nm\_90\%}$  and  $\kappa_{50nm\_90\%}$ ) of the aerosol particles were found to range between 0.00-0.11 and 0.02-0.25 for  
332 the 20 nm and 50 nm particle sizes, respectively, with an average of  $0.03 \pm 0.02$  and  $0.09 \pm 0.03$ . Nucleation mode  
333 particles, consisting mainly of monomodal GF-PDF (Fig. 4(a)), consisted of approximately  $74 \pm 24\%$  nearly  
334 hydrophobic particles ( $HGF < 1.2$ ). However, this percentage increased to 100% and was associated with nighttime  
335 local burning activities, as demonstrated in Fig. 4(a). The nucleation mode particles ( $\kappa_{20nm\_90\%}$ ) exhibited  
336 significantly ( $p < 0.05$ ) lower hygroscopicity than the Aitken mode particles ( $\kappa_{50nm\_90\%}$ ). Hong et al. (2015) found  
337 that nucleation mode particles have higher susceptibility to condensable vapors such as newly-emitted VOCs,  
338  $H_2SO_4$  and HCl. Nevertheless, the study at hand did not measure these substances. The  $\kappa$  value of Aitken-sized  
339 particles was comparable to the  $0.24 \pm 0.08$  of  $52.6 \pm 6.9$  size particles reported by Gunthe et al. (2011) for Beijing,  
340 like Delhi, is one of the most polluted urban area. Gunthe et al. (2011) conducted this study on CCN at  
341 supersaturation levels, justifying the comparison. The campaign average hygroscopicity parameter (kappa,  $\kappa_{90\%}$ )  
342 increased significantly ( $p < 0.05$ ) with particle size, attributed to the Kelvin effect (Wang et al., 2018a). In the  
343 accumulation size range of 100, 150, and 200 nm,  $\kappa_{90\%}$  increased to approximately 0.56. The mean values for  
344  $\kappa_{100nm\_90\%}$ ,  $\kappa_{150nm\_90\%}$ , and  $\kappa_{200nm\_90\%}$  were  $0.14 \pm 0.04$ ,  $0.18 \pm 0.06$ , and  $0.22 \pm 0.07$ , respectively. The range for  
345  $\kappa_{200nm\_90\%}$  was between 0.05 and 0.56. Similar variations of  $\kappa$  with particle size have been observed globally  
346 (Cerully et al., 2015; Enroth et al., 2018; Fan et al., 2020; Kawana et al., 2016; Kim et al., 2020; Kitamori et al.,  
347 2009; Ogawa et al., 2016; Sjogren et al., 2012; Wang et al., 2018a), including in Kanpur, India, situated in the  
348 center of the IGP (Mandariya et al., 2020a). These variations have been attributed to the prevalent increase in  
349 inorganic to organic aerosol fraction in particles with size increment. Furthermore, Arub et al. (2020) reported  
350 that  $\kappa_{H-TDMA\_90\%}$  was approximately in the range of 0.13-0.77 for  $PM_1$  in Delhi, without considering BC. However,  
351 their theoretical prediction of particles' hygroscopicity took into account a particle's chemical composition,  
352 leading to more precise results. Arub et al. (2020) thus provided a theoretical prediction of particles'  
353 hygroscopicity by considering a particle's chemical composition. A 10% in  $\kappa$  calculation was observed when

354 considering BC in the aerosol chemical composition. Additionally, the  $\kappa_{\text{H-TDMA,90\%}}$  measured in this study aligned  
 355 with the global average value of  $0.27 \pm 0.21$  for continental aerosols (Petters and Kreidenweis, 2007; Pringle et  
 356 al., 2010). Subsequent sections will discuss the impact of a particle's chemical composition, local meteorology,  
 357 and air mass trajectories on  $\kappa_{\text{H-TDMA,90\%}}$  for accumulation mode particles.

358



359

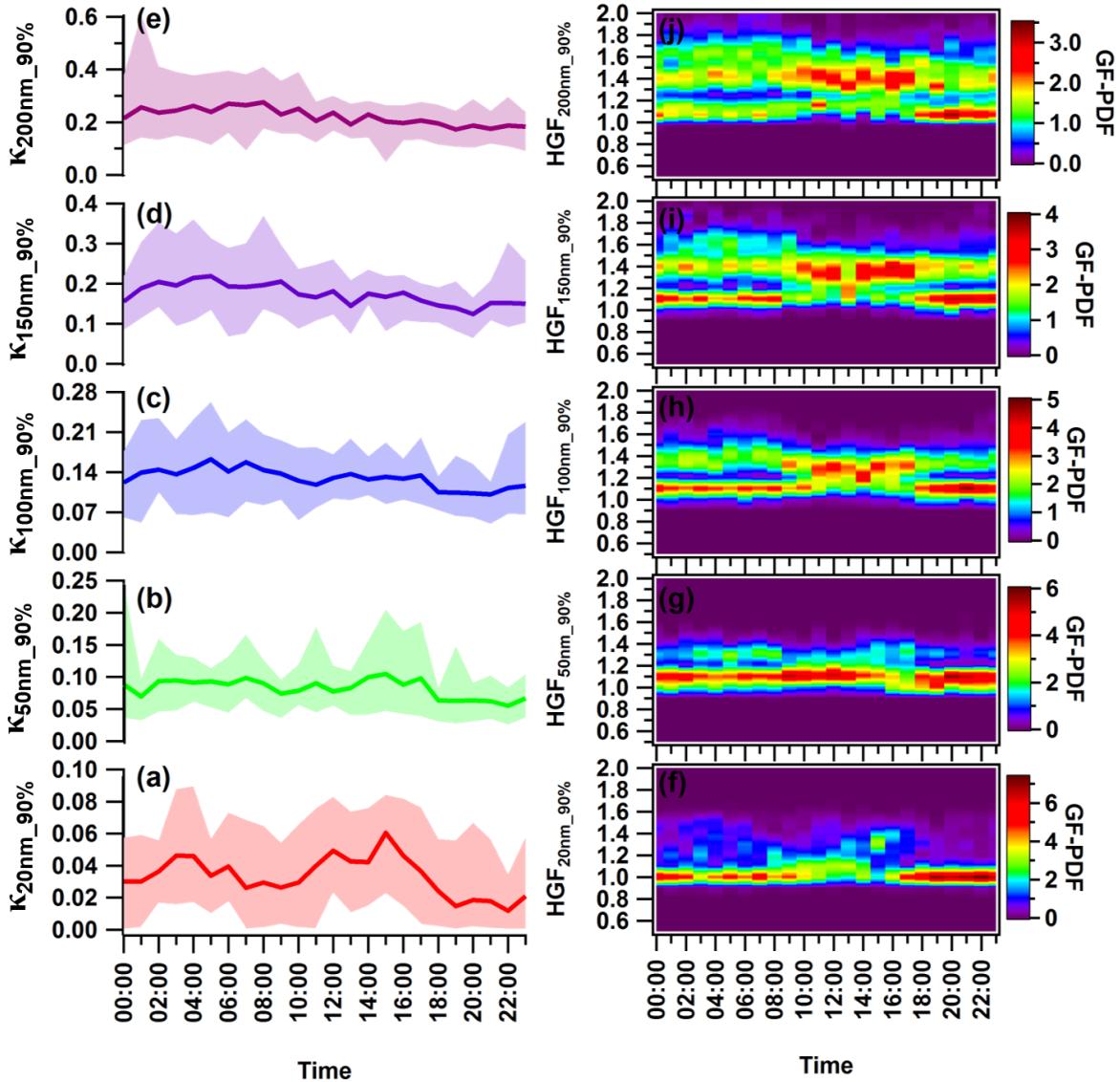
360 **Figure 4: Temporal variability in hygroscopicity parameter kappa ( $\kappa$ ) of nucleation mode particles (a) 20 nm**  
 361 **( $\kappa_{20\text{nm},90\%}$ ), Aitken mode particles (b) 50 nm ( $\kappa_{50\text{nm},90\%}$ ), and Accumulation mode particles (c) 100 nm ( $\kappa_{100\text{nm},90\%}$ ), (d)**  
 362 **150 nm ( $\kappa_{150\text{nm},90\%}$ ), and (e) 200 nm ( $\kappa_{200\text{nm},90\%}$ ).** The box plots represent the variability in the hygroscopicity of  
 363 respective sizes of particles in which low and high whisker traces represent the 5 and 95 percentile, respectively. The

364 red marker indicates the average of the data, whereas the upper and lower sides of the boxes indicate the 75 and 25  
365 percentile of the data, respectively.

366 **3.2.2 Diurnal variability**

367 The diurnal variation in  $\kappa_{\text{H-TDMA-90\%}}$  differed for nucleation ( $\kappa_{20\text{nm-90\%}}$ ), Aitken ( $\kappa_{50\text{nm-90\%}}$ ), and Accumulation  
368 ( $\kappa_{100\text{nm-90\%}}$ ,  $\kappa_{150\text{nm-90\%}}$ , and  $\kappa_{200\text{nm-90\%}}$ ) mode particles. Fig. 5 illustrates the hourly-resolved average  $\kappa$  for each  
369 particle size, showing a diel trend. The larger particles displayed higher  $\kappa$  values than the smaller ones, consistent  
370 with trends observed in Kanpur, India (Mandariya et al., 2020a) and other locations worldwide (Fan et al., 2020;  
371 Hong et al., 2015). Overall, all particle sizes exhibited a “late-night hump” (02:00-05:00 hr) in  $\kappa_{\text{H-TDMA-90\%}}$ . Only  
372  $\kappa_{20\text{nm-90\%}}$  displayed a diurnal variation with two peaks: one occurring late at night (02:00-04:00 hr) and the other  
373 at noon (14:00-16:00 hr). Additionally, two valleys were observed during the morning (07:00-10:00 hr) and night  
374 (19:00-22:00 hr), which indicate the strong influence of local burning and traffic activities (Pringle et al., 2010).  
375 Furthermore, nucleation-sized particles were potentially contributed by nearly hydrophobic particles (HGF<1.2)  
376 from evening to midnight. Mono-modal GF-PDF was exhibited around a unit hygroscopic growth factor,  
377 potentially suggesting the presence of locally-emitted particles. The 20 nm particles are of sufficient small size to  
378 be classified as nucleation mode particles. Similar diurnal trends of Nucleation and Aitken mode particles have  
379 been observed by Achtert et al. (2009), who attributed the lower values to the emission of hydrophobic aerosol  
380 particles during the local burning emissions. The daytime hump in aerosol particle composition can be attributed  
381 to the intensity of the photochemical oxidation process, resulting in the amplification of more oxidized species.  
382 Moreover, the gaseous condensation of  $\text{H}_2\text{SO}_4$ ,  $\text{HNO}_3$ , and VOCs predominantly controls their chemical makeup  
383 (Hong et al., 2015). The variability of  $\kappa_{\text{H-TDMA-90\%}}$  can be addressed by taking into account the chemical  
384 composition of the aerosol. Although  $\kappa_{50\text{nm-90\%}}$  exhibited less variation, it follows a diurnal pattern similar to  
385  $\kappa_{20\text{nm-90\%}}$ . Furthermore, when the dry size of the aerosol particles increased to the accumulated mode, the diurnal  
386 variation shifted towards nearly constant for the rest of the day. Hong et al. (2018) found no discernible diurnal  
387 variation of 100- and 150-nm particles of organic-dominated aerosols in China’s Pearl River Delta region.  
388 Furthermore, the diurnal cycles of aerosol physicochemical properties also reflect the dynamic diurnal variation  
389 in the planetary boundary layer (PBL), leading to particle accumulation during the night. The study only addressed  
390 trend variability using bulk-aerosol composition, as size-resolved chemical composition was not quantified.  
391 However, the daily average aerosol PNSD ranged from 18.0-140.0 nm, with a mean of  $73.1 \pm 33.8$  nm. The shift  
392 in PVSD mode occurred in the 300-600 nm. Range, making it appropriate to analyze the  $\kappa_{200\text{nm-90\%}}$  variation in

393 association with the bulk chemical properties of aerosols. Fan et al. (2020) demonstrated in Fig. 3 (r, s t, u, and v)  
394 that the increase in the ratio of inorganic volume fraction to OA volume fractions is responsible for the peak in  
395 hygroscopicity observed in the early morning hours. Additionally, in the winter during mid-night and early  
396 morning, water-soluble organic and inorganic gases undergo partitioning and/or coagulation/condensation on the  
397 surface of pre-existing particles. Furthermore, at high RH and lower temperatures, primary and secondary, less-  
398 oxidized organic aerosols engage in the aging process. This leads to improved oxidation through  
399 aqueous/heterogeneous reactions, thereby increasing the hygroscopicity of the particles (Jimenez et al., 2009; Wu  
400 et al., 2016). Similar findings were reported by Fan et al. (2020) for winter in urban Beijing. They have attributed  
401 this to the increase in hygroscopic particles due to the aqueous-oxidation and/or condensation process on the pre-  
402 existing particles. Generally, stronger noontime solar radiation promotes more intense photooxidation processes.  
403 The process promotes the distribution of fairly more oxidized and less volatile organics on the surface of particles,  
404 thus augmenting the hygroscopic nature of particles that belong to the accumulation mode (Duplissy et al., 2011;  
405 Massoli et al., 2010; Tritscher et al., 2011). The  $\kappa_{\text{H-TDMA-90\%}}$  exhibited a noontime flattening pattern, which was  
406 due to a combination of the positive and negative effects resulting from an increase in the volume fraction of OA  
407 and more hygroscopic ammonium sulfate and a decrease in ACl, and AN's volume fraction. A potential factor  
408 that modulates the hygroscopicity of accumulation mode particles is the lower volume fraction contribution of  
409 highly volatile ACl. This correlation is strongly supported by the  $\kappa_{\text{H-TDMA-90\%}}$  and the volume fraction of ACl ( $\epsilon_{\text{ACl}}$ )  
410 in the corresponding size particles.



411

412 **Figure 5: Diurnal variance in the hygroscopic parameter kappa ( $\kappa$ ) of nucleation mode particles (a) 20 nm ( $\kappa_{20\text{nm\_90\%}}$ ),**

413 Aitken mode particles (b) 50 nm ( $\kappa_{50\text{nm\_90\%}}$ ), and Accumulation mode particles (c) 100 nm ( $\kappa_{100\text{nm\_90\%}}$ ), (d) 150 nm

414 ( $\kappa_{150\text{nm\_90\%}}$ ), and (e) 200 nm ( $\kappa_{200\text{nm\_90\%}}$ ) and hygroscopic growth factor of (f) 20 nm ( $\text{HGF}_{20\text{nm\_90\%}}$ ), (g) 50 nm

415 ( $\text{HGF}_{50\text{nm\_90\%}}$ ), (h) 100 nm ( $\text{HGF}_{100\text{nm\_90\%}}$ ), (i) 150 nm ( $\text{HGF}_{150\text{nm\_90\%}}$ ), and 200 nm ( $\kappa_{200\text{nm\_90\%}}$ ) aerosol particles. The

416 solid line represents diurnal average values, and the upper and lower shaded area represents 95 and 5 percentile values

417 of corresponding average values. Different color coding has been used to represent various size-specific kappa values.

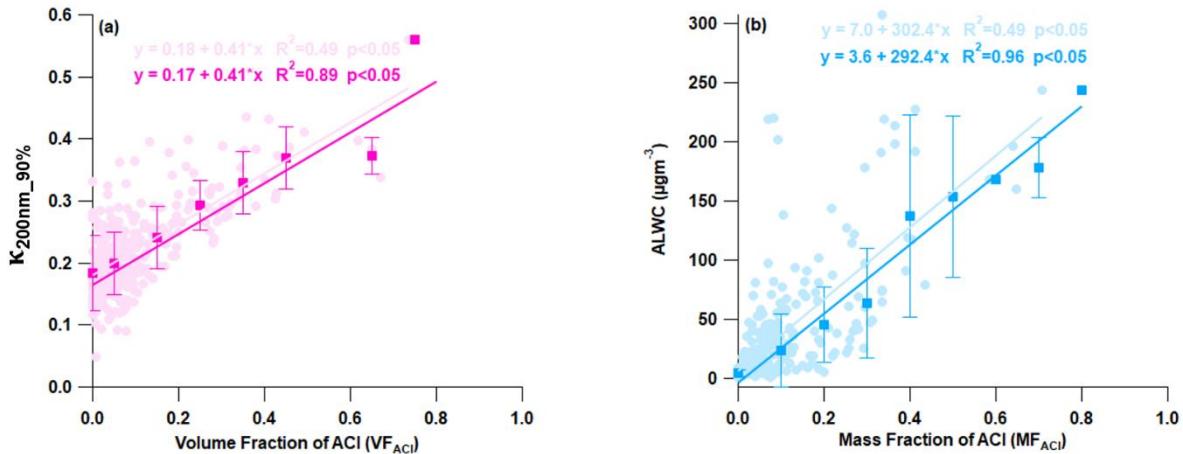
418 The color scale represents the growth factor probability density function of hygroscopic growth factor.

419 **3.2.3 Driving Factor of Hygroscopicity**

420 A correlation analysis was conducted between the measured chemical species and aerosol hygroscopicity to

421 investigate the factors governing aerosol hygroscopicity, as presented in Fig. 6. It was found that organic aerosol

negatively affected  $\kappa$ , as evidenced by a negative correlation (Fig. S7(a)). The negative correlation between OA and  $\kappa$  has been noted in India (Bhattu et al., 2016; Mandariya et al., 2020b) and globally (Enroth et al., 2018; Hong et al., 2014; Kawana et al., 2016; Kitamori et al., 2009; Wang et al., 2018a; Wu et al., 2013a). These findings suggest that primary constituents were predominant during high loading and may have been nearly hydrophobic or less hygroscopic. The present study found that a 10% increase in volume of OA in 200 nm aerosol particles led to a 4% reduction in their ability to attract water (hygroscopicity) (Fig. S7(a)). It is noteworthy that ammonium sulfate and nitrate exhibited a weak positive correlation with hygroscopicity (Fig. 7(b and c)). This may be attributed to sulfate and nitrate aerosols dominant in larger particles (>200nm). However, increasing the volume of AN and AS by 10% resulted in a 3.2 and 1.6% increase in hygroscopicity, respectively. This demonstrates that even small changes can have a significant impact on the final product, highlighting the importance of careful consideration and attention to detail. If the aerosol composition had an increased AN and AS contribution, the water-bound capacity of the aerosol was positively and negatively affected, respectively (refer to Fig. S8). Additionally, as shown in Fig. 6(a), there was an increase in the volume fraction of ACl in  $\text{PM}_1$  with an increase in aerosol hygroscopicity. This strong positive correlation was responsible for a 4.2% increase in  $\kappa$  over the increment of 10% ACl by volume. This was the highest among all chemical species. Furthermore, ammonium chloride has a greater capacity for water absorption (Chen et al., 2022; Zhao et al., 2020), which is supported by the strong correlation between ALWC and the mass fraction of ACl in  $\text{PM}_1$  as demonstrated in Fig. 6(b). The increasing fraction of ACl in  $\text{PM}_1$  may therefore be attributed to the higher water uptake potential of ammonium chloride. This implies that particles with a higher proportion of ammonium chloride absorb more water vapor, resulting in larger hygroscopic aerosol particles. It is evident that the rise in ammonium chloride proportion amplifies aerosol liquid water content, resulting in greater aerosol particle hygroscopicity. A recent study conducted in Delhi by Chen et al. (2022) revealed that the fraction of ammonium chloride in  $\text{PM}_1$  aerosol increases significantly during higher relative humidity conditions in the winter season. This is due to the co-condensation of semivolatile ammonium chloride with water vapor on particles, leading to enhanced water uptake and severe winter haze in Delhi. The high volume fractions (over 30%) of ACl in atmospheric  $\text{PM}_1$  were observed sporadically, leading to the conclusion that the high chloride fraction in the particle phase heavily relies on excess ammonia in the atmosphere. These findings suggest that ammonia plays a crucial role in determining chloride partitioning in the particle phase, leading to increased aerosol water content in high relative humidity conditions and lower temperature. The concentration of ACl relies heavily on both RH and temperature.



451

452 **Figure 6: Correlation plot for (a)  $\kappa_{200\text{nm}}\text{--}_90\%$  vs volume fraction of ammonium chloride aerosol ( $\text{VF}_{\text{ACI}}$ ) and (b) aerosol**

453 liquid water content (ALWC) vs mass fraction of ammonium chloride ( $\text{MF}_{\text{ACI}}$ ). The solid circle and square marker

454 represent the individual data points and the average of 10% volume and mass fraction increment of ACI data points,

455 respectively. The light and dark color regression lines and equations indicate the overall and average (10% volume and

456 mass fraction increment) correlation, respectively. The error bars indicate the standard deviation of the data points

457 within the 10% mass and volume fractional bins.

458 **3.2.4 Hygroscopicity during high biomass burning (H-BB), high-hydrocarbon like OA (H-HOA), high-Cl**  
 459 **(H-Cl), and relatively clean periods**

460 Delhi's atmosphere is a complex mixture of chloride and organic aerosol sources resulting from combustion  
 461 (including crop residue, agriculture waste, medical waste, municipal waste, plastic, etc.) and industrial activity.  
 462 To examine the influence of chloride and OA on aerosol hygroscopicity, all episodic events were categorized into  
 463 three groups. The first group was H-BB events, the second group was H-HOA events, and the third group was H-  
 464 Cl events. Aerosol chemical composition data was filtered based on hygroscopic parameter data for subsequent  
 465 analysis. This facilitates the retrieval of data specific to local emissions and atmospheric chemistry, as well as the  
 466 effects of various potential transported air masses. Extracting any conceivable information pertaining to aerosol  
 467 sources and transformation processes is valuable in interpreting their impact on aerosol hygroscopicity.

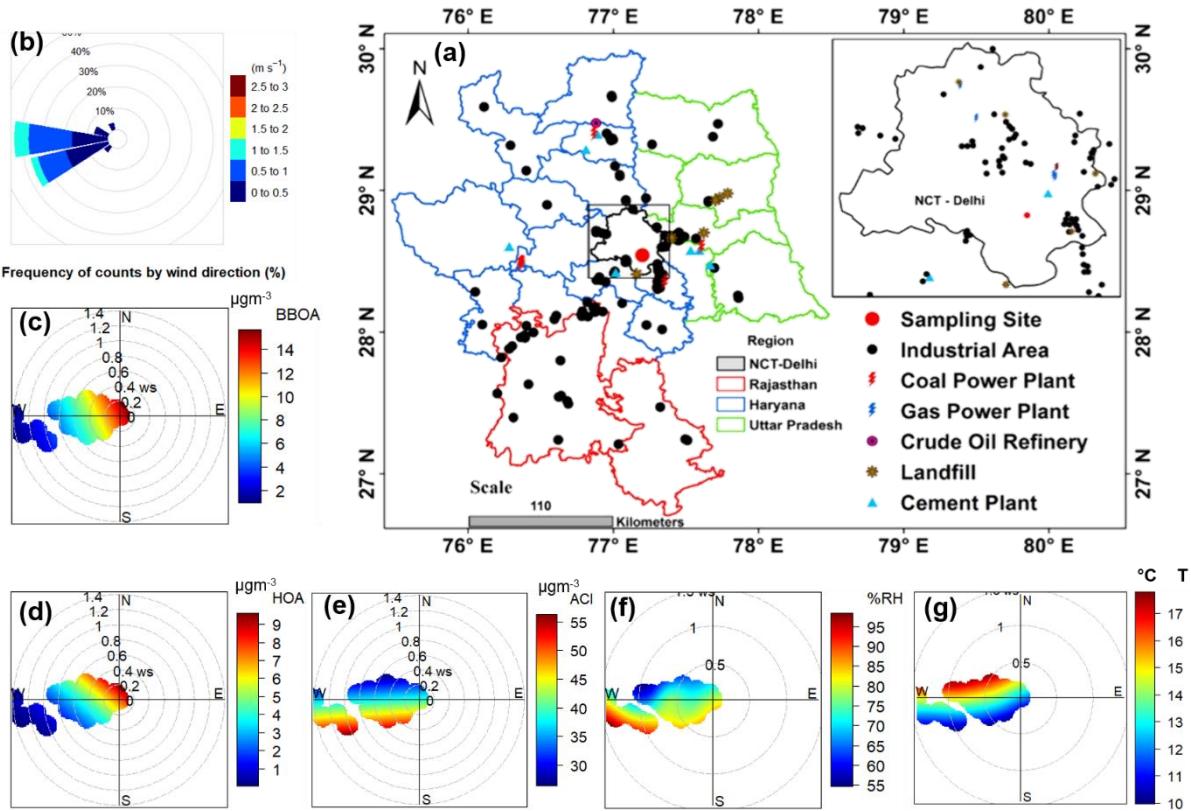
468 **3.2.4.1 High-Cl (H-Cl) events**

469 H-Cl events were selected as they correspond to a significant increase (>20%) in the fractional volume  
 470 contribution of  $\text{NH}_4\text{Cl}$  ( $\varepsilon_{\text{ACI}}$ ) in the  $\text{PM}_1$  aerosol at the receptor site. During this period, the surface wind mainly  
 471 came from the west, although it was also influenced by wind from the west-northwest, west-southwest, and  
 472 southeast, as illustrated in Fig. 7b. The average geometric mean diameter of the PNSD was almost 64 nm,

473 indicating that nearby fresh emission sources impact the particles. In addition, the average concentration of  $\text{SO}_2$ ,  
474  $\text{NO}_x$ , and  $\text{CO}$  concentrations were at 3.6 ppb, 51.9 ppb, and 0.4 ppm, respectively. The potential contributors to  
475 BBOA and HOA were from the WNW and SE directions, as demonstrated in the bipolar plot Fig. 7(c & d), and  
476 appeared to originate from a local source. Among the inorganic species,  $\text{ACl}$  displayed a strong correlation with  
477 ambient RH, as illustrated in Fig. 7e and f, suggesting that atmospheric gaseous  $\text{HCl}$  was neutralized by  $\text{NH}_3$  gas  
478 in the presence of atmospheric water content.  $\text{HCl}$  sources may include coal power plants, solid waste dumping  
479 sites with burning trash, and industries in the W-WSW direction (Gani et al., 2019), as depicted in in Fig. 7a.  
480 Trash burning in Delhi during winter may potentially dominate atmospheric high Cl events (Shukla et al., 2021;  
481 Tobler et al., 2020). In addition, the bipolar plots (Fig. 7(e and f)) indicate that  $\text{ACl}$  formation occurs under high  
482 relative humidity conditions associated with a relatively calm atmosphere, thereby triggering particles  
483 hygroscopicity. This hypothesis is supported by the strong correlation between ALWC, as discussed in the  
484 previous section. Moreover, as shown in Fig. 8a, the GF-PDF of particles of all sizes shows a relatively higher  
485 fraction of secondary mode particles contributing. More hygroscopic particles ( $\text{HGF}_{90\%} > 1.2$ ) accounted for higher  
486 percentage of 42%, 47%, 50%, 74%, and 83% in particles ranging from 20nm to 200nm in size, respectively.  
487 Therefore,  $\text{ACl}$  plays a significant role in increasing aerosol hygroscopicity, leading to the formation of fog/haze  
488 under higher RH and colder atmospheric conditions.

489 Gunthe et al. (2021) observed that high local emissions of hydrochloric acid in Delhi during February-March are  
490 partitioned into aerosol liquid water under high humidity conditions. This enhances the water uptake capacity of  
491 aerosols, sustaining particle hygroscopic growth and resulting in fog/haze formation. Additionally, studies  
492 worldwide on size-resolved hygroscopicity have observed Cl to be less than 1%, leading to the omission of  $\text{ACl}$   
493 as an aerosol constituent in the discussion. The current study did not find a strong correlation between  $\kappa$  with AS  
494 or AN, which may be due to their association with larger particle sizes. Additionally,  $\text{ACl}$  may be associated with  
495 particles of a comparatively smaller size ( $\leq 200$  nm). Furthermore, in the context of examining the influence of  
496 air mass trajectories, we mapped the constituents of aerosols in association with air mass back trajectories using  
497 PSCF to determine the potential area source contribution that may be influencing the aerosol evaluation processes,  
498 specifically the aerosol's hygroscopicity. However, we did not find any back trajectories that influenced the  
499 receptor site, as all trajectory endpoints were observed above the height of the planetary boundary layer.

500



501

502 **Figure 7** Map of (a) Delhi showing various types of industries located in the region and nearby locations, (b) wind rose  
 503 diagram and conditional bi-polar plots showing variation in mass concentration of (c) biomass burning OA (BBOA),  
 504 (d) hydrocarbon like OA (HOA), (e) ammonium chloride (ACI), (f) % ambient relative humidity (RH), and (g) ambient  
 505 temperature (T), with wind direction (WD) and wind speed (WS) during H-Cl events. A background map showing  
 506 various industrial locations was adapted from Rai et al. (2020).

507 **3.2.4.2 High biomass burning (H-BB) Events**

508 During the initial period of the field campaign (1-12 February), there were instances of high BB events. However,  
 509 H-BB events were generally observed during the midnight (01:00 hours) to morning (08:00 hours) or evening  
 510 (20:00 hours) to midnight (01:00 hours), and occasionally from evening (21:00 hours) to morning (11:00 hours).  
 511 The surface wind circulations were predominantly from the W, W-WNW, and W-WSW directions (refer to Fig.  
 512 S9b). The aerosol in this study was primarily sourced from local emissions. The aerosol constituents were mainly  
 513 associated with slower wind circulations from landfill sites, industrial areas, and coal power plants, as shown in  
 514 Fig. S9a. The PSCF analysis was justified by considering 48-hour air mass back trajectories, as shown in Fig.  
 515 S10. The average GMD of the PNSD was nearly 87 nm. Additionally, the mean concentration of SO<sub>2</sub>, NO<sub>x</sub>, and  
 516 CO were at 4.7 ppb, 124.1 ppb, and 1.5 ppm, respectively. Therefore, it is possible that BBOA was contributed  
 517 from the open local biomass burning activities at landfill sites or others sources. The H-BB event showed that

518 organic aerosol confined the largest fraction of BBOA, at 39%, followed by HOA at 28%. Fig. S9 (b, c, and d)  
519 clearly shows that BBOA and HOA have similar local source profiles but differ from the ACI source. Additionally,  
520 ACI was not found to have a strong association with ambient RH, but it was associated with emissions from a  
521 nearby coal power plant. However, the 48-hour air mass back trajectories indicate that the current city is also  
522 influenced by air masses from certain parts of Uttar Pradesh, Punjab, and Haryana. These states are potential hubs  
523 for crop residue burning, industrial activities and brick kilns, which contribute significantly to the presence of  
524 organic aerosols in PM<sub>1</sub>, particularly during winter. The H-BB event captured a significant volume fraction, 71%,  
525 of OA in PM<sub>1</sub>. BBOA contributed almost 39%, as shown in Fig. 9. A lower inorganic to OA ratio was a potential  
526 factor in decreasing the aerosol hygroscopicity during H-BB events. Additionally, the contribution of primary  
527 organic aerosol was enhanced during this event and, on average, increased to 67%. The hygroscopicity of the  
528 aerosol is inversely affected by organic aerosol loading. This observation was also reported by Mandariya et al.  
529 (2020) in Kanpur. The authors suggested that the hygroscopicity of the aerosol is adversely affected by primary  
530 biomass burning (BBOA) and hydrocarbon-like OA. BBOA was found to have a strong negative correlation with  
531 the hygroscopicity of 200 nm particles, supporting the conclusion. Apart from this, the Nucleation size particle  
532 (20 nm) exhibited a hygroscopicity parameter of  $0.02 \pm 0.02$  with a mono mode GF-PDF with the unit mode (Fig.  
533 8b) and consisted of  $83.7 \pm 18.6\%$  nearly hydrophobic particles. Additionally, as the aerosol size increased, the  
534 hygroscopicity parameter ( $\kappa_{H-TDMA\_90\%}$ ) significantly ( $p<0.05$ ) increased due to the contribution of relatively  
535 secondary aerosol particles ( $GF>1.2$ ) with increasing aerosol size. Approximately 54% of the accumulation size  
536 aerosol with a diameter of 100 nm is contributed by nearly hydrophobic particles ( $GF<1.2$ ), while the remaining  
537 46% is contributed by more hygroscopic particles ( $GF>1.2$ ).

### 538 3.2.4.3 High-HOA (H-HOA) Events

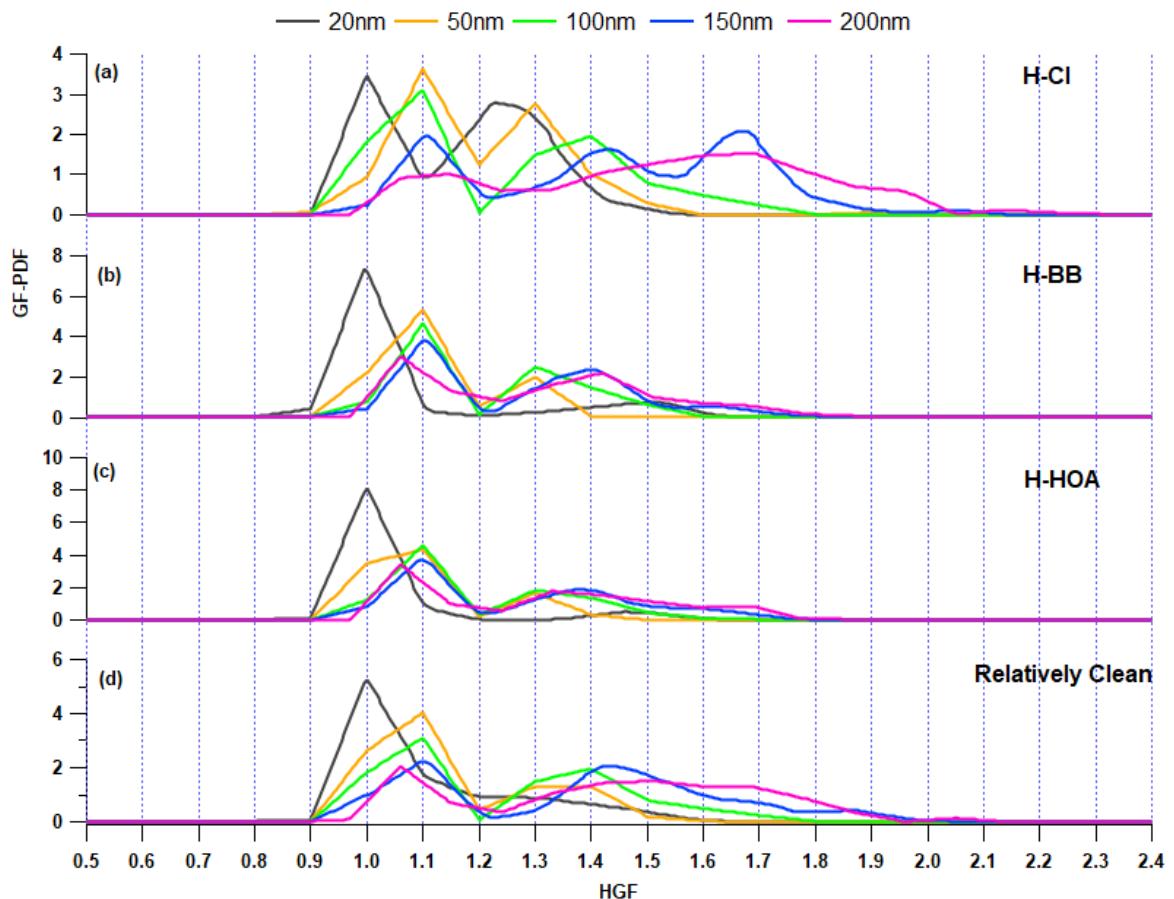
539 H-HOA events were identified based on the considerable mass concentration and fraction of HOA in the organic  
540 aerosol. These periods were generally noted from 19:00 hr to 09:00 hr the following morning during February 22-  
541 23, February 26-27 February, March 4, and March 7-8, as indicated in Fig. 2. The average geometric mean  
542 diameter of the particle number size distribution was nearly 80 nm. Additionally, the mean concentrations of SO<sub>2</sub>,  
543 NO<sub>x</sub>, and CO 4.3 ppb, 136.7 ppb, and 1.1 ppm, respectively. The potential impact of long-range transported  
544 aerosol was explored using PSCF. Air masses over Delhi, Haryana, and Uttar Pradesh were found to be potentially  
545 associated with hydrocarbon-like organic aerosols (Fig. S11). BBOA also followed a similar path as HOA.  
546 However, the potential area source of ACI was the nearby region of Delhi and Haryana. The loading of HOA was  
547 significantly ( $p<0.05$ ) higher than in H-BB, H-Cl and Clean periods. However, emission sources were different

548 during both H-HOA and H-BB periods. HOA may be a critical constituent in modulating aerosol hygroscopicity  
549 during these events, as it has been identified as a potential contributor to OA. HOA is typically considered  
550 hydrophobic (Duplissy et al., 2011), and therefore, its elevated contribution (41%) to OA could be responsible for  
551 the lower  $\kappa$  observed during these events. The overall hygroscopicity of particles with sizes of 20, 50, 100, 150,  
552 and 200 nm was recorded as  $0.01 \pm 0.01$ ,  $0.06 \pm 0.03$ ,  $0.11 \pm 0.03$ ,  $0.14 \pm 0.04$ , and  $0.17 \pm 0.05$ , respectively. The  
553 lower hygroscopicity of particles may be attributed to the predominant fractional contribution of primary aerosol  
554 particles ( $GF < 1.2$ ), as illustrated in Fig. 8(c). In general, OA constitutes the majority of the  $PM_1$ , with primary  
555 OA accounting for approximately 60% of the OA. However, the relative increase in the contribution of other more  
556 hygroscopic constituents, such as secondary organic aerosol (LO-OOA and MO-OOA), ACl, and AS, in the  
557 aerosol may help to balance the negative impact of high-HOA, which is limited by  $\kappa$ .

558 **3.2.4.5 Relatively Clean Period**

559 Clean events were recorded on February 24<sup>th</sup>, 25<sup>th</sup>, and March 5<sup>th</sup>-7<sup>th</sup>. The clean duration was from 9 PM to 11  
560 AM. E and S-E winds dominated the relatively clean period, but pollution was associated with calm winds, as  
561 shown in Fig. S12. The average GMD of the PNSD was nearly 54 nm. Additionally, the mean concentrations of  
562  $SO_2$ ,  $NO_x$ , and CO concentrations were at 4.2 ppb, 43.2 ppb, and 0.4 ppm, respectively. Similar sources were  
563 found for BBOA, HOA, and ACl, and they were all strongly associated with ambient relative humidity. The mean  
564 concentrations of organic aerosol, ACl, AN, and AS were  $11.0 \pm 6.4$ ,  $1.4 \pm 1.1$ ,  $3.0 \pm 1.5$ , and  $4.4 \pm 2.2 \mu\text{gm}^{-3}$ ,  
565 respectively. These mass concentrations were significantly lower than in other specified periods. However, OA  
566 was still the dominant species, comprising 56% of the  $PM_1$  volume, as shown in Fig. 9. Of all the factors  
567 contributing to OA, HOA was the dominant, accounting for 33%. However, secondary organic aerosol accounted  
568 for the majority of OA at 54.4%. Secondary OA is characterized by a relatively higher degree of oxidation, which  
569 positively affects OA hygroscopicity (Kim et al., 2017; Richard et al., 2011; Wu et al., 2013a). The mean  
570 hygroscopicity of particles with diameters of 20, 50, 100, 150, and 200 nm during the Clean period were observed  
571 to be  $0.03 \pm 0.02$ ,  $0.09 \pm 0.04$ ,  $0.14 \pm 0.06$ ,  $0.22 \pm 0.09$ , and  $0.27 \pm 0.07$ , respectively. These values were  
572 significantly ( $p < 0.05$ ) different from each other. However, the hygroscopicity of the 200 nm accumulation  
573 particles was not significantly ( $p > 0.05$ ) higher than that of the 150 nm particles. The increase in hygroscopicity  
574 as particle size increases from 20 to 200 nm can also be attributed to the greater proportion of more hygroscopic  
575 particles ( $GF > 1.2$ ) compared to nearly hydrophobic or less hygroscopic particles ( $GF < 1.2$ ) (refer Fig. 8d). The  
576 nucleation particles, with a size of 20 nm, were mostly composed of less hygroscopic particles ( $76.8 \pm 21.7\%$ ).

577 This indicates that there was an influence from fresh emission sources. On the other hand, Aitken (50 nm) and  
 578 Accumulation (200 nm) size aerosols had a lower percentage of less hygroscopic particles, with  $69.3 \pm 14.7$  and  
 579  $25.4 \pm 10.8$ , respectively. These results suggest that accumulation-size aerosols dominated secondary aerosols,  
 580 which is also supported by their GF-PDF as shown in Fig. 8(d). Aerosol particles of nucleation size (20nm)  
 581 exhibited a nearly mono-modal GF-PDF with a mode of unit growth factor. In contrast, as the aerosol size  
 582 increased, the mode shifted towards the higher end and the GF-PDF shifted from unit to multi-mode.



583

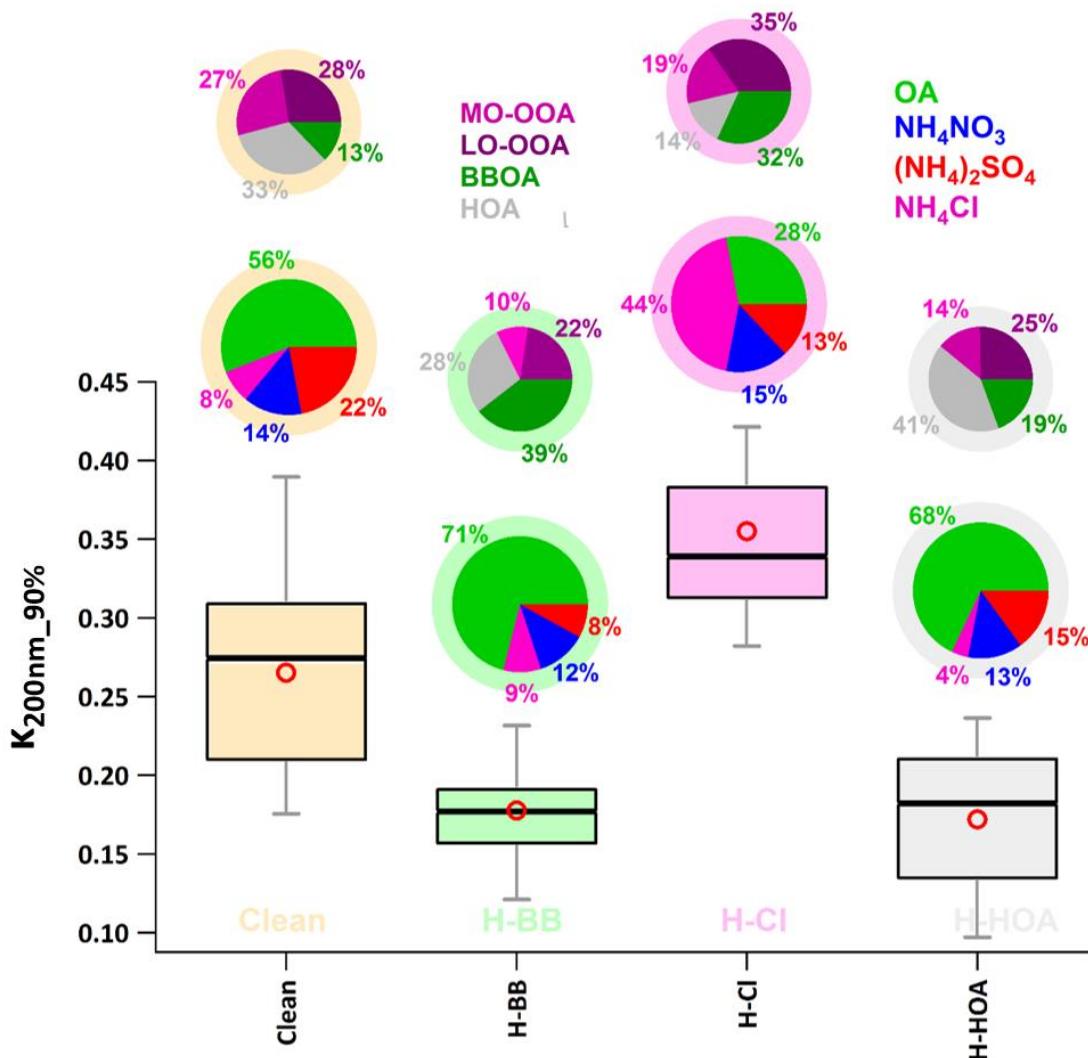
584 **Figure 8: Growth Factor Probability Density Function (GF-PDF) of 20, 50, 100, 150, and 200 nm aerosol particles for**  
 585 **the (a) H-Cl, (b) H-BB, (c) H-HOA, and (d) relatively clean periods.**

### 586 3.2.4.6 Comparison of $\kappa$ for different events

587 We compared the hygroscopicity of aerosols during different periods using a 200 nm particle size that represents  
 588 the bulk aerosol chemical composition. Additionally, in this study, the mode of the particle-volume size  
 589 distribution ranged from 400 nm to 600 nm in dry mobility diameter. Therefore, 200 nm particles are the best  
 590 choice for comparing hygroscopicity parameters among different periods, considering bulk aerosol composition.  
 591 Additionally, a good Pearson's r value of 0.76 was found between  $\kappa_{200\text{nm}, 90\%}$  and  $\kappa_{\text{chem}, 90\%}$ , which were derived

592 from the chemical composition of dry PM<sub>1</sub> particles measured by the ACSM using the ZSR mixing rule (Stokes  
593 and Robinson, 1966). This supports our decision to consider 200 particles for comparison.

594 The event labeled H-Cl exhibited the highest value ( $0.36 \pm 0.06$ ) of  $\kappa_{200\text{nm\_90\%}}$  compared to the events labeled H-  
595 BB ( $0.18 \pm 0.04$ ), H-HOA ( $0.17 \pm 0.05$ ), and relatively Clean ( $0.27 \pm 0.07$ ), as shown in Fig. 9. Additionally, the  
596 average  $\kappa_{200\text{nm\_90\%}}$  value for the H-Cl event was significantly ( $p < 0.05$ ) higher than that of the other events. A  
597 significant increase in Cl emissions in the Delhi region could lead to a substantial increase in the aerosol liquid  
598 water content. This increase in water content could result in higher aerosol hygroscopicity, which could further  
599 enhance cloud condensation nuclei formation. This, in turn, could potentially trigger haze/fog events in Delhi  
600 NCR (Gunthe et al., 2021). Controlling open trash/waste burning in the region could help minimize Cl emissions,  
601 which in turn could reduce the possibility of haze/fog formation during high atmospheric conditions. However,  
602 there was no significant difference ( $p > 0.05$ ) in  $\kappa_{200\text{nm\_90\%}}$  values between H-BB and H-HOA events, possibly due  
603 to relative changes in primary, secondary OA, and inorganic species. In H-HOA events, the negative effect of a  
604 significantly higher fractional contribution of HOA to OA (41%) possibly balances with a positive impact of a  
605 7% increase in secondary OA relative to H-BB. Several worldwide studies (Jimenez et al., 2009; Mandariya et  
606 al., 2019; Sun et al., 2013) have reported that secondary organic aerosol is associated with a higher O/C ratio.  
607 Additionally, several studies have found a positive correlation between the O/C ratio and  $\kappa$  (Jimenez et al., 2009;  
608 Kim et al., 2020), as described earlier. Furthermore, a 5% decrease in ACl during H-HOA events may be offset  
609 by a 7% increase in AS fraction during H-BB events. Overall, the relative changes in aerosol constituents resulted  
610 in insignificant changes in  $\kappa$  during H-BB and H-HOA periods. However, H-BB and H-HOA events showed  
611 significantly ( $p < 0.05$ ) lower hygroscopicity compared to a relatively cleaner atmosphere. The aerosol associated  
612 with relatively cleaner events had a higher inorganic-to-organic ratio. Additionally, during clean periods, the  
613 aerosol consisted of a significantly higher fraction of secondary organic aerosol. This could be the reason for the  
614 higher hygroscopicity associated with organic aerosol compared to other events. Studies worldwide (Aiken et al.,  
615 2008; Cerully et al., 2015b; Chakraborty et al., 2016b; Mandariya et al., 2019) have reported that organic aerosol  
616 loading has an inverse impact on the oxidation/aging process of OA. This results in higher hygroscopicity during  
617 relatively cleaner periods.



618

619 **Figure 9:** Box plot showing variation in H-TDMA measured hygroscopic parameter of 200 nm size particles  $\kappa_{\text{H-TDMA}}$   
 620 ( $\kappa_{200\text{nm-90\%}}$ ) in high biomass burning (H-BB), high-chloride (H-Cl), and high-hydrocarbon like organic aerosol (H-  
 621 HOA) events. Different colors represent respective events in the plot. A bigger pie chart represents the overall average  
 622 volume fractional contribution of various aerosol species indicated by color-coding. In addition, minor pie charts  
 623 described the event average mass fractional contribution of different OA species in OA. Diffused ring color of the pie  
 624 chart displays the respective event.

625 **4. Conclusions**

626 The study examined the hygroscopicity of aerosol particles of various sizes (Nucleation - 20 nm, Aitken - 50 nm,  
 627 and Accumulation - 150 and 200 nm) in Delhi during the winter months of February-March 2020. The research  
 628 also identified differences in hygroscopicity, particularly in aerosols with higher levels of chloride, biomass  
 629 burning, and hydrocarbon-like organic components. Delhi is known as one of the most polluted cities, particularly

630 during winter haze and fog events when it often experiences high levels of chloride pollution. This study reports  
631 on the temporal variations in size-specific hygroscopic parameters ( $\kappa_{H-TDMA\_90\%}$ ) under sub-saturated conditions  
632 (90% RH) in Delhi for the first time. Additionally, it presents the hygroscopicity of nucleation and Aitken mode  
633 particles using HTDMA for the first time in India.

634 The  $\kappa_{H-TDMA\_90\%}$  values observed for aerosol particles of 20 nm, 50 nm, 100 nm, 150 nm, and 200 nm ranged from  
635 0.00 to 0.11 (with an average of  $0.03 \pm 0.02$ ), 0.05 to 0.22 ( $0.11 \pm 0.03$ ), 0.05 to 0.30 ( $0.14 \pm 0.04$ ), 0.05 to 0.41  
636 ( $0.18 \pm 0.06$ ), and 0.05 to 0.56 ( $0.22 \pm 0.07$ ), respectively. During the study period, it was observed that the  
637 average hygroscopicity parameter increased significantly with the size of the particles ( $p < 0.05$ ). The diurnal  
638 variations of  $\kappa_{20nm\_90\%}$  and  $\kappa_{50nm\_90\%}$  were dynamic, while larger accumulation mode particles showed a flatter  
639 diurnal pattern. This was due to the positive and negative effects of changes in the volume fraction of  $\text{NH}_4\text{Cl}$  and  
640 organic aerosol in the aerosol with increasing particle size. The variation in  $\kappa_{200nm\_90\%}$  was primarily associated  
641 with fluctuations in  $\text{NH}_4\text{Cl}$  and OA, rather than  $(\text{NH}_4)_2\text{SO}_4$ .

642 Pollution episodes were mainly linked to local biomass burning and industrial and waste-burning emissions in  
643 Delhi and nearby regions. The study primarily focused on the impacts of high biomass burning (H-BB), high  
644 hydrocarbon-like OA (H-HOA), and high chloride emissions (H-Cl) on aerosol hygroscopicity and compared  
645 them to cleaner periods. The period with H-Cl exhibited significantly higher hygroscopicity ( $0.35 \pm 0.06$ )  
646 compared to the periods with H-BB ( $0.18 \pm 0.04$ ), H-HOA ( $0.17 \pm 0.05$ ), and the relatively cleaner period ( $0.27 \pm 0.07$ ). However, H-BB and H-HOA showed no significant difference in hygroscopicity but displayed lower  
647 hygroscopicity compared to the cleaner periods. This could be attributed to lower levels of organic aerosols and  
648 a higher ratio of inorganic-to-organic aerosol in the aerosol. The study found that an increase of 10% increase in  
649 chloride aerosol (ammonium chloride) significantly increased hygroscopicity, resulting in approximately  $3 \mu\text{g m}^{-3}$   
650 higher aerosol liquid water content during high chloride events. This 10% increase in a high-volume fraction of  
651 ammonium chloride in aerosol significantly ( $p < 0.05$ ) enhanced aerosol hygroscopicity by 0.0041. The research  
652 indicates that chloride emissions are a significant concern in Delhi. These emissions enhance aerosol  
653 hygroscopicity, promote cloud formation during winter days, and contribute to fog and haze in the region. High  
654 levels of chloride in aerosols counteract the negative impact of high organic aerosol loading on cloud condensation  
655 nuclei activity. The study suggests that controlling open burning of waste materials could help reduce haze and  
656 fog events in Delhi during the winter months.

658 **Supporting Information**

659 Supplementary pieces of information are mentioned in the supplementary file.

660 **Data availability.** Data can be accessed at the following repository:

661 <https://web.iitd.ac.in/~gazala/publications.html> (Mandariya et al., 2023).

662 **Author contributions.** AKM: conceptualization, HTDMA data analysis, investigation, methodology, writing  
663 (original draft and review and editing). AA: operated aerosol instrumentation and collection of data on-board in  
664 Delhi, analysis of MPSS data, conceptualization, review and editing. MH: help in data collection. NAB: ACSM  
665 operation and data collection. KP: ACSM data analysis and PMF analysis. JA: providing ACSM, review, and  
666 editing. LHR: ACSM, review, and editing. AW: experiment design, project administration, supervision, review,  
667 and editing. GH: operated aerosol instrumentation and collection of data on-board in Delhi, data analysis,  
668 methodology, funding acquisition, project administration, supervision, review and editing.

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671 **Competing interests**

672 The authors declare that they have no conflict of interest.

673

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