1	Ambient measurement	of fluorescent	aerosol	particles	with a	WIBS i	in the	Yangtze
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2 River Delta of China: potential impacts of combustion-related aerosol particles

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12 Abstract

Fluorescence characteristics of aerosol particles in polluted atmosphere were studied 13 using a wideband integrated bioaerosol spectrometer (WIBS-4A) in Nanjing, Yangtze 14 River Delta area of China. We observed strong diurnal and day-to-day variations of 15 fluorescent aerosol particles (FAPs). The average number concentrations of FAPs (1-15 16 µm) detected in the three WIBS measurement channels (FL1: 0.6 cm⁻³, FL2: 3.4 cm⁻³, 17 FL3: 2.1 cm⁻³) were much higher than those observed in forests and rural areas, 18 suggesting that FAPs other than bioaerosols were detected. We found that the number 19 fractions of FAPs were positively correlated with the black carbon mass fraction, 20 especially for the FL1 channel, indicating a large contribution of combustion-related 21 aerosols. To distinguish bioaerosols from combustion-related FAPs, we investigated two 22 23 classification schemes for use with WIBS data. Our analysis suggests a strong size dependence for the fractional contributions of different types of FAPs. In the FL3 channel, 24 combustion-related particles seem to dominate the 1-2 µm size range while bioaerosols 25 dominate 2-5 µm. The number fractions of combustion-related particles and non-26 27 combustion-related particles to total aerosol particles were ~11% and ~5%, respectively.

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30 **1 Introduction**

From the beginning of atmospheric aerosols studies, airborne biological particles 31 have been found as an important class of aerosol particles (Bary et al., 1887; Haldane and 32 33 Anderson, 1887; Després et al., 2012). They are ubiquitous in the atmosphere with a wide size range from approximately several nanometers to a few hundred micrometers (Pöschl, 34 35 2005; Després et al., 2012). Primary biological aerosol particles (PBAPs) are a subset of biological particles, usually defined as the aerosols of biological origin or carry living 36 organisms, including viruses, bacteria, fungal, pollen, cell or plant debris and animal 37 tissue (Huffman et al., 2012). PBAPs can affect the Earth's radiation balance directly by 38 absorbing and scattering solar radiation, and indirectly by serving as giant cloud 39 condensation nuclei (CCN) and ice nuclei (IN), and thereby influence cloud 40 microphysical and climate-relevant properties (Christner et al., 2008; Pöschl et al., 2010; 41 Deleon-Rodriguez et al., 2013; Morris et al., 2013). These impacts are not only restricted 42 to a local scale, but may also be effective in a regional scale due to the transport of 43 bioaerosols, e.g., by dust storms (Griffin, 2007; Polymenakou et al., 2008; Hallar et al., 44 45 2011; Creamean et al., 2013). In addition, PBAPs can spread human, animal and plant disease and influence public health (Després et al., 2012; Cao et al., 2014). Considering 46 its comprehensive impacts in diverse scientific fields, a better understanding of PBAPs 47 such as its concentration, composition, spatial and temporal variability becomes critically 48 49 important.

50 Despite its importance, information of PBAPs in the atmosphere is still very limited. Further investigation is hindered due to the lack of automatic measurement techniques. 51 Most previous studies are based on the analysis of cultivable PBAPs or DNAs from filter 52 samples (Henningson and Ahlberg, 1994; Duchaine et al., 2001; Yu et al., 2013). These 53 54 methods are time-consuming and their results may differ depending on the cultivation condition and procedures, especially considering the ubiquity of microorganisms that 55 cannot be cultivated (Oliver, 2005; Pöhlker et al., 2012). The low time resolution of 56 cultivation methods makes it difficult to investigate the emission mechanisms of PBAPs, 57 58 which happen at a time scale of less than a few hours.

59 Since most biological materials contain fluorophores, instruments based on the fluorescence detection, such as UV-APS (Ultraviolet Aerodynamic Particle Sizer) 60 (Brosseau et al., 2000), WIBS (Wideband Integrated Bioaerosol Spectrometer) and other 61 custom-made instruments based on the LIF (Laser induced fluorescence) technology (Pan 62 et al., 2009; Taketani et al., 2013; Miyakawa et al., 2015), have recently been developed 63 for online measurements of PBAPs. These instruments have been applied in various 64 atmospheric environments, including rainforest (Gabey et al., 2010; Huffman et al., 2012), 65 forest (Huffman et al., 2013; Schumacher et al., 2013; Crawford et al., 2014), high-66 altitude (Gabey et al., 2013; Valsan et al., 2016), rural (Healy et al., 2014), suburban 67 (Huffman et al., 2010; Toprak and Schnaiter, 2013) and urban environments (Gabey et al., 68 2011; Miyakawa et al., 2015; Wei et al., 2016). Besides settled sampling sites, WIBS has 69 70 also been used for airborne observations (Perring et al., 2015). In clean environments, these techniques can effectively distinguish PBAPs from other kinds of aerosol particles. 71 For example, Huffman et al. (2012) found similar size distributions of PBAPs measured 72 by UV-APS and scanning electron microscopy (SEM) in the Amazon rainforest. 73

PBAPs, however, are not the only fluorescent aerosol particles (FAPs) in the atmosphere. Other materials such as polycyclic aromatic hydrocarbons (PAHs) and humic-like substances (HULIS) may also fluoresce and contribute to the measured fluorescence signals (Pöhlker et al., 2012). Hence, the fluorescent information given by the instruments based on the fluorescence detection may include both fluorescent piological and non-biological particles.

In order to have a deeper insight into the ambient FAPs in polluted area, we have performed WIBS measurements in Nanjing, China in the autumn of 2013. In this study, we first present the number concentration of FAPs in Nanjing in comparison to previous studies. Then we demonstrate the potential impacts of combustion-related aerosol particles in discrimination of bioaerosols under the polluted atmosphere. Finally, we introduce alternative methods to quantify the relative contributions of different fluorescent materials (combustion- and bioaerosol-type particles) to FAPs.

87 2 Methods and instrumentation

88 2.1 Site description

WIBS measurements were performed at the Station for Observing Regional 89 Processes of the Earth System (SORPES station), Xianlin campus of Nanjing University 90 91 (32.12 N, 118.95 E). Nanjing lies in the Yangtze River Delta with a total population of 8.18 million (data of 2013), and it's a large commercial center in the East China region. 92 The measurement site is ~20 km in the east of the urban center. The SORPES station is 93 located on a hill about 40 m above the surroundings. Details of this station were 94 described by Ding et al. (2013). A 0.75 inch stainless-steel tube inlet was installed ~3 m 95 above the roof, and sample air was dried by a vertical silica gel drier prior to entering the 96 WIBS. Data were collected from 29 October to 15 November 2013. 97

98 2.2 Instruments

99 Measurements of FAPs were performed with a WIBS-4A. It uses the single-particle elastic scattering intensity at 535 nm to calculate the optical size of particles. The 100 101 scattering signal is used to trigger the flash of two xenon lamps with UV wavelength of 280 nm and 370 nm, respectively. The fluorescent signals are recorded at two wavelength 102 103 bands (310-400 nm and 420-650 nm). This design results in three wavelength channels: FL1 with excitation at 280 nm and detection 310-400 nm, FL2 with excitation 104 wavelength at 280 nm and detection wavelength at 420–650 nm, and FL3 with excitation 105 wavelength at 370 nm and detection wavelength at 420-650 nm. Respective abbreviations 106 107 are listed in Table 1. During the measurement period, we used 1 μ m and 2 μ m fluorescent and non-fluorescent PSL microspheres (3K-990, B0100, 4K-02 and B0200, Duke 108 Scientific, Inc.) for calibration. The fluorescence noise threshold is defined as: 109

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$$E_{\rm Threshold} = E + 3\sigma \tag{1}$$

111 Where *E* is the modal baseline and σ is the standard deviations in each channel. Particles 112 with fluorescence signals above the noise threshold are classified as FAPs. Single-particle 113 data were converted into a size distribution with a 5-min integration time and particles 114 with diameter of 1-15 µm were analyzed in this study.

Meteorological data were collected with an Automatic Weather Station (CAMPBEL
co., AG1000). The differential mobility particle sizer (DMPS, built at Helsinki University)

117 was used to measure the number size distribution of sub-micron particles between 6 and

- 118 800 nm mobility diameter (Herrmann et al., 2014). Particle mass concentration below 0.8
- 119 $\mu m (PM_{0.8})$ was calculated from the measured size distributions assuming a density of 1.6
- 120 g cm⁻³ (Wang et al., 2014). A 7-wavelength "Spectrum" Aethalometer (AE-31, Magee
- 121 Scientific co.) was used to measure the black carbon (BC) mass concentration $M_{\rm BC}$.

122 **3 Results and discussion**

3.1 Non-biological fluorescent aerosol particles

Figure 1 shows the time series of number concentrations and fractions of FAPs 124 during the measurement period. The number concentration of FAPs was dominated by 125 FL2 channel with a mean number concentration N_{FL2} of 3.4 cm⁻³, followed by N_{FL3} of 2.1 126 cm^{-3} and N_{FL1} of 0.6 cm⁻³. These number concentrations were 1~2 order of magnitudes 127 higher than those observed in clean areas where bioaerosols dominate the FAPs (Table 2). 128 For example, FAPs of 0.093 cm⁻³, 0.15 cm⁻³ and 0.023 cm⁻³ were reported for the Amazon, 129 Borneo and Hyytiälä forests, respectively (Gabey et al., 2010; Huffman et al., 2012; 130 131 Toprak and Schnaiter, 2013). Since polluted areas are characterized by less plants and natural biological processes, less bioaerosols are expected compared to the forests. This 132 133 much higher number concentration of FAPs observed in Nanjing suggests other kinds of 134 FAPs being detected by WIBS.

135 Previous studies (Pöhlker et al., 2012; Miyakawa et al., 2015; Perring et al., 2015) 136 reported that non-biological compounds like PAHs, mineral dust and HULIS can also 137 fluoresce. Several non-biological fluorophores such as SOAs, pyrene, humic acid and naphthalene have fluorescent property in the same excitation and emission wavelength 138 139 bands of FL1 channel (Chang and Thompson, 2010; Pöhlker et al., 2012). These 140 materials originate from sources different from bioaerosols. For example, PAH enriches on the surface of soot particles from biomass burning and fuel combustion, challenging 141 142 the interpretation of ambient particle fluorescence measurements.

Our sampling site is located in the vicinity of the polluted Nanjing city and is intensively affected by human activities. To check the potential influences of PAH and combustion processes, we compared the variability of FAPs with that of BC, on which the PAHs are often coated. To minimize the impacts of transport and boundary layer 147 dynamics, we compared the ratio of BC and FAPs to the total particles in their respective size range, i.e., $M_{\rm BC}/PM_{0.8}$ and $F_{\rm x}$ instead of using absolute concentrations. Miyakawa et 148 149 al. (2015) used factor analysis based on carbon monoxide, elemental carbon and other markers (using concentration instead of ratio) to identify "combustion-type" and "dust-150 type" aerosols in urban areas. In our study, we found that $M_{\rm BC}/PM_{0.8}$ showed a good 151 correlation with the number fraction of FAPs, especially in the FL1 channel (r=0.748, 152 Fig.1). For FL2 and FL3 channels, the number fractions also nicely followed the variation 153 of $M_{\rm BC}/PM_{0.8}$ except for November 8, which deteriorated the overall correlation. Since 154 BC and PAHs are products of incomplete combustion, the similar variability suggests a 155 large contribution from combustion-related aerosols to the measured FAPs, especially in 156 FL1 channel. Our findings strongly support previous results (Toprak and Schnaiter, 2013; 157 Miyakawa et al., 2015) that FAPs (FL1 channel) may came from combustion process and 158 anthropogenic interference. 159

3.2 Spectral patterns of fluorescent aerosol particles

The complex nature of FAPs in polluted areas challenges the interpretation of 161 ambient measurements. Different fluorophores have their characteristic excitation-162 emission matrices (EEM) map, which can be useful for discrimination of biological from 163 non-biological FAPs (Pöhlker et al., 2012). Since WIBS only has two excitation and 164 emission wavebands, a high-resolution EEM map cannot be retrieved. But we can still 165 166 consider the two wavebands as a low resolution EEMs, of which the distribution (i.e., the ratio of the two wavebands) may also contain information about the nature of FAPs. For 167 168 example, we can assume two kinds of fluorescent compounds I and II have different fluorescent spectra, as shown in Fig. 2a. For each compound, the integrated fluorescence 169 170 intensity are determined in two wavebands by WIBS (Fig. 2b). For qualitative analysis, a normalized EEM is often used providing the relative wavelength dependence of 171 172 fluorescent materials. For WIBS, we simply used the ratio of fluorescence intensity from 173 different WIBS channels to represent the wavelength dependence (Fig. 2c).

Figure 3 shows the intensity distributions of aerosols particles in different fluorescence bands/channels. Due to the instrument setting, fluorescence signal intensities beyond 2200 arbitrary units (a.u.) are forced to the range of 2000-2200 a.u., regarding as saturated signal. Hence we only discussed fluorescence signal intensities 178 below 2000 a.u.. We first investigated the intensity ratio between channel FL1 and FL2, as shown in Fig. 3a. With increasing fluorescence intensity, the number concentrations 179 180 sharply dropped, i.e., most of the abundant aerosol particles exhibited no or only weak fluorescence. Using the intensity ratio of FL1 to FL2 (I_{FL1}/I_{FL2}) as a fluorescence 181 fingerprint, we obtained two prominent groups of aerosols with I_{FL1}/I_{FL2} approaching 0 or 182 infinity. $I_{FL1}/I_{FL2} \sim 0$ means that the aerosol have a low FL1 intensity below the detection 183 limit and a high FL2 intensity, while I_{FL1}/I_{FL2} approaching infinity means the opposite. 184 According to the detection thresholds of both FL1 and FL2 channels, we then classified 185 the aerosol particles into four groups with FL1/FL2 above or below the detection 186 threshold (labelled as g1 to g4 in Fig. 3). We further investigated the FL3 properties of 187 the various groups. As shown in Figs. 3b-3d, the aerosol number concentration decreased 188 189 as FL3 intensity increased resembling the distribution for FL1 and FL2. Similarly we used the fluorescence threshold of FL3 to classify aerosols from g1 to g4 into subgroups. 190

Our efforts towards a spectral fingerprint resulted in the same classification method 191 as in Perring et al. (2015). Here we adopted the labels of Perring et al. (2015) in which 192 193 channel A refers to FL1, channel B refers to FL2 and channel C refers to FL3. Any aerosol particle can have signals above/below the fluorescence threshold in any of these 194 195 channels, leading to seven combinations of fluorescence signals, i.e., particles with fluorescence signals above the threshold in single channel as types A, B and C; particles 196 197 with fluorescence signals in two channels as types AB, AC and BC and particles with 198 fluorescence signals in all three channels as type ABC (Table 1).

199 As shown in Fig.4a, types B, BC and C were the most abundant FAPs, followed by types ABC, AB and A. Type AC had the lowest loading and was not even visible. The 200 mean number concentrations of dominant types B, BC and C were 1.77 cm⁻³, 1.06 cm⁻³ 201 and 0.66 cm⁻³, respectively (Table 3). The number concentration of 7-type FAPs 202 203 exhibited strong diurnal and day-to-day variability (Fig. 5). Number concentration of 204 FAPs peaked in the morning (~08:00 local time) and reached a minimum in the afternoon (~14:00). Their similar diurnal patterns indicate the dominant effect of boundary layer 205 206 development in controlling the variability of aerosol particles, which was also shown in FL1, FL2 and FL3 channels (Figure S1). To better understand the source of FAPs, we 207 208 also investigated the number fraction of FAPs in total particles. The boundary layer development exerts similar effect on all kinds of aerosol particles. Thus for particles of the same origin, their ratios will remain constant and a difference in their ratios reflects their different sources. As shown in Fig. 5, the fractions of FAPs presented quite different diurnal patterns. The fractions of type BC revealed substantial diurnal opposite with a clear morning peak and early afternoon minimum. Type A and type B showed a much weaker variability, implying a similar source of FAPs as the total aerosol particles.

The number size distributions of FAPs were shown in Figure 6. The highest FAPs 215 216 number concentration came out at $\sim 1 \,\mu m$ except type ABC. Type ABC peaked at 1-2 μm with a second peak at 4-6 µm. For type A, type C and type BC the number concentration 217 monotonously decreased with size increased. No fluorescence signals were found in FL1 218 219 and FL3 channels (corresponding to type A, type C and type AC FAPs) for the particles 220 of size larger than 4 μ m. On the contrary, the number fractions of FAPs generally increased as the particle size increased, reaching $\sim 100\%$ at 3-4 µm for FL2 channel (not 221 shown in Fig.6). These results reveal that most coarse mode particles contain certain 222 223 kinds of fluorophores.

224 Meanwhile, we compared the number fraction of 7-type FAPs with $M_{\rm BC}/PM_{0.8}$, the results indicate that the number fractions of types A, AB, and ABC showed good 225 correlations with $M_{\rm BC}/PM_{0.8}$ (Fig. 7), suggesting a large contribution of combustion-226 related aerosol particles to these types. Note that all these types contain FL1 signals, 227 implying the potential application of FL1 in the identification of biomass burning (or 228 other combustions) events. Likewise, fluorescent types B and BC mostly followed the 229 variation of $M_{\rm BC}/PM_{0.8}$ except for November 8 when elevated fractional contributions 230 231 were observed one day before a rain event on November 9. A dramatic release of certain fungal spores was often observed before rain (Hjelmroos, 1993). However, the increase 232 233 on November 8 was mainly contributed by 1-2 μ m FAPs rather than fungal spores (> 3 µm) shown by Hjelmroos (1993). So the origin of this elevated FAPs remained 234 235 inconclusive. Moreover, good correlation (r=0.58) between type B particles in 3-4 µm and $M_{\rm BC}/PM_{0.8}$, suggesting a closer link of this peak with type B particles to combustion 236 process. Fluorescent type C showed a weak negative correlation with $M_{\rm BC}/PM_{0.8}$, 237 suggesting a minor role of combustion-related aerosols or major contribution of non-238 combustion related aerosols (e.g., bioaerosols or dusts). 239

3.3 Fluorescence intensity

Besides the relative wavelength dependence, the absolute quantum yield is also one of the most important characteristics of a fluorophore. Discrepancies in the quantum yield can directly influence the fluorescence, resulting in different intensity levels. Thus it is possible to use the intensity information to identify different kinds of FAPs. Huffman et al. (2012) showed that the UV-APS can be used to successfully discriminate bioaerosols from dust particles, both of which have been suggested to fluoresce (Pöhlker et al., 2012).

247 We first made a hypothesis that there exists a characteristic intensity value I_{cri} , above which most FAPs are bioaerosols. Since I_{cri} cannot be directly inferred from the intensity 248 249 distribution (Fig. 3), we adopted the parameter $M_{\rm BC}/PM_{0.8}$ to assist our analysis. This is because bioaerosols and combustion-related FAPs are of different origins, we scanned 250 different values for I_{cri} until the corresponding FAPs (of intensity> I_{cri}) fraction showed a 251 non-positive correlation with $M_{\rm BC}/PM_{0.8}$. In this study, we mainly focus on the FL3 252 channel since it is running in a similar excitation-emission wavelength as the UV-APS 253 and it has been validated against other independent method. We thereby suggest that FL3 254 channel can be used to discriminate bioaerosols from combustion-generated FAPs in a 255 similar approach. The analysis of FL1 and FL2 channels were shown in the 256 supplementary Information (Figure S2 and Figure S3). Figure 8 shows the averaged 257 fractional contribution of FAPs with $I_{FL3}>I_{cri}$ at different $M_{BC}/PM_{0.8}$ levels. To account 258 259 for the size dependence of fluorescence signals, we first classified FAPs according to the particle size. For the 1-2 µm size range, the fraction was always positively correlated 260 with $M_{\rm BC}/PM_{0.8}$ and was independent of the selection of $I_{\rm cri}$. For the size range of 2-5 μ m, 261 the FAPs showed mostly negative correlation with $M_{\rm BC}/PM_{0.8}$ and were also independent 262 of the I_{cri} selection. For FAPs larger than 5 μ m, the selection of I_{cri} became critical. With 263 increasing I_{cri} , the dependence of FL3 fraction on $M_{BC}/PM_{0.8}$ gradually became weaker 264 and finally turned to negative at $I_{cri} > 40$ a.u.. The results at 5-15 µm were consistent with 265 266 our hypothesis that bioaerosols have stronger fluorescence intensity than combustionrelated aerosol particles and can be discriminated from their fluorescence intensity. The 267 different correlation statistics of 1-2 µm and 2-5 µm may be explained by the different 268 269 abundance of bioaerosols and combustion-related aerosols at different size range. The 2-5 µm mode was dominated by bioaerosols, while the 1-2 µm mode was dominated by 270

combustion-related aerosol particles. Therefore there was no clear dependence on the selection of I_{cri} . Saari et al. (2015) reported that FAPs at 0.5-1.5 µm might be due to anthropogenic emissions such as biomass burning, while most fungal spores and pollen dominated the larger size range (Despr és et al., 2012). It is also possible that I_{cri} had a size dependence because different types of bioaerosols may dominate different size ranges.

By integrating the FAPs of different correlations with $M_{BC}/PM_{0.8}$, we retrieved the number concentrations of "non-combustion-related" (NCR) type particles (FAPs with $I_{FL3}>18$ a.u. at 2-5 µm and FAPs with $I_{FL3}>40$ a.u. at 5-15 µm) and "combustion-related" (CR) type particles (FAPs with $I_{FL3}>18$ a.u. at 1-2 µm and FAPs with $40\ge I_{FL3}>18$ a.u. at 5-15 µm). The mean number concentrations of NCR type and CR type particles were 0.64±0.46 cm⁻³ and 1.45±1.06 cm⁻³, respectively. The NCR type FAPs are likely bioaerosols.

284 In this study, we applied two methods to classify FAPs measured by WIBS, resulting in two non-combustion-types of particles: type C particles derived from 285 286 fluorescent spectral pattern analysis and NCR type particles derived from fluorescence intensity pattern analysis. As shown in Table 3, the mean number concentrations of type 287 C and NCR type particle were 0.66 cm^{-3} and 0.64 cm^{-3} , which were still higher than those 288 found in PBAPs-dominated regions like the Amazon (Huffman et al., 2012), Hyvtiälä 289 (Schumacher et al., 2013) and PdD (Gabey et al., 2013). This indicates that still a residual 290 291 of these non-combustion type particles may comprise other fluorescent constituents like mineral dusts (Miyakawa et al., 2015; Perring et al., 2015). 292

293 **4. Conclusions**

On-line measurements of FAPs have been performed in Nanjing by using WIBS in the autumn of 2013. Our results showed that the number concentrations of FAPs were $1\sim2$ order of magnitudes higher than those reported in the previous studies. The observed high values suggested that directly using FL1, FL2 and FL3 channels to index PBAPs is not suitable for polluted areas. The number fraction of FL1 showed strong correlation with $M_{BC}/PM_{0.8}$ (r=0.748), indicative of a strong bias by anthropogenic emissions. 300 In this study, we used two methods to classify the FAPs. According to the threshold 301 of each channel, FAPs were divided into 7 types. Number fraction of type C showed 302 negative correlation (r=-0.13) with $M_{\rm BC}/PM_{0.8}$, which might be more representative for bioaerosols. Meanwhile, on the basis of the FL3 fluorescent intensity and its correlations 303 with $M_{\rm BC}/PM_{0.8}$, FL3 fluorescent particles were divided into 2 types. Combustion-related 304 type particles seemed to dominate 1-2 µm, while the non-combustion-related type 305 particles, which concentrated in the size range of 2-5 µm and showed negative correlation 306 (r=-0.121) with $M_{BC}/PM_{0.8}$, might be originated from biological emissions. The number 307 concentrations of the identified two types of bioaerosols (0.66 cm⁻³ for type C particles 308 and 0.64 cm⁻³ for non-combustion-related type), however, were still higher than those 309 observed in clean background areas and previous study in Nanjing (Wei et al., 2015), 310 indicating they may also include some other fluorophores, such as dusts. 311

312 Our results suggested that fluorescence measurements in polluted areas are prone to interferences and uncertainty introduced by the anthropogenic emissions. Discrimination 313 of biological particles from FAPs still needs further development. Each fluorophore 314 species presents unique fluorescence spectrum, hence we can effectively distinguish 315 316 biological particles from other FAPs based on their specific EEM maps. Due to the 317 limitation of excitation and emission wavebands of WIBS, the development of a multiwavebands instrument is hence needed. Other methods such as the cluster analysis 318 (Robinson et al., 2013; Crawford et al., 2014; Crawford et al., 2015) also exhibited the 319 ability to differentiate various FAPs. Measuring additional particle properties such as size 320 321 and morphology will help ameliorate the interferences by providing additional 322 dimensions to distinguish fluorescent particles of different emission mechanisms.

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481 Tables

Short name	Description
PBAPs	Primary biological aerosol particles
FAPs	Fluorescent aerosol particles
FL1	Fluorescent detected in channel F1 280 (excitation at 280 nm, detection 310-400 nm)
FL2	Fluorescent detected in channel F2 280 (excitation at 280 nm, detection 420-650 nm)
FL3	Fluorescent detected in channel F2 370 (excitation at 370 nm, detection 420-650 nm)
Type A	Fluorescent particle signal in channel FL1 only
Type B	Fluorescent particle signal in channel FL2 only
Type C	Fluorescent particle signal in channel FL3 only
Type AB	Fluorescent particle signal in channels FL1 and FL2
Type AC	Fluorescent particle signal in channels FL1 and FL3
Type BC	Fluorescent particle signal in channels FL2 and FL3
Type ABC	Fluorescent particle signal in channels FL1, FL2 and FL3
N_{x}	Number concentration of each type particles
F_{x}	Number fraction of each type particles
$M_{ m BC}$	Mass concentration of black carbon
$PM_{0.8}$	Mass concentration of particles in the size range of 0.006-0.8 μ m
$D_{ m o}$	Particle optical equivalent diameter
a.u.	Arbitrary units

Table 1. Definition of abbreviations used in the text.

1			1					
Site Location	Site Category	Season	$N_{ m FL1}$	$N_{ m FL2}$	$N_{\rm FL3}$	$N_{\rm FAPs}$	References	
Nanjing, China	sub-urban	autumn	570 (4.6)	3350 (25.3)	2090 (15.6)	-	This study	
Manchester, UK	urban	winter	29 (2.1)	52 (3.7)	110 (7.8)	-	(Gabey et al., 2011)	
Puy de Dôme mountain, France	high-altitude	summer	12 (4.4)	-	95 (35.2)	-	(Gabey et al., 2013)	
Killarney, Ireland	rural	summer	175 (0.5)	95 (0.3)	35 (0.1)	$15(0.05)^{a}$	(Healy et al., 2014)	
Borneo, Malaysis	rainforest	summer	-	-	-	150 ^b	(Gabey et al., 2010)	
Karlsruhe, Germany	semi-rural	one year	-	-	-	31 (7.3) ^b	(Toprak and Schnaiter, 2013)	
Amazon, Brazil	rainforest	spring	-	-	-	93 (26.3) ^a	(Huffman et al., 2012)	
Mainz, Germany	semi-urban	summer, autumn, winter	-	-	-	27 (4) ^a	(Huffman et al., 2010)	
Helsinki, Finland	urban	summer	-	-	-	13 (8) ^a	(Saari et al., 2015)	
		spring	-	-	-	15 (4.4) ^a		
Huuti äl ä Einland	boreal forest	summer	-	-	-	46 (13) ^a	$(\mathbf{S}_{abumaabar} \text{ at al} 2012)$	
Hyyu a a, Filland		autumn	-	-	-	27 (9.8) ^a	(Schumacher et al., 2013)	
		winter	-	-	-	$4(1.1)^{a}$		
	rural	spring	-	-	-	15 (2.5) ^a	(Solumopher et al. 2012)	
Colorado USA		summer	-	-	-	30 (8.8) ^a		
Colorado, USA		autumn	-	-	-	17 (5.7) ^a	(Schumacher et al., 2013)	
		winter	-	-	-	5.3 (3) ^a		
Ghats, India	high-altitude	summer				$20(2)^{a}$	(Valsan et al., 2016)	

484 **Table 2.** Comparisons between the results of this study and previous studies. Unit for the number concentration of fluorescent 485 particles is L^{-1} . Numbers in brackets are the number fractions of fluorescent particles (%).

a: results of UV-APS;

487 b: combine with FL1 and FL3 channel

Table 3. Integrated number concentrations (cm⁻³) of each FAPs and fractions (%) of
FAPs number concentrations to the total particle number concentration. Type AC is not
listed.

Category	25th Percentile	Mean	Median	75th Percentile	Standard Deviation	Fraction
Type A	0.03	0.05	0.04	0.06	0.03	0.45
Type B	0.79	1.77	1.42	2.55	1.27	12.95
Type C	0.23	0.66	0.43	0.95	0.55	4.40
Type AB	0.07	0.15	0.11	0.18	0.12	1.20
Type BC	0.52	1.06	0.87	1.51	0.73	8.26
Type ABC	0.17	0.37	0.28	0.43	0.31	2.91
CR type	0.63	1.45	1.10	2.11	1.06	10.50
NCR type	0.32	0.64	0.54	0.83	0.46	4.69



Figure 1. Time series of $M_{BC}/PM_{0.8}$ (gray line, right axis), number concentration of fluorescent particles in each channel (primary left axis) and relative number fractions of fluorescent particles in each channel (secondary left axis). (a) FL1 channel, N_{FL1} , crimson line, F_{FL1} , orchid line. (b) FL2 channel, N_{FL2} , navy line F_{FL2} , cornflower blue line. (c) FL3 channel, N_{FL3} , olive line F_{FL3} , lime line. r is the correlation coefficient between F_x and $M_{BC}/PM_{0.8}$.



Figure 2. (a) Normalized fluorescence emission spectra of two fluorescent compounds: I (black line, biological material) and II (red line, non-biological material) for excitation wavelengths at λ_{ex} =280 nm. Shadow areas indicate the excitation wavebands of FL1 and FL2 channels of WIBS. (b) Integrated fluorescence intensity of two compounds in two bands (FL1 and FL2). (c) The ratio of fluorescence intensity from different WIBS channels (I_{FL1}/I_{FL2}) of I and II compounds. The fluorescence emission spectra are obtained from Pöhlker et al. (2012).



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511 Figure 3. Spectral pattern of the classified fluorescence intensity. FL1 intensity is grouped at 100 intervals, FL2 intensity is grouped at 80 intervals and FL3 intensity is 512 513 grouped at 18 intervals. Color scale is measured particle number. None fluorescent and 514 saturating (FL \geq 2000 a.u.) aerosol particles were excluded. (a) FL1 intensity versus FL2 intensity of total measured particles; (b) FL2 intensity versus FL3 intensity of g3 type 515 particles; (c) FL2 intensity versus FL3 intensity of g4 type particles; (d) Numbers of g1 516 and g2 type particles of FL3 fluorescence intensity. Because FL2 intensity of g1 and g2 517 are below the threshold, the spectral patterns are hence not used. Dotted lines denote the 518 519 threshold of each channel (200 a.u. for FL1, 80 a.u. for FL2 and 18 a.u. for FL3). 520



Figure 4. Time series of (a) the fractional contributions of each fluorescent type to the total FAPs and (b) number concentration (left axis) of each fluorescent type and $M_{\rm BC}/PM_{0.8}$ (gray line, right axis). Red color indicate type A, blue color indicate type B, dark yellow indicate type C, green color indicate type AB, pink color indicate type AC, purple color indicate type BC, light blue color indicate type ABC.



Figure 5. Diurnal variations of number concentrations of (a) type A, red, (b) type B, blue,
(c) type C, dark yellow, (d) type AB, green, (e) type BC, purple and (f) type ABC, light
blue. Gray line indicates the number fraction of respective fluorescent particles (right
axis). Shading indicates ± one standard deviation.



Figure 6. Mean number size distributions of (a) type A (red), type AB (green), type AC
(pink) and type ABC (light blue); (b) type B (blue), type BC (purple) and type C (dark
yellow).



Figure 7. Time series of number fractions of various fluorescent particles (left axis) and $M_{\rm BC}/PM_{0.8}$ (gray line, right axis). r is the correlation coefficient between $F_{\rm x}$ and $M_{\rm BC}/PM_{0.8}$.



Figure 8. Correlations of FL3 fractions with $M_{BC}/PM_{0.8}$ in different size ranges. FL3 fraction is the number concentration of the subgroup ratio to the number concentration of total particles in each size bin. (a) Low fluorescent intensity group. (b) High fluorescent intensity group. The color lines represent the FL3 intensity (I_{FL3}) above the certain I_{cri} .