| Hygroscopic properties and CCN activity of atmospheric aerosols under |
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| the influences of Asian continental outflow and new particle formation at a |
| coastal site in East Asia |
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1 Abstract

2 The chemical composition of fine particulate matters (PM_{2.5}), the size distribution and number 3 concentration of aerosol particles (N_{CN}) and the number concentration of cloud condensation 4 nuclei (N_{CCN}) were measured at the northern tip of Taiwan Island during an intensive 5 observation experiment from April 2017 to March 2018. The parameters of aerosol hygroscopicity (i.e. activation ratio, activation diameter and kappa of CCN) were retrieved 6 7 from the measurements. Significant variations were found in the hygroscopicity of aerosols (κ : 8 0.18 - 0.56 for SS: 0.12 -0.80 %), which were subject to various pollution sources, including 9 aged air pollutants originating in the eastern/northern China and transported by the Asian 10 continental outflows, fresh particles emitted from local sources and distributed by land-sea 11 breeze circulations as well as produced by new particle formation (NPF) processes. Cluster 12 analysis was applied to the backward trajectories of air masses to investigate their respective source regions. The results showed that aerosols associated with Asian continental outflows 13 were characterized with lower N_{CN} and N_{CCN}, and with higher kappa of CCN, whereas higher 14 N_{CN} and N_{CCN} with lower kappa of CCN were observed in the aerosols associated with local 15 16 air masses. Besides, it was revealed that the kappa of CCN exhibited a decrease during the early stage of a new particle formation event, and turned to an increasing trend over the later 17 18 period. The distinct features in the hygroscopicity of aerosols were found to be consistent with the characteristics in the chemical composition of PM_{2.5}. This study has depicted a clear 19 20 seasonal characteristic of hygroscopicity and CCN activity under the influences of a complex 21 mixture of pollutants from different regional and/or local pollution sources. Nevertheless, the 22 mixing state and chemical composition of the aerosols critically influence the aerosol hygroscopicity and further investigations are necessary to elucidate the atmospheric processing 23 24 involved in the CCN activation in coastal areas.

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26 Keywords: Cloud condensation nuclei, Asian continental outflows, aerosol hygroscopicity,

27 kappa of CCN

1 **1. Introduction**

2 Aerosols suspended in the atmosphere allow condensation of water vapor under certain super-3 saturation conditions and subsequently evolve into cloud droplets. Activation of cloud 4 condensation nuclei (CCN) depends on the size and chemical composition of aerosol particles, 5 as well as on the meteorological conditions (i.e. water vapor supersaturation (SS), and uplift force for air parcels) (Seinfeld and Pandis 1998). Among the chemical and physical properties 6 7 of aerosols, hygroscopicity plays critical roles in the complex aerosol-cloud interactions 8 (McFiggans et al., 2006; Lee et al., 2010). Atmospheric aerosols are a mixture of different 9 chemical species rather than a single compound and exist in various size ranges and mixing 10 states. A single parameter called kappa (κ) has been developed to evaluate hygroscopicity of 11 aerosols, which represents a scaled volume fraction of soluble materials in particles and 12 provides a theoretical framework to derive bulk hygroscopicity for aerosols with internal 13 mixtures (Petters and Kreidenweis, 2007). However, while the hygroscopicity and CCN activity of a single component can be characterized in laboratories, the properties of their 14 15 mixture in ambient air are difficult to estimate owing to the complexity in physiochemical 16 characteristics of aerosols. Thus, field investigations have been conducted to study aerosol 17 hygroscopicity and CCN activity in various environmental settings including rural, urban, 18 forest and marine boundary layer (Ehn et al., 2007; Massling et al., 2007; Gunthe et al., 2009; 19 Wu et al., 2016; Schmale et al., 2017; Park et al., 2018). Furthermore, in-situ measurements of 20 physicochemical properties of aerosols and CCN in critical geographical areas in climate 21 system could provide a means of constraining representation of relevant schemes in global 22 climate models (Khairoutdinov and Randall, 2001; Morales and Nenes, 2014; Seinfeld et al., 23 2016).

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25 Due to the rapid industrialization and economic development in the East Asia (EA) during the 26 past few decades, the EA has become one of the most polluted regions in the world where 27 significant amount of particulate matters (PM) and their precursors were emitted (Streets et al., 2003; Dentener et al., 2006; Zhang et al., 2009). Taiwan is located in the downwind area of the 28 29 EA continental outflows, and thereby is influenced by the pollution outbreaks during the winter 30 monsoon seasons. Furthermore, the air quality in Taiwan is also known to be affected by the 31 photochemical production of secondary aerosols. The geographical location thus provides a strategic platform to investigate the CCN activation of aerosols influenced by a complex 32 33 mixture of pollutants (Chou et al., 2005, 2017; Chang et al., 2010; Cheung et al., 2013, 2016; 34 Li et al., 2016; Lee et al., 2019). Cheung et al. (2013) reported that new particle formation

(NPF) events occurred frequently during summertime in Taiwan, where the number 1 2 concentration of nucleation mode particles formed from photochemical reactions was nearly 3 ten-fold of that attributed to local primary pollution, indicating the critical impact of NPF on 4 particle concentration. Previous studies suggested that the freshly formed particles could 5 further grow into larger particles by up-taking condensable vapors (i.e. organic and sulfuric vapors) and increased CCN concentration (Merikanto et al., 2009; Pierce et al., 2012); however, 6 7 the detailed processes were not clear yet. To date, most of the studies upon CCN and its 8 interaction with NPF have been conducted in Europe and North America, whereas only a few 9 studies with 1-3 months measurement periods in East Asia were available despite the frequent 10 NPF observed in this region (Yue et al., 2011; Leng et al., 2014; Ma et al., 2016). In order to 11 investigate the hygroscopicity and CCN activity of the aerosols with a complex pollution 12 sources and aging processes, a one-year observation study on characteristics of aerosols and CCN was conducted in the northern Taiwan. The aim of this study was to characterize the 13 14 variations in aerosol hygroscopicity and CCN activity under the influences of continental 15 outflows and new particle formation during different seasons.

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17 2. Methodology

18 2.1 Observation site and instrumentation

19 A field study was conducted at the Cape Fuguei Research Station (named CAFÉ, 25.30°N, 20 121.54°E, 10 m a.s.l.) located at the northern tip of Taiwan Island (see Figure 1 for map) from 21 1 April 2017 to 31 March 2018. The air quality in northern Taiwan exhibited significant 22 seasonal variations, depending on the origins of polluted air masses. The EA continental pollution outbreaks dominated during the seasons of winter monsoons, whereas local pollution 23 24 associated with southerly flows affected the study site, particularly during summer (Chou et al., 25 2017). Therefore, this station provides an ideal platform for studies on the aerosol 26 hygroscopicity and CCN activity under the influences of various pollution sources. Further 27 detailed information of the site description of CAFÉ station is referred to Chou et al. (2017).

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The aerosol sampling inlets were located at the rooftop of the station and ambient air was drawn into the instruments through conductive tubing. **Figure 2** illustrates the schematic of aerosol sampling. Two inlets were deployed for aerosol sampling and were equipped with diffusion dryers filled with silica gel to reduce RH. One of the inlets was for particle size distribution measurement (13-736 nm), which was carried out by a scanning mobility particle sizer (SMPS, TSI Inc.). The SMPS system consisted of an electrostatic classifier (TSI 3080) with long-

1 differential mobility analyzer (TSI 3081) and a water-based condensation particle counter 2 (WCPC, TSI 3786). The sheath and sample flow rates were 3 and 0.6 lpm, respectively, and 3 the sample time interval was 5 minutes. The accuracy of particle sizing was checked using 4 polystyrene latex spheres (PSLs). The nominal diameters of the PSLs were 97±3nm (Part#: 5 3100A, Thermo Scientific Inc.) and 240±5 nm (Part#: 3240A, Thermo Scientific Inc.). The averaged modes of the PSLs measured by the SMPS were found to be 100±2.1 and 232.9±0 6 7 nm, respectively, and the differences from the nominal diameters were within 3%. Multiple 8 charge and diffusion loss corrections were applied to the particle size distribution data using 9 the internal algorithm from the Aerosol Instrument Manager Software. Furthermore, diffusion 10 loss in sampling tube was corrected according to the algorithm proposed by Holman (1972). 11 The nucleation, Aitken and accumulation modes particle number concentrations were 12 represented by N_{30} (13 nm < d <= 30 nm), N_{30-100} (30 nm < d <= 100 nm) and $N_{100-736}$ (100 nm) 13 $< d \le 736$ nm), respectively.

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The sample air from another inlet split into two streams for the CCN (N_{CCN}) and total particle 15 16 number concentrations (N_{CN}) measurements, respectively, which were used to calculate the 17 CCN activation ratio (AR). The instruments for N_{CCN} and N_{CN} measurements were cloud 18 condensation nuclei counter (CCNC-100, DMT Inc.) and butanol-based condensation particle 19 counter (BCPC 3022, TSI Inc.). The calibrated super-saturation (SS) condition setting of the 20 CCN counter was periodically changed from 0.12±0.044, 0.28±0.015, 0.54±0.002 to 0.80±0.067% with time interval of 21, 13, 13, and 13 minutes (a total of 1 hour for each cycle). 21 22 Since the CCNC needs several minutes to stable after changing the SS setting, therefore only 23 the last 5-minute data were used for kappa calculation. The flow rates for the CCNC and BCPC 24 instruments were 0.5 and 0.3 lpm, respectively, which were checked routinely during sampling 25 periods by the DryCal flow calibrator (Defender 520, Mesa Labs Inc.). The flow ratio between 26 sheath and sample flow of CCNC was maintained at 10 ± 0.3 .

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The SS calibration of CCN counter was conducted using ammonium sulfate particles at the start, middle and end of the campaign. Since the counting efficiencies of CCNC were lower than CPC, thus the maximum activated fraction of N_{CCN}/N_{CN} would be smaller than 1. Therefore, the activation diameters used to calculate the SS values were determined by using half of maximum activated fraction of N_{CCN}/N_{CN} (Rose et al. 2010). The operation of the DMT CCNC adopted in this study is referred to Lance et al. (2006). It should be noted that the CCNC malfunctioned from Aug 2017, and sampling was resumed from Oct 2017. Hence, data was not 1 available during that period.

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3 PM_{2.5} samples were collected by two sequential sampling systems (PNS 18-3.1DM, Comde-4 Derenda GmbH) and both samplers were equipped with PM_{2.5} sharp cut cyclone with 16.7 lpm 5 sampling flow rate. One sampler was equipped with Teflon filters which were used for the analysis of soluble ions (i.e. Na⁺, NH₄⁺, K⁺, Mg²⁺, Ca²⁺, Cl⁻, NO₃⁻, SO₄²⁻) using ion 6 7 chromatograph (IC). Another sampler was equipped with quartz filters which were used for 8 analysis of carbonaceous components (i.e. organic carbon, OC, and elemental carbon, EC) using a DRI-20001A carbonaceous aerosol analyzer with IMPROVE-A protocol (Chow et al., 9 10 2007). Details of the in-lab analysis are as described previously (Salvador and Chou, 2014). The sampling duration of each sample set was from 08:00 to 08:00LT (24h), and in total 282 11 12 samples were collected during the entire sampling period. Moreover, to assist the data interpretation, the hourly average mass concentration of PM_{2.5}, the mixing ratio of trace gases 13 (i.e. CO, O₃, SO₂ and NO₂) and the meteorological parameters (i.e. wind direction/speed) 14 15 reported from the air quality station of Taiwan EPA that collocated with the CAFÉ station were 16 analyzed in this study.

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18 2.2 Data processing and analysis for aerosol hygroscopicity

Firstly, the N_{CCN} and N_{CN} data were synchronized into 5-minute averages which matched the time interval for PSD data measured by SMPS. The CCN activation ratio (AR), i.e. the ratio of N_{CCN} to N_{CN} , was calculated for a given SS condition. Assuming that the particles were a homogeneous internal mixture, that large particles were activated first, and that the number of particles out of the measured particle size range was negligible in N_{CCN} , the cut-off diameter (D_{cut}) required for the CCN activation with the AR was calculated from equation (1) (Hung et al., 2014).

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$$AR = \frac{N_{CCN}}{N_{CN}} = \frac{\int_{D_{cut}}^{D_f} n(D) dlnD}{\int_{D_i}^{D_f} n(D) dlnD}$$
(1)

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The corresponding kappa (κ_{cut}) was then calculated by equation (2), which represents the effective average hygroscopicity of CCN-active particles in the size range above D_{cut} (Rose et al. 2010).

$$s = \frac{D_{wet}^3 - D^3}{D_{wet}^3 - D^3 (1 - \kappa)} \exp\left(\frac{4\sigma_{sol}M_W}{RT\rho_W D_{wet}}\right)$$
(2)

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4 K was determined by inserting the D_{cut} for D and varying both K and the droplet diameter D_{wet} 5 until the saturation ratio s was equivalent at the same time to the prescribed supersaturation S 6 and to the maximum of a Kohler model curve of CCN activation. Where S is the water saturation (= SS + 1), $\sigma_{S/W}$ is the solution surface tension (0.072 J m⁻²), ρ_W is the water density 7 (997 kg m⁻³), M_W is the molecular weight of water (0.018 kg mole⁻¹), R is the universal gas 8 constant (8.314 J K⁻¹ mole⁻¹) and T is 298.15 K. It should be noted that the kappa value 9 10 calculated by the cut-off diameter is an alternative approach by using integrated CCN concentration measurements of polydisperse aerosols and should be used with caution when 11 12 comparing with the kappa values obtained by alternative approaches such as size-resolved CCN measurement in which aerosols are not poly-dispersed. 13

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The kappa value is used to describe the hygroscopicity of the aerosols; for example, ammonium 15 16 nitrate and ammonium sulfate have kappa values of 0.67 and 0.61, respectively, whereas it is ~ 17 0.1-0.2 for organic species (Petters and Kreidenweis, 2007). To remove the outliers in kappa 18 data, we defined an outlier by values larger or smaller than 1.5 inter-quarter range (IQR) as 19 following:

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- 21 22

$$Q1 - 1.5 IQR \text{ or } Q3 + 1.5 IQR$$
 (4)

23 where Q1 and Q3 are first and third quarterly of kappa data, and IQR is Q3 minus Q1. About 24 12% of data point has been removed according to eq. (4).

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26 2.3 Back-trajectories cluster analysis

27 Five-day backward trajectories of air masses were calculated every 4 hours using the Hybrid 28 Single-Particle Lagrangian Integrated Trajectory (HYSPLIT) model of NOAA (National 29 Oceanic and Atmospheric Administration) for the entire sampling period (Stein et al., 2015). 30 The meteorological data used in the model were the 6-hourly Global Data Assimilation System (GDAS) archived data with a resolution of 0.5 degree in longitude and latitude. The end-point 31 of the trajectories was 200 m above ground level at the CAFÉ station. Cluster analysis was 32 then used to group trajectories into 5 clusters (see Figure 3). The air masses of Clusters 1, 2 33

1 and 4 were associated with Asian continental outflows induced by the high pressure system 2 during autumn to spring seasons. The air-mass members of both Clusters 1 and 2 were 3 originating in the inlands of the Asian continent, but the movement of Cluster 2 air masses was 4 faster and from higher altitudes. Air masses in Cluster 4 were also induced by high pressure 5 system but were moving slowly toward the Pacific Ocean and along marine boundary before reaching CAFÉ station. In contrast, Clusters 3 and 5 include air masses originating in the 6 7 Pacific areas and passing through Taiwan Island during warm seasons. The occurrence 8 frequency of each cluster is listed in Table 1. The implications of origins and trajectories of air 9 masses for CCN activation will be discussed in details in Section 3.2.

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11 **3.** Results and discussion

In the followings, we first present the overall statistics of aerosol hygroscopicity and CCN activity, and the seasonal and diurnal variations. Then, the features in aerosol hygroscopicity for respective air mass clusters are depicted. Finally, the implications of NPF for CCN activity will be discussed.

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17 *3.1. Overall statistics for seasonal and diurnal variations of aerosol hygroscopicity*

18 Statistics for the number concentration of cloud condensation nuclei (N_{CCN}) and total particles 19 (N_{CN}) as well as for the activation ratio (AR), activation diameter (D_{cut}) and kappa (κ) values 20 under specific SS conditions are summarized in Table 2. The median N_{CCN} ranged from 820 to 1880 cm⁻³ for SS = 0.12 - 0.80 %. The median κ values calculated for the sampling period 21 22 ranged from 0.18 to 0.56 (SS = 0.12 - 0.80 %), which exhibited larger variations than that 23 reported from coastal sites in Hong Kong (κ : 0.28 – 0.39 for SS: 0.15 – 0.70%, Meng et al. 24 2014) and in Noto Peninsula, Japan (κ : 0.19 – 0.37 for SS: 0.13 – 0.81%, Iwamoto et al. 2016), 25 as well as from the Asian rainforest sites at Bukit Atur, Malaysia (K: 0.05-0.37 for SS: 0.11-26 0.73%, Irwin et al. 2011). Schmale et al. (2018) summarized the results of CCN measurements 27 reported from 12 sites on 3 continents. The standardized κ values at SS of 0.5 % were found to 28 be 0.48, 0.41, 0.55, and 0.30 for rural background, alpine, coastal background, and urban 29 environmental settings, respectively. The estimated κ value at SS of 0.5 % was 0.35 for this 30 study, which was significantly lower than that for coastal background and was more similar to 31 that of urban aerosols.

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The larger variations of κ values measured at CAFÉ station compared to the results of the coastal studies at Hong Kong and Noto Peninsula Japan (Meng et al., 2014, Iwamoto et al.,

1 2016) may be attributed to the shorter periods of measurements in these two studies which 2 lasted for only 1 month in May and October, respectively, while the present study lasted for 1 3 year and thereby was subject to seasonal variations. Moreover, the κ values reported in these 4 previous Asian studies were derived by size-resolved CCN data which represent the average 5 hygroscopicity of the activated aerosols around the activation diameter (D_a), while the kappa was calculated by D_{cut} in this study which represent the average hygroscopic of the aerosols 6 above the size of D_{cut}. Nevertheless, the aerosol composition at CAFÉ station are frequently 7 8 influenced by local pollution from urban region and regional pollution associated with winter 9 monsoons through different seasons, as indicated in previous studies (Chou et al., 2008, 2010, 10 2017), hence this explains the larger variations in κ values observed in this study. The 11 implications of air mass history for aerosol hygroscopicity will be discussed in Section 3.2.

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13 It is noteworthy that both the κ and D_{cut} decrease with the increase of SS. This could be due to 14 the differences in the chemical composition of the aerosols for different size ranges, with less hygroscopic species in smaller particles and more hygroscopic species in larger ones. While 15 16 the SS increases, smaller and less hygroscopic particles have had got activated in the CCNC. 17 Consequently, a smaller κ is retrieved as the cut-off diameter is adopted in the calculation (Rose 18 et al., 2008). Previous studies on size-resolved chemical composition of PM_{2.5} at northern 19 Taiwan reported that the size distribution of aliphatic carbons peaked at 0.12-0.15 µm and 0.62-20 0.87 µm while that for carbonyl carbons peaked only at 0.6-0.64 µm (Chou et al., 2005). 21 Cheung et al. (2016) showed that the ultra-fine particles (i.e. d < 100 nm) collected from Taipei 22 City, an urban site in northern Taiwan, consisted mostly of organic matters. Moreover, Salvador et al. (2016) revealed that low-molecular-weight organic acids were abundant in the submicron 23 24 aerosols in Taipei, Taiwan. In this context, the low hygroscopicity of small aerosols found in 25 this study is consistent with the results of investigations upon aerosol chemical composition.

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27 Figure 4 illustrates the monthly median of N_{CCN}, κ and D_{cut} under different SS conditions and N_{CN} for the entire campaign period. Distinct seasonal variations were observed in the 28 29 measurements. Elevated levels of N_{CN} and N_{CCN} were observed in April (spring time) and July 2017 (summer time) (median N_{CN}: 4960-5650 cm⁻³, median N_{CCN} 750-1060 cm⁻³ at SS:0.12, 30 to 2690-2930 cm⁻³ at SS:0.80%). During spring and summer of 2017, NPF events were 31 32 observed frequently which induced an elevated N_{CN} (maximum median: 5650 cm⁻³ in July 2017). The consistency in N_{CN} and N_{CCN} suggests that the particles generated by NPF processes 33 34 could have contributed significantly to the increases in N_{CCN}. On the other hand, according to 1 the κ values, more hygroscopic particles were observed in June and October 2017. The 2 variations of k values could be under the influences of several mechanisms. The EA continental 3 outflows affected the study site frequently in the seasons of EA winter monsoons, during which 4 more inorganic aerosols could have been transported to the study site. Strong surface winds of 5 winter monsoons could have also increased the production of sea salt particles around the 6 coastal site and, thereby, resulted in increases in the kappa values. In addition, up-taking 7 hygroscopic species during particle growth and coagulation processes may influence the 8 hygroscopicity of aerosols, which will be discussed in further details later on.

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10 Figure 5 depicts the variations in daily chemical composition of PM_{2.5}, where a higher fraction 11 of inorganic pollutants was found during Apr. - May 2017 and Feb. - Mar. 2018, whereas sea-12 salt (calculated by $1.47*[Na^+] + [Cl^-]$) elevated during Oct. 2017 – Jan. 2018. The seasonality 13 of aerosol composition was consistent with the long-term records of aerosol observation at this 14 site (Chou et al., 2017). Petters and Kreidenweis (2007) have estimated CCN-derived κ values 15 for inorganic and organic species, which showed that significantly higher κ values were found 16 for major inorganics species in aerosols, such as ammonium sulfate, ammonium nitrate, sodium 17 chloride (kappa: 0.61-1.28), while κ values for organic species were usually lower than 0.2. 18 Thus, relatively lower kappa values observed during Jul. – Aug. 2017 were consistent to the 19 PM_{2.5} chemical composition data in which a higher mass fraction of organic carbon was found. 20

21 3.2 Implications of different types of air masses

22 The air masses reaching this study site are known to be associated with the Asian continental 23 outflows and/or with local pollution in northern Taiwan (Cheung et al., 2016). Since CO has 24 longer atmospheric lifetime than NO₂, a higher $\Delta CO/\Delta NO_2$ can be used to indicate influences 25 of aged regional air pollutants. The averaged median $\Delta CO/\Delta NO_2$ ratios for the 5 trajectory clusters were 76, 75, 32, 60 and 33, respectively. A higher $\Delta CO/\Delta NO_2$ ratio was found in 26 27 Clusters 1, 2 and 4, whereas $\Delta CO/\Delta NO_2$ of Cluster 4 was found slightly lower than that of Cluster 1 and 2. This was attributed to the differences in air mass history; the air masses of 28 29 both Clusters 1 and 2 were originating in the inland areas of the Asian Continent, whereas the 30 air masses of Cluster 4 passed through the south of Korea and Japan and came from the east of CAFÉ station and, thereby, was occasionally impacted by some fresh emissions. The mixing 31 32 ratio of O_3 , a typical secondary pollutant, provided further information about the sources of air 33 plumes. The results showed that higher O₃ levels (43-46 ppb) were found in continental 34 outflows (i.e. Cluster 1, 2 and 4) as compared to those of marine air masses (i.e. 26-28 ppb for 1 Cluster 3 and 5).

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3 Furthermore, higher κ values were found for CCN transported with the continental outflows, 4 which ranged from 0.16 to 0.69 for SS of 0.12-0.80 %. On the contrary, lower κ values (0.11 -5 0.50) were found for the CCN in air mass of Clusters 3 and 5, which originated in the remote 6 Pacific region and passed through Taiwan Island during summertime. This result was 7 reasonable since aged polluted air masses contained more inorganic species (with higher k 8 values), while the organic species (with lower κ values) contributed a higher fraction to the 9 aerosol mass loading in urban areas of Taiwan (Chou et al., 2010, 2017). On the other hand, 10 higher N_{CCN} and N_{CN} were found in Clusters 3 and 5 compared to that in Clusters 1 and 2 (see Table 3). This could be due to the substantial production of new particles during warmer 11 12 seasons (Cheung et al., 2013, 2016).

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14 3.3 Implications of New Particle Formation

As described in Section 3.1, large variations in N_{CCN} and kappa values were found in summer 15 16 during which NPF events occurred frequently. A NPF event is defined as the increase of the 17 number concentration of nucleation mode particles, and those particles are growing into Aitken 18 and/or accumulation mode size ranges and last for a few hours until they disappear into the 19 atmospheric condensation/coagulation sinks (Dal Maso et al., 2005). In total 53 NPF events 20 were observed during the entire study period and among which 31 were observed in warm 21 months (from June to September 2017). Investigations reported that NPF occurred more 22 frequently during summer (34.6 - 42.8 %) and occasionally during spring (11.5 %) in urban areas of northern Taiwan (Cheung et al., 2013, 2016). Figure 6 illustrates the median particle 23 24 size distribution for NPF and non-NPF days as well as the quartiles. The particle number 25 concentration for NPF events was significantly higher than that for non-NPF case. In addition, 26 large variations were associated with the particle size range below 100 nm in NPF events, 27 suggesting that a large amount of ultra-fine particles formed.

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In **Figure 7**, diurnal variations in particle size distribution for NPF and non-NPF cases are presented along with the aerosol hygroscopic parameters D_{cut} , κ and AR at SS = 0.28 %. In the plot of particle size distribution for NPF events, a banana feature (growth of particle diameter indicated by the geometric mean diameter, GMD) is obviously illustrated, which is typical for NPF process (Dal Maso et al., 2005; Cheung et al., 2011), whereas relatively stable particle size distribution exhibits for non-NPF periods with the particles of 50-60 nm dominate 1 throughout a day. On NPF days, a nucleation burst as indicated by a surge in nucleation mode 2 particles (N₃₀, number concentration of particle size \leq 30 nm) from 06:00 to 10:00 LT is shown. 3 Note that the number concentration of Aitken mode particles (indicated by N_{30-100} , for particle 4 size between 30 to 100 nm) increases consistently, implying active coagulation for the period. 5 N_{CCN} starts to increase around 07:00 LT. Note that the increasing rate of N_{CN} is higher than that 6 of N_{CCN}, which in turn results in the decrease in AR. Note that the observed increase in CCN 7 accompanying with the growth of particles could be due to various mechanisms (e.g. vapor 8 condensed on existing sub-CCN, coagulation between CCNs, and other oxidation processes), 9 and the causes for the increase in CCN and the roles of NPF need to be further studied.

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11 It was revealed that the kappa values exhibited a decreasing trend at the early stage of a NPF 12 and turned to an increase from 0.32 to 0.44 during the later stage (as shown in Figure 7). 13 Similar increase of κ values during the particle growth period was observed in a suburban region of northern China (Li et al., 2017). The κ values reached ~ 0.4 after the growth process, 14 which was likely a result of a mixture of hygroscopic species like ammonium sulfate ($\kappa = 0.61$) 15 and organic matters ($\kappa = 0.1 - 0.2$). This was evidenced by the measurement of chemical 16 17 composition as shown in Figure 5, where the PM_{2.5} was composed mostly of sulfate and 18 organics, particularly during the warm months with frequent NPF events. Note that the 19 chemical composition of ultrafine particles at urban Taipei was dominated by organic matters 20 (Cheung et al., 2016), which generally has lower κ values. Therefore, our results indicated that 21 these "growing" particles were consisted of a mixture of sulfate and organic matters, which 22 evidenced the influences of local (e.g. particles from vehicles emissions) and regional pollution (e.g. aged sulfate particles). In contrast, the increases in kappa during the later NPF course 23 24 suggested that the "new CCN" were dominated by hygroscopic species. The field studies at 25 North China Plain found two types of NPF events (Yue et al., 2010, Ma et al. 2016), including 26 sulfur-rich NPF, i.e., condensation and neutralization of sulfuric acid contributed most to the 27 growth of the new particles with high particle hygroscopicity, and sulfur-poor NPF, i.e., 28 condensation of organic compounds had a higher contribution to the growth with a lower 29 particle hygroscopicity. Indeed, our results showed that the NPF events in northern Taiwan 30 were characterized by elevated levels in both sulfur and organic matters (as shown in Figure 31 5). In particular, the submicron particles in northern Taiwan were known to be enriched in 32 sulfate (Cheung et al., 2016) and organic acids (Salvador et al., 2016).

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1 4. Conclusion

2 This study presents the observation of aerosol hygroscopicity parameters, including κ , 3 activation diameter (D_{cut}) and activation ratio (AR = N_{CCN}/N_{CN}) of CCN at a coastal research 4 station (CAFÉ) in northern Taiwan during a 1-year campaign from April 2017 to March 2018. 5 The parameters exhibited distinct seasonal variations. High levels of N_{CN} and N_{CCN} were 6 consistently observed in spring and summer, whereas kappa elevated in autumn and exhibited 7 minimal in summer. Measurements of the chemical composition of PM_{2.5} and cluster analysis 8 of the backward trajectories were deployed to elucidate the seasonality observed in the 9 hygroscopicity of aerosols. The results of this study indicated that aerosols associated with 10 Asian continental outflows contained more inorganic species and thereby were characterized 11 with higher κ values, as comparing to those associated with local urban pollution which 12 consisted substantially of organic matters.

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14 The higher levels of N_{CCN} and N_{CN} found in spring and summer were attributed mainly to the NPF events occurred frequently during warm months. Moreover, it was found that the kappa 15 16 of CCN exhibited a decrease at the early stage of a NPF and turned to an increasing trend during 17 the later period. A two-stage hypothesis was proposed according to the results of this study for 18 the implications of NPF for CCN activity. At the early stage of a NPF event, new particles 19 formed and resulted in increases in N₃₀ and thereby N_{CN}, which was followed immediately by 20 increases in the number density of Aiken mode particles (N_{30-100}). The newly formed particles were composed mostly of organic matters, which could have "diluted" the hygroscopicity of 21 22 preexisting CCN by coagulation and resulted in the decrease in kappa. In the later stage of the NPF event, as the preexisting sub-CCN particles grew up to the size of CCN, kappa got 23 24 increased because the sub-CCN particles were consisted mostly of highly hygroscopic 25 components.

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The seasonal characteristics of hygroscopicity and CCN activity under the influences of a complex mixture of pollutants from different regional and/or local pollution sources have been presented in this study, and the impacts of NPF was demonstrated. Nevertheless, the mixing state and chemical composition of the aerosols, in particular the organic content of the sea spray aerosols, would critically influence the aerosol hygroscopicity in coastal areas. Hence further investigations are warranted to understand the atmospheric processing involved in the CCN activation which would in turn affect cloud formation and the regional climate.

1 Author contributions

HC Cheung performed the instrumentation and data analysis. CCK Chou initiated the research
program, led the research team and was in charge of the chemical analysis. CSL Lee
participated in scientific discussions and writing of this manuscript. WC Kuo conducted data
analysis for CCN. SC Chang was in charge of the operation of the air quality station of Taiwan
EPA. HC Cheung prepared the manuscript with contributions from all co-authors.

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Table 1. Statistics on the occurrence of respective air mass clusters for each month during the

- 2 study period.

| Manth | Cluster 1 | | Cl | Cluster 2 | | Cluster 3 | | Cluster 4 | | Cluster 5 | | Undefined | |
|----------|-----------|---------|-------|-----------|-------|-----------|-------|-----------|-------|-----------|-------|-----------|--|
| Month | n (%) | | n (%) | | n (%) | | n (%) | | n (%) | | n (%) | | |
| 17-Apr | 66 | (36.7%) | 17 | (9.4%) | 20 | (11.1%) | 43 | (23.9%) | 34 | (18.9%) | 0 | (0.0%) | |
| 17-May | 30 | (16.1%) | 12 | (6.5%) | 18 | (9.7%) | 95 | (51.1%) | 31 | (16.7%) | 0 | (0.0%) | |
| 17-Jun | 10 | (5.6%) | 0 | (0.0%) | 105 | (58.3%) | 43 | (23.9%) | 22 | (12.2%) | 0 | (0.0%) | |
| 17-Jul | 0 | (0.0%) | 0 | (0.0%) | 26 | (14.0%) | 3 | (1.6%) | 157 | (84.4%) | 0 | (0.0%) | |
| 17-Aug | 0 | (0.0%) | 4 | (2.2%) | 129 | (69.4%) | 20 | (10.8%) | 33 | (17.7%) | 0 | (0.0%) | |
| 17-Sep | 50 | (27.8%) | 12 | (6.7%) | 26 | (14.4%) | 24 | (13.3%) | 68 | (37.8%) | 0 | (0.0%) | |
| 17-Oct | 96 | (51.6%) | 31 | (16.7%) | 1 | (0.5%) | 41 | (22.0%) | 14 | (7.5%) | 3 | (1.6%) | |
| 17-Nov | 96 | (53.3%) | 42 | (23.3%) | 2 | (1.1%) | 39 | (21.7%) | 0 | (0.0%) | 1 | (0.6%) | |
| 17-Dec | 88 | (47.3%) | 84 | (45.2%) | 0 | (0.0%) | 9 | (4.8%) | 0 | (0.0%) | 5 | (2.7%) | |
| 18-Jan | 77 | (41.4%) | 77 | (41.4%) | 7 | (3.8%) | 21 | (11.3%) | 0 | (0.0%) | 4 | (2.2%) | |
| 18-Feb | 90 | (53.6%) | 50 | (29.8%) | 3 | (1.8%) | 25 | (14.9%) | 0 | (0.0%) | 0 | (0.0%) | |
| 18-Mar | 58 | (31.2%) | 38 | (20.4%) | 16 | (8.6%) | 65 | (34.9%) | 6 | (3.2%) | 3 | (1.6%) | |
| All data | 661 | (30.2%) | 367 | (16.8%) | 353 | (16.1%) | 428 | (19.5%) | 365 | (16.7%) | 16 | (0.7%) | |

- 1 Table 2. Statistics for the number concentrations of cloud condensation nuclei (N_{CCN}) and
- 2 total particles (N_{CN}), kappa value (κ), activation diameter (D_{cut}) and activation ratio (AR)

| | SS(%) | Median | 1Q | 3Q | |
|-------------------------------------|--------------|--------|------|-------|--|
| | 0.12 | 819 | 529 | 1205 | |
| | 0.28 | 1202 | 715 | 1770 | |
| $N_{\rm CCN}$ (cm ⁻³) | 0.54 | 1689 | 1013 | 2497 | |
| | 0.8 | 1884 | 1161 | 2796 | |
| N _{CN} (cm ⁻³) | | 2880 | 1830 | 4690 | |
| | 0.12 | 0.56 | 0.40 | 0.78 | |
| | 0.28 | 0.42 | 0.27 | 0.58 | |
| К | 0.54 | 0.22 | 0.11 | 0.42 | |
| | 0.8 | 0.18 | 0.11 | 0.29 | |
| | 0.12 | 110.9 | 99.1 | 122.2 | |
| D () | 0.28 | 73.8 | 65.7 | 84.2 | |
| D _{cut} (nm) | 0.54 | 53.7 | 47.3 | 61.9 | |
| | 0.8 | 47.6 | 42.1 | 55.6 | |
| | 0.12 | 0.22 | 0.13 | 0.32 | |
| A D | 0.28 | 0.41 | 0.28 | 0.52 | |
| АК | 0.54 | 0.59 | 0.44 | 0.69 | |
| | 0.8 | 0.66 | 0.51 | 0.76 | |

3 under four different SS conditions during the study period.

4

Table 3. Statistics for the number concentration of cloud condensation nuclei (N_{CCN}), kappa value (κ), activation diameter (D_{cut}),
 activation ratio (AR), and concentrations of major air pollutants (i.e. CO, NO₂, O₃, and PM_{2.5}).

| 2 |
|----|
| -≺ |
| - |

| Parameters | | cl | uster 1 | cluster 2 | | cluster 3 | | cluster 4 | | cluster 5 | |
|---|--------------------------------------|-------|---------------|-----------|---------------|-----------|--------------|-----------|--------------|-----------|--------------|
| | N _{CCN} (cm ⁻³) | 910 | (600-1260) | 790 | (460-1000) | 820 | (590-1320) | 810 | (490-1230) | 790 | (560-1200) |
| SS: 0.12% | Карра | 0.69 | (0.50-0.99) | 0.57 | (0.36-1.03) | 0.5 | (0.42-0.65) | 0.56 | (0.36-0.76) | 0.49 | (0.37-0.63) |
| | D _{cut} | 112.2 | (100.4-120.5) | 113.9 | (106.4-122.9) | 108.1 | (99.2-118.1) | 114.1 | (97.6-124.6) | 106.7 | (97.2-116.4) |
| | AR | 0.3 | (0.17-0.42) | 0.31 | (0.21-0.38) | 0.19 | (0.10-0.27) | 0.22 | (0.16-0.29) | 0.17 | (0.11-0.24) |
| SS: 0.28% | NCCN (cm ⁻³) | 1140 | (680-1620) | 1030 | (700-1470) | 1370 | (910-2190) | 1150 | (650-1980) | 1540 | (950-2270) |
| | Карра | 0.46 | (0.27-0.59) | 0.4 | (0.20-0.59) | 0.39 | (0.31-0.52) | 0.4 | (0.27-0.56) | 0.42 | (0.28-0.55) |
| | Dcut | 70.9 | (64.6-82.1) | 70.8 | (62.9-81.8) | 78.7 | (71.7-84.8) | 74.9 | (67.8-85.9) | 76 | (69.5-87.2) |
| | AR | 0.44 | (0.33-0.55) | 0.46 | (0.36-0.57) | 0.33 | (0.21-0.49) | 0.42 | (0.31-0.52) | 0.3 | (0.21-0.43) |
| 55.0 5/0/ | N _{CCN} (cm ⁻³) | 1500 | (960-2130) | 1420 | (820-1970) | 2060 | (1550-3340) | 1540 | (910-2680) | 2420 | (1620-3470) |
| | Карра | 0.23 | (0.11-0.45) | 0.23 | (0.11-0.45) | 0.22 | (0.15-0.36) | 0.2 | (0.12-0.40) | 0.18 | (0.11-0.26) |
| 55. 0.5470 | D _{cut} | 53 | (46.6-59.5) | 51.7 | (46.2-59.8) | 55.6 | (50.1-61.8) | 55.5 | (48.3-65.9) | 56.7 | (50.3-66.2) |
| | AR | 0.61 | (0.48-0.70) | 0.61 | (0.50-0.69) | 0.55 | (0.30-0.67) | 0.58 | (0.46-0.70) | 0.48 | (0.34-0.63) |
| | N _{CCN} (cm ⁻³) | 1680 | (1110-2410) | 1530 | (970-2100) | 2440 | (1780-3490) | 1660 | (1060-3230) | 2860 | (1810-3950) |
| SS: 0.80% | Карра | 0.22 | (0.11-0.31) | 0.22 | (0.11-0.34) | 0.15 | (0.11-0.23) | 0.16 | (0.10-0.27) | 0.11 | (0.09-0.21) |
| 55. 0.00 /0 | D _{cut} | 46.1 | (41.7-52.5) | 46.6 | (40.7-52.7) | 47.7 | (43.6-53.2) | 48.9 | (43.0-59.0) | 49.5 | (42.6-59.8) |
| | AR | 0.68 | (0.56-0.75) | 0.68 | (0.54-0.76) | 0.62 | (0.46-0.75) | 0.65 | (0.55-0.77) | 0.55 | (0.43-0.69) |
| N _{CN} (cm ⁻³) | | 2460 | (1730-3730) | 2260 | (1400-3260) | 4770 | (3120-7410) | 2840 | (1830-5090) | 4920 | (3270-7620) |
| CO (ppb) | | 170 | (130-240) | 160 | (120-230) | 150 | (120-200) | 170 | (120-230) | 140 | (90-210) |
| NO ₂ (ppb) | | 2 | (1.2-3.9) | 1.8 | (1.1-3.5) | 4.3 | (1.9-7.2) | 2.4 | (1.2-4.6) | 3.3 | (1.7-6.3) |
| O ₃ (ppb) | | 46 | (38-56) | 45 | (36-50) | 26 | (16-39) | 43 | (28-54) | 28 | (19-41) |
| $PM_{2.5} (\mu g m^{-3})$ | | 13.2 | (9.2-21.1) | 11.6 | (7.5-18.7) | 10.5 | (6.2-15.6) | 14 | (7.4-22.8) | 11 | (5.9-21) |



Figure 1. The geographical location of CAFÉ research station (25.30°N 121.54°E), which is at

3 the northern tip of Taiwan Island in the East Asia. The digital map was provided by Center for

4 Space and Remote Sensing Research (CSRSR), National Central University, Taiwan.



Figure 2. Schematic diagram for $N_{\text{CN}},\,N_{\text{CCN}}$ and PSD measurements.



1 2 Figure 3. Cluster classification of 120h backward trajectories during measurement period (upper 3 panel) and air masses heights are shown in lower panel. Air masses with both clusters 1 and 2 4 originated in the inlands of the Asian Continent, but the movement of cluster 2 air masses was 5 faster and from higher elevation. Air masses in cluster 4 were pushed by high pressure system 6 towards the south of Korea and Japan, then moved along marine boundary slowly before reaching 7 CAFÉ station, while Cluster 3 and 5 represent air masses originated in the South China Sea and remote Pacific region, respectively. The digital map applied in this figure is provided by the 8 9 graphing software Igor Pro 6.37, WaveMetrics. The data for the back-trajectory plot overlaid on 10 the map is obtained from the HYSPLIT mode, NOAA.





3 Figure 4. Seasonal variations in the number concentration of total particles (N_{CN}) and the number

 $\label{eq:concentration} 4 \quad \ \ \text{concentration of cloud condensation nuclei} \ (N_{CCN}), \ \ \text{kappa value} \ (\kappa) \ \ \text{and activation diameter} \ (D_{cut})$

5 measured for SS: 0.12%, 0.28%, 0.54% and 0.80%.



Figure 5. Daily mass fraction of major PM_{2.5} chemical components measured during 1 April 2017
- 31 March 2018.



3 Figure 6. Particle size distributions observed for NPF and non-NPF events. Solid lines: median,





1 2 Figure 7. Diurnal variations of particle size distribution and geometric mean diameter (GMD), 3 activation ratio (AR), Kappa (κ), activation diameter (D_{cut}), particle number concentrations of N₃₀, 4 N₃₀₋₁₀₀, and N₁₀₀₋₇₃₆, N_{CN} and N_{CCN} as well as PM_{2.5} for NPF and non-NPF events. CCN and related 5 parameters were measured under SS = 0.28%. GMD were calculated based on the multiple curves 6 fitting result by DOFIT model which one to three modes were defined depends on the particle size 7 distribution data.