



## New particle formation dynamics in the central Andes: contrasting urban and mountaintop environments

Diego Aliaga<sup>1</sup>, Victoria A. Sinclair<sup>1</sup>, Radovan Krejci<sup>2,3</sup>, Marcos Andrade<sup>4,5</sup>, Paulo Artaxo<sup>6</sup>,  
Luis Blacutt<sup>4</sup>, Runlong Cai<sup>1,7</sup>, Samara Carbone<sup>8</sup>, Yvette Gramlich<sup>9</sup>, Liine Heikkinen<sup>1,2,3</sup>,  
Dominic Heslin-Rees<sup>2,3</sup>, Wei Huang<sup>1,9</sup>, Veli-Matti Kerminen<sup>1</sup>, Alkuin Maximilian Koenig<sup>4,10</sup>,  
Markku Kulmala<sup>1,11,12</sup>, Paolo Laj<sup>1,13</sup>, Valeria Mardoñez-Balderrama<sup>4,14</sup>, Claudia Mohr<sup>2,3,9</sup>,  
Isabel Moreno<sup>4</sup>, Pauli Paasonen<sup>1</sup>, Wiebke Scholz<sup>15</sup>, Karine Sellegri<sup>16</sup>, Laura Ticona<sup>4</sup>, Gaëlle Uzu<sup>13</sup>,  
Fernando Velarde<sup>4</sup>, Alfred Wiedensohler<sup>17</sup>, Doug Worsnop<sup>1,18</sup>, Cheng Wu<sup>2,3,a</sup>, Chen Xuemeng<sup>1</sup>,  
Qiaozhi Zha<sup>11</sup>, and Federico Bianchi<sup>1</sup>

<sup>1</sup>Institute for Atmospheric and Earth System Research (INAR)/Physics,  
University of Helsinki, Helsinki, 00014, Finland

<sup>2</sup>Department of Environmental Science, Stockholm University, 11418 Stockholm, Sweden

<sup>3</sup>Bolin Centre for Climate Research, Stockholm University, 11418 Stockholm, Sweden

<sup>4</sup>Laboratory for Atmospheric Physics, Institute for Physics Research,  
Universidad Mayor de San Andrés, La Paz, Bolivia

<sup>5</sup>Department of Atmospheric and Oceanic Sciences, University of Maryland,  
College Park, College Park, Maryland 20742, USA

<sup>6</sup>Institute of Physics, University of São Paulo, São Paulo, 05508-900, Brazil

<sup>7</sup>Shanghai Key Laboratory of Atmospheric Particle Pollution and Prevention (LAP3), Department of  
Environmental Science and Engineering, Fudan University, 200438 Shanghai, China

<sup>8</sup>Institute of Agrarian Sciences, Federal University of Uberlândia, Uberlândia-MG, 38408-100, Brazil

<sup>9</sup>PSI Center for Energy and Environmental Sciences, 5232 Villigen PSI, Switzerland

<sup>10</sup>Institute of Coastal Systems – Analysis and Modeling, Helmholtz-Zentrum Hereon,  
Max-Planck-Str. 1, 21502 Geesthacht, Germany

<sup>11</sup>Joint International Research Laboratory of Atmospheric and Earth System Sciences, School of Atmospheric  
Sciences, Nanjing University, Nanjing, 210023, China

<sup>12</sup>Aerosol and Haze Laboratory, Beijing Advanced Innovation Center for Soft Matter Science and Engineering,  
Beijing University of Chemical Technology, Beijing, 100089, China

<sup>13</sup>Institut des Géosciences de l'Environnement, IGE, UGA, CNRS, IRD, G-INP, 38000 Grenoble, France

<sup>14</sup>Institute of Atmospheric Sciences and Climate, National Research Council of Italy (CNR-ISAC),  
40129 Bologna, Italy

<sup>15</sup>Institute for ion and applied physics, University of Innsbruck, Innsbruck, Austria

<sup>16</sup>Laboratoire de Météorologie Physique (LaMP), Université Clermont Auvergne,  
CNRS, 63000 Clermont-Ferrand, France

<sup>17</sup>Department of Experimental Aerosol and Cloud Microphysics, Leibniz Institute for Tropospheric Research  
(TROPOS), 04318 Leipzig, Germany

<sup>18</sup>Aerodyne Research Inc., Billerica, Massachusetts 01821, USA

<sup>a</sup>now at: Department of Chemistry and Molecular Biology,  
University of Gothenburg, 41296, Gothenburg, Sweden

**Correspondence:** Victoria A. Sinclair (victoria.sinclair@helsinki.fi)

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**Abstract.** In this study, we investigate atmospheric new particle formation (NPF) across 65 d in the Bolivian central Andes at two locations: the mountaintop Chacaltaya station (CHC, 5.2 km above sea level) and an urban site in El Alto–La Paz (EAC), 19 km apart and at 1.1 km lower altitude. We classified the days into four categories based on the intensity of NPF, determined by the daily maximum concentration of 4–7 nm particles: (1) high at both sites, (2) medium at both, (3) high at EAC but low at CHC, and (4) low at both. These categories were then named after their emergent and most prominent characteristics: (1) Intense-NPF, (2) Polluted, (3) Volcanic, and (4) Cloudy. This classification was premised on the assumption that similar NPF intensities imply similar atmospheric processes. Our findings show significant differences across the categories in terms of particle size and volume, sulfuric acid concentration, aerosol compositions, pollution levels, meteorological conditions, and air mass origins. Specifically, intense NPF events (1) increased Aitken mode particle concentrations (14–100 nm) significantly on 28 % of the days when air masses passed over the Altiplano. At CHC, larger Aitken mode particle concentrations (40–100 nm) increased from  $1.1 \times 10^3 \text{ cm}^{-3}$  (background) to  $6.2 \times 10^3 \text{ cm}^{-3}$ , and this is very likely linked to the ongoing NPF process. High pollution levels from urban emissions on 24 % of the days (2) were found to interrupt particle growth at CHC and diminish nucleation at EAC. Meanwhile, on 14 % of the days, high concentrations of sulfate and large particle volumes (3) were observed, correlating with significant influences from air masses originating from the actively degassing Sabancaya volcano and a depletion of positive 2–4 nm ions at CHC but not at EAC. During these days, reduced NPF intensity was observed at CHC but not at EAC. Lastly, on 34 % of the days, overcast conditions (4) were associated with low formation rates and air masses originating from the lowlands east of the stations. In all cases, event initiation ( $\sim 09:00$  LT) generally occurred about half an hour earlier at CHC than at EAC and was likely modulated by the daily solar cycle. CHC at dawn is in an air mass representative of the regional residual layer with minimal local surface influence due to the barren landscape. As the day progresses, upslope winds bring in air masses affected by surface emissions from lower altitudes, which may include anthropogenic or biogenic sources. This influence likely develops gradually, eventually creating the right conditions for an NPF event to start. At EAC, the start of NPF was linked to the rapid growth of the boundary layer, which favored the entrainment of air masses from above. The study highlights the role of NPF in modifying atmospheric particles and underscores the varying impacts of urban versus mountain top environments on particle formation processes in the Andean region.

## 1 Introduction

Atmospheric new particle formation (NPF) is a process when under favorable conditions molecules nucleate to form particles and clusters and through further condensation and coagulation grow to sizes up to tens of nanometers in diameter. Several modeling studies have shown that NPF can contribute globally to over 50 % of cloud condensation nuclei (CCN) (Dunne et al., 2016; Gordon et al., 2017; Kerminen et al., 2018; Merikanto et al., 2009; Spracklen et al., 2008). Furthermore, NPF is crucial from a climate perspective because of its potential to affect cloud radiative properties, cloud lifetime, and precipitation formation to a large degree. Therefore, understanding the processes involved in NPF and its role in the production of CCN is crucial for a better understanding of the current and future climates, air quality, and related effects.

In situ measurements are needed for understanding the diverse and heterogeneous NPF processes worldwide, and they are crucial for validating theoretical models and assessing the relevance of laboratory experimental results. This is especially important given the global variation in NPF mechanisms and their climatic and health impacts (e.g., Daelenbach et al., 2020; Gordon et al., 2017; Kerminen et al.,

2018; Lee et al., 2019; Lehtipalo et al., 2018; Yao et al., 2018). Hence, conducting strategically well-distributed measurements globally is essential to ensure a comprehensive understanding of NPF and its implications in the real atmosphere (Kulmala, 2018).

Despite the growing number of global observations, there is a pronounced bias toward studies conducted in the Northern Hemisphere and at lower altitudes, leaving the Southern Hemisphere and high-altitude (urban or background) regions underrepresented in NPF research (Laj et al., 2020; Nieminen et al., 2018). High-altitude studies in locations such as the Himalayas, the Swiss Alps, and the Rocky Mountains have provided important insights into NPF processes under these unique atmospheric conditions (e.g., Bianchi et al., 2016, 2021; Cai et al., 2021; Hirshorn et al., 2022; Lv et al., 2018; Nishita et al., 2008; Sebastian et al., 2021; Tang et al., 2023; Victor et al., 2024; Sellegri et al., 2019, and references therein; Kerminen et al., 2018, and references therein), but these are still relatively limited in number. Particularly in South America, research on new particle formation, especially ground-based studies, is recent and limited, predominantly focusing on the Amazon rainforest (Varanda Rizzo et al., 2018; Wimmer et al., 2018) or urban settings at low elevations in São Paulo, Brazil (Backman et al., 2012; Monteiro

dos Santos et al., 2021). While there have been numerous airborne studies exploring NPF in relation to convective cloud processes in the Amazon (Andreae et al., 2018; Krejci et al., 2003, 2005; Williamson et al., 2019; Zhao et al., 2020, 2022), these investigations, despite providing valuable insights, offer limited long-term continuity due to their narrow temporal coverage and focus on part of the atmosphere with different thermodynamic conditions and atmospheric dynamics compared to the Earth surface (Collaud Coen et al., 2018).

In this context, the Global Atmosphere Watch Station at Chacaltaya (hereafter referred to as CHC) emerges as a key site to close this gap. Positioned at a high altitude (5240 m above sea level) in the Bolivian Andes at the intersection of the Amazon basin and the Altiplano plateau (hereafter Altiplano), CHC offers a unique vantage point for NPF studies. At this site, Rose et al. (2015) documented frequent NPF events based on a year-long study conducted in 2012. They found that both the formation rate and frequency of NPF events were significantly higher during the dry season, in contrast to the wet season. Additionally, their examination of air mass trajectories revealed that NPF events are more likely to occur when air masses originate from the direction of the Pacific Ocean. However, several questions are still unanswered. For example, we need to better understand the chemical composition of the precursor gases involved in nucleation and growth and the composition of the aerosols formed during these events. Furthermore, a more detailed understanding of the atmospheric transport processes in this complex high-altitude environment is necessary, including disentangling how various atmospheric layers interact and the specific impacts of emissions from nearby the La Paz–El Alto conurbation and volcanic activities on the NPF process.

The challenges faced by Rose et al. (2015) in capturing the full vertical and horizontal scope of NPF events and assessing the impact of nearby emissions on CHC are indicative of a widespread difficulty in single-site NPF observations (especially at mountain top sites with complex topography). Relying on measurements from just one station assumes uniformity in the characteristics of all sampled air masses, an assumption that is occasionally valid in uniform (regional) NPF. However, the atmospheric complexity often restricts the comprehensive representation and understanding of NPF processes observed from a single vantage point. Two-site studies combining mountaintop and ground-level measurements have been beneficial in revealing how elevation, local topography, and emissions influence NPF dynamics and the transport of air masses (e.g., Boulon et al., 2011; Casquero-Vera et al., 2020; Shang et al., 2023; Wang et al., 2014; Zhou et al., 2021). Expanding simultaneous observations at multiple sites within a localized region can help overcome these limitations by enabling the distinction between localized and more regional NPF events and how these affect individual sites. At mountain top sites this becomes more important due to the strong diurnal cycle in thermally driven winds and planetary boundary layer (PBL) structure in these regions.

Due to the nature of NPF events, which last for several hours and are strongly influenced by the path and history of the air masses involved, any NPF-related observation at a fixed point depends on where the air mass has traveled before reaching the measurement site. Whether the air mass has passed over polluted urban areas or descended from the clean upper troposphere will affect its chemical and physical properties. Furthermore, the NPF process in the convective boundary layer is heterogeneous, influenced by variations in thermodynamic conditions, precursor gas availability, pre-existing aerosol populations, and the continuous yet not instantaneous air mass mixing within the vertical column, which typically takes around 30 min (O'Donnell et al., 2023). For example, at the upper limit of the boundary layer, lower temperatures can reduce the volatility of nucleating vapors, enhancing nucleation, while intrusions from the free troposphere may decrease the condensation sink, increasing the survival probability of newly formed clusters. Near the surface, emissions of precursor gases may favor nucleation, though pre-existing aerosol and primary particle emissions can also raise the condensation sink, reducing the survival probability of clusters (O'Donnell et al., 2023). Despite this heterogeneity, continuous mixing over time can make the process appear homogeneous when observed hours after the event has begun. These considerations highlight the importance of accurately tracing the geographical history of the air mass before sampling. Additionally, multi-site observations can help in disentangling the various factors influencing heterogeneous NPF.

This air mass history tracing is typically done by computing single back trajectories (also known as trajectory models; Fleming et al., 2012) using meteorological data, which are often of coarse resolution from global reanalysis (Fleming et al., 2012 and references therein). However, single back trajectories do not account for the turbulent and chaotic nature of the atmosphere and lack any probabilistic information on where the air masses originated from. Furthermore, back trajectories do not account for filamentation and the backward volume growth of the measured air masses (Stohl et al., 2002). To mitigate these disadvantages, particle dispersion models can be used. Moreover, the results from any dispersion or trajectory models are also sensitive to the quality of the model-based meteorological input data (Foreback et al., 2024), and this is especially true in areas of complex topography, where coarse-resolution meteorological data will not resolve small-scale flows such as thermally driven upslope and downslope winds. Therefore, in this study we analyze air mass origin using the Lagrangian dispersion model, FLEXPART, which has been driven by high-resolution meteorological model (horizontal grid spacing down to 1 km) data (Aliaga et al., 2021).

Another significant challenge in the study of NPF is identifying days on which NPF events are observed (Kulmala et al., 2024). Traditionally, these are classified into event days, non-event days, and undefined days (e.g., Dal Maso et al.,

2005; Kulmala et al., 2012; Dada et al., 2018). Event days are characterized by a clear new mode of particles present in the particle number size distribution (PNSD) with a subsequent growth that can be followed for several hours, while non-event days display an absence of new particles in the nucleation mode size range. Undefined days are those in between that do not fulfill either of these two criteria. This approach, however, faces two key issues: a substantial number of days fall into the undefined category often due to non-stationary weather conditions, which makes statistical analysis complicated, and the traditional classification fails to identify sub-regional NPF events. Recently, the nanoparticle ranking analysis was introduced (Aliaga et al., 2023). Unlike the conventional method of day classification, this method assigns values (or rankings) to days based on the concentration of nanoparticles within the smallest measurable size ranges (for example, 2.5–5 nm). This analysis is not only a more nuanced indicator of NPF activity but also correlates well with the formation rate, offering a continuous and robust metric for evaluating the probability and intensity of NPF events on all days (including those previously falling into the undefined group).

The Southern Hemisphere high-altitude experiment on particle nucleation and growth (SALTENA, December 2017 to May 2018; Bianchi et al., 2022) aimed to understand the formation and growth mechanisms and properties of aerosols in the Andes. It focused on observation sites at CHC and the La Paz–El Alto conurbation (EAC; Fig. 1). This campaign has provided detailed new information on the transport mechanism of the air masses (Aliaga et al., 2021), the molecular composition of the nucleating precursors and clusters (Zha et al., 2023a), quantitative information on dimethyl sulfide (DMS) and its oxidation products (Scholz et al., 2023), and the vapors contributing to particle growth (Heitto et al., 2024). Additionally, it produced a new dataset detailing the PNSD and aerosol chemical compositions at El Alto city (EAC; Bianchi et al., 2022; Mardoñez-Balderrama et al., 2024). Moreover, Moreno et al. (2024) documented a significant rise in volcanic degassing in the area. However, all of these findings have yet to be fully incorporated into the current understanding of the NPF process in the region, and a comparison between the observations at EAC and CHC has not been explored.

In this study we expand our current understanding of NPF in the central Andes through the analysis of 65 d of observations (19 March–31 May 2018) at CHC and EAC that correspond to the transition period from the wet to the dry season. We apply the recently developed “nanoparticle ranking analysis” (Aliaga et al., 2023) to evaluate the probability and intensity of NPF occurrence simultaneously at both sites, resulting in a joint distribution. This analysis is integrated with an in-depth examination of air mass histories at CHC (Aliaga et al., 2021) and EAC and complemented with observations of aerosol chemical composition concentrations (Bianchi et al., 2022). Although precursor gases were not measured at EAC, we include direct sulfuric acid measurements at CHC,

where sulfuric acid–ammonia interactions are likely the primary mechanism for NPF (Zha et al., 2023a). Our study aims to deepen the understanding of NPF in the Andes, focusing on both background and polluted regimes. We investigate the regional representativeness (both vertical and horizontal) of NPF observations at CHC and their correlation with events at EAC. We also quantify the impact of anthropogenic emissions at EAC locally and at a sub-regional level. Moreover, we identify local and regional meteorological patterns and air transport mechanisms that influence NPF, assessing their effects on both sites. Lastly, we evaluate the contrasting influence of volcanic plumes on NPF at CHC and EAC.

## 2 Observations and instrumentation

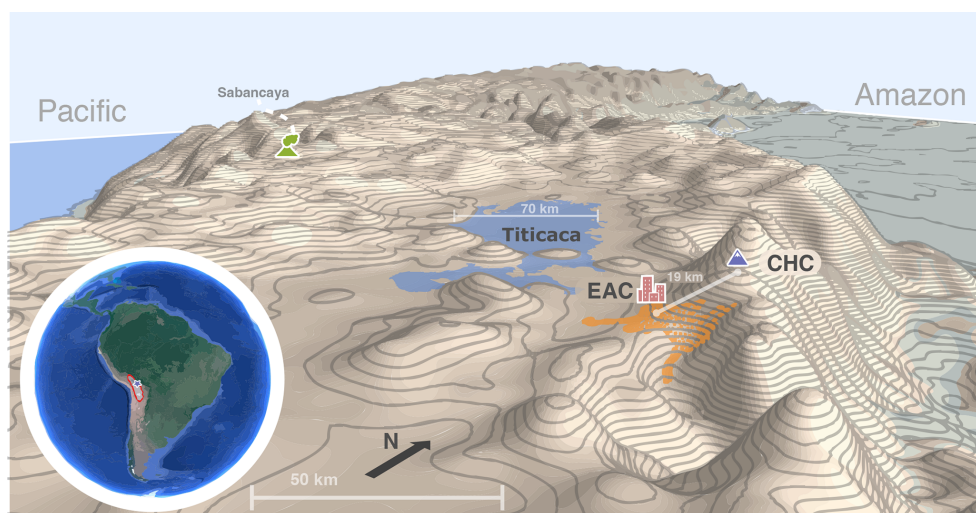
This study is based on measurements obtained during the SALTENA campaign. The experimental setup and overview for this campaign have previously been detailed by Bianchi et al. (2022). The SALTENA campaign spanned from December 2017 to May 2018, aiming to understand the formation and growth mechanisms and properties of aerosols in the Andes. This study focuses on 65 d in the period between 19 March and 31 May 2018 (9 d were excluded due to missing PNSD observations at either site) when intensive measurements were concurrently performed at the CHC and EAC sites. Subsequent sections detail the instrumentation employed for this study.

### 2.1 Site descriptions

#### 2.1.1 The Global Atmosphere Watch Chacaltaya station

The Global Atmosphere Watch Chacaltaya station (CHC), situated at 5240 m above sea level (a.s.l.) (16.350° S, 68.131° W; Fig. 1), was established in 2011 and has been extensively described in several studies (Adams et al., 1977, 1980, 1983; Aliaga et al., 2021; Andrade et al., 2015; Bianchi et al., 2022; Chauvigné et al., 2019; Francou et al., 2000; Heitto et al., 2024; Koenig et al., 2021; Mardoñez-Balderrama et al., 2024; Moreno et al., 2024; Ramirez et al., 2001; Rose et al., 2015, 2017; Wiedensohler et al., 2018; Zha et al., 2023b, a). Located approximately 140 m below the peak of Chacaltaya and about 1400 m above the Altiplano, CHC is part of the Cordillera Real. This range extends from southeast to northwest, forming a natural divide between the Altiplano to the west and the Amazon to the east. The conurbation of La Paz–El Alto is situated approximately 19 km south of CHC.

CHC experiences an annual cycle of dry and wet seasons. The wet season spans 4 months, from December to March, while the dry season spans 4 months, from May to August. April is considered the transition period between the wet and dry seasons, while September to November is considered the transition period between the dry and wet seasons. The station records an annual average atmospheric pressure



**Figure 1.** The illustration shows a general description of the region including a world map (lower left) and a topographic portrayal of the area. On the world map, CHC is denoted with a star, while a red line outlines the Altiplano plateau. In the topographic portrayal, the Chacaltaya station (CHC) is marked with a lilac mountain icon, while the El Alto City (EAC) station is marked with a pink city icon. The conurbation of the La Paz–El Alto area is colored in orange. Additionally, distinct features of the region are displayed, including the La Paz Valley situated southeast of the EAC, Lake Titicaca to the west of the stations, the Sabancaya volcano (green volcano icon) to the west of the stations, the Amazon region and the lowlands to the east, and the Pacific Ocean to the west.

of 534 hPa, temperature of 0 °C, and an annual precipitation of 865 mm (Perry et al., 2017). It is predominantly influenced by air masses advected from the west during the dry season and from the lowlands to the northeast and southeast during the wet season (Chauvigné et al., 2019). Actively degassing volcanoes in the Peruvian Western Cordillera such as Sabancaya (5976 m a.s.l., ~400 km northwest of CHC) routinely influence the observed sulfate concentrations at CHC (Aliaga et al., 2021; Moreno et al., 2024). Pollution from the conurbation of La Paz–El Alto influences observations at CHC regularly, preferentially during the early afternoon due to PBL growth and orographic thermal winds (Chauvigné et al., 2019; Wiedensohler et al., 2018). In general, at any given time, about a quarter of the air masses arriving at CHC have been in touch with the pseudo PBL (below 1.5 km) within 4 d before arriving at the station (Aliaga et al., 2021).

### 2.1.2 The El Alto city urban background site

EAC is located at the meteorological station of El Alto International Airport. This site has been previously described (Bianchi et al., 2022; Mardoñez-Balderrama et al., 2024; Wiedensohler et al., 2018) and is situated at an altitude of 4040 m a.s.l. (16.510° S, 68.199° W; Fig. 1). It is located on the eastern edge of the Altiplano and at the western high and flat area of the conurbation of La Paz–El Alto (orange region in Fig. 1), which has an estimated population of 2 million inhabitants.

The minimum distance from the meteorological station to the surrounding city's roads and neighborhoods is ~600 m to the south and northwest. The building of the meteorological

station is 250 m away from the airport runway. The airport experiences low traffic, and little influence from planes has been observed. The site is representative of the urban background conditions of El Alto city. Meteorological seasons at EAC closely resemble those at CHC, but EAC, situated at a lower altitude, experiences higher annual mean temperatures and pressures (8 °C and 664 hPa; Mardoñez-Balderrama et al., 2024).

### 2.2 Size-resolved particle number concentrations

Size-resolved number concentrations for particles between the electrical mobility diameters of 2 and 440 nm were concurrently measured at CHC and EAC. This diameter range was obtained by combining the measurements of the neutral cluster and air ion spectrometer (NAIS) for ions between 2 and 4 nm and particles between 4 and 15 nm and the mobility particle size spectrometer (MPSS) for larger particles between 15 and 440 nm. In practice, there are overlapping diameters between the instruments, which we used for calibration and validation as described below. The time resolution of both instruments is below 10 min.

The NAIS (Mirme and Mirme, 2013) nominally measures the number size distributions of ions in the electric mobility diameter range between 0.84 and 42 nm and particles in the range between 2.5 and 42 nm. At EAC, we utilized the newer NAIS 5 model. This model is designed to adapt to atmospheric pressure changes, mainly because it features two blowers per analyzer that can adjust to varying ambient pressures. In contrast, at CHC we used the older NAIS 3 model. This model does not adjust to atmospheric pressure changes

and operates with a single blower per analyzer that manages both the sheath and sample flow. The NAIS 3 model at CHC has been previously described (Rose et al., 2015). During our campaign, it was necessary to adjust the raw observations due to the instrument's inability to adapt to the low pressure of CHC and the blower's reduced performance. This resulted in a lower-than-expected flow rate, which in turn led to incorrect sizing of the particles. The adjustment procedure included a simultaneous 5 d measurement with both NAIS 3 and NAIS 5 at CHC, using the NAIS 5 as a reference for correcting the NAIS 3. Additionally, using the MPSS as a standard, the NAIS 3 was adjusted based on the overlapping size region with the MPSS (10 to 42 nm). This overlap was then used to correct the NAIS 3 measurements. As a result of the above-described sizing issues and to homogenize the NAIS measurement diameter range across sites, we decided to report ions between 2 and 4 nm and particles between 4 and 15 nm. At these size ranges we have high confidence in the performance of both NAISs.

Two MPSSs (TROPOS-type; Wiedensohler et al., 2012) were also deployed at CHC (permanently) and EAC (during SALTENA). The instrument deployment at CHC has been previously detailed (Wiedensohler et al., 2018), and a similar protocol was followed at EAC. At CHC, the MPSS measures particle sizes ranging from 10 to 460 nm, while at EAC, the size range extends to 692 nm. However, to homogenize the measurements across sites and to combine these measurements with those of the NAIS, we selected the diameter range between 15 and 440 nm. Weekly calibrations were performed using standard latex particles of 203 nm (Wiedensohler et al., 2012). Additionally, a weekly verification of the aerosol inlet and condensation particle counter (CPC) flow rates was conducted to ensure accuracy.

### 2.3 Mass concentrations of particle chemical composition

Mass concentrations of particle chemical composition were concurrently measured at the CHC and EAC sites. The mass concentrations of sub-micrometer non-refractory aerosol chemical species, such as sulfate, were determined using a quadrupole Aerodyne aerosol chemical speciation monitor (ACSM; Aerodyne Research Inc.; Ng et al., 2011), whereas measurements of equivalent black carbon were conducted using the Aethalometer AE31. The procedures for deploying the AE31 instruments at the stations are documented in Mardoñez-Balderrama et al. (2024). Similarly, the methodology for ACSM deployment at CHC, which was identical to that at EAC, is outlined in Aliaga et al. (2021).

The ACSM is used for characterizing non-refractory sub-micrometer aerosol species, including organics, nitrate, sulfate, ammonium, and chloride (Ng et al., 2011). Due to the challenges posed by low atmospheric pressure, a modification was made to the ACSM by incorporating a critical orifice with a diameter of 130  $\mu\text{m}$ . This adaptation was essential

to maintain the standard sample mass flow rate (Fröhlich et al., 2013). After passing the critical orifice, the air sample travels through an aerodynamic lens, which enables particles between  $\sim 75$ –650 nm in vacuum aerodynamic diameter to reach a particle vaporizer (Liu et al., 2007). Here, particles are flash vaporized at 600 °C and ionized by electron impact ionization (70 eV). The particle composition is thereafter determined using quadrupole mass spectrometry. To ensure optimal instrument performance and accurate mass quantification, calibrations were routinely conducted during the campaign. These calibrations focused on the instrument's inlet flow and mass, using ammonium nitrate and ammonium sulfate as standard references. The ACSM was set to record data at a temporal resolution of 30 min, and a PM<sub>10</sub> cyclone was used in the line as cutoff for the aerosol particle measurements. In addition, the Magee Nafion membrane dryer was used to guarantee aerosol particles below 50 % relative humidity.

During some volcanic plume events at CHC, the ACSM inlet became clogged, resulting in underestimated concentrations for all measured species. To correct this, we analyzed the ratio of observed volume from the PNSD and mass concentration from the ACSM between 00:00 and 04:00 LT – a period when equivalent black carbon (eBC) is negligible and does not skew the ratio. This ratio remained stable when the instrument was unclogged. Thus, during the clogged periods, we adjusted the species concentrations upward to match the ratio observed on unclogged days.

The AE31 (Magee Scientific; Arnott et al., 2005, Tape: Pall flex Quartz fiber Q250F) is a filter-based absorption photometer that measures light attenuation by atmospheric aerosol particles at seven wavelengths in the visible and near-visible spectrum (370, 470, 520, 590, 660, 880, 950 nm). Measurements at 880 nm were used to obtain an estimate of the equivalent black carbon mass concentration (Petzold et al., 2013).

### 2.4 Ancillary measurements

Routine meteorological parameters (e.g., temperature, relative humidity, and wind speed and direction) were measured continuously at both CHC and EAC (Bianchi et al., 2022) at varying temporal resolutions and subsequently averaged to a uniform 15 min temporal resolution. Additionally, incident global shortwave radiation (hereafter referred to as “incident SW radiation”) measurements were taken at CHC but not at EAC.

We also measured sulfuric acid (SA) concentrations at CHC with the chemical ionization atmospheric-pressure interface time-of-flight (CI-API-TOF; Aerodyne Research Inc. & Tofwerk AG) mass spectrometer (Jokinen et al., 2012). Zha et al. (2023a) provide comprehensive installation and operational details of this instrument's deployment at the station. The instrument was a nitrate ion (NO<sub>3</sub>)-based CI-API-

TOF that is widely used for atmospheric SA measurements (Bianchi et al., 2016; Jokinen et al., 2012).

Cloud cover fraction (CF, Fig. S6 in the Supplement) data for the stations is gathered from the MODIS instrument aboard the Aqua and Terra satellites, which pass over the region four times daily at  $\sim 10:00$ ,  $\sim 14:00$ ,  $\sim 20:00$ , and  $\sim 02:00$  LT (Platnick et al., 2015) and have a spatial resolution of approximately 5 km. Due to higher noise levels in nighttime data, we focus on daytime retrievals. For each satellite pass and day, we calculate the CF at each station by averaging the cloud fraction values from all pixels within a 5 km radius centered on each station.

### 3 Methods and diagnostics

#### 3.1 Categorization of days based on NPF intensity across both sites

Traditional atmospheric NPF field studies have relied on predefined criteria to differentiate between days with and without NPF (e.g., Dal Maso et al., 2005; Kulmala et al., 2012; Dada et al., 2018), but this binary approach often misclassifies weak events and non-regional phenomena, limiting further analyses such as growth and formation rates. Kulmala et al. (2024) proposed deriving a probability distribution for NPF intensity across all observed days, using nanoparticle ranking analysis (Aliaga et al., 2023) to produce a daily metric indicative of NPF intensity. This metric, which focuses on the daily maximum minus background particle concentration within the nucleation mode, correlates higher values with increased formation rates and event probabilities. Additionally, grouping days by shared characteristics, such as chemical environment, season, or air mass origin, as demonstrated by Kulmala et al. (2022, 2024), helps identify emerging patterns and mitigates observational noise, leading to more accurate estimations of metrics like growth rate (GR).

Building upon these recent advancements and the inclusion of two observational sites, this study employs a straightforward, yet effective methodology based on the nanoparticle ranking analysis (Aliaga et al., 2023) and  $k$ -means clustering to create four categories of days for further analysis (see flowchart in Fig. 2). First, for each site, we derive a single metric for daily NPF intensity using the diameter range of 4 to 7 nm for the number concentration ( $N_{4-7}^{\text{day max}}$ ). For the  $N_{4-7}^{\text{day max}}$  calculation, following Aliaga et al. (2023), we identify the maximum concentration of  $N_{4-7}$  during the active period (08:00 to 18:00 LT) after smoothing the  $N_{4-7}$  time series with a 2 h rolling median. Diverging from Aliaga et al. (2023), we select a 4–7 nm diameter range (as mentioned above), considering our confidence in particle measurement reliability above 4 nm at CHC and aiming for a range that ensures a detectable signal while diminishing influence of potential primary emissions. Instead of calculating the difference between  $N_{4-7}^{\text{day max}}$  and the background median, as sug-

gested by Aliaga et al. (2023), we opt for a simpler method of using only the maximum concentration during the active period, having found that both approaches yield comparable results.

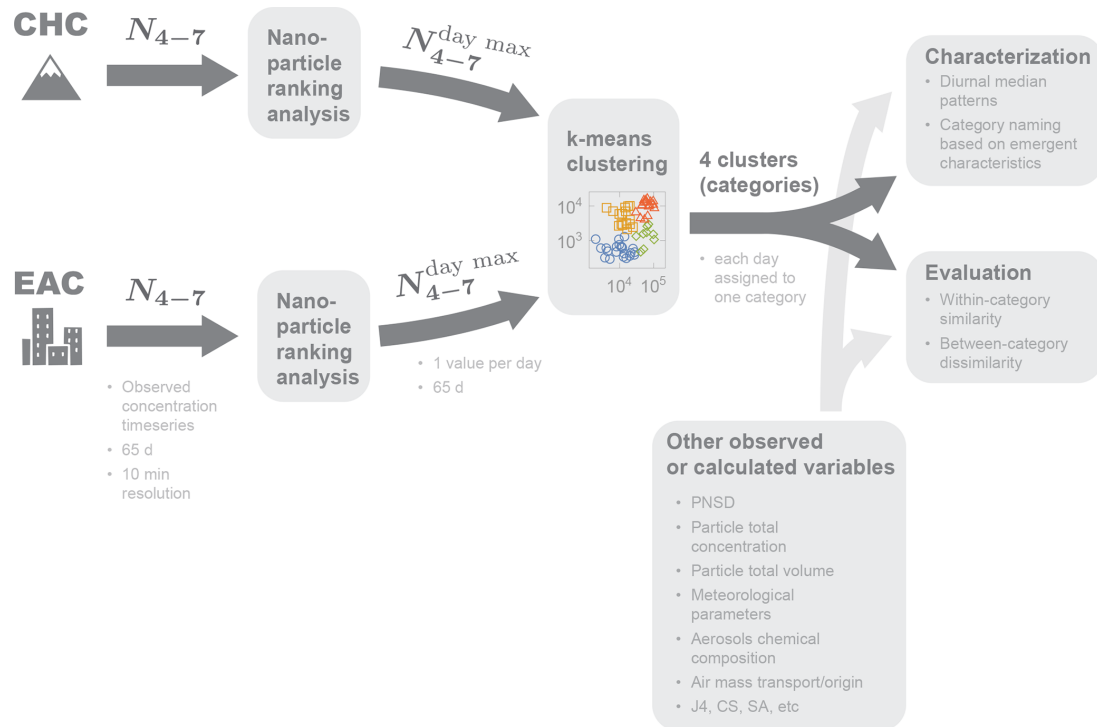
We then construct a two-dimensional vector for each day, with  $N_{4-7}^{\text{day max}}$  from both sites. Utilizing  $k$ -means clustering, we cluster days into four categories based on the NPF intensity at the two sites, anticipating two categories with uniformly high or low intensities across both sites and two with mixed intensities. Furthermore, we also employed three popular metrics to identify the optimal number of clusters: silhouette scores, the Davies–Bouldin index, and the Calinski–Harabasz index. Among configurations ranging from two to six clusters, the four-cluster option achieved the highest overall score across these tests. The category separation not only produced significantly distinct values of  $N_{4-7}^{\text{day max}}$  for each category but also produced significantly (Mann–Whitney  $U$  test,  $p$  value  $< 0.1$ ) distinct values for, among others,  $J_{4-7}$ , PNSD, aerosol chemical compositions (e.g., eBC, sulfate), SA, and meteorological parameters (e.g., relative humidity (RH), cloud fraction (CF), water vapor mixing ratio (WVMR); Figs. S13–S16).

Finally, we also used a more traditional approach to classify days loosely based on Dada et al. (2018) to compare with our categorization scheme (Figs. S4 and S9). We utilized concentrations of negative ions in the 2–4 nm range and particle concentrations from 7 to 25 nm. We conducted a visual inspection on the PNSD for each day at each site, identifying days with an observed increase in  $N_{2-4}^-$  lasting more than 1 h as nucleating days (Nuc-D). Days showing a noticeable growing edge in the range from 4 to 25 nm were labeled as growth days (Gr-D). Additionally, days with a distinct increase in the 7–25 nm range were designated as Aitken peak days (Ait-P-D). It is important to point out that at EAC many days were classified as Nuc-D and Ait-P-D but not Gr-D, likely since the local dynamics do not allow the growing edge to be observed.

#### 3.2 Air mass origin analysis

All air mass history analyses in this study are derived from 4 d backward simulations using the Lagrangian FLEXible PARTicle dispersion model (FLEXPART; version FLEXPART-WRF\_v3.3.2; Brioude et al., 2013), with CHC and EAC as the arrival points. The FLEXPART simulations were driven by meteorological output from the Weather Research and Forecasting (WRF) model version 4.0.3 (Skamarock et al., 2019). For CHC, we utilized a pre-existing dataset generated by Aliaga et al. (2021), while for EAC we ran new FLEXPART simulations using an identical setup but targeting EAC as the arrival point.

The WRF meteorological data were originally generated by Aliaga et al. (2021) for the CHC region during the SALTENA campaign (6 December 2017 to 31 May 2018) at high resolution (down to 1 km). The WRF model was initial-



**Figure 2.** Flowchart showing the procedure for assigning each day to one of the four categories that are subsequently evaluated and characterized.

ized with data from the National Centers for Environmental Prediction Climate Forecast System Version 2 (Saha et al., 2014) and included four nested domains, with the innermost covering 180 km<sup>2</sup> at 1 km resolution. The model output was saved every 15 min, and further details on the simulation setup are available in Aliaga et al. (2021).

In both the CHC and EAC simulations, 20 000 virtual particles (passive air tracers) were released every hour and tracked backward for 4 d. To refine the results from Aliaga et al. (2021), which used a pseudo PBL defined as altitudes below 1.5 km, we employed a more precise PBL metric. We determined whether air masses were within or above the PBL by comparing their geographic positions and altitudes against the PBL height in the WRF meteorological dataset.

When run in backwards mode, FLEXPART computes the emission sensitivity response function, also referred to as the source–receptor relationship (SRR), on a user-specified three-dimensional longitude–latitude–height grid (Eckhardt et al., 2017; Pisso et al., 2019; Seibert and Frank, 2004). The potential emission sensitivity provides a footprint of emission source areas and if multiplied by actual emissions would give an estimate of the concentrations that would be measured at the receptor (station). The SRR output was cast into a log polar grid centered at each of the stations following the methods and rationale described by Aliaga et al. (2021)

In the results section, we distinguish air mass history for long-range, medium-range, and short-range transport. The

long-range transport is analyzed by the integrated SRR over the full 4 d duration of the simulated transport back in time. The medium range is calculated in the same way as the long range but with a color bar scaled to emphasize sources within a 200 km range. The short-range transport is calculated slightly differently for a more detailed representation of the air mass movement close to the station. For 1, 2, 3, and 4 h prior to arrival at the site, the SRR at the time was clustered into 20 clusters (using *k*-means clustering), forcing half of the clusters to be above the boundary layer and half of them to be below the boundary layer. The mean location of each cluster was then calculated in addition to the size of the SRR magnitude in the cluster. In total, each cluster is characterized as a “blob” with a certain location and a volume representing the SRR contribution of this cluster. Since 20 blobs are produced per hour, the full transport 4 h prior to arrival at the station is represented by a total of  $20 \times 4 = 80$  blobs.

### 3.3 Formation rate, growth rate, coagulation sink, and condensation sink calculations

Particle formation rates (*J*) and the growth rates (GRs) are the most important parameters characterizing atmospheric NPF (Kerminen et al., 2018). Additionally, coagulation sink (CoagS) and condensation sink (CS) are commonly used when analyzing NPF processes. These parameters can be calculated in a microscopic or macroscopic fashion, but in field



studies the latter is usually applied because then these quantities can be directly estimated from the measured particle size distribution.

The formation rate is defined as the flux of growing particles above a threshold diameter (in our case 4 nm) and is denoted as  $J_4$  and its units are particles per cubic centimeter per second. It can be calculated from the measured particle size distribution following the formulation based on the aerosol general dynamic equation (Kulmala et al., 2012),

$$J_4 = \frac{\Delta N_{[4,7]}}{\Delta t} + \text{CoagS}_{[4,7]} \times N_{[4,7]} + \frac{\text{GR}}{(7 - 4) \text{ nm}} \times N_{[4,7]}, \quad (1)$$

where  $N_{[4,7]}$  is the concentration of particles sized from 4 nm up to but not including 7 nm.

The growth rate (GR) indicates the time-based change in diameter ( $D$ ) of the growing mode in the PNSD. GR can be estimated in field studies using the maximum-concentration, appearance time, or mode-fitting methods (Kulmala et al., 2012; Lehtipalo et al., 2014). The maximum concentration method identifies peak concentrations at each size bin after applying a Gaussian filter for noise reduction and fits a least-squares line to these peaks with swapped axes ( $x$  axis is diameter, and  $y$  axis is time) since the uncertainty is in the time dimension, calculating GR as the inverse of this slope. The appearance time method is similar to the maximum concentration method, but instead of using the maximum, a certain threshold of the maxima (e.g., 50 %) is used. In this study we use the maximum-concentration method (Max) and the appearance time method, setting the threshold as the maximum of the time derivative (Der.). We do not use the mode-fitting method because events in this region nucleate for many hours, making the method unsuitable for this environment.

Results from the Max and Der. methods are shown in Figs. S1 and S2 and Tables S1 and S2, but we relied on the Der. method for  $J_4$  estimations (Eq. 1) because it better handles the increasing surface influence at CHC. Mathematically, it is precise to use the GR at the 7 nm upper size limit for Eq. (1), but commonly any nucleation mode GR is used. We used GR in the range from 4 to 7 nm.

The coagulation sink, calculated as

$$\text{CoagS}_{[4,7]} = \sum_{i=j}^{i=n} K \left( \sqrt{4 \cdot 7} \text{ nm}, \sqrt{D_{L,i} \cdot D_{U,i}} \right) \cdot N_{[D_{L,i}, D_{U,i}]}, \quad (2)$$

quantifies the rate at which particles within a specific size range, here [4, 7) nm, collide and coalesce with particles of similar or larger sizes, thereby exiting the growing particle mode. The variables  $D_{L,i}$  and  $D_{U,i}$  denote the lower and upper diameter boundaries of each diameter size bin  $i$ . The integer  $j$  is the number of the first bin for which the lower limit of the bin is larger than 4 nm ( $j = \min\{i \text{ s.t. } D_i > 4 \text{ nm}\}$ ). The

integer  $n$  equals the total number of bins, and  $D_{U,n}$  is the upper diameter of the last bin, which in our case is 470 nm. Each term in the sum involves a coagulation coefficient  $K$  that takes two parameters: the first parameter is the geometric mean between 4 and 7 nm, and the second parameter is the geometric mean between the diameter boundaries of bin  $i$ . The coagulation coefficient is multiplied by the number concentration of particles  $N$  in bin  $i$ .

The condensation sink quantifies the theoretical loss rate of condensing vapor molecules (here defined with respect to sulfuric acid) to the existing particle population. Similar to the coagulation sink, it can be calculated from the particle number size distributions using the following equation (Dal Maso et al., 2002):

$$\text{CS} = 4\pi D^* \sum_{i=1}^{i=n} \beta \left( \sqrt{D_{L,i} \cdot D_{U,i}} \right) \cdot N_{[D_{L,i}, D_{U,i}]}, \quad (3)$$

where  $D^*$  is the diffusion coefficient of sulfuric acid and  $\beta$  is the transition regime correction factor.

In field measurements, the most difficult quantity to estimate is the GR as it can only be calculated when a growing mode is observed, and it can additionally be affected by the fluctuating air masses and/or primary emissions. Moreover, a changing environment upwind can even produce apparent shrinking (Hakala et al., 2023). As mentioned above, Kulmala et al. (2022) have suggested to calculate GR by taking group averages of similar days. In this study we follow this approach by using the median  $\text{GR}_{4-7}$  of all the days within a category where  $\text{GR}_{4-7}$  was available. This category median  $\text{GR}_{4-7}$  is then used in Eq. (1) together with the other required quantities.

## 4 Results and discussion

In this section, we describe the results of our analysis and discuss their implications. We have clustered the 65 d under study into four categories (each day belongs to only one category and 9 d were excluded due to missing  $N_{4-7}$  measurements at either location). The classification of each day was based only on the combined two-dimensional (CHC and EAC) maximum daily values of  $N_{4-7}$  ( $N_{4-7}^{\text{day max}}$ ; see Fig. 4 and description in Sect. 3.1).

The underlying assumption behind this categorization is as follows. The atmospheric processes behind days with similar NPF intensities ( $N_{4-7}^{\text{day max}}$ ) are likely similar to each other and different from days with different NPF intensities. Dividing these days into a small number of categories allows us to analyze these categories in detail and thus understand which specific processes lead to different NPF intensities. Conducting this categorization at two points that are close in geographical distance but separated by altitude and local influences also allows us to understand which processes are favorable at each specific site.

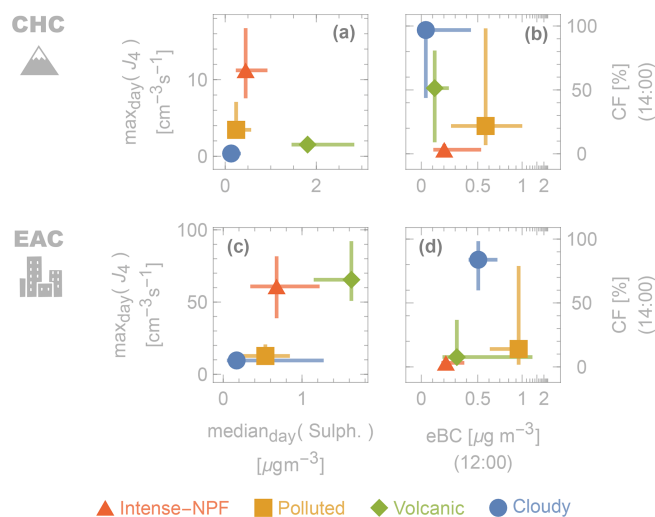
We first tested whether the four categories were significantly different from each other using 25 selected variables

(Figs. S13–S16), including concentrations of particles at four different sizes, total concentration and volume, meteorological parameters (RH, WVMR, incident SW radiation, wind speed and direction), chemical composition of aerosols, CS, and SA. For each variable, we collated hourly measurements by category and compared these across all four categories at the same hourly intervals using the Mann–Whitney  $U$  test, which is suited to non-normal distributions (Figs. S13–S16). We established our null hypothesis that the collated hourly measurements are not significantly different, setting a significance threshold at  $p$  values greater than 0.1. The alternative hypothesis that collated hourly measurements are distinct was set for  $p$  values less than 0.1. The findings from this analysis revealed that approximately 48 % of the measurement sets exhibited statistically significant differences. In other words, on average each variable is significantly different half of the time. Ideally, a flawless categorization would result in 100 % significant differences, indicating clear separations between categories. In contrast, poor or arbitrary categorization would likely result in values close to 0 %, suggesting no discernible differences between categories based on the data. Thus, we concluded that the categories are indeed significantly different in terms of concentrations of size-resolved particle number and volume, precursor gases, aerosol chemical composition, level of pollution, meteorological parameters, transport patterns, and air mass origins (Figs. 9, S13–S16). Additionally, the analysis of the origin of the air masses further supported distinct categories originating from different source regions (Fig. 9).

Subsequently, we identified four key emergent and memorable indicators observed at both location for naming these categories:

1. Intense-NPF, where combined  $J_4$  is considerably higher compared to the other categories;
2. Polluted, where eBC concentrations at 12:00 LT are significantly elevated;
3. Volcanic, where daily median sulfate concentrations are notably higher, likely due to the Sabancaya volcano;
4. Cloudy, where the cloud fraction at 14:00 LT, matching satellite observations, is significantly higher than in the other categories.

Each parameter exhibited high values in one of the four categories (corresponding values are shown in Fig. 3 and Table 1), indicating their dominant influence at CHC and EAC (except for  $J_4$  where Intense-NPF and Volcanic are similar only at EAC). Hard categorizations may not always align perfectly with observed features. For instance, certain days categorized as Intense-NPF may also exhibit pronounced eBC peaks at noon. Nevertheless, such occurrences are not the norm, as the value distributions across categories remain notably and significantly dissimilar.



**Figure 3.** Key parameters for naming the categories derived using  $k$ -means clustering on  $N_{4-7}^{\max}$  at CHC and EAC. The top panels (a, b) display variables observed at CHC, while the bottom panels (c, d) present EAC observations. Panels (a) and (c) show daily maximum  $J_4$  values (y axis) against median daily sulfate concentrations (x axis). Panels (b) and (d) illustrate cloud fraction (CF) percentages at 14:00 LT within a 10 km radius of each station (y axis), as captured by MODIS, versus eBC concentrations at 12:00 LT (x axis), when peak eBC levels are observed at CHC and comparatively (to other categories) high levels are seen at EAC. The markers indicate median values, and the lines represent the inter-quartile range (IQR).

The analysis in this study is primarily based on the median daily patterns (rounded to the hour) of size-resolved particle distributions, aerosol chemical compositions, meteorological variables (e.g., temperature, RH, wind speed and direction, solar radiation), sulfuric acid concentrations, and crucial NPF characteristics (formation and growth rates). We further examine particle number concentrations ( $N$ ) or negative (positive) ions ( $N^{(-)}$ ) within size ranges determined by specific criteria shown in Table 2. Additionally, we conduct comprehensive air mass history analyses ranging from short timescales (< 4 h) and short-range transport (< 200 km) to long timescales (up to 4 d) and long-range transport (up to 1500 km). In all figures time references are in local time (UTC−4), with data shown as daily hourly medians, left-aligned, and shaded for the inter-quartile range.

In Fig. 4, we start with the days within the category denoted as Intense-NPF (top-right quadrant). During these days, high-intensity NPF (i.e., high values of  $N_{4-7}^{\max}$ ) is observed at both CHC and EAC, and a distinct and intense banana-like shape is observed in the growing NPF mode. Both CHC and EAC show a clear and intense formation event with a well-defined growth edge. However, there are two clear differences between CHC and EAC. First, the maximum value of  $N_{4-7}$  is 5-fold higher at EAC ( $48.8 \times 10^3 \text{ cm}^{-3}$ ) than at CHC ( $8.2 \times 10^3 \text{ cm}^{-3}$ ). Second,

**Table 1.** Key parameters at each category and station. Each entry shows the median value of the variable. First (Q1) and third (Q3) quartiles are denoted as subscripts and superscripts, respectively. For each variable name subscripts indicate the particle size range (where applicable) and superscripts the time of day or aggregation method used (e.g., 14:00 LT or max for maximum).

|   | Intense-NPF                          |                                      | Polluted                           |                                      | Volcanic                             |                                      | Cloudy                             |                                     |
|---|--------------------------------------|--------------------------------------|------------------------------------|--------------------------------------|--------------------------------------|--------------------------------------|------------------------------------|-------------------------------------|
|   | CHC                                  | EAC                                  | CHC                                | EAC                                  | CHC                                  | EAC                                  | CHC                                | EAC                                 |
| <i>N</i> days   | 18                                   |                                      | 16                                 |                                      | 9                                    |                                      | 22                                 |                                     |
| $J_4^{\text{maxday}}$ [ $\text{cm}^{-3} \text{s}^{-1}$ ]    | 7.7 <sub>3.8</sub> <sup>12.6</sup>   | 50.7 <sub>35.4</sub> <sup>71.8</sup> | 2.2 <sub>1.0</sub> <sup>3.5</sup>  | 9.2 <sub>5.4</sub> <sup>13.6</sup>   | 1.2 <sub>0.9</sub> <sup>1.6</sup>    | 52.1 <sub>33.3</sub> <sup>90.9</sup> | 0.2 <sub>0.2</sub> <sup>0.3</sup>  | 6.1 <sub>3.5</sub> <sup>11.5</sup>  |
| $\text{SA}^{\text{maxday}}$ [ $10^6 \text{ mol. cm}^{-3}$ ] | 12.8 <sub>7.1</sub> <sup>23.2</sup>  |                                      | 6.1 <sub>4.8</sub> <sup>6.8</sup>  |                                      | 35.9 <sub>30.1</sub> <sup>41.6</sup> |                                      | 3.4 <sub>2.3</sub> <sup>7.6</sup>  |                                     |
| $\text{GR}_{4-7}$ [ $\text{nm h}^{-1}$ ]                    | 7.0 <sub>4.3</sub> <sup>10.1</sup>   | 9.0 <sub>6.5</sub> <sup>10.3</sup>   | 6.8 <sub>4.8</sub> <sup>9.5</sup>  | 7.0 <sub>5.9</sub> <sup>11.1</sup>   | 6.2 <sub>5.2</sub> <sup>18.2</sup>   | 7.3 <sub>6.8</sub> <sup>8.4</sup>    | 7.7 <sub>6.1</sub> <sup>16.7</sup> | 5.1 <sub>2.7</sub> <sup>12.0</sup>  |
| $\text{CS}^{10:00}$ [ $10^{-3} \text{ s}^{-1}$ ]            | 4.0 <sub>3.2</sub> <sup>6.0</sup>    | 11.9 <sub>10.5</sub> <sup>15.9</sup> | 3.8 <sub>2.8</sub> <sup>4.1</sup>  | 14.5 <sub>13.6</sub> <sup>19.9</sup> | 7.5 <sub>6.6</sub> <sup>7.8</sup>    | 14.9 <sub>13.8</sub> <sup>16.5</sup> | 1.3 <sub>1.1</sub> <sup>3.4</sup>  | 9.8 <sub>1.3</sub> <sup>15.3</sup>  |
| $N_{4-7}^{\text{maxday}}$ [ $10^3 \text{ cm}^{-3}$ ]        | 11.5 <sub>9.7</sub> <sup>14.3</sup>  | 62.1 <sub>51.8</sub> <sup>75.6</sup> | 4.9 <sub>2.9</sub> <sup>7.5</sup>  | 14.8 <sub>10.9</sub> <sup>18.2</sup> | 1.5 <sub>1.1</sub> <sup>1.7</sup>    | 62.3 <sub>49.6</sub> <sup>70.6</sup> | 0.5 <sub>0.4</sub> <sup>0.7</sup>  | 11.2 <sub>5.9</sub> <sup>15.2</sup> |
| $N_{7-13}^{03:00}$ [ $10^3 \text{ cm}^{-3}$ ]               | 0.3 <sub>0.1</sub> <sup>0.5</sup>    | 1.8 <sub>1.3</sub> <sup>2.1</sup>    | 0.3 <sub>0.1</sub> <sup>0.4</sup>  | 1.0 <sub>0.7</sub> <sup>2.4</sup>    | 0.1 <sub>0.1</sub> <sup>0.1</sup>    | 0.9 <sub>0.8</sub> <sup>1.0</sup>    | 0.1 <sub>0.1</sub> <sup>0.2</sup>  | 1.0 <sub>0.7</sub> <sup>1.7</sup>   |
| $N_{7-13}^{11:00}$ [ $10^3 \text{ cm}^{-3}$ ]               | 19.7 <sub>14.9</sub> <sup>26.0</sup> | 39.9 <sub>15.0</sub> <sup>53.9</sup> | 8.1 <sub>2.2</sub> <sup>14.6</sup> | 8.1 <sub>4.6</sub> <sup>12.7</sup>   | 3.9 <sub>2.8</sub> <sup>6.8</sup>    | 35.3 <sub>10.6</sub> <sup>63.3</sup> | 0.2 <sub>0.1</sub> <sup>0.4</sup>  | 5.6 <sub>3.0</sub> <sup>10.8</sup>  |
| $N_{13-40}^{03:00}$ [ $10^3 \text{ cm}^{-3}$ ]              | 2.6 <sub>1.6</sub> <sup>3.2</sup>    | 4.5 <sub>3.7</sub> <sup>6.1</sup>    | 2.3 <sub>1.2</sub> <sup>3.8</sup>  | 4.8 <sub>2.7</sub> <sup>8.0</sup>    | 2.1 <sub>1.4</sub> <sup>3.3</sup>    | 2.8 <sub>1.3</sub> <sup>3.9</sup>    | 0.5 <sub>0.3</sub> <sup>1.3</sup>  | 3.3 <sub>1.8</sub> <sup>5.7</sup>   |
| $N_{13-40}^{12:00}$ [ $10^3 \text{ cm}^{-3}$ ]              | 29.0 <sub>18.6</sub> <sup>39.0</sup> | 24.8 <sub>18.9</sub> <sup>40.3</sup> | 9.3 <sub>5.8</sub> <sup>14.6</sup> | 16.9 <sub>10.0</sub> <sup>22.5</sup> | 10.6 <sub>4.1</sub> <sup>19.6</sup>  | 23.2 <sub>9.3</sub> <sup>34.5</sup>  | 0.7 <sub>0.3</sub> <sup>2.6</sup>  | 10.1 <sub>6.3</sub> <sup>13.3</sup> |
| $N_{40-100}^{03:00}$ [ $10^3 \text{ cm}^{-3}$ ]             | 1.4 <sub>1.0</sub> <sup>2.7</sup>    | 3.3 <sub>2.0</sub> <sup>4.0</sup>    | 1.2 <sub>1.0</sub> <sup>1.9</sup>  | 2.8 <sub>1.5</sub> <sup>4.6</sup>    | 2.6 <sub>2.2</sub> <sup>3.8</sup>    | 1.8 <sub>1.2</sub> <sup>3.4</sup>    | 0.7 <sub>0.4</sub> <sup>0.9</sup>  | 1.3 <sub>1.0</sub> <sup>3.3</sup>   |
| $N_{40-100}^{17:00}$ [ $10^3 \text{ cm}^{-3}$ ]             | 6.0 <sub>3.3</sub> <sup>8.8</sup>    | 4.9 <sub>2.8</sub> <sup>6.5</sup>    | 2.2 <sub>0.9</sub> <sup>5.7</sup>  | 2.4 <sub>1.7</sub> <sup>3.4</sup>    | 3.3 <sub>1.7</sub> <sup>6.9</sup>    | 4.2 <sub>2.9</sub> <sup>5.8</sup>    | 0.6 <sub>0.4</sub> <sup>1.1</sup>  | 1.9 <sub>1.2</sub> <sup>3.0</sup>   |
| eBC <sup>12:00</sup> [ $\mu\text{g m}^{-3}$ ]               | 0.2 <sub>0.1</sub> <sup>0.5</sup>    | 0.2 <sub>0.2</sub> <sup>0.4</sup>    | 0.7 <sub>0.3</sub> <sup>1.0</sup>  | 0.9 <sub>0.6</sub> <sup>1.0</sup>    | 0.1 <sub>0.1</sub> <sup>0.2</sup>    | 0.3 <sub>0.3</sub> <sup>0.8</sup>    | 0.1 <sub>0.0</sub> <sup>0.4</sup>  | 0.5 <sub>0.4</sub> <sup>0.7</sup>   |
| Sulf.med. day [ $\mu\text{g m}^{-3}$ ]                      | 0.6 <sub>0.3</sub> <sup>0.9</sup>    | 0.9 <sub>0.5</sub> <sup>1.3</sup>    | 0.3 <sub>0.2</sub> <sup>0.6</sup>  | 0.6 <sub>0.3</sub> <sup>0.8</sup>    | 1.9 <sub>1.4</sub> <sup>2.8</sup>    | 1.3 <sub>1.2</sub> <sup>1.7</sup>    | 0.2 <sub>0.1</sub> <sup>0.4</sup>  | 0.3 <sub>0.1</sub> <sup>1.2</sup>   |
| CF <sup>10:00</sup> [%]                                     | 3 <sub>3</sub> <sup>3</sup>          | 3 <sub>3</sub> <sup>3</sup>          | 4 <sub>3</sub> <sup>20</sup>       | 6 <sub>3</sub> <sup>31</sup>         | 27 <sub>3</sub> <sup>48</sup>        | 12 <sub>3</sub> <sup>30</sup>        | 62 <sub>3</sub> <sup>95</sup>      | 29 <sub>4</sub> <sup>70</sup>       |
| CF <sup>14:00</sup> [%]                                     | 3 <sub>3</sub> <sup>7</sup>          | 3 <sub>3</sub> <sup>3</sup>          | 25 <sub>10</sub> <sup>91</sup>     | 15 <sub>4</sub> <sup>64</sup>        | 59 <sub>38</sub> <sup>81</sup>       | 12 <sub>6</sub> <sup>40</sup>        | 97 <sub>45</sub> <sup>97</sup>     | 84 <sub>61</sub> <sup>97</sup>      |
| RH <sup>12:00</sup> [%]                                     | 31 <sub>23</sub> <sup>45</sup>       | 19 <sub>13</sub> <sup>27</sup>       | 48 <sub>37</sub> <sup>61</sup>     | 35 <sub>30</sub> <sup>40</sup>       | 61 <sub>49</sub> <sup>65</sup>       | 37 <sub>34</sub> <sup>41</sup>       | 75 <sub>48</sub> <sup>92</sup>     | 49 <sub>42</sub> <sup>53</sup>      |

the event at EAC is preceded by the appearance of a mode with high number concentrations in the Aitken range (13–100 nm;  $40.9 \times 10^3 \text{ cm}^{-3}$ ) observed from 05:00 to 08:00 LT. This latter pattern is qualitatively similar in all categories and linked to early morning rush hour and a shallow PBL.

In Polluted (Fig. 4, top-left quadrant) at CHC we observe morning (09:00–12:00 LT) nucleation and growth similar to what was observed at Intense-NPF-CHC. However, the event is abruptly interrupted at noon when aerosol concentrations in the accumulation mode ( $N_{100-440}$ ) rapidly increase from  $0.51 \times 10^3 \text{ cm}^{-3}$  at 10:00 LT to  $1.72 \times 10^3 \text{ cm}^{-3}$  at 12:00 LT. Later, we will show in detail that this peak is the result of air pollution advected from EAC and certainly not the result of NPF. At EAC, like Intense-NPF-EAC, early morning (07:00 LT;  $N_{13-100} = 25.3 \times 10^3 \text{ cm}^{-3}$ ) and evening (20:00 LT;  $N_{13-100} = 22.5 \times 10^3 \text{ cm}^{-3}$ ) Aitken mode peaks are observed. However, unlike Intense-NPF-EAC, nucleation without apparent growth is observed here ( $N_{4-7} = 9.6 \times 10^3 \text{ cm}^{-3}$  at 13:00 LT, Fig. 4b and d).

In Volcanic (Fig. 4, bottom-right quadrant) we observe elevated levels of sulfate and total aerosol volume at both

stations. The air masses come from areas near the Sabancaya volcano (Fig. 1) where active degassing has been observed during the measurement period (Aliaga et al., 2021; Bianchi et al., 2022). Interestingly, at CHC, we see an NPF process with noticeable growth, but at considerably lower intensity ( $N_{4-7}^{\text{day max}} = 1.2 \times 10^3 \text{ cm}^{-3}$ ) compared to that of Intense-NPF-CHC ( $N_{4-7}^{\text{day max}} = 8.2 \times 10^3 \text{ cm}^{-3}$ ). This diminished NPF intensity, however, is not seen at EAC where we observe a similar PNSD diurnal pattern to that of Intense-NPF-EAC with similar NPF intensity ( $N_{4-7}^{\text{day max}}$  is  $42.3 \times 10^3$  and  $48.8 \times 10^3 \text{ cm}^{-3}$  at Volcanic-EAC and Intense-NPF-EAC, respectively). Finally in the lower Aitken range (13–40 nm) the particle number concentration in the afternoon (around 15:00 LT) is comparatively low compared to Intense-NPF-EAC ( $14.6 \times 10^3$  versus  $24.2 \times 10^3 \text{ cm}^{-3}$  for Volcanic-EAC and Intense-NPF-EAC, respectively).

The Cloudy category (Fig. 4, bottom-left quadrant) is characterized by cloudy skies both at CHC (CF=97 % at 14:00 LT, Fig. S6) and EAC (CF=83 % at 14:00 LT), the highest relative humidity and air masses originating from the

**Table 2.** Particle size ranges used in this study and their characteristics.

| Size range [nm] | Notation         | Description  |
|-----------------|------------------|--|
| 2–4             | $N_{2-4}^{-(+)}$ | <ul style="list-style-type: none"> <li>– Primarily observes reliable negative (positive) ion concentrations</li> <li>– Indicates early clustering and growth</li> <li>– Marks the onset of nucleation</li> </ul>                               |
| 4–7             | $N_{4-7}$        | <ul style="list-style-type: none"> <li>– Falls within the lower nucleation range</li> <li>– Sensitive to the intensity of new particle formation (NPF)</li> <li>– Marks early nucleation and growth stages</li> </ul>                          |
| 7–13            | $N_{7-13}$       | <ul style="list-style-type: none"> <li>– Represents the upper nucleation range</li> <li>– Reflects further growth</li> <li>– Not influenced by primary emissions at EAC during morning and afternoon rush hours</li> </ul>                     |
| 13–40           | $N_{13-40}$      | <ul style="list-style-type: none"> <li>– Corresponds to the lower Aitken mode</li> <li>– Most NPF-produced particles are found in this range by the end of daily NPF events</li> <li>– Captures traffic primary emissions at EAC</li> </ul>    |
| 40–100          | $N_{40-100}$     | <ul style="list-style-type: none"> <li>– Pertains to the upper Aitken mode</li> <li>– A small but significant portion of NPF-produced particles reach this size</li> <li>– Sensitive to traffic primary emissions at EAC</li> </ul>            |
| 100–440         | $N_{100-440}$    | <ul style="list-style-type: none"> <li>– Denotes the accumulation mode</li> <li>– Affected by primary emissions from pollution and dust</li> <li>– Notably influenced by volcanic plume influences in this specific geographic area</li> </ul> |

lowlands and valleys east from the Altiplano. At CHC, apparent nucleation is rarely observed during these days (only in 7 d out of 22). The overall particle concentration remains exceptionally low with a maximum  $N_{3-440}$  of  $3.8 \times 10^3 \text{ cm}^{-3}$ . At EAC, a similar pattern to Polluted-EAC is observed, which is expected as their NPF intensity values are similar ( $N_{4-7}^{\text{day max}} = 7.6 \times 10^3 \text{ cm}^{-3}$  versus  $9.6 \times 10^3 \text{ cm}^{-3}$  for Cloudy-EAC and Polluted-EAC, respectively), and more importantly local anthropogenic sources dominate despite advection from the lowlands.

#### 4.1 Intense-NPF category

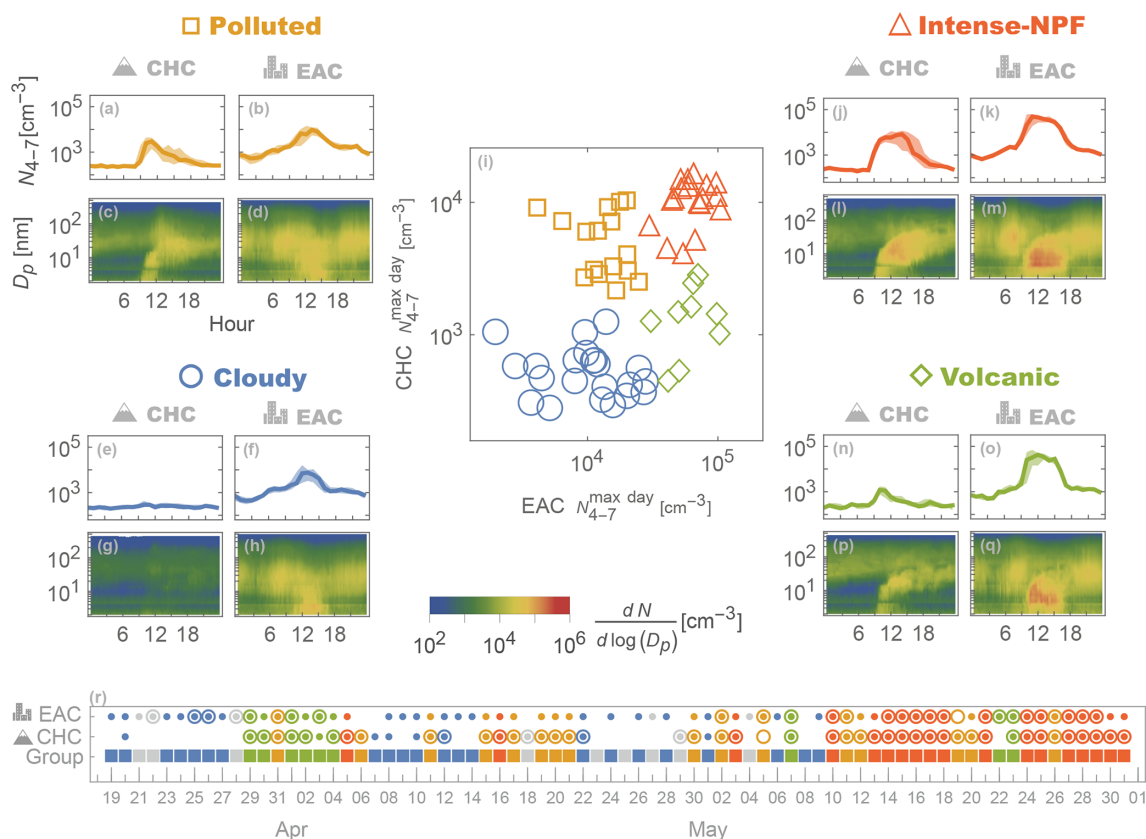
We begin with an overview of the Intense-NPF category, initially outlining typical characteristics shared by both CHC and EAC. This is followed by a detailed examination of the median diurnal patterns for each location, focusing on four critical times: sunrise (07:00 LT), the beginning of new particle formation (NPF) around 09:00 LT, noon (12:00 LT), and sunset (18:00 LT). We conclude by highlighting the key factors associated with NPF and conducting a comparative analysis between CHC and EAC.

During the 18 d within this category, the FLEXPART air mass history analysis (both at CHC and EAC) reveals the presence of air masses originating from the western Altiplano region. These air mass origins are observed in both the long-range ( $> 200 \text{ km}$ ; Fig. 5p) and medium-range analyses ( $< 200 \text{ km}$ ; Fig. 9). Generally, these days exhibit cloudless sky conditions (Fig. 5a) and limited presence of clouds in the

region (Fig. S6). Additionally, both sites, when compared to the other categories, experience the lowest relative humidity levels ( $< 45 \%$ ; Fig. S9) throughout the day. Within this category a clear and intense process of nucleation (Nuc-D) and growth (Gr-D) has been identified in our conventional classification for all 18 d at CHC and EAC except for two instances at EAC where Gr-D was not detected (Figs. S3 and S4).

At CHC, during the pre-dawn period (00:00–06:00 LT) most observed parameters have low values and are either constant in time or decrease gradually. Minimum values of wind speed ( $1.9 \text{ m s}^{-1}$ ), temperature ( $-3 \text{ }^\circ\text{C}$ ), condensation sink (CS,  $2.95 \times 10^{-3} \text{ s}^{-1}$ ), and total particle concentration ( $N_{3-440}$ ,  $4.8 \times 10^3 \text{ cm}^{-3}$ ) occur at approximately 06:00 LT. Sunrise occurs at  $\sim 07:00 \text{ LT}$ , after which incident SW radiation and sulfuric acid (SA), which were close to zero during the night, begin to increase. Nucleation begins at  $\sim 09:00 \text{ LT}$ , which coincides almost exactly with the time when wind speed starts to increase (Fig. 5).

During the early new particle formation phase (09:00–11:00 LT),  $J_4$  increases rapidly from  $0.4$  to  $3.4 \text{ cm}^{-3} \text{ s}^{-1}$ , the CS remains small ( $0.34 \times 10^{-3} \text{ s}^{-1}$ ) and a GR<sub>4-7</sub> of  $7.0 \text{ nm h}^{-1}$  (Table 1) is estimated. Equivalent black carbon (eBC, Fig. 5c), which is used as a proxy for anthropogenic pollution, also starts to increase during this time interval and the wind speed continues to increase. SA reaches its maximum value ( $1.35 \times 10^7 \text{ molec. cm}^{-3}$ ) at 10:00 LT, after which it starts to decrease, most likely due to the increase in CS and associated scavenging, which reaches  $7.5 \times 10^{-3} \text{ s}^{-1}$



**Figure 4.** The central panel (i) displays the daily maximum values of particle concentration in the range of 4 to 7 nm for EAC (x axis) and CHC (y axis) (see Sect. 3). These points are grouped into four categories or quadrants using *k*-means clustering. Each group of days is named after its key emergent parameter (Fig. 3): Intense-NPF (upper right; **j–m**), Polluted (upper left; **a–d**), Volcanic (lower right; **n–q**), and Cloudy (lower left; **e–h**). The panels in the four corners show the daily median values of particle concentration  $N_{4-7}$  (first row) and PNSD (second row) for CHC (first column) and EAC (second column). Panel (r) shows the group that is assigned to each day (grey is used for days with insufficient data) and whether nucleation (dot; Nuc-D) and/or growth (circle; Gr-D) was observed at the stations.

by 12:00 LT. Thus, eBC (Fig. 5c) reaches its peak value of  $0.2 \mu\text{g m}^{-3}$  at 12:00 LT.

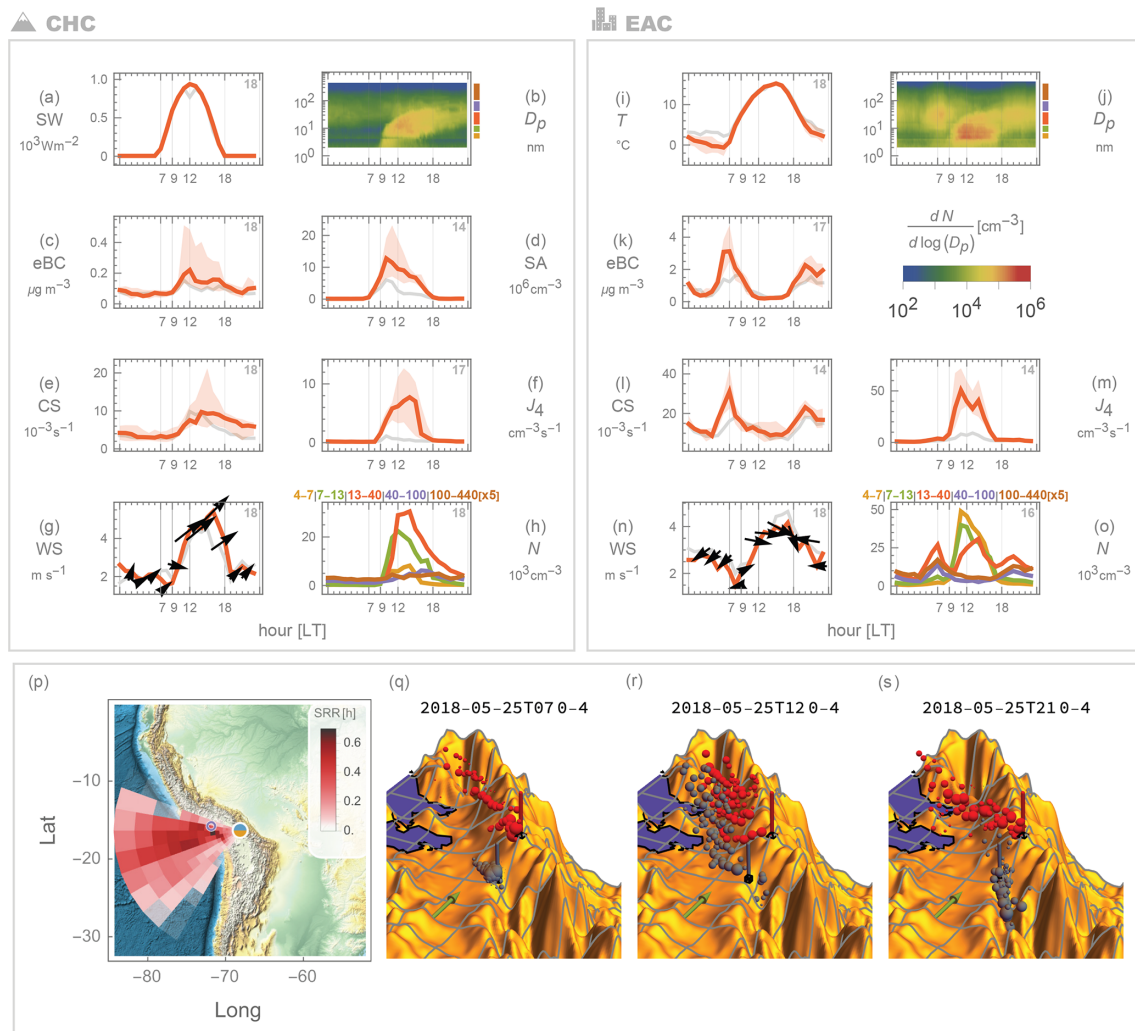
In the afternoon (12:00–17:00 LT), the wind is blowing upslope from the southwest and reaches a maximum wind speed of  $5.4 \text{ m s}^{-1}$  at 16:00 LT.  $J_4$  peaks at 14:00 LT ( $7.7 \text{ cm}^{-3} \text{ s}^{-1}$ ), while  $N_{13-40}$  and  $N_{40-100}$  peak at 14:00 LT ( $30.5 \times 10^3 \text{ cm}^{-3}$ ) and 16:00 LT ( $6.18 \times 10^3 \text{ cm}^{-3}$ ), respectively. The peak in the particle concentration in the lower Aitken range ( $N_{13-40}$ ) is likely dominated by the observed NPF process, while the peak in  $N_{40-100}$  is likely a combination of surface-based primary emissions and NPF. In the evening interval (18:00 to 23:00 LT), incident SW radiation, wind speed, and temperature experience a rapid decrease coinciding with sunset. SA and  $J_4$  decrease to very low values after 18:00 LT. Meanwhile, eBC and CS decrease more gradually, and their concentrations by the end of the day are only half of their daily maximum.

At EAC during the pre-dawn hours (00:00–06:00 LT), the temperature follows a decreasing trend like that seen at CHC, reaching its lowest point at 06:00 LT ( $-0.6 \text{ }^\circ\text{C}$ ). Wind direc-

tion stays consistently northeasterly, with a median speed of  $2.1 \text{ m s}^{-1}$ . The concentration of eBC reaches its lowest at 02:00 LT ( $0.4 \mu\text{g m}^{-3}$ ) before trending upwards. CS follows a similar trajectory, with its minimum at 04:00 LT ( $8.7 \times 10^{-3} \text{ s}^{-1}$ ).

During the early morning hours (07:00–08:00 LT), eBC concentration peaks at 07:00 LT ( $3.1 \mu\text{g m}^{-3}$ ), a surge attributed to the combined effects of morning traffic, low temperature, and a stable shallow PBL (Wiedensohler et al., 2018). This peak in eBC coincides with morning highs in other parameters: CS at  $31.0 \times 10^{-3} \text{ s}^{-1}$ ,  $N_{13-40}$  at  $26.7 \times 10^3 \text{ cm}^{-3}$ ,  $N_{40-100}$  at  $14.0 \times 10^3 \text{ cm}^{-3}$ , and  $N_{100-440}$  at  $3.43 \times 10^3 \text{ cm}^{-3}$ . It is likely that all of these highs are the result of traffic pollution. Wind speed hits its daily minimum at 08:00 LT ( $1.5 \text{ m s}^{-1}$ ), changing direction from northeasterly to westerly and rapidly increasing in speed thereafter. This low wind speed is also seen in the short-range air mass analysis ( $< 4 \text{ h}$ , Fig. 5q, grey spheres).

During the early phase of new particle formation (09:00–11:00 LT) at EAC, nucleation is observed around 09:00 LT,

Intense-NPF  $\Delta$ 

**Figure 5.** Main characteristics of the Intense-NPF category. Panels (a)–(h) and (i)–(o) provide information on diurnal median values of key variables at CHC and EAC, respectively. The shading shows the inter-quantile range, and the grey line is the median of all categories (shown for comparison). Panels (g) and (n) show the wind speed, and the arrows point to the median direction (up means wind coming from south to north, and right means wind coming from west to east). Panels (h) and (o) show the concentration at different ranges color coded and specified in the legend above. Panel (p) shows the median long-range air mass origins for CHC (source–receptor relationship; SRR). The sky-blue half-disk represents the location of CHC (with EAC in orange close to the same location). The lilac circle marks the location of the Sabancaya volcano. The EAC long-range air mass origin is very similar and is presented in Fig. 9. Panels (q)–(s) depict the short-range (< 4 h) air mass origins for a representative day at three key hours: 7, 12, and 21 (see Sect. 3 for calculation). The red spheres indicate the location of the air mass arriving at CHC, with their size representing the quantity and/or duration of air tracers in that location. The grey spheres provide the same information but for EAC. The green arrow points north. CHC is denoted by a pyramid with a red stick on top, while EAC is marked with a cube topped by a grey stick. Each grid line is separated by approximately 25 km.

leading to a sharp increase in the concentrations of smaller particles:  $N_{4-7}$  reaches  $48.8 \times 10^3 \text{ cm}^{-3}$ ,  $N_{7-13}$  reaches  $39.9 \times 10^3 \text{ cm}^{-3}$ , and  $J_4$  reaches  $50.7 \text{ cm}^{-3} \text{ s}^{-1}$  ( $\sim 10$  times higher than  $J_4$  at CHC), all peaking at 10:00 LT. In contrast, eBC decreases 10-fold to  $0.39 \mu\text{g m}^{-3}$ , the CS drops to  $11.1 \times 10^{-3} \text{ s}^{-1}$ , and particle concentrations  $N_{40-100}$  and  $N_{100-440}$  fall to  $3.25 \times 10^3$  and  $1.15 \times 10^3 \text{ cm}^{-3}$ , respectively, reaching these levels by noon and then stabilizing. The

rather swift change in the PNSD, concentration of eBC, and value of CS is likely the result of a rapidly growing PBL. The rapid increase in PBL height is related to the dry environment ( $\text{RH} = 36\%$ ), which means the latent heat from the small and sensible heat flux, which drives the PBL growth, is large.

In the early afternoon (12:00–17:00 LT) at EAC the wind is westerly, and the wind speed stays high at around  $3.8 \text{ m s}^{-1}$ , while temperature peaks at 15:00 LT ( $15.3^\circ\text{C}$ ). It

can be seen that the air masses in the short-range ( $< 4$  h) come from the Altiplano, from what appears to be a well-developed PBL that is indistinguishable (in the sense that it follows a very similar path) from the air masses that reach CHC at the same time (Fig. 5r). The concentration  $N_{40-100}$  reaches a minimum of  $3.25 \times 10^3 \text{ cm}^{-3}$ , similar to CHC ( $3.34 \times 10^3 \text{ cm}^{-3}$ ) at the same time, which is further evidence that similar air masses are influencing the stations. The concentration of  $N_{13-40}$  peaks at 14:00 LT ( $30.9 \times 10^3 \text{ cm}^{-3}$ ), most likely as a product of the ongoing NPF process.

In the evening interval (18:00 to 23:00 LT) at EAC there is a marked shift in wind direction from westerlies (from the Altiplano) to easterlies (from the La Paz Valley), which then stabilizes for the rest of the night as the speed decreases (Fig. 5n). The concentration of eBC and the CS begin to rise again, peaking at around 20:00 LT ( $2.3 \mu\text{g m}^{-3}$  and  $23.1 \times 10^{-3} \text{ s}^{-1}$ , respectively), likely due to the afternoon increase in traffic-related emissions and the development of a shallow nocturnal PBL. This increase is also clear in the PNSD (Fig. 5j), where a nighttime Aitken mode (centered around 30 nm) is established, similar to that observed in the morning.

### Similarities and differences

Comparing both locations, we now highlight some key differences and similarities between NPF and other aerosol-related processes at CHC and EAC. First, the occurrence of morning and nighttime high-concentration peaks in Aitken mode in the PNSD is a unique feature at EAC and is absent at CHC. This phenomenon can be linked to the clear decoupling of air masses during the night, with CHC sampling within the residual layer or free troposphere, while EAC is affected by a shallow nocturnal PBL and advection of urban valley air from La Paz. The presence of these modes at EAC, and their absence at CHC, highlights the impact of local emissions, particularly from traffic, at EAC.

Secondly,  $N_{4-7}$  is significantly higher at EAC, especially during the day (e.g.,  $45.8 \times 10^3$  versus  $5.9 \times 10^3 \text{ cm}^{-3}$  at 12:00 LT).

This is likely due to local emissions of precursors at EAC that undergo quick photooxidation during daytime (their concentrations during the early morning rush hour only reach a tenth of the daily value). Short range air mass analysis ( $< 4$  h) suggests similar air mass history at both sites during the day. However, this similarity is partial; closer inspection reveals air masses separate at shorter intervals ( $< 2$  h), and in general the residence time of the air masses within the urban area is less than 2 h. This supports the idea that the higher concentrations of  $N_{4-7}$  at EAC result from local emissions of precursor gases that lead to higher production of particles.

Thirdly, negative ions  $N_{2-4}^-$  persist at EAC until just before 18:00 LT, whereas at CHC they decrease significantly after 12:00 LT. This persistence at EAC is likely due to the

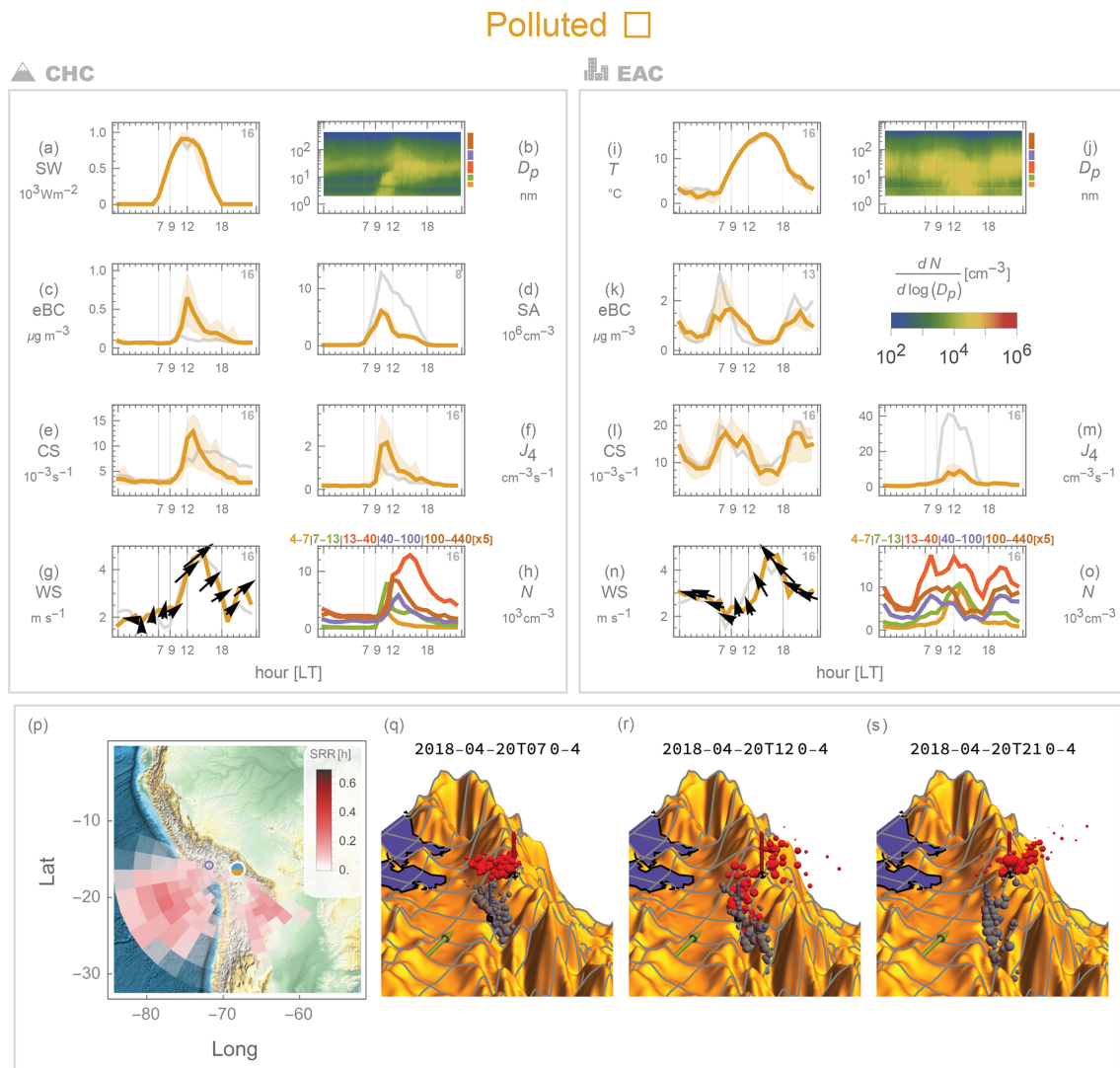
continuous availability of precursor gases from local anthropogenic emissions, while at CHC such emissions are absent, and any precursor gases must be transported, getting lost due to the condensation sink generated by background aerosol concentrations and newly formed particles.

Despite these differences, the aerosol growth patterns are similar after 10:00 LT ( $GR_{7-13}$  is 7.2 and  $7.6 \text{ nm h}^{-1}$  for CHC and EAC, respectively; Table S1 and Figs. S1 and S2), and the evolutions of the concentrations of particles  $N_{13-40}$  show great resemblance between the two stations after 12:00 LT. This suggests that during Intense-NPF days we encounter regional scale events. The orographic upslope winds and a well-developed PBL over the Altiplano connect both sites. This hypothesis is supported by almost identical concentrations of  $N_{13-40}$  between 12:00 and 18:00 LT at both sites (Fig. S17), coinciding with the estimated time it would take the NPF mode to grow to this size. Differences in particle sizes below 14 nm between the sites are likely due to varying anthropogenic influences, particularly from traffic emissions of precursor gases at EAC, which increase local production of these smaller particles. In contrast, CHC shows fewer such influences. At EAC, the urban air mass has a short residence time of approximately 1–2 h, after which fresher air masses from outside the urban area replace it. These new air masses, unaffected by local emissions, are influenced mainly by regional NPF processes and are thus similar to those concurrently observed at CHC.

### 4.2 Polluted category

The Polluted category consists of a total of 16 d. At both sites, the FLEXPART air mass history analysis (Fig. 6p) reveals that a majority of the air masses during these days originate from the southeast along the Altiplano eastern edge with a lesser contribution from the western direction (central Altiplano). This spatial origin is evident in both medium-range distances ( $< 200$  km) and long-range distances ( $> 200$  km, Fig. 9). During these days, the mornings exhibit clear skies; however, as the day progresses, intermittent cloud cover becomes noticeable. This is demonstrated by the increased shaded inter-quantile range in the incident SW radiation curve (Fig. 6a) and in the increase in the CF fraction (Figs. S6 and S9) from 6% at 10:00 LT to 15% at 14:00 LT. The relative humidity on these days is higher compared to Intense-NPF, with the median RH reaching 48% at CHC but drier in comparison to Volcanic and Cloudy (Fig. S9).

Within this category, nucleation is observed on 15 and 14 d at CHC and EAC, respectively, while clear particle growth is observed on 16 d at CHC and 6 d at EAC (Fig. S4). Moreover, the arrival of a pollution plume around noon (12:00 LT) is observed at CHC, which frequently interrupts the observed growth process. The arrival of this plume is evident in the concentration increase observed in the PNSD surface plot at CHC (Fig. 6b) around 12:00 LT, seen by an upper-range Aitken mode centered at  $\sim 70$  nm in diameter. Additionally,



**Figure 6.** The main characteristics of the Polluted category. Panels (a)–(h) and (i)–(o) provide information on diurnal median values of key variables at CHC and EAC, respectively. The shading shows the inter-quantile range, and the grey line is the median of all categories (shown for comparison). The upper-right grey integers mark the number of available days for the given variable. Panels (g) and (n) show the wind speed, and the arrows point to the median direction (up means wind coming from south to north, and right means wind coming from west to east). Panels (h) and (o) show the concentration at different ranges color coded and specified in the legend above. Panel (p) shows the median long-range air mass origins for CHC (source–receptor relationship; SRR). The sky-blue half-disk represents the location of CHC (with EAC in orange close to the same location). The lilac circle marks the location of the Sabancaya volcano. The EAC long-range air mass origin is very similar and is presented in Fig. 9. Panels (q)–(s) depict the short-range (< 4 h) air mass origins for a representative day at three key hours: 7, 12, and 21 (see Sect. 3 for calculation). The red spheres indicate the location of the air mass arriving at CHC, with their size representing the quantity and/or duration of air tracers in that location. The grey spheres provide the same information but for EAC. The green arrow points to north. CHC is denoted by a pyramid with a red stick on top, while EAC is marked with a cube topped by a grey stick. Each grid line is separated by approximately 25 km.

the concentration of eBC shows a substantial increase, with concentrations rising 10-fold from  $0.07 \mu\text{g m}^{-3}$  at 09:00 LT to  $0.65 \mu\text{g m}^{-3}$  at 12:00 LT (Fig. 6c).

At CHC, in the pre-dawn and early morning period (00:00–11:00 LT) the diurnal pattern of Polluted-CHC is very similar to that of Intense-NPF-CHC (Fig. 5). The main difference is that the wind has a more southerly component

in this case (Fig. 6g and q, red spheres), the maximum SA concentration is halved ( $6.05 \times 10^6 \text{ molec. cm}^{-3}$  at 10:00 LT, Fig. 6d), and the maximum  $J_4$  is a quarter of that calculated for Intense-NPF-CHC ( $2.17 \text{ cm}^{-3} \text{ s}^{-1}$  at 11:00 LT, Fig. 6f).

From 12:00 to 17:00 LT, the most notable difference to Intense-NPF-CHC is the influence of urban pollution from the city, with eBC levels peaking at  $0.65 \mu\text{g m}^{-3}$  at 12:00 LT



(Fig. 6c) and followed by larger Aitken particle concentrations ( $N_{40-100}$ ; maximum of  $5.82 \times 10^3 \text{ cm}^{-3}$  at 13:00 LT, Fig. 6h), reflecting the advection of polluted urban emissions. The short-range air mass analysis (< 4 h; Fig. 6r, red spheres) suggests that the air masses are indeed coming from close to the surface and from the area of EAC at 12:00 LT. As the afternoon progresses, a gradual decrease in pollution levels and particle concentrations is observed, indicating the dispersion of pollutants. The concentration of  $N_{13-40}$  peaks at  $12.8 \times 10^3 \text{ cm}^{-3}$  by 15:00 LT (Fig. 6h), while at the same time the eBC has plunged to  $0.22 \mu\text{g m}^{-3}$  (Fig. 6c). This suggests that the  $N_{13-40}$  is not the result of primary emission advected from EAC, which would exhibit elevated concentrations of eBC, but instead is due to an ongoing regional NPF process that was briefly interrupted by the localized emission from EAC.

In the evening transition from 18:00 to 23:00 LT (at CHC), incident SW radiation diminishes to  $4.70 \text{ W m}^{-2}$  by 18:00 LT (Fig. 6a), while temperatures drop down to  $-0.4 \text{ }^\circ\text{C}$  at 23:00 LT (Fig. S9), marking the establishment of the nighttime residual layer. Particle concentrations across all size ranges start to decline, with  $N_{100-440}$  reducing to  $0.36 \times 10^3 \text{ cm}^{-3}$  and  $N_{13-40}$  to  $4.25 \times 10^3 \text{ cm}^{-3}$  by 23:00 LT (Fig. 6h). The decrease in eBC to  $0.07 \mu\text{g m}^{-3}$  by 23:00 LT indicates a reduction in the advection of polluted air masses from the city (Fig. 6c). Our short-range analysis of air mass origins (< 4 h; red spheres in Fig. 6s) shows these air masses originate from the south, share a similar altitude with CHC, and are not affected by the pollution typically seen at EAC.

At EAC, comparing the diurnal patterns of the PNSD between Polluted-EAC and Intense-NPF-EAC reveals significant differences (Fig. 4d and m). Notably, the growth observed in Intense-NPF-EAC is absent in Polluted-EAC. The daytime maximum concentration of  $N_{4-13}$  ( $20.3 \times 10^3 \text{ cm}^{-3}$ , Fig. 6h) in Polluted-EAC is also reduced to one-fifth as compared to Intense-NPF-EAC. Furthermore, the decline in concentrations of larger particles  $N_{40-100}$  and  $N_{100-440}$  is delayed, occurring at 13:00 LT instead of 08:00 LT as observed in Intense-NPF-EAC, which correlates well with eBC and indicates higher levels of pollution in the morning at EAC as well. For example, at 12:00 LT the concentration of eBC is  $0.22 \mu\text{g m}^{-3}$  versus  $0.94 \mu\text{g m}^{-3}$  for Intense-NPF-EAC and Polluted-EAC, respectively.

Additionally, significant differences between Polluted-EAC and Intense-NPF-EAC are evident among the observed meteorological variables. For example, the minimum temperature before dawn is higher in Polluted-EAC compared to Intense-NPF-EAC ( $1.3 \text{ }^\circ\text{C}$  versus  $-0.6 \text{ }^\circ\text{C}$ , respectively, Figs. 6i and 5i) and the daily median WVMR ( $6.5$  versus  $3.4 \text{ g kg}^{-1}$ , Fig. S9). Moreover, in Polluted-EAC, the increase in wind speed starts later in the day, around 12:00 LT, while in Intense-NPF-EAC it becomes noticeable as early as 08:00 LT (see Figs. 6n and 5n). This difference likely explains why  $N_{40-440}$  concentrations take longer to decrease in Polluted-EAC than in Intense-NPF-EAC (previous para-

graph). Analyzing the short-term air mass history (< 4 h), we observe that at 12:00 LT air masses in Polluted-EAC originate from areas closer to the surface, while in Intense-NPF-EAC the air masses appear to originate from upper parts of the PBL, with source regions reaching altitudes comparable to CHC elevation (see Figs. 5r and 6r).

The observations consistently indicate weaker diurnal cycle in PBL height in Polluted-EAC, which contrasts with the conditions in Intense-NPF-EAC. Specifically, the PBL in Polluted-EAC grows at a slower rate and does not reach the same PBL height as in Intense-NPF-EAC. This delay is attributed to a higher proportion of insolation being used for latent heat processes, as evidenced by a higher WVMR, unlike the drier conditions in Intense-NPF. Furthermore, the pre-dawn measurements show that the temperature is higher and the concentrations of  $N_{40-440}$  and eBC are lower in Polluted-EAC compared to Intense-NPF-EAC ( $9.85 \times 10^3$  versus  $17.4 \times 10^3 \text{ cm}^{-3}$  for  $N_{40-440}$  and  $2.49$  versus  $4.67 \mu\text{g m}^{-3}$  for eBC, respectively). These differences suggest a deeper nocturnal layer in Polluted-EAC, which facilitates the dilution of pollutants more effectively than in Intense-NPF-CHC. In the latter scenario, higher pollutant concentrations likely result from their accumulation due to a shallower PBL. Additionally, increased cloudiness in Polluted-EAC (Fig. S6) contributes to both reduced nocturnal cooling and diminished daytime surface heating. This results in a less stable surface layer at night that is less prone to pollution accumulation and a shallower PBL during the day that takes longer to dilute pollutants.

The formation rate  $J_4$  in Polluted-EAC reaches its peak at 13:00 LT ( $9.2 \text{ cm}^{-3} \text{ s}^{-1}$ , Fig. 6m) and is only one-fifth of the peak value estimated at Intense-NPF-EAC. At this time (13:00 LT) the calculated CS is considerably reduced from  $16.8 \times 10^{-3} \text{ s}^{-1}$  (11:00 LT) to  $9.8 \times 10^{-3} \text{ s}^{-1}$  (Fig. 6l), which is comparable with the CS at Intense-NPF-EAC at the same time ( $10.5 \times 10^{-3} \text{ s}^{-1}$ ; Fig. 5l). However, the peak  $J_4$  is still 4 times lower than at this same time on Intense-NPF-EAC ( $9.18$  versus  $32.8 \text{ cm}^{-3} \text{ s}^{-1}$ , Figs. 5m and 6m). Therefore, the difference between  $J_4$  does not seem to be explained by higher losses and may indicate differences in the chemical environment between these two categories that favors increased nucleation and growth during Intense-NPF-EAC. The fact that incident SW radiation is similar (only measured at CHC but expected to be representative of both locations) at this time between these two categories ( $878$  versus  $913 \text{ W m}^{-2}$  for Polluted-CHC and Intense-NPF-CHC, respectively) suggests that different rates of photons and subsequent photooxidation do not explain the above-mentioned difference in  $J_4$  (under the hypothesis of a similar chemical environment). The different provenance of the air masses in the short-, medium-, and long-range between Polluted-EAC and Intense-NPF support the hypothesis of a differentiated chemical environment, with Polluted-EAC receiving air masses from the southeastern edge of the Altiplano and Intense-NPF-EAC receiving air masses from the west-

ern central Altiplano (Figs. 6p–s and 9). The hypothesis can be further supported by the measured SA at CHC at 13:00 LT (potentially representative of EAC under the assumption the  $\text{SO}_2$  is not locally emitted but transported), which is only one-fifth as high in Polluted as compared to Intense-NPF ( $1.67 \times 10^6$  versus  $9.02 \times 10^6$  molec.  $\text{cm}^{-3}$ , respectively).

### Similarities and differences

The atmospheric conditions at EAC and CHC are different between EAC and CHC are different between the Polluted and Intense-NPF category, especially during the daytime. In Intense-NPF, the predominant and synoptic westerly wind direction, combined with the south-to-north alignment of EAC and CHC, implies that air masses originating from the Altiplano simultaneously affect both stations with reduced direct air exchange between them (Fig. 9). However, in the Polluted category, the southerly short-range wind direction implies that the air masses reach the stations in sequence: first EAC arrives, which is followed by the same air mass enriched by air pollution from EAC (or more specifically the La Paz–El Alto conurbation, i.e., the orange polygon in Fig. 1) that reaches CHC shortly after. This is evident in the noon eBC peak observed at CHC that happens while a downward eBC trend is observed in EAC (concentrations 0.94 and 0.65  $\mu\text{g m}^{-3}$  at 12:00 LT, respectively). Furthermore, it should be mentioned that we observe not only a peak in eBC but also peaks in particle-phase organics, nitrate, and ammonium, all of which are indicators of anthropogenic pollution (1.4, 0.52, 0.57  $\mu\text{g m}^{-3}$ , respectively; Fig. S11).

Despite the differences between Intense-NPF and Polluted, in Polluted we still observe nucleation at both locations (calculated max  $J_4$  is 9.2 and 2.2  $\text{cm}^{-3} \text{s}^{-1}$  for EAC and CHC, respectively). Furthermore, it could be argued that at CHC, if we discard the hours when intense city pollution is observed, we observe a regional NPF event with nucleation and growth in the morning and the resulting growing mode upwind late in the afternoon. Based on this assumption, the final size of the particles is smaller than that observed in the case of Intense-NPF-CHC. For example, at 17:00 LT the center of the observed growing mode is 31.6 nm at Intense-NPF-CHC and only 22.4 nm at Polluted-CHC. This is likely the result of a different chemical environment with different source regions (Fig. 9). For example, the maximum concentration of SA, which happens at 10:00 LT in both scenarios, is lower during Polluted-CHC compared to Intense-NPF-CHC ( $6.05 \times 10^6$  and  $12.8 \times 10^6$  molec.  $\text{cm}^{-3}$ , respectively).

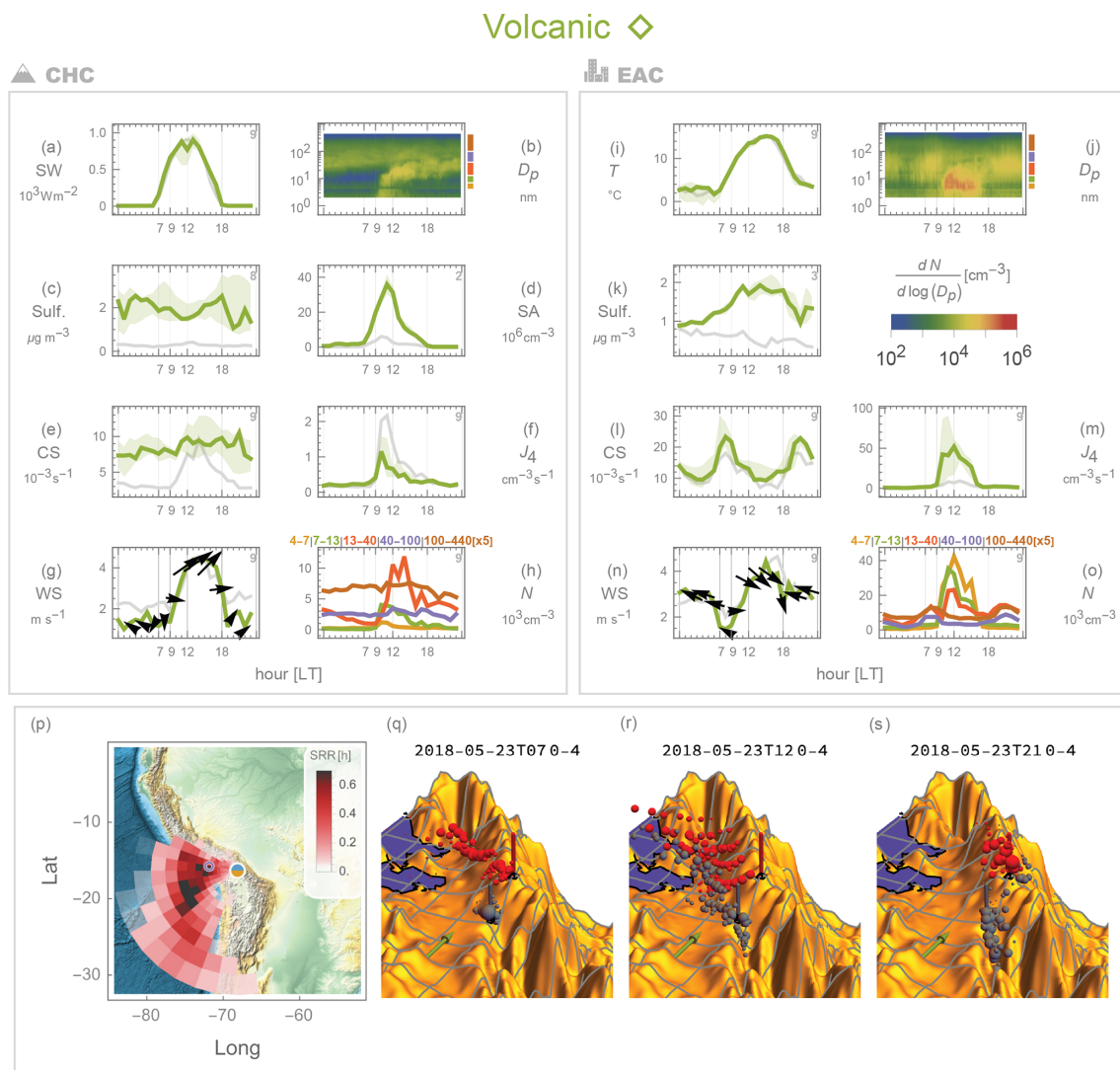
### 4.3 Volcanic category

The Volcanic category consists of a total of 9 d. During these days, at both locations the FLEXPART air mass analysis shows that the air masses come from the northern Altiplano, but intrusions from lowland regions north of CHC and EAC are also common, either in the medium range through the

Sorata Valley or in the medium range via the valley to the north in the eastern ridge of the Altiplano (Fig. 9). Even though air masses traverse the Altiplano on their way to CHC and EAC, the high values of RH recorded during these days when compared to Intense-NPF further hints at the stronger influence of humid air masses from the lowlands (75 % versus 45 % for Volcanic- and Intense-NPF-EAC and 54 % versus 34 % for Volcanic- and Intense-NPF-CHC, respectively; Fig. S9). The most outstanding feature during these days is the observed high concentration of sulfate (and aerosol total volume) at both EAC and CHC. At EAC, it is generally high, with a daily median of 1.34  $\mu\text{g m}^{-3}$ , and particularly high between 10:00 and 18:00 LT (1.80  $\mu\text{g m}^{-3}$ ). At CHC a constant high value is observed through the day with a median of 1.94  $\mu\text{g m}^{-3}$  (Fig. 7 and Table 1). Furthermore, a comparatively high and constant median value of CS is present before 10:00 LT (i.e., before the growing particles influence the CS) at CHC ( $7.7 \times 10^{-3}$  versus  $3.3 \times 10^{-3} \text{s}^{-1}$  for Volcanic-CHC and Intense-NPF-CHC, respectively). Finally, the highest peak of SA is observed in this category at CHC ( $35.9 \times 10^6$  molec.  $\text{cm}^{-3}$  at 11:00 LT), although SA measurements were available on only 3 of the 9 d.

Nucleation that occurred at both CHC and EAC stations was identified on 8 and 9 d (respectively) in our traditional classification. Subsequent growth was observed in 6 and 7 d at EAC and CHC, respectively (Fig. S4). At CHC, the high concentration of SA does not translate into a correspondingly intense  $J_4$ . For instance, at Volcanic-CHC, the median noon values for SA and  $J_4$  are 24.4  $\times 10^6$  molec.  $\text{cm}^{-3}$  and 0.7  $\text{cm}^{-3} \text{s}^{-1}$ , respectively. In contrast, at Intense-NPF-CHC, these values are 9.47  $\times 10^6$  molec.  $\text{cm}^{-3}$  for SA and 6.2  $\text{cm}^{-3} \text{s}^{-1}$  for  $J_4$ . The smaller  $J_4$  from higher SA concentrations in Volcanic-CHC is qualitatively in agreement with higher CS ( $10.0 \times 10^{-3}$  versus  $7.6 \times 10^{-3} \text{s}^{-1}$ ). The discrepancy between Volcanic and Intense-NPF remains also when only the days with available SA data are compared (noon medians for 3 Volcanic days: SA = 24.4 molec.  $\text{cm}^{-3}$ ,  $J_4 = 0.4 \text{cm}^{-3} \text{s}^{-1}$ , CS = 11.4  $\times 10^{-3} \text{s}^{-1}$ ; noon medians for 10 Intense-NPF days: SA = 9.47 molec.  $\text{cm}^{-3}$ ,  $J_4 = 5.5 \text{cm}^{-3} \text{s}^{-1}$ , CS = 6.7  $\times 10^{-3} \text{s}^{-1}$ ). Whether other factors are needed to explain the drastic difference in  $J_4$  remains unexplained. One hypothesis is that the absence of other required nucleating bases (e.g.,  $\text{NH}_3$ ; Zha et al., 2023a) may contribute to the lower  $J_4$  values. We have found that during nucleation at CHC the ratio between  $N_{2-4}^-$  and  $N_{2-4}^+$  is reduced to 0.02 (it is 0.37 for the rest of the days; Fig. S17). This change in ratio is not observed at EAC and remains constant at  $\sim 1.14$ . Higher RH may also play a role, but the effects of RH in formation rates are varied across different studies (Kerminen et al., 2018).

At CHC, the diurnal pattern reveals notable similarities in particle formation between Volcanic-CHC and Intense-NPF-CHC during the predawn and early morning hours (00:00–11:00 LT). According to the PNSD, both locations exhibit a similar nucleation process and early growth phase. This pro-



**Figure 7.** Main characteristics of the Volcanic category. Panels (a)–(h) and (i)–(o) provide information on diurnal median values of key variables at CHC and EAC, respectively. The shading shows the inter-quantile range, and the grey line is the median of all categories (shown for comparison). The upper-right grey integers mark the number of available days for the given variable. Panels (g) and (n) show the wind speed, and the arrows point to the median direction (up means wind coming from south to north, and right means wind coming from west to east). Panels (h) and (o) show the concentration at different ranges color coded and specified in the legend above. Panel (p) shows the median long-range air mass origins for CHC (source–receptor relationship; SRR). The sky-blue half-disk represents the location of CHC (with EAC in orange close to the same location). The lilac circle marks the location of the Sabancaya volcano. The EAC long-range air mass origin is very similar and is presented in Fig. 9. Panels (q)–(s) depict the short-range (< 4 h) air mass origins for a representative day at three key hours: 7, 12, and 21 (see Sect. 3 for calculation). The red spheres indicate the location of the air mass arriving at CHC, with their size representing the quantity and/or duration of air tracers in that location. The grey spheres provide the same information but for EAC. The green arrow points to north. CHC is denoted by a pyramid with a red stick on top, while EAC is marked with a cube topped by a grey stick. Each grid line is separated by approximately 25 km.

cess starts at approximately 09:00 LT with a growth rate for  $GR_{4-7}$  of about  $6.5 \text{ nm h}^{-1}$  (Table S1). However, the process is much less intense in Volcanic-CHC. This less intense NPF process is also reflected in a smaller  $J_4$  (as noted above), resulting in a reduction in the maximum concentration  $N_{7-13}$  and  $N_{13-40}$  ( $11.9 \times 10^3$  and  $30.5 \times 10^3 \text{ cm}^{-3}$  at Volcanic- and Intense-NPF-CHC, respectively). The incident SW radi-

ation pattern is also similar during the early morning, which depicts clear-sky conditions; however, after 09:00 LT small perturbations are observed at Volcanic-CHC, indicating the presence of clouds (Fig. 7a), and furthermore the observed CF at 14:00 LT is 59% (Fig. S6). Another important difference from Intense-NPF is found in  $N_{100-440}$ . This value remains relatively constant during the day. At Volcanic-CHC it

is twice as high as at Intense-NPF-CHC, with daily median values of  $1.38 \times 10^3$  and  $0.63 \times 10^3 \text{ cm}^{-3}$ , respectively. The higher concentration of  $N_{100-440}$  particles, and notably in the overall particle mass, likely stems from primary emissions of the Sabancaya volcano or from particles formed secondarily through the reaction of  $\text{SO}_2$  emitted by the volcano during its transport to CHC. Our air mass origin analysis reveals that the SRR contribution from a 50 km radius zone centered around Sabancaya exceeds others by over 5 times (SRR = 0.5 h, not shown). The increased CF during these days may also contribute to in-cloud aqueous-phase conversion of  $\text{SO}_2$  to sulfate. Regarding the local meteorology, the daytime wind patterns are similar to Intense-NPF-CHC in terms of both speed and direction (Figs. 5g and 7g).

At EAC, the diurnal patterns of Volcanic-EAC and Intense-NPF-EAC (Fig. 4m and q) show consistently similar characteristics. Specifically, the maximum diurnal concentration of small particles  $N_{4-7}$  and  $N_{7-13}$  exhibit remarkable similarity between the two categories ( $42.3 \times 10^3$  and  $35.3 \times 10^3 \text{ cm}^{-3}$  at Volcanic-EAC, and  $48.8 \times 10^3$  and  $39.9 \times 10^3 \text{ cm}^{-3}$  at Intense-NPF-EAC, respectively). This similarity in the smallest sizes is also reflected in comparable  $J_4$  ( $52.1$  versus  $50.7 \text{ cm}^{-3} \text{ s}^{-1}$  for Volcanic-EAC and Intense-NPF-EAC, respectively). However, at the intermediate sizes  $N_{13-40}$ , the number concentration in Volcanic-EAC is similar to Intense-NPF-EAC only until noon. After this point it is significantly lower, particularly during the early afternoon (14:00 LT) when the concentration is halved ( $13.4 \times 10^3$  versus  $30.9 \times 10^3 \text{ cm}^{-3}$ ). Furthermore, in the larger sizes  $N_{100-440}$ , the pattern is reversed, with the concentration at Volcanic-EAC slightly exceeding that observed at Intense-NPF-EAC ( $1.38 \times 10^3$  versus  $1.12 \times 10^3 \text{ cm}^{-3}$ , respectively). This is consistent with an almost tripled mass concentration of sulfates in Volcanic-EAC versus Intense-NPF-EAC ( $1.93$  versus  $0.77 \mu\text{g m}^{-3}$  at 14:00 LT).

Meteorologically, both Volcanic-EAC and Intense-NPF-EAC experience similar wind speeds throughout the day, diverging in wind direction before 09:00 LT; Volcanic-EAC shows a southwestern flow, while Intense-NPF-EAC has a northwestern one. This early morning variation also impacts RH, with Volcanic-EAC exhibiting higher levels than Intense-NPF-EAC (92 % versus 69 % before sunrise). These differences are attributed to Intense-NPF-EAC receiving a drier air mass from the northern mountains (near CHC), while Volcanic-EAC is influenced by a humid air mass from the La Paz Valley. The moist conditions at Volcanic-EAC likely slow the PBL morning development due to higher surface latent heat fluxes, delaying pollutant dilution. This is also reflected in the CS values measured at 10:00 LT:  $21.7 \times 10^{-3} \text{ s}^{-1}$  for Volcanic-EAC and  $15.9 \times 10^{-3} \text{ s}^{-1}$  for Intense-NPF-EAC.

## Similarities and differences

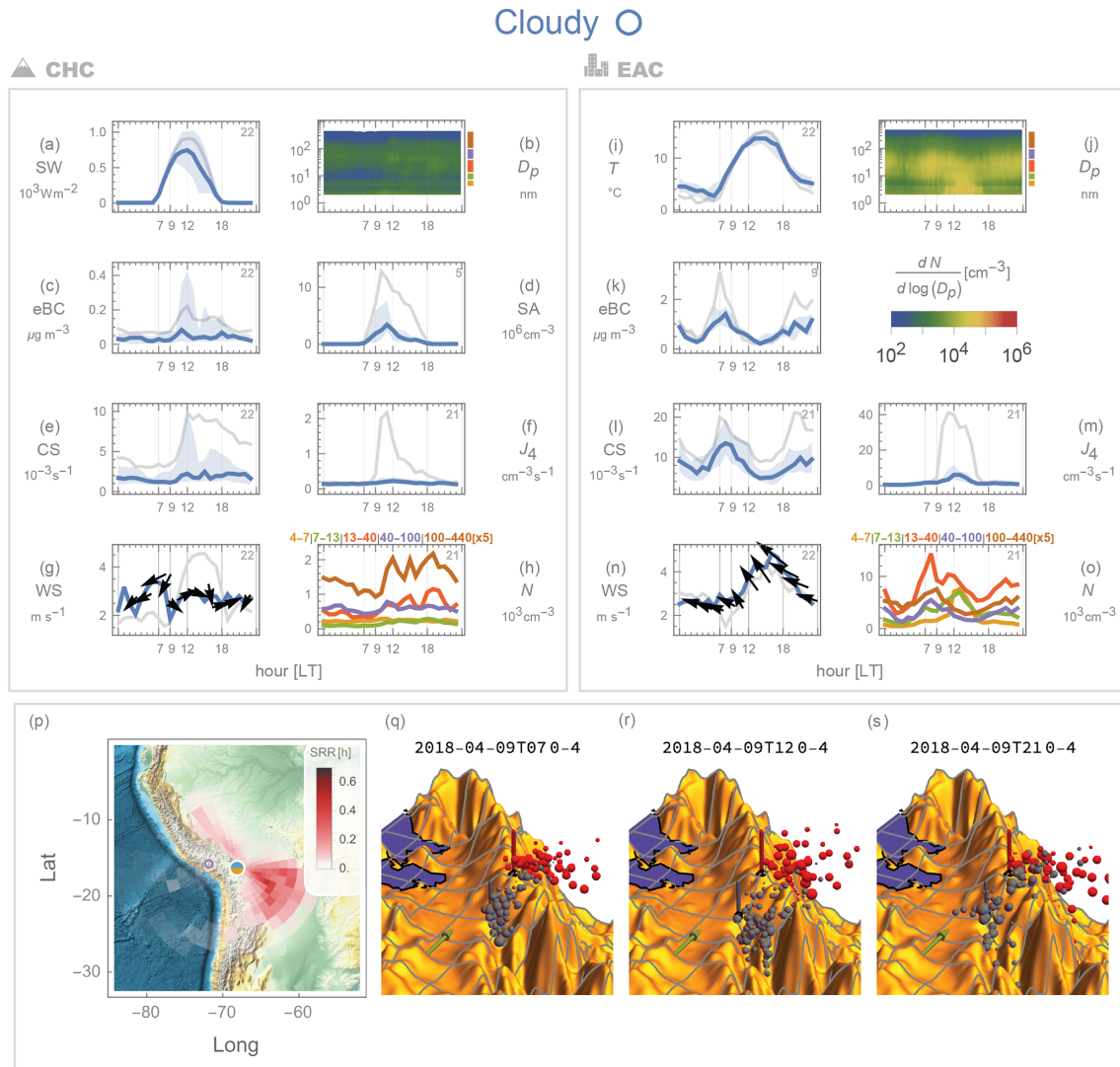
The comparison between CHC and EAC within Volcanic shows similarities to Intense-NPF, with a distinct NPF process observed at CHC and pronounced nucleation and growth at EAC in both categories. However, a key difference is the  $J_4$  ratio between CHC and EAC: 1 to 5 in Intense-NPF and 1 to 50 in Volcanic. This suggests that in this environment volcanic conditions tend to reduce NPF intensity – as compared to Intense-NPF – more at CHC than at EAC. Before noon, the smaller-sized particles follow a similar pattern to that of  $J_4$  with, e.g., the maximum concentration of  $N_{4-7}$  reaching  $42.3 \times 10^3 \text{ cm}^{-3}$  versus  $1.19 \times 10^3 \text{ cm}^{-3}$  at EAC and CHC, respectively. These differences are significantly higher than in Intense-NPF, implying that urban NPF is more affected by local emissions in Volcanic. Together, the results indicate that volcanic plumes do not result in as strong NPF events despite the prevalence of high SA possibly by higher CS (in both CHC and EAC), and this effect is exacerbated in CHC likely due to the limited availability of relevant gaseous precursors resulting from anthropogenic activities.

Afternoon particle measurements reveal a different pattern for the Aitken mode ( $N_{13-100}$ ), where the concentrations at EAC and CHC become similar in magnitude. For example, at 15:00 LT,  $N_{13-40}$  concentrations are  $7.11 \times 10^3 \text{ cm}^{-3}$  at CHC and  $11.5 \times 10^3 \text{ cm}^{-3}$  at EAC, and  $N_{40-100}$  concentrations are  $2.58 \times 10^3 \text{ cm}^{-3}$  at CHC and  $3.10 \times 10^3 \text{ cm}^{-3}$  at EAC. This similarity in magnitude between CHC and EAC in the afternoon is also observed in Intense-NPF. A likely explanation for this shift is that morning conditions favor local NPF at EAC (higher nucleation mode,  $N_{7-13}$ , concentrations), but as the day evolves and the PBL deepens, both stations likely share the same air mass (Fig. 7r). Consequently, the similarities observed between the stations in afternoon particle number concentrations, specifically in the growing NPF mode size range, suggest they are the result of regional NPF events within the well-mixed and deep PBL.

## 4.4 Cloudy category

Finally, we briefly discuss the last category denoted Cloudy. A total of 22 d belong to this category, which is characterized by a predominance of overcast days (Fig. 8a) and frequent cloud coverage in the domain (Fig. S6). At both locations, the FLEXPART air mass history analysis (Fig. 8p) shows that air masses originate in the lowlands situated to the east of the stations, encompassing both the northern (western Amazonia) and southern (Chaco) regions. This group stands out from the others because of its elevated relative humidity (median values of 75 % and 73 % for EAC and CHC, respectively). Nucleation is observed on most days at EAC (20) but only on 7 d at CHC. Growth is observed on 2 d at both stations (Fig. S4).

At CHC, the PNSD (see Fig. 1g) shows diminished particle concentrations across all sizes throughout the day com-



**Figure 8.** Main characteristics of the Cloudy category. Panels (a)–(h) and (i)–(o) provide information on diurnal median values of key variables at CHC and EAC, respectively. The shading shows the inter-quantile range, and the grey line is the median of all categories (shown for comparison). The upper-right grey integers mark the number of available days for the given variable. Panels (g) and (n) show the wind speed, and the arrows point to the median direction (up means wind coming from south to north, and right means wind coming from west to east). Panels (h) and (o) show the concentration at different ranges color coded and specified in the legend above. Panel (p) shows the median long-range air mass origins for CHC (source–receptor relationship; SRR). The sky-blue half-disk represents the location of CHC (with EAC in orange close to the same location). The lilac circle marks the location of the Sabancaya volcano. The EAC long-range air mass origin is very similar and is presented in Fig. 9. Panels (q)–(s) depict the short-range (< 4 h) air mass origins for a representative day at three key hours: 7, 12, and 21 (see Sect. 3 for calculation). The red spheres indicate the location of the air mass arriving at CHC, with their size representing the quantity and/or duration of air tracers in that location. The grey spheres provide the same information but for EAC. The green arrow points to north. CHC is denoted by a pyramid with a red stick on top, while EAC is marked with a cube topped by a grey stick. Each grid line is separated by approximately 25 km.

pared to the other categories. Similarly, the SA concentration is also lowest of the four categories (diurnal maximum is  $3.44 \times 10^6$  molec.  $\text{cm}^{-3}$ ), likely due to lower photochemical activity and/or possibly lower  $\text{SO}_2$  concentrations (not measured).

At EAC, the observed diurnal pattern closely resembles Polluted-EAC both in the meteorology and in the PNSD. Fur-

thermore, a comparable  $J_4$  is observed ( $6.1 \text{ cm}^{-3} \text{ s}^{-1}$ ). The primary difference between Cloudy-EAC and Polluted-EAC is the earlier increase in wind speed observed at Cloudy-EAC. For instance, by 12:00 LT the wind speed at Cloudy-EAC reaches  $3.7 \text{ m s}^{-1}$ , while at Polluted-EAC it is only  $2.5 \text{ m s}^{-1}$ . This translates into an early decrease in CS at Cloudy-EAC beginning at 09:00 LT (Fig. 8l). At Polluted-

EAC, this decrease does not start until after 12:00 LT (Fig. 6l).

In this category, we notice a distinct pattern not seen in the others. During the afternoon, Aitken mode particle concentrations are not similar at the two stations. Instead, concentrations are significantly higher at EAC compared to CHC. Specifically, for  $N_{13-40}$  and  $N_{40-100}$ , the concentrations at EAC are  $5.3 \times 10^3$  and  $1.6 \times 10^3 \text{ cm}^{-3}$ , respectively, while at CHC they are only  $0.6 \times 10^3 \text{ cm}^{-3}$  in both size ranges. This discrepancy suggests two possibilities: either the mixing layer does not extend as high as CHC, isolating it more from surface influence, or the air masses have different sources. The air mass analysis supports both ideas, indicating minimal surface influence in this category (not shown) and air masses arriving at CHC via the northwest ridge and at EAC via the La Paz Valley southeast of the city (Fig. 9). Furthermore, both EAC and CHC share the same long-range origin for their air masses ( $> 200 \text{ km}$ ; Fig. 9). However, nucleation events are seen at EAC and not at CHC, suggesting that EAC likely has a sufficient concentration of precursor gases from local emissions to support this level of nucleation activity, even in the absence of a regional NPF event.

## 5 Summary and conclusions

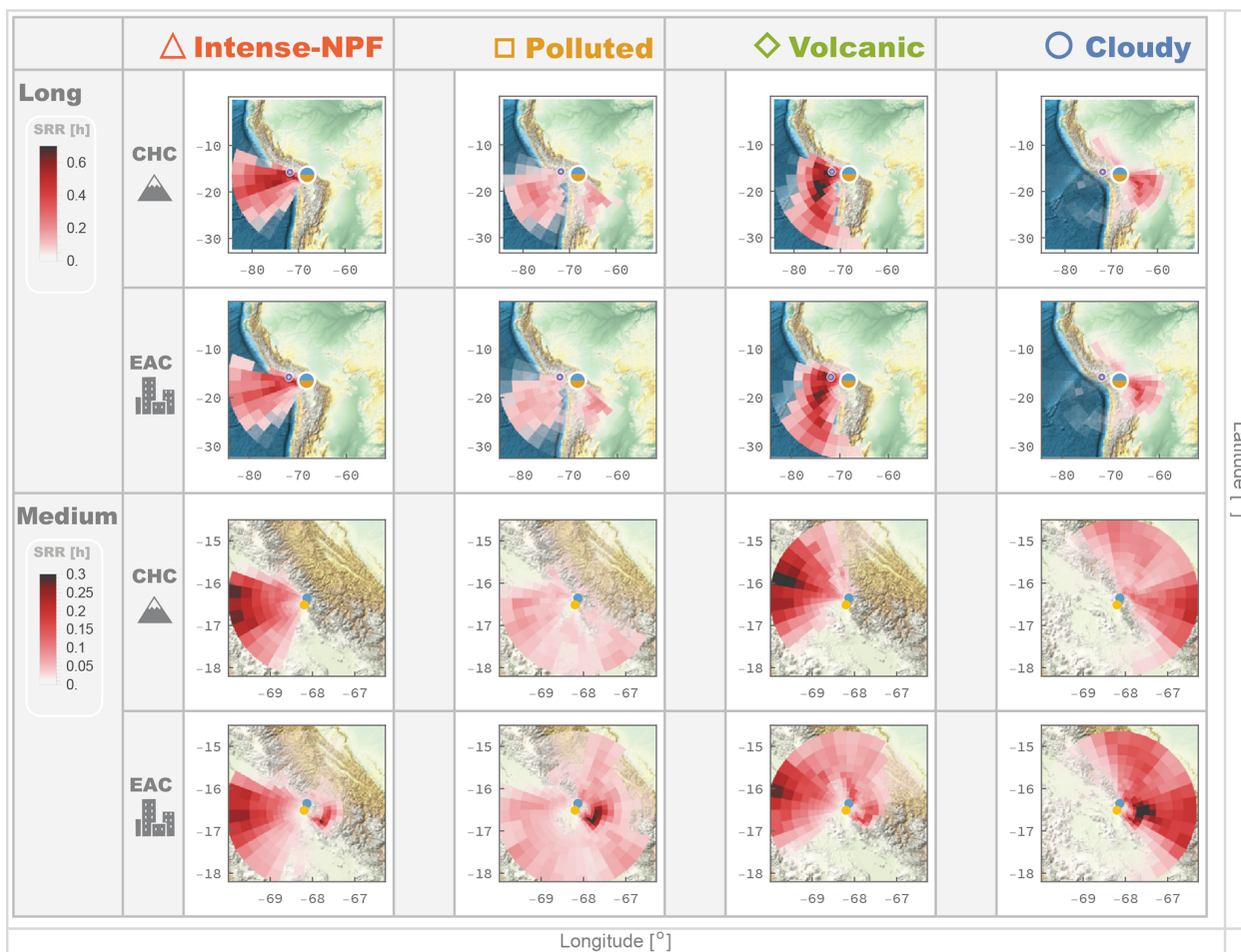
Our study examines NPF in the Andes, specifically around the eastern edge of the Bolivian central Altiplano, likely representative of similar Andean regions. This is the first regional analysis to simultaneously compare NPF events at two interconnected sites with different altitudes: EAC, an urban site on the eastern edge of the Altiplano, and CHC, a mountain site in the Andean Cordillera Real range (19 km north of EAC). This dual-site approach allowed us to explore several aspects of NPF in the Andean highlands, including how NPF characteristics vary with altitude, the impact of volcanic degassing, and anthropogenic influences from nearby urban areas. We combined the recently developed “nanoparticle ranking analysis” (Aliaga et al., 2023) with  $k$ -means clustering to categorize days based on the intensity of NPF (determined as the daily maximum  $N_{4-7}$ ) simultaneously observed at CHC and EAC. We obtained four significantly different categories of days named based on their emergent characteristics at both sites: (1) Intense-NPF, (2) Polluted, (3) Volcanic, and (4) Cloudy. These four categories allowed us to conduct a detailed exploration of the impact of meteorology, SA (only CHC), and volcanic degassing on the formation of new particles in the region and to compare the NPF processes observed in EAC and CHC (Table 1). We have found that the intensity of NPF events varies depending on the geographical location, the level of anthropogenic influence, and/or the elevation, with EAC experiencing stronger events compared to CHC (about an order of magnitude greater but enhanced during Volcanic and reduced during Polluted). This indicates that the characteristics of NPF in the region are likely influ-

enced by local anthropogenic activities and/or surface influences. The two stations we considered vary in altitude and local pollution levels, complicating our understanding of how NPF intensity would appear in a station differing in only one of these aspects. For instance, it remains uncertain what the NPF intensity would be at a station with the same altitude as EAC but without high levels of precursor emissions from anthropogenic activities (background Altiplano). We hypothesize that the intensity at such a station would likely fall between those observed at EAC and CHC.

We have observed that NPF events typically begin around 09:00 LT at CHC and 09:30 LT at EAC, indicating a consistent pattern of event initiation. While the specific triggers for NPF event onset are not yet fully understood, our findings suggest that multiple factors may play a role. At CHC, factors such as increased solar radiation and surface influence appear to influence the onset of NPF events. Conversely, at EAC factors such as increased solar radiation, changes in wind direction (from easterlies to westerlies), decreases in RH, and the intrusion of air masses from above the stable nocturnal PBL contribute to event initiation. Almost all of these factors are correlated and modulated by solar activity.

We observed that intense NPF events (Intense-NPF) occur under different atmospheric conditions at each site. At EAC, they begin in a rapidly growing PBL, where the entrainment of cleaner air from above mixes with polluted air from local emissions. At CHC, they start in a regional residual layer, increasingly influenced by regionally surface-influenced air masses due to anabatic winds. In both cases, air masses from the Altiplano play a key role, with the events eventually merging to form a regional mixture across the PBL. This indicates that the formation of NPF events is not confined to specific atmospheric layers but rather involves complex interactions across different layers of the atmosphere. We do not observe any event in the free troposphere during event days and over most of the period (except for brief periods at dawn), which suggests that CHC in our air mass analysis is heavily influenced by the residual layer.

At EAC, a daytime increase in nucleation mode particle concentrations is observed every day regardless of air mass origin. This increase during daytime is likely not the result of primary emissions from anthropogenic emissions as it is anticorrelated with other markers of anthropogenic pollution such as eBC. This is likely a result of the combined effect of precursors emitted from anthropogenic activities and/or (less likely) precursors emitted from the surface that rapidly photo-oxidate and nucleate with increased radiation and rapidly increase in concentration. The intensity of the NPF process does, however, vary with air mass origin. Formation rates are considerably lower when air masses arrive from the La Paz Valley ( $J_4^{\text{Polluted}} = 9.2 \text{ cm}^{-3} \text{ s}^{-1}$ ;  $J_4^{\text{Cloudy}} = 6.1 \text{ cm}^{-3} \text{ s}^{-1}$ ) and are increased when the air masses come from the Altiplano ( $J_4^{\text{Intense-NPF}} = 50.7 \text{ cm}^{-3}$ ;  $J_4^{\text{Volcanic}} = 52.1 \text{ cm}^{-3} \text{ s}^{-1}$ ).



**Figure 9.** The median of the origins of the air masses directed towards CHC and EAC for each category. The top two rows provide an overview of the long-range air mass patterns associated with CHC and EAC. The bottom two rows present a detailed view of the air mass patterns specific to CHC and EAC, respectively. CHC and EAC are shown by a sky-blue and orange (half-)disk, respectively. The Sabancaya volcano is marked by a lilac circle. The color-coded cells show the magnitude of that source–receptor relationship ( $SRR = n \times r$ ) at that cell, which quantifies the number ( $n$ ) of passive air tracers at the cell multiplied by their residence time ( $r$ ) integrated over the previous 4 d. A cell with a value of 1 h would mean that all the air tracers spent the last 4 h at that cell.

Increased volcanic influence does not modify the observed formation rate. Finally, on 41 % of the observed days (Intense-NPF and Volcanic), the daytime population of  $N_{4-13}$  particles reached approximately  $1 \times 10^6 \text{ cm}^{-3}$ . This poses potential health risks (Pedata et al., 2015) to the densely populated conurbation of El Alto–La Paz.

At CHC, a new nucleation mode is observed often but not always (74 % of observed days) and is sensitive to air mass origin, with fewer events observed when the air masses come from the lowlands (Cloudy). The intensity of NPF is also sensitive to air mass origins with higher formation rates observed when air masses are transported from the Altiplano ( $J_4^{\text{Intense-NPF}} = 7.7 \text{ cm}^{-3} \text{ s}^{-1}$ ). However, when these air masses are also influenced by the volcanic activity, formation rates are drastically reduced ( $J_4^{\text{Volcanic}} = 1.2 \text{ cm}^{-3} \text{ s}^{-1}$ ). The absence of a stabilizing base cluster may play a cru-

cial role in this aspect, as during these days the concentration  $N_{2-4}^+$  is drastically reduced ( $N_{2-4}^{\text{Volcanic}} = 19 \text{ cm}^{-3}$ ;  $N_{2-4}^{\text{Intense-NPF}} = 123 \text{ cm}^{-3}$ ).

The anthropogenic influence from the city plays a role in interrupting observed events at CHC (Polluted). During these days, an ongoing event is interrupted at noon ( $J_4^{11:00\text{LT}} = 2.2$ ;  $J_4^{13:00\text{LT}} = 0.9 \text{ cm}^{-3} \text{ s}^{-1}$ ). Between 12:00 and 15:00 LT, similar values of eBC and slightly higher  $N_{40-440}$  are observed at CHC compared to EAC. A shallower PBL than Intense-NPF and transport dominated by thermally driven winds prevails during these days. The fact that the arrival of this plume, with potentially less entrainment from the layer above the PBL that reduces the intensity of NPF, seems to suggest that the intensity of NPF events benefits from entrainment (e.g., SA is reduced from  $6.1 \times 10^3 \text{ molec. cm}^{-3}$  at 10:00 LT to  $1.7 \times 10^3 \text{ molec. cm}^{-3}$  at 13:00 LT). Increased CS does

not seem to explain the sudden reduction in formation rates as it is comparable in magnitude to the same time during Intense-NPF when the formation rates are 7 times higher.

The ongoing NPF process does not result in an increase in accumulation mode particles (100–440 nm) across any category or site. At CHC, increases are only observed during Polluted days at 12:00 LT, likely from advection of anthropogenic-influenced air masses from the city. The necessary growth rate would need to be around  $25 \text{ nm h}^{-1}$ , well beyond the observed  $\sim 7 \text{ nm h}^{-1}$ . Typically, any increase in particles  $> 40 \text{ nm}$  before the early afternoon is likely due to primary emissions or changing air masses, not NPF.

However, in the late afternoon, we do see a significant increase in larger Aitken mode particles (40–100 nm) during Intense-NPF days (which accounts for 36 % of the total measured days), suggesting a link to the ongoing NPF process and coinciding with the observed growth rate. At EAC, it increases from  $3.2 \times 10^3 \text{ cm}^{-3}$  at 04:00 LT to  $4.9 \times 10^3 \text{ cm}^{-3}$  at 17:00 LT, although this increase may be overestimated due to primary emissions from the city. At CHC, the count rises 6-fold from  $1.1 \times 10^3 \text{ cm}^{-3}$  at 08:00 LT to  $6.2 \times 10^3 \text{ cm}^{-3}$  at 16:00 LT. Given that these particles form between 4 and 5.5 km a.s.l. in altitude and likely drift over the eastern lowlands, they could impact the region's climate by modifying cloud properties.

To conclude, NPF in this region is frequent and intense compared to other locations around the globe (Kerminen et al., 2018; Sellegri et al., 2019), occurring in both urban polluted environments and at mountaintop sites. It is primarily driven by air masses originating from or passing over the Altiplano, coinciding with synoptic conditions that favor clear skies and dry conditions. In contrast, NPF is significantly diminished when air masses originate from the lowlands (Amazon and Chaco). In the mountaintop region, the main driving mechanism is likely sulfuric acid–ammonia nucleation (Zha et al., 2023a), while in the city local emissions enhance formation rates possibly through amines or other basic stabilizers. At both sites, events are typically observed uninterruptedly throughout the day and consistently reach sizes between 40 and 100 nm.

**Code availability.** The source code for the FLEXPART-WRF model v3.3.2 (Brioude et al., 2013) used in this study can be downloaded from <https://git.nilu.no/flexpart/flexpart-wrf> (last access: 5 December 2024). We modified parts of the original code to adapt it to the complex topography of the domain. The modified source code can be downloaded from <https://doi.org/10.5281/zenodo.5516295> (Aliaga, 2021). For a detailed description of how this model was ran, please see Aliaga et al. (2021).

The code used to perform the nanoparticle ranking analysis can be downloaded from <https://doi.org/10.5281/zenodo.10231522> (Aliaga, 2023). For a detailed description of the nanoparticle ranking analysis, please see Aliaga et al. (2023).

**Data availability.** Both the WRF and FLEXPART raw output datasets for EAC and CHC are available upon request (size is on the order of terabytes). The clustered output from FLEXPART, measured particle number size distributions, aerosol chemical compositions, and ancillary data (for both CHC and EAC) can be obtained from <https://doi.org/10.5281/zenodo.14062976> (Aliaga, 2024).

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DA performed the analysis.

LH and SC performed the ACSM measurements during SALTENA and ACSM data preparation.

MA, PL, AW, RK, KS, and LB contributed to the development of the GAW station CHC.

FB, MK, CM, RK, PA, AW, MA, PL, KS, DA, and QZ contributed to the overall planning of the SALTENA campaign.

DA, SC, YG, LH, WH, AMK, VMB, CM, IM, WS, GU, FV, CW, CX, QA, and FB performed the measurements during the SALTENA campaign.

PP, DW, and RC provided valuable and significant input during the data analysis. FB, VAS, and RK conceived the study and led the overall scientific investigation.

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