

## Properties and Processing of Aviation Exhaust Aerosol at Cruise Altitude Observed from the IAGOS-CARIBIC Flying Laboratory

Mahnke, Christoph; Gomes, Rita; Bundke, Ulrich; Berg, Marcel; Ziereis, Helmut; Sharma, Monica; Righi, Mattia; Hendricks, Johannes; Zahn, Andreas; More Authors

**DOI**

[10.1021/acs.est.3c09728](https://doi.org/10.1021/acs.est.3c09728)

**Publication date**

2024

**Document Version**

Final published version

**Published in**

Environmental Science and Technology

**Citation (APA)**

Mahnke, C., Gomes, R., Bundke, U., Berg, M., Ziereis, H., Sharma, M., Righi, M., Hendricks, J., Zahn, A., & More Authors (2024). Properties and Processing of Aviation Exhaust Aerosol at Cruise Altitude Observed from the IAGOS-CARIBIC Flying Laboratory. *Environmental Science and Technology*, 58(16), 6945-6953. <https://doi.org/10.1021/acs.est.3c09728>

**Important note**

To cite this publication, please use the final published version (if applicable). Please check the document version above.

**Copyright**

Other than for strictly personal use, it is not permitted to download, forward or distribute the text or part of it, without the consent of the author(s) and/or copyright holder(s), unless the work is under an open content license such as Creative Commons.

**Takedown policy**

Please contact us and provide details if you believe this document breaches copyrights. We will remove access to the work immediately and investigate your claim.

# Properties and Processing of Aviation Exhaust Aerosol at Cruise Altitude Observed from the IAGOS-CARIBIC Flying Laboratory

Christoph Mahnke,\* Rita Gomes, Ulrich Bundke, Marcel Berg, Helmut Ziereis, Monica Sharma, Mattia Righi, Johannes Hendricks, Andreas Zahn, Andreas Wahner, and Andreas Petzold

Cite This: *Environ. Sci. Technol.* 2024, 58, 6945–6953

Read Online

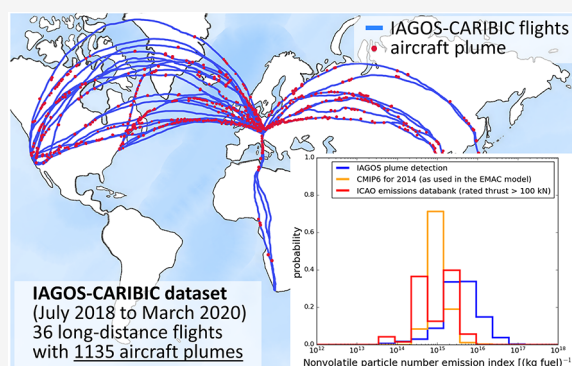
ACCESS |

Metrics & More

Article Recommendations

**ABSTRACT:** The characteristics of aviation-induced aerosol, its processing, and effects on cirrus clouds and climate are still associated with large uncertainties. Properties of aviation-induced aerosol, however, are crucially needed for the assessment of aviation's climate impacts today and in the future. We identified more than 1100 aircraft plume encounters during passenger aircraft flights of the IAGOS-CARIBIC Flying Laboratory from July 2018 to March 2020. The aerosol properties inside aircraft plumes were similar, independent of the altitude (i.e., upper troposphere, tropopause region, and lowermost stratosphere). The exhaust aerosol was found to be mostly externally mixed compared to the internally mixed background aerosol, even at a plume age of 1 to 3 h. No enhancement of accumulation mode particles (diameter >250 nm) could be detected inside the aircraft plumes. Particle number emission indices (EIs) deduced from the observations in aged plumes are in the same range as values reported from engine certifications. This finding, together with the observed external mixing state inside the plumes, indicates that the aviation exhaust aerosol almost remains in its emission state during plume expansion. It also reveals that the particle number EIs used in global models are within the range of the EIs measured in aged plumes.

**KEYWORDS:** aviation aerosol, aerosol particle, aircraft exhaust, aircraft plume, particle emission index, aviation soot, plume detection, IAGOS-CARIBIC



## 1. INTRODUCTION

Global civil aviation is a significant contributor to anthropogenic climate change through a complex series of processes that are primarily driven by emissions from aircraft gas turbines. These emissions include carbon dioxide (CO<sub>2</sub>), reactive nitrogen oxides (NO<sub>x</sub>), water vapor, carbonaceous and sulfate aerosols, and a mixture of gaseous hydrocarbon (HC) compounds. Lee et al.<sup>1</sup> provides an overview of the current understanding of the impact of civil aviation on climate change. The present study focuses on particulate matter emission and atmospheric processing, as their ability to form ice in contrails has a significant impact on the climate effects of aviation,<sup>2,3</sup> while some studies also argued for a potential impact on natural clouds.<sup>4–7</sup>

Aircraft gas turbine engines release ultrafine particles with diameters smaller than 100 nm, which are generated during the combustion of hydrocarbon fuels. The emitted aerosol contains primary carbonaceous particles, including black carbon (BC) and organic carbon (OC), commonly known as soot. These particles are formed during incomplete combustion. Additionally, the aerosol contains condensation particles that nucleate and condense in the cooling exhaust gas from

gaseous precursors, such as sulfuric acid and hydrocarbon vapors (for an overview, see Petzold et al.<sup>8</sup>). The emitted aerosol particles are classified into two groups based on their thermal stability: nonvolatile (which remains stable at temperatures above 250 °C) and volatile (which evaporates below 250 °C). For certification and regulation purposes of aircraft engines, this temperature threshold is currently set at 350 °C.<sup>9,10</sup> The nonvolatile mode refers to the carbonaceous particles generated from fuel combustion, while the volatile mode includes droplets composed of sulfur and organic compounds.

According to Petzold et al.,<sup>11</sup> the fraction of primary carbonaceous particles can be identified by a particle mode with a median diameter of 25 nm, as well as a weaker mode at 150 nm. The number of nonvolatile particles released per unit

Received: November 21, 2023

Revised: March 21, 2024

Accepted: March 21, 2024

Published: April 8, 2024



mass of fuel burned is heavily influenced by the type of fuel and aircraft engine technology used and has decreased significantly from the 1960s ( $2 \times 10^{15}$  particles per kg fuel) to the current engine technology (less than  $4 \times 10^{14}$  particles per kg fuel).<sup>12,13</sup>

The volatile aerosol has a modal diameter of approximately 10 nm, which varies depending on the age of the exhaust plume and atmospheric conditions. The number of particles formed depends on the fuel sulfur content.<sup>14</sup> Additionally, engine lubrication oil fumes are an important source for nonvolatile ultrafine particles.<sup>15</sup> Recent studies indicate that lubrication oil fumes are efficient nucleation agents, a source for volatile aerosol that will not be addressed by replacing traditional jet fuels with sustainable aviation fuels.<sup>16</sup> A key difference between sulfur acid-based volatile particles and aircraft soot particles is that volatile particles can increase in size through the condensation of gaseous compounds during the early stages of the exhaust plume,<sup>17</sup> whereas aviation soot particles remain almost at the same size. Soot particles can also serve as condensation nuclei for organic species and sulfuric acid and therefore affect the nucleation and growth of volatile particles.<sup>13</sup> Research aircraft studies conducted at cruising altitude have revealed that the growth of volatile particles continues within the jet regime for up to 10 s after the plume is released.<sup>14</sup>

During the early stages of the aircraft exhaust plume, volatile and nonvolatile particles interact through coagulation, which can result in a sulfuric acid coating on the hydrophobic aviation soot particles. Detailed studies on aircraft soot have demonstrated a significant increase in the ability of soot particles to act as cloud condensation nuclei as a result of this coating.<sup>18</sup> While contrail formation requires the activation of aviation soot particles for droplet formation and subsequent freezing, their role in the formation of anthropogenically perturbed cirrus clouds is not understood. However, aggregated aviation soot particles have been found in contrail ice crystals at a higher concentration than in natural cirrus.<sup>19</sup>

All available studies on the aerosol particle properties within the aircraft exhaust plume are based on measurements in engine testing facilities at ground level,<sup>20,21</sup> at airports<sup>22–24</sup> or on a few specialized research aircraft missions at cruise altitude.<sup>14,13</sup> All of these types of measurements are important for the analysis of aircraft exhaust aerosol chemical and physical properties and have their individual advantages and disadvantages. When measuring the exhaust aerosol at ground testing facilities or at airports, the aircraft engines are running under very different environmental conditions (e.g., air pressure and temperature) compared to cruising altitude. Due to the complexity of missions where a research aircraft is flying in the exhaust plume directly behind another aircraft, the number of measurements and tested engine types is limited. Furthermore, in both cases, only the very fresh aerosol particles with an age of a few seconds are observed. It is yet to confirm that the aerosol properties used in the inventories for global climate models, which are based on this kind of measurement, also represent the further aged aerosol particles in the dispersion phase of the aircraft exhaust plume (starting 2 min after emission)<sup>25</sup> at a scale that can be resolved by global models.

This study utilizes the IAGOS-CARIBIC data set (In-service Aircraft for a Global Observing System—Civil Aircraft for the Regular Investigation of the Atmosphere Based on an Instrument Container), which contains the aerosol micro-

physical measurements of randomly probed aircraft exhaust plumes that were crossed during 36 long-distance passenger aircraft flights to destinations worldwide.

## 2. METHODS AND INSTRUMENTATION

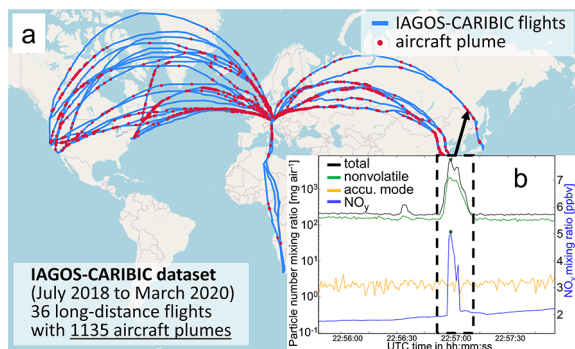
**2.1. IAGOS and the IAGOS-CARIBIC Flying Laboratory.** The European Research Infrastructure IAGOS ([www.iagos.org](http://www.iagos.org)) provides a long-term observation platform for measuring the composition of the atmosphere within the major global flight corridors at altitudes up to 13 km. IAGOS uses the two complementary approaches, IAGOS-CORE and IAGOS-CARIBIC. IAGOS-CORE operates automated instruments on a fleet of long-haul aircraft for the continuous measurement of the essential climate variables ozone, carbon monoxide, nitrogen oxides, carbon dioxide, methane, water vapor, aerosol, and clouds. All measurements discussed in this work were performed utilizing the IAGOS-CARIBIC flying laboratory as a platform, which deploys a comprehensive set of complex scientific instruments aboard an Airbus A340-600 operated by Deutsche Lufthansa. The IAGOS-CARIBIC flying laboratory is a specialized air-freight container with automated instrumentation for simultaneous measurements of atmospheric aerosol particles and gaseous compounds. The container was deployed monthly, typically for four consecutive long-distance flights. A more detailed description of the IAGOS-CARIBIC flying laboratory can be found in Brenninkmeijer et al.'s study.<sup>26</sup> Here, the measurements of the aerosol particle microphysical properties and the total reactive nitrogen ( $\text{NO}_y$ ) mixing ratio for the period from July 2018 to March 2020 are used.

**2.2. IAGOS-CARIBIC Aerosol Microphysical Instrumentation.** The aerosol particle microphysical properties for the IAGOS-CARIBIC data set were measured using the IAGOS-CORE aerosol instrument. This instrument contains an optical particle counter (OPC; Grimm) and two butanol condensation particle counters (CPC, Grimm); for a detailed description and characterization, see Bundke et al.'s study.<sup>27</sup> The OPC is providing the particle number concentration for the accumulation mode particles with diameters of  $D > 250$  nm. The OPC accuracy is estimated to be  $4 \pm 1\%$  by comparing extinction measurements of a CAPS (Cavity Attenuated Phase Shift)  $\text{PM}_{\text{ex}}$  instrument with calculated values from Mie theory using the OPC size distribution. The precision of the total particle number concentration is reported with an average instrument-to-instrument comparison of  $\leq 1\%$ . The two CPCs were operated with a particle diameter detection range of 15 nm to  $3 \mu\text{m}$ . While one CPC was measuring the total particle number concentration, the other one was detecting the nonvolatile aerosol particles after being heated up to  $250 \text{ }^\circ\text{C}$  in a thermal denuder. The thermal denuder consists of a heated stainless-steel tube with an inner diameter of 9 mm and a length of 0.2 m. The details of the thermal denuder heating characteristic are discussed by Bundke et al.<sup>27</sup> Both CPC instruments report total particle number concentration with an accuracy of  $3 \pm 1.5\%$  against a Faraday cup electrometer. Side-by-side operation of GRIMM CPC leads to an estimated precision of 3.4%. All parameters were measured with a 1 Hz temporal resolution. All instrument characterization measurements were conducted in the laboratory, simulating the in-air temperature and pressure conditions as well as possible. Additionally, these instruments and the IAGOS-CARIBIC container as a platform were constructed to work under conditions within the aircraft.

Nevertheless, extreme events during flight may result in larger uncertainties.

**2.3. IAGOS-CARIBIC NO<sub>y</sub> Instrumentation.** The NO<sub>y</sub> mixing ratio for IAGOS-CARIBIC was measured with the chemiluminescence instrument from the German Aerospace Agency (DLR); see Stratmann et al.'s study<sup>28</sup> for details. The statistical detection limits of this instrument for the 1 Hz data are 7 pptv for the NO measurements and 8 pptv for the NO<sub>y</sub> measurements. Meanwhile, the overall uncertainty for the NO and NO<sub>y</sub> measurements was reported by Stratmann et al.<sup>28</sup> to be 8% (6.5%) for a volume mixing ratio of 0.5 ppbv (1 ppbv). Even though laboratory instrument characterization was accounting for normal conditions during operation on aircraft, some extreme events during flight may result in larger uncertainties.

**2.4. Plume Detection and Analysis.** Aircraft plumes were probed randomly during the IAGOS-CARIBIC flights. For this reason, a plume detection algorithm was implemented to identify the plume data within the full data set. Because aerosol particles and NO<sub>y</sub> are coemitted by aircraft engines (see Figure 1), the plume detection algorithm was set up to



**Figure 1.** (a) World map with the IAGOS-CARIBIC flight tracks (blue lines) and the detected aircraft plumes (red dots). (b) Time series of the total (black line;  $D > 15$  nm), nonvolatile (green line;  $D > 15$  nm), and accumulation mode (orange line;  $D > 250$  nm) particle number mixing ratio and the NO<sub>y</sub> mixing ratio (blue line), exemplary for one aircraft plume. Map data © 2023 were obtained by OpenStreetMap.

search for simultaneously measured peaks in the 1 Hz resolved total aerosol particle number mixing ratio data and the NO<sub>y</sub> mixing ratio data; see Figure 1b. For the detection of the individual peaks, the algorithm utilizes the `find_peaks` function from the python package `scipy` (version 1.8.0).<sup>29</sup> To ensure that the detection of peaks from large-scale vertical transport and convection was minimized, the prominence, distance, and width parameters for the `find_peaks` function were individually optimized for the aerosol and NO<sub>y</sub> data. The threshold parameter “prominence” was set to 300 particles mg<sup>-1</sup> air and 0.2 ppbv for the aerosol and NO<sub>y</sub> data, respectively, while the distance parameter was set to 10 s for both species. The width parameter was set to be between 2 and 40 s for the aerosol data and between 2 and 80 s for the NO<sub>y</sub> data. The aircraft plumes were then identified by matching the detected peaks in the aerosol and NO<sub>y</sub> data sets. A match was identified where a peak from the aerosol data set and a peak from the NO<sub>y</sub> data set intersected within the peaks’ widths at half height. In the next step, all overlapping plumes were removed from the data set to avoid artifacts from mixed plumes of potentially different ages during the subsequent plume analysis.

For all the remaining “unambiguous” aircraft plumes, a plume analysis was executed to determine each plume’s excess of the NO<sub>y</sub> mixing ratio and the aerosol particle number concentration of the total ( $D > 15$  nm), nonvolatile ( $D > 15$  nm), and accumulation mode aerosols ( $D > 250$  nm), which were contributed by the aircraft to the background atmosphere. The background was fitted within a window with five times the width of the respective peak using the baseline function of the `peakutils` Python package (version 1.3.3).<sup>30</sup> Species by species, the excess for each individual plume was then calculated by subtracting the integrated background values from the integrated values over the full peak and dividing it by the integration time over the peak’s width.

**2.5. Plume Dispersion Model.** A plume dispersion model is applied to estimate the age of the observed plumes by using NO<sub>y</sub> as a chemically inert tracer ( $< 18$  h)<sup>31</sup> during plume evolution in the plume dispersion phase. First, the concentration of NO<sub>y</sub> is calculated at the initial time step ( $t_0$ ), which corresponds to a specific initial plume area ( $A_0 = 0.15$  km<sup>2</sup>; calculated based on eq 6 in Petry et al.’s study<sup>31</sup>). This initial time step represents the end of the vortex regime and the beginning of the dispersion phase, about 2 min after the emission (see Kärcher et al.’s study<sup>25</sup>). As the next step, the dispersion of NO<sub>y</sub> within the growing plume area as a function of time is modeled following a Gaussian theory.<sup>32</sup> Since NO<sub>y</sub> is emitted in the form of NO<sub>x</sub>, the initial concentration of NO<sub>y</sub>, denoted as  $C_0$ , is calculated from the aircraft NO<sub>x</sub> emission rate using eq 1 and is used to initialize the plume model using parameter values from Lee et al.<sup>33</sup> and Petry et al.<sup>31</sup>

$$C_0 = \frac{EI \times FC}{A_0 \times v} \quad (1)$$

In this equation,  $C_0$  represents the concentration of NO<sub>y</sub> in g m<sup>-3</sup> at time  $t_0$ , EI is the emission index of NO<sub>x</sub> (which is assumed to be equivalent to NO<sub>y</sub> at this plume age) in g kg<sup>-1</sup>, FC is the fuel consumption rate in kg s<sup>-1</sup>,  $A_0$  is the initial area in m<sup>2</sup>, and  $v$  is the aircraft speed in m s<sup>-1</sup>. For  $v$ , a typical aircraft speed of 870.7 km h<sup>-1</sup> (about 240 m s<sup>-1</sup>) for a Boeing B-747 aircraft<sup>31</sup> was used. The dilution of emitted species within the aircraft exhaust plume is dependent on the dispersion dynamics, which are influenced by parameters such as diffusion coefficients (vertical, horizontal, and shear) and wind shear.<sup>31</sup> These parameters control the dispersion processes within the expanding plume. Although turbulence is not modeled explicitly, it is implicitly accounted for in the description of the diffusion process based on Petry et al.<sup>31</sup> The evolution of the NO<sub>y</sub> concentration during the dispersion phase is simulated by the plume model with 5 min time resolution over 24 h. For an aircraft speed of about 240 m s<sup>-1</sup>, one time step would correspond to a distance traveled by the aircraft of 72 km.

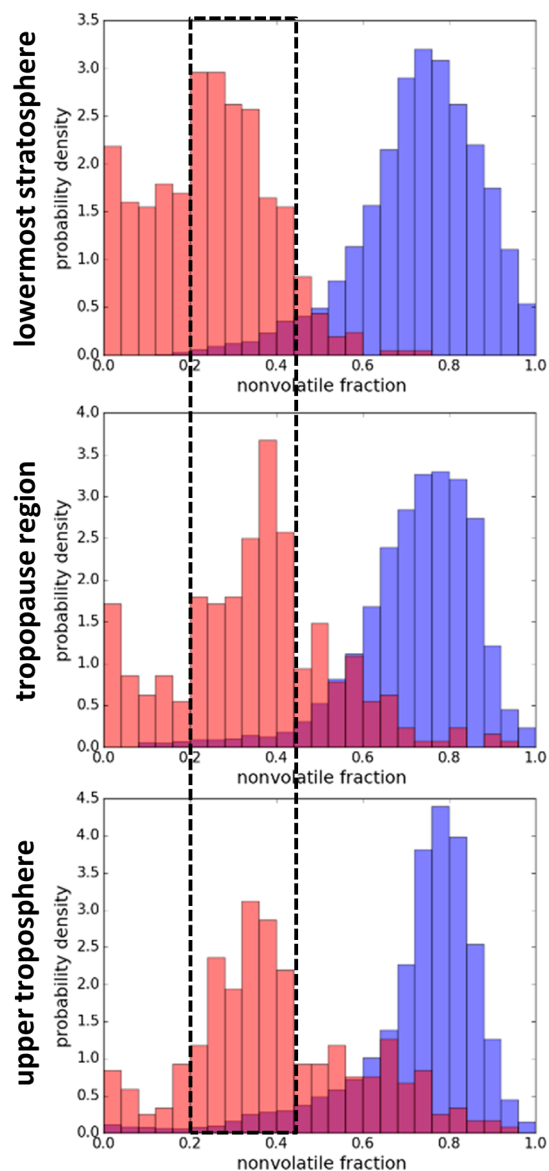
### 3. RESULTS AND DISCUSSION

**3.1. Plume Characteristics and Plume Age.** For the period between July 2018 and March 2020, all measurements required for this analysis are available from a subset of 36 of the total 42 IAGOS-CARIBIC flights. Based on the NO<sub>y</sub> and aerosol particle measurements, the previously described plume detection algorithm identified 1135 unique aircraft plumes. Figure 1 shows a world map with all detected unique aircraft plumes as red dots on the IAGOS-CARIBIC flight tracks (blue lines). These flights covered routes between Munich

(Germany) and destinations in North America, South Africa, and East Asia, thereby providing a solid statistical basis and global insight into the impact of aviation on aerosol and trace gas properties within the main flight corridors. Utilizing a data set including nearly 2 years of atmospheric observations, the detected aircraft plumes are also covering all annual seasons. Of in total 1135 detected aircraft plumes, 200 were observed during winter (December to February), 48 in spring (March to May), 513 during summer (June to August), and 374 in autumn (September to November). It must be noticed that the number of detected plumes does not represent the actual occurrence frequency of aircraft plumes in the atmosphere during the different seasons but is primarily driven by the number of IAGOS-CARIBIC flights on different flight routes during those seasons. For further analysis, all detected exhaust plumes were categorized in terms of the upper troposphere (pressure level relative to the thermal tropopause:  $\Delta p_{\text{tp}} > 15$  hPa), tropopause region ( $\Delta p_{\text{tp}} \pm 15$  hPa), and lowermost stratosphere ( $\Delta p_{\text{tp}} < -15$  hPa) using the ECMWF (European Centre for Medium-Range Weather Forecasts)<sup>34</sup> reanalysis thermal tropopause data. This results in 24% upper tropospheric plumes, 28% plumes in the tropopause region, and 48% of the plumes observed in the lowermost stratosphere. Further analysis shows that the main mode of the nonvolatile particle fraction (for particles with  $D > 15$  nm) inside the plume is between 0.2 and 0.4 for all those atmospheric layers (see Figure 2), while this fraction is about 0.8 for the background aerosol. Weinzierl et al.<sup>35</sup> explain the link between the volatile fraction and the mixing state of the aerosol based on the change in size distribution for internally and externally mixed aerosols. This finding indicates that the plume aerosol is more externally mixed, while the background aerosol at all atmospheric layers is mostly internally mixed. The observed independence of the plume aerosol properties from the background aerosol allows for plume aerosol parametrization independent of the flight altitude and respective atmospheric layers within the main flight corridors.

In contrast to aircraft exhaust observations at ground testing stations and airborne measurements where the exhaust plume is probed directly behind another aircraft, here, the plumes were observed randomly at very different ages. The previously described plume dispersion model was used to estimate the age range of the observed aircraft plumes using the  $\text{NO}_y$  mixing ratio as a proxy. Figure 3 depicts the modeled  $\text{NO}_y$  mixing ratio of an aircraft plume in the dispersion phase as a function of the plume age. The black line represents the reference case with a  $\text{NO}_y$  emission index of  $14 \text{ g kg}^{-1}$ . Additionally, an upper limit case (red dotted line) with slower diffusion and a  $\text{NO}_y$  EI of  $17 \text{ g kg}^{-1}$  and a lower limit case for the plume age (blue dotted line) with faster diffusion and a  $\text{NO}_y$  EI of  $12 \text{ g kg}^{-1}$  were calculated. For the short plume ages discussed here, the reference case and range of the  $\text{NO}_y$  emission indices used were set to be equal to the fleet average  $\text{NO}_x$  EIs from 2010 reported by Lee et al.<sup>33</sup> The resulting range in plume age for a constant  $\text{NO}_y$  mixing ratio shows clearly that this method can only be used to estimate the age range of all observed aircraft plumes statistically and not the precise age of every single plume individually.

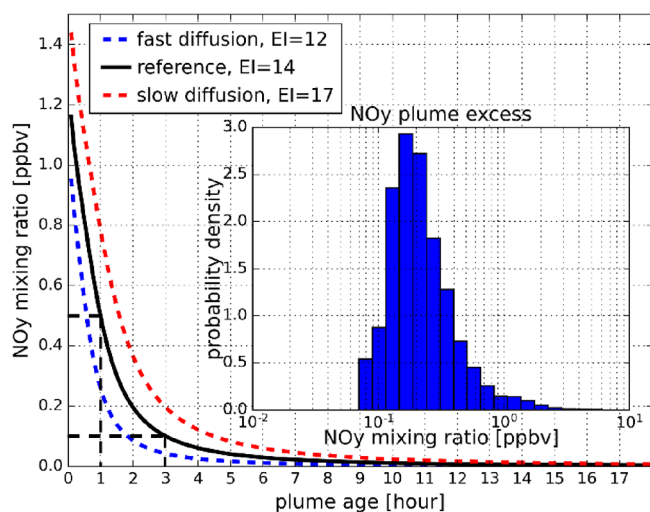
The histogram of the  $\text{NO}_y$  plume excess mixing ratio (see Figure 3) has its main mode between 0.1 and about 0.5 ppbv. Comparing this range of  $\text{NO}_y$  mixing ratios with the results from the plume dispersion model translates into a plume age range for the observed aircraft plumes of about 1 to 3 h. In



**Figure 2.** Nonvolatile fraction distributions ( $D > 15$  nm) for the plume excess aerosol (red) and the background aerosol (blue) separated for the upper troposphere, tropopause region, and lowermost stratosphere. The black dashed box indicates the range of the main mode of the plume excess nonvolatile fraction.

contrast to the only few second-old aerosol particles observed directly behind aircraft engines, the plume excess aerosol measured by IAGOS-CARIBIC can be considered as aged aerosol, where the aerosol particle number concentration and nonvolatile fraction are mainly driven by dispersion and processes like nucleation and coagulation are not efficient anymore.

**3.2. Accumulation Mode Particles.** One important factor for the climate impact of aviation is the presence of large accumulation mode particles, which by themselves have a stronger radiative impact compared to smaller aerosol particles but can also act as efficient condensation nuclei and therefore enhance the formation of contrail cirrus clouds.<sup>36</sup> The analysis of all detected aircraft plumes showed no detectable and statistically significant enhancement of the accumulation mode particle number ( $D > 250$  nm) compared to the background



**Figure 3.** Simulated  $\text{NO}_y$  mixing ratio as a function of the plume age resulting from plume dispersion modeling. With the reference case as a black line and the histogram of the observed  $\text{NO}_y$  plume excess mixing ratio, the black dashed lines indicate the mean plume age of 1 to 3 h resulting from the main mode of the  $\text{NO}_y$  mixing ratio distribution between about 0.1 and 0.5 ppbv.

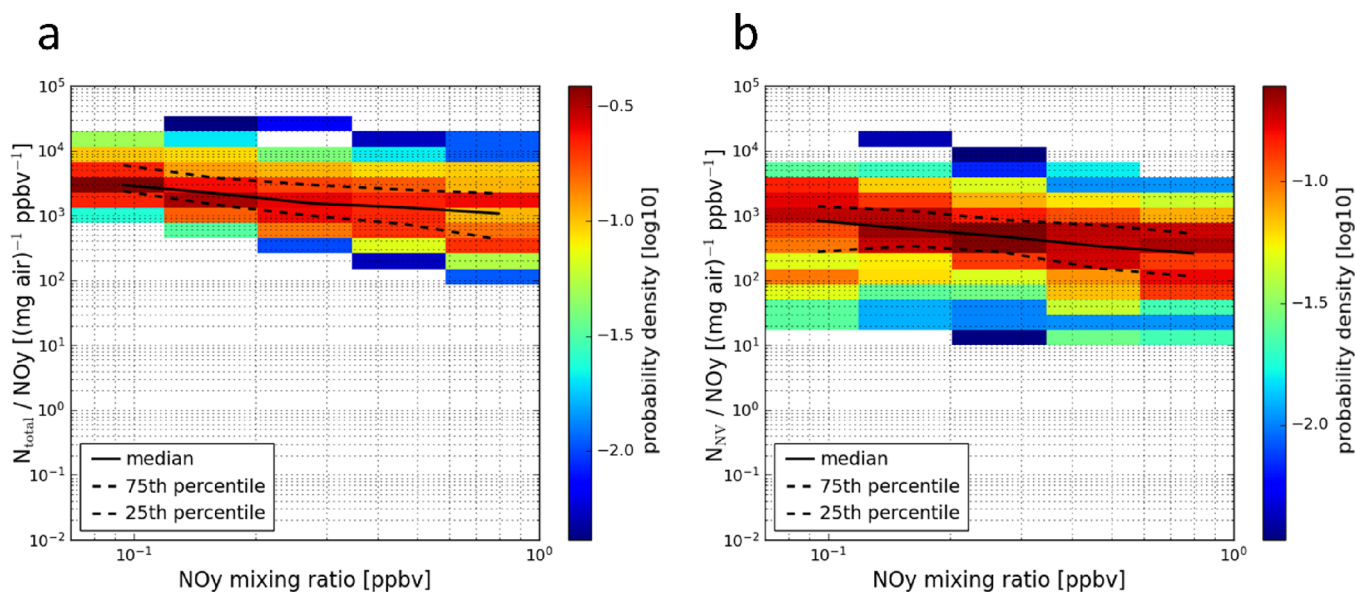
variability. The time series of the aerosol particle number mixing ratios (total aerosol as the black line, nonvolatile aerosol as the green line, and accumulation mode aerosol as the orange line) and the  $\text{NO}_y$  mixing ratio (blue line) of one example plume is shown in Figure 1b. This example case visualizes that no enhancement from the background variability of particles with diameters  $>250$  nm can be observed, even though this is one of the youngest and therefore least diluted plumes observed, with a  $\text{NO}_y$  mixing ratio peaking at about 5 ppbv.

### 3.3. Particle Number Emission Index Calculation.

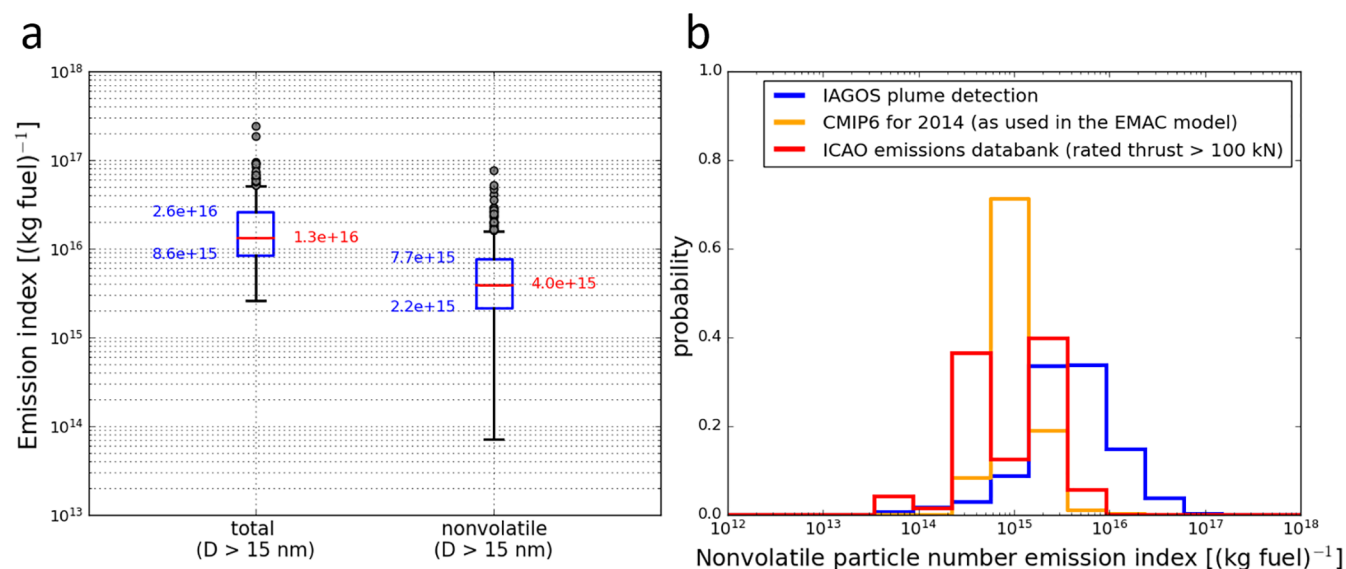
Global climate models are driven by emission data provided in global emission inventories. These, however, only provide

information about the emitted mass of various compounds, such as soot and  $\text{NO}_x$ , but do not include particle number emissions. These need to be derived from the mass emissions by assuming typical size distributions of the emitted particles. These assumptions are usually based on measurements and implicitly account for particle transformation processes occurring during the plume dispersion phase that cannot be resolved by the models due to their coarse resolution.<sup>5,7</sup> For this reason, only the data of plumes that are in a state where the change in the aerosol number is mostly driven by the plume dispersion should be used. This way, one can make sure that the calculated particle number emissions represent the exhaust aerosol in a processing state that can be resolved with the large-scale model grid boxes ( $\sim 100$  km) by processes typically represented by climate models. In Figure 4, heatmaps of the plume total (a) and nonvolatile (b) particle number mixing ratios normalized by their corresponding  $\text{NO}_y$  mixing ratios are shown as a function of the  $\text{NO}_y$  mixing ratios. The black line and black dotted lines represent the median and the 25th and 75th percentiles for each  $\text{NO}_y$  bin. Assuming that  $\text{NO}_y$  is an inert tracer within the timescales of the detected plumes' age, the particle number mixing ratio normalized by the  $\text{NO}_y$  mixing ratio should be constant as a function of the  $\text{NO}_y$  mixing ratio when the change in particle number is only driven by the plume dispersion. The deviation from this constant behavior (visible in Figure 4) may be explained by the limitations of the sampling and calculation of the plumes' particle and  $\text{NO}_y$  excess, especially for older plumes with very low excess mixing ratios. As the plumes were encountered randomly at largely unknown plume positions, this may have caused uncertainties by differences in the response times of the  $\text{NO}_y$  and aerosol instruments. This uncertainty is minimized by analyzing statistically a large number of plumes. Considering these limitations, only a subset of the plume data with excess  $\text{NO}_y$  mixing ratios between 0.2 and 0.4 ppbv was used for the particle EI calculations.

For each aircraft plume that fulfilled this criterion, the total and nonvolatile particle EIs were calculated. The EIs were



**Figure 4.** Heatmaps of the plume individual total (a) and nonvolatile (b) particle number mixing ratios normalized by their corresponding  $\text{NO}_y$  mixing ratios as a function of the  $\text{NO}_y$  mixing ratios. The median and the 25th and 75th percentiles for each  $\text{NO}_y$  bin are indicated by a black line and dotted black lines, respectively. The probability density within each  $\text{NO}_y$  mixing ratio bin is color-coded.



**Figure 5.** (a) Emission index of the total aerosol particles (left) and the nonvolatile aerosol particles (right) shown as a boxplot for all observed aircraft plumes within the IAGOS-CARIBIC data set. (b) Histogram of the nonvolatile particle number emission index calculated based on the IAGOS-CARIBIC data set (blue), derived from the CMIP6 inventory and used in the EMAC global model (orange), and reported in the ICAO emission databank for engines with thrust ratings greater than 100 kN (red).

calculated by the method demonstrated by Voigt et al.<sup>37</sup> who used the  $\text{CO}_2$  EI to calculate the particle EI, here using the mean aviation  $\text{NO}_x$  EI of  $14 \text{ g } (\text{kg fuel})^{-1}$ .<sup>33</sup> This results in median particle number EIs of  $1.3 \times 10^{16} (\text{kg fuel})^{-1}$  for the total aerosol ( $D > 15 \text{ nm}$ ) and  $4 \times 10^{15} (\text{kg fuel})^{-1}$  for the nonvolatile aerosol ( $D > 15 \text{ nm}$ ). In Figure 5a, in addition to the median values (red line), the 1st and 99th percentiles (black vertical bar), 25th and 75th percentiles (blue box), and the outliers (gray dots) are presented as a boxplot.

### 3.4. Discussion of Resulting EIs with the Literature, Emission Databanks, and Model Emission Inventories.

Volatile particle EIs normalized to a plume age of 3 s were reported by Schumann et al.<sup>38</sup> to range between about  $1 \times 10^{16}$  and  $2 \times 10^{17} (\text{kg fuel})^{-1}$  for fuel sulfur contents between 2 and  $3000 \mu\text{g g}^{-1}$ . For 2006, the average fuel sulfur content was estimated to be between 550 and  $750 \mu\text{g g}^{-1}$ , well below the specification limit of  $3000 \mu\text{g g}^{-1}$ .<sup>39</sup> According to Schumann et al.,<sup>38</sup> this would result in volatile particle EIs well below  $1 \times 10^{17} (\text{kg fuel})^{-1}$ . Together with the lower CPC cutoff diameter of 3 nm used by Schumann et al.<sup>38</sup> (15 nm for the IAGOS-CARIBIC data set), the difference to the median EI for volatile particles of about  $1 \times 10^{16} (\text{kg fuel})^{-1}$  for the IAGOS-CARIBIC observations can be explained by further processing (e.g., coagulation with other volatile and nonvolatile particles) of the only 3 s-old plume aerosol.

The nonvolatile plume excess particles with diameters larger than 15 nm can be assumed to consist mainly of soot. Directly emitted metal particles from engine erosion and the combustion of fuel containing trace metal impurities or metal particles that enter the exhaust with the fuel only have EIs of  $10^7$  to  $10^8 (\text{kg fuel})^{-1}$ .<sup>40</sup> Anderson et al.<sup>41</sup> reported nonvolatile particle EIs ranging from  $0.5 \times 10^{15}$  to  $10 \times 10^{15} (\text{kg fuel})^{-1}$ , while the EI values from Schumann et al.<sup>38</sup> are between about  $0.2 \times 10^{15}$  and  $1.8 \times 10^{15} (\text{kg fuel})^{-1}$ . For two reference Jet A1 fuels, Voigt et al.<sup>37</sup> measured nonvolatile particle EIs of  $3.8 \times 10^{15}$  and  $4.9 \times 10^{15} (\text{kg fuel})^{-1}$  following an Airbus A320 aircraft. With a median EI resulting from the IAGOS-CARIBIC data set at  $4 \times 10^{15} (\text{kg fuel})^{-1}$  and the 25th

and 75th percentiles at  $2.2 \times 10^{15}$  and  $7.7 \times 10^{15} (\text{kg fuel})^{-1}$ , respectively, these observations are at the upper end of the EI range found by inflight measurements of very fresh exhaust plumes (age of a few seconds).

The International Civil Aviation Organization (ICAO) engine emission databank contains exhaust information like particle EI.<sup>42</sup> The data are provided by the engine manufacturers, while the measurements at ground testing facilities must comply according to the procedures in ICAO Annex 16, Volume II. The first data on nonvolatile particle measurements included in the ICAO database are from the year 2013.<sup>42</sup> A subset of engines with a thrust rating  $>100 \text{ kN}$  was selected to represent the most common engine types used within the international main flight corridors. The histogram of the EI under approach condition, corrected for system losses from the ICAO database subset (see Figure 5b), shows one mode at smaller EI values and one within the main mode of the IAGOS-CARIBIC EI distribution. By selecting engine types with increasing thrust rating, the number of engine types with low EI values decreases. However, the histogram of the ICAO data cannot directly be compared to the IAGOS-CARIBIC observation because the ICAO database distribution only represents the number of engine types in the database and is not weighted by the number of the corresponding engines of each type that are currently used in the global fleet. But it still gives an indication that the globally observed EIs are at the upper end of the values reported by the engine manufacturers. Besides the different environmental conditions at ground testing, the engines used for emission measurements by the manufacturers can be expected to be either newly built or very well maintained. This would cause lower particle emissions compared to older engines of the same type.

To compare the nonvolatile particle number EI calculated based on the IAGOS-CARIBIC data set with the inventories currently used for climate models, the input data used in the simulations by Righi et al.<sup>7,43</sup> with the global climate-chemistry model EMAC (ECHAM/MESSy Atmospheric Chemistry)<sup>44</sup> were considered. This is based on the soot and  $\text{CO}_2$  emission

data from the CMIP6 emission inventory for 2014,<sup>45</sup> which allowed to derive the soot EI (assuming a mean CO<sub>2</sub> EI of 3160 g kg<sup>-1</sup>).<sup>33</sup> This was then converted to a particle number EI using the size distribution parameters given in Petzold et al.'s study<sup>11</sup> which are based on in situ measurements. In Figure 5b, the resulting global EI values are depicted as a histogram together with the IAGOS-CARIBIC EI histogram. Even though the main mode of the CMIP6-based EI distribution has its peak at lower EI values as the main mode peak of the IAGOS-CARIBIC data, the distributions are widely overlapping. The median value of  $1 \times 10^{15}$  (kg fuel)<sup>-1</sup> for the CMIP6-based EI is a factor of 4 lower than the  $4 \times 10^{15}$  (kg fuel)<sup>-1</sup> for the nonvolatile particle EI from IAGOS-CARIBIC. For this comparison, several uncertainties must be considered. The measurement and data processing uncertainties for the IAGOS-CARIBIC data are assumed to have the smallest impact. The variability of the NO<sub>x</sub> EI introduced by the global mean value of 14 g kg<sup>-1</sup> and its range (12–17 g kg<sup>-1</sup>),<sup>33</sup> together with the assumption of NO<sub>y</sub> being an inert tracer and being equal to NO<sub>x</sub> for the observed plume ages, is considered to be one of the main contributors. However, since we sampled randomly from a wide range of aircraft types, the application of the fleet average NO<sub>x</sub> EI seems to be justified. Potential removal of aviation aerosol particles due to deposition on contrail ice particles and subsequent sedimentation could result in lower particle EIs for plumes affected by contrail formation. The largest uncertainty is the sampling of the plumes at random positions. The impact of the uncertainties introduced by the two latter processes is minimized statistically by analyzing a large set of plumes. For the model, the EI calculation based on CMIP6 relies on the CO<sub>2</sub> and soot emission inventory data as well as the mean CO<sub>2</sub> EI.

Considering these uncertainties, on the one hand, this comparison reveals that the soot number EIs used in the models are within the range of the EIs resulting from the IAGOS-CARIBIC data set, representing a significant part of the global fleet within the main flight corridors. On the other hand, the identified discrepancy could indicate a potential underestimation of the number concentration of aviation-induced soot particles in the models, which should be considered when interpreting modeled aviation soot climate effects as described, for instance, by Righi et al.<sup>7</sup> Using the IAGOS-CARIBIC data set with its unique advantages of in situ observations with the global coverage of the main flight corridors over a period of nearly 2 years and statistics over about 1100 aircraft plumes underlines the representativeness of the measured particle EIs ( $EI_{\text{total}} = 1.3 \times 10^{16}$  (kg fuel)<sup>-1</sup> and  $EI_{\text{nonvolatile}} = 4 \times 10^{15}$  (kg fuel)<sup>-1</sup>) and their respective ranges for the emissions of the mean global fleet. Furthermore, no enhancement above the background variability of large accumulation mode particles ( $D > 250$  nm) could be detected for the aircraft plume excess. The fact that after 1–3 h, the main mode of the plume aerosol nonvolatile fraction distribution is still between 0.2 and 0.4 indicates that plume internal aerosol processing has come to a steady state and that the aviation exhaust aerosol almost remains in its emission state during plume expansion.

## AUTHOR INFORMATION

### Corresponding Author

Christoph Mahnke – *Forschungszentrum Jülich GmbH (FZJ), Institute of Energy and Climate Research:*

*Troposphere (IEK-8), Jülich 52428, Germany;* [orcid.org/0000-0003-2606-1680](https://orcid.org/0000-0003-2606-1680); Email: [c.mahnke@fz-juelich.de](mailto:c.mahnke@fz-juelich.de)

### Authors

Rita Gomes – *Forschungszentrum Jülich GmbH (FZJ), Institute of Energy and Climate Research: Troposphere (IEK-8), Jülich 52428, Germany*

Ulrich Bundke – *Forschungszentrum Jülich GmbH (FZJ), Institute of Energy and Climate Research: Troposphere (IEK-8), Jülich 52428, Germany*

Marcel Berg – *Forschungszentrum Jülich GmbH (FZJ), Institute of Energy and Climate Research: Troposphere (IEK-8), Jülich 52428, Germany*

Helmut Ziereis – *Deutsches Zentrum für Luft- und Raumfahrt (DLR), Institut für Physik der Atmosphäre, Oberpfaffenhofen 82234, Germany;* [orcid.org/0000-0001-5483-5669](https://orcid.org/0000-0001-5483-5669)

Monica Sharma – *Deutsches Zentrum für Luft- und Raumfahrt (DLR), Institut für Physik der Atmosphäre, Oberpfaffenhofen 82234, Germany; Faculty of Aerospace Engineering, Delft University of Technology, Delft 2600 AA, The Netherlands*

Mattia Righi – *Deutsches Zentrum für Luft- und Raumfahrt (DLR), Institut für Physik der Atmosphäre, Oberpfaffenhofen 82234, Germany*

Johannes Hendricks – *Deutsches Zentrum für Luft- und Raumfahrt (DLR), Institut für Physik der Atmosphäre, Oberpfaffenhofen 82234, Germany*

Andreas Zahn – *Karlsruhe Institute of Technology (KIT), Institute of Meteorology and Climate Research, Karlsruhe 76131, Germany*

Andreas Wahner – *Forschungszentrum Jülich GmbH (FZJ), Institute of Energy and Climate Research: Troposphere (IEK-8), Jülich 52428, Germany*

Andreas Petzold – *Forschungszentrum Jülich GmbH (FZJ), Institute of Energy and Climate Research: Troposphere (IEK-8), Jülich 52428, Germany; Institute for Atmospheric and Environmental Research, University of Wuppertal, Wuppertal 42119, Germany;* [orcid.org/0000-0002-2504-1680](https://orcid.org/0000-0002-2504-1680)

Complete contact information is available at:

<https://pubs.acs.org/10.1021/acs.est.3c09728>

### Author Contributions

The manuscript was written through contributions of all authors. All authors have given approval to the final version of the manuscript.

### Funding

Part of this study is funded by the ACACIA project (EU Grant Agreement Number 875036) and the Eco2Fly project (DLR aviation research program). The German Federal Ministry of Education and Research (BMBF) is acknowledged for financing the instrument operation and data analysis as part of the joint project IAGOS-D under grants 01LK1301A and 01LK1301C.

### Notes

The authors declare no competing financial interest.

## ACKNOWLEDGMENTS

We thank all members of IAGOS-CARIBIC, in particular Deutsche Lufthansa and Lufthansa Technik, for enabling the IAGOS-CARIBIC observatory.



## ■ ABBREVIATIONS

$A_0$ , initial plume area; BC, black carbon;  $C_0$ , initial concentration; CARIBIC, Civil Aircraft for the Regular Investigation of the Atmosphere Based on an Instrument Container;  $\text{CO}_2$ , carbon dioxide; CPC, condensation particle counter;  $D$ , diameter; DLR, Deutsches Zentrum für Luft- und Raumfahrt (English: German Aerospace Agency);  $\Delta p_{\text{tp}}$ , pressure relative to thermal tropopause; ECMWF, European Centre for Medium-Range Weather Forecasts; EI, emission index; EMAC, ECHAM/MESSy Atmospheric Chemistry; FC, fuel consumption rate; HC, hydrocarbon; IAGOS, In-service Aircraft for a Global Observing System;  $\text{NO}_x$ , nitrogen oxides;  $\text{NO}_y$ , total reactive nitrogen; OC, organic carbon; OPC, optical particle counter; ppbv, parts per billion by volume;  $t_0$ , initial time step;  $v$ , aircraft speed

## ■ REFERENCES

- (1) Lee, D. S.; Fahey, D. W.; Skowron, A.; Allen, M. R.; Burkhardt, U.; Chen, Q.; Doherty, S. J.; Freeman, S.; Forster, P. M.; Fuglestvedt, J.; Gettelman, A.; De Leon, R. R.; Lim, L. L.; Lund, M. T.; Millar, R. J.; Owen, B.; Penner, J. E.; Pitari, G.; Prather, M. J.; Sausen, R.; Wilcox, L. J. The contribution of global aviation to anthropogenic climate forcing for 2000 to 2018. *Atmos. Environ.* **2021**, *244*, No. 117834, DOI: 10.1016/j.atmosenv.2020.117834.
- (2) Burkhardt, U.; Bock, L.; Bier, A. Mitigating the contrail cirrus climate impact by reducing aircraft soot number emissions. *Npj Clim. Atmos. Sci.* **2018**, *1*, 37 DOI: 10.1038/s41612-018-0046-4.
- (3) Kärcher, B. Formation and radiative forcing of contrail cirrus. *Nat. Commun.* **2018**, *9* (1), 1824.
- (4) Hendricks, J.; Kärcher, B.; Lohmann, U. Effects of ice nuclei on cirrus clouds in a global climate model. *J. Geophys. Res.-Atmos.* **2011**, *116*, 1–24, DOI: 10.1029/2010JD015302.
- (5) Gettelman, A.; Chen, C. The climate impact of aviation aerosols. *Geophys. Res. Lett.* **2013**, *40* (11), 2785–2789.
- (6) Penner, J. E.; Zhou, C.; Garnier, A.; Mitchell, D. L. Anthropogenic Aerosol Indirect Effects in Cirrus Clouds. *J. Geophys. Res.-Atmos.* **2018**, *123* (20), 11652–11677.
- (7) Righi, M.; Hendricks, J.; Beer, C. G. Exploring the uncertainties in the aviation soot-cirrus effect. *Atmos. Chem. Phys.* **2021**, *21* (23), 17267–17289.
- (8) Petzold, A.; Fiebig, M.; Fritzsche, L.; Stein, C.; Schumann, U.; Wilson, C. W.; Hurley, C. D.; Arnold, F.; Katragkou, E.; Baltensperger, U.; Gysel, M.; Nyeki, S.; Hittenberger, R.; Giebl, H.; Hughes, K. J.; Kurtenbach, R.; Wiesen, P.; Madden, P.; Puxbaum, H.; Vrchoticky, S.; Wahl, C. Particle Emissions from Aircraft Engines—A Survey of the European Project PartEmiss. *Meteorol. Z.* **2005**, *14* (4), 465–476.
- (9) ICAO, Assembly Resolutions in Force. (as of 6 October 2016), Doc 10075, **2017**.
- (10) SAE, Procedure for the Continuous Sampling and Measurement of Non-Volatile Particulate Matter Emissions from Aircraft Turbine Engines ARP6320A. **2023**.
- (11) Petzold, A.; Döpelheuer, A.; Brock, C. A.; Schröder, F. In situ observations and model calculations of black carbon emission by aircraft at cruise altitude. *J. Geophys. Res.-Atmos.* **1999**, *104* (D18), 22171–22181.
- (12) Petzold, A.; Stein, C.; Nyeki, S.; Gysel, M.; Weingartner, E.; Baltensperger, U.; Giebl, H.; Hittenberger, R.; Döpelheuer, A.; Vrchoticky, S.; Puxbaum, H.; Johnson, M.; Hurley, C. D.; Marsh, R.; Wilson, C. W. Properties of jet engine combustion particles during the PartEmiss experiment: Microphysics and Chemistry. *Geophys. Res. Lett.* **2003**, *30* (13), 52.1 DOI: 10.1029/2003GL017283.
- (13) Moore, R. H.; Thornhill, K. L.; Weinzierl, B.; Sauer, D.; D'Ascoli, E.; Kim, J.; Lichtenstern, M.; Scheibe, M.; Beaton, B.; Beyersdorf, A. J.; Barrick, J.; Bulzan, D.; Corr, C. A.; Crosbie, E.; Jurkat, T.; Martin, R.; Riddick, D.; Shook, M.; Slover, G.; Voigt, C.; White, R.; Winstead, E.; Yasky, R.; Ziemba, L. D.; Brown, A.; Schlager, H.; Anderson, B. E. Biofuel blending reduces particle emissions from aircraft engines at cruise conditions. *Nature* **2017**, *543* (7645), 411–415.
- (14) Schröder, F.; Brock, C. A.; Baumann, R.; Petzold, A.; Busen, R.; Schulte, P.; Fiebig, M. In situ studies on volatile jet exhaust particle emissions: Impact of fuel sulfur content and environmental conditions on nuclei mode aerosols. *J. Geophys. Res.-Atmos.* **2000**, *105* (D15), 19941–19954.
- (15) Yu, Z. H.; Herndon, S. C.; Ziemba, L. D.; Timko, M. T.; Liscinsky, D. S.; Anderson, B. E.; Miake-Lye, R. C. Identification of Lubrication Oil in the Particulate Matter Emissions from Engine Exhaust of In-Service Commercial Aircraft. *Environ. Sci. Technol.* **2012**, *46* (17), 9630–9637.
- (16) Ungeheuer, F.; Caudillo, L.; Ditas, F.; Simon, M.; van Pinxteren, D.; Kiliç, D.; Rose, D.; Jacobi, S.; Kürten, A.; Curtius, J.; Vogel, A. L. Nucleation of jet engine oil vapours is a large source of aviation-related ultrafine particles. *Commun. Earth Environ* **2022**, *3* (1), 319 DOI: 10.1038/s43247-022-00653-w.
- (17) Yu, F. Q.; Turco, R. P.; Kärcher, B. The possible role of organics in the formation and evolution of ultrafine aircraft particles. *J. Geophys. Res.-Atmos.* **1999**, *104* (D4), 4079–4087.
- (18) Petzold, A.; Gysel, M.; Vancassel, X.; Hittenberger, R.; Puxbaum, H.; Vrchoticky, S.; Weingartner, E.; Baltensperger, U.; Mirabel, P. On the effects of organic matter and sulphur-containing compounds on the CCN activation of combustion particles. *Atmos. Chem. Phys.* **2005**, *5* (12), 3187–3203.
- (19) Petzold, A.; Ström, J.; Ohlsson, S.; Schröder, F. P. Elemental composition and morphology of ice-crystal residual particles in cirrus clouds and contrails. *Atmos. Res.* **1998**, *49* (1), 21–34.
- (20) Kinsey, J. S.; Dong, Y. J.; Williams, D. C.; Logan, R. Physical characterization of the fine particle emissions from commercial aircraft engines during the Aircraft Particle Emissions eXperiment (APEX) 1–3. *Atmos. Environ.* **2010**, *44* (17), 2147–2156.
- (21) Lobo, P.; Durdina, L.; Smallwood, G. J.; Rindlisbacher, T.; Siegerist, F.; Black, E. A.; Yu, Z. H.; Mensah, A. A.; Hagen, D. E.; Miake-Lye, R. C.; Thomson, K. A.; Brem, B. T.; Corbin, J. C.; Abegglen, M.; Sierau, B.; Whitefield, P. D.; Wang, J. Measurement of Aircraft Engine Non-Volatile PM Emissions: Results of the Aviation-Particle Regulatory Instrumentation Demonstration Experiment (APRIDE) 4 Campaign. *Aerosol. Sci. Technol.* **2015**, *49* (7), 472–484.
- (22) Moore, R. H.; Shook, M. A.; Ziemba, L. D.; DiGangi, J. P.; Winstead, E. L.; Rauch, B.; Jurkat, T.; Thornhill, K. L.; Crosbie, E. C.; Robinson, C.; Shingler, T. J.; Anderson, B. E. Take-off engine particle emission indices for in-service aircraft at Los Angeles International Airport. *Sci. Data* **2017**, *4*, 1–15, DOI: 10.1038/sdata.2017.198.
- (23) Stacey, B. Measurement of ultrafine particles at airports: A review. *Atmos. Environ.* **2019**, *198*, 463–477.
- (24) Takegawa, N.; Murashima, Y.; Fushimi, A.; Misawa, K.; Fujitani, Y.; Saitoh, K.; Sakurai, H. Characteristics of sub-10 nm particle emissions from in-use commercial aircraft observed at Narita International Airport. *Atmos. Chem. Phys.* **2021**, *21* (2), 1085–1104.
- (25) Kärcher, B.; Möhler, O.; DeMott, P. J.; Pechtl, S.; Yu, F. Insights into the role of soot aerosols in cirrus cloud formation. *Atmos. Chem. Phys.* **2007**, *7* (16), 4203–4227.
- (26) Brenninkmeijer, C. A. M.; Crutzen, P.; Boumard, F.; Dauer, T.; Dix, B.; Ebinghaus, R.; Filippi, D.; Fischer, H.; Franke, H.; Friess, U.; Heintzenberg, J.; Helleis, F.; Hermann, M.; Kock, H. H.; Koepfel, C.; Lelieveld, J.; Leuener, M.; Martinsson, B. G.; Miemczyk, S.; Moret, H. P.; Nguyen, H. N.; Nyfeler, P.; Oram, D.; O'Sullivan, D.; Penkett, S.; Platt, U.; Pupek, M.; Ramonet, M.; Randa, B.; Reichelt, M.; Rhee, T. S.; Rohwer, J.; Rosenfeld, K.; Scharffe, D.; Schlager, H.; Schumann, U.; Slemr, F.; Sprung, D.; Stock, P.; Thaler, R.; Valentino, F.; van Velthoven, P.; Waibel, A.; Wandel, A.; Waschitschek, K.; Wiedensohler, A.; Xueref-Remy, I.; Zahn, A.; Zech, U.; Ziereis, H. Civil Aircraft for the regular investigation of the atmosphere based on an instrumented container: The new CARIBIC system. *Atmos. Chem. Phys.* **2007**, *7* (18), 4953–4976.
- (27) Bundke, U.; Berg, M.; Houben, N.; Ibrahim, A.; Fiebig, M.; Tettich, F.; Klaus, C.; Franke, H.; Petzold, A. The IAGOS-CORE

aerosol package: instrument design, operation and performance for continuous measurement aboard in-service aircraft. *Tellus B* **2015**, *67* (1), 28339.

(28) Stratmann, G.; Ziereis, H.; Stock, P.; Brenninkmeijer, C. A. M.; Zahn, A.; Rauthe-Schöch, A.; Velthoven, P. V.; Schlager, H.; Volz-Thomas, A. NO and NO<sub>y</sub> in the upper troposphere: Nine years of CARIBIC measurements onboard a passenger aircraft. *Atmos. Environ.* **2016**, *133*, 93–111.

(29) Virtanen, P.; Gommers, R.; Oliphant, T. E.; Haberland, M.; Reddy, T.; Cournapeau, D.; Burovski, E.; Peterson, P.; Weckesser, W.; Bright, J.; van der Walt, S. J.; Brett, M.; Wilson, J.; Millman, K. J.; Mayorov, N.; Nelson, A. R. J.; Jones, E.; Kern, R.; Larson, E.; Carey, C. J.; Polat, I.; Feng, Y.; Moore, E. W.; VanderPlas, J.; Laxalde, D.; Perktold, J.; Cimrman, R.; Henriksen, I.; Quintero, E. A.; Harris, C. R.; Archibald, A. M.; Ribeiro, A. N. H.; Pedregosa, F.; van Mulbregt, P.; Contributors, S. SciPy 1.0: fundamental algorithms for scientific computing in Python. *Nat. Methods* **2020**, *17* (3), 261–272.

(30) Negri, L. H.; Vestri, C.; lucashn/peakutils: v1.1.0. DOI: DOI: 10.5281/zenodo.887917.

(31) Petry, H.; Hendricks, J.; Mollhoff, M.; Lippert, E.; Meier, A.; Ebel, A.; Sausen, R. Chemical conversion of subsonic aircraft emissions in the dispersing plume: Calculation of effective emission indices. *J. Geophys. Res.-Atmos.* **1998**, *103* (D5), 5759–5772.

(32) Schumann, U.; Konopka, P.; Baumann, R.; Busen, R.; Gerz, T.; Schlager, H.; Schulte, P.; Volkert, H. Estimate of Diffusion Parameters of Aircraft Exhaust Plumes near the Tropopause from Nitric-Oxide and Turbulence Measurements. *J. Geophys. Res.-Atmos.* **1995**, *100* (D7), 14147–14162.

(33) Lee, D. S.; Pitari, G.; Grewe, V.; Gierens, K.; Penner, J. E.; Petzold, A.; Prather, M. J.; Schumann, U.; Bais, A.; Bernsten, T.; Iachetti, D.; Lim, L. L.; Sausen, R. Transport impacts on atmosphere and climate: Aviation. *Atmos. Environ.* **2010**, *44* (37), 4678–4734.

(34) Peuch, V. H.; Engelen, R.; Rixen, M.; Dee, D.; Flemming, J.; Suttie, M.; Ades, M.; Agustí-Panareda, A.; Ananasso, C.; Andersson, E.; Armstrong, D.; Barré, J.; Bousserez, N.; Dominguez, J. J.; Garrigues, S.; Inness, A.; Jones, L.; Kipling, Z.; Letertre-Danczak, J.; Parrington, M.; Razinger, M.; Ribas, R.; Vermoote, S.; Yang, X. B.; Simmons, A.; de Marcilla, J. G.; Thépaut, J. N. The Copernicus Atmosphere Monitoring Service: From Research to Operations. *B. Am. Meteorol. Soc.* **2022**, *103* (12), E2650–E2668.

(35) Weinzierl, B.; Petzold, A.; Esselborn, M.; Wirth, M.; Rasp, K.; Kandler, K.; Schütz, L.; Koepke, P.; Fiebig, M. Airborne measurements of dust layer properties, particle size distribution and mixing state of Saharan dust during SAMUM 2006. *Tellus B* **2009**, *61* (1), 96–117.

(36) Kärcher, B.; Peter, T.; Biermann, U. M.; Schumann, U. The initial composition of jet condensation trails. *J. Atmos. Sci.* **1996**, *53* (21), 3066–3083.

(37) Voigt, C.; Kleine, J.; Sauer, D.; Moore, R. H.; Bräuer, T.; Le Clercq, P.; Kaufmann, S.; Scheibe, M.; Jurkat-Witschas, T.; Aigner, M.; Bauder, U.; Boose, Y.; Borrmann, S.; Crosbie, E.; Diskin, G. S.; DiGangi, J.; Hahn, V.; Heckl, C.; Huber, F.; Nowak, J. B.; Rapp, M.; Rauch, B.; Robinson, C.; Schripp, T.; Shook, M.; Winstead, E.; Ziemba, L.; Schlager, H.; Anderson, B. E. Cleaner burning aviation fuels can reduce contrail cloudiness. *Commun. Earth Environ* **2021**, *2* (1), 114 DOI: 10.1038/s43247-021-00174-y.

(38) Schumann, U.; Arnold, F.; Busen, R.; Curtius, J.; Karcher, B.; Kiendler, A.; Petzold, A.; Schlager, H.; Schroder, F.; Wohlfrom, K. H. Influence of fuel sulfur on the composition of aircraft exhaust plumes: The experiments SULFUR 1–7. *J. Geophys. Res.-Atmos.* **2002**, *107* (D15), AAC-2 DOI: 10.1029/2001JD000813.

(39) Barrett, S. R. H.; Yim, S. H. L.; Gilmore, C. K.; Murray, L. T.; Kuhn, S. R.; Tai, A. P. K.; Yantosca, R. M.; Byun, D. W.; Ngan, F.; Li, X. S.; Levy, J. I.; Ashok, A.; Koo, J.; Wong, H. M.; Dessens, O.; Balasubramanian, S.; Fleming, G. G.; Pearlson, M. N.; Wollersheim, C.; Malina, R.; Arunachalam, S.; Binkowski, F. S.; Leibensperger, E. M.; Jacob, D. J.; Hileman, J. I.; Waitz, I. A. Public Health, Climate, and Economic Impacts of Desulfurizing Jet Fuel. *Environ. Sci. Technol.* **2012**, *46* (8), 4275–4282.

(40) Penner, J. E.; Lister, D.; Griggs, D. J.; Dokken, D. J.; McFarland, M.; *Aviation and the global atmosphere: special report of the Intergovernmental Panel on Climate Change*. Cambridge University Press: Cambridge, UK: 1999, pp 384of plates: ill. (some col.).

(41) Anderson, B. E.; Cofer, W. R.; Bagwell, D. R.; Barrick, J. W.; Hudgins, C. H.; Brunke, K. E. Airborne observations of aircraft aerosol emissions I: Total nonvolatile particle emission indices. *Geophys. Res. Lett.* **1998**, *25* (10), 1689–1692.

(42) EASA, Aircraft Engine Emissions Databank (06/2023), <https://www.easa.europa.eu/en/domains/environment/icao-aircraft-engine-emissions-databank>, last access: 10 November 2023. 2023.

(43) Righi, M.; Hendricks, J.; Brinkop, S. The global impact of the transport sectors on the atmospheric aerosol and the resulting climate effects under the Shared Socioeconomic Pathways (SSPs). *Earth Syst. Dynam.* **2023**, *14* (4), 835–859.

(44) Jöckel, P.; Kerckweg, A.; Pozzer, A.; Sander, R.; Tost, H.; Riede, H.; Baumgaertner, A.; Gromov, S.; Kern, B. Development cycle 2 of the Modular Earth Submodel System (MESSy2). *Geosci. Model. Dev.* **2010**, *3* (2), 717–752.

(45) Hoesly, R. M.; Smith, S. J.; Feng, L. Y.; Klimont, Z.; Janssens-Maenhout, G.; Pitkanen, T.; Seibert, J. J.; Vu, L.; Andres, R. J.; Bolt, R. M.; Bond, T. C.; Dawidowski, L.; Kholod, N.; Kurokawa, J.; Li, M.; Liu, L.; Lu, Z. F.; Moura, M. C. P.; O'Rourke, P. R.; Zhang, Q. Historical (1750–2014) anthropogenic emissions of reactive gases and aerosols from the Community Emissions Data System (CEDS). *Geosci. Model. Dev.* **2018**, *11* (1), 369–408.