

## ***Interactive comment on “The Importance of Size Ranges in Aerosol Instrument Intercomparisons: A Case Study for the ATom Mission” by Hongyu Guo et al.***

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Comment on Guo et al., The Importance of size ranges in aerosol instrument intercomparisons: A case study for the ATom Mission

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### Introduction

The authors of this comment are the principal investigators for the PALMS single particle mass spectrometer and the aerosol microphysical properties (AMP) size distribution instruments that were operated on the Atmospheric Tomography Mission (ATom). The PALMS authors are the developers of the instrument and associated data analysis methodologies, and have applied the instrument to study the atmospheric aerosol for more than 2 decades.

We write out of concern that this manuscript (Guo et al., 2020; hereafter G20) has serious flaws in the way it represents the PALMS instrument capabilities and the PALMS+AMP data products submitted to the ATom database. Others who use data from ATom and other missions could misunderstand how to utilize PALMS+AMP products in the mission archive. Moreover, G20 introduces into the literature a new “chemical information” metric that has unphysical behavior and lacks mathematical rigor.

This comment will show that that G20: - Analyzes the PALMS data with arbitrary size bins that are too narrow. The combination of a very high size resolution and prescribing zero values to any bins without PALMS particle observations biases the results. - Includes a conceptually flawed “chemical information” metric that leads incorrect conclusions. - Improperly compares instrument performance by using different metrics for different instruments. - Is quantitatively incorrect in several ways: underestimating by large factors the number of particles actually sampled by PALMS, and producing concentrations that are biased low and scale unphysically with sampling time.

These issues were pointed out to the lead authors, who are PIs and scientists associated with the Aerodyne Aerosol Mass Spectrometer (AMS) instrument operated on ATom before submission. There was extensive, but unresolved, discussion, that included us suggesting alternative figures and text. We repeatedly stated that the method of calculating PALMS statistics was not consistent with a detailed description of PALMS data analysis methods (Froyd et al. 2019; hereafter F19) and therefore was likely to

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be inaccurate, and that their “chemical information” metric was both conceptually and quantitatively flawed. Because of the use of PALMS data, K. Froyd and D. Murphy were originally invited to be coauthors on this manuscript but we were removed as authors when agreement could not be reached. Following this, four other authors (comprising the AMP team plus one other) removed themselves from authorship.

The purpose of this comment is to describe these issues in detail as a matter of public record, to help mitigate any misconceptions about the intrinsic merit and capabilities of the PALMS instrument and associated data products, and to form recommendations for the Editor to correct these problems before acceptance of G20 in Atmospheric Measurement Techniques. While much of G20 represents solid research and a valuable contribution to the literature, the sections relating to PALMS are flawed and need to be removed or undergo major revision, as detailed at the end of this comment. The PALMS-AMP data products are very complementary to AMS and SAGA. Each measurement has its own strengths. We continue to be ready to assist the AMS team in representing our data.

#### Background

PALMS by itself cannot derive absolute particle concentrations, as it samples particles with uneven efficiency across its nominal size range of 0.1 to 4.8  $\mu\text{m}$ . This uneven size sampling underlies the methodology developed by F19 which derives absolute concentrations from PALMS by combining it with accurate counting and sizing instruments (the AMP size spectrometers for ATom). Members of the AMS team are coauthors on F19.

#### Arbitrary and narrow size bins

G20 show results obtained by combining PALMS and AMP data (e.g., Fig 8, 9, S28, S29, S30). However, they explicitly do not follow the data analysis procedures used by the PALMS+AMP team for data submitted to the mission archive. Instead, the manuscript “provides an alternative illustration of PALMS size coverage” (line 339).

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Instead of the 4 size bins used by the PALMS+AMP team to derive absolute concentrations, G20 use 20 bins per decade of diameter, or 35 bins across the nominal PALMS size range. The choice of bin width is critical because it significantly affects their analysis of data coverage and derived concentrations. The G20 choice has no physical basis. Presumably, it arises because the AMP team uses 20 bins per decade as a convenient bin size to report optical particle counter data in the data files, minimizing file size while providing adequate resolution for optical calculations. Note that 20 bins/decade is narrow: each bin is only a  $\sim 12\%$  change in diameter. When establishing the methodology to derive concentrations from PALMS, F19 found that grouping the size-resolved PALMS composition data into just four size bins was a good compromise between adequate statistics and changes in particle composition with size. This choice of bin width is extensively and quantitatively evaluated in F19, which states “It is infeasible to retain the raw size resolution of the OPS [optical particle spectrometer, AMP here] for the integrated concentration analysis”.

The G20 manuscript creates a data coverage metric called “chemical information content” or “chemical composition information”. The metric, used in G20 to derive Figs. 8, S29, and elsewhere, assigns an information content of 1 to size bins with particles and 0 to size bins without particles. It is easy to see that this leads to lower values of “chemical information” as the number of size bins is increased.

Imagine, for example, that an instrument has measured 50 particles. If there is no size resolution (one bin), the “chemical information” is always 1. If there are three bins and 50 particles, statistically each bin will almost always contain a particle and the average “chemical information” will be very close to one. But if there are 100 size bins (e.g. the native resolution of the UHSAS optical spectrometer) and 50 particles, at least 50 bins are necessarily empty and the average “information content” will be less than 0.5. With 1000 bins, in this example the “chemical information” metric that is supposed to quantify data coverage would be reduced to  $< 0.05$ . Although of course G20 are not proposing 1000 bins, any metric that can produce arbitrarily small values of the supposed data

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coverage simply by choosing narrower bins must be mathematically invalid.

#### Conceptual flaws in the "chemical information" metric

It is worth exploring some reasons why their metric of data coverage has an unphysical dependence on the width of the size bins. Even if reasonable bin resolution were used and the quantitative errors described below were corrected, the "chemical information" analysis is still conceptually flawed as an indicator of data coverage.

The first reason the "chemical information" metric in G20 is flawed is that it penalizes high-resolution data for empty bins but does not give credit for information obtained from narrower bins. For example, having two size bins instead of one adds information about possible differences in composition between small and large particles; G20 assign no value, either conceptually or mathematically, to this added information.

Second, the G20 analysis does not recognize autocorrelation. In reality, neighboring bins are not independent of each other, either in concentration or chemistry. This is particularly true at the high resolution used by G20. For example, if 200 nm particles are composed of 80% sulfate, it is very unlikely that 225 nm particles are composed of pure organics. If 200 nm particles truly had a completely different composition than 205 nm particles, and those again different than 210 nm particles, etc., PALMS would need to sample an enormous number of particles to fully characterize the size-dependent composition. If all the particles from 100 nm to 5  $\mu\text{m}$  in a given air mass were exactly the same, PALMS would only need to sample a few particles. Naturally, the amount of data required is in between these extremes.

When analyzing PALMS data coverage, G20 do not consider that different size particles may have correlated compositions, yet that assumption is implicit in the interpretation of AMS and SAGA data. Without it one would have no idea, for example, if a 50:50 organic-sulfate mixture represented mixed particles, small pure organic particles and large pure sulfate particles, or vice versa. The AMS collection efficiency (bounce) correction, which is based on bulk composition, also assumes similar particle compo-

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sitions at different sizes. For example, if 150 nm particles were ammonium sulfate and 250 nm particles were sulfuric acid, the AMS bounce correction would be incorrect.

A rigorous analysis of information and data coverage is beyond the scope of this comment but we can point out that that it should be framed in terms of detection limits. The G20 "chemical information" metric conflates information about the instrument with information about the atmosphere. In a typical 3-minute period in the stratosphere PALMS measures no 30 nm particles and no 3  $\mu\text{m}$  particles. G20 assign the same zero value to these, yet they are very different. The former is a statement about PALMS because 30 nm is far below PALMS' nominal size range, whereas the latter is a statement about low concentrations in the stratosphere. In G20 this is evident in Fig. 8 for example, where zero "information content" is assigned at high altitudes to large sizes that PALMS samples well (because the atmosphere there contained almost no large particles). This illustrates why the scientific literature conventionally discusses detection limits for in-situ instruments rather than "chemical information". When one compares an instrument detection limit with an atmospheric concentration it properly separates instrument performance from atmospheric properties. There are mathematically rigorous ways of defining information content for aerosol size distributions (Preining, 1972) in the context of a priori information (Petty, 2018), yet an arbitrary metric is developed in G20 instead.

#### Flawed instrument comparisons

The G20 manuscript applies different metrics to different instruments, leading to biased comparisons. In particular, G20 Fig. 8, the primary comparison of instrument measurement capabilities, is not internally consistent. The "chemical information" metric is applied only to PALMS, not the other instruments. PALMS data coverage is derived using a limited (3 minute) sample time. Imposing this sample time restriction only on PALMS misrepresents its size range and data coverage relative to the other instruments. Were a similar information content or sample time restriction imposed on AMS and SAGA, a high fraction of samples would be below detection limit. At the native sampling times

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for AMS or SAGA (1 min and ~5-15 min, respectively), 72% of AMS and 35% of SAGA samples are below their detection limits for a major chemical component (sulfate, ammonium, nitrate, or organic material). Such samples have little “chemical information” across all sizes beyond being able to say “below detection limit”, yet that is ignored in G20 Fig 8, where instead AMS and SAGA are shown to detect 100% of particles within their nominal size ranges. On the same 3 minute sample time as PALMS, over 60% of AMS organic data in the tropical Pacific are below detection limit, yet G20 assert that those data have more “chemical information” than PALMS data above detection limit.

Quantitative errors: scaling and number of particles.

A quantitative error in G20 is that their derived PALMS+AMP concentrations in Fig. 8 and elsewhere scale improperly with sampling time. This is illustrated in Fig. S29, where increasing the PALMS sampling time from 3 to 60 min increases the PALMS+AMP number and volume. Although PALMS observes more particles with longer sample time, higher particle counts do not translate into higher derived concentrations. The G20 method to derive PALMS+AMP concentrations is therefore flawed: physical concentrations do not scale with sample time. The method of F19 does not have this problem.

Figure 1 below shows that it is essential to use information across wider bins than 20/decade to obtain accurate concentration measurements with PALMS+AMP. If one simply puts zeros in empty bins, as in G20 Fig. 8, the resulting concentrations have large discrepancies and are biased low.

The G20 manuscript also strongly underestimates the number of particles sampled by PALMS. Fig. S14 in G20 is the basis for the derived PALMS+AMP concentrations in Fig 8 and elsewhere. Although their estimated sampling rate near the peak sampling efficiency at around 300 nm appears reasonable, their estimates have large errors for smaller and larger particle sizes, exactly those most important for data coverage (Figure 2). For instance, for the narrow bin at 1005-1128 nm G20 calculate that PALMS

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observed ~500 particles over an ATom deployment, whereas PALMS actually observed over 14000. Considering the 5 bins/decade curve on G20 Fig. S14, they underestimate the average sampling rate for the bin centered near 130 nm by a factor of about 10 and underestimate the PALMS sampling rate above 1  $\mu\text{m}$  by factors of 8 to 40. Similar errors apply to all other curves in S14. These errors presumably propagate into all calculations in the manuscript (Fig 8, 9, S15, S28, S29, S30, and Table S2). Underestimating the number of particles sampled by PALMS by x10 and higher factors will seriously affect the conclusions of the manuscript.

Specifically, G20 state (line 345) “The probability of detecting on average one valid particle per AMP size bin in the PALMS is very low below ~160 nm and above 1000 nm over a typical 3 min analysis period.” In contrast, on average PALMS actually measured in 3 minutes the composition of about 4 particles smaller than 160 nm and about 10 particles larger than 1  $\mu\text{m}$ . G20 (lines 336 and 694) also refer to PALMS+AMP products for small and large particles as “extrapolations”. In reality, during the ATom deployments PALMS measured over 100,000 particles between 100 and 180 nm diameter and almost 100,000 between 1 and 4  $\mu\text{m}$ .

We provided the AMS team with unpublished data on the PALMS sampling rate (the red curve on their Fig. S13), and allowed them to use these data even after we were removed as coauthors. We have been unable to replicate exactly how they arrived at their underestimates of PALMS sampling rates. The manuscript states (Fig. S14 caption) that they used a detection efficiency and multiplied it by a flow rate and atmospheric concentrations. However, according to F19, using a detection efficiency curve for PALMS is “not recommended due to many possible pitfalls and large, unquantifiable errors.”

Summary

The incorrect calculation of the number of particles sampled by PALMS and the use of arbitrarily narrow bin widths together lead to low assessments of the PALMS data

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coverage. G20 assert (line 691, also Table S2 and Figs 8 and 9) that the PALM+AMP data characterize about 54% of the aerosol volume within 3 minutes of sample time during the ATom flights. Figure 3 shows cumulative size distributions for the ATom flights. One can see that a 54% fraction of the volume within the nominal PALMS size range is implausibly low.

The analysis of the PALMS+AMP data in G20 has both quantitative and conceptual errors. Even if the quantitative errors were fixed, the “chemical information” metric of data coverage would still be conceptually flawed. G20 Figs. 8 and 9 and the stated size-dependent numbers of PALMS-sampled particles are incorrect by large margins, as is the 54% PALMS volume coverage figure. Finally, instruments are not compared using the same criteria: only the PALMS data are scaled by “chemical information” using a limited sample time, and an implicit assumption that particle composition is uncorrelated across nearby diameters is applied only to PALMS.

The manuscript is not suitable for publication unless the incorrect calculations, the “chemical information” analysis, and all associated discussion are removed. Specifically, in G20, Figs. 8, 9, S14, S15, S28, S29, and S30 show incorrect information about PALMS. The associated discussion starting on line 331 is incorrect, as are the data coverage percentages following line 689, line 744, and in Table S2. The red curve on Fig. S13 is correct but mislabeled.

Instead of the existing panels showing PALMS+AMP data coverage in Fig. 8, we would support a figure similar to the bottom panel of G20 Fig. S29 or S30. These do a good job of illustrating the coverage of the PALMS data and how PALMS samples within the four broad size bins established in F19.

#### References

Froyd, Karl D., Daniel M. Murphy, Charles A. Brock, Pedro Campuzano-Jost, Jack E. Dibb, Jose-Luis Jimenez, Agnieszka Kupc, Ann M. Middlebrook, Gregory P. Schill, Kenneth L. Thornhill, Christina J. Williamson, James C. Wilson, and Luke D. Ziemba,

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A new method to quantify mineral dust and other aerosol species from aircraft platforms using single-particle mass spectrometry, *Atmos. Meas. Technol.*, 12, 6209-8239, <https://doi.org/10.5194/amt-12-6209-2019>, 2019.

Guo, H., P. Campuzano-Jost, B. A. Nault, D. A. Day, J. C. Schroder, J. E. Dibb, M. Dollner, B. Weinzierl, and J. L. Jimenez, The importance of size ranges in aerosol instrument intercomparisons: A case study for the ATom mission, *Atmos. Meas. Tech. Disc.*, submitted manuscript, 2020.

Petty, G. W., On some shortcomings of Shannon entropy as a measure of information content in indirect measurements of continuous variables, *J. Atmos. Oceanic Technol.*, 35, 1011-1021, <https://doi.org/10.1175/JTECH-D-17-0056.1>, 2018.

Preining, O., Information theory applied to the acquisition of size distributions, *J. Aerosol Sci.* 3, 289-296, [https://doi.org/10.1016/0021-8502\(72\)90050-X](https://doi.org/10.1016/0021-8502(72)90050-X), 1972.

Figure 1. PALMS+AMP sulfate mass concentrations if one inserts zero values in bins without particles (20 bins/decade) in a 3-minute period, compared to the PALMS standard method used for data in the ATom mission archive (x axis).

Figure 2. A comparison of the G20 calculation of the number of particles ostensibly sampled by PALMS with the number actually sampled. The red dashed curve is from Fig. S14 in G20. The black curve is the average number actually sampled out of cloud expressed as particles per 3 minutes. This shows 5 bins/decade; other bin sizes have similar discrepancies. Thin dashed lines are individual deployments. (Slight changes in vacuum inlet alignment favored large particles during ATom 2 and 3 and small particles during ATom 1 and 4.)

Figure 3. Cumulative size distributions expressed as the fraction of aerosol volume below 3  $\mu\text{m}$  optical diameter. Solid lines are data taken below 2 km altitude and dashed lines above 2 km. Horizontal grey bars show approximate size ranges for AMS and PALMS+AMP data. These are averages of all ATom data out of cloud and west of 60°

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W longitude. The last criterion is just a simple way to exclude strong biomass and dust plumes near Africa.

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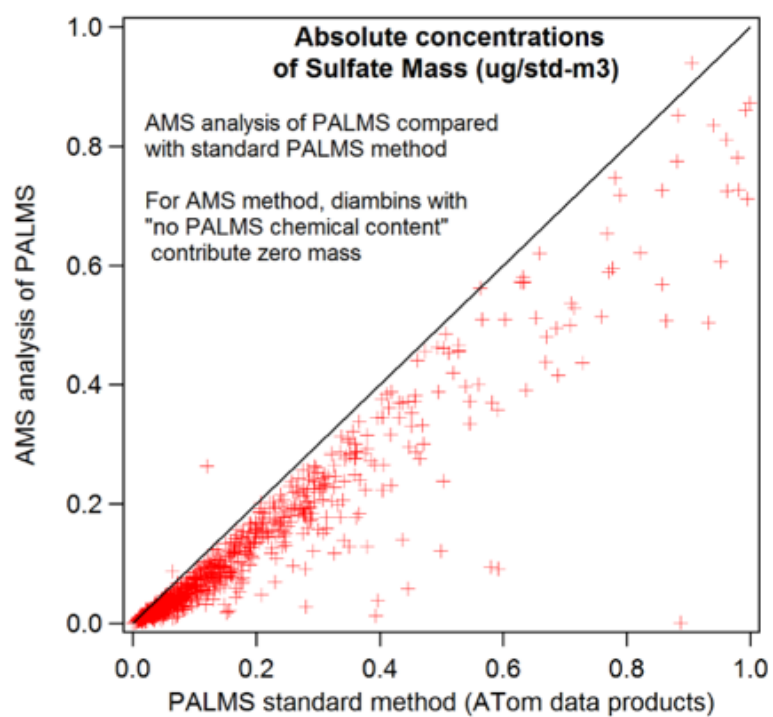


Fig. 1.

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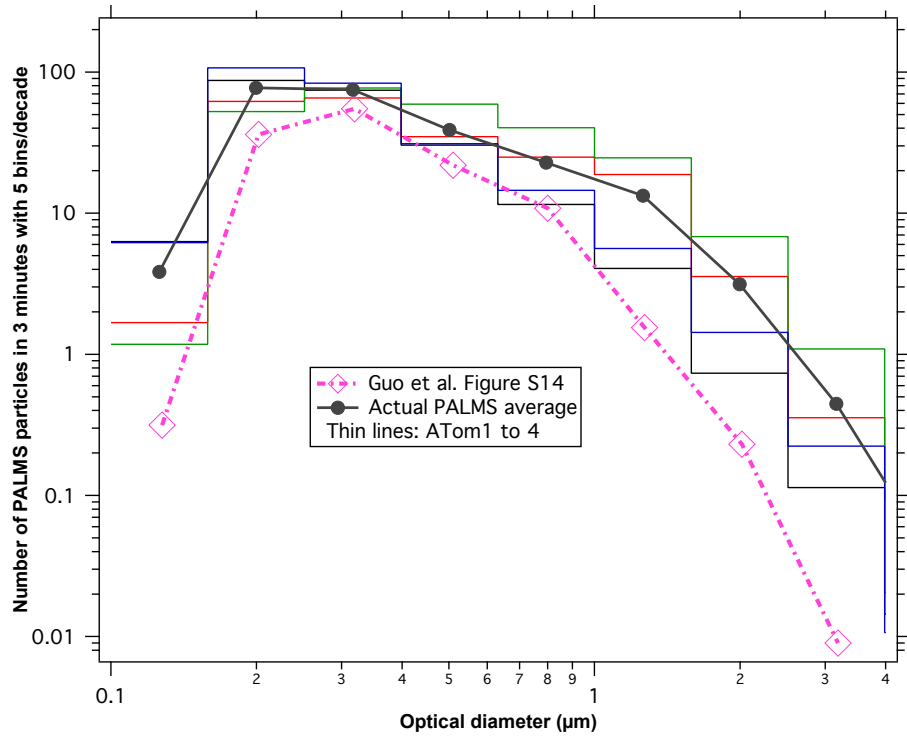


Fig. 2.

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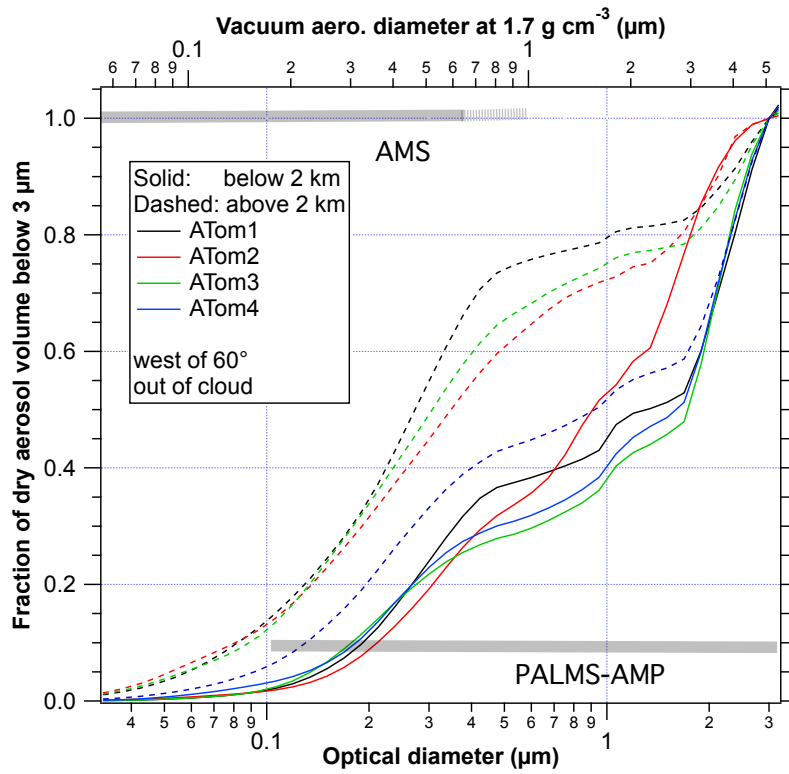


Fig. 3.

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