

Answers to Wenche Aas:

The authors thank Wenche Aas for her detailed review of the manuscript, for the meticulous pointing of incoherencies between tables and figures, as well as for all their comments and suggestions allowing a clear improvement of the paper.

During the review process, the routines for MK trend analysis were translated into R and an error was found in the selection of data for north hemispheric winter season. This error was corrected in the original matlab routines leading to minor changes in slope absolute values for most of the stations, but also sometimes to modification of the statistical significance. The more important changes are:

- ALT was the only station with ss trend in absorption coefficient and this was the only case where there is a strong discrepancy among the analysing methods, MK being ss positive, LMS/log not ss and GLS/day ss negative. The correction leads to MK not ss trend in absorption coefficient at ALT and remove therefore the solely strong discrepancy between the methods.
- MLO has a ss negative trend in scattering coefficient for the last 10 y, leading to a better agreement between scattering and absorption trends. The evolution from positive to negative ss trends is now well established.
- Some other not ss present-day trends are now ss negative (RMN scattering coefficient, CPR absorption coefficient, THD single scattering albedo) or ss positive (PUY single scattering albedo, MSY scattering Ångström exponent, LLN absorption Ångström exponent).
- Some ss trends are now not ss: IZO absorption coefficient,
- One trend (JFJ scattering Ångström exponent for the 20y period) change from ss negative to ss positive trend.
- The statistical significance of some of the 10 y trends of the time evolution analysis (Sect. 3.2) is also modified, but these changes do not impact the results.

The revised manuscript and all tables and figures were corrected in order to take into account the new results.

Answers to specific comments:

1. P7, line 35. Why are the trends based on daily medians and not mean? It would have been nice to include a sentence of the choice of aggregation.

The mean is the usual averaging method for normal distribution. In case of skewed distribution, the median is used in order to minimize the effect of outliers. The measured in-situ aerosol parameters all have distributions that strongly diverge from normal distribution and can be best fitted by Johnson distribution (Sect 2.5). Most of the calculated parameters are also not normally distributed. They are sometimes almost normally distributed but only for some stations or, e.g., one of the size cuts. To ensure the

homogeneity of the results, the median was applied in order to minimize the effects of extremes values.

The following sentence was added to the manuscript: “The median was chosen to minimize the effect of extreme values on the average since the measured parameters are strongly not normally distributed and most of the calculated parameters also do not follow a normal distribution”.

2. Page 11. If as stated in line 39 that the TFPW rejection rate is too high, why is the criteria as stated in line 35 significant trend considered only when both PW procedures gave ss?

The PW rejection rate is very low since this method has a very low type 1 error. PW has however a lower power than the TFPW. If both PW and TFPW detect a ss trend, the low rejection rate (low type 1 error) is ensured by the PW and the trend can be considered as ss. If TFPW leads to ss trends but not PW, the trend is considered as a false positive result as the no-trend hypothesis is rejected by TFPW but accepted by PW. At line 33 (p.11), “PW” was misleading used instead of “prewhitening” so that the reader could not differentiate between the method called PW (von Storch, 1995) and the general used of a prewhitening method that comprises both PW and TFPW.

The manuscript was consequently modified and the mention of “false positive” was added at line 38 in order to clarify the explanation : “The standard pre-whitening (PW) by removing the first lag autocorrelation (von Storch, 1995) has a very low type 1 error but also a low test power, whereas the so-called trend-free pre-whitening procedure published by Yue et al. (2002) (called TFPW-Y in Collaud Coen et al., submitted, 2020) restores the test power at the expense of the type 1 error. Both these prewhitening procedures were applied prior to the MK test to assess the statistical significance of the trend. A trend was then considered as ss only if both PW and TFPW-Y were ss at the 95% confidence level or if PW is ss but not TFPW-Y (false negative). Among the trends of all parameters at all stations calculated for this paper, none was ss for the PW but not for the TFPW-Y, meaning that the PW procedure was always powerful enough. In contrast, many trends were not ss when PW was applied, but were ss with the TFPW-Y procedure, leading to false positives and showing that the TFPW_Y rejection rate of the no-trend hypothesis is effectively too high.”

3. Page 11 line 49. What does it actually mean that the seasons are homogeneous?

Yes, annual trend are only considered is seasons are homogeneous. If Z_i is the Z Mann-Kendall statistical for the i season,

$$X^2_{total} = \sum_{i=1}^m Z_i^2 = X^2_{homogeneous} + X^2_{trend} = X^2_{homogeneous} + m * \bar{Z}^2$$

$$\text{where } \bar{Z} = \frac{1}{m} * \sum_{i=1}^m Z_i$$

$$\text{Then } X^2_{homogeneous} = \sum_{i=1}^m Z_i^2 - m * \bar{Z}^2$$

Both X statistic have a chi-squared distribution with $m-1$ degrees of freedom, m being the number of seasons. Their statistical significance can then be assessed (see e.g. Table p.

114 of Gilbert, 1987). Trends between seasons are homogeneous if $X^2_{homogeneous}$ is ss. We chose a ss confidence level of 90% for this study (see sect. 2.5.1, p. 12). Since the test for homogeneity between seasons is extensively explained in cited publications and due to the length of the manuscript, the authors does not consider a complete description in the paper as necessary. Gilbert (1987) and Sirois (1998) are however mentioned at p. 12 line 1 in the revised version: "The annual trends were considered only if the slopes of the four seasons were homogeneous at the 90% confidence level (Gilbert, 1987; Sirois, 1998)."

Homogeneous trends are mentioned with red squares on Figure 2.

4. Figure 2. Spelling mistake in caption. RMN should be MRN

Both stations (RMN and MRN) exist. Figure 2 relates to MRN and not to RMN.

5. Page 12. Line 40. GLS/ARB trends for MLO: "the longer periods exhibit ss negative trends". Should read positive trends if to be similar as MK, and it also looks like positive trends in Figure 3.

Yes. The text was modified accordingly.

6. Figure 3. The fitted curves are for the longest periods I assume, (small) different fit for shorter periods?

The total fit (in red and orange) corresponds effectively to the longest period whereas the fitted linear trend (in black and grey) are plotted for varying periods. The fitted seasonal cycle is to some extent different for shorter periods, since the amplitude of the cycle is not allowed to change with time. For example, the GLS/ARB fit of the last 10 y with a negative linear trend will better correspond to the original time series minima than the plotted fitted with the positive linear trend for the last 30 y.

7. Figure 4. ALT is missing on the map. The site is present in Figure 5.

ALT is not missing but in light green corresponding to ss negative trend with slope smaller than -0.02. The color is perhaps not well visible so that it was changed to a stronger one.

8. P 12, L 43-45. If the seasonality fit is better using daily median compared to the GLS/ARB data, why not also use daily data for the LMS analysis. That would make all three methods more comparable to the data used in the MK test?

The monthly median for the LMS analysis was first chosen so that the present analysis can be compared to CC2013. The second strong argument concern the presence of negatives: for some stations sampling very low aerosol concentrations, there is a large amount of negative daily medians, particularly for the absorption coefficient. Since the logarithm of the data is taken for the LMS analysis, daily medians would result in a corresponding amount of missing values that concentrate in the season with the lowest aerosol concentration. For some stations and parameters, this can also lead to a distortion of the comparison with the other methods.

9. P13, 42-44. The paragraph of MLO seems a bit station specific, while the rest of the bullet points represent regions. Maybe add a sentence that this site represents the Pacific as in table 4 and then maybe include CGO?

The referee remark is pertinent. CGO is now associated to MLO as representative of the Pacific region and, due to the lower amount of stations in the Pacific, this bullet point was shifted lower. The present text is:

"The only two stations representing the Pacific region are MLO and CGO. The recent MLO 10 y σ_{sp} trend is ss decreasing, the σ_{sp} 15 y trend is not ss, whereas the trends for the longer time periods (20-30 y) are ss positive (see Fig. 2). In the previous decadal trend paper (CC2013), MLO exhibited a ss positive trend for the 10 y period ending in 2010. MLO σ_{sp} trends changed then from previously ss positive to nowadays ss negative trends. The recent 10y at CGO is found to be positive and quite homogeneous with the seasons, with fall being the only season without a ss trend."

10. P14, line 18. GLR does not turn up as ss positive in Figure 12 or 4, though in Table 2

Thanks for pointing at this incoherence. The GLR scattering coefficient has a period of about 2 years with higher minima in the middle of the time series that cannot be explained by any instrumental change or station history. The removal of this period lead to not ss positive trend, whereas keeping this period lead to ss positive trend. The authors and the station manager finally decided to present the result with the removal of that period, leading unfortunately to these inconsistencies between the text, Table 2 and the figures. This is however corrected in the revised version with the correction of Table 2 and the removal of the mention of the GLR ss positive trend at p. 14 line 18.

11. P14, line 20. "PM10 trends are five times larger than PM1", maybe rewrite to "scattering trends of PM10 aerosols are five times larger than PM1". Do not find separate results for the different size cut off. Could they be included in Table 2 and Figure 12? And maybe indicate which size are chosen for Figure 4 and 5?

The manuscript was modified:" At CPR, the largest scattering trend is found in summer and the scattering trend of PM10 trend is five times larger than the PM1 trend".

As stipulated at Sect. 2.4, the paper presents the TSP/PM10 trends and PM1 results are only presented if they are different from PM10 results. This occurs quite rarely, but CPR is one of this case as mentioned at p. 14 line 20. All figures and tables consequently present TSP/PM10 trends. If the values of the slope are usually slightly different for PM1 trends, an inclusion of these trends for all aerosol parameters in Table 2 and in all figures would contribute to dilute the main results without bringing much more valuable information. The differences between both size cuts are so small that the authors did even not consider showing them in the supplement for clarity purpose.

12. P14 line 27-31. Do not understand the possible "enhanced" NPF. The references only describes that you may have more NPF at high altitudes but not the possible trends. If the NPF should mask the trend we would expect more NPF in present day than earlier, or?

Exactly. The NPF are "enhanced" at high altitudes compared to low altitudes NPF rate. This means that the ratio of new particle over the total particles concentration is larger at high altitude and can potentially mask the trends observed at lower altitudes. The manuscript was modified leading hopefully to less confusion:

“New particle formation (NPF) and growth are favored at high altitudes (> 1000 m and up to 5000 m) due to low temperatures, high solar radiation and low pre-existing particle concentrations leading to limited condensational sinks for nucleation precursor gases (Sellegrri et al., 2019). This higher frequency of nucleation at high altitude leads to a high contribution of secondary particles to the total number concentration that largely contributes to the total scattering coefficient. The decreasing σ_{sp} trends from anthropogenic pollution in the planetary boundary layer can, consequently, be masked by the presence of NFP at high altitude stations.”

13. P14 line 43. Not only ALT with positive trend, also NMY.

Sorry, this is a typo on Table 2, Figure 6 was right. NMY has a ss tiny negative trend.

Anyhow, the MK trend analysis was recomputed due to the error in the selection in winter season and ALT trend remains positive but not ss. The text, figures and tables were consequently modified.

14. P15 line 8. WLG show negative trend in Figure 6, Table 2 and Figure 13.

You're right. This is an analysis that come from a previous version without 2017-2018 data for WLG. The manuscript was modified:

“In Asia, both the high altitude station of LLN in Taiwan and WLG in China exhibits annual ss decreasing σ_{ap} trends. The south Korean coastal station of AMY has no ss annual trend.”

15. P15 line 11-12. NMY (and ALT) show positive trend

Similarly to answer at comment 13, there is a typo in Table 2, figure 6 being right. NMY has a ss negative trend. ALT was positive but the recomputed trends lead now to not ss trend for ALT.

16. Figure 6. Seems like several of the sites miss information (outside circles) of longer trends than the last 10 years. I.e. JFJ, FKL, IPR, UGR etc.

The JFJ trend is masked by other stations since I always plot the longest trend first in order not to mask stations with shorter trends. FKL is present but in light green that is not very visible. This color was changed. IPR and UGR have only 10 y trend since their time series are shorter than 15 y.

17. There are two Figure S7. The first with backscatter trend should maybe be in the paper?

No, this is a typo in the supplement, the last figure name was changed to S8 and the text (p. 15 line 27) was also adapted (S7 to S8). Thanks for this observation.

18. P15, line33. Not sure about "Mostly decreasing". The mean trend is decreasing maybe (Table 4), but only 1 site with ss negative trend (SGP)

In North America, there are three ss decreasing trends (BND, SGP and THD), two ss increasing trends and one not ss trend. Anyhow, this is visible in Figure 7 but Table 2 missed the minus sign for BND and THD, which is a mistake. Table 2 was modified.

19. P16 line 9-10. Why not mentioned that the polar sites ALT and ZEP show positive trends?

You are right, the positive trends at ALT and ZEP are missing. The manuscript was consequently modified:

“The Arctic stations of ALT and ZEP have ss positive ω_0 annual trends, which are due to ss positive trends from March to August for ALT and from December to May for ZEP.”

20. Chapter 3.2. When I read chapter 3.1, I used the Figures developed for 3.2 since they are connected and give a more complete picture. Think the presentation of trend results would have benefited to combine these chapters.

It was difficult to decide if the present-day trends and the time evolution of the trends should be presented together for each aerosol parameters or treated separately. We decided to treat them separately for clarity purpose, because i) there are some stations, which end their measurements before 2016 leading to no present-day trends and ii) there are not many stations with more than 15 y of measurement (scattering coefficient: 17, absorption coefficient: 5, single scattering albedo: 4) allowing a complete discussion of the trend evolution. We recognize that this choice also has inconveniences but they seem to us, however, not sufficient to merge sections 3.1 and 3.2.

21. P17 line 36. I don't find the trends in Figure 12 that much scattered, and I am not sure if one can track the differences back to abatement strategies. The UGR site is urban and influence by Saharan dust and is not representative for detecting general trends in Europe. The increase in SMR the latter periods might be do to increase emissions of BVOCs from the boreal forest? The trends in observed and modelled chemical composition in Europe are non linear due to changes in atmospheric chemistry. Maybe refer to some model/observation studies Europe trends for comparison. E.g: Banzhaf, S., Schaap, M., Kranenburg, R., Manders, A. M. M., Segers, A. J., Visschedijk, A. J. H., Denier van der Gon, H. A. C., Kuenen, J. J. P., van Meijgaard, E., van Ulft, L. H., Cofala, J., and Builtjes, P. J. H.: Dynamic model evaluation for secondary inorganic aerosol and its precursors over Europe between 1990 and 2009, *Geosci. Model Dev.*, 8, 1047–1070, <https://doi.org/10.5194/gmd-8-1047-2015>, 2015.

Ciarelli, G., Theobald, M. R., Vivanco, M. G., Beekmann, M., Aas, W., Andersson, C., Bergström, R., Manders-Groot, A., Couvidat, F., Mircea, M., Tsyro, S., Fagerli, H., Mar, K., Raffort, V., Roustan, Y., Pay, M.-T., Schaap, M., Kranenburg, R., Adani, M., Briganti, G., Cappelletti, A., D'Isidoro, M., Cuvelier, C., Cholakian, A., Bessagnet, B., Wind, P., and Colette, A.: Trends of inorganic and organic aerosols and precursor gases in Europe: insights from the EURODELTA multi-model experiment over the 1990–2010 period, *Geosci. Model Dev.*, 12, 4923–4954, <https://doi.org/10.5194/gmd-12-4923-2019>, 2019.

The term “homogeneous” is effectively not correctly chosen. The sentence was modified:

“The evolution of the European σ_{sp} 10 y trends does not show a clear time for trend modification like in North America, probably due to delays in abatement policies in each individual country.”

Both publications of Banzhaf and Ciarelli are very relevant to discuss the trends in in-situ aerosol parameters, so that they were introduced in the discussion section 4.2 (see next comment 22) and 4.3:

Sect 4.3:” Moreover, emission changes can lead to modification of the atmosphere chemistry. Banzhaf et al. (2015) shows, for example, that the sulfate and nitrate formation have increased in efficiency by factors between 20-25% between 1990 and 2009 leading to lower trends in sulfate and total nitrate concentrations than the trends in precursor emissions and concentrations. ”

22. P22 line 26. Does it have to be anthropogenic sources? Changes in natural sources, typically BVOC may contribute? May a change in atmospheric composition contribute to smaller aerosols, i.e. less sulfate aerosols and more ammonium nitrate which potentially might be smaller?

This is a very interesting comment and these criteria were introduced:

“Trends towards smaller particle size might be due to an increase of near anthropogenic sources of pollution, to an increase in new particle formation, to a decrease of long-range transport of anthropogenic pollution, to increased scavenging of larger particles due to changes in atmospheric conditions, to a modification of atmospheric chemistry (Banzhaf et al., 2015) or to a change in both primary and secondary natural aerosol (e.g. an increase of biogenic secondary aerosols and their precursors as demonstrated by Ciarelli et al., 2019).”

23. P22 line46-Bodhain and Dutton, 1993 is a quite old reference, maybe add e.g. Hand et al 2012 for a longer trend analysis for especially sulfate. Further, one should probably mention that the in Asia the decrease started rapidly after 2013 when the China’s Clean Air Action was implemented. Maybe add Paulot et al (2018), which gives a nice global overview of trends using satellites and models

Hand, J. L., Schichtel, B. A., Malm, W. C., and Pitchford, M. L.: Particulate sulfate ion concentration and SO₂ emission trends in the United States from the early 1990s through 2010, *Atmos. Chem. Phys.*, 12, 10353–10365, <https://doi.org/10.5194/acp12-10353-2012>, 2012.

Paulot, F., Paynter, D., Ginoux, P., Naik, V., and Horowitz, L. W.: Changes in the aerosol direct radiative forcing from 2001 to 2015: observational constraints and regional mechanisms, *Atmos. Chem. Phys.*, 18, 13265–13281, <https://doi.org/10.5194/acp18-13265-2018>, 2018.

The old reference of Bodhaine and Dutton was used on purpose to emphasized the fact that the sulphate decrease was recognize since a long time. Hand et al., (2012) was also added as a more recent citation as well as Paulot et al., 2018).

“The beginning of the decrease of the aerosol burden varies with region; the earliest decrease is found in Europe in the 1980’s (Tørseth et al., 2012), followed by North America in the 1990’s (Bodhaine and Dutton, 1993, Hand et al., 2012) and by Asia some 10-15 years ago (Sogacheva et al., 2019, Zhao et al., 2019, Paulot et al., 2018).”

24. P23. Line 49 Pandolfi et al (2016) only show PM trends in NE Spain. There are several other national PM trend studies in Europe (e.g. Germany, France, Switzerland). For a complete overview of Europa it is possible to refer to EMEP TFMM assessment report showing PM trends from both EMEP and AIRBASE for 2002-2012: Colette et al 2016: <https://projects.nilu.no//ccc/reports/cccr1-2016.pdf> (chapter 3.6.1)

Thanks for this reference. Sect 4.4 was improved by clearly differentiate sub-chapters devoted to comparison with other in-situ trends, comparison with ground-based and air-born remote sensing measurements trends and leading to a more global view, and, finally, the causality for the detected trends that are often based on models. New references were then introduced:

“4.4 Comparison with other trends and causality

The current study has focused on surface in situ aerosol optical properties at point locations, primarily in North America and Europe, but also in Asia and Polar Regions. Comparison with reported trends from other long-term measurements of aerosol properties (e.g., surface aerosol mass concentrations, surface chemical mass concentrations, ground-based and satellite column optical properties, etc), can provide a more holistic and global view of changes in the atmospheric aerosol. Model simulations of aerosol trends can also supply insight into global impacts of emission changes. We, thus, present a (non-exhaustive) comparison of the trend results from this study with some other relevant aerosol trend studies in the literature. The supplemental materials of Li et al. (2017) include a summary of trends reported in the literature for AOD, PM_{2.5} and several aerosol constituents (e.g., sulphate, BC, etc.).

There are some important caveats to keep in mind when comparing aerosol trends across platforms and instruments. First, they represent different aspects of the aerosol (chemical, physical, or optical), at different conditions (dry or ambient), different wavelengths (300-1100 nm), different techniques (in-situ, REM) and different locations (ground-based, airborne or satellite). Second, there are differences in the statistical methodologies, both in terms of methods used and data treatment. Third, the periods covered often overlap, but are not the same. Further, some REM measurements can only be made under certain conditions (e.g., daylight and cloud-free conditions versus continuous sampling, over land versus over ocean, etc.), meaning temporal coverage may be quite different. Because of all these differences, we only discuss general tendencies rather than absolute values when comparing trends from different studies. Below we first compare our results with trends from other surface in-situ measurements and REM observations. Finally, we discuss causes of the observed trends and speculate specifically on some of the trends in intensive aerosol properties, which have received less attention in the literature than properties related to aerosol loading.

4.4.1 Comparison with other surface, in-situ aerosol trends

A comparison of the present day trends derived here to our previous trend ending in 2010 (CC2013) demonstrates that the larger number of stations, particularly in Europe, permits a more detailed view of regional trends. The current wide coverage across continental Europe shows decreasing present-day trends. Decreasing σ_{sp} , σ_{bsp} and σ_{ap} trends were confirmed for individual stations (e.g., SMR (Luoma et al., 2019), PAL (Lihavainen et al., 2015b), ARN (Sorribas et al., 2019)), as well as at ACTRIS sites including JFJ, HPB, IPR, IZO, PAL, PUY, SMR and UGR (Pandolfi et al. (2018)). There are some discrepancies in the trends between our current study and Pandolfi et al. (2018) that seem to be principally due to differences in the analyzed periods. Three additional years of data were included in this study and some older periods included in Pandolfi et al. (2018) were invalidated following the evaluations described in Sect. 2.4. The European b and \dot{a}_{sp} trends computed

by Pandolfi et al. (2018) are similar to the results of this study for most of the stations, in that they also found a general ss increase of b and variable \dot{a}_{sp} trends. In North America the ss decreasing trends in aerosol extensive properties observed in CC2013 are found to have continued in this work with the extended data sets. These results are confirmed by the two other trend studies for in-situ aerosol optical properties in North America. While the methodology and time period of Sherman et al. (2015) were different, the sign and ss of their σ_{sp} , b , and \dot{a}_{sp} trends for BND and SGP were the same as reported here. White et al. (2016) found a decreasing trend in absorption coefficient (estimated from light transmittance measurements on 24 h filter samples) at 110 IMPROVE stations for the 2003-2014 period. SPO σ_{sp} , b and \dot{a}_{sp} trends for the 1979-2014 period (Sheridan et al., 2016) do agree with CC2013 results, whereas the 1979-2018 trends reported in this study suggest an evolution towards more ss positive trends. The very low aerosol concentrations in Antarctica and the difference in the MK algorithm could however also explain the differences amongst these three analyses.

There have been multiple trends studies on carbon species (also referred to as black carbon (BC), elemental carbon, equivalent black carbon, brown carbon or other terms) which is closely related to aerosol absorption. A decreasing trend in BC concentration is found in Europe (Singh et al., 2018, Kutzner et al., 2018, Grange et al., 2019) related primarily to traffic emission decreases rather than changes in wood burning and/or industrial emissions. Similarly, Lyamani et al. (2011) noted a decrease in BC in southern Spain due to the 2008 economic crisis. In contrast, Davulienė et al. (2019) reported an increasing trend in equivalent black carbon (eBC) for the Arctic site of TIK. In North America, White et al. (2016) found that the decreasing elemental carbon trend at IMPROVE sites was larger than the aerosol absorption trend at the same sites due to the impact of Fe content in mineral dust. BC trends in the Arctic have been extensively studied (e.g., AMAP, 2015; Sharma et al., 2019; and references therein) and suggest a decreasing trend. This is consistent with our general trend in absorption for polar regions (Table 4), although for individual stations most trends were statistically insignificant.

Particulate mass (PM) and visibility are other metrics for atmospheric aerosol loading that can be most readily compared with our trends in aerosol scattering. Tørseth et al. (2012) detailed decreases in PM across Europe while Hand et al. (2014, 2019) report significant decreases in PM_{2.5} mass across the US with larger trends in eastern than in western US. Both these trends were also confirmed by the PM trend analysis in Mortier et al. (2020) and are consistent with our reported scattering trends. Li et al. (2016) used visibility to assess trends in atmospheric haze and aerosol extinction coefficient around the world. The time delay in when the trends switch sign between North America (late 1970s), Europe (early 1980s) and China (mid 2000s) correlates with SO₂ trends and the trend differences between eastern and western part of US and Europe are consistent with what is presented in our study.

Many atmospheric aerosols are formed in the atmosphere rather than being directly emitted, so understanding trends in aerosol precursors is also relevant for understanding changes in the atmospheric aerosol. Our study found similar results for scattering as have been found for sulphate trends (Aas et al., 2019), i.e., decreasing sulphate trends across Europe and the US, albeit with the sulphate decrease in Europe beginning before the decrease was observed in the US. Aas et al (2019) also describe potential increases in sulphate in India and increases followed by decreases in SE Asia. Vestreng et al. (2007) monitored the sulphur dioxide emission reduction in Europe and concluded that SO₂ emission reductions were largest in the 1990s with a first decrease in Western Europe in

the 1980s followed by a large decrease in Eastern Europe in the 1990s. Similarly Crippa et al. (2016) simulated a larger impact of policy reduction in Western than in Eastern Europe for NO_x, CO, PM₁₀ and BC between 1970 and 2010. Likewise, Huang et al. (2017) simulated the non-methane volatile organic compounds emissions and found a rapid decrease in Europe and in North America since the 1990s, whereas the emission of Africa and Asia clearly increased between 1970 and 2012.

4.4.2 Comparison with remote sensing trends

A significant advantage of many REM platforms is their global coverage. Satellites often provide coverage over both land and ocean and the major ground-based REM network AERONET (Holben et al., 1998) is more globally representative than the sites used in this study. However, there are some inherent limitations in comparing aerosol optical property trends from REM retrievals with surface in-situ trends. Our study used aerosol optical measurements made at low RH (typically RH<40%) at the surface, while column aerosol optical retrievals are made at ambient conditions and represent the atmospheric column including layers aloft. Only in the situation of a well-mixed atmosphere, will it be reasonable to compare trends in surface in-situ optical properties with those obtained by ground-based or satellite retrievals. It has also to be mentioned that satellite measurements are less sensitive to the near ground layers containing the greatest aerosol load. Thus, while our trends can be compared with those for column aerosol properties, there is no reason to expect them to be in complete agreement. Below we discuss trends in PM, AOD, column σ_{ap} and column SSA.

Satellites have been used to assess the decreasing PM trends in North America and Europe and also to estimate PM trends in other regions with sparse surface measurements. For example, Nam et al. (2017) evaluated the trend in satellite-derived PM10 over Asia and reported mixed annual trend values depending on the subregion they looked at. Li et al. (2017) found satellite-derived PM2.5 to continuously increase in some parts of Asia (e.g., in India) for the 1989-2013 period - we also find an increasing trend (for aerosol absorption) at the one site we studied in India (MUK). For China, Li et al. (2017) report that the PM2.5 trend transitions from an increasing to a decreasing trend with the transition occurring in the 2006-2008 time period similar to the sulphate trend pattern reported by Aas et al. (2019). The in-situ measurements from China (WLG) and Taiwan (LLN) used in our study are not long enough to detect this transition.

Multiple ground-based REM studies (e.g., Yoon et al., 2016, Wei et al., 2019, Mortier et al., 2020,) report decreasing trends in AOD over the US and Europe with larger decreasing trends over Europe than over the US, which is the case in our study (see Table 4) as well. The lack of measurements in many regions similar to the lack of representativeness in the surface in-situ aerosol sites discussed in this study (Asia, Africa, South America, etc) are also emphasized. Ningombam et al. (2019) analyse AOD 1995-2018 trends from 53 remote and high altitude sites, of which 21 had ss negative trends. Regionally, Ningombam found primarily negative trends at sites in the US, Europe and polar regions. Their findings for sites in China and India suggested mixed trends with some being positive and some negative in those regions. Some of the sites in Ningombam et al. (2019) were also involved in our study. The trends they find for AOD at LLN and MLO are similar to ours (i.e., not ss trends) at SPO (i.e., ss increasing) and at SGP (i.e., decreasing (note: they refer to SGP as 'car')). Their results are different for IZO (we found no ss trends for

scattering while they reported ss decreasing AOD) and at BRW and BIR (we found ss decreasing scattering trends but they found not ss AOD trends).

Satellite retrievals can offer an even more global picture of aerosol trends than the surface based REM data. Various satellite trend analyses present a picture of trends in aerosol optical depth for different regions of the world that is quite consistent across satellite (and ground-based) AOD datasets. For example, for the satellite literature that we surveyed, all found decreases in AOD over the US and Europe (e.g., Hsu et al., 2012, Mehta et al., 2016, Zhao et al., 2017, Alfaro-Contreras et al., 2017, Wei et al., 2019) consistent with what we have reported for the AOD from ground-based, REM instruments. As we note above, this is also consistent with surface in-situ scattering trends.

There are some discrepancies in the various satellite derived AOD trends over Asia that are likely due to differences in time period of analysis, trend methodology, regional definitions and/or perhaps satellite data product. Nam et al. (2017) found AOD trends varied depending on what part of Asia was being evaluated. Zhao et al. (2017) reported an increasing then decreasing trend over China, which was also suggested by others (e.g., Sogachova et al., 2019; Alfaro-Contreras et al., 2017). Wei et al. (2019) found a slightly negative but statistically insignificant AOD trend for China. Our study found statistically insignificant trends in aerosol loading for both the high-altitude surface site in China (WLG) and in Taiwan (LLN), perhaps because measurements at both these sites span the AOD increase/decrease periods mentioned by Zhao et al. (2017). Over India, increasing trends in satellite AOD were reported by all the literature we surveyed (e.g., Wei et al. 2019; Mehta et al., 2016; Hsu et al., 2012; Alfara-Contreras et al., 2017). This is consistent with our finding of an increasing trend for aerosol absorption for the one Indian site (MUK) in our study.

The satellite measurements also enable evaluation of aerosol loading changes in regions with few to none long-term surface in-situ aerosol optical property measurements. The Middle East exhibited an increasing trend in AOD, while South America exhibited variable trends (e.g., Wei et al., 2019; Metha et al., 2016, Hsu et al., 2012; Alfaro-Contreras et al., 2017). Wei et al. (2019) found a statistically insignificant trend in South America and suggested it was due to complex and changing aerosol sources. Mehta et al. (2016) looked specifically at Brazil and found a decreasing annual AOD trend, but an increasing AOD trend in springtime. Decreasing AOD trends were found over central Africa (Wei et al., 2019), over the African deserts (Metha et al., 2016) and on African coasts (Alfaro-Contreras et al., 2017) regardless if they are dominated by smoke aerosols (southwest) or dust (northwest).

In addition to AOD, trends for other column aerosol property such as column σ_{ap} and column SSA can be considered. While there appear to be many investigations focusing on trends in column aerosol properties other than AOD at individual sites, there are only a few papers that take a more global, multi-site approach (e.g., Li et al., 2014; Zhao et al., 2017; Mortier et al., 2020). There have been several studies related to changes in column σ_{ap} using AERONET REM retrievals. For example, Li et al. (2014) suggest an increase in column σ_{ap} over the US and a decrease over Europe and at most sites in Asia. More recently, Mortier et al. (2020) found ss decreasing σ_{ap} trends in Europe, North America and ss increasing σ_{ap} trends in Asia and Africa. Zhao et al. (2017) used satellite retrievals and reported decreasing trends of column σ_{ap} over both the US and Europe and a not ss column σ_{ap} trend over China. Nam et al. (2018) suggested there was an increasing trend in column extinction Ångström exponent over Asia based on satellite observations. These

findings are mostly consistent with our results (Table 4) which indicated decreasing \hat{a}_{sp} trends in the US and Europe, but perhaps an increasing trend in Asia.

Comparisons of in-situ and column ω_0 trends are more fraught, because, in addition to the above mentioned caveats related to comparing surface and column measurements, column ω_0 can only be obtained from REM techniques under higher aerosol loading conditions. For example, Kahn and Gaitley (2015) indicate that MISR SSA retrieval requires $AOD > 0.15-0.2$. Similarly, AERONET retrievals require AOD (at 440 nm) > 0.4 (Dubovik et al., 2000). This limits the sites for which column SSA can be retrieved. Andrews et al. (2017) present a plot derived from global model simulations suggesting more than 80% of the globe has annual AOD values below 0.2, and, indeed, many of the surface in-situ sites discussed here are in remote locations with annual AOD consistently below 0.2. Andrews et al. (2017) also suggest there is a systematic variability of SSA with loading that might result in column SSA biases if retrievals are constrained to higher levels of AOD. With these caveats in mind, we can compare our surface ω_0 trend results with satellite column ω_0 trends.

Li et al. (2014) studied 2000-2013 trends in column ω_0 at select AERONET sites. Their findings suggest that column ω_0 is increasing in the US, Europe and Asia. However, they noted the uncertainty in these trends is high because they used level 1.5 data ($AOD < 0.4$) in order to have enough data points for their analysis. Zhao et al. (2017) utilized satellite retrievals and reported decreasing trends in column ω_0 over the eastern US and Europe and a not statistically significant trend over China for the 2001-2015 period. Their results over the US and western Europe are consistent with the overall regional ω_0 trends reported in this study (i.e., Table 4), although Figure 7 suggests there is a fair amount of variability in the surface ω_0 trends at the individual sites in these two regions. Our study found an increasing trend in ω_0 at the surface in Asia (based on 3 sites), which is consistent with Li et al.'s column ω_0 trend but not with the lack of trend in column ω_0 over China suggested by Zhao et al. (2017). But, as noted above, remote sensing retrievals of column SSA should be considered with caution and, clearly, further effort in column SSA trend analysis is warranted.

4.4.3 Causality

While it is beyond the scope of this effort to explore in depth the causes of the observed trends of aerosol optical properties, some general comments can be made. First, tendencies in regional trends for variables representing aerosol loading (e.g., surface in-situ aerosol scattering, PM, and AOD) are generally consistent across multiple datasets. Overall, the main cause of observed decreasing trends in loading is likely strong reduction of both primary aerosols and precursors of secondary aerosol formation connected to mitigation strategies on regional to continental scales (e.g., Huang et al., 2017; Crippa et al., 2016; Pandolfi et al., 2016; Vestreng et al., 2007). Detailed analysis of PM reductions and composition changes in Europe and the US have enabled attribution of the trends to changes in source types and emission levels (e.g., Hand et al., 2019; Pandolfi et al., 2016, Ealo et al., 2018).

The explanations of the trends based on long-term measurements are supported by modelling efforts. Like many satellite retrievals, model simulations also provide global coverage and, in addition, can be used to investigate reasons for observed changes in aerosol. Model simulations described in Li et al. (2017) suggested that the decrease in PM_{2.5} in western and central Europe is principally due to sulfate, whereas in eastern

Europe decreases in organic aerosol also plays a role. The EMEP status report (2019) notes that the difference in emissions trends between western and eastern Europe has become more significant since 2010. Further, the EMEP status report suggests that estimated increasing emissions of all pollutants since 2000 in the eastern Europe are mainly influenced by emission estimates for the remaining Asian areas in the EMEP modelled domain. Similarly, Zhao et al. (2019) used a model to attribute the AOD, ω_0 and \dot{a}_{sp} decreases in North America and Europe to considerable emission reductions in all major pollutants except in mineral dust and ammonia.

For Asia, modelling by Li et al. (2017) suggests aerosol changes are principally related to increases in organic aerosol and secondary inorganic aerosol, whereas the increases in BC, nitrate and ammonium are comparably moderate. Yoon et al. (2016) use a model to ascribe the observed increases in AOD over India to increases in BC and water soluble materials - both related to anthropogenic emissions. Over China, Yoon et al. (2016) observe a disconnect between the model chemical composition and the measured AOD which they explain by noting that the measurement sites they rely on in the region are far from the population centers where most of the emissions occur. Zhao et al. (2019) use a model to attribute the increase in AOD followed by a decrease in AOD to emission increases induced by rapid economic development until 2008-2009 followed by decreases in both anthropogenic primary aerosols and aerosol precursor gases.

Zhao et al. (2017) suggest that the larger reductions in aerosol precursors (e.g., SO₂ and NO_x emissions) rather than primary aerosols, including mineral dust and black carbon can explain the decreases in ω_0 and \dot{a}_{sp} observed over Europe and the US. This is because the secondary aerosols formed from such precursors tend to be primarily scattering, so less secondary aerosol would change the relative balance between scattering and absorption driving ω_0 down. Similarly, secondary aerosol particles tend to be small so a decreasing trend in secondary aerosol would change the relative contribution of small to large particles in the aerosol size distribution and lead to a decreasing trend in \dot{a}_{sp} . In contrast, in Asia simultaneous increases in aerosol precursors and BC before 2006, and a simultaneous decrease after 2011 explains the trends ω_0 and \dot{a}_{sp} they observed there. Modifications in emissions of aerosol precursors also impact the atmospheric chemistry leading to non-linear response of the formation of secondary inorganic aerosol (Banzhaf et al., 2015).

While regional changes in emissions are one driving factor in trends, because of long-range transport, out of region changes in sources also have the potential to affect trends. For example, Saharan dust impacts CPR, IZO and UGR (e.g., Denjean et al., 2016; Rodriguez et al., 2011; Garcia et al., 2017; Lyamani et al., 2008) and its emissions may change (decrease) in a warmer world (Evan et al., 2016). Other examples of sites clearly impacted by long range transport include IZO impacted by North African pollution due to developing industries (Rodriguez et al., 2011), and the high altitude station of MLO which is impacted by Asian pollution (e.g., Perry et al., 1999). Mountainous stations can also be affected by modifications of the planetary boundary layer or of the continuous aerosol layer heights responding to ground temperature or mesoscale synoptic weather changes (e.g., Collaud Coen et al., 2018 and references therein).

The oscillation in trend sign for several variables at the Arctic sites is potentially caused by the very low aerosol loading, but the Arctic region is changing rapidly and the impact of evolving transport patterns, atmospheric removal processes or local sources cannot be excluded (e.g., Willis et al., 2018) and requires closer study.

While both increasing and decreasing levels of aerosol due to changes in anthropogenic emissions have been observed, the role of non-anthropogenic sources may become more important in the future. For example, climate change also affects soil drought and the positive feedback between drought and wildfires can also affect aerosol optical properties (Hallar et al., 2017, McClure and Jaffe, 2018). The number and intensity of wildfires is increasing in several regions (e.g., Moreira et al., 2020; Turco et al., 2018; Hand et al., 2014). McClure and Jaffe (2018) confirmed an increasing trend of PM_{2.5} 98 percentiles in northwest US due to an increase in wildfires superimposed on the global decrease in anthropogenic emissions. Yoon et al. (2016) also note an increase in extreme AOD events in the western US, which they hypothesize could be due to wildfires. Another example of potential changes in natural aerosol may take place in the Arctic, where decreases in sea ice coverage might play a role in natural aerosol increases in the region (e.g., Willis et al., 2018) (decreases in sea ice coverage may also lead to enhanced anthropogenic emissions due to increased human activity (e.g., Aliabadi et al., 2015)). Whether such changes in natural aerosol emissions lead to observable changes in overall aerosol trends or trends at the extremes of aerosol loading is something to look for in future trend analyses.

Detailed studies at each station are necessary to discriminate between direct causes like changes in anthropogenic emissions, and indirect causes related to general climate changes such as drought, changes in surface albedo, biogenic aerosol concentration, atmospheric chemistry, sea ice coverage or atmospheric circulation patterns. The availability of the homogenized data set from this study will provide a useful tool for these types of analyses.

In order to get a truly global overview of aerosol trends, surface in-situ measurements need to be paired with model simulations and satellite observations. This will enable evaluation of the uncertainty in regional and global trends based on deficiencies in spatial and/or temporal coverage. Satellites and models are able to fill the gaps in coverage from ground-based measurements, but both rely on surface measurements for ground truth.”