Evaluating the PurpleAir monitor as an aerosol light scattering instrument

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16 Abstract

- 17 The Plantower PMS5003 sensors (PA-PMS) used in the PurpleAir (PA) monitor PA-II-SD
- 18 configuration are equivalent to cell-reciprocal nephelometers using a 657 nm perpendicularly
- 19 polarized light source that integrates light scattering from 18 to 166 degrees. Yearlong field data
- 20 at the National Oceanic and Atmospheric Administration's (NOAA) Mauna Loa Observatory
- 21 (MLO) and Boulder Table Mountain (BOS) sites show that the 1 h average of the PA-PMS first
- size channel, labeled "> 0.3μ m" ("CH1") is highly correlated with submicrometer aerosol
- 23 scattering coefficients at the 550 nm and 700 nm wavelengths measured by the TSI 3563
- integrating nephelometer, from 0.4 Mm⁻¹ to 500 Mm⁻¹. This corresponds to an hourly average
 submicrometer aerosol mass concentration of approximately 0.2 to 200 µg m⁻³. A physical-
- 25 submicrometer aerosol mass concentration of approximately 0.2 to 200 µg m². A physical-26 optical model of the PA-PMS is developed to estimate light intensity on the photodiode,
- accounting for angular truncation of the volume scattering function as a function of particle size.
- 27 accounting for angular truncation of the volume scattering function as a function of particle size. 28 The model predicts that the PA-PMS response to particles $>0.3 \ \mu m$ decreases relative to an ideal
- nephelometer by about 75% for particle diameters $\geq 1.0 \ \mu\text{m}$. This is a result of using a laser that
- 30 is polarized, the angular truncation of the scattered light, and particle losses (e.g., due to
- 31 aspiration) before reaching the laser. It is shown that CH1 is linearly proportional to the model-
- 32 predicted intensity of the light scattered by particles in the PA-PMS laser to its photodiode over 4
- orders of magnitude. This is consistent with CH1 being a measure of the scattering coefficient
- and not the particle number concentration or particulate matter concentration. The model
 predictions are consistent with data from published laboratory studies which evaluated the PMS
- 35 predictions are consistent with data from published laboratory studies which evaluated the PMS 36 against a variety of aerosols. Predictions are then compared with yearlong fine aerosol size
- distribution and scattering coefficient field data at the BOS site. Field data at BOS confirm the
- model prediction that the ratio of CH1 to the scattering coefficient would be highest for aerosols
- 39 with median scattering diameters $<0.3 \ \mu\text{m}$. The PA-PMS detects aerosols smaller than 0.3 μm
- 40 diameter in proportion to their contribution to the scattering coefficient. The results of this study
- 41 indicate that the PA-PMS is not an optical particle counter and that its six size fractions are not a
- 42 meaningful representation of particle size distribution. The relationship between the PA-PMS 1 h
- 43 average CH1 and b_{sp1} , the scattering coefficient in Mm⁻¹ due to particles below 1 μ m
- 44 aerodynamic diameter, at wavelength 550 nanometers, is found to be $b_{sp1} = 0.015 \pm 2.07 \times 10^{-5} \times 10^{-5}$

- CH1, for relative humidity below 40%. The coefficient of determination r^2 is 0.97. This suggests 45
- 46 that the low-cost and widely used PA monitors can be used to measure and predict the submicron
- 47 aerosol light scattering coefficient in the mid-visible nearly as well as integrating nephelometers.
- 48 The effectiveness of the PA-PMS to serve as a $PM_{2.5}$ mass concentration monitor is due both to
- 49 the sensor behaving like an imperfect integrating nephelometer and to the mass scattering
- 50 efficiency of ambient PM_{2.5} aerosols being roughly constant.
- 51 Keywords: PurpleAir, Plantower PMS5003, nephelometer, low-cost sensor, physical-optical
- 52 model, PM_{2.5}, scattering coefficient, visibility, atmospheric aerosol

53 **1. Introduction**

- 54 Currently there are tens of thousands of low-cost aerosol monitors used by atmospheric research
- 55 groups, air quality monitoring and regulatory organizations, and individual citizen scientists
- 56 around the world. The recent explosion in the number of these sensors (see, for example, Aerosol
- 57 Air Oual. Res. 20(2), 2020, Special Issue on Low-cost Sensors for Air Ouality Monitoring and
- 58 papers therein) is a result of the increased research, regulatory, and citizen interest over the past
- 59 few years. For example, there are over 9,000 active PurpleAir (PA) aerosol monitors (PurpleAir
- 60 LLC, Draper, UT), with sampling locations on almost every continent. The large geographic
- 61 coverage of this array of low-cost sensors presents enormous potential for obtaining valuable
- 62 information on atmospheric aerosol properties and transport processes.
- 63 The majority of these low-cost aerosol sensors are used to monitor the mass concentration of
- 64 particles with aerodynamic diameters $<2.5 \mu m$ (PM_{2.5}) (Kelly et al., 2017; Gupta et al., 2018;
- Zheng et al., 2018; Sayahi et al., 2019; Barkjohn et al., 2020; Holder et al., 2020; Jayaratne et al., 65
- 66 2020; Malings et al., 2020; Mehadi et al., 2020). However, these sensors do not actually measure
- 67 aerosol mass concentrations but light scattered by the aerosols and thus are dependent on the
- 68 aerosol particle size distribution, morphology, and composition. Recently, Hagan and Kroll
- (2020) developed a framework and computer model to estimate the effects of relative humidity 69
- 70 (RH) and aerosol refractive index on PM₂₅ estimated by a number of low-cost sensors. Their
- 71 model assumed that the low-cost sensor lasers were not polarized and could be modeled with Mie theory. The PMS5003 (PMS) was included in their classification scheme as an example of a 72
- 73 sensor that behaved more like a nephelometer than an optical particle counter.
- 74 Three recent laboratory studies showed that the PMS response decreases with particle size. He et
- 75 al. (2020) measured the PMS response to monodisperse ammonium sulfate aerosol particles 76
- having diameters of 0.1, 0.3, 0.5, and 0.7 μ m. The PMS was able to detect 0.1 μ m particles. They
- 77 derived a transfer function that showed that the PMS >0.3 µm channel (CH1) response was
- 78 maximum at particle diameter 0.26 µm but decreased significantly below this size. They
- 79 concluded that the PMS behaved more like a nephelometer than an optical particle counter. 80
- Kuula et al. (2020) generated monodisperse dioctyl sebacate oil droplets from 0.5 to 20 µm and 81 measured the PMS CH1 response versus particle diameter using an aerosol particle sizer (APS).
- 82 Their data showed that the PMS relative response decreased for particles $>0.5 \mu m$ diameter.
- 83 Tryner et al. (2020) evaluated three low-cost particulate matter sensors, including the PMS, by
- 84 exposing them to five different types of aerosols in the laboratory. They found that the ratios of
- 85 PMS-reported to filter-derived PM2.5 mass concentrations were inversely proportional to mass
- median diameter (MMD). Wood smoke had the smallest MMD, 0.42 µm; its PMS PM_{2.5} 86

87 averaged 2.5 times the filter-derived PM_{2.5}. Conversely, oil mist had the largest MMD, 2.9 µm;

88 its PMS PM_{2.5} averaged only 0.23 times the filter-derived PM_{2.5}.

89 Climate modeling requires a robust set of models and atmospheric measurements for predicting 90 anthropogenic aerosol radiative forcing. Currently, there are uncertainties in the modeling 91 results, due in part to the sparseness of ground-based data used to evaluate and refine the models 92 (e.g., Gliss et al., 2021). Satellite observations provide global coverage that can be used for 93 model evaluation, but satellite data require further assessment, particularly when trying to 94 provide information about surface aerosol properties. The Surface Particulate Matter Network 95 (SPARTAN) (https://www.spartan-network.org/; Snider et al., 2015) was specifically designed 96 to assess and improve algorithms to relate satellite retrievals to surface aerosols. SPARTAN 97 operates collocated filter-based PM2.5, aerosol scattering coefficient via nephelometer, and 98 aerosol optical depth (AOD) measurements at approximately 20 sites around the world. Model 99 and satellite uncertainties can be reduced using a distributed set of low-cost sensors that can 100 provide aerosol light scattering estimates at a higher spatial and temporal resolution than is 101 possible using nephelometers alone. Low-cost sensors are increasingly being used along with

102 satellite data to estimate global aerosol impacts (Gupta et al., 2018).

103 There is ongoing scientific debate about the accuracy and precision of these low-cost sensors and

104 their limitations (Morawska et al., 2018; Jayaratne et al., 2020). Many of the recent papers

105 discuss performance evaluations or "calibrations" of these low-cost sensors by comparing their

106 measurements with traditional, research-grade aerosol measurements (Papapostolou et al., 2017;

107 Barkjohn et al., 2020). The concerns over data quality, stemming largely from inexpensive

108 components, lack of transparency of signal processing, and inadequate quality control and testing 109

at the factory, must be weighed against the advantages of low cost and wide spatial coverage.

110 The actual measurement in the PA monitor with its two PMS5003 sensors (PA-PMS), and in

111 many other low-cost aerosol monitors, is of light scattered by particles integrated over a wide

range of angles (Kelly et al., 2017), which has traditionally been done in atmospheric research 112

113 and aerosol monitoring programs using integrating nephelometers. Aerosol light scattering and

- 114 extinction measurements are useful in many applications, including determination of the 115 radiative forcing effects of aerosols on climate change, atmospheric visibility, wildfire/smoke
- 116 impacts, and validation of model outputs and satellite retrievals (e.g., Malm et al., 1994;
- 117 Sherman et al., 2015; Snider et al., 2015; Gliss et al., 2021). Even though most low-cost aerosol
- 118 sensors use light scattering as the basis of their operation, almost none have been evaluated as a
- 119 low-cost nephelometer to estimate atmospheric light scattering. Markowicz and Chilinski (2020)
- 120 conducted a 3 year evaluation of two low-cost sensors versus the Aurora 4000 polar integrating
- 121 nephelometer at a site in southeastern Poland. They found that the mass concentration of
- particles with aerodynamic diameters $<10 \mu m$ (PM₁₀) from the DfRobot SEN0177 and the 122
- Alphasense OPC-N2 were highly correlated ($r^2 > 0.89$) with the aerosol scattering coefficient 123
- 124 measured by the nephelometer. They were able to estimate the 1 h average aerosol scattering
- 125 coefficient from the low-cost sensors with a root mean square error (RMSE) of 20 Mm⁻¹,
- 126 corresponding to 27% of the mean aerosol scattering coefficient.

127 Unfortunately, due to cost, availability, and the expertise required to run them, integrating

128 nephelometers are not operated in great numbers around the world. A recent analysis by Laj et

129 al. (2020) showed 56 long-term monitoring stations reporting their nephelometer data to the

- 130 World Meteorological Organization (WMO) Global Atmosphere Watch (GAW) World Data
- 131 Centre for Aerosols. This count includes nephelometers operated in several monitoring
- 132 networks, including the National Oceanic and Atmospheric Administration's (NOAA) Federated
- 133 Aerosol Network (NFAN, Andrews et al., 2019), the Aerosols, Clouds and Trace Gases Research
- 134 Infrastructure (ACTRIS) network (e.g., Pandolfi et al., 2018), and the Interagency Monitoring of
- 135 Protected Visual Environments (IMPROVE) network (Malm et al., 1994). While there are more
- 136 nephelometers in use around the world for short-term field and laboratory studies, the number
- almost certainly does not exceed a few hundred. This is small compared with the number of low-
- 138 cost aerosol monitors in use globally.
- 139 This paper presents an evaluation of the performance characteristics of the low-cost PA-PMS
- 140 monitor to measure the integrated aerosol light scattering coefficient. It is shown that the PA-
- 141 PMS sensor configuration is similar to a cell-reciprocal nephelometer. A physical-optical model
- based on Mie theory and the PMS geometry is created that predicts scattered light intensity on
- 143 the PMS photodiode and aerosol forward and backward light scattering truncation. PA-PMS
- 144 measurements are compared to yearlong measured aerosol light scattering coefficients at
- 145 NOAA's Mauna Loa Observatory (MLO) in Hawaii and to measured and modeled aerosol light
- 146 scattering coefficients and aerosol size distribution at the Boulder Table Mountain (BOS) site in
- 147 Colorado. Finally, an empirical relationship is developed to estimate the submicron light
- scattering coefficient and its uncertainty from the PA-PMS data.
- 149 With a better understanding of what the PA measures, how it works, and its uncertainties, the
- 150 large network of PA-PMSs could be used to estimate the submicrometer aerosol scattering
- 151 coefficient at visible wavelengths throughout the world. These data could then be used to
- 152 improve chemical transport and general circulation models, advance climate change predictions,
- 153 and provide for better air quality forecasts.

154 **2. Instrument description**

- 155 In this section we first describe the physical and optical characteristics of the PA-PMS to place it
- 156 in the context of nephelometry. We then provide a brief overview of integrating nephelometers,
- 157 which are instruments designed specifically to measure light scattering.

158 **2.1 PA-PMS nomenclature**

- 159 The PMS sensor outputs 14 fields that are processed and reported by the PA. Each of these
- 160 fields will be referred to as a channel. For instance, the PA-reported number concentration of
- 161 particles $>0.3 \,\mu\text{m}$ is referred to as CH1 in the remainder of this paper, number concentrations
- 162 >0.5 μm as channel two (CH2), and so forth. Furthermore, the two PMS sensors embedded in
- 163 the PA will be referred to as either sensor A or sensor B. Therefore, the number concentration of
- 164 particles $>0.3 \mu m$ derived from sensor A will be referred to as CH1A and those from sensor B as
- 165 CH1B. The average of CH1A and CH1B will be referred to as CH1avg. The PMS reports the
- 166 CH1 units as "#/dl", which is the number of particles having diameters >0.3 μ m per deciliter. In
- 167 this paper the PMS units for CH1 are not used.

168 **2.2 Description of the PA and its PMS 5003 sensors**

- 169 The PA monitor integrates two PMS sensors, a Bosch BME280 pressure, temperature, and RH
- 170 sensor and an ESP 8266 chip (<u>https://www2.purpleair.com/pages/technology</u>). The PA-reported

- 171 temperature and RH are based on the sensor attached to the circuit board, and do not necessarily
- represent ambient conditions. The available specifications of the PMS are incomplete, and the
- 173 processing algorithms are unknown (He et al., 2020). The following is based on available
- information and, where needed, professional judgment. Each PMS includes a small laser, a
 photodiode, a small fan to draw air across the laser beam, a microprocessor control unit (MCU),
- and probably an operational amplifier. The MCU processes the signal from the photodiode and
- 177 and probably an operational amplifier. The MCO processes the signal from the photodiode and 177 outputs the following data fields approximately once per second: $>0.3 \ \mu\text{m}$, $>0.5 \ \mu\text{m}$, $>1.0 \ \mu\text{m}$,
- $2.5 \ \mu\text{m}, >5 \ \mu\text{m}, >10 \ \mu\text{m}, PM_1, PM_{2.5}, and PM_{10}$. The PMS denotes the first six data fields as
- particle number concentrations above the designated cutpoint and the last three data fields as
- 180 mass concentrations of particles below the designated cutpoints; the PM data fields are reported
- 181 for two different conditions, "standard particles" and "under atmospheric environment". The PA
- 182 ESP8266 chip calculates 2 min averages of the PMS and BME280 signals. It transmits them
- 183 wirelessly and writes them as a CSV file on a micro SD card.

184 **2.2.1 Airflow and particle losses**

- 185 The recommended orientation of the PA results in aerosol being drawn upward by a small fan
- 186 through four 3 mm diameter entrance holes in each PMS. The aerosol then enters a 9.4 cm^3
- 187 chamber (Fig. S1a) and flows upward, parallel to and exposed to the circuit board as shown in
- 188 Fig. S1b. Particles then make a 180 degree turn through three exit holes at the top of the chamber
- 189 to emerge on the other side of the circuit board and flow downhill through a 1.1 cm³ channel that
- 190 is illuminated by the laser. The total PMS volume is estimated to be 9.4 + 1.1 = 10.5 cm³. The
- 191 PMS volumetric flow rate is estimated to be $1.5 \text{ cm}^3 \text{ s}^{-1}$ (~0.090 lpm) based on measurements
- 192 described in Supplemental Materials Sect. S1. The estimated inlet velocity through the entrance
- 193 holes is estimated to be 5.3 cm s^{-1} .
- 194 The PMS inlet orientation 90 degrees to the wind, upward flow, and the low inlet velocity
- 195 through the sampling holes can result in significant aspiration losses of larger particles (Hangal
- and Willeke, 1990). Aspiration losses are greater at higher wind speeds because it is more
- 197 difficult for the larger particles to follow the streamlines into the low velocity PMS inlet. This
- can result in a lower concentration of larger particles entering the PMS than are in the ambient
- air. Particle aspiration losses are proportional to the particle Stokes number and the ratio of the
- wind velocity to the inlet face velocity (Hangal and Willeke, 1990). More details are provided in
- 201 Supplemental Materials Sect. S1.
- At typical wind velocities of $1-3 \text{ m s}^{-1}$, the ratio of PMS inlet face velocity to wind speed is only 202 203 0.02 to 0.05, much lower than typical sampling ratios of 0.5 to 6.0 (Brockman, 2011). Pawar and 204 Sinha (2020) addressed this problem for the Laser Egg low-cost sensor by putting it in a box and adding a 40 lpm fan to increase the inlet-to-wind velocity ratio and to direct the airflow upward 205 206 to the Laser Egg inlet. During calm winds, large particle aspiration losses may occur by particle 207 gravitational settling, acting against the PMS upward flow (Grinshpun et al., 1993). The actual 208 wind conditions in the ambient air and in the PA near the PMS sample inlet are turbulent. Hangal 209 and Willeke (1990) found in their wind tunnel experiments that turbulence intensity had a 210 negligible effect on aspiration efficiency. Calculations using Eq. S1 (see Fig. S2) predict that at a 211 wind speed of 1 m s⁻¹, the PMS aspiration losses for particles >2 μ m may be significant.
- However, it must be cautioned that the literature does not include data for the very low 5.3 cm s^{-1}

- 213 PMS face velocity, and actual measurements of the PMS aspiration efficiencies were not made.
- 214 They may be significantly different from these calculated efficiencies.
- 215 Inside the PMS 9.4 cm³ chamber, the air has an average velocity of 0.57 cm s⁻¹ and Reynolds
- 216 number of 6.1, resulting in an average residence time of 6.3 s. The average air velocity in the
- chamber is equal to the sedimentation velocity of a spherical 10 µm diameter particle with a
- 218 density of 2 g cm⁻³ in air at STP (standard temperature and pressure; values used in this analysis
- are 273.15 K and 1013.25 hPa, respectively). This suggests that some 2 g cm⁻³ density particles
- with diameters $>10 \,\mu\text{m}$ that enter the PMS would settle out in the chamber and not make it to the three exit holes at the top of the chamber. Ultrafine particles can also be lost to the walls of the
- chamber and the printed circuit board due to convective diffusion. Calculations using the
- equation for diffusional losses (Friedlander, 1977) show that less than 1% of the 0.01 μm
- diameter aerosols would be lost in the chamber due to convective diffusion, with even smaller
- 225 diffusional losses for larger particles.
- Loss of particles due to inertial impaction on the wall opposite the three holes (Fig. S1b) was
- estimated by the local air flow Reynolds number near the three holes and the aerosol Stokes
- 228 number. The local Reynolds number is calculated to be 23, and the Stokes number for $10 \,\mu m$
- particles is 8.2×10^{-4} . At these low numbers, the calculated loss to impaction is less than 1% for
- 230 all particles less than 10 μ m diameter (Hering, 1995).
- The average flow velocity through the laser beam is approximately 3.0 cm s^{-1} . By the time the
- air flows through the laser beam, it has lost most of the particles over 10 µm diameter. Further
- particle losses due to gravitational settling over the photodiode would be very small, since the
- 234 gravitational force is parallel to the photodiode.
- 235 In summary, it is likely that the laser in the PMS is sampling a lower concentration of particles >
- 236 2 μm diameter than in the ambient air. Based on the literature and calculations, the dominant
- 237 coarse aerosol loss mechanism may be aspiration, not internal losses. However, further
- 238 measurements are needed to assess the various aerosol loss mechanisms.
- 239 2.2.2 Laser
- 240 The wavelength and power of three PMS diode lasers were measured using an Ocean Optics Red
- 241 Tide USB650 spectrometer and Melles Griot Universal Optical Power Meter, respectively. The
- 242 wavelength averaged 657 +/- 1 nm, and the power averaged 2.36 +/- 0.04 mW. The laser is
- 243 polarized parallel to the plane of the photodiode detector. This results in the aerosol-scattered
- 244 light being polarized perpendicular to the plane of incidence. Figure S3 shows that
- 245 perpendicular polarization results in significantly greater scattering intensity from 0.3 μm
- 246 particles compared to natural or parallel polarization. It is probable that many low-cost PM
- sensors have lasers that are polarized. Polarization will affect how the sensors respond to various
- 248 size particles and needs to be considered when modeling sensor behavior.
- 249 The PMS laser beam profile is not a simple plane wave, but complex in shape. The laser has a 3
- 250 mm diameter lens that focuses the laser over the photodiode. The beam profile evolves
- significantly as it goes through the focal region (Naqwi and Durst, 1990). The laser beam
- diameter in the laser sensing region over the photodiode was not measured. It was estimated by
- 253 eye to be 0.5 to 1.0 mm, with significant uncertainty. The PMS MCU turns the laser on and off

- every 800 msec or 2.5 s, depending on aerosol concentration. The laser pulses are 600–900
- msec, with the laser power on continuously during this time. We hypothesize that the PMS MCU
- 256 gathers data during laser on, processes it during laser off, and uses the difference of the
- 257 photodiode output during these stages to obtain and subtract any electronic or stray light (other
- than the laser) background signal to the photodiode.

259 2.2.3 Photodiode detector

- 260 The actual photodiode model in the PMS is unknown. The photodiode appearance is similar to
- the BPW34 silicon PIN photodiode. In this paper the specifications of the BPW34 are used to
- estimate the likely properties of the detector in the PMS. It has a very large dynamic range when
- 263 operated with reverse bias. The dependence of the photodiode current on the light intensity is
- very linear over 6 or more orders of magnitude, e.g., in a range from a few nanowatts to tens of
- 265 milliwatts. Silicon PIN photodiodes have low dark current, a 20 nanosecond rise time, and good
- wavelength sensitivity between roughly 400 and 1000 nm. (<u>https://www.rp-</u>
- 267 <u>photonics.com/photodiodes.html</u>). At a wavelength of 657 nm, the BPW34 produces
- approximately 0.4 microampere current per microwatt of incident radiant power
- 269 (https://www.fiberoptics4sale.com/blogs/archive-posts/95046662-pin-photodetector-
- 270 <u>characteristics-for-optical-fiber-communication</u>). The PMS does not have any optical elements
- 271 to capture and focus the aerosol-scattered light on its photodiode.
- 272 The photodiode does not have a cosine corrector in front and is probably not a true cosine
- detector. However, the relative spectral sensitivity is advertised to be a cosine response by the
- 274 manufacturers
- 275 (https://www.osram.com/ecat/DIL%20BPW%2034%20B/com/en/class_pim_web_catalog_1034
- 276 <u>89/prd_pim_device_2219537/</u> and <u>https://www.vishay.com/docs/81521/bpw34.pdf</u>).

277 2.2.4 Laser and photodiode geometry

- 278 The PMS geometry is very similar to a cell-reciprocal nephelometer. Figure 1 shows the PMS
- 279 laser and photodiode geometry. The measurements were made with a Brown & Sharpe
- 280 micrometer. The distance from the laser exit hole to the photodiode is 2.5 mm; the perpendicular
- 281 distance from the center of the laser beam to the photodiode is 1.8 mm; the diameter of the
- exposed photodiode area is 3.0 mm; the thickness of the base mask over the photodiode is 0.46
- 283 mm; and the distance from the edge of the photodiode to the end of the laser sensing volume is
- 284 4.5 mm. θ_1 is the lower angular scattering limit, and θ_2 is the upper angular scattering limit for a
- 285 particle in the laser.
- 286 Due to the PMS geometry, the upper and lower angular scattering limits for θ depend on the
- location, x, of a particle in the laser. This can be seen in Fig. S4. For example, at x = 0 mm, at the
- 288 laser exit, the upper and lower scattering limits for θ are 18–38 degrees. At x = 4.0 mm, over the
- 289 center of the photodiode, the angular integration limits are 50–130 degrees. The PMS photodiode
- is not capable of detecting light scattered from particles at less than 18 degrees.
- 291 Figures S5–S9 provide more detail about the PMS dimensions and geometry.

292 **2.2.5 PMS5003 sensing volume**

293 The sensing volume is the volume in which the aerosol is irradiated by the laser. The sensing

volume extends the length of the laser where the aerosol flows through it, approximately 10 mm.

The sensing volume is shown in Fig. S9. The average residence time of a particle in the laser

beam is approximately 30 ms. Some of the scattered light is detected by the photodiode and

- 297 creates a voltage pulse approximately 30 ms wide. It appears that the photodiode is detecting 298 either a cloud of particles from the sensing volume or individual pulses, depending on the
- 299 concentration. At low concentrations, the aerosol concentration within the sensing volume is
- 300 unlikely to be uniform, resulting in large relative changes in output per second.

301 **2.2.6 Signal processing and electronics**

- 302 It is not reported how the PMS MCU differentiates and processes the photodiode signals. The
- 303 PMS MCU sends the PA a signal approximately every second in the form of a digital sequence

304 of unsigned 16 bit binary data words, and CH1 is thought to be proportional to the photodiode

305 current. The photodiode current was not measured in this study. The PA creates 80 s (Firmware

- 306 Version 3) or 120 s (Firmware Version 4 and higher) averages and writes them to its micro SD
- 307 card. We measured an average percentage difference of 0.3% between the 2 min averages
- reported by the PA and the 2 min averages calculated from the 1 s values from the PMS. The
- results are shown in Fig. S10. It is apparent that the processing done by the PA to calculate its
- 310 reported 2 min averages does not bias the results.

311 2.2.7 PMS CH1 variability in sampling filtered air

312 We found significant variability in PMS response to filtered air. We exposed 21 PAs containing

- 313 42 PMS sensors to filtered air for 2 to 94 hours. The results are summarized in Table S1. Hourly
- average CH1 ranged from 0.10 to 377. Eleven PAs had both PMS CH1A and CH1B averages
- below 2, while seven PAs had at least one CH1 average over 26. We recommend that before
- deployment the PAs sample filtered air for at least four hours to identify and eliminate PAs with
- 317 CH1 hourly averages over 2 in filtered air. Removing PAs with high CH1 offsets in filtered air
- 318 reduces uncertainty and improves precision, particularly in cleaner ambient air.

319 2.2.8 PMS CH1 unresponsive to CO₂ and Suva[®]

- 320 Filtered air, CO₂, and Suva[®] (DuPont[™] Suva[®] 134a refrigerant) are often used to calibrate
- 321 integrating nephelometers (Anderson et al., 1996). The Rayleigh scattering coefficients of
- 322 filtered air, CO₂, and Suva at 657 nm and at STP (0 °C and 1013.25 hPa) are 5.5, 13.3, and 46.2
- 323 Mm⁻¹, respectively. We found that the PMS was unresponsive to 100% CO₂ (Fig. S11) and Suva.
- The CH1 for each gas was the same as filtered air. These results indicate that the PMS signal
- 325 processing zeroes out a constant scattering signal and cannot be used to measure the scattering
- 326 coefficient of gases that are commonly used in calibrating nephelometers. Furthermore, the
- 327 method used by the PMS to subtract light scattering by air molecules in the sampling volume is
- 328 unknown.

329 2.2.9 PMS CH1 and CH1avg precision

- 330 The PMS CH1 precision was measured by collocating ten PA monitors on the roof of the NOAA
- building in Boulder, Colorado, between 22 January 2021 and 1 February 2021. These monitors

- 332 were not checked with filtered air before deployment. It was found that two of the PMS sensors
- had large offsets and two had moderate offsets at low CH1 values. One PMS sensor was found to
- produce errant data and was removed from the analysis, resulting in valid data from 19 CH1A
- and CH1B sensors in the ten PAs.
- 336 The precisions for the hourly data from the CH1A and CH1B sensors and their average
- 337 (CH1avg) were estimated as the coefficient of variation for each of the 19 CH1A and CH1B
- values and the 9 CH1avg values for each hour, which are plotted against the average CH1 values
- in Fig. 2. As shown, above CH1 values of 500, the precision is relatively constant with an
- average of 8% and 4.8% for CH1A-CH1B and CH1avg, respectively. Below CH1 values of 500,
- 341 the uncertainties increase rapidly with decreasing CH1 values.
- 342 There are two mechanisms that may contribute to the rapid uncertainty increase for CH1 < 100.
- 343 First, it is likely that some of the increased uncertainty in CH1 below values of 100 is inherent to
- 344 sampling low concentrations, as is the case for any instrument. Second, the geometry of the laser
- 345 sensing volume in the PMS can contribute to uncertainty in the CH1 at low concentrations,
- 346 specifically if particles are not distributed uniformly within the laser beam.
- 347 The data in Fig. 2 can be modeled by the sum of squares of an additive (Un_{add}) and multiplicative
- 348 uncertainty (Un_{mult}) (Currie, 1968; Hyslop and White, 2008; JCGM100:GUM, 2008):

349 Uncertainty =
$$\sqrt{Un_{add}^2 + Un_{mult}^2 * CH1}$$
 (1)

- 350 Equation 1 was fitted to the precision data in Fig. 2 where the Un_{mult} was set to the average
- 351 precision at high CH1 values, and Un_{add} was set to 28 and 19 for the A and B sensors and
- 352 CH1avg, respectively, to fit the highest variances (Table S2). The Un_{add} is the precision of CH1
- 353 as CH1 approaches zero and is assumed to be equivalent to the uncertainty in values below the
- instrument minimum detection limit (MDL) or that of blanks (Currie, 1968), which were 0.08
- and 0.048 for the A and B sensors and CH1avg, respectively. The coefficient of determination in
- the model fit for both sets of data was $r^2 = 0.96$. Defining the MDL as the 99% confidence interval of the Un_{add} (Code of Federal Regulations, 40 CFR 136, https://ecfr.io/Title-40/Part-
- 358 136), MDLs for the individual CH1 sensors and CH1avg were 65 and 44, respectively.
- As shown in Sect. S3, the Un_{mult} and Un_{add} are highly dependent on the systematic biases
- 360 between the individual CH1 sensors and CH1avg and the four CH1 sensors with data offsets as
- 361 the CH1 approaches zero (Fig. S12). Removing these four sensors and normalizing the data for
- 362 each CH1 sensor by its average reduced the Un_{add} and Un_{mult} to 9% and 3%, respectively, for the
- 363 CH1 sensors and 6% and 1.9%, respectively, for the CH1avg data. These results correspond to
- an MDL of 21 and 14 for the normalized CH1 sensor and CH1avg data, respectively. Based on
- these results, an "off the shelf" PA will have a CH1avg MDL of about 44 and precision of less
- than 4.3%, but the careful selection of a PA without an offset and that has relatively low noise
- 367 will have an MDL of 14 and precision of less than 1.9%.

368 **2.3 Overview of cell-direct and cell-reciprocal nephelometers**

- 369 The integrating nephelometer was invented during World War II (Beuttell and Brewer, 1949). It
- 370 provides a direct measure of aerosol light scattering integrated over a large angular range, the
- 371 "aerosol light scattering coefficient". This measure requires no assumptions about aerosol

- 372 composition, size distribution, refractive index, or shape. The most common nephelometer
- 373 configurations are the "cell-direct" and "cell-reciprocal". Figure 3 presents schematics of the two
- types of nephelometers. The geometrical relationship between the laser and the photodetector in
- the PMS resembles a cell-reciprocal nephelometer (Fig. 3b).
- 376 Middleton (1952) was the first to show that the cell-direct nephelometer with a Lambertian
- 377 (cosine-adjusted diffuser) light source directly measures the aerosol light scattering coefficient.
- Anderson et al. (1996), following the derivation in Butcher and Charlson (1972), added
- 379 geometrical diagrams to make Middleton's derivation much clearer. Mulholland and Bryner
- 380 (1994) proved that the cell-reciprocal nephelometer with a Lambertian diffuser followed by a
- 381 photodiode placed at the center of the cell-reciprocal nephelometer also directly measures the
- aerosol scattering coefficient. This put both the cell-direct and cell-reciprocal nephelometers on
- 383 equal theoretical footing.
- There are a number of cell-direct nephelometers in use today. They include the TSI 3563 (St.
- Paul, MN, USA; Anderson et al., 1996), the Ecotech Aurora Models 3000 and 4000 (Knoxfield,
- Australia; Müller et al., 2011), the Radiance Research M903 (Seattle, WA, USA; Heintzenberg
- et al., 2006), and the Optec NG-2 (Lowell, MI, USA; Molenar, 1997). In contrast, cell-
- 388 reciprocal nephelometers have more limited commercial availability. The photoacoustic
- extinctioneter (PAX; Droplet Measurement Technologies, Inc., Longmont, CO, USA) and the
- 390 three-wavelength photoacoustic soot spectrometer (PASS-3) use a cell-reciprocal nephelometer 391 to measure the aerosol light scattering coefficient (Arnott et al., 2006). A cosine corrector
- followed by a photomultiplier tube is placed at the center of the cell-reciprocal nephelometer
- 393 (Abu-Rahmah et al., 2006; Nakayama et al., 2015).
- A "perfect nephelometer" is one in which the nephelometer is able to see the scattered light over the entire angular range from 0 to 180 degrees. In practice, this cannot be achieved for the celldirect and cell-reciprocal nephelometers. Both the forward and backward scattering angles are truncated. For example, the TSI 3563 nephelometer has measured angular truncation below about 7 degrees in the forward direction and above 170 degrees in the backward direction (Anderson et al., 1996; Heintzenberg and Charlson, 1996). For the PASS-3, Nakayama et al.
- 400 (2015) found that both the large effective truncation angle (21 degrees) as well as the
- 401 perpendicular polarization of the 532 nm laser relative to the scattering plane contribute to the
- 402 large particle size dependence of measured scattering. Light scattering from ammonium sulfate
- 403 particles of $0.71 \,\mu\text{m}$ diameter was reduced by 50% relative to a perfect nephelometer. Angular
- 404 truncation generally results in nephelometers underestimating the contribution of particles larger
- than approximately 1 μm diameter to the scattering coefficient, although corrections have been
 developed to account for angular nonidealities (e.g., Anderson and Ogren, 1998; Müller et al.,
- 407 2011).

407 2011).

408 **3. A physical-optical model of the PMS5003**

- 409 To gain insight into how the PMS responds to ambient aerosol properties, a model was
- 410 developed to estimate the intensity of scattered light impinging on the PMS photodiode. The
- 411 primary purpose of the model was to predict how the PMS performance compares to other
- 412 instruments designed to measure the aerosol scattering coefficient, such as integrating
- 413 nephelometers. The model makes simplifying assumptions about the laser that allow the

- 414 application of Mie theory to the light scattered from particles in the laser. Details of the model415 are presented in the Appendix.
- The equation describing the intensity of light scattered from a particle in the laser is (Middleton,1952; Anderson et al., 1996)

418
$$I(\theta) = F_{dv} \beta_p(\theta) dv$$

- 419 where $I(\theta)$ is the intensity of light at angle θ scattered from a particle in the volume element dv
- 420 (with units of W sr⁻¹); $\beta_p(\theta)$ is the volume scattering function (m⁻¹ sr⁻¹); F_{dv} is the incident laser
- 421 flux density (W m⁻²) impinging on the volume element dv; and dv is the volume element within
- 422 the laser.
- 423 The volume scattering function for a single particle in the laser beam is a function of aerosol
- 424 diameter D_p , complex refractive index m, laser wavelength λ , and scattering angle θ :

425
$$\beta_{\rm p}(\theta) = (\lambda/2\pi)^2 (1/dv) |S_1(m, \lambda, \theta, D_{\rm p})|^2$$
 (3)

426 where $|S_1(m, \lambda, \theta, D_p)|^2$ is the Mie scattering intensity function for laser light polarized parallel to 427 the photodiode surface and perpendicular to the plane of incidence (Bohren and Huffman, 1983).

428 The scattered light intensity from a single particle in the laser beam to a narrow strip across the

middle of the photodiode and from all positions in the scattering volume is integrated to predict

- 430 the total power received by the photodiode as a function of particle diameter D_p and refractive
- 431 index m:

432
$$P(m,D_p) = K \int_{x=0}^{x=10mm} \int_{\theta_1(x)}^{\theta_2(x)} |S_1(m,\theta,D_p)|^2 \sin(\theta) \, d\theta \, dx.$$
(4)

433 Due to the PMS geometry, the upper and lower angular scattering limits for θ depend on the 434 location, x, of a particle in the laser. Details are provided in the Appendix. This approach can be 435 used to estimate the amount of scattered energy detected from mixtures of particles of varying 436 diameters and indices of refraction, as shown in Eq. (5):

437
$$P = K \int_{Dp} \int_{x=0}^{x=10mm} \int_{\theta_1(x)}^{\theta_2(x)} |S_1(m,\theta,D_p)|^2 \sin(\theta) N(D_p,m) d\theta dx dD_p.$$
 (5)

438 **3.1 Model predictions - Deviation from a perfect cosine response**

439 As discussed above, the PMS has a photodetector that is about 1.8 mm below the laser, resulting

440 in forward scattering and backscattering truncation angles of 18 and 166 degrees, respectively.

441 Furthermore, the photodetector is recessed 0.46 mm below the scattering chamber base.

- 442 Equation 4 is used to explore the deviation from a perfect cosine response resulting from the
- 443 truncated scattering volume and recessed detector. It is shown in Fig. 4. For these calculations,
- 444 $S_1(m,\theta,D_p)$ is set equal to 1, which corresponds to isotropic scattering or a volume scattering
- function that is constant over all scattering angles. It is assumed that the detector has a
- 446 Lambertian response, i.e., the light detected is independent of the direction of the incident
- 447 energy, which results in a detector cosine response. Figure 4 shows a perfect cosine response in

(2)

- 448 yellow, while the red line shows the deviation from a perfect cosine response due to angular
- 449 truncation. The blue line shows the effect of both angular truncation and an inset detector that is
- 450 0.46 mm below the chamber base. All curves have been normalized to one at 90 degrees.

451 **3.2 Model predictions - Intensity versus position on the detector**

452 Figure 5 provides an example of the energy distribution on the photodiode as a function of

453 position in the laser and on the diode resulting from scattering from particles represented by a

454 lognormally distributed aerosol volume size distribution with a volume mean diameter of 0.33

- 455 µm and geometric standard deviation of 1.7. Figure 5 shows model predictions of the relative
- 456 intensity of scattered light, where the values are proportional to energy flux impinging on the
- 457 detector.
- 458 The masking resulting from a recessed detector truncates the scattering both in the most forward
- 459 and most backward scattering angles. This masking is shown as the triangular area
- 460 corresponding to distance down the laser and detector of 0.0-2.5 mm and 0.0-0.78 mm,
- 461 respectively, for the forward scattering angles and 5.6–10 mm and 1.44–3.0 mm, respectively,
- 462 for backscattering. Because the laser is parallel to the photodetector, which is assumed to have a
- 463 $\cos(90-\theta)$ response, the maximum energy scattered to the detector is approximately at $\theta = 90$
- 464 degrees. However, more energy is scattered to the detector for scattering angles less than 90
- 465 degrees, which corresponds to forward scattering, and very little energy is detected by the
- 466 photodiode for particles in the laser that are greater than about 8 mm down the laser beam, even
- though the detector is exposed to particles in the laser that are 10 mm away from the laser exit 467 hole. These distances down the laser correspond to backscattering. The total energy detected by 468
- 469
- the photodiode is the sum or integral across both the detector surface and position in the laser
- 470 and corresponds to the volume under the curve depicted in Fig. 5.

471 3.3 Model predictions - Predicted photodiode response as a function of particle diameter

- 472 The PMS differs from a perfect nephelometer in at least five important ways:
- 473 1. The laser is polarized, whereas the nephelometer light source is unpolarized.
- 474 2. The laser beam profile is not a simple plane wave, but complex in shape. The laser beam 475 profile evolves significantly as it is focused over the photodiode.
- 476 3. The photodiode likely does not have a perfect cosine response.
- 477 4. The PMS geometry limits the photodiode to receiving scattered light between 478 approximately 18 and 166 degrees, whereas a perfect nephelometer measures all energy 479 scattered between 0 and 180 degrees.
- 480 5. The unknown PMS signal processing removes the light scattering signal from CO₂. Suva, 481 and filtered air. These gases are used to calibrate nephelometers but cannot be used to 482 calibrate the PMS.
- 483 The effects of these differences can be seen in Fig. 6, which shows predicted photodiode
- 484 response as a function of particle diameter. The perfect nephelometer response is in blue, and
- 485 the PMS response is in yellow. The red line predicts PMS response if the laser were not
- 486 polarized. Relative intensities have been normalized to an ideal nephelometer measurement of a
- 487 0.1 µm diameter particle, which is akin to adjusting the laser power such that the scattered power
- 488 at a diameter equal to 0.1 µm is the same for all configurations. Scattering as a function of
- 489 particle diameter is nearly the same for all three configurations from 0.1 µm to about 0.3 µm. At

- 490 about 0.8 to 1.0 μm, the response of a PMS with an unpolarized laser is about half that of an
- 491 ideal nephelometer, and the use of a polarized laser reduces its response to about 30% to that of
- 492 an ideal nephelometer. For particles above 2 μ m in diameter, the PMS response compared to an
- ideal nephelometer is decreased by about 75%. Additionally, the PMS manual (Zhou, 2016)
- 494 quotes a lower detection limit diameter of 0.3 μ m. The model predicts that particles smaller than
- 495 $0.3 \,\mu\text{m}$ in diameter would be detected by the PMS, in direct proportion to their contribution to
- 496 the scattering coefficient.
- 497 These differences in geometry and optics from an ideal nephelometer are further highlighted in
- 498 Fig. 7. To highlight the effect of polarization, the blue line shows the ratio of an ideal
- nephelometer with a laser light source that is perpendicularly polarized to an ideal nephelometer
- 500 with an unpolarized light source while the red line shows just the effect of PMS geometry
- 501 relative to an ideal nephelometer. The yellow line shows the effects that polarization and PMS 502 geometry have on the measured scattering signal. Again, all hypothetical instrument responses
- 502 geometry have on the measured scattering signal. Again, all hypothetical instrument responses 503 have been normalized to a particle diameter of 0.1 μm. Relative to scattering for a 0.1 μm
- 504 particle, the polarization alone reduces the scattering signal of an ideal nephelometer by 40% for
- particles with diameters in the $0.8-1.5 \,\mu\text{m}$ size range. The additional effect of PMS scattering
- 506 geometry reduces the scattering signal at 0.8–1.0 μ m by about another 30% relative to an ideal
- 507 nephelometer.
- 508 As noted in Sect. 2.2.3, the specifications of the BPW34 are used to estimate the likely properties
- 509 of the detector in the PMS. Our model assumes two ideal properties of the photodiode. The first
- 510 is area uniformity that a photon impinging any part of the photodiode would generate the same
- 511 current as the same photon impinging on another part of the photodiode. The second ideal
- assumption is that the dependence of the photodiode current on the light intensity is very linear
- 513 over 4 or more orders of magnitude. If these assumptions do not hold, then the yellow curve in $\vec{r} = \vec{r} = \vec{r}$
- 514 Fig. 7 will change.
- 515 The variance in the PMS physical and optical geometry and errors in the measurements are not
- 516 known but likely small. To evaluate the sensitivity of the modeled PA scattering to errors in
- 517 these measurements, the model was exercised with large deviations of $\pm 25\%$ and $\pm 50\%$ in these
- 518 inputs. As shown in Table S3, the errors tend to increase with particle size. The modeled PA 519 scattering to a perfect nephelometer is most sensitive to errors in the distance from the laser to
- scattering to a perfect nephelometer is most sensitive to errors in the distance from the laser to the photodiode. For particle diameters of $0.5 \,\mu\text{m}$, +25% and +50% changes in this distance
- 521 resulted in maximum differences of 10% and 20%, respectively. Based on these results and the
- fact that the errors in the physical dimensions are less than 25%, these errors are thought to have
- 523 a small contribution to the overall modeled PA scattering error and were not directly accounted
- for in the analysis. This analysis does not attempt to account for the possibility that the laser
- 525 beam profile is not a simple plane wave or that the laser beam profile may evolve significantly as
- 526 it is focused over the photodiode, and the standard plane wave Mie calculations would no longer
- 527 apply.

528 **3.4 Model predictions – Differentiating by particle size**

- 529 The irradiance received by the PMS photodiode from a particle of a given diameter and
- refractive index depends on the particle's location in the laser beam. The model predicts that
- 531 particles of different sizes may contribute the same irradiance to the photodiode, depending on

- their location in the beam, or conversely, light scattered by a particle of a given size can vary by
- 533 more than an order of magnitude.

As an example, the model predicts that all of the particles in Fig. 8 contribute the same irradiance

- to the PMS photodiode. The smaller particles contribute the same irradiance by scattering in the
- 536 more effective forward scattering regime. The larger particles contribute the same irradiance by
- 537 scattering in the less effective backscattering regime. The photodiode and its associated
- electronics would not be able to differentiate between them. As a result, the model predicts that 520 the model predicts that 520 and 500 and 500 are the second second
- 539 the values reported in the six PA-PMS particle size channels from >0.3 μ m to >10 μ m cannot 540
- 540 correctly represent the aerosol size distribution.

541 **4. Experimental – Field studies**

- 542 Field experiments were conducted at two of the NFAN aerosol monitoring stations: the Mauna
- 543 Loa Baseline Observatory in Hawaii and the Table Mountain Test Facility in Colorado. Both
- sites have large suites of aerosol instrumentation and daily access for scientists and technicians to
- 545 inspect, calibrate, and maintain the instruments. These sites also have integrating nephelometers
- 546 (TSI 3563, St. Paul, MN, USA) against which to evaluate the PA monitors.

547 **4.1 Description of Mauna Loa site**

- 548 The Mauna Loa Baseline Observatory (MLO) is located on the north flank of the Mauna Loa
- volcano, on the Big Island of Hawaii (19.536 °N, 155.576 °W, 3397 m asl). The observatory is a
- 550 premier atmospheric research facility that has been continuously monitoring and collecting data
- on global background conditions and atmospheric change since the 1950s
- 552 (<u>https://www.esrl.noaa.gov/gmd/obop/mlo/</u>). Continuous aerosol measurements at MLO began in
- the mid-1970s with the installation of condensation particle counters and an integrating
- nephelometer (Bodhaine and Mendonca, 1974; Bodhaine et al., 1981). MLO lies above the
- strong marine temperature inversion layer present in the region, which separates the more-
- 556 polluted lower portions of the island atmosphere in the marine boundary layer from the much
- 557 cleaner free troposphere. MLO experiences a diurnal wind pattern (Ryan, 1997) that is strongly
- 558 influenced by the daily heating and nighttime cooling of the dark volcanic lava rock that makes 559 up the mountain. This "radiation wind" brings air up from lower elevations during the daytime,
- 560 when atmospheric measurements reflect the local mountain environment. In contrast, during the
- 561 nighttime, downslope winds develop, and the measurements at MLO are typically dominated by
- 562 clean, free-tropospheric conditions (Chambers et al., 2013). At these times, the aerosol
- 563 measurements at MLO often reflect some of the cleanest conditions at any station in the northern
- 564 hemisphere. It has long been known, however, that episodic long-range transport of Asian
- pollution and dust aerosols occurs, most frequently in the springtime (Shaw, 1980; Miller, 1981;
- 566 Harris and Kahl, 1990), and these aerosol events can influence both the daytime and nighttime
- 567 measurements at MLO. Consequently, the aerosol levels at MLO vary over a large range, from
- 568 extremely low to at times mildly elevated. Here we use observations from the MLO integrating
- nephelometer to evaluate the PMS sensor.

570 **4.2 Description of Boulder Table Mountain site**

- 571 The Table Mountain Test Facility (BOS) is a large restricted-access federal complex located 14
- 572 km north of Boulder, Colorado (40.125 °N, 105.237 °W, 1689 m asl). NOAA conducts
- 573 atmospheric research at this site, and in addition to its NFAN station, it is one of the Global

- 574 Monitoring Laboratory's seven U.S. Surface Radiation Network (SURFRAD) sites
- 575 (<u>https://www.esrl.noaa.gov/gmd/grad/surfrad/tablemt.html</u>). Many instruments for measuring
- 576 surface and column aerosol properties are maintained at this location and used for long-term
- 577 monitoring of the atmosphere.
- 578 The BOS site lies just east of the Front Range foothills of the Rocky Mountains and is typical of
- a semi-arid, high plains environment. It is a high mesa of predominantly grassland with some
- 580 desert scrub vegetation. The location is well suited for sampling of wildfire smoke plumes during
- 581 fire season in the western United States (summer and autumn), dust events at any time of the
- 582 year, and occasional urban pollution episodes. The NFAN station at BOS
- 583 (https://www.esrl.noaa.gov/gmd/aero/net/bos.html) was completed in September 2019. BOS
- 584 operates an integrating nephelometer and a differential mobility particle spectrometer (DMPS).
- 585 Both provided useful data for evaluating some of the predictions from the physical-optical model
- 586 we developed for the PMS sensor.

587 4.3 PA monitors

588 PA-PMS monitors were installed on the aerosol towers at the MLO and BOS stations, just below

- the main aerosol inlets. MLO had two PA-PMS monitors, one gently heated and one unheated,
- 590 whereas BOS had one gently heated PA-PMS monitor. Prior to deployment, the monitors were
- tested in a filtered air chamber for 4 hours to ensure that the 1 h average CH1 values were less
- than 1 when no particles were present. One of the PMS sensors in the unheated MLO PA had 1 h
- average CH1 values of 27 when no particles were present. The heated monitors were wrapped
- 594 with heating tape and powered by small DC power supplies. All the monitors were covered with
- 595 stainless steel flashing 5 cm below the bottom to prevent rain and snow from entering the inlet
- 596 (Fig. S13).

597 The PA-PMS monitors were warmed in an effort to reduce the sample RH to be closer to that of 598 the nephelometer, which is unavoidably heated to above ambient temperatures by the warmth of

the laboratory and by the nephelometer's halogen lamp. Because of this warming, the RH inside

- 600 the nephelometers rarely exceeded 40%. Both MLO and BOS are low-RH environments under
- 601 normal conditions, although occasionally moist air masses are encountered. The heating of the 602 monitors increased the sample temperatures by 5–8 °C, which helped to lower the sample RH.
- 603 While the PA heating was not controlled to achieve an RH match with the nephelometer, it
- brought the sample RH of the two measurements closer together. The gentle warming of the
- heated PA to only a few degrees above ambient is unlikely to cause the PVC to off-gas or melt.
- 606 Heating from direct sunlight may have had a larger impact.
- 607 Due to internet protocols at both sites, PA's wireless data transmission feature was not used, and
- the data were stored on the internal micro SD card. At approximately 1 month intervals, the data
- 609 were downloaded from the micro SD cards, and the PAs were returned to service. Outputs from
- 610 the two PMS sensors were then compared at these intervals to determine if the PAs were still
- functioning properly. In this study, the 80 s or 2 min averages were used to create 1 h averages to
- 612 compare the PA observations to those of the nephelometer and the DMPS.

613 **4.4 Integrating nephelometer**

- 614 The integrating nephelometer (TSI Inc., model 3563) measures the aerosol light scattering
- 615 coefficient at three wavelengths (450, 550, and 700 nm). At both sites, the sample flow path is
- 616 switched every 6 min between 1 and 10 μm aerodynamic diameter, multijet, Berner-type
- 617 impactors. Here, the scattering coefficients at 550 nm for both the PM₁ and PM₁₀ size fractions
- are used for comparison with the PMS measurements. These are referred to as b_{sp1} and b_{sp10} ,
- 619 respectively.
- 620 There are two quality checks of the nephelometer operation made in the field. First, the
- 621 nephelometer automatically samples filtered air once per hour. This provides a record of the
- 622 stability of the instrument background measurement. Second, the nephelometer calibration is
- manually checked on a monthly basis using CO_2 and filtered air (Anderson et al., 1996). The 1 h
- 624 average b_{sp1} in filtered air is 0.01 Mm⁻¹ with a standard deviation of 0.12 Mm⁻¹, based on 125
- 625 hours of sampling filtered air.
- 626 The nephelometer measurements were corrected for angular truncation (Anderson and Ogren,
- 627 1998) and reported at STP. Weekly data review provides quality assurance of the nephelometer
- data. Scattering coefficient data were averaged to 1 min resolution for logging and were further
- averaged to hourly resolution for comparison with the PA data. The 1 h average b_{sp1} uncertainties
- 630 of the nephelometer measurements are ~ 0.13 Mm⁻¹ for scattering coefficients less than 1.0 Mm⁻¹
- and ~10% for scattering coefficients greater than 1 Mm^{-1} (Sherman et al., 2015).

632 **4.5 Differential mobility particle spectrometer (DMPS)**

- 633 The DMPS was provided by the Institute for Atmospheric and Earth System Research,
- 634 University of Helsinki, Finland. It was checked and calibrated by the World Calibration Centre
- 635 for Aerosol Physics (WCCAP) at Leibniz Institute for Tropospheric Research (IfT), Leipzig,
- 636 Germany, just prior to deployment at NOAA's Table Mountain site. After shipment from IfT to
- 637 NOAA, the DMPS was again checked by aerosolizing polystyrene latex spheres and confirming
- that the peaks occurred in the correct size bins. The DMPS was housed inside the same building
- as the nephelometer at BOS and sampled aerosols through the same inlet, although the DMPS
- 640 flow did not pass through the aerosol impactors.
- 641 The DMPS provides 40 channels of particle concentration versus size, ranging from mobility
- 642 diameters of 0.01 μm to 0.8 μm. The 0.1 μm to 0.8 μm channels of the DMPS were used to
- calculate hourly average fine aerosol scattering coefficient distributions and the total fine aerosol
- 644 scattering coefficient, assuming spherical particles (Mie theory) with a refractive index of
- 645 1.53+0.017i. The hourly average, DMPS-calculated fine aerosol scattering coefficients were
- 646 compared to the nephelometer-measured fine aerosol scattering coefficients to check operational
- 647 consistency (Fig. S14). No operational changes were made to the DMPS during this field study.
- 648 This study did not measure coarse aerosol size distributions. The DMPS hourly average fine 649 aerosol scattering coefficient distributions were used with the PMS physical-optical model to
- 650 predict total 1 h average scattered irradiance on the photodiode.

651 **5. Results**

- 652 This section describes our evaluation of the PA-PMS using field data from MLO and BOS. First,
- 653 we provide an overview of the observational data. We then assess how well the model described

- 654 in Sect. 3 is able to represent the observed data and show consistency with results previously
- 655 reported in the literature. Next, we present results showing the potential of the PA-PMS to
- 656 perform as a nephelometer. Finally, we note how the size information output by the PA is not
- 657 correct due to the PA's primary measurement being a scattering measurement. For the results
- 658 presented below, data from the PA-PMS, nephelometer, and DMPS were averaged to hourly
- 659 frequency and merged prior to analysis.

660 5.1 Field data overview

- 661 Heated PA monitors were deployed at the MLO and BOS observatories for 15 and 11 months,
- 662 respectively (Table 1). At both sites weather had no impact on the operation of the PA
- 663 instrument, and downtime only occurred during data downloading.
- 664 These two deployments provide an excellent dataset for assessing PA performance in both a
- clean location (MLO) and in an environment with more elevated particle concentration (BOS). 665
- 666 As shown in Table 2, during the field study at MLO, the median CH1 was 26.7. The median b_{sp1}
- was 0.76 Mm⁻¹ at 550 nm, which is approximately 10% of Rayleigh scattering at the MLO 667
- 668 altitude. The reported PM2.5 mass concentration from the PA was zero for most of the MLO
- 669 deployment. The CH1 and b_{sp1} are adjusted to STP in Table 2. The air quality at BOS was less
- 670 pristine than at MLO and is more representative of nonurban continental air quality. The very
- 671 high maximum CH1 and b_{sp1} at BOS reported in Table 2 occurred during smoke events in the
- 672 summer and autumn of 2020. One of the BOS PMS sensors experienced approximately 10%
- 673 degradation in sensitivity after one year in the field (Fig. S15).

674 5.2 Relationship between model predictions and field data

- 675 The PMS sensor is described by the manufacturer as a particle counter that measures particles 676
- between 0.3 µm and 10 µm in six size bins. Based on the theoretical characterization of the PMS
- 677 sensor described in Sect. 3, the sensor is more akin to a polarized, reciprocal integrating 678 nephelometer than a particle counter. Below, the field data and theoretical model are used to
- 679 demonstrate that the raw PMS CH1 sensor signal is an integrated scattering measurement that is
- 680 sensitive to particles smaller than 0.3 µm but relatively insensitive to particles larger than 1.0
- 681 μm.

682 5.2.1 Predicted photodiode irradiance versus CH1 field data at BOS

- 683 Our model described in Sect. 3 and the Appendix predicts a value proportional to the scattered
- 684 irradiance impinging on the PMS photodiode as a function of particle diameter and
- 685 concentration. This was done using the DMPS size distribution data from BOS. The modeled
- PMS photodiode output is plotted against the PMS CH1 output (Fig. 9). The predicted 686
- 687 photodiode output is linearly correlated with the ordinary least squares (OLS) regression ($r^2 =$
- 688 0.90, normalized root mean square error (NRMSE) ~25%) with CH1 over 4 orders of magnitude.
- 689 The RMSE contains contributions of errors from the model-predicted radiant power, the
- 690 measured SMPS data the model is based on, as well as in the CH1 measurements. This strong
- 691 correlation and low RMSE is convincing evidence that the model and SMPS data describe the 692 PMS response quite well.
- 693 The linear relationship between CH1 and modeled photodiode response suggests the likelihood 694 that the CH1 output is directly related to what the photodiode is sensing (i.e., scattering from all

- 695 particles in the scattering volume). The PA-PMS reported values, such as concentrations of
- 696 particle numbers in various size ranges or PM concentrations, are quantities derived from the 697 scattering signal and the use of an undescribed algorithm.

698 5.2.2 Predicted aerosol size truncation versus published laboratory data

The PMS physical-optical model described in Sect. 3 predicts that if CH1 is proportional to the photodiode power, then its signal will be reduced relative to a perfect nephelometer. Thus, the ratio CH1/b_{sp} should decrease as median scattering diameter increases. To test this prediction,

- data were obtained from published laboratory studies evaluating the PMS against aerosols of
- varying composition and size distribution reported by Tryner et al. (2020) and He et al. (2020).
- These reported aerosol size distributions were used here to calculate the aerosol scattering
 coefficient distributions from 0.1 to 10 μm for the various aerosols and refractive indices at a
- wavelength of 657 nm. The median scattering diameter (MSD) was calculated for each test. The
- 707 MSD is the aerosol diameter at which approximately half of the light scattering coefficient is due
- to particles smaller than the MSD and the other half to particles larger than the MSD. The MSD
- 709 was then compared to the ratio of the measured CH1 and b_{sp10} values, i.e., CH1avg/ b_{sp10} , for each
- of the tests reported in Tryner et al. (2020) and He et al. (2020). Figure 10 summarizes the
- 711 results for $CH1/b_{sp10}$ versus MSD.
- 712 The controlled laboratory results are in general agreement with the PMS physical-optical model,
- 713 showing substantial reduction in CH1avg/b_{sp10} as a function of increasing particle diameter from
- 714 0.2 to 1 μ m. The laboratory results show an even greater reduction in CH1avg/b_{sp10} than the
- model predicts at diameters larger than 1 μ m. This suggests the possibility of supermicron
- aerosol loss before laser detection, perhaps due to aspiration as discussed in Sect. 2.2.1.

717 **5.2.3** CH1avg/b_{sp1} as a function of median scattering diameter

- 718 Although ambient aerosols may vary considerably in composition and morphology and cannot be
- as simply characterized as laboratory aerosols, it is instructive to evaluate if PMS angular
- truncation can be observed using field data. The DMPS data from BOS were used to calculate
- hourly average aerosol scattering coefficient distributions for diameters between 0.1 μ m and 0.8
- μm. A wavelength of 657 nm and a particle refractive index of 1.53+0.0i were used for the
 calculations. The median scattering diameter was calculated for each hour. The MSD was then
- compared to the ratio of the measured CH1 and b_{sp1} values, i.e., CH1avg/ b_{sp1} , for each of these
- hours. The results are shown in Fig. 11 as a box and whisker plot of the CH1avg/ b_{sp1} values
- found in each MSD bin. The center MSD value for each bin is based on a logarithmic scale of
- MSD values where the upper and lower bin values are selected as $MSD_i + MSD_{i+1}/2$ and $MSD_i MSD_i + MS$
- MSD_{i-1}/2 and i refers to the i^{th} bin. The thin black horizontal lines correspond to the number of
- observations in each bin and the scale is shown on the right hand axis. There are less than 20 methods in the 0.22 mm 0.62 mm 10.70 mm bins. Associately (70) with 10.22 mm 0.62 mm 10.70 mm bins.
- values in the 0.22 μm, 0.63 μm, 0.71 μm, and 0.79 μm bins. Approximately 67% of the MSDs
 observed at BOS were between 0.29 μm and 0.36 μm, and 98% of MSDs were between 0.26 μm
- and 0.46 μ m. The overall average CH1avg/b_{sp1} ratio, based on 6777 observations, is 65 Mm.
- 733 Figure 11 is consistent with the PMS physical-optical model. The highest CH1avg/b_{sp1} ratios
- tend to occur for aerosols with the lowest MSD and decrease as MSD increases. Additionally,
- the results show, as suggested above, that the PMS can detect particles below 0.3 μm in diameter
- 736 in proportion to their contribution to the scattering coefficient.

737 5.2.4. Estimating the scattering coefficient minimum detection limit of the PA-PMS

The precision analysis in Sect. 2 indicates that the PA monitors used in this study estimated 1 h average CH1 and CH1avg MDLs of approximately 21 and 14, respectively. The estimated 1 h average MDL b_{sp1} of the TSI 3563 nephelometer is approximately 0.20 Mm⁻¹, based on filtered air tests. Further analysis of the relationship between CH1 and b_{sp1} at low levels was performed by plotting the ratio, CH1avg/ b_{sp1} , for the combined MLO and BOS dataset, as a function of b_{sp1} . This relationship is shown graphically in Fig. 12. The data values were first averaged over 6

- hours because hourly b_{sp1} values near zero included many small negative b_{sp1} values due to the
- 745 very clean conditions occasionally observed at MLO. The averaging eliminated all but five 746 negative b_{sp1} values, which were removed from the dataset. The CH1avg/ b_{sp1} and b_{sp1} values
- were further averaged over six data points after sorting the data on b_{sp1} levels to more clearly
- show the relationship between CH1avg and b_{sp1} . At $b_{sp1} > 5$ Mm⁻¹, the CH1avg/ b_{sp1} ratio is
- relatively constant at 67 Mm, the yellow line in Fig. 12. The yellow line is the slope of CH1avg
- 750 versus b_{sp1} at b_{sp1} values greater than 5 Mm⁻¹. The CH1avg/ b_{sp1} ratio systematically decreases
- from its highest values to about 35 Mm, the slope of CH1avg versus b_{sp1} at $b_{sp1} = 0.4$ Mm⁻¹. For
- $b_{sp1} < 0.4 \text{ Mm}^{-1}$ the CH1avg/ b_{sp1} ratio then increases significantly as b_{sp1} decreases, consistent
- with CH1avg values staying approximately constant below 0.4 Mm⁻¹. Both the CH1avg and b_{sp1}
- are below MDL for $b_{sp1} < 0.2 \text{ Mm}^{-1}$. A CH1avg/ b_{sp1} ratio of approximately 35 Mm at $b_{sp1} = 0.4$
- Mm⁻¹ and a CH1avg value of about 14 ± 5 is consistent with the estimated CH1avg MDL of 14.
- 756 Based on these results, the 1 h average CH1 sensor MDL for hourly data in units of scattering is
- approximately 0.4 Mm⁻¹ at MLO. Laboratory tests challenging the PAs with known low-level,
- spiked aerosol concentrations and defined size distributions are needed to further refine the
- 759 estimated MDL.

760 **5.2.5** Evaluating the use of the PA-PMS as an integrating nephelometer

761 The MLO and BOS hourly average CH1avg are plotted against b_{sp1}, measured at 550 nm, in Fig. 13. Also shown in Fig. 13 is an OLS regression line with the intercept set equal to zero using the 762 BOS and MLO combined dataset but with values associated with b_{sp1} less than 0.4 Mm⁻¹ and 763 764 greater than 500 Mm⁻¹ removed. Results of the regression for the combined datasets as well as 765 for the individual BOS and MLO datasets are presented in Table 3. There is good agreement for both datasets (Table 3) with an r² of 0.97 and 0.85 for the BOS and MLO datasets, respectively, 766 767 and 0.97 for the combined datasets. The relationship deviates somewhat from linear with 768 increasing slopes and scatter at lower values of atmospheric scattering coefficient, particularly for the MLO data. The slopes (in Mm⁻¹) for all data, MLO, and BOS, are $0.015\pm2.07\times10^{-5}$, 769 $0.017\pm5.72\times10^{-5}$, and $0.015\pm2.68\times10^{-5}$, respectively. In the following analysis, a PA-derived 770 atmospheric scattering ($b_{sp1,PA}$, Mm^{-1}) for both MLO and BOS is estimated using $b_{sp1,CH1} = 0.015$ 771 \times CH1avg at a wavelength of 550 nm. The best-fit value of 0.015 Mm⁻¹ corresponds to the 772 773 yellow horizontal line in Fig. 12 of 67.0 (1/0.015) and corresponds to a median scattering

diameter of about 0.33 μm (Fig. 11).

Figure S16 shows that the submicron aerosol scattering coefficients at 550 nm and 700 nm are highly correlated, with the 700 nm scattering coefficient averaging 52% of the 550 nm scattering

777 coefficient. This results in $b_{sp1,CH1} = 0.0078 \times CH1$ avg at a wavelength of 700 nm.

- As discussed above, the regression coefficient between b_{sp1} and CH1 for the combined dataset of
- 779 0.015 Mm^{-1} is used to estimate the $b_{sp1,PA}$ derived from the CH1 channel. The data for each
- 780 dataset and the combined dataset were binned into ten bins based on measured b_{sp1} levels that
- ranged from 0.4 Mm^{-1} to 500 Mm^{-1} . Values of b_{sp1} above 500 Mm^{-1} were removed from the
- dataset. For each bin the NRMSE between $b_{sp1,PA}$ and measured b_{sp1} was calculated. The
- 783 NRMSE values as a function of the b_{sp1} bins are plotted in Fig. 14 for the combined dataset
- represented as the gray bars and BOS and MLO represented by blue and orange bars,
- respectively.
- For b_{sp1} levels less than 0.8 Mm⁻¹, the NRMSE is 45–55%, and for b_{sp1} levels greater than 10
- 787 Mm⁻¹, the NRMSE is about 25% or less. For b_{sp1} levels greater than 60 Mm⁻¹, the NRMSE
- approaches 15%.
- As discussed in Sect. 2.2.9, the uncertainty for high CH1avg values is small (1.9% to 4.8%). The
- 790 precision of the TSI 3563 nephelometer is also similarly high, and together they account for
- 791 about 10% NRMSE at high b_{sp1} values.
- 792 The overall normalized error is likely due to a variety of sources, primarily the variability in the
- 793 CH1 values due to using a polarized light source and truncation errors due to the geometry of the
- 794 PA-PMS sensors. Also, the variability in aerosol characteristics such as size distribution,
- refractive index, and shape may be important. At extremely low levels, uncertainty may also be
- due to a nonuniform distribution of particles in the PMS laser beam.
- 797 There are two reasons why the PA-PMS MDL and RMSE values reported in our study are
- surprisingly low. The TSI 3563 nephelometer has an extremely low detection limit of 0.20 Mm⁻¹,
- which is approximately 1% of Rayleigh scattering. Second, the PA-PMS has very low noise at
- 800 zero aerosol concentration. If the PA in our study had been collocated with a nephelometer that
- 801 was not as sensitive as the TSI 3563 in a location having an average fine aerosol coefficient of,
- say, 30 Mm⁻¹, then the PA 1 h average MDL could have been significantly higher than the 0.4
- 803 Mm^{-1} we obtained in our study.

804 **5.2.6 PA-PMS size distributions**

- 805 The aerosol number concentrations from the six PMS size channels are unrealistic. The BOS
- 806 field data showed that the concentration of particles larger than 0.3 μm diameter calculated from
- the DMPS averaged 10 times higher than CH1 (Fig. S17). The other PMS size channels are so
- 808 highly correlated with CH1 that they provide no additional information (Table S4). Furthermore,
- 809 it appears that the PMS creates an approximately invariant normalized aerosol number
- 810 distribution across a wide range of sites (Table S5, Fig. S18). Although the overall CH1
- 811 concentration can vary over 6 orders of magnitude (column 3 in Table S5), the shape of the PMS
- 812 size distribution remains fairly constant.
- 813 In our study, we found that the ambient aerosol size distributions measured with the SMPS
- varied considerably at Table Mountain, as seen in Fig. 11, while the Plantower normalized
- 815 reported size distribution changed very little. Invariant Plantower size distributions were also
- 816 observed during controlled laboratory studies (He et al., 2020; Kuula et al., 2020; Tryner et al.,
- 817 2020). This suggests that the values in the channels above CH1 are software generated and
- 818 indicates that the most relevant output from the PMS is from the CH1 channel. The bottom row

- 819 of Table S5 shows that the PMS bin fractions above 1 μ m increased by only a factor of 2–5 in a
- high-PM_{2.5} windblown dust episode at Keeler, California. This is consistent with the PMS model
- 821 prediction that PMS coarse aerosol response is small relative to a perfect nephelometer.
- 822 The results above indicate that CH1 is the primary source of aerosol information from the PMS
- sensor. Additionally, consistent with the sensor behaving like a cell-reciprocal nephelometer, it
- 824 was found that CH1 was proportional to the aerosol scattering coefficient, not the number
- 825 concentration of particles having diameters greater than 0.3 μ m. CH1 was approximately a
- factor of 10 lower than the DMPS number concentration for a similar size range.

827 5.2.7 Relationship between CH1 and PM_{2.5}

- 828 The PM_{2.5} mass concentration was not measured by Federal Reference Method (FRM) or Federal
- 829 Equivalent Method (FEM) instruments at MLO and BOS during this study. Consequently, the
- 830 PA-PMS PM_{2.5} or CH1 results cannot be compared with PM_{2.5} concentrations, but they can be
- 831 compared with measured scattering coefficients and discussed in the context of mass scattering
- 832 efficiency, which ties scattering coefficient to mass concentration.
- Figure S19 shows that the PA-PMS $PM_{2.5}$ channel is reasonably well correlated with b_{sp1} for
- values greater than about 10–20 μ g m⁻³, typical of many moderately polluted locations, with a
- calculated mass scattering efficiency of approximately $2.5 \text{ m}^2 \text{ g}^{-1}$. This value of the mass
- scattering efficiency is at the low end of the range of values reported by Hand and Malm (2007),
- 837 which could reflect the nature of the observed aerosols or an error of the PA-PMS $PM_{2.5}$ mass
- 838 concentration. This suggests that the effectiveness of the PA-PMS to serve as a $PM_{2.5}$ mass 839 concentration monitor is due both to the sensor behaving like an imperfect integrating
- 839 concentration monitor is due both to the sensor behaving like an imperfect integrating 840 nephelometer and to the mass scattering efficiency of ambient PM_{2.5} aerosols being roughly
- set in the phetometer and to the mass scattering efficiency of anotent $1 \text{ W}_{2.5}$ acrossly being roughly set constant with values in the 2–4 m² g⁻¹ range. However, it is likely that the PA-PMS
- underestimates $PM_{2.5}$ for very clean areas where b_{sp1} is often less than 10 Mm⁻¹. For example, the
- PA-PMS PM_{2.5} was zero for 1099 of the hours in this study when b_{sp1} was greater than 1 Mm⁻¹.
- 844 One may obtain a lower bound estimate of the PA-PMS RMSE 1 h average mass concentration
- 845 from the study results. Figure 14 shows the PurpleAir scattering coefficient RMSE as a function
- of the measured scattering coefficient. For example, the PurpleAir NRMSE is 20% for a fine
- 847 aerosol scattering coefficient of 25 Mm⁻¹. For an aerosol having a mass scattering efficiency of
- $2-3 \text{ m}^2 \text{ g}^{-1}$, this is approximately 10 $\mu \text{g} \text{ m}^{-3}$. Thus, the PurpleAir 1 h average RMSE is roughly 2
- μ g m⁻³. This is somewhat lower than the reported mean absolute error of ~4 μ g m⁻³ for hourly
- average PM_{2.5} in Pittsburgh (Malings et al., 2020). This error assumes that the mass scattering
- 851 efficiency is fixed and known. This is generally not the case, and the actual error in the mass
- 852 concentrations will be larger.
- 853 The mean 1 h average fine aerosol scattering coefficient b_{sp1} at MLO during our yearlong study
- was 1.50 Mm⁻¹. From Fig. 14, the PurpleAir had a RMSE of 0.60 Mm⁻¹. For an aerosol having a
- mass scattering efficiency of $2-3 \text{ m}^2 \text{ g}^{-1}$, this corresponds to a 1 h average RMSE of roughly 0.2–
- $856 \quad 0.3 \ \mu g \ m^{-3}$. This is well below the advertised 1 h average MDL of commercial PM_{2.5} monitors.
- 857 For example, the BAM 1020 specifies a typical hourly detection limit of $3.6 \ \mu g \ m^{-3}$.

858 **6. Summary, discussion, and future work**

859 We have demonstrated that the PMS sensor inside the PA monitor (PA-PMS) appears to behave

as an imperfect reciprocal integrating nephelometer. As a scattering sensor, the PMS cannot

directly count nor size particles in the air stream. The PMS uses an unknown algorithm to

862 convert the scattering signal to a near-constant normalized number distribution from which PM

863 concentrations are derived.

864 The scattering coefficient that is measured by an ideal integrating nephelometer does not need 865 correction for any aerosol attributes such as shape, chemical composition, refractive index, or

diameter. It is a valuable measure for visibility and global climate monitoring. Simple low-cost

sensors such as the PA-PMS can play a role in estimating aerosol scattering coefficients and
 improving global coverage. Yearlong field data at NOAA's Mauna Loa Observatory and

869 Boulder Table Mountain sites show that the 1 h average of the PA-PMS CH1 is highly correlated

with a nephelometer-measured fine aerosol scattering coefficient at 550 nm, b_{sp1} , over a wide

scattering coefficient range of 0.4 Mm^{-1} to 500 Mm^{-1} . The relationship between CH1 and b_{sp1} at

872 550 nm is found to be b_{sp1} (Mm⁻¹) = 0.015 × CH1 when both quantities are adjusted to the same

temperature and pressure.

874 The physical-optical model developed in this paper for the PMS and the general consistency with

both published laboratory data for a variety of fine aerosols and ambient field data may motivate

876 users of other low-cost sensors to develop similar models. It is possible that some of the other

877 low-cost sensors also use polarized lasers in a cell-reciprocal configuration like the PMS. Such

- 878 models would improve the understanding of sensor operation and help users better recognize the
- 879 opportunities and limitations of other low-cost sensors in applications such as monitoring the
- 880 scattering coefficient.

881 The strong relationship between b_{sp1} and CH1 and the general agreement between the model and

882 published laboratory data support characterizing the PA-PMS as an imperfect truncated cell-

reciprocal nephelometer. The results demonstrate that it is possible to use the PA-PMS to

estimate the 1 h average fine aerosol scattering coefficient across a wide range of aerosol
 scattering concentrations, provided the aerosol median scattering diameter is between 0.26 µm

and $0.46 \,\mu\text{m}$. The CH1 and b_{sp1} relationship is dependent on the size distribution, and it is

expected to change for locations and times where the particle size shifts to larger or smaller sizes

than those measured at BOS and MLO.

889 We found that the PA-PMS has important limitations compared to integrating nephelometers. It

890 measures the light scattering over a smaller angular range, causing a significant truncation of the

scattering signal in the forward and backward directions. Additionally, the PA-PMS uses a

892 polarized light source; the sensor most likely does not have a cosine response; the laser beam 893 profile is not a simple plane wave; and the inlet/geometry creates a broad uncertain particle size

893 profile is not a simple plane wave; and the inlet/geometry creates a broad uncertain particle size 894 cut point. Nephelometers calibrate their scattering coefficient with CO₂ or Suva, but the PMS is

unresponsive to these gases. As a result, there is currently no convenient way to calibrate the

PMS to ensure its accuracy. Neither PA nor Plantower provide technical support. Quality

897 assurance and control are not as robust as one encounters for regulatory and scientific monitoring

instruments. For this reason, it is useful to test the PMS sensors in filtered air before using them

and to limit field use to those sensors that have 1 h average CH1 values less than 2. While

- sampling, it is necessary to compare 1 h averages from the two PMS sensors in each PA monitor
- 901 to become aware of any changes and, if needed, to replace them in a timely fashion.
- 902 This study limited its findings to low-RH air, because both the PA monitors and the
- 903 nephelometers were heated to reduce RH. Since RH plays such an important role in water uptake
- 904 by hygroscopic aerosols and the concomitant increase in the scattering coefficient, future work is
- 905 planned to compare unheated PA monitors with an unheated nephelometer that does not reduce
- 906 RH before sampling. Our model predicts that the PMS may not be as responsive to hygroscopic
- 907 growth as an unheated nephelometer. This is a topic of current study.
- 908 The PA-PMS reports a mass concentration of PM_{2.5} particles, and many papers have been written
- to compare the PA-PMS values with reference instruments and explain the observed differences.
- 910 The modest agreement that has been reported is the direct result of two factors generally
- 911 overlooked in those publications: the PA-PMS behaves like an imperfect integrating
- 912 nephelometer that provides a representative value of the light scattering coefficient, and the mass
- scattering efficiency of $PM_{2.5}$ aerosols is roughly constant, with values in the 2–4 m² g⁻¹ range.

914 Appendix

- 915 The PMS physical-optical model makes some simplifying assumptions. The actual PMS laser
- beam profile is not a simple plane wave but complex in shape. The model assumes the laser is a
- 917 plane wave with a constant laser beam irradiance profile. This allows the use of Mie theory to
- 918 predict the light scattered by particles in the laser. Secondly, the model calculates the light
- 919 scattered to a narrow strip across the middle instead of the entire photodiode. It assumes that the
- 920 irradiance received by the narrow strip is representative of the entire photodiode.
- 921 The intensity of light scattered from a particle in the laser is

922
$$I(\theta) = F_{dv} \beta(\theta) dv$$

- 923 where $I(\theta)$ is the intensity of light at angle θ scattered from a particle in the volume element dv
- 924 (with units of Watt sr⁻¹); $\beta(\theta)$ is the volume scattering function (m⁻¹ sr⁻¹); F_{dv} is the incident laser
- 925 flux density (Watt m⁻²) impinging on the volume element dv; and dv is the volume element
- 926 within the laser.
- $\begin{array}{ll} 927 & \mbox{The volume scattering function for a monodisperse aerosol having a diameter D_p and number 28 concentration $N(D_p)$ in the PMS laser is $$$

929
$$\beta(m, \lambda, \theta, D_p) = (\lambda/2\pi)^2 N(D_p) |S_1(m, \lambda, \theta, D_p)|^2$$
 (A2)

- 930 where $|S_1(m, \lambda, \theta, D_p)|^2$ is the perpendicular scattering intensity function; λ is the laser
- 931 wavelength; m is the particle complex refractive index; θ is the scattering angle; and D_p is the
- 932 aerosol diameter. Note that $\theta = 0$ in the direction of the laser, and $\theta = 90$ degrees perpendicular to
- 933 the laser and photodiode.
- 934 For one particle of size Dp in the volume element dv, $N(Dp) dv = (1/dv) \times (dv) = 1$.

(A1)

- 935 The incremental power dP (Watt) scattered from a particle in the volume element dv across a
- 936 solid angle d Ω subtended on the surface of a sphere at distance r from the particle, and normal to 937 r, is
- 938 $dP = I(\theta) d\Omega$.
- 939 $d\mathbf{\Omega} = dA_0 / r^2$, where dA_0 is the incremental area on the sphere at distance r from the particle and 940 normal to r. dP is then
- 941 $dP = I(\theta) dA_0 / r^2$. (A4)
- 942 For the PMS model, dA_0 is a small rectangle with width w and height rd θ , where w is the width 943 of the strip on the photodiode, and $d\theta$ is the differential scattering angle.
- 944 $dA_0 = r d\theta \times w$, where w is the width of the strip on the photodiode. From Fig. A1, $r = b/sin(\theta)$, 945 where b is the distance from the laser to the photodiode.

946
$$d\mathbf{\Omega} = dA_0 / r^2 = (r \ d\theta \times w) / r^2 = d\theta \times (w/r) = (w/b) \times \sin(\theta) d\theta.$$
(A5)

947 The incremental power across the solid angle $d\Omega$ normal to r is then

948
$$dP = I(\theta) \times dA_0/r^2 = I(\theta) \times (w/b) \times \sin(\theta)d\theta.$$
 (A6)

949 Substituting for $I(\theta)$,

950
$$dP(g,x,\theta) = [F_0 (\lambda/2\pi)^2 |S_1(\theta,D_p)|^2] \times (w/b) \times \sin(\theta) d\theta.$$
(A7)

951 Equation A7 can be further simplified by combining the constants into $K = (\lambda/2\pi)^2 F_0 w/b$, where 952 K has units of watts:

953
$$dP(g,x,\theta) = K |S_1(\theta,D_p)|^2 \sin(\theta) d\theta.$$
 (A8)

954 The power received by the photodiode from a particle of diameter D_p in the volume element at x 955 is obtained by numerically integrating across θ on the photodiode:

956
$$P(m,D_p) = K \int_{\theta_1(x)}^{\theta_2(x)} |S_1(m,\theta,D_p)|^2 \sin(\theta) d\theta.$$
(A9)

- 957 Due to the PMS geometry, the upper and lower angular scattering integration limits for θ depend 958 on the location x. This can be seen in Fig. S4. For example, at x = 0 mm, the upper and lower 959 integration limits for θ are 18 to 38 degrees. At x = 4.0 mm, over the center of the photodiode, 960 the angular integration limits are 50 to 130 degrees.
- 961 The total power P in Watts received by the photodiode from the light scattered by all the
- 962 particles of diameter D_p in the laser is obtained by carrying out the numerical integration in Eq. 963 A9 for all x from 0 to 10 mm:
 - A9 for all x from 0 to 10 mm:

(A3)

964
$$P(m,D_p) = K \int_{x=0}^{x=10mm} \int_{\theta_1(x)}^{\theta_2(x)} |S_1(m,\theta,D_p)|^2 \sin(\theta) \, d\theta \, dx.$$
(A10)

965 The result for carrying out this calculation for the power per particle of size D_p is in Table S6 for

966 wavelength 657 nm and particle refractive index 1.53+0.015i. The total power received at the

967 photodiode by a distribution of particles is obtained by summing up the power per particle of size 968 D_p times the number of particles N(D_p , m) in the size interval D_p to $D_p + dD_p$.

969
$$P = K \int_{Dp} \int_{x=0}^{x=10mm} \int_{\theta_1(x)}^{\theta_2(x)} |S_1(m,\theta,D_p)|^2 \sin(\theta) N(D_p,m) d\theta dx dD_p.$$
(A11)

- 970 Figure A1 shows the PMS geometry. The distance along the laser is the variable x, which ranges
- from 0 to 10 mm. The distance along the photodiode is the variable g, which ranges from 0 to 3.0
- 972 mm. The distance between the photodiode and the laser is b, approximately 1.8 mm.

973 Code and data availability

- 974 Data sets are available on Zenodo.org. The dataset is available at
- https://doi.org/10.5281/zenodo.5764982. The data were published on 15 December 2021.
- 976 Citation is: Ouimette, James; Malm, William; Schichtel, Bret; Sheridan Patrick; Andrews,
- 977 Elisabeth; Ogren, John A.; & Arnott, W. Patrick. (2021). Datasets for paper "Evaluating the
- 978 PurpleAir monitor as an aerosol light scattering instrument" (1.0_20211215) [Data set]. Zenodo.
- 979 https://doi.org/10.5281/zenodo.5764982

980 Supplement

- 981 I think ACP fills out this we have provided the supplement to them.
- 982

983 Author contributions

- 984 PJS and JRO designed the field study. PJS provided measurement data from the MLO and BOS
- sites. BAS performed the uncertainty and precision analyses. WCM led the physical-optical
- model development with BAS and JRO. JRO and WCM performed analysis of laboratory and
- 987 field data for model evaluation. WPA provided insight regarding the laser behavior and
- 988 instrument electronics. JAO and WCM independently performed the statistical analyses of the
- 989 TSI nephelometer and PA data. JAO and JRO performed measurements and tests to characterize
- the PMS5003. EA led the manuscript submission and review process. All authors read and
- 991 commented on the article.
- 992

993 **Competing interests**

- 994 The authors declare that they have no conflict of interest.
- 995

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1003 Disclaimer

- 1004 The assumptions, findings, conclusions, judgments, and views presented herein are those of the
- 1005 authors and should not be interpreted as necessarily representing NOAA or National Park
- 1006 Service policies. Reference to any companies or specific commercial products does not
- 1007 constitute endorsement by NOAA or the National Park Service.

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1223 Tables

	number of hours			percent coverage				
site	PA- PMS	TSI neph	DMPS	overlap	PA- PMS	TSI neph	DMPS	Time period
MLO	9371	9204	na	9204	97.6	95.9	na	2019-05-06 to 2020-06-05
BOS	7716	7479	7045	6901	97.7	94.7	89.2	2020-02-13 to 2021-01-06

Table 1. Summary of PA, TSI nephelometer, and DMPS data coverage.

Table 2. Summary of PA-PMS and nephelometer hourly observations at MLO and BOS.

		1 h mediai	n (average)		1 h range min-max			
	PA-PMS		TSI nephelometer		PA-PMS		TSI nephelometer	
Site	PM _{2.5} μg m ⁻³	CH1	b _{sp10} Mm ⁻¹	b _{sp1} Mm ⁻¹	РМ _{2.5} µg m ⁻³	CH1	b _{sp10} Mm ⁻¹	b _{sp1} Mm ⁻¹
MLO	0.000 (0.12)	26.7 (75.2)	1.19 (2.82)	0.76 (1.50)	0.0 - 21.6	0.26 - 1649	-0.35 - 35.2	-0.29 - 34.2
BOS	3.37 (8.42)	720 (1422)	14.6 (32.4)	9.9 (20.9)	0.0 - 571	7.38 - 63340	-0.11 - 4097	-0.44 - 2596

Table 3. Ordinary least square regression coefficients with a zero intercept and standard error for

 b_{sp1} and CH1 as the dependent and independent variables, respectively, for the BOS, MLO, and 1232 combined datasets. CH1 and b_{sp1} reported at STP. Also shown are the respective coefficients of 1233 determination, R^2 .

Site	slope (Mm ⁻¹)	standard error (Mm ⁻¹)	1/slope (Mm)	R ²
BOS	0.015	2.68×10 ⁻⁵	67.0	0.97
MLO	0.017	5.72×10 ⁻⁵	59.0	0.85
Both BOS&MLO	0.015	2.07×10 ⁻⁵	67.0	0.97

1236 Figures



Figure 1. PMS sensor geometry highlighting the dimensions of laser beam (red) and photodiode

- 1239 (gray) and the various relevant distances between the two.





- 1244 and CH1avg values (b) for the 19 collocated sensors and 9 PAs.











Figure 5. Relative intensity of radiant energy scattered by a lognormally distributed aerosol volume size distribution with a volume mean diameter of 0.33 μm and geometric standard deviation of 1.7 as a function of location of scattering event in the laser and as a function of position on the photodiode. Assumed laser wavelength was 650 nm, and the particle index of refraction was assumed to be 1.53. Positions in the laser and detector are from left to right as in Fig. 1 and are in units of mm.



Figure 6. Normalized power detected by an ideal integrating nephelometer, a PMS with an
unpolarized light source, and a PMS with a perpendicularly polarized light source plotted as a
function of particle diameter. Modeled light source wavelength is 657 nm, and the particle index

1265 of refraction is 1.53. See explanation of the different curves in text.





1268 **Figure 7.** Ratio of scattering of a "perfect" nephelometer to a nephelometer with a light source

1269 that is perpendicularly polarized (blue) and to a PMS with an unpolarized light source (red).

1270 Yellow line shows the effect of a perpendicularly polarized light source and PMS geometry. All

1271 three curves are plotted as a function of particle diameter.



1274Figure 8. The model predicts that different size particles can generate the same irradiance on the1275photodiode, depending on their location in the laser beam. In this example, each of the particles1276would create 1.7×10^{-2} picowatts of scattered irradiance on the photodiode.



Figure 9. One hour average CH1 reported values plotted against model-predicted radiant power (or energy) in μwatts on the photodiode. Both the CH1 and DMPS data were adjusted to STP

1281 conditions. Ordinary least squares regression line is also shown. Plot is based on 6839 1 h

1282 averages at BOS.



1285Figure 10. Laboratory measurements of $CH1/b_{sp10}$ versus median scattering diameter from1286Tryner et al. (2020) and He et al. (2020). Results are compared with PMS physical-optical1287model prediction of the scattering ratio (yellow line in Fig. 7). Maximum value of 1.0 of the1288model-predicted scattering ratio is arbitrarily set at a $CH1/b_{sp10}$ value of 110 Mm. Ammonium

1289 sulfate 1 data are from He et al. (2020); all other data are from Tryner et al. (2020).



1292Figure 11. Observed decrease in $CH1avg/b_{sp1}$ ratio as a function of MSD values. MSD values1293were selected based on a log scale but plotted equally spaced from each other to maintain1294uniformity in the dimensions of the box and whisker symbol. Red line represents the median

value, and the bottom and top of each box are the first and third quartile values. Extremes shown

1296 on each box are the 2 and 98 percentiles. Black horizontal lines for each MSD value are the

number of observations in the respective MSD bins.

1298



Figure 12. Ratios of CH1avg and measured scattering, b_{sp1} , as a function of measured b_{sp1} for MLO and BOS. Green line corresponds to 0.4 Mm⁻¹ while the purple line, a ratio of 35 Mm,

corresponds to the additive uncertainty of 14. Yellow line corresponds to a CH1avg/b_{sp1} ratio of

approximately 67 Mm, the slope of CH1avg vs. b_{sp1} above about 5 Mm⁻¹.



1306Figure 13. Fine aerosol scattering coefficient from TSI nephelometer vs. CH1avg value from1307PA. Yellow line represents the fit to all data. Purple line shows the additive uncertainty of 141308while b_{sp1} values less than the green line were removed for the regression analysis.



1311 Figure 14. Normalized root mean square error between measured and estimated scattering from

1312 CH1 values plotted as a function of binned b_{sp1} for the BOS, MLO, and combined datasets.

1313 Yellow line is referenced to the right axis to provide the number of observations in each bin.

1314 Numbers on the x-axis represent the lower and upper levels of each scattering bin.

differential volume element at distance x along the laser, scattering light at angle θ to the photodiode





Figure A1. Sketch of PMS5003 geometry.