The World Optical Depth Research and Calibration Center (WORCC) quality assurance and quality control of GAW-PFR AOD measurements

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Abstract. The World Optical Depth Research Calibration Center (WORCC) is a section within the World Radiation Center at Physikalisch-Meteorologisches Observatorium Davos, World Radiation Center (PMOD/WRC), Davos, Switzerland, established after the recommendations of the World Meteorological Organization for calibration of aerosol optical depth (AOD)-related Sun photometers. WORCC is mandated to develop new methods for instrument calibration, to initiate homogenization activities among different AOD networks and to run a network (GAW-PFR) of Sun photometers. In this work we describe the calibration hierarchy and methods used under WORCC and the basic procedures, tests and processing techniques in order to ensure the quality assurance and quality control of the AOD-retrieved data.

1 Introduction

Aerosols in the atmosphere, through direct and indirect effects, mainly result in a cooling contribution to the global radiation balance (IPCC, 2013). The parameter that describes their integrated optical attenuation is the aerosol optical depth (AOD), which can be derived by measurements of the sunlight transmittance (WMO, 2016b). AOD has been used in case studies and local studies in order to characterize aerosols and assess atmospheric pollution and the aerosol-related radiative forcing.

Atmospheric extinction of sunlight has been studied for at least 250 years by P. Bouger (http://glossary.ametsoc.org/wiki/Bouguer_s_law). Linke (1942) studied turbidity, Angström (1929) studied extinction power law and Junge (1952) studied the relationship between particle volume and aerosol number size distribution. They have mainly set the theoretical basis for studying aerosol extinction. However, Volz (1959) have developed a Sun photometer that is able to measure atmospheric turbidity at different wavelengths using filters, used in the first US (Volz, 1969) and the first European (Flowers, 1969) networks of turbidity measurements. Since then various sites have included AOD measurements in their monitoring schedules, constructing long-term series of AOD (e.g., Barreto et al., 2014; Weller and Gerice, 2005; Nyeki et al., 2012). Most of these measurements are site specific, with little relevance to long-term trend analysis on a global scale. However, more recently, several multiyear spatial studies (Holben, 2001; Che et al., 2015; Mitchell et al., 2017) have been conducted.

The World Meteorological Organization (WMO) instigated the Global Atmosphere Watch (GAW) program in 1989 as a successor to the Background Air Pollution Monitoring Network (BAPMoN). In 1993 (WMO, 1993) it was recommended that AOD measurements, conducted previously under BAPMoN, should be discontinued until new instruments, methods and protocols could be established to collect AOD data of known and assured quality. Based on a recommendation by GAW experts, the World Optical Depth Research Calibration Center (WORCC) was established in 1996 at the PMOD/WRC in Switzerland. WORCC has since been advised by the GAW Scientific Advisory Group for Aerosols. Fifteen existing GAW stations were chosen for the deployment and operation of 12 N-type precision filter radiometers (PFRs; manufactured by PMOD/WRC) (Wehrli, 2000), pro-
vided by the Swiss Government. WORCC was assigned the following tasks:

- development of a radiometric reference for spectral radiometry to determine AOD
- development of procedures to ensure worldwide homogeneity of AOD observations
- development of new instrumentation and methods for AOD
- implementation of a pilot network for AOD at GAW global observatories including quality control and quality assurance of data called GAW-PFR
- training operators to use and maintain AOD instruments.

There are different global networks measuring AOD, mainly distinguished by the different instruments used in each of them. The AErosol RObotic NETwork (AERONET) (Holben et al., 1998, 2001) (http://aeronet.gsfc.nasa.gov/) is the major global network with central calibration facilities in the USA, France and Spain. The sky radiometer network (SKYNET) aerosol network (Takamura and Nakajima, 2004; Campanelli, 2004) is an observational network dedicated to aerosol–cloud–radiation interaction research studies. The Australian AOD network includes 22 stations (Mitchell et al., 2017). The Chinese Aerosol Remote Sensing network (CARSNET), reporting AOD measurements for 50 sites, representing remote, rural and urban areas (Che et al., 2015).

In addition, national, regional and global networks such as the French component of AERONET, PHOTONS (Goloub et al., 2007), the Iberian Network for aerosol measurements (V(λ), m, R) is the exoatmospheric signal at wavelength λ and standard Sun–Earth distance of 1 astronomical unit, m is the optical air mass along the line of sight to the Sun, δ is the total optical depth, R is the Sun–Earth distance in astronomical units, and ϵ accounts for the circumsolar sky radiance in the field of view of the Sun photometer. The total optical thickness m × δ includes several terms describing the extinction by different atmospheric components: molecular scattering, gas absorption and aerosol extinction. Then in order to calculate the AOD we use the following:

\[
\tau_{\text{aer}} = \frac{\ln(V_o) - \ln(V)}{m} - \tau_{\text{rt}},
\]

where \(\tau_{\text{aer}}\) is the AOD, m is the optical air mass and \(\tau_{\text{rt}}\) is the attenuation due to Rayleigh scattering and other trace gases for cloudless conditions. Using Eq. (2), we conclude that an error of 1% in \(V_o(\lambda)\) results in an AOD of 0.01 for an air mass equal to 1.

According to WMO (2005), as traceability is not currently possible based on physical measurement systems, the initial form of traceability will be based on difference criteria.
is, at an intercomparison or co-location, traceability will be established if the difference between the AOD of one network and another is within specific limits. Those limits for finite field-of-view instruments have been set (WMO, 2005) to optical depths of 0.005 + 0.01 m$^{-1}$ and the acceptable traceability is when 95 % of the absolute AODs are within those limits. So requiring 95 % uncertainty (U95) within optical depths of ±0.005 + 0.01 m$^{-1}$, where the first term (0.005) is linked to instrument uncertainties (signal linearity, Sun pointing, temperature effects, processing, etc.) and the second term to a calibration uncertainty of 1 %.

The WORCC standard group of three PFRs (defined as the “PFR triad”) was established in 2005 by WORCC in order to fulfill the WMO mandate on “homogenization of global AOD through provision of traceability to the World Standard Group (WSG) of spectral radiometers for contributing networks at co-located sites and/or periodic international filter radiometer comparisons, and further standardization of evaluation algorithms”. Since 2005, five different well-maintained instruments have been used as part of the PFR triad. Figure 1 shows the long-term (12 years) comparison of the PFR triad instruments.

The long-term relative stability of each of the five PFRs that were part of the triad is presented in Fig. 1. The left panel shows the 1 min AOD PFR differences, compared using the WMO-U95 criterion at all four PFR-measuring wavelengths. It should be noted that all instruments measure at WORCC in Davos, Switzerland. They are mounted on the same solar tracking system and their signal is processed using a common processing algorithm. In the 12 years of 1 min measurement data, more than 99 % of retrieved AOD lies within the U95-WMO criterion, at all wavelengths. The right panel of Fig. 1 shows the individual instrument comparisons with the mean triad AOD in more detail. As shown, all differences are well within ±0.005 with small shifts for different PFRs and particular wavelengths.

In order to continuously check and maintain the triad stability we have defined a calibration protocol including instruments frequently performing Langley calibrations at high-altitude stations. For this calibration method (Holben et al., 1998; Michalsky et al., 2001) the main requirement is the stability of AOD during the measurement Langley periods (half days). Theoretically, this can be achieved anywhere, but in practice AOD is variable during the day, so the current practice is to perform such measurements at high-altitude locations where AOD is very low; thus its variability is very small on an absolute level. Since 2003, Mauna Loa, Hawaii, USA (MLO, 19.5° N, 155.6° W, 3397 m a.s.l.), Izaña, Tenerife, Spain (IZO, 28.3° N, 16.5° W, 2370 m a.s.l.) and Jungfraujoch, Switzerland (JJF, 3580 m a.s.l. 46.5° N, 7.9° E), have mainly been used for such Langley calibrations. PFR instruments have been permanently deployed at these stations for certain periods since 2003, and approximately every 6 months, one of these instruments is returned to WORCC to perform synchronous measurements in parallel with the triad. Table 1 lists the details of these visits. For each period it describes the current status of the PFR instruments of the triad, the transferred instrument performing the Langley plots and the Langley plot measurement location and period.

The determination of $V_o$ with the Langley calibration method using a 6-month period of measurements requires high accuracy and quantification of the introduced uncertainties. Using a defined calibration method, the $V_o$ accuracy can be traced back to the variability of the $V_o$ determination and is related to the instrument precision and the procedures. Practically, the long-term stability of $V_o$ is mainly related to degradation/changes in the transmission of the optical interference filters, or hardware-related failures/changes that are linked to changes in the instrument signal.

WORCC Langley algorithms use half-days to determine $V_o$ values. The main requirements for accepting a half-day Langley determination of $V_o$ are the AOD stability, the signal stability and the statistics of the retrieved signal versus air mass linear regression using specific air mass limitations. An example of accepted Langley (half-day) measurements for a 6-month period at MLO is shown in Fig. 2.

Figure 2 shows 95 Langley diagrams/days that have been used to analyze Langley calibration results and related uncertainties. The mean ln($V_o$) calculated for this period at 500 nm was 1.343, the standard deviation was 0.002 and the 5th and 95th percentiles were 1.340 and 1.346, respectively. The distribution of ln($V_o$) values is also shown with the statistics for mean AOD values (0.010–0.015 at 500 nm). The distribution and the normal distribution are shown in the upper-left subplot of Fig. 2.

Based on Eq. (1) the AOD absolute uncertainty, $\delta AOD_{V_o}$ that is related only to the Langley calibration factor, using Eq. (2), equals $\frac{\delta \ln(V_o)}{m}$ where $\delta \ln(V_o)$ is the uncertainty in ln($V_o$). The uncertainty of ln($V_o$) can be described by the coefficient of variation (standard deviation/mean, CV) or in the case of a normal distribution by the standard error (standard deviation divided by the square root of the number of measurements, SE). For the particular example in Fig. 2, the calibration uncertainties are shown in Table 2.

As described above, this uncertainty is directly related to calculated $\delta AOD_{V_o}$ uncertainty and is equal to $\delta \ln(V_o)$ when $m = 1$. In Fig. 3, $V_o$ values at 500 and 865 nm are shown as a function of time for measurements of the PFR instrument N06 that measured at Davos from 2000 to 2005 and at IZO from 2005 to 2016. In addition, the evolution of the SE is shown.

Each of the data points in Fig. 3 represents average $V_o$ values at the end of the averaging period which varies between 3 and 6 months. PFR N06 has exhibited good stability since 2000. All instrument filters have not changed more than 0.1 in $V_o$ units, which corresponds to maximum changes in AOD of ~0.02 when $m = 1$. However, the 412 nm filter is an exception which has apparently degraded since 2009. The maximum changes in AOD (at $m = 1$) were ~0.05 from...
Figure 1. (a) Difference between each PFR with the mean of the PFR triad at the four PFR wavelengths. Grey areas represent the WMO-U95 limits. (b) Frequency distribution of these differences for the four measuring wavelengths.

Table 1. Details of PFR triad Langley calibration measurements.

<table>
<thead>
<tr>
<th>Year</th>
<th>Triad</th>
<th>Comparison reference</th>
<th>Calibration type</th>
<th>Comparison period</th>
</tr>
</thead>
<tbody>
<tr>
<td>2010</td>
<td>N01 N25</td>
<td>N24</td>
<td>JFJ-Langley</td>
<td>1 Jan 2010 – 31 Jan 2010</td>
</tr>
<tr>
<td>2011</td>
<td>N01 N25</td>
<td>mean of N01, N25, N27</td>
<td></td>
<td></td>
</tr>
<tr>
<td>2014</td>
<td>N01 N25</td>
<td>mean of N01, N25, N27</td>
<td></td>
<td></td>
</tr>
</tbody>
</table>
Figure 2. Langley plots for Mauna Loa observatory from November 2015 to April 2016.

Table 2. Calibration uncertainties derived from 6 months of Langley calibration measurements shown in Fig. 2.

<table>
<thead>
<tr>
<th>PFR wavelength (nm)</th>
<th>Number of Langley plots (N)</th>
<th>Mean $\ln(V_o)$</th>
<th>Standard deviation $\delta \ln(V_o)$ (CV)</th>
<th>$\delta \ln(V_o)$ (SE) $m = 1$ (norm. distr.)</th>
</tr>
</thead>
<tbody>
<tr>
<td>368</td>
<td>75</td>
<td>1.438</td>
<td>0.002</td>
<td>0.0013</td>
</tr>
<tr>
<td>412</td>
<td>93</td>
<td>1.308</td>
<td>0.002</td>
<td>0.0015</td>
</tr>
<tr>
<td>500</td>
<td>95</td>
<td>1.343</td>
<td>0.002</td>
<td>0.0014</td>
</tr>
<tr>
<td>863</td>
<td>56</td>
<td>1.276</td>
<td>0.001</td>
<td>0.0007</td>
</tr>
</tbody>
</table>

2009 to 2016. It has to be noted that all the above-described changes have been taken into account in order to calculate the corresponding AOD for the individual periods. Results in Fig. 3 illustrate the stability of PFR instruments over time. The very low filter response changes over long-term periods increase the statistical validity of each 6-month Langley calibration period.

3 GAW-PFR network

A primary task of WORCC is the implementation of a global trial network at selected GAW stations with the objective of demonstrating that PFR instruments, together with standard calibration techniques and quality assurance procedures, can be used to determine AOD with a precision adequate for the fulfilment of the objectives of GAW (WMO, 2001). In addition, it is intended that long-term high-resolution AOD measurements are conducted and analyzed at selected GAW locations.

The locations, together with their characteristics in terms of aerosol sources and their period of measurements, are described in Table 3. Bratts Lake and Mace Head measurements were unfortunately discontinued in 2012 and 2015, respectively, due to logistical aspects. However, Valentia (Ire-
<table>
<thead>
<tr>
<th>Station (abbreviation)</th>
<th>Lat (°)</th>
<th>Long (°)</th>
<th>Altitude (m)</th>
<th>Country</th>
<th>Type of location</th>
<th>Main types of Air masses</th>
<th>Previous studies</th>
</tr>
</thead>
<tbody>
<tr>
<td>Alice Springs (ASP)</td>
<td>23.80</td>
<td>-133.87</td>
<td>547</td>
<td>Australia</td>
<td>desert</td>
<td>marine boundary layer</td>
<td>Mitchell et al. (2017)</td>
</tr>
<tr>
<td>Bratts Lake (BRA)</td>
<td>50.28</td>
<td>-104.70</td>
<td>576</td>
<td>Canada</td>
<td>prairie, agricultural</td>
<td>high mountain</td>
<td>McArthur et al. (2003)</td>
</tr>
<tr>
<td>Danum Valley (MAL)</td>
<td>4.98</td>
<td>117.84</td>
<td>436</td>
<td>Malaysia</td>
<td>tropical forest</td>
<td>marine boundary layer</td>
<td>2007–2016</td>
</tr>
<tr>
<td>Hohenpeissenberg (HPB)</td>
<td>47.80</td>
<td>11.02</td>
<td>995</td>
<td>Germany</td>
<td>pre-alpine, rural</td>
<td>high mountain</td>
<td>Ruckstuhl et al. (2008), Nyeki et al. (2012)</td>
</tr>
<tr>
<td>Izana (IZO)</td>
<td>28.31</td>
<td>16.50</td>
<td>2371</td>
<td>Spain</td>
<td>island</td>
<td>free troposphere</td>
<td>Barreto et al. (2014)</td>
</tr>
<tr>
<td>Jungfraujoch (JFJ)</td>
<td>46.55</td>
<td>7.99</td>
<td>3580</td>
<td>Switzerland</td>
<td>high altitude</td>
<td>free troposphere</td>
<td>Ruckstuhl et al. (2008), Nyeki et al. (2012)</td>
</tr>
<tr>
<td>Mauna Loa (MLO)</td>
<td>19.53</td>
<td>-155.58</td>
<td>3397</td>
<td>USA</td>
<td>island</td>
<td>free troposphere</td>
<td>Dutton et al. (1994)</td>
</tr>
<tr>
<td>Mace Head (MHD)</td>
<td>53.33</td>
<td>-9.89</td>
<td>20</td>
<td>Ireland</td>
<td>coast</td>
<td>marine boundary layer</td>
<td>Mulcahy et al. (2009)</td>
</tr>
<tr>
<td>Ny Ålesund (NY A)</td>
<td>78.91</td>
<td>11.88</td>
<td>17</td>
<td>Svalbard</td>
<td>Arctic</td>
<td>coast</td>
<td>Herber et al. (2002)</td>
</tr>
<tr>
<td>Ryori (RYO)</td>
<td>39.03</td>
<td>141.83</td>
<td>230</td>
<td>Japan</td>
<td>coast</td>
<td>marine boundary layer</td>
<td>2002 to present</td>
</tr>
<tr>
<td>Cape Point (CPT)</td>
<td>34.35</td>
<td>-18.49</td>
<td>230</td>
<td>South Africa</td>
<td>coast</td>
<td>marine boundary layer</td>
<td>Nyeki et al. (2015)</td>
</tr>
<tr>
<td>Mt. Waliguan (WLG)</td>
<td>36.28</td>
<td>-100.90</td>
<td>3810</td>
<td>China</td>
<td>high mountain</td>
<td>high mountain</td>
<td>2007 to present</td>
</tr>
<tr>
<td>Valentia (VAL)</td>
<td>51.94</td>
<td>10.24</td>
<td>24</td>
<td>Ireland</td>
<td>coast</td>
<td>marine boundary layer</td>
<td>2007 to present</td>
</tr>
<tr>
<td>Marambio (MAR)</td>
<td>64.24</td>
<td>-56.62</td>
<td>205</td>
<td>Argentina</td>
<td>coast</td>
<td>marine boundary layer</td>
<td>Tomasi et al. (2015)</td>
</tr>
<tr>
<td>Troll (TRO)</td>
<td>72.01</td>
<td>-2.54</td>
<td>1309</td>
<td>Antarctica</td>
<td>polar</td>
<td>free troposphere</td>
<td>Tomasi et al. (2015)</td>
</tr>
</tbody>
</table>

**Table 3.** GAW-PFR station details, location characteristics and AOD time-series information.
Figure 3. Long-term $\nu_o$ values for PFR-N06 at Davos and IZO for the four PFR channels. Bars indicated the standard error.

Figure 4. Data coverage of GAW-PFR stations. Green indicates periods with data availability and red indicates missing data.

Smaller (red) gaps are due to instrument recalibrations through transfer and measurements in parallel with the PFR triad at Davos, Switzerland.

3.1 Instrument calibrations

Instruments are regularly calibrated (every 1 to 2 years, depending on instrument-related and logistical aspects). The calibration of the filter radiometer has to be assured with an uncertainty of $\pm1\%$ in order to achieve the required AOD uncertainty within the U95-WMO limits. Quality-assured AOD data can only be obtained when pre- and post-deployment calibration constants are available. That means that AOD data for a certain location and period can only be considered as final after the recalibration of the instrument, which is performed at the end of the specific period.

Postcalibrations can be obtained by different methods:

3.1.1 WORCC calibration certificate

The WORCC calibration certificate is obtained by instruments/stations that have their PFR calibrated at Davos, against the WORCC triad. Polar and high-altitude stations are often set for calibration annually during polar night/longest night periods. For other stations, a re-calibration should be performed every 12 to 24 months. This method implies that preparation of the final version of the AOD data might be postponed by 1 to 2 years. Comparison of each of the instruments with the triad is performed based on the WMO criteria for AOD intercomparisons. The intercomparison lasts for at least 5 cloudless days.

The extraterrestrial calibration constants of an instrument $x$, $\nu_{0x}$, $\nu_{0xR}$ are determined by using 1 min measurements $S_{iA}$ of the instrument to be calibrated and synchronous measurement $S_{iR}$ of the reference (mean of the three triad PFRs) in-
Figure 5. Calibration of an instrument against the triad: (a) measurement signals at four wavelengths, (b) comparison of instrument signals, (c) differences between instrument- and triad-retrieved AOD using the old and the new calibration $V_{0xR}$.

Figure 6. Graphs of $V_{0x395}$ calculated over an extended calibration period of 35 days for a PFR instrument measuring against each of the three triad instruments for the four PFR wavelengths.

The daily calibration constants $V_{0xR}$, according to (Eq. 4), are determined for days on which a number ($N \geq 120$) of solar measurements unobstructed by clouds were collected. Comparing the instrument measurement signal to that of the triad, a new $V_{0xR}$ is calculated and compared with the last one used. Details of such an analysis for a single day are shown in Fig. 5. Instrument signals are shown in Fig. 5a, then the percentage differences of 1 min data are calculated for all four wavelengths in Fig. 5b. An example of the calculated AOD differences from the triad before and after the calibration is finally shown in Fig. 5c. For the specific instrument, the $V_{0x,R}$ differences for the particular day were up to 0.5% and depended on the wavelength. The impact of this difference in AOD calculation is an air-mass-dependent difference of 0.008 to 0.003. In practice, when an instrument is calibrated against the triad, the only limitation on using the synchronous signals is the cloud presence. So, no air mass or AOD limits are included.

The average over the number of measurements over a day, values $V_{0x,R}$ and standard deviations $\sigma_{0x}$ of the daily mean calibration constants from each reference instrument are averaged to give the final calibration constants $V_0$ with an expanded uncertainty $U_{95}$:

$$U_{95} = 1.96 \sqrt{\frac{\sum_{i=1}^{N_{ref}} (V_{0x,R} - \bar{V}_0)^2}{2N_{ref} \sqrt{N_{days}}} + \sum_{i=1}^{N_{ref}} \left(\frac{\sigma_{0x,R}}{\sqrt{N_{days}}}\right)^2}.$$ (4)

The two terms under the square root in Eq. (4) describe the combined statistical (comparison) and triad uncertainty during the calibration period.

For a normal distribution, $V_{0U95}$ corresponds to a coverage probability of approximately 95%.

The calibration is considered successful when the coefficient of variation $\text{CV} = V_{0U95}/V_0$ becomes smaller than ±0.5% for all four channels of the instrument to be calibrated. This limit is typically reached after 3 to 5 days of comparison. In Fig. 6, we show $V_{0U95}$ calculated over an extended calibration period of 35 days for a PFR instrument measuring against the triad. For each of the four PFR wavelengths, $2\sigma$ within the period is on the order of 0.4 to 0.9% of the mean $V_0$. In addition, we have calculated the $V_{0U95}$ in percent using Eq. (3) for the instrument under calibration with each of the three PFRs that are part of the WORCC triad. For this particular case, all wavelengths are within
the limit $CV < 0.4\%$ after 3 days and after 10 days within $CV < 0.2\%$.

3.1.2 Langley sites

Calibrations can be obtained by statistical analysis of objective Langley plots collected in situ over an extended period of time at high-altitude (IZO, JFJ, MLO) or remote background (ASP, BRA, TRO) sites. Such an evaluation of Langley plots is routinely performed every 6 months using Langley results from 6 months before and after the anchor dates of 1 January and 1 July for each year. This method implies that annual quality-assured data can be obtained in July or August of the following year.

A smaller (<1\%) calibration uncertainty can be expected and is required for Langley sites where AOD is lower than elsewhere, and inconsistent calibration may lead to erroneous conditions such as an inverted Ångström relation (channels crossing over) or negative AOD.

Calibration $V_o$ values calculated for the four AOD channels are used in order to retrieve the AOD. For the data obtained between two calibrations a calibration slope of $V_o$ values is applied. If the differences between two calibrations are larger than 2\% then an in situ estimate of the instrument stability is investigated from a number of in situ Langley plots or cross-calibrations between different PFR channels. This is conducted in order to determine nonlinear (over time) changes (steps) of instrumental $V_o$ values.

3.2 Quality control

After finalizing the calibration constants to be used for the AOD retrieval, a series of QA/QC procedures are used before finalizing the AOD data.

3.2.1 Check for ancillary data

Ancillary data of atmospheric pressure and total ozone are needed to retrieve the Rayleigh and ozone optical thicknesses, respectively, according to Eq. (1). Atmospheric pressure measurements, required for Rayleigh scattering, should be accurate to about 3 hPa. This accuracy is readily achieved by meteorological grade barometers built into new PFR loggers. Accurate pressure data are requested from each station and compared to the daily PFR logger values. If the mean differences are larger than ~3 hPa, then the atmospheric pressure is corrected and all data are reprocessed. The use of average atmospheric pressure data over a day or longer periods can lead to wavelength-dependent AOD retrieval errors and to large Ångström exponent errors.

Total column ozone values are needed to correct optical depth at 500 nm for ozone absorption. As the absorption coefficient at 500 nm is low, total ozone needs to be known to ±30 Dobson units or 10\% of typical values, for an uncertainty of ±0.001 optical depths at 500 nm. GAW-PFR uses (AURA) satellite overpass observations with the Ozone Monitoring Instrument (OMI) for daily operations (McPeters et al., 2015). OMI values are validated to in situ observations for stations operating a Dobson or Brewer instrument. Where available, total column ozone may be found at the World Ozone and Ultraviolet Radiation Data Centre database (http://woudc.org/). Figure 7 shows the evolution of daily mean pressure used for the Rayleigh calculations and ozone values at Davos, Switzerland as measured in situ with a Brewer spectrophotometer and from the OMI ozone retrieval.

Figure 7. (a) Daily mean pressure during 2016 at Davos, Switzerland. (b) Brewer and OMI ozone values.
3.2.2 Corrections for temperature, dark signal

The PFR sensor temperature is checked for deviations from its active stabilized set point, indicating potential problems during extremely hot or cold ambient conditions. The PFR dark signal is checked for values >0.25 mV, and if found on approximately 5% of days, a correction is applied. The dark signal is the mean signal when the solar elevation is less than $-6^\circ$, i.e., below the horizon. The temperature dependence of its PFR is based on characterization measurements in a climate chamber. Corrections are applied only in cases in which the dependence on $V_o$ is more than $\pm 2\%$ for the range from $-20$ to $40^\circ C$.

3.2.3 Sun pointing

In order to ensure that the full solar disk is included in the field of view (FOV) of the instrument an accurate Sun-tracking system is required. While a PFR instrument can be readily aligned to the Sun with the required accuracy, a solar-pointing monitor of the PFR is included in order to control the Sun-pointing accuracy. This monitor consists of a four-quadrant silicon detector that is illuminated through a pin-hole of 1 mm diameter at a distance of 70 mm. When the light is centered, all four quadrants produce equal signals. By subtracting signals from paired pixels, the sunspot can be localized (Wehrli, 2008).

Figure 8 shows four examples of perfect to bad instruments pointing at four cloudless, low aerosol concentration (AOD < 0.1) days. The instrument pointing is shown in the upper plots. The first (from the left) case shows a perfect pointing accuracy where 328 measurements during the day are almost identical in terms of pointing direction. The second case shows when all measurements can be found inside the 15 arcmin limit. Finally, the last two cases show instruments with pointing issues where only 62.9 and 59.5% cases respectively are inside the 15 arcmin limit, and in the last case a number of measurements are outside the 25 and 30 arcmin limit.

The result of the measured signal (which has a direct impact on calculated AOD) is shown in the lower panel, where the first two days show a very smooth daily pattern, while artificial signal features can be seen in the last two cases. The use of these data will end up in an artificially overestimated AOD retrieval.

3.2.4 Check for crossing of wavelengths

An additional quality control check detects instances when AOD at one of the four PFR wavelengths is less than that at a higher wavelength. This quality check is mainly performed in order to detect the erroneous performance of one of the four channels. The test also becomes very important when low AOD values are measured, which is the case at a number of GAW-PFR stations. Small errors related to the calibration of one channel can be easily identified, as this results in a wavelength crossing of AOD. During evaluation of the data, the processing software tools give the opportunity to define the limits of the accepted offset for the wavelength crossing.

An example of the graphic representation of wavelength crossing is shown in Fig. 9. Based on the fact that AOD at lower wavelengths has to be at least equal to or higher than that at higher wavelengths, colored points show the correlation of pairs of AOD values at different wavelengths and black points represent the cases in which wavelength crossing occurs. The figure is composed of 70 350 1 min, cloudless measurements from the year 2015 as recorded at Cape Point, South Africa. For example, as many as 14.3% of data in the 412–500 nm panel (red-blue section) do not pass the wavelength crossing test, so they are discarded from the postprocessing analysis.
3.2.5 Other issues

The spectral bandpasses of all PFR instruments have been characterized for their effective spectral wavelength and bandwidth. This is determined as the average wavelength weighted by the spectral response and equivalent width of a rectangular bandpass with equal throughput as the filter. Minimum and maximum central wavelengths (and bandwidths) that have been calculated were 367.2–367.7 (3.5–3.7), 411.8–412.6 (4.3–4.4), 500.6–501.5 (5–5.1) and 861.3–863 (5.5–5.6). These measurements were performed using illumination by a grating monochromator (Jobin Yvon HR640) with 0.6 nm spectral resolution. Lately, a pulsed tunable laser system for the characterization of spectrometers and filter radiometers has been available at PMOD/WRC. Test measurements with PFR instruments did not show significant differences from the older characterization measurements.

3.3 Cloud flagging

As AOD measurements cannot be performed under cloudy conditions, a cloud detection algorithm is used for the PFR measurements. Three different criteria are used (Wehrli, 2008):

a. The instrument signal derivative with respect to air mass is always negative. The method has been developed and described in detail by Harrison and Michalsky (1994). For cases in which air mass values < 2 and the influence of clouds on the noon-side of perturbations cannot be easily detected, we compare the derivative with the estimate of the clear Rayleigh atmosphere and flag it as cloudy if the rate of change is twice as much (objective method).

b. The use of a test for optically thick clouds with AOD_{500 nm} > 2.

c. The use of the Smirnov triplet measurement (Smirnov et al., 2000) by calculating AOD and looking at the signal variability for 3 consecutive minutes (triplet method).

An example of the use of these three criteria can be seen in Fig. 10, where a day with variable cloudiness at Davos is presented.

For this particular day, all three criteria are applied. In the early morning and evening, the thick-cloud criteria are applied. Then both the triplet and the objective method are applied due to variable cloudiness in front of the Sun. However, there are times during the day when only the objective method is applied (thin clouds in front of the Sun as seen in the first picture that is superimposed in Fig. 10). During the last part of the day (second picture), clouds completely disappear and cloud flagging is set to zero, which means that all three criteria are passed. It has to be noted that cloud flagging is always kept as a constant number describing which one of the three criteria or combination of criteria is valid at a certain minute.

The lower panel shows the calculation of AOD for the whole day, with obvious deviations due to cloud occurrence for the parts of the day when both criteria are fulfilled. It is interesting to see the 10:50 to 12:00 period which is a difficult period when defining the presence of clouds only with direct Sun measurements. For this particular period, even if the AOD is low, the objective method shows the presence of thin clouds in front of the Sun.

It has to be noted that final AOD data include all available measurements that have passed the quality control procedures, except the cloud-flagging ones. So, all reported AODs are available, accompanied by a flag showing which cloud-flagging criteria have been assigned to the particular 1 min measurement.

4 Final AOD data

During the calibration and quality control procedure, three levels of data are defined.

Level 1: These are the raw signal data as measured by the PFR instrument at the four different channels.

Level 2: These are AOD values. The data are produced at each measuring station using standardized software including QC tests, cloud screening, Sun-tracking details and signal-to-AOD conversion using an existing calibration file. Each of the mentioned test results is characterized by a specific flag. In addition, the true solar elevation is calculated and included. None of the level 1 data are discarded.

Level 3: AOD data are re-evaluated at WORCC which includes AOD results and Ångström coefficients. Additional checks are included, such as the detection of wavelength crossing AOD(λ₁) > AOD(λ₂), where λ₁ > λ₂. In addition, a day-to-day visual inspection is performed in order to identify other technical issues or the possible presence of undetected clouds. For the latter, additional cloud flags are included in the final data files. Data control of level 3 data includes overviews of the instrument’s tracking performance, wavelength crossing and ancillary data.

Hourly data records are prepared from quality-assured level 3 data, which are then submitted to the World Data Center for Aerosols (WDCA) hosted by the Norwegian Norsk Institutt for Luftforskning (NILU; ebas.nilu.no). Final data files include the mean, median, standard deviation and the number of 1 min samples used to calculate the hourly value at all four wavelengths.

In order to calculate hourly, daily and monthly statistics, we apply the following criteria:

- A minimum of 50 cloudless 1 min measurements per day are required to calculate daily statistics. In this case, we eliminate days with less than 1 h of sunshine.
Figure 9. Correlation curves of the four PFR-measuring wavelengths. Colored points represent the data that have passed the wavelength crossing test and black ones are those that have not.

Figure 10. Example of a day with variable cloudiness, (a) instrument signal at 500 nm and minute-by-minute application of the three cloud-flagging methods. The two inset pictures show a 360° view of the sky using a cloud camera. (b) Calculation of AOD at four wavelengths.
Figure 11. Monthly means and 1σ standard deviations for Davos, Izaña and Mauna Loa using 15 years of 1 min quality-controlled PFR measurements at four wavelengths.

- A minimum of six 1 min cloud free measurements are required to calculate the hourly mean.

- A minimum of 30 hourly values and 10 days per month are required to calculate the monthly mean.

- Measurements that lie beyond 2 standard deviations for an hourly mean are considered outliers, as they are considered to be affected by cloud contamination.

Monthly statistics can be presented with different approaches. In most studies, AOD is usually reported as the arithmetic mean and associated standard deviations over a selected period. This is based on the hypothesis of an underlying normal distribution. However, AOD is often better characterized by a lognormal distribution and described by geometric mean and standard deviation. Based on a statistical analysis of skewness and kurtosis in a multiyear and multistation AOD data set, O’Neill and co-authors (O’Neill et al., 2000) have shown that a lognormal distribution systematically provides a more robust base for reporting AOD statistics than the normal distribution. Using long-term series of the final-selected 1 min AOD data, users can then try to draw conclusions on the AOD climatology of each station, the aerosol changes, if any, or the daily monthly and annual patterns. As an example of the three Langley calibration-related stations IZO, DAV and MLO, monthly means calculated from 15 years of measurements are presented in Fig. 11. IZO and MLO are the Langley calibration sites and DAV the triad host site.

For the particular sites that are all considered to have low AOD, we can clearly see that Davos shows an increase in AOD during the summer months, while the other two sites show much lower AOD with the exception of Saharan dust intrusions at Izaña for the July–September months.

When comparing MLO and IZO statistics, we calculate long-term AOD 550 means of 0.050 and 0.020, respectively, and geometrical means of 0.033 and 0.017. Respective geometrical standard deviations are about 1.7 for MLO and 2.6 for IZO, meaning that AOD varies from 60 to 170 % of 0.017 for MLO and from 38 to 260 % of 0.033 for IZO. This is linked with the Saharan dust events (AOD outliers for a normal distribution) that affect IZO. An overview of the GAW-PFR AOD time series at all stations will be reported in a future study.

5 Summary and conclusions

“AOD is the single most comprehensive variable to assess the total aerosol load of the atmosphere and represents the least common denominator by which ground-based remote sensing, satellite retrievals and global modeling of aerosol properties are compared” (WMO, 2016a). According to the WMO, multiwavelength AOD is one of the essential variables that critically contributes to the characterization of Earth's climate. In addition, the Global Climate Observing System (GCOS) includes atmospheric aerosols including AOD as an essential climate variable. Finally, the European Space Agency has included aerosols and AOD as one of the 10 climate change initiative (CCI) variables to be investigated with a view towards building space-based databases.

In order to monitor AOD over the long-term and provide data of traceable quality, the World Optical depth Research and Calibration Centre (WORCC), Davos, was established by the WMO Global Atmosphere Watch (GAW) program. Fifteen existing GAW baseline stations were chosen for the deployment of PFRs (precision filter radiometer; in-house manufacture). Quality-controlled and -assured AOD data from this GAW-PFR network (www.pmodwrc.ch/worcc) are being submitted by WORCC to the World Data Centre for Aerosols (ebas.nilu.no).

Under conditions of low aerosol loading, e.g., AOD < 0.1 at 500 nm, a calibration error of 1 % results in an error of ~ 12 % in the mean daily AOD. WMO has recommended (WMO, 1993) an absolute limit to the estimated uncertainty of 0.02 optical depths for acceptable data and < 0.01 as a goal to be achieved in the near future. These specifications require a calibration uncertainty better than 2 % to be achieved for spectral radiometers. In addition, measurement quality control and quality assurance in different processing levels of the actual measured direct Sun signals or retrieved AOD have to be included.
The calibration hierarchy of any network of Sun photometers is linked with the instrument performance and stability over time. Instruments which do not exhibit good stability (e.g., filter degradation) over time tend to utilize short periods for Langley calibrations where the instrument response can be considered constant. This can impact the calibration constant uncertainty through the limited number of measurements and the statistical analysis that is used. The PFR development and construction has been based on the use of specific hardware and manufacturing techniques that make them reliable for long-term measurements without rapid interference filter changes (e.g., Fig. 2). This provides the opportunity of using longer periods for collecting Langley calibration results and thus results in better statistics for the determination of the calibration constants.

Quality control of routine WORCC/PFR measurements includes a number of measurement-related checks, including the optical window cleanliness and the accuracy of the Sun pointing. In addition, a number of parameters such as pressure, ozone and NO\textsubscript{2} concentrations have to be measured, assumed and/or modeled. Further QC procedures involve data evaluation, especially rejecting measurements with wavelength-related drifts (crossing) and suspected cloud contamination in the line of sight. Cloud screening becomes a difficult task, especially in the case of optically thin clouds that cannot be easily distinguished from AOD associated with coarse-mode aerosols. Finally, quality assurance of AOD data mainly include the determination of a proper calibration (extraterrestrial signals) within the required uncertainty.

WORCC has defined a protocol for calibrating the PFR instruments by maintaining a triad of reference PFRs that exhibit differences well within (more than 99\% of 1 min data over a 12-year period) the U95 WMO criterion. The procedure includes systematic checks including comparisons with instruments that perform measurements (Langley calibrations) at high-altitude stations.

One of the aims of WORCC is the provision of instrumentation and protocols for uniform global measurement and records of AOD and the maintenance of the radiometric reference for such measurements. So in addition to the hosting and maintenance of the AOD triad, WORCC hosts the filter radiometer comparison every 5 years (e.g., WMO, 2016b) and maintains long-term AOD measurements at the main calibration sites of other aerosol networks such as AERONET (Mauna Loa, USA; Izaña, Spain) and SKYNET (Chiba, Japan; Valencia, Spain).

Data availability. The data that has been used in this work is available upon request.

Competing interests. The authors declare that they have no conflict of interest.

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