

Uncertainties in satellite remote sensing of aerosols and impact on monitoring its long-term trend: a review and perspective

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Abstract. As a result of increasing attention paid to aerosols in climate studies, numerous global satellite aerosol products have been generated. Aerosol parameters and underlying physical processes are now incorporated in many general circulation models (GCMs) in order to account for their direct and indirect effects on the earth's climate, through their interactions with the energy and water cycles. There exists, however, an outstanding problem that these satellite products have substantial discrepancies, that must be lowered substantially for narrowing the range of the estimates of aerosol's climate effects. In this paper, numerous key uncertain factors in the retrieval of aerosol optical depth (AOD) are articulated for some widely used and relatively long satellite aerosol products including the AVHRR, TOMS, MODIS, MISR, and SeaWiFS. We systematically review the algorithms developed for these sensors in terms of four key elements that influence the quality of passive satellite aerosol retrieval: calibration, cloud screening, classification of aerosol types, and surface effects. To gain further insights into these uncertain factors, the NOAA AVHRR data are employed to conduct various tests, which help estimate the ranges of uncertainties incurred by each of the factors. At the end, recommendations are made to cope with these issues and to produce a consistent and unified aerosol database of high quality for both environment monitoring and climate studies.

Keywords. Atmospheric composition and structure (Aerosols and particles) – History of geophysics (Atmospheric sciences) – Meteorology and atmospheric dynamics (Radiative processes)

1 Introduction

Industrialization and human activities have led to the release of excessive amounts of trace gases and aerosol particles into the atmosphere. Aerosols are a major atmospheric variable influencing both the transfer of radiative energy, and the conversion of water vapor into cloud droplets and raindrops. As such, most general circulation models (GCMs) are now incorporating aerosol parameters and physical processes linking aerosols with the energy and water cycles so that aerosol's direct and indirect effects on climate can be addressed. However, aerosol remains one of the largest uncertainties in estimating climate forcing (IPCC, 2007), due in large part to a lack of reliable measurements on the global scale. Many global estimates of the aerosol climate forcing were based on simulations by chemical-transport model (CTM) coupled with or driven by GCM (Chin et al., 2002; Hansen et al., 2002; Ramaswamy et al., 2001; Takemura et al., 2002). Thanks to the advent of global satellite retrieved aerosol products (King et al., 1999; Kauffman et al., 2002) in combination with increasing number of ground aerosol observation stations (Holben et al., 1998), modeling studies are starting to use observational data to constrain model



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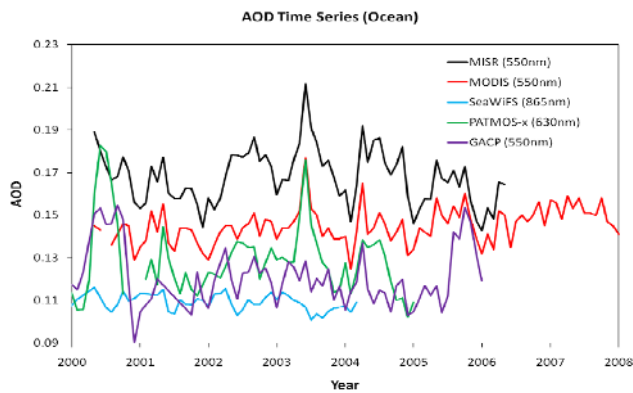


Fig. 1. Comparison of global mean AOD over ocean derived from different satellite input data and retrieval algorithms for an overlapping period since 2000. Different retrieval algorithms assuming different aerosol models (some even retrieve aerosol model such as MODIS algorithm). Converting AOD from retrieval channels to the standard 550 nm wavelength depend on the aerosol model used or retrieved and the extrapolation may introducing extra errors, especially for the algorithm using fixed aerosol model (such as AVHRR). Thus, we decide to display the AOD in the retrieval channel instead of extrapolating to the standard wavelength 550 nm.

uncertainties. However, large discrepancies still exist in the estimates of aerosol direct forcing among some modeling studies (Bellouin et al., 2005; Chung et al., 2005; Yu et al., 2006; Zhao et al., 2008a) using satellite products generated from different sensors by different retrieval algorithms.

As a measure of aerosol loading, aerosol optical depth (AOD) is a basic optical property derived from many earth observation satellites (AVHRR, MODIS, MISR, TOMS/OMI, SeaWiFS, etc.) spanning from late 1970s to the present. While several inter-comparison studies (King et al., 1999; Lee et al., 2009) were conducted and some insights were gained on the causes of the discrepancies (Jeong et al., 2005; Jeong and Li, 2005; Zhao et al., 2005a, b; Kahn et al., 2007; Kokhanovsky et al., 2007; Mishchenko et al., 2007a, 2009; Liu and Mishchenko, 2008), progress has been slow to reconcile the differences and to generate integrated products so that advantages of individual products are retained while their weaknesses are circumvented or relieved (Kinne et al., 2006, 2009).

This has posed the greatest challenge to user communities in choosing an aerosol product from a rich inventory. In addition to the usage for modeling studies, the integrated product should provide a seamless long-term time series to monitor any trend changes due to natural or anthropogenic causes (Mishchenko et al., 2007b). Since more aerosol products will be generated from new sensors (e.g., CALIPSO, PARASOL, OMPS, APS, and VIIRS), the issue of consistency is becoming even more acute. This is demonstrated in Fig. 1 showing a comparison of time series of global mean AOD over ocean computed from several prominent aerosol products using dif-

ferent input datasets and algorithms over the same period in recent years. Differences appear both in terms of magnitude and temporal tendency. The overall range of discrepancy amounts to about 50% of the mean AOD.

The factors involved include differences in cloud masking, treatment of surface boundary conditions, assumptions about component aerosol microphysical properties, and instrument calibration, as discussed below and in the references cited. Spurious trends may result from deficient retrieval algorithms and/or erroneous calibration of the input data (Zhao et al., 2008b). Improper assumptions used in the algorithm regarding such key parameters as aerosol type and size distribution may lead to a spurious AOD long-term trend in the regions under heavy influence of industrial and biomass burning pollutions and desert particles due to the regional biases. Consistent calibration is an even more acute problem in studying the trend of AOD using historical poorly calibrated satellite radiance data. The sign of AOD long-term trend can be reversed due to inadequate calibration (Zhao et al., 2008b).

However, sampling differences among the instruments also make major contributions to the apparent discrepancies in regional episodic events (Ignatov et al., 2005; Kahn et al., 2007). Given AOD spatial and temporal variability, convolved with actual satellite measurement frequency, the assumption that “monthly mean” data sets from these instruments can be treated as statistical representations of regional or global AOD must be examined more closely, especially for the instruments with low revisit frequency (such as MISR). This of course has implications for the way these data sets can be used for assessing long-term trends. Therefore, before the physical causes of any trends in AOD are identified, we must gain deep insights in the retrieval algorithms and input datasets, as well as data sampling, to assure they do not cause any significant artifacts of both temporal and spatial footprints in the retrieval products.

2 Overview of long-term global AOD products

Aerosol products have been retrieved from the AVHRR, TOMS/OMI, SeaWiFS, MODIS, and MISR for a relatively long time period. Historical aerosol products were derived from AVHRR and TOMS measurements that have the longest records of over 25 years. Since aerosol remote sensing was not included in the original instrument design, the aerosol retrievals from these traditional instruments are subject to more limitations than the retrievals from SeaWiFS, MODIS, and MISR. However, their long duration make them uniquely suited for climate studies.

2.1 TOMS product

This dataset was generated from the satellite observations made by NASA’s Total Ozone Mapping Spectrometer

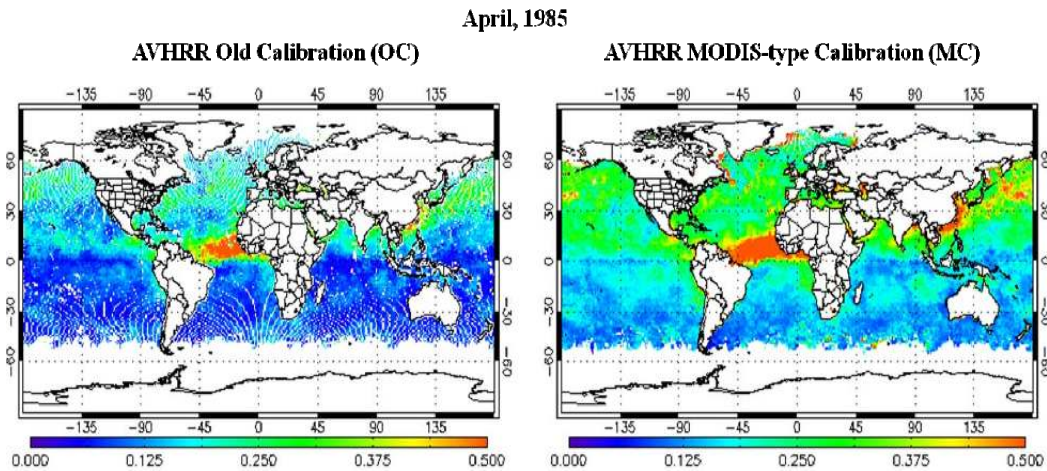


Fig. 2. Monthly mean maps of AOD at $0.63 \mu\text{m}$ for April 1985 derived from old AVHRR radiances (left panel) and retrospectively calibrated AVHRR radiances using MODIS radiances (right panel).

(TOMS) sensors onboard the Nimbus-7 (1979–1992), Meteor-3 (1991–1994), ADEOS (1996–1997), Earth Probe (1996–2000) satellites. Because of the low near-UV surface albedo of all terrestrial surfaces (including deserts) except for ice or snow, the TOMS near-UV measurements from all platforms have been used to detect aerosols and retrieve their AOD and single scattering albedo (SSA) over both oceans and continents (Torres et al., 1998, 2002). The AOD has been validated through comparisons with surface Aerosol Robotic Network (AERONET) measurements. Gridded monthly mean AODs at a $1^\circ \times 1^\circ$ resolution from 1979 through 2000 are available for our study. The current TOMS aerosol algorithm (version 2) has undergone important upgrades that reduced significantly the overestimation (observed in Fig. 3) over the oceans of the version 1 record with respect to other satellite data sets.

2.2 GACP-AVHRR aerosol data

This dataset is the product of the NASA Global Aerosol Climate Project (GACP) established in 1998. The aerosol retrieval algorithm is based on channel-1 ($0.63 \mu\text{m}$) and channel-2 ($0.85 \mu\text{m}$) AVHRR observations over the oceans (Mishchenko et al., 1999; Geogdzhayev et al., 2002) and applied to the ISCCP DX radiance dataset (Rossow and Schiffer, 1999). The algorithm simultaneously retrieves the AOD and Ångström exponent (AE). Extensive studies on the accuracy of the product have been performed against shipborne measurements and SAGE, MODIS and MISR observations (Mishchenko et al., 2003, 2007a; Liu et al., 2004; Geogdzhayev et al., 2004; Smirnov et al., 2006). The monthly averaged values of AOD (at $0.55 \mu\text{m}$) and AE are gridded at a $1^\circ \times 1^\circ$ resolution to form final global aerosol climatology over the oceans for the period of July 1983 to the present (Mishchenko et al., 2007c).

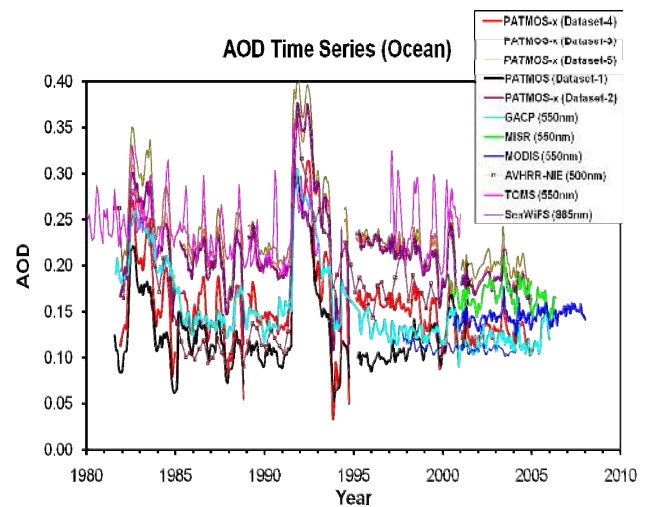


Fig. 3. Comparison of global mean AOD computed from five versions of PATMOS experimental products, with reference to the other aerosol products discussed in the paper.

Jeong and Li (2005) conducted an inter-comparison study between the TOMS and GACP AOD products. The general trends of the two products are similar, but their magnitudes differ beyond the differences caused by the spectral dependence of AOD due to the use of different channels (UV and visible). The two aerosol products also exhibit a good synergy. Taking advantage of their respective strengths, an algorithm was developed to classify aerosol types into dust, biomass burning, a mixture of the two, sulfate/pollution, and sea-salt. Using this algorithm, regions under the dominant influence of various types of aerosols were determined from the two satellite products, which helped convert the TOMS AOD at the UV wavelength to AOD at the visible wavelength.

However, the causes for their differences cannot be gleaned from the use of the two monthly mean products. This initial synergy exercise on the two products will benefit the future synergy effort by including more satellite aerosol products.

2.3 PATMOS-AVHRR data

An early version of this AOD dataset was generated from AVHRR Pathfinder Atmosphere (PATMOS) climate dataset over oceans from September 1981 to December 2000 at 110-km equal area global grids (Stowe et al., 2002) using a one-channel at $0.63 \mu\text{m}$ algorithm (Stowe et al., 1997). The performance of the aerosol retrievals has been thoroughly evaluated against surface measurements (Stowe et al., 2002; Zhao et al., 2002) and against the MODIS product (Zhao et al., 2005a, b). The more accurate MODIS radiances were then used to re-calibrate the AVHRR radiance (Heidinger et al., 2002) by using simultaneous nadir overpass (SNO) data (Cao et al., 2004). An independent two-channel algorithm is applied to the recalibrated AVHRR radiances, leading to a new product named PATMOS-x. Better dust detection algorithm has also been developed to improve the distinction between thick dust storms and clouds (Evan et al., 2006). A consistent inter-satellite calibration using MODIS as the reference was applied to all the AVHRR sensors on different satellite platforms. As a result, the calibration accuracy of AVHRR is now compatible to that of MODIS, which is proven to be critical for determining AOD long-term trend from historical AVHRR observations (Zhao et al., 2008b).

2.4 MODIS product

MODIS AOD is retrieved using multiple channels from the MODIS sensors aboard the Terra and Aqua satellites, beginning in 2000 and 2002, respectively, using separate algorithms over oceans (Tanré et al., 1997) and land (Kaufman et al., 1997; Remer et al., 2005). The algorithms are continuously evaluated and periodically updated (Levy et al., 2007a, b; Remer et al., 2008). Over land, the new collection 5 eliminates the systematic overestimation of AOD for low aerosol loadings and underestimation for high loadings (Levy et al., 2007a; Li et al., 2007; Mi et al., 2007), which existed in previous collections (Chu et al., 2002; Remer et al., 2005; Levy et al., 2005). Collection 5 also expands MODIS AOD coverage to bright desert surfaces by using the deep-blue retrieval algorithm (Hsu et al., 2006). Over oceans, the MODIS AOD is systematically higher than that from the GACP aerosol product (Geogdzhayev et al., 2004). Larger regional differences between the two products are likely associated with cloud screening and the selection of aerosol size distribution models (Jeong et al., 2005; Zhao et al., 2005a, b).

2.5 MISR product

MISR is another important specialized instrument onboard the Terra satellite providing AOD data over oceans (Mar-

tonchik et al., 1998; Kahn et al., 2001) and land (Martonchik et al., 1998; Diner et al., 2005). Given its multiple angle viewing capability, aerosol retrievals can also be made over bright surfaces such as deserts. Simulated MISR radiances for mixtures containing up to three components, are tested against observed radiances for all glint-free cameras (up to nine), at each of two wavelengths over water; over land, all nine cameras and four wavelengths are included, and the algorithm makes use of surface variability. Thus, aerosol types can be determined from the MISR aerosol retrieval. The number of aerosol mixtures and components has changed several times during the refinement of the retrieval algorithm (e.g., Kahn et al., 2005). The standard algorithm now contains three-component mixtures and uses red and NIR channels (two channels) over dark water and all four channels over land. The aerosol products have been evaluated against AERONET observations (Martonchik et al., 2004; Kahn et al., 2005; Abdou et al., 2005).

2.6 SeaWiFS aerosol product

SeaWiFS (1997–present) is primarily for the routine global ocean color measurements and ocean bio-optical property data generation, which requires a high accuracy in calibration and high spectral band signal-to-noise characteristics (Gordon and Wang, 1994). The SeaWiFS aerosol retrieval algorithm uses two NIR bands (765 and 865 nm) to estimate the aerosol optical properties (Gordon and Wang, 1994a; Wang et al., 2005). Over productive ocean waters, bio-optical models are used to account for the NIR ocean contributions (Siegel et al., 2000; Stumpf et al., 2003). SeaWiFS routinely produces AOD at 865 nm and Ångström exponent products in the global oceans. The SeaWiFS AOD data have been validated against ground-based measurements (Wang et al., 2005) and used for studying aerosol effects over oceans (e.g., Chou et al., 2002). The same algorithm (Gordon and Wang, 1994a; Gordon, 1997) has been also employed to routinely derive the MODIS ocean color aerosol products (AOD and Ångström exponent) over global oceans.

The products described above have their strengths and weaknesses as summarized in Table 1. Some of these datasets have been employed in model simulations of the global impact of aerosols on the earth's climate, while others have used them to study the trend of aerosol loading especially in the context of environmental changes. Discrepancies existing between the products must be minimized to the best of our knowledge, and ways must be found to deal with sampling limitations. In the following section, we attempt to elaborate some major potential sources that have contributed to the discrepancies.

Table 1. Summary of the calibration approach, accuracy, and precision of existing satellite aerosol instruments.

| Instrument | Method | Reference source |
|---------------------|--|---|
| AVHRR-GACP | Pre-launch, ISCCP post-launch using deep convective clouds (absolute accuracy ~5%, to be calibrated against MISR/MODIS, ~1% precision) | Rossow and Sciffer (1999) |
| AVHRR-PATMOS | Vicarious, Intersatellite (accuracy ~3–5% absolute, precision ~1%) | Libyan desert & SNOs (Heidinger et al., 2002) |
| TOMS | Vicarious (~2% accuracy) | Ice and Clouds |
| MISR | On-board, vicarious, lunar (~3% absolute; 1–2% channel-to-channel relative; 1% precision) | Kahn et al. (2005b) Bruegge et al. (2006) |
| MODIS | On-board, vicarious, lunar (~2% absolute, ~1% precision) | Solar diffuser |
| SeaWiFS/MODIS ocean | On-board, Vicarious, Lunar, comparison with in situ (accuracy 0.5%; precision ~0.3%) | Solar, Lunar, & Vicarious over clear oceans |

Table 2. Summary of cloud screening schemes for the satellite aerosol retrievals.

| Instrument | Method | Note |
|----------------------------|--|---|
| AVHRR-GACP | Modified ISCCP cloud detection scheme based on the thermal IR channels | Mishchenko et al. (1999) |
| AVHRR-NIES AVHRR-PATMOS | Thresholds of Ch-1 reflectance and Ch-4 BT CLAVR & CLAVR-x | Higurashi et al. (2000) Stowe et al. (1999) & Heidinger et al. (2004) |
| TOMS/OMI | Threshold of 0.36 μm reflectance + TOMS AI information | Torres et al. (2002) |
| MISR | Multi-angle-based: radiative camera-to-camera & stereo-derived cloud masks + angular smoothness and spatial correlation tests. | DiGirolamo and Wilson (2003); Martonchik et al. (2002); Diner et al. (2006) |
| MODIS | Spatial variability at 0.67 μm over ocean, 0.46 & 1.38 over land; IR 1.38 μm test for cirrus. | Martins et al. (2002) Remer et al. (2005) |
| SeaWiFS/MODIS | Threshold of 0.863 μm reflectance | Robinson et al. (2003) Wang et al. (2005) |

3 Sources of discrepancies in AOD retrievals

Satellite retrieval of AOD is subject to uncertainties associated with radiometric calibration, assumption of aerosol properties, cloud contamination, and correction of the surface effect. Retrieval errors stemming from these factors can diminish the retrieval quality. Temporal trends appearing in the data product, which cannot be readily identified using the traditional ground-truth and in-situ measurement, can be affected by these factors as well as by sampling limitations, time-of-day and clear-sky biases, etc.

3.1 Calibration

Radiance calibration is a major source of uncertainty in AOD retrievals (e.g., Higurashi and Nakajima, 1999; Ignatov and Stowe, 2002b) which could change the AOD by more than 40% (Geogdzhayev et al., 2002). Calibration method and

accuracy differ considerably from sensor to sensor, as summarized in Table 1. Since the modern research sensors (e.g. MODIS and MISR) have on-board calibration systems, they are more accurate than the vicarious calibration adopted for the traditional sensors (e.g. AVHRR and TOMS).

Thus, using advanced research sensors to cross-calibrate the traditional sensors can reconcile the relatively larger uncertainties in the vicarious calibrations of the traditional sensors and reduce their uncertainties close to that of advanced research sensors. For example, the Simultaneous Nadir Overpass (SNO) method was developed specifically for intersatellite calibrations (Cao et al., 2004; Heidinger et al., 2002). More accurate MODIS reflectances ($\pm 2\%$ uncertainties in calibration) can be used to cross-calibrate the AVHRR reflectances ($\pm 5\%$ uncertainties in calibration) for the overlap operational time periods of the two instruments. The newly calibrated AVHRR radiances are applied backward

one satellite platform each time until the last (or the earliest) platform (NOAA-9) is completed. As a result, the MODIS calibration is effectively transferred to the AVHRR instrument with uncertainties close to that of MODIS. Moreover, a consistent calibration can be applied to the AVHRR on different satellite platforms, critical for generating unbiased long-term aerosol dataset (Zhao et al., 2008b).

As an example, Fig. 2 compares AVHRR AOD retrievals using the original radiances at $0.63 \mu\text{m}$ with that from the newly SNO calibrated AVHRR radiances. On a global scale, the new AODs are higher than the old AODs. Since MODIS generally has higher AOD values than the original AVHRR AOD values (e.g., Mishchenko et al., 2007a; Myhre et al., 2005; Jeong et al., 2005), the new AVHRR AODs are more consistent with those from MODIS.

Among the operational sensors, SeaWiFS achieves highest calibration accuracy (0.5% accuracy and 0.3% stability) through on-board, lunar (Barnes et al., 2001), and vicarious calibrations (Gordon, 1998; Eplee et al., 2001), which may also be used as the baseline reference for calibrating other sensors at cross-over instances. The SeaWiFS and MODIS (ocean color) vicarious calibrations have been carried out using the in situ data from the Marine Optical Buoy (MOBY) deployed in the west of Lanai, Hawaii (1997–present) (Clark et al., 1997).

3.2 Cloud screening

Arguably, the largest source of uncertainties in AOD retrievals is cloud screening (Mishchenko et al., 1999; Ignatov and Nalli, 2002; Zhao et al., 2003; Myhre et al., 2004; Jeong and Li, 2005; Jeong et al., 2005; Kaufman et al., 2005). Much attention was paid to this issue by all major AOD data producers. For the GACP product, in addition to the IS-CCP cloud detection algorithm (Rossow and Garder, 1993), more conservative cloud screening algorithm was applied by Mishchenko et al. (1999) and Geogdzhayev et al. (2002). This additional cloud screening aims to eliminate small cumulus clouds and optically thin cirrus clouds. On the other hand, strict cloud masking could have the adverse effect of discarding strong aerosol signals (Husar et al., 1997; Haywood et al., 2001), which might be a major contributing factor to the systematically lower AODs from GACP compared to the MODIS product (Jeong et al., 2005). The MODIS AOD product was generated using an aerosol cloud screening method specifically developed for aerosol remote sensing (Martins et al., 2002) rather than using the nominal MODIS cloud identification scheme (Ackerman et al., 1998). SeaWiFS used the Rayleigh-corrected reflectance threshold at the NIR (865 nm) for the cloud discrimination (Robinson et al., 2003; Wang et al., 2005). The cloud screening schemes used by the satellite aerosol retrievals discussed in this paper are summarized in Table 2. Sensitivity studies of aerosol products (especially global monthly means) to the different cloud screening methods are lacking in all satellite aerosol products

discussed here, which is a significant obstacle for reconciling the differences among the AOD datasets and needs to be resolved before a consistent and integrated satellite aerosol data product can be generated and provided to user communities.

3.3 Selection of aerosol models

Due to a general lack of information about aerosol types on a global scale, different aerosol models were adopted in generating the AOD products. The MODIS ocean retrieval algorithm employs 20 combinations of aerosol size distributions given by bi-log-normal (BL) functions with variable refractive indices. There are no arbitrary restrictions imposed on the retrieval choice of the 20 combinations. Over land, the MODIS algorithm specifies two aerosol models for each location and season. The GACP/AVHRR algorithm uses a modified power law size distribution with varying slope and a fixed particle refractive index. Model simulations were conducted to investigate the impact of the differences in the size distribution function and the refractive index on the AOD discrepancies (Mishchenko et al., 1999; Jeong et al., 2005). It was found that the difference in the size distribution function can create substantial AOD discrepancies of up to a factor of 2, while different refractive indices cause a moderate systematic difference. The same finding may apply to other AOD products.

Table 3 summarizes the aerosol models used for the retrievals discussed here. Sensitivity study of influence of aerosol model selection on the AOD long-term trend performed for the AVHRR type AOD retrieval with fixed aerosol model (Zhao et al., 2008b) indicates that improper selection of aerosol model may generate spurious AOD long-term trend on the regional scale. For MISR, both statistical and case-by-case analyses of the aerosol type assumption impacts on retrieved AOD have been performed for globally distributed aerosol types (Kahn et al., 2005), spherical absorbing and non-absorbing particles (Chen et al., 2008; Kahn et al., 2007), and desert dust (Kalashnikova and Kahn, 2006). In conclusion, attention should be paid to aerosol size distributions in addition to refractive indices and cloud screening.

3.4 Surface effect

Except for the multi-angle technique adopted in the MISR and the UV-technique used in TOMS, removal of the surface effect, especially for relatively bright surfaces such as arid and semi-arid land and desert, is a key to the estimation of AOD from satellite observations. It is a much easier task over oceans than over land. In the MODIS and GACP algorithms, the ocean surface boundary condition is based on Cox and Munk (1954) with the wind speed set to 6 or 7 m/s (Mishchenko and Geogdzhayev, 2007; Levy et al., 2003). SeaWiFS also implemented a surface whitecap reflectance correction algorithm (Gordon and Wang, 1994b;

Table 3. Summary of aerosol models and instrument channels and angles used for satellite aerosol retrievals.

| Instrument | Aerosol model | Channels used |
|---------------|--|---|
| AVHRR-GACP | Modified power -law, $n=1.5-0.003i$ | Dependent 2-Chs |
| AVHRR-NIES | Bi-modal Log-N, $n=1.5-0.005i$ | Dependent 2-Chs |
| AVHRR-PATMOS | Bi-modal Log-N, $n=1.45-0.003i$ & $1.45-0.007i$ | Independent 2-Chs |
| TOMS | Bimodal Log-N, 3 Types, 21 aerosol models based on AERONET statistics | 2-Chs (331, 360 nm) Report at 380 nm & 500 nm |
| MISR | Log-N; mixtures containing up to 3 of 8 components, including non-spherical dust | 9-angles x 2 spectral Chs over water (672, 867 nm); 4-Chs over land |
| MODIS ocean | Bi-modal Log-N, 4 fine modes & 5 coarse modes. $nr=1.36-1.53$, $ni=0-0.005$ | 6 channels (ocean) |
| MODIS land | Mixture of fine-dominated multi-modal Log-N with coarse-dominated multi-modal Log-N at each location; 3 different fine-dominated models selected a priori dependent on location and season | 3-Chs (land) |
| SeaWiFS/MODIS | Bi-modal Log-N, SSA from 0.93–1.0 at 865 nm | 2-Chs (765, 865 nm)/(748, 869 nm) |

Frouin et al., 1996) using the wind speed data. Therefore, not only is the ocean surface dark, discrepancies caused by the treatment of its effect are minimized. However, for some rough ocean surfaces, such as those in the “roaring 40s” band (40° S– 60° S), surface contamination may become prominent (Mishchenko and Geogdzhayev, 2007). Large differences in aerosol products, especially for aerosol Angstrom Exponent (AE), are observed from MODIS and AVHRR data collected over this region of the southern ocean (Zhao et al., 2005b).

It is generally difficult to accurately derive aerosol optical properties in the coastal ocean regions. As a result, many AOD products show discontinuity along the coastal regions (e.g., Mishchenko et al., 2009). A main challenge lies in complex turbid waters caused by river inputs, sediment re-suspension or large phytoplankton blooms. For productive ocean waters, there are very significant ocean contributions at the NIR bands (Siegel et al., 2000; Stumpf et al., 2003; Wang and Shi, 2005, 2007). The ocean radiance contributions are even larger at the red bands. Thus, in the coastal regions where waters are often turbid, the satellite-derived AOD is usually over-estimated without properly accounting for the ocean contributions. In addition, a recent study (Wang, 2006) shows that in the coastal region the aerosol polarization effects may need to be included.

More efforts are called for to cope with the surface effect over land. While the spectral variation of surface albedo was taken into account in the MODIS algorithm, little has been done to account for the influence of the bidirectional reflectance distribution function (BRDF) (Luo et al., 2005). Little is known about the effect of land use and land cover change on the aerosol long-term trend. Table 4 lists the ma-

ior features of the surface treatment for the major aerosol retrieval algorithms discussed here.

Since historical AVHRR, current EOS/MODIS, and future NPOESS/VIIRS instruments are more comparable than the other instruments involved and can eventually cover a time period of about 50 years together, more effort should be put on the comparison and reconciliation of these products. AOD and the Angstrom exponent (AE) should be treated as two core products since they are available from almost all the instruments. Spherical vs. non-spherical particle type distinctions are produced for AOD $> \sim 0.15$ or 0.2 by MISR. Fine/coarse fraction modes, SSA, and any other aerosol optical properties are highly desired but are formidable to achieve at present. A consistent long-term AOD and AE products with sufficient climate application quality using AVHRR and MODIS measurement as the kernel and the measurement from other historical, current, and future satellite instrument as supplement could be generated eventually through data synergy.

4 Demonstration of the impact of retrieval uncertainties on global AOD products, aerosol radiative forcing, their temporal variations

To comprehend the large discrepancies exhibited in Fig. 1 in the context of various potential contributing factors as described above, tests were conducted by applying different retrieval algorithms to the PATMOS and PATMOS-x aerosol products (Stowe et al., 2002; Zhao et al., 2008b) spanning nearly 25 years from September 1981 to December 2004. Five datasets are generated as outlined in Table 5.

Table 4. Summary of surface treatment for the major aerosol retrieval algorithms.

| Instrument | Method | Note |
|---------------|--|---|
| AVHRR-GACP | Bi-directional (Cox-Munk with variable wind speed taken from assimilation) | + small Lambertian component |
| AVHRR-NIES | Bi-directional (modified Cox-Munk) with variable wind speed taken from NCEP re-analysis | + small Lambertian component |
| AVHRR-PATMOS | Bi-directional (Cox-Munk) with fixed wind speed | + small Lambertian component |
| TOMS | Aerosol-corrected TOMS climatology of minimum lambertian reflectance | |
| MISR | Bi-Directional (Cox-Munk + whitecap over Ocean parameterized as function of wind speed; Spectrally invariant surface angular shapes plus empirically derived bidirectional reflectances from the data) | Lambertian spectral water-leaving reflectance retrieval being developed |
| MODIS | Bi-directional (Cox-Munk) – Ocean Dark Pixel – Land assuming spectral ratios | + small Lambertian component over ocean |
| SeaWiFS/MODIS | Bi-directional (Cox-Munk) + whitecaps driven by wind speed | + correction on visible and 765 & 865 nm |

Table 5. Five long term aerosol datasets from the AVHRR observations used in the current AOD tendency analysis. τ_1 and τ_2 are AOD of AVHRR Channel 1 ($0.63 \mu\text{m}$) and 2 ($0.83 \mu\text{m}$), respectively.

| Datasets | Products | Retrieval resolution | Time coverage | Algorithm | Notes |
|----------|-----------------------|---|---------------|---------------------|---------------------------------|
| 1 | τ_1 | Pixel level (GAC data) | 1981–2001 | One-channel | PATMOS, Old Calibration |
| 2 | τ_1 and τ_2 | Pixel level (GAC data) | 1981–2004 | Two-channel | PATMOS-x, New Calibration |
| 3 | τ_1 and τ_2 | Grid level ($0.5^\circ \times 0.5^\circ$) | 1981–2004 | Two-channel | PATMOS-x based, New Calibration |
| 4 | τ_1 and τ_2 | Grid level ($0.5^\circ \times 0.5^\circ$) | 1981–2004 | Revised Two-channel | PATMOS-x based, New Calibration |
| 5 | τ_1 | Grid level ($0.5^\circ \times 0.5^\circ$) | 1981–2004 | One-channel | PATMOS-x based, New Calibration |

Dataset 1 gives AOD at $0.63 \mu\text{m}$ using the single-channel algorithm of Stowe et al. (1997) with the original vicarious calibration from Libyan deserts. The more accurate MODIS radiances were used to re-calibrate the AVHRR radiance retrospectively (Heidinger et al., 2002) to produce a new product, which is named as PATMOS-x and has been extended to 2005 by including the AVHRR observations from the NOAA-15, -16, and -17. The dataset 2 of PATMOS-x is derived from the pixel-level daily orbital radiances sampled from the AVHRR Global Area Coverage (GAC) data and in a spatial resolution of $8 \text{ km} \times 8 \text{ km}$ using two-channel algorithm of Ignatov and Stowe (2002a). It provides AOD in the AVHRR channel 1 ($0.63 \mu\text{m}$), τ_1 , and channel 2 ($0.83 \mu\text{m}$), τ_2 . It assumes an aerosol model of non-absorbing with one-mode log-normal size distribution over ocean surface under the wind speed of 1 m/s for the calculation of ocean surface reflectance. Dataset 3 is the same as dataset 2 except for a degraded resolution of $0.5^\circ \times 0.5^\circ$. Comparing these two

datasets, one notices rather small differences, so that we can use the coarse resolution data to perform the tests more efficiently. Dataset 4 is generated using a revised two-channel algorithm that led to the best agreements with ground-based observations (Zhao et al., 2004), due to the use of a more realistic aerosol model (weak-absorbing with bi-modal log-normal size distribution) and globally averaged ocean surface wind speed (6 m/s). Dataset 5 is similar to dataset 1 but using new SNO calibration data. All five datasets are over ocean only to avoid large uncertainties resulting from highly variable and reflective land surfaces. Apart from the strong interruptions by volcano eruptions of El Chichón in March 1982 and Mt. Pinatubo in June 1991, the long-term variation in AOD could be seen in the Fig. 3. Unfortunately, the faint signal of the inter-annual variation is overshadowed by the exceptionally large discrepancies among the various products.

The largest systematic discrepancy is found between Dataset 1 and 5, due simply to the use of different calibrations. This is not surprising, as the AOD signal is extracted from a reflectance signal that is so faint that any change in the calibration may substantially alter the retrieval of AOD. From this finding, one may thus make a conjecture that the differences in the calibration as given in Table 1 might account for a great deal to the AOD differences shown here. As such, to make the AOD compatible, we must assure radiances measured by different sensors agree first. The SNO calibration method applied to the PATMOS-X is therefore a sound and valid approach to bring the historical AVHRR data into agreement with the MODIS. For trend detection, however, absolute calibration is less important than other factors. The same input data, however, do not necessarily lead to the same AOD retrieval. The AOD from dataset 2 differs considerably from the MODIS AOD, even though their calibrated radiances are similar. This is because of large differences in the aerosol model and treatment of surface reflectance. In narrowing the discrepancy, Zhao et al. (2004) adopted a relatively more realistic aerosol model based on the validation with the AERONET observation. After re-tuning based on AERONET observations, the revised algorithm (dataset 4) leads to the AOD in close proximity with the MODIS products. This is supported by the finding of Jeong et al. (2005) showing very large differences brought by applying two distinct models of aerosol size distribution, the power law and bi-lognormal functions to the same radiance data. Ironically, not only does the dataset 4 AOD agree broadly with the MODIS AOD, it also agrees with the GACP AOD, while the latter employed the power-law size distribution, as is shown more clearly in Fig. 4. Such a level of consistency in AOD is unprecedented, even though regional discrepancies may still be much larger. Yet there is still disagreement in the tendency over the short overlapping period (see Fig. 1) from weak positive (MODIS) to weak negative (GACP, PATMOX-x, SeaWiFS, and MISR), which we think is due to the differences in the cloud screening schemes and warrants a more detailed investigation.

Despite of the good agreement, we are still confronted with fundamental challenges in choosing the right aerosol models characterized by both the size distribution and absorbing property. Lack of constraints on both key variables could produce spurious long-term trends. Note that AOD is just one of the three basic variables to determine their radiative effects. For the same AOD but different SSA and asymmetry factor (also surface albedo), the implied radiative forcing can change in magnitude or even in sign. Unfortunately, both aerosol particle size distribution and SSA are hard to quantify. To date, their measurements are limited to a handful of field experiments that reveal strong variation with time and location. At present, instruments specialized in measuring both variables are very expensive prohibiting widespread usage. Few methods are available for application over large scales on routine basis. By virtue of the combi-

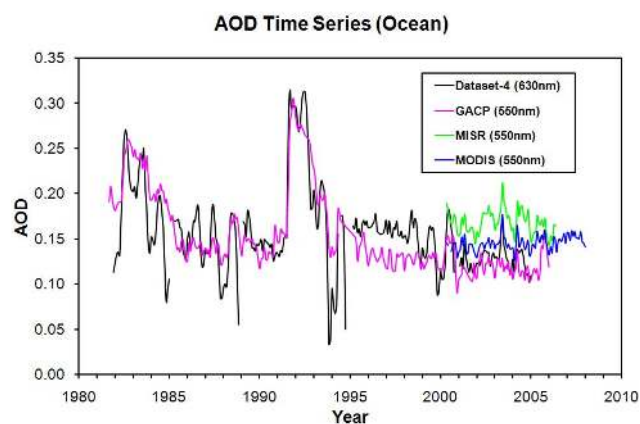


Fig. 4. Comparison of a subset of four latest AOD products.

nation of ground-based clear-sky measurements of transmittance and space-borne measurements of TOA reflectance, the approach proposed by Lee et al. (2007) has certain merit for routine determination of the SSA over large areas, but it is only valid under heavy aerosol loading conditions.

Before radical advances occur to physically characterize aerosols, a feasible means of improving the AOD retrieval appears to be the traditional approach of analyzing retrieval results in light of near-coincident ground-based and aircraft observations. To a certain extent, the good agreement shown here is attributed to extensive validations against the same ground-based observations, primarily the global AERONET (Holben et al., 1998) data. Data from this network provide globally distributed and quality controlled observations and inferences of aerosol spectral optical depth, aerosol size distribution and refractive index (Dubovik and King, 2000; Holben et al., 2001; Smirnov et al., 2002b, 2003; Dubovik et al., 2002). There are currently over 200 AERONET sites in operation of variable durations. AERONET measurements have been employed to validate the retrievals of AOD from the AVHRR (e.g., Higurashi et al., 2000; Zhao et al., 2002, 2003), TOMS/OMPS (e.g., Hsu et al., 1999; Torres et al., 2002), MODIS (e.g. Chu et al., 2002; Ichoku et al., 2002, 2003, 2005; Remer et al., 2002, 2005), and MISR (e.g., Diner et al., 2001; Martonchik et al., 2004; Abdou et al., 2005; Kahn et al., 2005a, b, 2007; Kalashnikova and Kahn, 2006; Chen et al., 2008). However, further evaluation in the context of performance matrix could be beneficial, including additional scatter plots, PDF, long-term time series, consistent checks, and dependent checks (on the calibration, aerosol model selection, cloud screening, and surface treatment) for both episodic scenarios and long-term time series.

To put the AOD discrepancies in the context of solar aerosol direct radiative effect (ADRE), we used the mean and standard deviation of aerosol optical properties derived from 436 AERONET stations around the world (SSA of 0.92 and asymmetry factor of 0.69) to compute ADRE at the top,

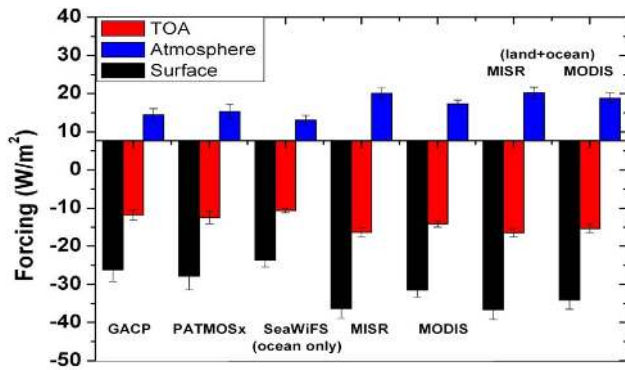


Fig. 5. Aerosol radiative forcing at the top, bottom and inside of the atmosphere computed from global mean aerosol optical depths derived from various satellite sensors and global mean aerosol optical properties estimated from 436 AERONET stations for a solar zenith angle of 40° and albedo of 5%.

bottom and inside of the atmosphere. The radiative transfer calculations were done by assuming a mean solar zenith angle of 40° and a mean surface albedo of 5% (representative of ocean and visible land surface). Figure 5 shows the ADRE for the three layers. It is seen that the means of the ADRE for different global datasets ranges from -10.6 (SeaWiFS) to -16.3 W m^{-2} (MISR) for TOA, -23.7 to -36.3 W m^{-2} at the surface, and 13 to 20 W m^{-2} in the atmosphere. The relative ADRE discrepancies are 46%, 43% and 42% for the surface, TOA and atmosphere respectively. Note that these are instantaneous values that should not be compared with the annual and daily averages as reported in many other studies as summarized in Yu et al. (2006). Dividing the values displayed here by a factor of 2 are approximate estimates of the daily mean values (Zhang et al., 2005b). However, the relative discrepancies among these values are compatible to those of Yu et al. (2006) who compiled the global means of ADRE (TOA and ocean only) estimated by various investigators using different satellite products by assuming different aerosol properties. Since we employed the same aerosol properties, the discrepancies stem from nothing but AOD. The compatible relative discrepancies thus suggest that the differences in our current estimates of the global ADRE are chiefly attributed to the discrepancies in AOD, which is most likely linked to the TOA clear-sky radiances used in different retrievals following different methods of cloud screening and calibration.

Figure 6 shows the time series of the ADRE in the three layers over the EOS era beginning in 2000. There is a tendency that the discrepancies converge in recent years, especially between the MODIS and MISR. This is probably due to adjustments of the algorithms based on recent active inter-comparisons and ground truth validation performed by individual aerosol producers. However, more studies are still necessary to explain the differences in detailed variations and

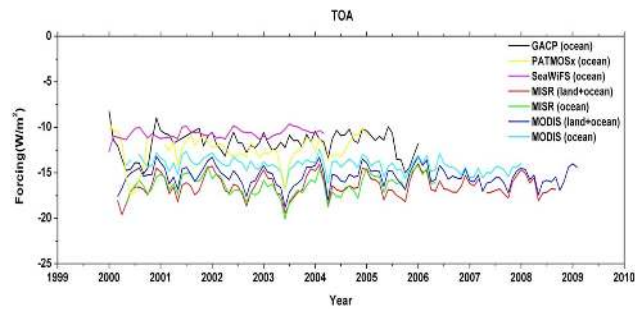


Fig. 6. Time series of the global mean aerosol radiative forcing at the top of the atmosphere based on different global aerosol optical depth products of the same aerosol optical properties from AERONET.

to achieve consistent long-term AOD trends (both global and regional) from various instruments.

5 Concluding remarks and recommendations

As importance of aerosols in the earth's system is recognized, the number of global aerosol products generated from space-borne sensors has dramatically increased within the last decade thanks largely to the advent of the earth observation system. Despite steady improvement in data quality, uncertainties in the retrieval of the most basic aerosol variable, AOD remain so large that can hardly be utilized to monitor the trend of its long-term variation. As a tutorial demonstration of the extent of the problem, this paper only shows some cursory comparisons of the global mean AOD values. On regional scales, the differences can be much larger and a lot more complex, as aerosol properties are so diverse that any fixed aerosol model leads to large regional biases. Even for such a highly averaged quantity, the discrepancies among different products exceed the signal of inter-annual variability, although the precision of the products is significantly better than the discrepancy (e.g., Mishchenko et al., 2007a, 2009). To make a good use of the products for both climate modeling and monitoring, we must first understand and resolve the discrepancies and then produce consistent and unified products of higher accuracy. For monitoring the long-term changes of atmospheric environments and their impact on climate change, we have to bridge historical, current, and future (e.g., Mishchenko et al., 2007d) satellite products.

Towards achieving these goals, each individual product needs to be extensively and rigorously validated and evaluated. Evaluation of the discrepancies requires detailed analysis, in addition to independent measurements, to disclose their causes, and it is difficult to obtain the “true” values of remotely sensed fields. Aerosol remote sensing is subject to four primary uncertain factors: sensor calibration, cloud screening, aerosol optical properties and surface reflectance. Sensor calibration stability is key to long-term

monitoring. The weak radiometric signal of aerosols requires much higher calibration accuracy and precision than other space-borne remote sensing elements such as cloud. For long-term monitoring without interruption, we must maintain at least one sensor of high stability at sufficient number of channels in a polar orbit so that other sensors can be at least cross-calibrated. The biggest challenge confronted us is retrospective calibration of the weather sensors prior to the EOS era. In the EOS era, calibration appears to be a secondary problem relative to other uncertain factors.

Cloud screening is one of the largest sources of discrepancies, especially on pixel and regional scales, which is dual-edge problem. The root of the problem traces to a vague bound between cloud and aerosol, at least in the “eyes” of satellite sensors, and the empirical nature of cloud screening. Over- and under-screening clouds lead to under- and over-estimate of aerosol loadings. An example is dust storm whose spectral signature is somewhat similar to clouds and as a result one may totally miss it or have some residual clouds misclassified as dust. In the era of A-train especially thanks to the two active sensors (CALIPSO and CLOUDSAT), our capability has been enhanced considerably to discriminate residual/thin clouds and thick aerosol layers. It is thus recommended for each cloud screening method designed for a particular sensor to be modified in conformity with an integrated method taking advantage of the suite of A-train sensors. For those sensors that fly in different orbits at different times, the method may be tuned to generate similar PDFs. By doing so, we can eliminate/lessen a primary source of uncertainty that contaminate the quality of aerosol products.

Aerosol absorption dictated chiefly by size distribution and composition is an inherent problem common to all sensors. For known TOA reflectance, the retrieval of AOD is very sensitive to this property, as well as its vertical distribution in the atmosphere. Advance in AOD retrieval is contingent upon the improvement in our knowledge of aerosol properties which further relies on ground-based and/or airborne measurements. In addition, for strongly absorbing aerosols, accurate satellite AOD retrievals require accurate aerosol vertical information, e.g., from CALIPSO measurements. There currently exist a handful of stations measuring many relevant aerosol attributes: light scattering and absorption coefficients, particle number concentrations, and chemical composition. Stations measuring these quantities have been operated at its baseline observatories since the mid-1970s by the NOAA Climate Monitoring and Diagnostics Laboratory (CMDL) (Delene and Ogren, 2002). These surface measurements provide valuable information pertaining to the long-term changes in background aerosol properties and the influence of regional sources on aerosol optical properties’ statistics and trends. Such observations are very expensive to make. Intensive short-term campaign is a sound approach to remedy the problem, which has been conducted in numerous places with different dominant aerosol types around the world. Besides, aerosol type information obtained

from model simulations, such as the GOCART model (Chin et al., 2002), or classification using remote sensing data (e.g. Jeong and Li, 2005) would also be helpful to reduce ambiguity. It is worth noting that different algorithms/sensors have different sensitivity. For example, MISR has more sensitivity to certain particle properties, such as shape, than other operational instruments mentioned in this paper (e.g., Kalashnikova and Kahn, 2006).

Variable and uncertain surface albedo has limited many global aerosol products to oceans only. The problem has been alleviated considerably by the multi-channel approach of MODIS (Kaufman et al., 1997; Hsu et al., 2004) and the multi-angle approach of MISR (Martonchik et al., 1998). The improved relationship between short-wavelength and long-wavelength surface reflectance adopted in the MODIS C5 algorithm (Levy et al., 2006) has significantly improved its accuracy over land (Li et al., 2007). Further improvement is possible by refining the relationship with respect to land cover types, pixel resolution and better accounting for the bidirectional reflectance distribution function (BRDF). The deep blue approach (Hsu et al., 2004) applied to MODIS observations extends MODIS AOD retrieval to over bright surfaces, but more improvements is necessary to better cope with transitional land covers.

Ultimately, we ought to generate a *single* most trustworthy product by integrating data from various sensors and using the best of knowledge about aerosols, as the nature only present us with one true world. Of little doubt, each sensor has its strength and weakness. An integrated aerosol product should make use of synergetic information conveyed in the all available satellite data, which have been validated through inter-comparison and ground truth validation. The integrated product is expected to be superior to any individual product. It will link historical, current, and future satellite observations for long-term trend analysis and climate studies.

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