Version 2.3 GPCP Satellite-Gauge (SG) Monthly Precipitation

1. Intent of This Document and POC

1a) This document is intended for users who wish to compare satellite-derived precipitation estimates with climate model output in the context of the CMIP5/IPCC historical experiments. Users are not expected to be experts in satellite-derived Earth system observational data. This document summarizes essential information needed for comparing this dataset to climate model output. References are provided at the end of this document to additional information.

This dataset, in which NASA participated as a contribution to the Global Energy and Water Exchange (GEWEX) project, is provided as part of an experimental activity to increase the usability of NASA and related satellite observational data for the modeling and model analysis communities. This particular archive of data is not a standard NASA satellite instrument product, but does represent an effort on behalf of data experts to repackage a standard product that is appropriate for routine model evaluation. The data may have been reprocessed, reformatted, or created solely for comparisons with climate model output. Community feedback to improve and validate the dataset for modeling usage is appreciated. Email comments to HQ-CLIMATE-OBS@mail.nasa.gov.

Dataset File Names (as they appear on the ESG):

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where pr_GPCP-SG_L3_v2.3_YYYYM1-YYYYM2.nc

Where YYYY = year

M1 = first month (of the year)

M2 = last month (of the year)
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Note: The GPCP-SG Version 2.3 contained in this data archive is the successor to the Version 2.2 archive originally posted in Obs4MIPS. Version 2.3 uses improved inputs in the later part of the record and extends the record to more-recent years.

1b) Technical point of contact for this dataset:

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2. Data Field Description

CF variable name, units:	pr (precipitation_flux), units of kg / m ² / s	
CF variable name, units:	prSterr (precipitation_flux_standard_error), units of kg / m²/s	
Spatial resolution:	2.5°x2.5° latitude/longitude	
Temporal resolution and extent:	Monthly averages, January 1979 – June 2017 in yearly files	
Coverage:	latitudes 90°N – 90°S	

3. Data Origin

The Satellite-Gauge data set has the identifier "SG" within the Global Precipitation Climatology Project (GPCP). Within the ESG these datasets are posted with file names of the form

The SG is designed to provide fully global, consistently processed precipitation estimates based on a relatively homogeneous set of input data. This design meets Climate Data Record (CDR) standards as part of the NOAA CDR (now Reference Environmental Data Record [REDR]) program. Adler et al. (2003) and Huffman et al. (2009) provide additional background. Data are drawn from four sources, namely passive microwave (PMW) radiances at multiple frequencies and polarizations observed from the DMSP sensors at 6 a.m./p.m. during the DMSP epoch (F08, F11, and F13 SSMI, and F17 SSMIS), thermal infrared brightness temperatures (IR Tb; observed by the international constellation of low-Earth-orbit [leo] and geosynchronous-Earth-orbit [geo] satellites), atmospheric soundings computed from National Oceanic and Atmospheric Administration (NOAA)-series Television-Infrared Observation Satellite (TIROS) Operational Vertical Sounder (TOVS) and NASA Aqua Advanced Infrared Sounder (AIRS) data, and surface precipitation gauge measurements. The monthly estimates contained in this data set are an optimal combination of the monthly satellite precipitation estimates and the precipitation gauge analysis (see below). The computational scheme applied in the present Version 2.3 is that used in Version 2.2, with additional calibrations and adjustments to start/stop dates for data sets, as noted below.

Each of the PMW data streams is processed into precipitation estimates separately over land and ocean. Over ocean the microwave emission technique infers the quantity of liquid water in a column from the increased low-frequency observed microwave brightness temperatures. Greater amounts of liquid water in the column tend to correlate with greater surface precipitation. The algorithm applied is the Wilheit et al. (1991) iterative histogram approach to retrieving precipitation from emission signals in the 19-GHz SSMI channel. It assumes a log-normal precipitation histogram and estimates the freezing level from the 19 and 22 GHz channels. The fit is applied to the full month of data. Individual estimates on the 2.5°x2.5° grid occasionally fail to converge. In that case the estimate is set to the separately computed 5°x5° precipitation estimates available in the box for the month. In Version 2.3, subsequent work by the GPCP Merge Development Centre (GMDC); refined the SSMIS processing coefficients to create a more homogeneous SSMI-SSMIS record over ocean.

Over land and coastal surface areas the PMW algorithm reduces to a scattering-type procedure using only the higher-frequency channels. This loss of information arises from the physics of the emission signal in the lower frequencies when the underlying surface is other than all water. The microwave scattering technique infers the quantity of hydrometeor ice in a column from the depressions in the 85 GHz channel brightness temperatures. More ice aloft typically implies more surface precipitation. This relationship is physically less direct than in the emission technique, but it works equally well over land and ocean whenever deep convection is important. However, icy surfaces also exhibit scattering, so no scattering estimates are possible in areas with an icy, snowy,

or frozen surface. The algorithm applied is based on the Grody (1991) Scattering Index (SI), supplemented by the Weng and Grody (1994) emission technique in oceanic areas. A similar fall-back approach was used during the period June 1990 - December 1991 when the 85.5-GHz channels were unusable. The scheme showed anomalously high coastal values in many locations, and lacked snow screening. Pixel-by-pixel retrievals are accumulated onto separate daily ascending and descending 0.333°x0.333° lat/lon grids, then all the grids are accumulated for the month on the 2.5° grid. Because SSMIS observes at 91 GHz, while the SI expects 85 GHz data, Vila et al. (2013) developed a 91 GHz-based 85 GHz proxy channel.

Through most of the period of record the geo-IR Tb (with leo-IR Tb fill in) data are processed as part of the SG algorithm (see below). However, for the pre-DMSP epoch (January 1979 – July 1987) the leo-IR data are used as Outgoing Longwave Radiation (OLR) Precipitation Index (OPI; Xie and Arkin 1998). Colder OLR radiances are directly related to higher cloud tops, which are related to increased precipitation rates. It is necessary to define "cold" locally, so OLR and precipitation climatologies are computed and a regression relationship is developed between the anomalies in OLR and precipitation. In use, the total precipitation inferred is the estimated anomaly plus the local climatological value. A backup direct OLR-precipitation regression is used when the anomaly approach yields unphysical values. In this analysis, the precipitation climatology used to develop the OLR-derived precipitation estimates was based on the GPCP Version 2.3 satellite-gauge estimates over the time period 1988-2007. The resulting spatially and temporally varying climatological calibration is then applied to the independent OPI data covering the span 1979-1987 to fill all months lacking SSMI(SSMIS) data. The OPI data for the first two satellites (covering January 1979 through August 1981) were given additional adjustments, described in Huffman and Bolvin (2012). This adjusted OPI data provides a globally complete proxy for the SSMI(SSMIS) data.

The TOVS(AIRS) precipitation estimate is based on Susskind and Pfaendtner (1989) and Susskind et al. (1997). The TOVS(AIRS) precipitation estimates infer precipitation from deep, extensive clouds. The technique uses a multiple regression relationship between collocated rain gauge measurements and several TOVS(AIRS)-based parameters that relate to cloud volume: cloud-top pressure, fractional cloud cover, and relative humidity profile. This relationship is allowed to vary seasonally and latitudinally. Furthermore, separate relationships are developed for ocean and land. The TOVS data are used for the period August 1987 - April 2005 and are provided at the 1° spatial resolution and at the daily temporal resolution. The data covering the span up to February 1999 are based on information from two satellites. For the period after March 1999 the TOVS estimates are based on information from one satellite. Analyses of Version 2.2 revealed deficiencies in TOVS estimates starting in 2003, so AIRS data were used starting with January 2003, versus the use of TOVS into 2005 in Version 2.2. This change mandated a revision to the TOVS-AIRS intercalibration as well. Finally, in October 2016 AIRS lost its AMSU-A PMW input, and a new calibration was developed to maintain a consistent record across this boundary.

Summarizing Adler et al. (2003) and Huffman et al. (2009), during the DMSP era TOVS(AIRS) is merged in with SSMI(SSMIS) where the SSMI(SSMIS) is suspect (outside about 45°N-S) or missing (snowy/icy surfaces). Then SSMI(SSMIS) and geo-IR

are approximately time-matched to compute local coefficients to adjust the full geo-IR Geosynchronous Orbit Environmental Satellite (GOES) Precipitation Index (GPI; Arkin and Meisner 1987) to the bias of the SSMI(SSMIS) in the 40°N-S band. As well, leo-IR GPI is approximately scaled to the SSMI(SSMIS). This Adjusted GPI (AGPI) is built from geo-IR AGPI where possible and leo-IR AGPI elsewhere. The Multi-Satellite (MS) intermediate product is composed of AGPI in the band 40°N-S and the merged SSMI(SSMIS)–TOVS(AIRS) elsewhere.

During the late pre-DMSP period (January 1986 - July 1987 and December 1987), the OPI data, as calibrated by the GPCP satellite-gauge estimates for part of the DMSP period (1988-2007), are used as a proxy for the merged SSMI(SSMIS)/TOVS(AIRS) field in the AGPI procedure described for the DMSP period. During the early pre-DMSP period (January 1979 – December 1985) there is no geo-IR GPI, and therefore no AGPI. The OPI data, calibrated by the GPCP satellite-gauge estimates for the same part of the DMSP period (1988-2007), are used "as is" for the multi-satellite estimates

Throughout, the gauge analysis is used to remove large-area biases in the MS, then combined with the (debiased) MS data using optimal weighting by the inverse (estimated) error variances to form the GPCP SG combination (ESG datasets of the form GPCP-SG_L3_v2.3_YYYYM1-YYYYM2.nc). The Global Precipitation Climatology Centre (GPCC) gauge analysis was updated in Version 2.3 to the Version 7 Full Analysis through 2013, and to the Version 5 Monitoring Analysis thereafter. In Version 2.2 GPCP, the GPCC data used were the Version 6 Full through 2010 and the Version 4 Monitoring thereafter. The error variance calculation (following Huffman 1997) results in fields of estimated random error. In the CMIP5 collection the precipitation and random error are referred to as fields pr (precipitation_flux) and prStderr (precipitation_standard_error). The SG ATBD (Adler et al. 2016) is posted at https://www.ncei.noaa.gov/data/global-precipitation-climatology-project-gpcp-monthly/doc/. The GPCP version number for this series of SG is Version 2.3. A summary of the upgrades from Version 2.2 to Version 2.3 is provided in the ATBD.

For most of the period of record essentially every grid box has a value, so sampling is not typically an issue. The primary sampling issue is that the Indian Ocean sector lacked geo-IR data before July 1998. As a partial offset, we employed GPI data computed from LEO-IR data, but even in combination with the PMW data the sampling is reduced. Otherwise, the sampling inside the latitude band 40°N-S during the DMSP era is higher than the zones outside and than the entire globe in the early pre-DMSP era (1979-1985).

The Merged Precipitation research group in the NASA/GSFC Mesoscale Atmospheric Processes Laboratory works with the GPCP group at University of Maryland College Park as the GMDC for technical development and maintenance for the SG. The NASA/GSFC Collaborative REAnalysis Technical Environment (CREATE-IP) team developed the conversion routines to CMIP-standard files.

4. Validation and Uncertainty Estimate

Combinations are difficult to validate as they tend to include data that would otherwise be independent. Analysis against dense gauge data in Finland also showed reasonable

behavior for the Version 2 monthly SG, with better results in the summer than the winter (Bolvin et al. 2009). Overall, the original SG appears to have worked as expected in both the AGPI and TOVS(AIRS) data, and this continues to be true in Version 2.3. Krajewski et al. (2000) developed and applied a methodology for assessing the expected random error in a gridded precipitation field. Their estimates of expected error agreed rather closely with the errors estimated for the multi-satellite and satellite-gauge combinations.

An initial comparison between Versions 2.2 and 2.3 was developed as part of the transition to Version 2.3 and appears in Adler et al. (2017). Table 1 provides some key examples.

Table 1. Global- and tropical-average land, ocean, and total precipitation for Versions 2.2 and 2.3 in mm/d. The percentage increase of Version 2.3 over Version 2.2is given in parentheses. "Ocean" and "land" regions are defined by 100% and <100% coverage by water.

1979-2013	Global		Tropical	
	90°N-90°S		40°N-40°S	
Version	2.2	2.3	2.2	2.3
Land and Ocean	2.68	2.69 (+0.37%)	2.93	2.95 (+0.68%)
Land	2.23	2.25 (+0.90%)	2.80	2.81 (+0.36%)
Ocean	2.88	2.89 (+0.35%)	2.99	3.00 (+0.33%)

The changes from Version 2.2 to 2.3 are much smaller than for the previous version upgrades. The only additional data boundary to note is the transition from SSMI to SSMIS starting with January 2009. The total, land, coast, and ocean averages for each of the Versions are given in Table 3. See "accuracy in space/time averages" for comments on the importance of defining the masks for each surface type. Continued diagnostics following the release of Version 2.2 showed that the SSMIS estimates over ocean tended to be systematically lower than the comparable SSMI by several percent. Significant effort eventually led to revised calibrations for SSMIS that are a major reason for going to Version 2.3. In addition, the last few years of TOVS was found to be deficient, so going to Version 2.3 allowed the developers to start using AIRS estimates in 2003, and this required a revised TOVS-AIRS calibration that improved homogeneity.

It is worth mentioning that users should expect to see relatively large local excursions in precipitation from month to month. Larger time/space averages will usually be more stable, but ENSO fluctuations in the tropical Pacific can cause large variations in regional, or even basin-wide zonal averages over ocean. The 1982-1983 and 1997-1998 El Niño events are particular examples. Note well that the ENSO precipitation variations over ocean tend to cancel with variations over land, so the results are somewhat sensitive to the definition of "ocean" and "land", and the net fluctuations over the combination of land and ocean tends to be smaller than the fluctuations over each individually.

5. Considerations for Model-Observation Comparisons

Collecting the issues raised in other parts of this document:

- Note: The GPCP-SG Version 2.3 contained in this data archive is the successor to the Version 2.2 archive originally posted in Obs4MIPS. Version 2.3 uses improved inputs in the later part of the record and extends the record to more-recent years.
- There is a boundary between IR- and SSMI(SSMIS)/TOVS(AIRS)-based data at 40°N and S. Typically, discontinuities are not an issue.
- TOVS data are used outside the latitude band 40°N-S through December 2002, with AIRS data used thereafter. Compared to Version 2.2, Version 2.3 has better continuity across this data boundary. In addition, the loss of the AMSU-A sensor in October 2016 forced AIRS to depend on the IR data alone, and a calibration to the revised retrievals was developed to minimize the difference.
- Likewise, in the latitude belt 40°N-S the data source changes from SSMI to SSMIS starting January 2009. Compared to Version 2.2, 2.3 has an improved calibration for SSMIS.
- The gauge analysis shifts from the GPCC Version 7 Full Analysis to the Version 5 Monitoring Analysis in January 2014. Regions with sparse data may exhibit a discontinuity across this boundary.

As well, a few additional factors should be noted:

- Coastal zones present special challenges for retrievals due to the heterogeneity of the surface scene. In a few cases where the land/ocean contrast in precipitation is strong (such as Jamaica), the gauge values tend to bleed into the surrounding coastal waters on 2.5°x2.5° blocks related to the SG resolution.
- Orographic enhancement of precipitation is sometimes a challenge for the satellite schemes. The issue arises when the enhancement takes place (mostly) in the liquid phase, which current PMW algorithms cannot "see" over land, causing underestimation. On the other hand, in a few places the orography provokes very inefficient storms that create large amounts of ice near cloud top relative to the precipitation reaching the ground. The satellites consequently overestimate the rainfall in these cases.
- Current PMW schemes cannot make retrievals over snowy or frozen surfaces, which
 yield signals similar to frozen precipitation. The SG substitutes TOVS(AIRS)
 estimates, but these are presumed to be of lower quality. As a result, statistics over
 cold-season land situations should be examined for possible degradation by these snow
 effects.

6. Instrument Overview

The instruments contributing to the SG are drawn from a wide variety of sources. The goal of the SG dataset is to use a relatively homogeneous set of quasi-global precipitation estimates from the international constellation of precipitation-relevant satellites to create a CDR-like product with complete coverage over the chosen domain and period of record (global, 1979-present). Fig. 1 summarizes the periods of record for the various inputs:

• <u>PMW radiometers</u> in the form of selected SSMI and SSMIS conical-scan imagers that fly on the DMSP series, which feature multiple channels and dual polarization well-

suited to estimating precipitation; provide constant footprint sizes, although these sizes differ for different channels; and are processed with sensor-specific algorithms for land and ocean separately.

• IR imagers provide Tb's that are converted to GPI before transmission to the GMDC. For the period 1986-March 1998 the geo-GPI data are accumulated on a 2.5°x2.5° lat/lon grid for pentads (5-day periods). Starting with October 1996 the geo-GPI data are accumulated on a 1°x1° lat/lon grid for individual 3-hrly images. In both data sets gaps in geo-IR are filled with leo-IR data from the NOAA series of polar orbiting meteorological satellites. However, the 2.5°x2.5° data only contain the leo-IR used for fill-in, while the 1°x1° data contain the full leo-IR. The GPI product is based on the 2.5°x2.5° data for the period 1987-1996, and the 1°x1° beginning in 1997. The boundary is set at January 1997 to avoid placing the boundary during the 1997-1998 ENSO event.

In the pre-DMSP epoch leo-IR data are processed into OLR estimates of broadband outgoing longwave radiation based on an algorithm applied to the narrow-band IR channels on the Advanced Very High Resolution Radiometer (AVHRR) aboard the polar-orbiting NOAA series of satellites. Typically two satellites are available, but occasionally the OLR is based on only one satellite. Then, these OLR estimates are converted to OPI values before transmission to the GMDC.

• TOVS(AIRS) soundings are retrieved from a series of sensors. Up through December 2002, the TOVS dataset of surface and atmospheric parameters is derived from analysis of High-Resolution Infrared Sounder 2 (HIRS2) and Microwave Sounding Unit (MSU) data aboard the NOAA series of polar-orbiting operational meteorological satellites. Thereafter, the AIRS dataset of surface and atmospheric parameters is derived from analysis of data from the HIRS2 and Advanced Microwave Sounding Unit A (AMSU-A) aboard the Aqua polar-orbiting satellite. Then in October 2016 the AMSU-A failed, reducing the AIRS retrievals to IR-only schemes. In all cases the retrieved fields include land and ocean surface skin temperature, atmospheric temperature and water vapor profiles, total atmospheric ozone burden, cloud-top pressure and radiatively effective fractional cloud cover, outgoing longwave radiation and longwave cloud radiative forcing, and precipitation estimate.

The SG Version 2.2 technical document (Huffman and Bolvin 2012) provides expanded summaries for each sensor and references to relevant documentation.

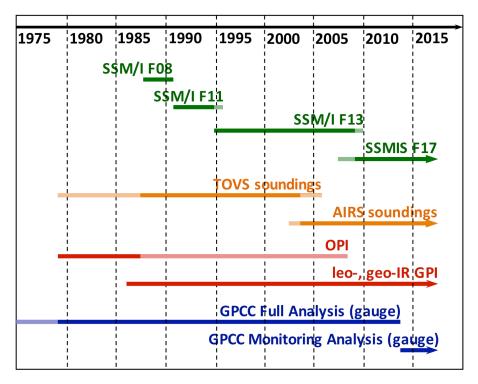


Fig. 1. Periods of record for the various data sets used in computing the SG (solid lines). Some of these sensors' periods of record extend beyond the periods of use, shown in light colors.

7. References

The International Polar Year (IPY) Data policy guidelines (http://.ipydis.org/data/citations.html) suggest a formal reference for data sets of the form

R.F. Adler, M. Sapiano, J.-J. Wang, 2016, last updated 2017: *GPCP Version* 2.3 SG Combined Precipitation Data Set. NCEI CDR Program, Asheville, NC. Data set accessed classes at cDR/Monthly Data.

As an "Acknowledgment", one possible wording is: "The Version 2.3 GPCP SG combined precipitation data were provided by the NCEI CDR Program as a contribution to the GEWEX Global Precipitation Climatology Project."

Additional details: At frequencies below about 37 GHz the radiative transfer signal in PMW sensor channels is primarily a combination of emission from the surface and then from the overlying atmosphere, including cloud and precipitation liquid water. At higher frequencies the useful signal results from scattering of the upwelling radiant energy out of the line of sight. Unfortunately, the land surface is radiometrically emissive and heterogeneous, so current-generation algorithms can only use the emission channels over ocean. The restriction to frozen hydrometeors alone over land is an issue because they only represent the upper reaches of clouds, while the liquid phase tells about precipitation nearer the surface. Thus, conical-scan radiometers, which span both radiometric regimes, provide better answers over ocean than land. This is also the basis for the issues with

retrievals over snowy/frozen surfaces and when orographic enhancement is in the liquid phase.

Data source:

- http://eagle1.umd.edu/GPCP CDR/Monthly Data
- Adler, R.F., M. Sapiano, J.-J. Wang, 2016: Climate Data Record (CDR) Program; Climate Algorithm Theoretical Basis Document (C-ATBD); Global Precipitation Climatology Project (GPCP) Monthly Analysis. CDR Program Document Number: CDRP-ATBD-0848, 32 pp. https://www.ncei.noaa.gov/data/global-precipitation-climatology-project-gpcp-monthly/doc/
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8. Revision History

- Rev 0 9/30/2012 This is a new document/dataset [G.J. Huffman]
- Rev 1 10/21/2013 Correct definition of "GEWEX", add text about variation due to ENSO, update dataset period of record, update Vila ref. [G.J. Huffman]
- Rev 2 07/01/2014 Update dataset period of record. [G.J. Huffman]
- Rev 3 09/15/2017 Upgrade from V2.2 to V2.3 [G.J. Huffman]
- Rev 4 05/10/2018 Add location of ATBD, document number [G.J. Huffman]