

Black Marble User Guide Version 1.0

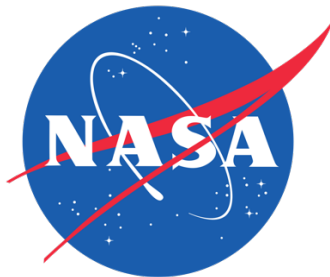
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Acryonyms

AERONET	Aerosol Robotic Network
AOD	Aerosol Optical Depth
BRDF	Bidirectional Reflectance Distribution Function
BRF	Bidirectional Reflectance Factor
DMSP	Defense Meteorological Satellite Program
DNB	Day/Night Band
EOS	Earth Observing System
GEO	Group on Earth Observations
GIS	Geographic Information System
HAM	Half-angle Mirror
HDF-EOS	Hierarchical Data Format - Earth Observing System
IR	Infrared
L1B	Level-1 B
L2G	Level-2 Gridded
LAI	Leaf Area Index
LANCE	The Land, Atmosphere Near real-time Capability for EOS
LZA	Lunar Zenith Angle
JPSS	Joint Polar Satellite System
NASA	National Aeronautics and Space Administration
NBAR	Nadir BRDF-Adjusted Reflectance
NCEP	National Centers for Environmental Prediction
NDVI	Normalized Difference Vegetation Index
NDSI	Normalized Difference Snow Index
NIR	Near-infrared
NRT	Near Real-Time
NTL	Nighttime Lights
Pgap	Gap Fraction Probability
PGE	Product Generated Executable
PRWGLP	Puerto Rico's Working Group on Light Pollution
QA	Quality Assurance
QF	Quality Flag
RTA	Rotating Telescope Assembly
SDS	Scientific Data Set
SIPS	Science Investigator-led Processing System
S-NPP	Suomi National Polar-orbiting Platform
TOA	Top of Atmosphere
UTC	Coordinated Universal Time
VCM	VIIRS Cloud Mask
VCST	VIIRS Calibration Support Team
VIIRS	Visible Infrared Imaging Radiometer Suite
VNP09	VIIRS Surface Reflectance product
VNP46	NASA's Black Marble nighttime lights product suite
VNP46A1	Daily at-sensor TOA nighttime radiance product
VNP46A2	Daily moonlight-adjusted nighttime lights product

1 Introduction

The Day/Night Band (DNB) sensor of the Visible Infrared Imaging Radiometer Suite (VIIRS), on board the Suomi-National Polar-orbiting Partnership (S-NPP) and Joint Polar Satellite System (JPSS) satellite platforms, provide global daily measurements of nocturnal visible and near-infrared (NIR) light that are suitable for Earth system science and applications studies. The VIIRS DNB's ultra-sensitivity in lowlight conditions allows for the generation of new science-quality nighttime products as result of significant improvements to sensor resolution and calibration compared to those provided previously by the Defense Meteorological Satellite Program's (DMSP) generation of nighttime lights imagery. These improvements have allowed for better monitoring of both the magnitude and signature of nighttime phenomena and anthropogenic sources of light emissions.

Since the launch of the S-NPP satellite in 2011, multiple studies have used the VIIRS DNB as the primary data source in a wide range of study topics. These include: (1) feature extraction techniques to detect severe weather impacts to urban infrastructure (Cao et al., 2013; Cole et al., 2017; Mann et al., 2016; Molthan and Jedlovec, 2013); (2) detection of sub-pixel scale features, e.g., fires (Polivka et al., 2016), shipping vessels (Asanuma et al., 2016; Elvidge et al., 2015; Straka et al., 2015), lightning flashes (Bankert et al., 2011), surface oil slicks (Hu et al., 2015), and gas flares (Elvidge et al., 2015; Liu et al., 2017, Liu et al., 2017); and (3) techniques for monitoring nighttime atmospheric optical properties, including clouds (Minnis et al., 2016; Walther et al., 2013), aerosols (Johnson et al., 2013; McHardy et al., 2015), particulate matter (Wang et al., 2016), and gravity waves in the upper atmosphere via nightglow (Miller et al., 2015).

As with early research that utilized the DMSP's Operational Line Scanner (OLS) (Huang et al., 2014), recent studies using the VIIRS DNB have employed statistical analyses and correlation discovery methods to confirm established empirical relationships with a wide range of human-linked patterns and processes. These include socioeconomic variables (Chen and Nordhaus, 2015; Chen et al., 2015; Levin and Zhang, 2017; Li et al., 2013; Ma et al., 2014; Shi et al., 2014; Yu et al., 2015), as well as changes driven by urban expansion (Guo et al., 2015; Sharma et al., 2016; Shi et al., 2014), energy use (Coscieme et al., 2014; Román and Stokes, 2015), and carbon emissions (Oda et al., 2017; Ou et al., 2015).

To realize the full potential of the VIIRS DNB time series record, NASA has developed a new suite of standard products that represent the current state-of-the-art in nighttime lights (NTL) applications, the NASA's Black Marble product suite (VNP46). NASA's Black Marble nighttime lights product, at 500m resolution, is available from January 2012-present with data from the VIIRS DNB sensor. The VNP46

product suite is being processed on a daily basis within 3-5 hours of acquisition, which enables both near real-time uses and long-term monitoring applications. The VNP46 product suite includes the daily at-sensor top of atmosphere (TOA) nighttime radiance product (VNP46A1), and the daily moonlight-adjusted nighttime lights (NTL) product (VNP46A2). The retrieval algorithm, developed and implemented for routine global processing at NASA's Land Science Investigator-led Processing System (SIPS), utilizes all high-quality, cloud-free, atmospheric-, terrain-, vegetation-, snow-, lunar-, and stray light-corrected radiance to estimate daily nighttime lights (NTL) and other intrinsic surface optical properties. The VIIRS Black Marble product has been used for global mapping of human activity patterns, such as tracking shipping and fishing vessels, gas flaring, in addition to their application to humanitarian efforts, such as assessment of conflict-associated demographic changes and mapping impoverishment.

This user guide provides an overview of NASA's new VIIRS Level 3 Black Marble nighttime lights product suite (VNP46) to users. This document describes the theoretical basis for the algorithms, the operational processing, evaluation and validation of the product, and how to access the product. Additional details can be found in related publications within section 10.

2 Algorithm

2.1 Overview of the Algorithm

NASA's operational Black Marble product suite (VNP46) ingests multiple-source input datasets and ancillary data to output the highest quality pixel-based estimates of NTL. These NTL estimates are accompanied by pixel-level quality flags. The principal features of the algorithm are summarized in the following sections. More details of the algorithm can be found in related publications in section 10.

The NASA Black Marble algorithm produces cloud-free imagery that has been corrected for atmospheric, terrain, lunar BRDF, thermal, and straylight effects. The corrected nighttime radiance, resulting in a superior retrieval of nighttime lights at short time scales and a reduction in background noise, enables quantitative detection and analyses of daily, seasonal and annual variations. Key algorithm enhancements include: (1) lunar irradiance modeling to resolve non-linear changes in phase and libration; (2) vector radiative transfer and lunar bidirectional surface anisotropic reflectance modeling to correct for atmospheric and bidirectional reflectance distribution function (BRDF) effects; (3) geometric-optical and canopy radiative transfer modeling to account for seasonal variations in NTL; and (4) temporal gap-filling to reduce persistent data gaps.

2.2 Atmospheric Correction

NASA’s Black Marble retrieval strategy combines daytime VIIRS DNB surface reflectance, BRDF, surface albedo, nadir BRDF-adjusted reflectance (NBAR), and lunar irradiance values to minimize the biases caused by extraneous artifacts in the VIIRS NTL time series record.

Using this novel “turning off the Moon” approach, illustrated in Figure 1, the surface upward radiance from artificial light emissions, L_{NTL} [units of $\text{nWatts}\cdot\text{cm}^{-2}\cdot\text{sr}^{-1}$], can be extracted from at-sensor nighttime radiance at TOA, L_{DNB} , using the following equation:

$$L_{NTL} = \left[\left(\frac{L_{DNB} - L_{path}}{T_{\uparrow}(\tau, \theta_v)} \right) (1 - a(\theta_m)\rho_a) - L_m T_{\downarrow}(\tau, \theta_v) \right] / P_{\uparrow}(\theta_v) \quad (1)$$

where L_{path} is the nighttime path radiance (*i.e.*, the radiance generated by scattering within the atmosphere), and $a(\theta_m)$ is the VIIRS-derived actual (or blue-sky) surface albedo; incorporating the directional influence of sky radiance and multiple scattering effects between the ground and the atmosphere (Román et al., 2010). For the latter, a snow albedo retrieval scheme is used if the VIIRS current day snow status flag is activated (Klein and Stroeve, 2002; Liu et al., 2017, Liu et al., 2017; Moustafa et al., 2017; Wang et al., 2012). $P_{\uparrow}(\theta_v)$ is the probability of the upward transmission of NTL emissions through the urban vegetation canopy, defined in Equation 4. The atmospheric backscatter is given by ρ_a , and $T_{\downarrow}(\tau, \theta_v)$ and $T_{\uparrow}(\tau, \theta_v)$ are the total transmittance (including direct and diffuse radiation) along the lunar-ground and ground-sensor paths, respectively. The latter two are a function of view-illumination geometry and the total atmospheric column optical depth (τ) due to mixed gases, water vapor, and aerosol particles. The retrieval uses a modified algorithm based on the VIIRS Surface Reflectance product (VNP09) to estimate the values of L_{path} , ρ_a , $T_{\downarrow}(\tau, \theta_v)$, and $T_{\uparrow}(\tau, \theta_v)$ for a given set of surface and atmospheric conditions (Roger et al., 2016; Skakun et al., 2018). Additional input datasets include the standard VIIRS Cloud Mask (VCM) (Kopp et al., 2014), atmospheric profiles obtained from the National Centers for Environmental Prediction (NCEP) model (*i.e.*, water vapor, ozone, and surface pressure) (Moorthi et al., 2001), and the VIIRS aerosol model combined with daytime-to-daytime averaged aerosol optical depth (AOD) at $0.550 \mu\text{m}$ to extrapolate the nighttime AOD.

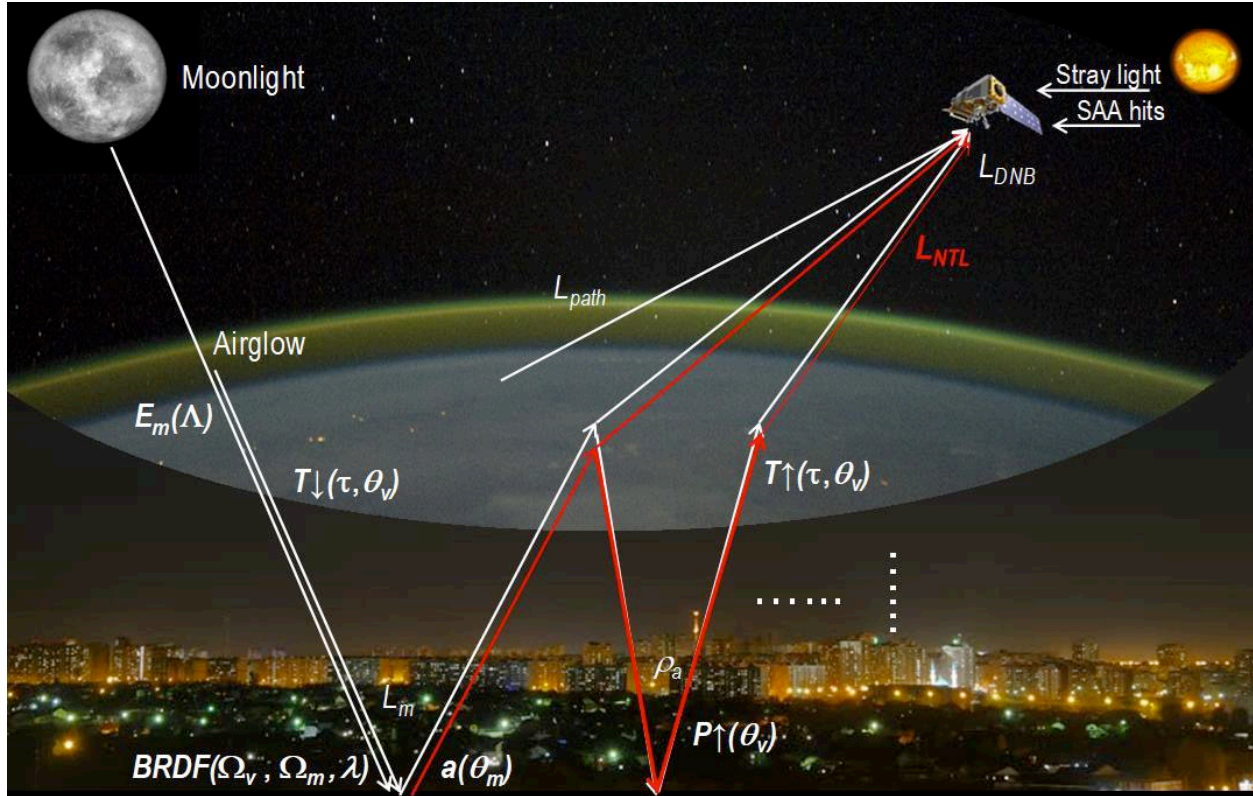


Figure 1 Overview of NASA's Black Marble retrieval strategy (*cf.*, Equation 1). During the ~50% portion of the lunar cycle when moonlight is present at the time of satellite observation, the surface upward radiance from artificial light emissions, L_{NTL} [units of $\text{nWatts} \cdot \text{cm}^{-2} \cdot \text{sr}^{-1}$], can be extracted from at-sensor nighttime radiance at TOA (L_{DNB}). L_{path} is the nighttime path radiance, $a(\theta_m)$ is the VIIRS-derived actual surface albedo. The atmospheric backscatter is given by ρ_a . $T_{\downarrow}(\tau, \theta_v)$ and $T_{\uparrow}(\tau, \theta_v)$ are the total transmittances along the lunar-ground and ground-sensor paths (respectively). $P_{\uparrow}(\theta_v)$ is the probability of the upward transmission of NTL emissions through the urban vegetation canopy.

2.3 BRDF Correction

The VNP46 algorithm estimates the actual moonlight, aerosol, and surface albedo contribution through analytical BRDF model inversion. This model has proven effective in removing biases introduced by extraneous sources of nighttime lights emissions.

The surface BRDF, or reflectance anisotropy is governed by the angle and intensity of illumination – whether that illumination be solar or lunar or from airglow – and by the structural complexity of the surface, resulting in variations in brightly illuminated regions and highly shadowed areas. The semi-empirical RossThick-LiSparse Reciprocal (RTLSR, or Ross-Li) BRDF model (Román et al., 2010; Roujean et al., 1992; Schaaf et al., 2002, Schaaf et al., 2011; Strahler et al., 1999) is advantageous in this regard, since (1) it is the most likely kernel-driven combination to capture the wide range of conditions affecting the VIIRS DNB on a global basis; (2) it allows robust analytical model inversion

with a pixel-specific estimate of uncertainty in the model parameters and linear combinations thereof (Lucht and Roujean, 2000); and (3) the scheme is flexible enough that other kernels can be easily adopted should any become available, and be shown to be superior for a particular scenario.

For VIIRS DNB acquisitions over snow-free and snow-covered surfaces, we define the spectral radiance contribution from moonlight, L_m ,

$$L_m(\Omega_v, \Omega_m, \Lambda) = \frac{E_m(\Lambda)}{\pi} \mathbf{BRF}(\Omega_v, \Omega_m, \Lambda) \cos(\Theta_m) \quad (2)$$

in terms of the Ross-Li model:

$$\mathbf{BRDF}(\Omega_v, \Omega_m, \Lambda) \approx \frac{\mathbf{BRF}(\Omega_v, \Omega_m, \Lambda)}{\pi} = f_{iso}(\Lambda) + f_{vol}(\Lambda) K_{vol}(\Omega_v, \Omega_m) + f_{geo}(\Lambda) K_{geo}(\Omega_v, \Omega_m) \quad (3)$$

Here, we define the wavelength for the narrowband instrument of interest as the weighted center, Λ , of the VIIRS DNB spectral band [0.5–0.9 μm]. Parameter $f_{iso}(\Lambda)$ is the isotropic scattering component and equal to the bidirectional reflectance for a pixel viewing zenith angle $\theta_v = 0$ and a lunar zenith angle $\theta_m = 0$. Parameter $f_{geo}(\Lambda)$ is the coefficient of the LiSparse-reciprocal geometric scattering kernel K_{geo} , derived for a sparse ensemble of surface casting shadows on a Lambertian background (Li and Strahler, 1992). Parameter $f_{vol}(\Lambda)$ is the coefficient for the RossThick volume scattering kernel K_{vol} , so called for its assumption of a dense leaf canopy (Ross, 2012).

To achieve a high-quality BRDF retrieval, the NASA Black Marble algorithm collects all available daytime, atmospherically-corrected, VIIRS DNB bidirectional reflectance factor (BRF) over a multi-date period (normally 16-days) to establish the analytical solution for the Ross-Li BRDF model parameter values, $f_k(\Lambda)$. Note that during moon-free nights, when atmospheric air glow is the dominant emission source, the VNP46 algorithm sets the illumination geometry to near-nadir ($\theta_m = 10^\circ$) and the lunar irradiance to $E_m(\Lambda) = 0.26 \text{ nW} \cdot \text{m}^{-2}$ (Liao et al., 2013). This enables a BRDF correction even in the absence of moonlight.

2.3 Seasonal Vegetation Correction

Another known source of uncertainty in the retrieval of satellite-derived NTL is the influence of canopy-level foliage within the ground-to-sensor geometry path (Román and Stokes, 2015). This effect, which has been shown to reduce the magnitude of NTL at city-wide scales (Levin, 2017; Levin and Zhang, 2017), is most pronounced in temperate urban regions; where mixed and deciduous vegetation are most pervasive. Given its seasonal dependence, this occlusion effect (obscuration of surface light by foliage) should be proportional in magnitude to the density and vertical distribution pattern of leaves within a given VIIRS DNB pixel. Hence, while the effect may be non-linear (due to the confluence of factors that

control the seasonality, physiognomy, and vertical distribution of urban vegetation canopies), the effect can be parameterized using analytical models which aim to retrieve canopy structure parameters from multi-angle remote sensing data (Chopping, 2006). With this concept in mind, we are employing a vegetation dispersion parameter, known as the clumping index, ψ , to parameterize the confined distribution of foliage within distinct canopy structures (Chen et al., 2005; Chen and Black, 1991; Jiao et al., 2018; Leblanc et al., 2005; Nilson, 1971):

$$P_{\uparrow}(\theta_v) = e^{-\psi G(\theta_v) LAI} / \cos(\theta_v) \quad (4)$$

Here, $P_{\uparrow}(\theta_v)$ is the probability of the upward transmission of NTL emissions through the urban vegetation canopy (known as the gap fraction probability and hereafter termed the P_{gap} equation), $G(\theta_v)$ is the extinction coefficient that expresses the mean area projection of plant elements in the direction θ_v (being 0.5 for canopies with a random distribution of leaf angles), and LAI is the Leaf Area Index.

The P_{gap} equation can be inverted from available daily VIIRS BRDF-derived clumping index values, as done in Hill et al. (2011) and He et al. (2012). The VIIRS LAI retrievals are based on the current standard product (VNP15) (Park et al., 2017). In the case of poor-quality or missing LAI values (e.g., when LAI is not retrieved over dense urban areas), we are employing the VIIRS LAI backup algorithm by using a look-up table (LUT) (Knyazikhin et al., 1999; Xiao et al., 2016) with normalized difference vegetation index (NDVI) generated from high quality retrievals from the VIIRS NBAR product (Shuai et al., 2013).

3 Data Product Formats

The NASA's Black Marble product suite includes the daily at-sensor TOA nighttime radiance (VNP46A1) and the daily moonlight and atmosphere corrected NTL (VNP46A2) products at a 500 m geographic linear latitude/longitude (lat/lon) grid. The data are provided in the standard land hierarchical data format - Earth observing system (HDF-EOS) format.

3.1 Metadata

Metadata (data attributes) provide information about the time of data acquisition, input products, geographic location, output of the data product, satellite instrument, processing environment, and other aspects of the product. More details of the VNP46A1 and VNP46A2 product metadata are listed in Appendix A and B.

3.2 Filenames

The filenames follow a naming convention which gives useful information regarding the specific product. For example, the filename VNP46A1.A2015001.h08v05.001.2017012234657.h5 indicates:

- (1) VNP46A1: Product Short Name;
- (2) A2015001: Julian Date of Acquisition (A-YYYYDDD);
- (3) h08v05: Tile Identifier (horizontalXXverticalYY);
- (4) .001: Collection Version;
- (5) .2017012234657: Julian Date of Production (YYYYDDDDHHMMSS);
- (6) .h5: Data Format (HDF5).

3.3 Projection

The NASA's Black Marble product suite (VNP46) employs the standard VIIRS science algorithms and software that produce the DNB standard (radiance-based) products, and their corresponding ancillary layers in gridded (Level 2G, Level 3) linear lat/lon format (Figure 2). The gridding algorithms were modified to work with the VIIRS DNB unique viewing geometry, which, unlike the VIIRS moderate and imagery bands, has a ground pixel footprint at a nearly constant size (742 m). The rationale behind the VIIRS DNB gridding approach is to select the nighttime observations from available 6-min swath granules (2366 km along track, ~3100 km across-track), that are the least affected by cloud cover and off-nadir viewing observations. The goal is to increase signal-to-noise, while maximizing coverage within a cell of the gridded projection (Tan et al., 2006; Wolfe et al., 2002). By implementing this combined gridding strategy and geographic linear lat/lon projection formats, we seek to improve the efficiency of processing and reprocessing the VNP46 product suite, preserve the satellite location and observation footprints, while also enabling the ingest of the products into accessible software for geographic information system (GIS)-friendly analysis and mapping.

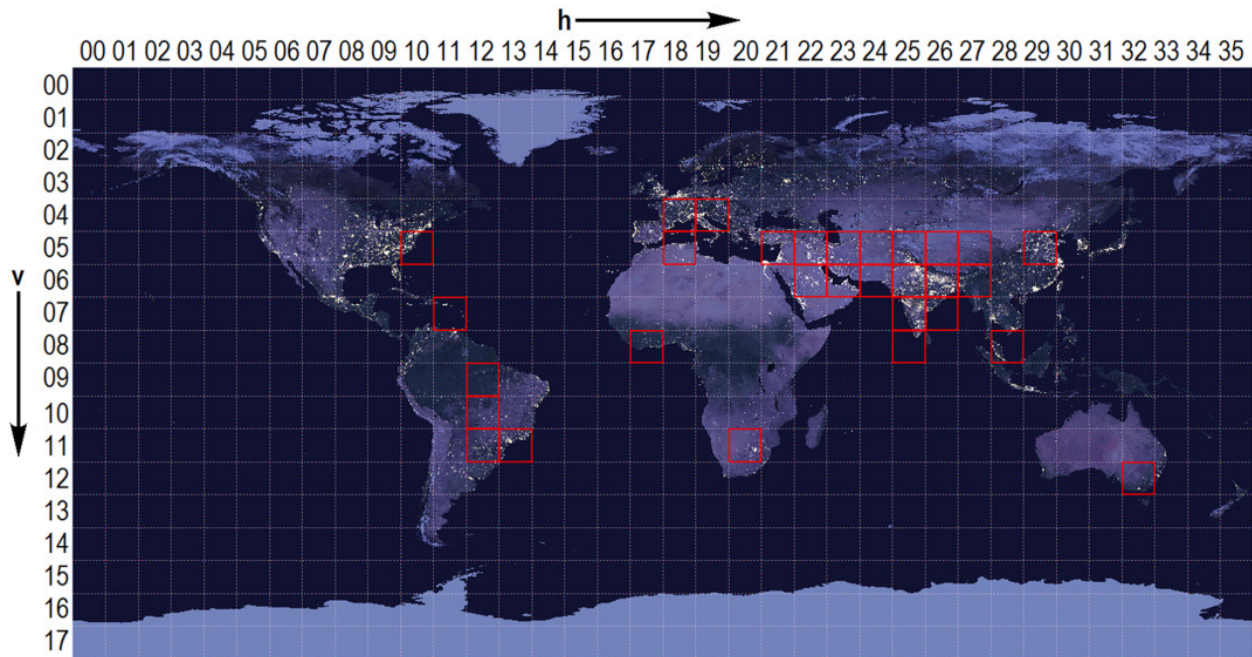


Figure 2 The Suomi-NPP VIIRS linear latitude/longitude (or geographic) grid consists of 460 non-overlapping Land tiles which measure approximately $10^{\circ} \times 10^{\circ}$ region. 30 VIIRS tiles (highlighted in red) were used to conduct the benchmark tests presented in NASA's Black Marble Nighttime Lights Product Suite ATBD.

4. Product generation

Data product inputs to the NASA Black Marble (VNP46) algorithm are listed in Table 1 and Table 2. The algorithm processing flow is depicted in Figure 3. The algorithm processing cycle is divided into daytime and nighttime branches, and each processing branch produces a unique set of ancillary and quality assurance (QA) flags.

Table 1 Black Marble VNP46A1 product input files

Input File	Description
VNP02DNB	VIIRS/NPP Day/Night Band 6-Min L1B Swath 750m (L1B DNB)
VNP02MOD	VIIRS/NPP Moderate Resolution 6-Min L1B Swath 750m (L1B moderate bands)
NPP DNB [*]	VIIRS L2G DNB radiance
NPP DNB angles [*]	VIIRS L2G DNB angles
NPP MOD [*]	VIIRS L2G moderate bands M10, M11, M12, M13, M15, M16
NPP PTDN [*]	VIIRS DNB pointer files
The standard VIIRS Cloud Mask (VCM)	VIIRS cloud mask

^{*}IP products.

Table 2 Black Marble VNP46A2 product input files

Input file	Description
VNP46A1	VIIRS/NPP Daily Gridded Day Night Band 500m Linear Lat Lon Grid Night
VNP43LGDNBA1	VIIRS/NPP DNB BRDF/Albedo Model Parameters Daily L3 Global 500m LLL Grid
VNPLG09GA	VIIRS/NPP Surface Reflectance Daily L2G Global 1km and 500m Linear Lat Lon Grid
VNP04LGA	VIIRS/NPP Aerosols Optical Thickness Daily L2G Global Linear Lat Lon Grid

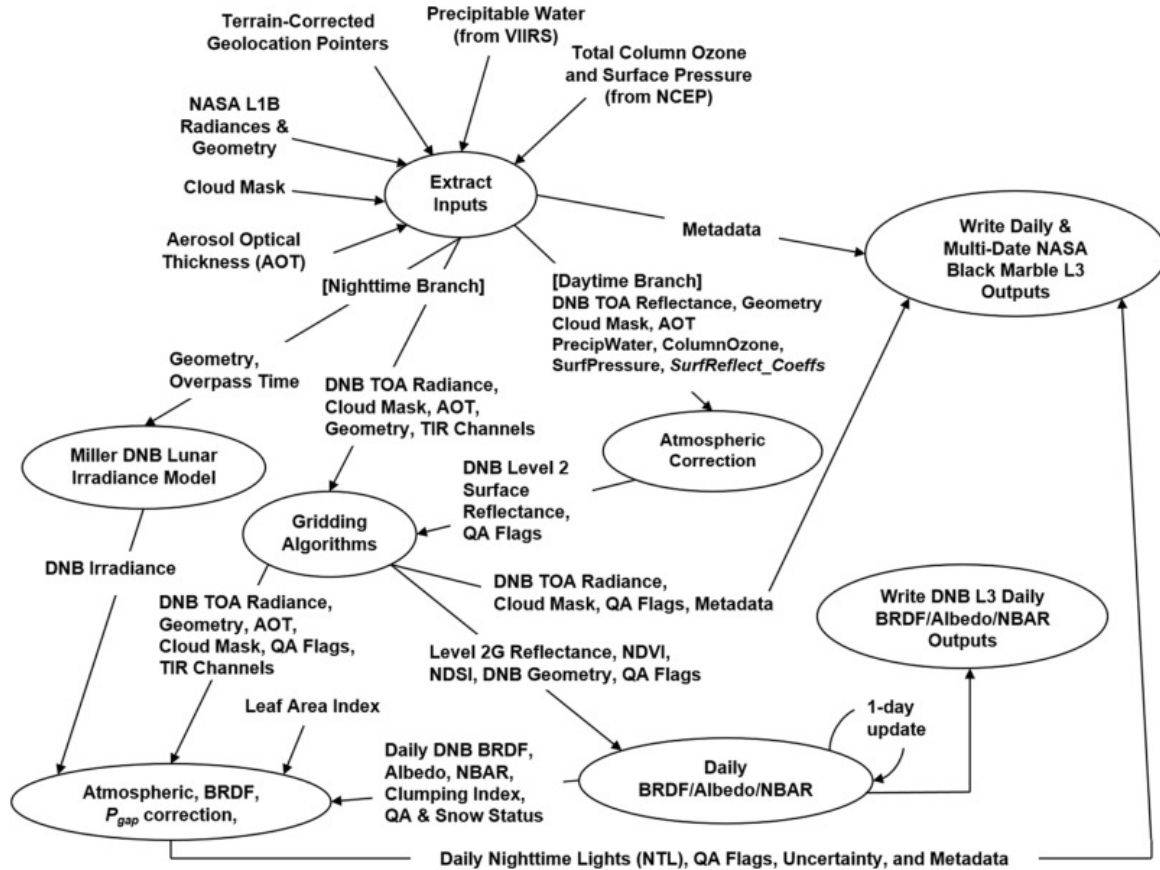


Figure 3 Algorithm processing cycle and ancillary parameters used by NASA’s Black Marble product suite (VNP46).

For the daytime branch, science product generated executables (PGEs) based on the standard suite of VIIRS land products are integrated as part of NASA's Black Marble processing chain. First, a modified version of the operational VIIRS surface reflectance algorithm (Roger et al., 2016; Vermote et al., 2014) is used to generate the DNB surface bidirectional reflectance factor (BRF) using NASA's Level 1B calibrated radiance product as input (i.e., 6-minute granules, or 2366 km along track and ~3100 km across-track). Level 2G DNB surface reflectance is then generated by performing spatial and temporal

aggregation to 500 m grid cells over daily time periods (Campagnolo et al., 2016; Pahlevan et al., 2017; Wolfe et al., 1998; Yang and Wolfe, 2001). Daily Level 3 DNB BRDF/Albedo data are then retrieved using the heritage MODIS/VIIRS algorithm (MCD43/VNP43) (Liu et al., 2017, Liu et al., 2017; Wang et al., 2018), and corresponding snow flags are estimated using the VIIRS Normalized Difference Snow Index (NDSI) algorithm (VNP10) (Riggs et al., 2016, Riggs et al., 2017). The NDVI and NDSI values are used to determine the growing, dormant, and snow periods to routinely update the a priori global database of the DNB BRDF product (Cescatti et al., 2012; Liu et al., 2017, Liu et al., 2017; Román et al., 2009). Surface BRDF from the VIIRS I1 (red) and I2 (NIR) channels is used to obtain daily estimates of LAI (Knyazikhin et al., 1999; Park et al., 2017; Xiao et al., 2016). The retrieved LAI and clumping index values are then used to calculate the gap fraction probability (P_{gap}).

The nighttime branch describes the path followed to generate the final VNP46 products. We begin with the at-sensor TOA nighttime radiance (VNP46A1), along with the corresponding nighttime cloud mask, multiple solar/viewing/lunar geometry values (including moon-illuminated fraction and phase angles), and the daily snow and aerosol status flags. These science data sets (SDS) enable open access to the primary inputs used to generate the NASA Black Marble NTL time series record, thus ensuring reproducibility of the final outputs. A series of temporal and spatial gap-filling techniques are also employed to improve the coverage of the VNP46 NTL product.

5 Scientific Data Sets (SDSs) from VNP46 Product Suite

5.1 The VNP46A1 Daily At-sensor TOA Nighttime Radiance Product

The daily at-sensor TOA nighttime radiance product (VNP46A1) is available at 500 m resolution from January 2012 onward. The 500m VNP46A1 product contains 26 SDS layers (Table 3) including sensor radiance, zenith and azimuth angles at sensor, solar, and lunar, cloud mask flag, time, shortwave IR radiance, brightness temperatures, VIIRS quality flags, moon phase angle, and moon illumination fraction. Contents of VNP46A1 product are given in List 1. Table 3 presents detailed information on the layers. Table 4 and Table 5 present the details of the flag description keys and quality flags (QF) of the VNP46A1 product.

List 1 Datasets in a sample of VNP46A1 product.

- ~ 📁 HDFEOS
 - ~ 📁 ADDITIONAL
 - 📁 FILE_ATTRIBUTES
 - ~ 📁 GRIDS
 - ~ 📁 VNP_Grid_DNB
 - ~ 📁 Data Fields
 - 🌐 BrightnessTemperature_M12
 - 🌐 BrightnessTemperature_M13
 - 🌐 BrightnessTemperature_M15
 - 🌐 BrightnessTemperature_M16
 - 🌐 DNB_At_Sensor_Radiance_500m
 - 🌐 Glint_Angle
 - 🌐 Granule
 - 🌐 Lunar_Azimuth
 - 🌐 Lunar_Zenith
 - 🌐 Moon_Illumination_Fraction
 - 🌐 Moon_Phase_Angle
 - 🌐 QF_Cloud_Mask
 - 🌐 QF_DNB
 - 🌐 QF_VIIRS_M10
 - 🌐 QF_VIIRS_M11
 - 🌐 QF_VIIRS_M12
 - 🌐 QF_VIIRS_M13
 - 🌐 QF_VIIRS_M15
 - 🌐 QF_VIIRS_M16
 - 🌐 Radiance_M10
 - 🌐 Radiance_M11
 - 🌐 Sensor_Azimuth
 - 🌐 Sensor_Zenith
 - 🌐 Solar_Azimuth
 - 🌐 Solar_Zenith
 - 🌐 UTC_Time
 - ~ 📁 HDFEOS INFORMATION
 - 📄 StructMetadata.0

Table 3 Scientific datasets included in the VNP46A1 daily at-sensor TOA nighttime radiance product.

Scientific Datasets (SDS HDF Layers)	Units	Description	Bit Types	Fill Value	Valid Range	Scale Factor	Offset
DNB_At_Sensor_Radiance_500m	$\text{nW}\cdot\text{cm}^{-2}\cdot\text{sr}^{-1}$	At-sensor DNB radiance	16-bit unsigned integer	65535 ¹	0 - 65534	0.1	0.0
Sensor_Zenith	Degrees	Sensor zenith angle	16-bit signed integer	-32768	-9000 - 9000	0.01	0.0
Sensor_Azimuth	Degrees	Sensor azimuth angle	16-bit signed integer	-32768	-18000 - 18000	0.01	0.0
Solar_Zenith	Degrees	Solar zenith angle	16-bit signed integer	-32768	0 - 18000	0.01	0.0
Solar_azimuth	Degrees	Solar azimuth angle	16-bit signed integer	-32768	-18000 - 18000	0.01	0.0
Lunar_Zenith	Degrees	Lunar zenith angle	16-bit signed integer	-32768	0 - 18000	0.01	0.0
Lunar_Azimuth	Degrees	Lunar azimuth angle	16-bit signed integer	-32768	-18000 - 18000	0.01	0.0
Glint_Angle	Degrees	Moon glint angle	16-bit signed integer	-32768	-18000 - 18000	0.01	0.0
UTC_Time	Decimal hours	UTC time	32-bit floating point	-999.9	0 - 24	1.0	0.0
QF_Cloud_Mask ²	Unitless	Cloud mask status	16-bit unsigned integer	65535	0 - 65534	N/A	N/A
QF_DNB ³	Unitless	DNB quality flag	16-bit unsigned integer	65535	0 - 65534	N/A	N/A
Radiance_M10	$\text{W}\cdot\text{m}^{-2}\cdot\mu\text{m}^{-1}\cdot\text{sr}^{-1}$	Radiance in band M10	16-bit unsigned integer	65535	0 - 65534	0.0013	-0.04
Radiance_M11	$\text{W}\cdot\text{m}^{-2}\cdot\mu\text{m}^{-1}\cdot\text{sr}^{-1}$	Radiance in band M11	16-bit unsigned integer	65535	0 - 65534	0.00058	-0.02
BrightnessTemperature_M12	Kelvins	Brightness temperature of band M12	16-bit unsigned integer	65535	0 - 65534	0.0025	203.0
BrightnessTemperature_M13	Kelvins	Brightness temperature of	16-bit unsigned	65535	0 - 65534	0.0025	203.0

		band M13	integer				
BrightnessTemperature_M15	Kelvins	Brightness temperature of band M15	16-bit unsigned integer	65535	0 - 65534	0.0041	111.0
BrightnessTemperature_M16	Kelvins	Brightness temperature of band M16	16-bit unsigned integer	65535	0 - 65534	0.0043	103.0
QF_VIIRS_M10 ⁴	Unitless	Quality flag of band M10	16-bit unsigned integer	65535	0 - 65534	N/A	N/A
QF_VIIRS_M11 ⁴	Unitless	Quality flag of band M11	16-bit unsigned integer	65535	0 - 65534	N/A	N/A
QF_VIIRS_M12 ⁴	Unitless	Quality flag of band M12	16-bit unsigned integer	65535	0 - 65534	N/A	N/A
QF_VIIRS_M13 ⁴	Unitless	Quality flag of band M13	16-bit unsigned integer	65535	0 - 65534	N/A	N/A
QF_VIIRS_M15 ⁴	Unitless	Quality flag of band M15	16-bit unsigned integer	65535	0 - 65534	N/A	N/A
QF_VIIRS_M16 ⁴	Unitless	Quality flag of band M16	16-bit unsigned integer	65535	0 - 65534	N/A	N/A
Moon_Phase_Angle	Degrees	Moon phase angle	16-bit signed integer	-32768	0 – 18000	0.01	0.0
Moon_Illumination_Fraction	Percentage	Moon illumination fraction	16-bit signed integer	-32768	0 – 10000	0.01	0.0
Granule	Unitless	Number of selected Granule	8-bit unsigned integer	255	0 - 254	1.0	0.0

¹ Note that fill value can arise from various scenarios such as bad quality data or if the solar zenith angle < 108 degrees since that is the nighttime cut-off used in the code. ² Details of QF_Cloud_Mask are shown in Table 4. ³ The scale and offset are for nighttime. Users should check the quality flags and metadata for specific values. ⁴ Details of QF_DNB and QF of VIIRS band M10/11/12/13/15/16 are shown in Table 5.

Table 4 Value of QF_Cloud_Mask in the VNP46A1 product.

Bit	Flag description key	Interpretation
0	Day/Night	0 = Night 1 = Day
1-3	Land/Water Background	000 = Land & Desert 001 = Land no Desert 010 = Inland Water 011 = Sea Water 101 = Coastal
4-5	Cloud Mask Quality	00 = Poor 01 = Low 10 = Medium 11 = High
6-7	Cloud Detection Results & Confidence Indicator	00 = Confident Clear 01 = Probably Clear 10 = Probably Cloudy 11 = Confident Cloudy
8	Shadow Detected	1 = Yes 0 = No
9	Cirrus Detection (IR) (BTM15 – BTM16)	1 = Cloud 0 = No Cloud
10	Snow/ Ice Surface	1 = Snow/Ice 0 = No Snow/Ice

Table 5 Value of QF_DNB and QF of VIIRS band M10/11/12/13/15/16 in the VNP46A1 product.

SDS Layer	Flag Mask Values and Descriptions
QF_DNB	1 = Substitute_Cal 2 = Out_of_Range 4 = Saturation 8 = Temp_not_Nominal 16 = Stray_light 256 = Bowtie_Deleted/Range_bit 512 = Missing_EV 1024 = Cal_Fail 2048 = Dead_Detector

QF_VIIRS_M10	1	= Substitute_Cal
QF_VIIRS_M11	2	= Out_of_Range
QF_VIIRS_M12	4	= Saturation
QF_VIIRS_M13	8	= Temp_not_Nominal
QF_VIIRS_M15	256	= Bowtie_Deleted
QF_VIIRS_M16	512	= Missing_EV
	1024	= Cal_Fail
	2048	= Dead_Detector

5.2 The VNP46A2 Daily Moonlight-adjusted Nighttime Lights (NTL) Product

The daily moonlight and atmosphere corrected NTL (VNP46A2) is available at 500 m resolution from January 2012-present. The VNP46A2 product has 6 layers containing information on BRDF-corrected NTL (500m), lunar irradiance, mandatory quality flag, latest high-quality retrieval (number of days), snow flag, and cloud mask flag. Contents of VNP46A2 product are given in List 2. The detailed VNP46A2 layer properties are described in Table 6. Table 7 and Table 8 present the details of quality flags (QF) for the VNP46A2 product.

List 2 Datasets in a sample of VNP46A2 product

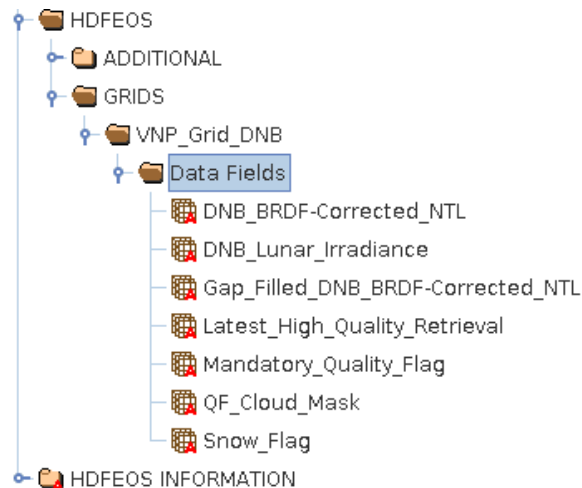


Table 6 Scientific datasets included in VNP46A2 daily moonlight-adjusted NTL product.

Scientific Data Sets (SDS HDF Layers)	Units	Description	Bit Types	Fill Value	Valid Range	Scale Factor	Offset
DNB_BRDF-Corrected_NTL	$\text{nWatts}\cdot\text{cm}^{-2}\cdot\text{sr}^{-1}$	BRDF corrected DNB NTL	16-bit unsigned	65,535	0 – 65,534	0.1	0.0

			integer				
Gap_Filled_DNB_BRDF-Corrected_NTL	nWatts·cm ⁻² ·sr ⁻¹	Gap Filled BRDF corrected DNB NTL	16-bit unsigned integer	65,535	0 – 65,534	0.1	0.0
DNB_Lunar_Irradiance	nWatts·cm ⁻²	DNB Lunar Irradiance	16-bit unsigned integer	65,535	0 – 65,534	0.1	0.0
Mandatory_Quality_Flag ¹	Unitless	Mandatory quality flag	8-bit unsigned integer	255	0 – 3	N/A	N/A
Latest_High_Quality_Retrieval	Number of days	Latest high quality BRDF corrected DNB radiance retrieval	8-bit unsigned integer	255	0 – 254	1.0	0.0
Snow_Flag ²	Unitless	Flag for snow cover	8-bit unsigned integer	255	0 – 1	N/A	N/A
QF_Cloud_Mask ³	Unitless	Quality flag for cloud mask	16-bit unsigned integer	65,535	0 – 65,534	N/A	N/A

¹ Details of Mandatory_Quality_Flag are shown in Table 7. ² Details of Snow_Flag are shown in Table 8. ³ Details of QF_Cloud_Mask are shown in Table 4.

Table 7 Values of the Mandatory_Quality_Flag in VNP46A2 product.

Value	Retrieval quality	Algorithm instance
00	High-quality	Main algorithm (Persistent nighttime lights)
01	High-quality	Main algorithm (Ephemeral Nighttime Lights)
02	Poor-quality	Main algorithm (Outlier, potential cloud contamination or other issues)
255	No retrieval	Fill value

Table 8 Values of the Snow_Flag in VNP46A2 product.

Flag description key	Value	Interpretation
Snow/ Ice Surface	00	No Snow/Ice
	01	Snow/Ice
	255	Fill value

5.3 Examples of the VNP46 Product Suite

The VNP46 product suite will be made available both retrospectively, via NASA’s Level 1 and Atmosphere Archive and Distribution System Distributed Active Archive Center (LAADS-DAAC), and in forward near real-time (NRT) data streams, via NASA’s Land, Atmosphere Near Real-time Capability for EOS (LANCE) with a latency of about three hours. The NRT data are mainly used in response to disasters and other management applications which require low latency data access.

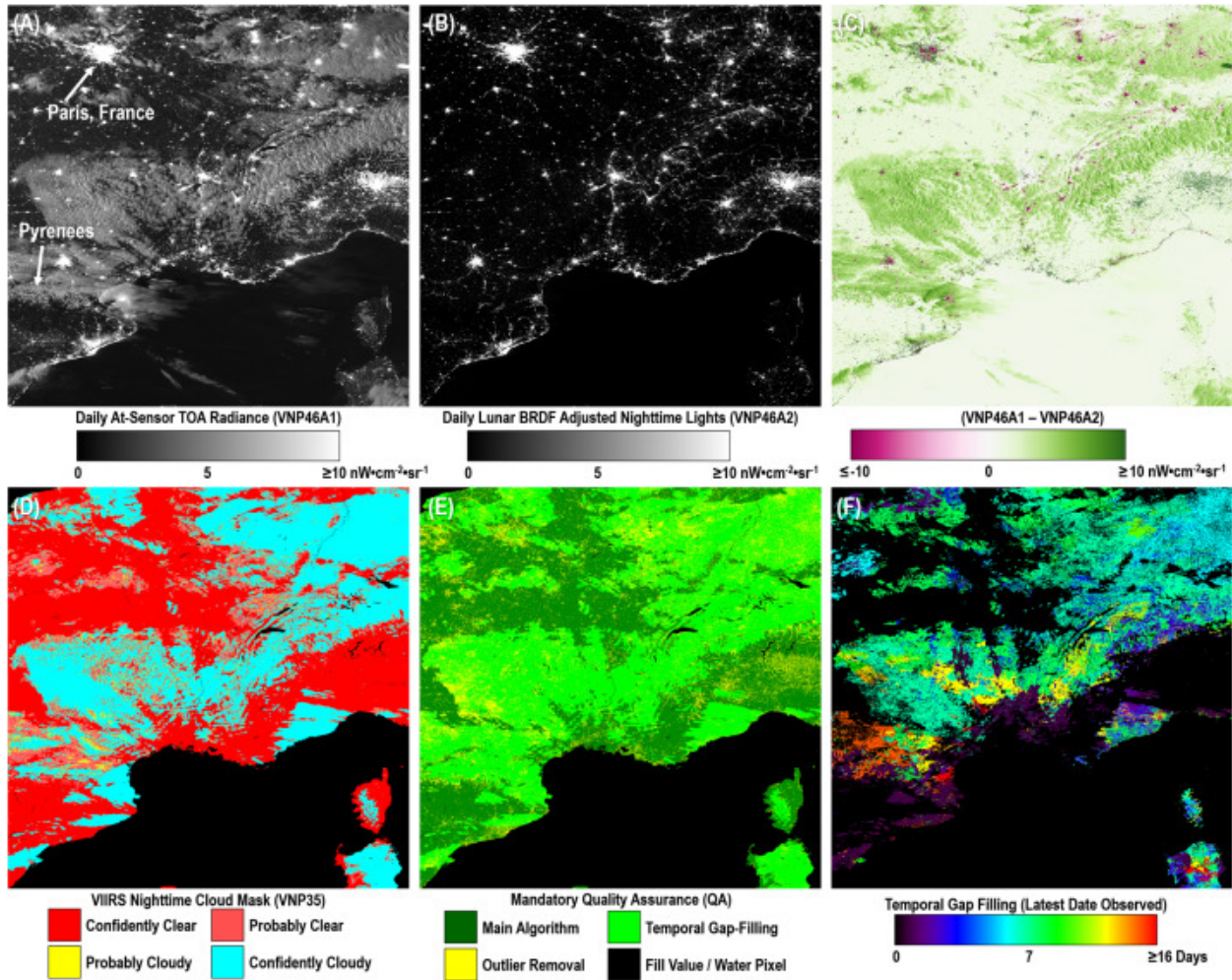


Figure 4 VNP46 product suite components for a $10^{\circ} \times 10^{\circ}$ Level 3 tile over France and the Balearic Sea region (h18v04; DOY 2015-091). The full-moon-illuminated and 51% cloud-contaminated scene illustrates the challenges of nighttime cloud masking over snow-covered surfaces (e.g., the French Alps and the Pyrenees).

Figure 4 and Figure 5 illustrate the key processing steps used to retrieve high-quality NTL as part of NASA's Black Marble product suite. Cloud-free, atmospheric-, seasonal-, and moonlight BRDF-corrected DNB nighttime radiance is produced using the nighttime DNB-at-sensor radiance (VNP46A1), nighttime cloud mask, aerosol optical depth values, snow status flag, Ross-Li DNB BRDF model parameters and

albedo values, Pgap, and per-pixel estimates of DNB lunar irradiance and corresponding geometries. A mandatory quality assurance (QA) flag is then provided to establish the pixel-specific estimates of retrieval performance. Note that when the temporal gap-filling routine is called upon, as reported in the mandatory quality assurance (QA) Flags (Table 7), the latest high-quality date observed (based on retrievals using the main algorithm) is reported as a separate SDS layer. If an outlier is still detected after temporal gap-filling, then the VNP46 algorithm defaults to a monthly climatology, based on the most recently available moonless high QA values. Thus, through judicious use of the VNP46 product quality flag, the end-user can establish whether a particular temporally gap-filled NTL value is based on a recent date or not. This results in a traceable, moonlight-adjusted, NTL product to assess current versus recent NTL conditions, while reducing persistent data gaps caused by nighttime clouds, snow, and other ephemeral artifacts (e.g., the Aurora Borealis - cf., Figure 5).

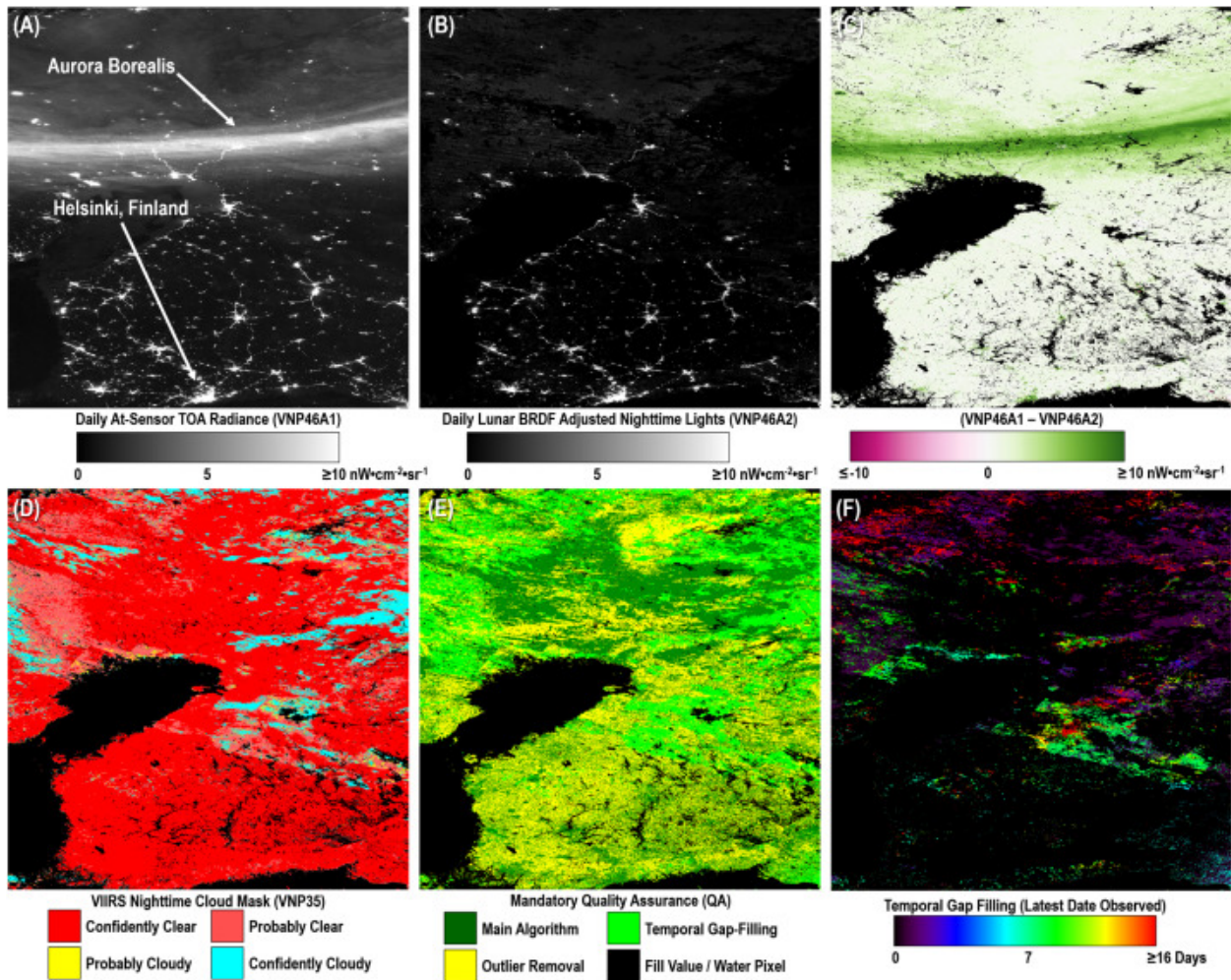


Figure 5 VNP46 product suite components for a $10^\circ \times 10^\circ$ Level 3 tile over Sweden and Finland (h20v02; DOY 2013-080). The half-moon-illuminated and 30% cloud-contaminated scene is shown to capture extraneous light emissions north of the Gulf of Bothnia caused by the Aurora Borealis.

6 Evaluation and Validation of the Product

The overarching goal of NASA's Black Marble science product development effort is to achieve a “breakthrough” performance specification (cf., Table 9) by conducting the following: (1) long-term stability monitoring of the entire VNP46 algorithm processing chain, including the fundamental (Level 1B) VIIRS DNB time series record, terrain-corrected geolocation, stray light correction, and calibration LUTs; and (2) global quality assessment, uncertainty quantification, and product validation. To assess progress, we have developed a series of benchmark tests to quantify product performance at representative spatial and temporal scales. This comprehensive suite of benchmark tests and assessment metrics are meant to ensure that variations in VNP46 product performance can be identified quickly, so that improvements can be implemented in a timely fashion. It also enables the end-user to consider the products in their appropriate context, e.g., by anticipating appropriate noise reduction levels under specific retrieval conditions.

Table 9 Key performance metrics established for NASA's Black Marble product suite.

Key performance metrics	Threshold	Breakthrough	Goal
NTL detection limit (L _{min})	3.0 nW·cm ⁻² ·sr ⁻¹	0.5 nW·cm ⁻² ·sr ⁻¹	0.25 nW·cm ⁻² ·sr ⁻¹
NTL robustness (L ₀)	±3.0 nW·cm ⁻² ·sr ⁻¹	± 0.10 nW·cm ⁻² ·sr ⁻¹	± 0.05 nW·cm ⁻² ·sr ⁻¹
Stray light error	0.45 nW·cm ⁻² ·sr ⁻¹	0.25 nW·cm ⁻² ·sr ⁻¹	< 0.1 nW·cm ⁻² ·sr ⁻¹
Spatial resolution	742m (±5%)	500m (±5%)	≤200m (±5%)
Temporal resolution	Monthly	Daily	Hourly
Geolocation uncertainty	133m	50m	20m

A series of benchmark tests were designed to quantify errors inherited from the upstream products (i.e., VIIRS calibrated radiance, cloud mask, aerosol retrieval, etc.), provided a relative assessment of NTL product performance. The initial validation results are presented together with example case studies can be found in related publications in section 10. To establish the absolute accuracy of the final NTL retrievals, one must also assess the NTL products against an independent source of reference data. Unfortunately, quality-assessed in-situ NTL measurements are not widely available; let alone, at the spatial and temporal densities necessary to capture the full range of retrieval conditions. Recent NASA Black Marble product validation efforts have therefore focused on developing guidelines for accuracy assessment of NTL products through a number of international initiatives.

Figure 6 shows an example of the accuracy assessment of NTL products through a field experiment at the Pitahaya farmland site in Cabo Rojo, PR. During the night of 2 March 2017, at 02:00 local time, the Puerto Rico's Working Group on Light Pollution (PRWGLP) team conducted a validation experiment at

the Pitahaya site. A stable point source was reflected by a 30 m² Lambertian target to generate an in-band DNB radiance at sensor of $\sim 0.45 \text{ nW} \cdot \text{cm}^{-2} \cdot \text{sr}^{-1}$. Additional Sky-Quality Meter instrument data recordings (Falchi et al., 2016; Kyba et al., 2011, Kyba et al., 2013; Schnitt et al., 2013) with specialized filters matching the VIIRS relative spectral response, as well as atmospheric measurements from nearby Aerosol Robotic Network (AERONET) sun photometers (Holben et al., 1998) were used to characterize atmospheric conditions.

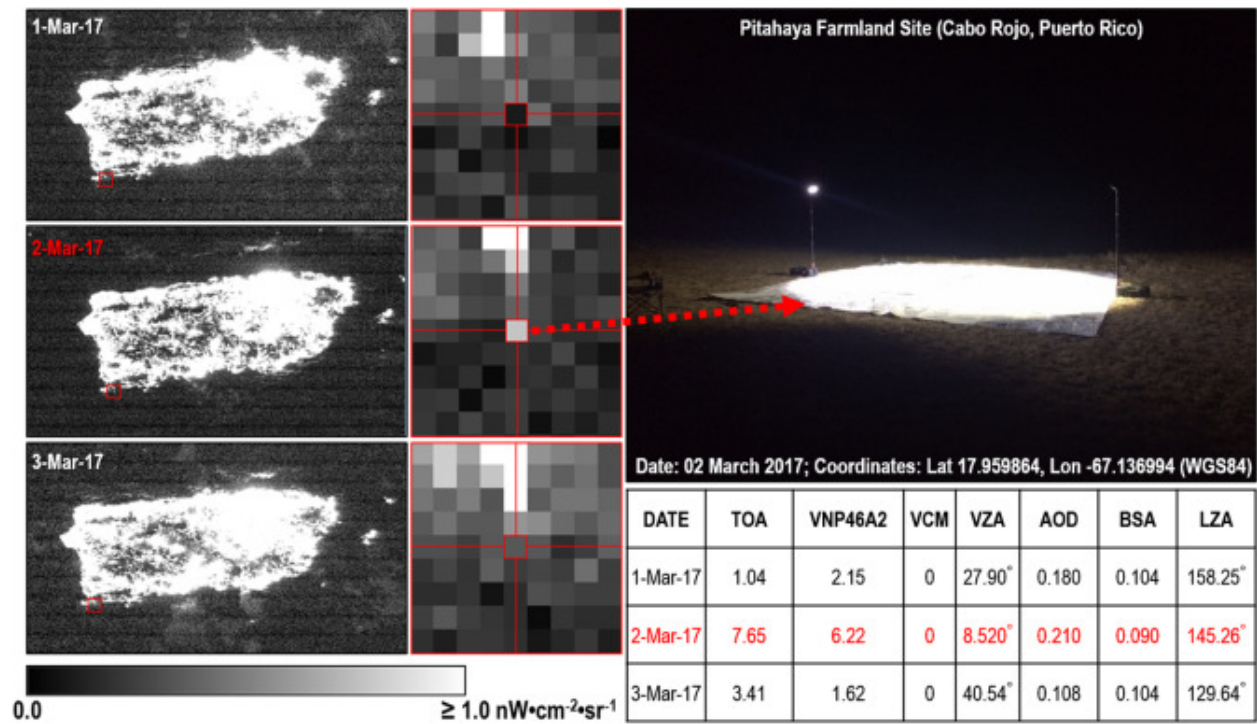


Figure 6 The NTL radiance at the Pitahaya farmland site in Cabo Rojo, PR on 1st, 2nd and 3rd March 2017. The top-right image shows the setup of the stable point source. TOA and VNP46A2 values are in $\text{nW} \cdot \text{cm}^{-2} \cdot \text{sr}^{-1}$. VCM = 0 represents cloud free overpasses. LZA is lunar zenith angle, and the values larger than 108° correspond to moonless nights.

The validation approach follows the assessment method first described in *Cao and Bai* (2014), which relies on quantitative analysis and stability monitoring of stable light point sources. We used the following parameters to generate our radiative transfer calculations: (1) atmospheric transmittance = 0.8 (based on 6S radiative transfer code and AERONET calculations), a target reflectance = 0.8, and 16 W of total effective irradiance incident on the reflective surface. Results in Figure 6 also illustrate how the detected VIIRS at-sensor cloud-corrected radiance (or TOA) and VNP46A2 estimates over the pixel centered on the reflective point source were within the VNP46A2 product's “breakthrough” requirement specifications for the NTL detection limit, L_{min} ($0.43 \text{ nW} \cdot \text{cm}^{-2} \cdot \text{sr}^{-1}$) after removing background

noise measured the days prior and after activation of the stable light point sources. We found that the final VNP46A2 product resulted in a 16.95% sensitivity enhancement (due to reduced background noise), as confirmed in previous benchmark tests, compared to the at-sensor cloud-corrected radiance product (TOA) under observed moon-free conditions.

7 Data Archives

The VNP46 suite of daily operational products will be archived and supported by NASA's LAADS DAAC data center <https://ladsweb.modaps.eosdis.nasa.gov/>.

The VNP46 suite of near real-time products with latency of about three hours will be available at the NASA LANCE: NASA Near Real-time Data and Imagery <https://earthdata.nasa.gov/earth-observation-data/near-real-time>.

8 Data Usage and Citation Policies

Please find detailed information about how to use and how to cite the data at the webpage https://lpdaac.usgs.gov/dataset_discovery/viirs/viirs_policies.

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10 Related Publications

Román, M.O., Wang, Z., Sun, Q., Kalb, V., Miller, S.D., Molthan, A., Schultz, L., Bell, J., Stokes, E.C., Pandey, B. and Seto, K.C., et al. (2018). NASA's Black Marble nighttime lights product suite. *Remote Sens. Environ.* 210, 113-143. doi:10.1016/j.rse.2018.03.017.

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Wang, Z., Román, M. O., Sun, Q., Molthan, A. L., Schultz, L. A., and Kalb, V. L. (2018). Monitoring Disaster-related Power Outages Using NASA Black Marble Nighttime Light Product. *Int. Arch. Photogramm. Remote Sens. Spatial Inf. Sci.*, XLII-3, 1853-1856, <https://doi.org/10.5194/isprs-archives-XLII-3-1853-2018>, 2018.

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Cole, T.A., Wanik, D.W., Molthan, A.L., Román, M.O. and Griffin, R.E. (2017). Synergistic use of nighttime satellite data, electric utility infrastructure, and ambient population to improve power outage detections in urban areas. *Remote Sensing*, 9(3), 286. doi:10.3390/rs9030286.

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Appendix A: Metadata (Attributes) in VNP46A1 Product

```
Netcdf VNP46A1_NPP_DNBdailyN.A2016189.h10v05.h5 {
  group: HDFEOS {
    group: ADDITIONAL {
      group: FILE_ATTRIBUTES {
      }
    }
  }

  group: GRIDS {
    group: VNP_Grid_DNB {
      dimensions:
        XDim = 2400;
        YDim = 2400;
        Xdim = 2400;
        Ydim = 2400;
      variables:
        short HDFEOS_CRS;
        :Projection = "HE5_GCTP_GEO";
        :UpperLeftPointMtrs = -8.0E7, 4.0E7; // double
        :LowerRightMtrs = -7.0E7, 3.0E7; // double

    group: Data_Fields {
      variables:
        float BrightnessTemperature_M12(YDim=2400, XDim=2400);
        :long_name = "Brightness Temperature of band M12 ";
        :units = "Kelvins";

        float BrightnessTemperature_M13(YDim=2400, XDim=2400);
        :long_name = "Brightness Temperature of band M13 ";
        :units = "Kelvins";

        float BrightnessTemperature_M15(YDim=2400, XDim=2400);
        :long_name = "Brightness Temperature of band M15 ";
        :units = "Kelvins";

        float BrightnessTemperature_M16(YDim=2400, XDim=2400);
        :long_name = "Brightness Temperature of band M16 ";
        :units = "Kelvins";

        float DNB_At_Sensor_Radiance_500m(YDim=2400, XDim=2400);
        :long_name = "DNB at Sensor Radiance";
        :units = "nW/(cm2 sr)";

        float Glint_Angle(YDim=2400, XDim=2400);
        :long_name = "Glint Angle";
        :units = "degrees";

        float Granule(YDim=2400, XDim=2400);
        :long_name = "Number of selected Granule";
        :units = "none";

        float Lunar_Azimuth(YDim=2400, XDim=2400);
        :long_name = "Lunar Azimuth Angle";
        :units = "degrees";

        float Lunar_Zenith(YDim=2400, XDim=2400);
        :long_name = "Lunar Zenith Angle";
        :units = "degrees";

        float Moon_Illumination_Fraction(YDim=2400, XDim=2400);
        :long_name = "Moon Illumination Fraction";
        :units = "percentage";

        float Moon_Phase_Angle(YDim=2400, XDim=2400);
        :long_name = "Moon Phase Angle";
        :units = "degrees";

        ushort QF_Cloud_Mask(YDim=2400, XDim=2400);
        :valid_min = 0; // int
        :valid_max = 65534; // int
        :_FillValue = 65535US; // ushort
    }
  }
}
```

```

        :long_name = "Cloud Mask Status";
        :units = "class flags";
        :flag_meanings = "bit 0: 0=Night, 1=Day\n bits 1-3: Land/Water 000=Land & Desert, 001=Land & no Desert, 010=Inland Water, 011=Sea Water,
101=Coastal\n bits 4-5: Cloud Mask Quality 00=Poor, 01=Low, 10=Medium, 11=High\n bits 6-7: Cloud Confidence 00=Confident Clear, 01=Probably
Clear, 10=Probably Cloudy, 11=Confident Cloudy\n bit 8: Shadow Detected 1=Yes, 0=No\n bit 9: Cirrus Detection (IR) 1=Cloud, 0=No Cloud\n bit 10:
Snow/Ice 1=Snow/Ice, 0=No Snow/Ice\n";

    ushort QF_DNB(YDim=2400, XDim=2400);
    :valid_min = 0; // int
    :valid_max = 65534; // int
    :FillValue = 65535US; // ushort
    :long_name = "DNB QF";
    :units = "class flags";

    float QF_VIIRS_M10(YDim=2400, XDim=2400);
    :long_name = "Quality Flag of Band M10";
    :units = "class flags";

    float QF_VIIRS_M11(YDim=2400, XDim=2400);
    :long_name = "Quality Flag of Band M11";
    :units = "class flags";

    float QF_VIIRS_M12(YDim=2400, XDim=2400);
    :long_name = "Quality Flag of Band M12";
    :units = "class flags";

    float QF_VIIRS_M13(YDim=2400, XDim=2400);
    :long_name = "Quality Flag of Band M13";
    :units = "class flags";

    float QF_VIIRS_M15(YDim=2400, XDim=2400);
    :long_name = "Quality Flag of Band M15";
    :units = "class flags";

    float QF_VIIRS_M16(YDim=2400, XDim=2400);
    :long_name = "Quality Flag of Band M16";
    :units = "class flags";

    float Radiance_M10(YDim=2400, XDim=2400);
    :long_name = "Band M10 Radiance";
    :units = "W/(m2 micron sr)";

    float Radiance_M11(YDim=2400, XDim=2400);
    :long_name = "Band M11 Radiance";
    :units = "W/(m2 micron sr)";

    float Sensor_Azimuth(YDim=2400, XDim=2400);
    :long_name = "Sensor Azimuth Angle";
    :units = "degrees";

    float Sensor_Zenith(YDim=2400, XDim=2400);
    :long_name = "Sensor Zenith Angle";
    :units = "degrees";

    float Solar_Azimuth(YDim=2400, XDim=2400);
    :long_name = "Solar Azimuth Angle";
    :units = "degrees";

    float Solar_Zenith(YDim=2400, XDim=2400);
    :long_name = "Solar Zenith Angle";
    :units = "degrees";

    float UTC_Time(YDim=2400, XDim=2400);
    :long_name = "View Time (UTC)";
    :units = "decimal hours";
}

// group attributes:
:InputPointer_CM = "NPP_CMN.data.A2016189.h10v05.0654.hdf:NPP_CMN.data.A2016189.h10v05.0700.hdf";
:InputPointer_L2G_DNB = "NPP_DNBN.data.A2016189.h10v05.0654.hdf:NPP_DNBN.data.A2016189.h10v05.0700.hdf";
:InputPointer_L2G_Ang = "NPP_DNBN.angles.A2016189.h10v05.0654.hdf:NPP_DNBN.angles.A2016189.h10v05.0700.hdf";
:InputPointer_L2G_PNTR = "NPP_PTDN.A2016189.h10v05.0654.hdf:NPP_PTDN.A2016189.h10v05.0700.hdf";

```

```

:InputPointer_DNB =
"/h10v05_2016189/data/NPP_VDNES_L1.A2016189.0654.001.2017168020038.hdf../h10v05_2016189/data/NPP_VDNES_L1.A2016189.0700.001.201
7168004047.hdf";
:InputPointer_Mod = "NPP_MOD.data.A2016189.h10v05.0654.hdf:NPP_MOD.data.A2016189.h10v05.0700.hdf";
:useCM = "No";
:CMfill = "No";
:RangeBeginningDate = "2016-07-07";
:RangeBeginningTime = "00:00:00";
:RangeEndingDate = "2016-07-07";
:RangeEndingTime = "23:59:59";
:NorthBoundingCoord = 40.0; // double
:SouthBoundingCoord = 29.999999999999996; // double
:EastBoundingCoord = -70.0; // double
:WestBoundingCoord = -80.0; // double
:TileID = 61010005; // int
:TileMode = "Night";
:HorizontalTileNumber = 10; // int
:VerticalTileNumber = 5; // int
:NumberOfInputGranules = 2; // int
:PGE_Name = "PGE554";
:PGEVersion = "V1.0.1";
:SatelliteInstrument = "NPP_SCI";
:ReprocessingPlanned = "metadata field";
:ReprocessingActual = "metadata field";
:ProcessingEnvironment = "Linux nppdev1";
:ScienceQualityFlagExplanation = "unknown";
}
}
}
group: HDFEOS_INFORMATION {
variables:
char StructMetadata.0(32000);

// group attributes:
:HDFEOSVersion = "HDFEOS_5.1.15";
}

// global attributes:
:featureType = "GRID";
:_CoordSysBuilder = "ucar.nc2.dataset.conv.DefaultConvention";
}

```

Appendix B: Metadata (Attributes) in VNP46A2 Product

```

netcdf VNP46A2.A2016251.h21v09.h5 {
group: HDFEOS {
group: ADDITIONAL {
group: FILE_ATTRIBUTES {
}
}
}

group: GRIDS {
group: VNP_Grid_DNB {
dimensions:
XDim = 2400;
YDim = 2400;
variables:
short _HDFEOS_CRIS;
:Projection = "HE5_GCTP_GEO";
:UpperLeftPointMtrs = 3.0E7, 0.0; // double
:LowerRightMtrs = 4.0E7, -1.0E7; // double

group: Data_Fields {
variables:
double DNB_BRDF-CORRECTED_NTL_500m(YDim=2400, XDim=2400);
}
}
}

```

```

:long_name = "BRDF Corrected DNB Radiance \n";
:units = "nWatts/(cm^2·sr) \n";
:valid_range = "0-65534 \n";
:offset = 0.0; // double
:scale_factor=0.1;//double
:_ChunkSizes = 100U, 2400U; // uint

double Gap_Filled_DNB_BRDF-CORRECTED_NTL_500m(YDim=2400, XDim=2400);
:long_name = "Gap Filled BRDF Corrected DNB Radiance \n";
:units = "nWatts/(cm^2·sr) \n";
:valid_range = "0-65534 \n";
:offset = 0.0; // double
:scale_factor=0.1;//double
:_ChunkSizes = 100U, 2400U; // uint

double DNB_Lunar_Irradiance(YDim=2400, XDim=2400);
:long_name = "Lunar Irradiance \n";
:units = "nWatts/(cm^2) \n";
:valid_range = "0-65534 \n";
:offset = 0.0; // double
:scale_factor=0.1;//double
:_ChunkSizes = 100U, 2400U; // uint

double Latest_High_Quality_Retrieval(YDim=2400, XDim=2400);
:long_name = "The Latest High Quality BRDF Corrected DNB Radiance Retrieval\n";
:units = "Number of Days \n";
:valid_range = "0 - 254 \n";
:offset = 0.0; // double
:_ChunkSizes = 100U, 2400U; // uint

ubyte Mandatory_Quality_Flag(YDim=2400, XDim=2400);
:long_name = "Mandatory Quality Flag of BRDF Corrected DNB Radiance \n";
:units = "nWatts/(cm^2)";
:valid_range = "0 - 3 \n";
:Description = "00\tHigh-Quality\tMain Algorithm (Persistent Nighttime Lights)\n01\tHigh-Quality\tMain Algorithm (Ephemeral Nighttime
Lights)\n02\tPoor-Quality\tMain Algorithm (Outlier, potential cloud contamination or other issues)\n255\tNo Retrieval\tFill Value \n";
:_FillValue = 255UB; // ubyte
:_ChunkSizes = 100U, 2400U; // uint

ushort QF_Cloud_Mask(YDim=2400, XDim=2400);
:long_name = "Cloud Mask Status \n";
:units = "class flag \n";
:valid_range = "0 - 65534 \n";
:Description = "bit Flag description key: \n0\t Day/Night \n 0=Night 1=Day \n1-3\t Land/Water Background \n\t\t00=Land & Desert
\n\t\t01=Land no Desert \n\t\t010=Inland Water \n\t\t011=Sea Water \n\t\t101=Coastal \n4-5\t Cloud Mask Quality \n\t\t00=Poor\n\t\t01=Low
\n\t\t10=Medium \n\t\t11=High \n6-7\t Cloud Detection Results & Confidence Indicator \n\t\t00=Confident Clear \n\t\t01=Probably Clear
\n\t\t10=Probably Cloudy \n\t\t11=Confident Cloudy \n8\t Shadow Detected \n\t\t1=Yes 0=No \n9\t Cirrus Detection (IR) (BTM15-BTM16)
\n\t\t1=Cloud 0=No Cloud \n";
:_FillValue = 65535US; // ushort
:_ChunkSizes = 100U, 2400U; // uint

ubyte Snow_Flag(YDim=2400, XDim=2400);
:long_name = "Snow/Ice Status \n";
:units = "class flag \n";
:valid_range = "0 - 1 \n";
:Description = "0 = No snow/ice \n 1 = snow/ice \n";
:_FillValue = 255UB; // ubyte
:_ChunkSizes = 100U, 2400U; // uint

}

}

}

}

group: HDFEOS_INFORMATION {
variables:
char StructMetadata.0(32000);

// group attributes:
:HDFEOSVersion = "HDFEOS_5.1.15";
}

```

```
// global attributes:  
:featureType = "GRID";  
:_CoordSysBuilder = "ucar.nc2.dataset.conv.DefaultConvention";  
}
```