

NOAA-20 VIIRS Aerosol Detection Beta Maturity

April 18, 2018

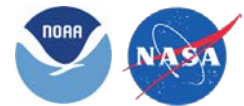
VIIRS Aerosol Team

Shobha Kondragunta (STAR); Pubu Ciren(IMSG);
Istvan Laszlo (STAR)

- Aerosol Cal/Val Team Members
- Product Requirements
- Findings/Issues for Beta maturity
- Documentation (Science Maturity Check List)
- Conclusions
- Path Forward



STAR Aerosol Team



| Name | Organization | Major Task |
|--------------------|--------------|--|
| Pubu Ciren | IMSG | Aerosol detection product development and validation |
| Amy Huff | PSU | Product assessment & User (forecasters) feedback, outreach |
| Edward J. Hyer | NRL | Product validation, assimilation activities |
| Shobha Kondragunta | NOAA | Co-lead (detection) |
| Istvan Laszlo | NOAA | Co-lead (optical depth) |
| Hongqing Liu | IMSG | Algorithm development, validation, visualization |
| Lorraine A. Remer | UMBC | Documentation, liaison to Cloud Team |
| Arthur Russakoff | IMSG | Algorithm integration |
| Ivan Valerio | IMSG | Data management and monitoring |
| Hai Zhang | IMSG | Algorithm coding for and maintenance of eIDEA, AerosolWatch websites |

Primary VIIRS Bands used in the Aerosol Detection Algorithm

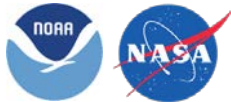
| Band Name | Nominal Wavelength Range (μm) | Nominal Central Wavelength (μm) | Horizontal Sample Interval (Km) (Along-Track×Along-Scan) | | Algorithm Use |
|-----------|-------------------------------|---------------------------------|---|--------------|---------------|
| | | | Nadir | Edge of Scan | |
| M1 | 0.402-0.422 | 0.412 | 0.742×0.259 | 1.60×1.58 | Dust/Smoke |
| M2 | 0.436-0.454 | 0.445 | 0.742×0.259 | 1.60×1.58 | Dust/smoke |
| M3 | 0.478-0.498 | 0.488 | 0.742×0.259 | 1.60×1.58 | Dust/Smoke |
| M4 | 0.545-0.565 | 0.555 | 0.742×0.259 | 1.60×1.58 | Smoke |
| M5 | 0.662-0.682 | 0.640 | 0.742×0.259 | 1.60×1.58 | Dust/Smoke |
| M6 | 0.739 – 0.754 | 0.746 | 0.742×0.776 | 1.60×1.58 | Smoke |
| M7 | 0.846-0.885 | 0.865 | 0.742×0.259 | 1.60×1.58 | Dust/Smoke |
| M8 | 1.230-1.250 | 1.24 | 0.742×0.776 | 1.60×1.58 | Dust/Smoke |
| M9 | 1.371-1.386 | 1.378 | 0.742×0.776 | 1.60×1.58 | Dust |
| M10 | 1.580-1.640 | 1.61 | 0.742×0.776 | 1.60×1.58 | Smoke |
| M11 | 2.225-2.275 | 2.25 | 0.742×0.776 | 1.60×1.58 | Dust/Smoke |
| M12 | 3.660-3.840 | 3.70 | 0.742×0.776 | 1.60×1.58 | Dust/Smoke |
| M13 | 3.973-4.128 | 4.05 | 0.742×0.259 | 1.60×1.58 | Smoke |
| M14 | 8.400-8.700 | 8.55 | 0.742×0.776 | 1.60×1.58 | |
| M15 | 10.263-11.263 | 10.763 | 0.742×0.776 | 1.60×1.58 | Dust/Smoke |
| M16 | 11.538-12.488 | 12.013 | 0.742×0.776 | 1.60×1.58 | Dust |

NDE/STAR VIIRS Aerosol Detection Product Status

| Algorithm | Suomi-NPP | NOAA-20 |
|--|--|---|
| Enterprise Processing System (EPS) v1r2 | NDE Operational since July 7, 2017 | NDE Currently in I&T March 20, 2018 |



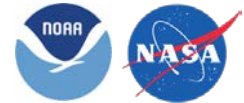
ADP Requirements



| | Proposed Operational Capabilities |
|-----------------------|---|
| Satellite Source (s) | SNPP/NOAA-20 VIIRS |
| Product Name | Aerosol Detection |
| Accuracy | Dust: 80% correct detection over land and ocean Smoke: 80% Correct detection over land 70% correct detection over ocean |
| Latency | 30 minutes after granule data is available |
| Refresh | 90 minutes |
| Timeliness | ≤ 3 hours |
| Coverage | Global |
| Horizontal Resolution | 0.75 km |
| Other attributes | VIIRS algorithm maintains continuity with MODIS, GOES, and GOES-R algorithms |



JPSS Data Products Maturity Definition



JPSS/GOES-R Data Product Validation Maturity Stages – COMMON DEFINITIONS (Nominal Mission)

1. Beta

- Product is minimally validated, and may still contain significant identified and unidentified errors.
- Information/data from validation efforts can be used to make initial qualitative or very limited quantitative assessments regarding product fitness-for-purpose.
- Documentation of product performance and identified product performance anomalies, including recommended remediation strategies, exists.

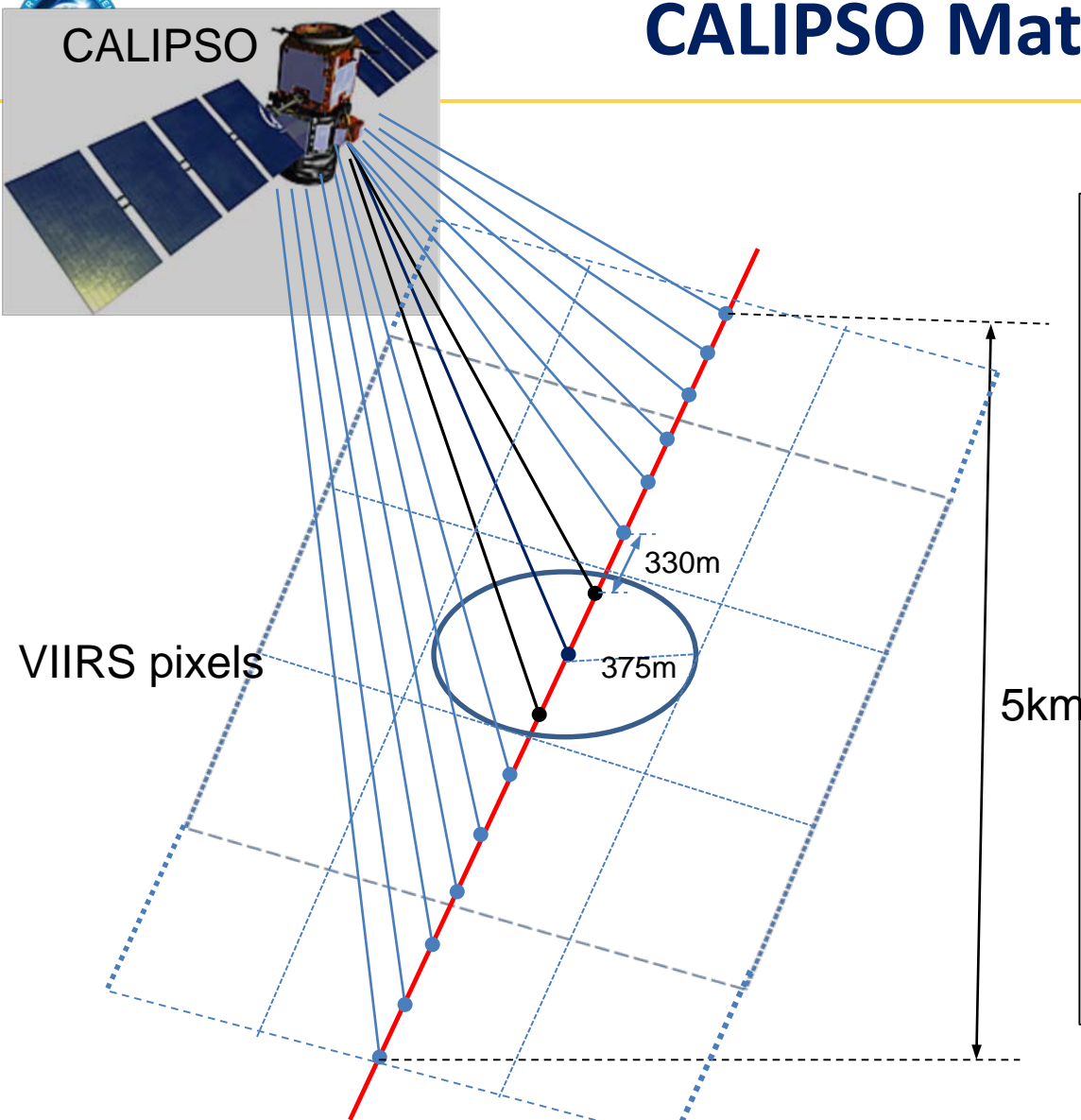
2. Provisional

- Product performance has been demonstrated through analysis of a large, but still limited (i.e., not necessarily globally or seasonally representative) number of independent measurements obtained from selected locations, time periods, or field campaign efforts.
- Product analyses are sufficient for qualitative, and limited quantitative, determination of product fitness-for-purpose.
- Documentation of product performance, testing involving product fixes, identified product performance anomalies, including recommended remediation strategies, exists.
- Product is recommended for potential operational use (user decision) and in scientific publications after consulting product status documents.

3. Validated

- Product performance has been demonstrated over a large and wide range of representative conditions (i.e., global, seasonal).
- Comprehensive documentation of product performance exists that includes all known product anomalies and their recommended remediation strategies for a full range of retrieval conditions and severity level.
- Product analyses are sufficient for full qualitative and quantitative determination of product fitness-for-purpose.
- Product is ready for operational use based on documented validation findings and user feedback.
- Product validation, quality assurance, and algorithm stewardship continue through the lifetime of the instrument.

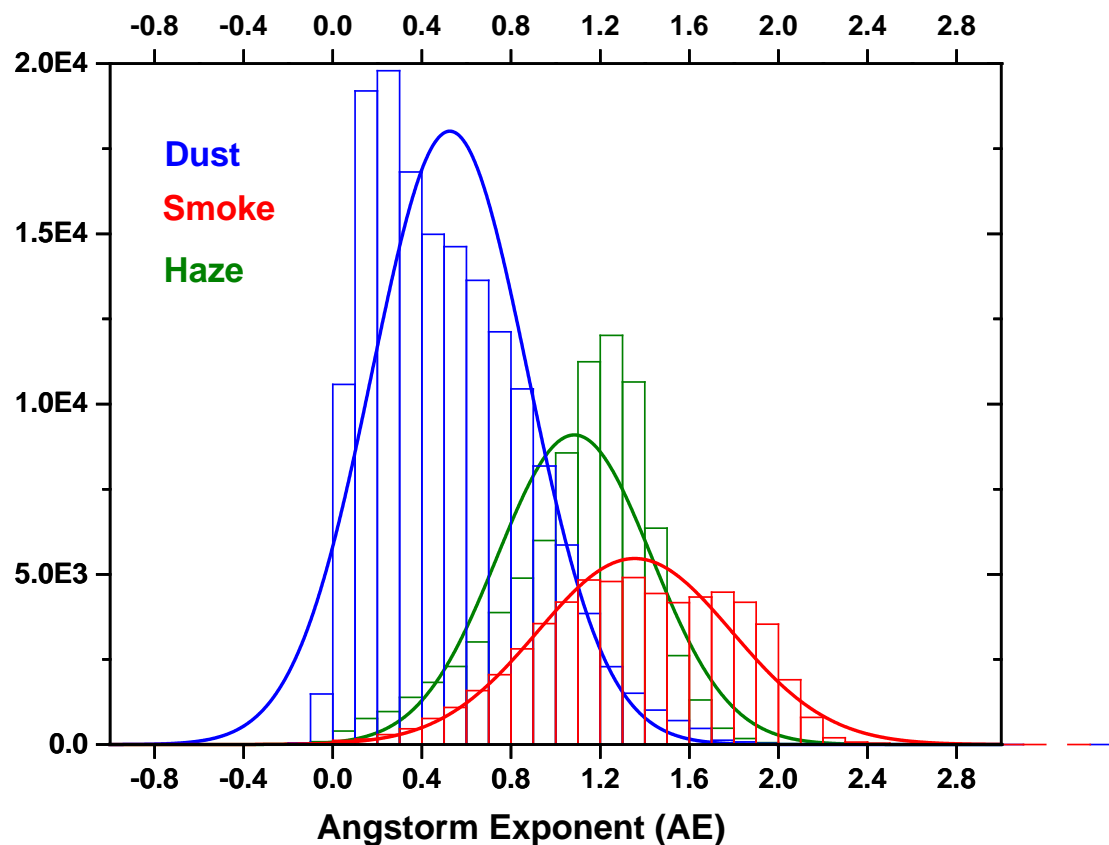
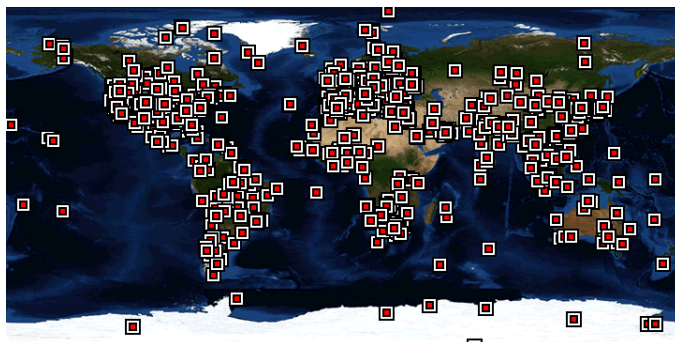
- Visual comparison between Suomi NPP and NOAA-20 ADP product. **ADP products for both Suomi NPP and NOAA-20 were generated off-line using IDPS VIIRS Cloud Mask**
 - Global scale (daily)
 - Global scale (monthly)
 - Correlations
- Time Period
 - January 9 – March 31, 2018
- Comparisons with CALIPSO Vertical Feature Mask (VFM)
 - Matchups in space and time
 - Daily time scale
- Comparisons with AERONET
 - Matchups in space and time
 - Daily time scale



- Time difference: ± 2 minutes
- Spatially, VIIRS pixels within $\pm 375\text{m}$ of the middle CALIPSO profile are selected.
- Middle three profiles are used to determine aerosol type in the column
 - All three profiles need to be cloud-free;
 - Dominant aerosol type is determined through the calculation of dust (or smoke) fraction (i.e., no of dust (or smoke) layers divided by the no. of aerosol layers from surface to 12km.
- VIIRS ADP data are filtered for high quality.

True Positive (TP): VIIRS and CALIPSO say **dust**
 True Negative(TN): VIIRS and CALIPSO say **no dust**
 False Negative(FN): VIIRS says **no dust** but CALIPSO says **dust**
 False Positive(FP): VIIRS says **dust** when CALIPSO says **no dust**

$$\begin{aligned}
 \text{POCD} &= \text{TP}/(\text{TP}+\text{FN}) \\
 \text{Accuracy} &= (\text{TP}+\text{TN})/(\text{TP}+\text{TN}+\text{FP}+\text{FN}) \\
 \text{POFD} &= \text{FP}/(\text{FP}+\text{TP})
 \end{aligned}$$



AERONET Smoke: AOD > 0.2 and Angstrom Exponent > 1.0

AERONET Dust: AOD > 0.2 and Angstrom Exponent < 0.5

AERONET and NOAA-20 within ± 30 min

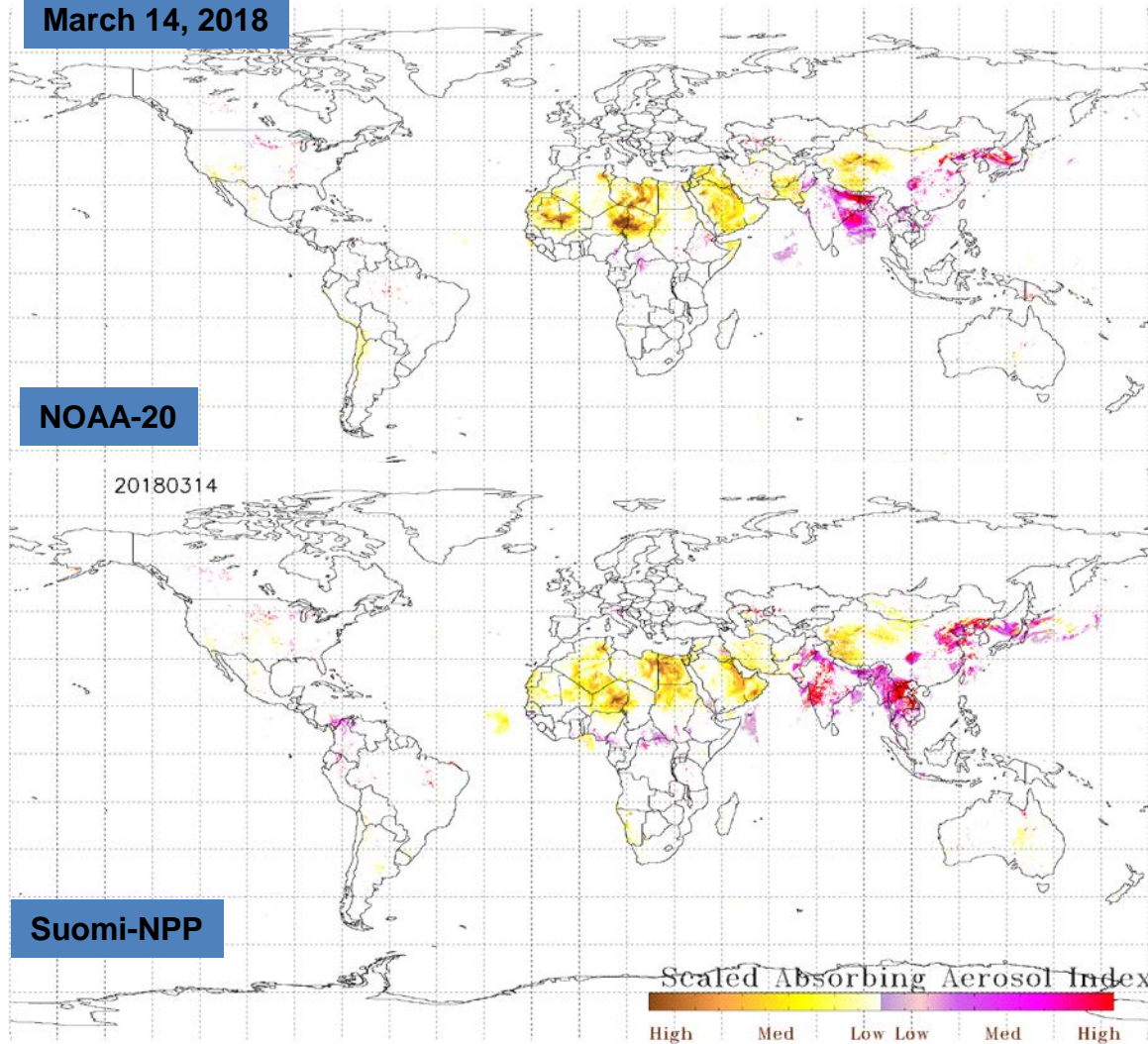
NOAA-20 VIIRS > 750 pixels within 27.5 km radius of AERONET

March 14, 2018

NOAA-20

20180314

Suomi-NPP



EPS algorithm run off-line on both SNPP and NOAA-20

IDPS Cloud Mask

SDRs downloaded from SCDR

April 05, 2018

NOAA-20 from NDE I&T

NOAA-20 from off-line run

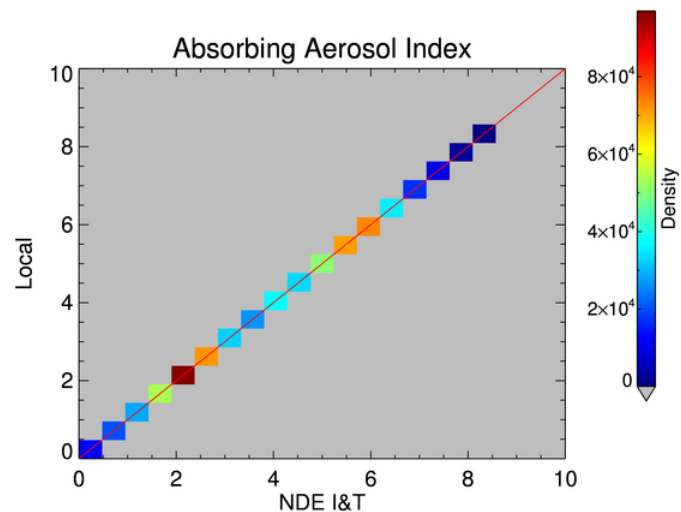
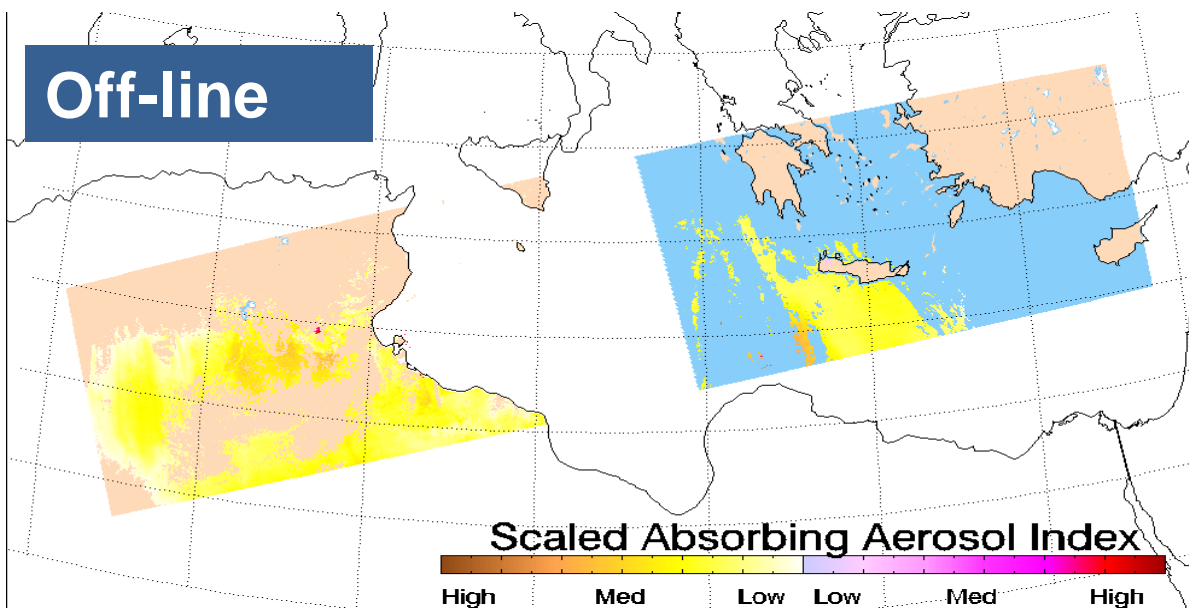
Scaled Absorbing Aerosol Index
High Med Low Low Med High

Scaled Absorbing Aerosol Index
High Med Low Low Med High

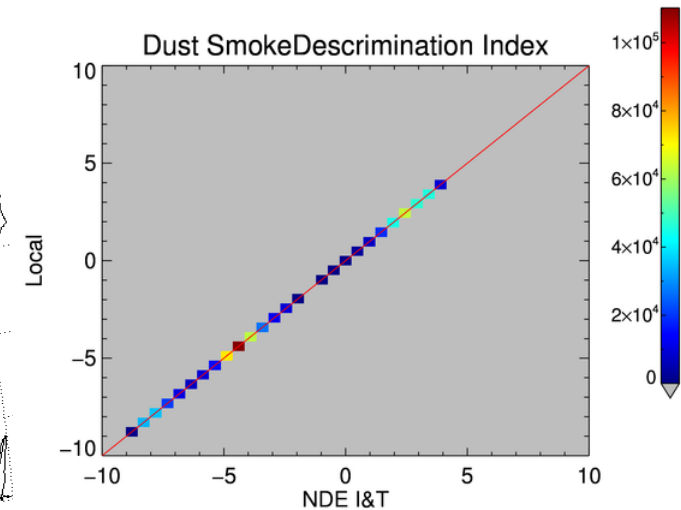
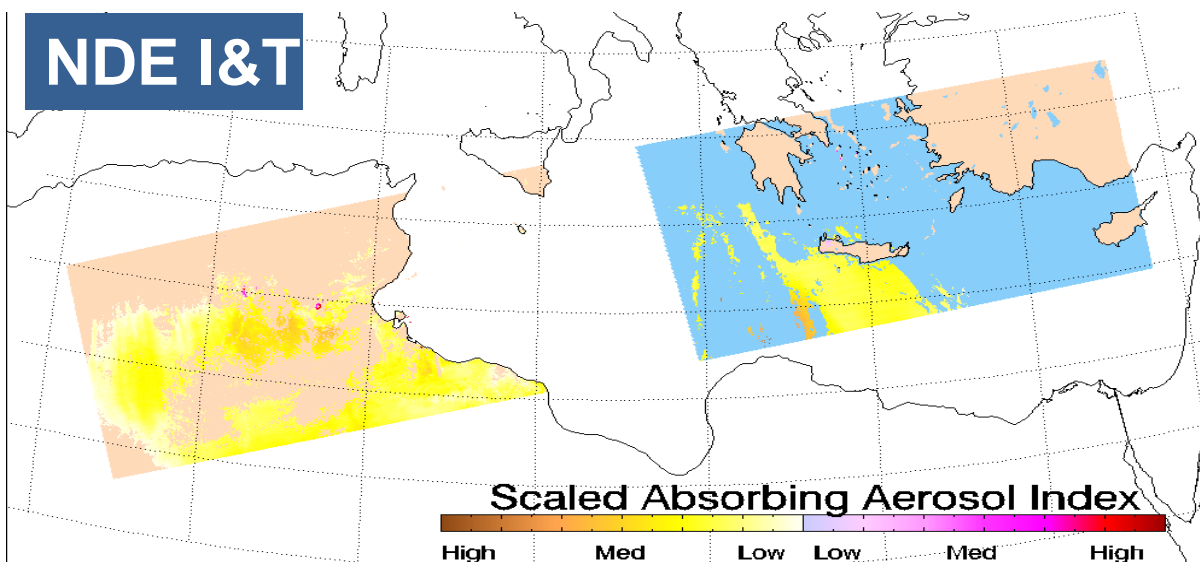
Missing granules in I&T

Input SDRs same. NDE I&T ADP generated using Enterprise Cloud Mask (ECM). Off-line ADP generated using IDPS Cloud Mask (old VCM).

Off-line

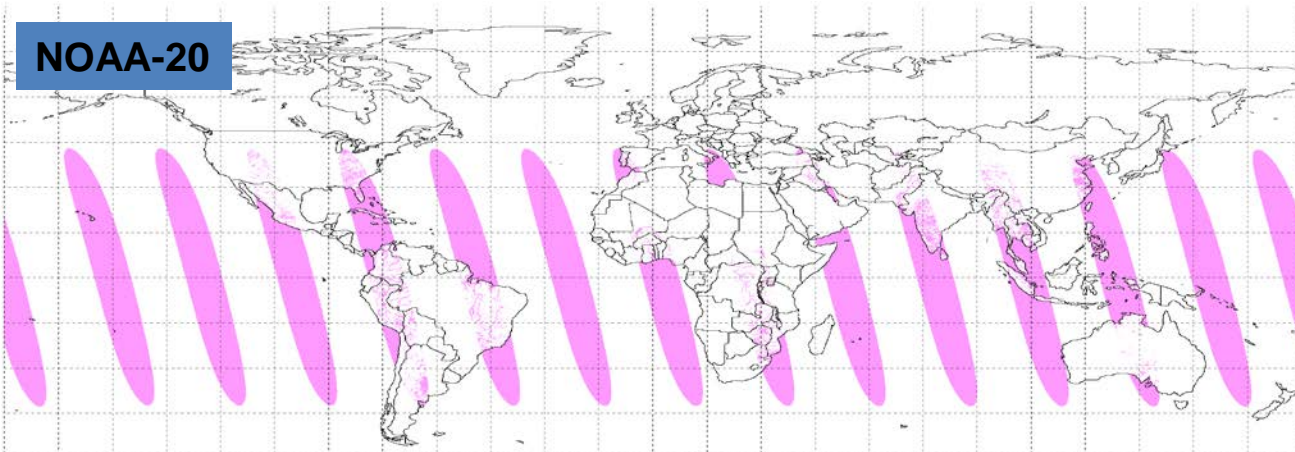


NDE I&T



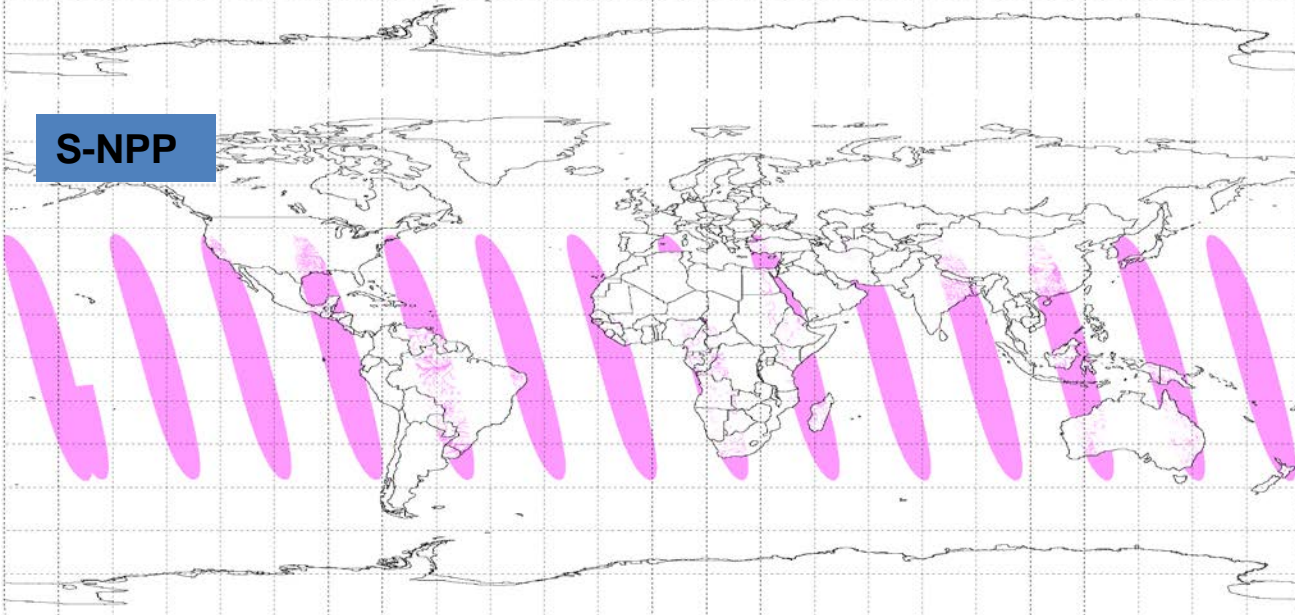
Sunglint

NOAA-20



$$0 < \eta < 40^\circ$$

S-NPP

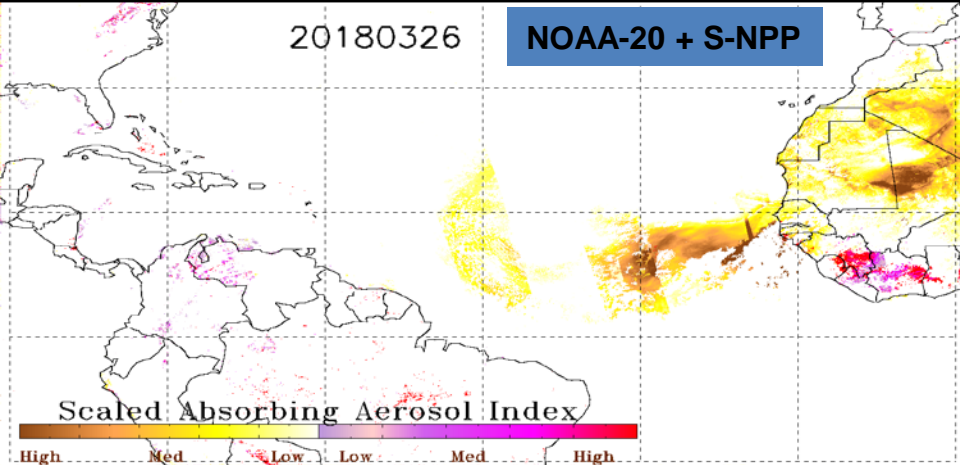
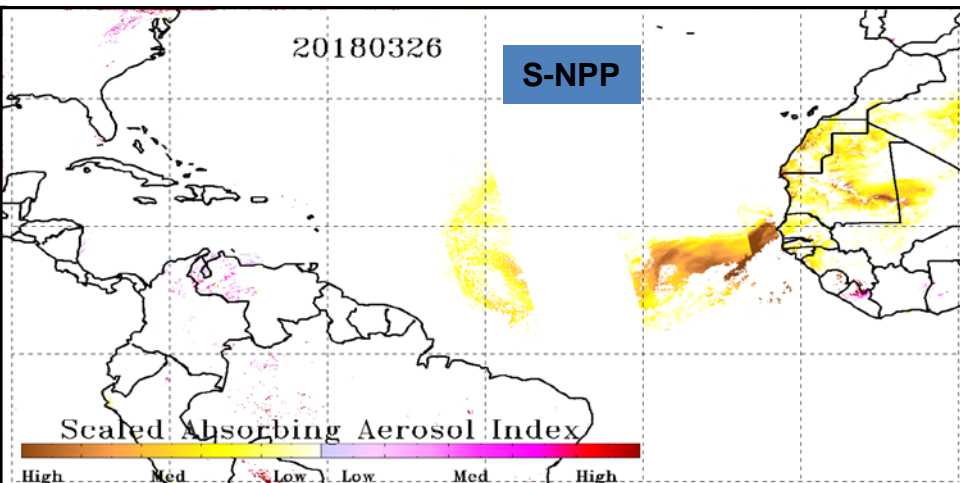
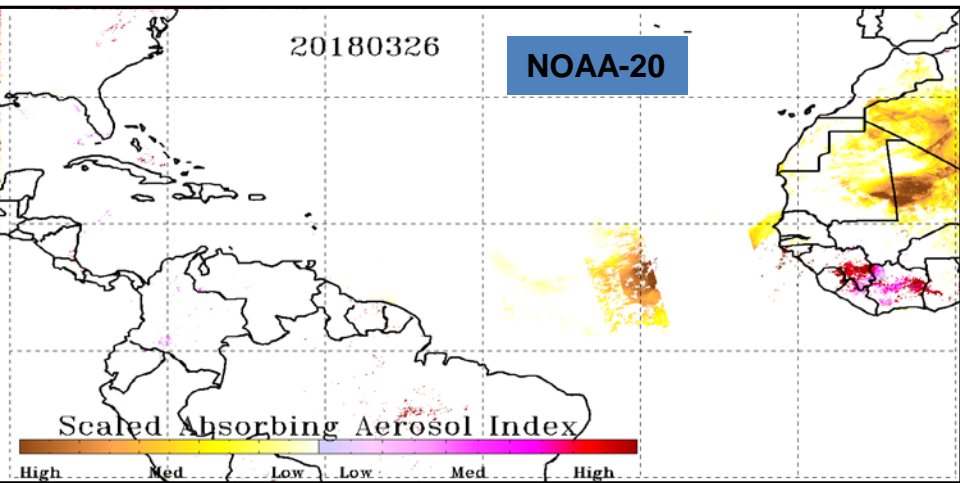


$$\cos(\eta) = \cos(\theta_0) \cdot \cos(\theta) + \sin(\theta_0) \cdot \sin(\theta) \cdot \cos(180 - \varphi)$$

η is the sunglint angle; θ_0 is the solar zenith angle
 θ is the satellite zenith angle; φ is the relative azimuth angle

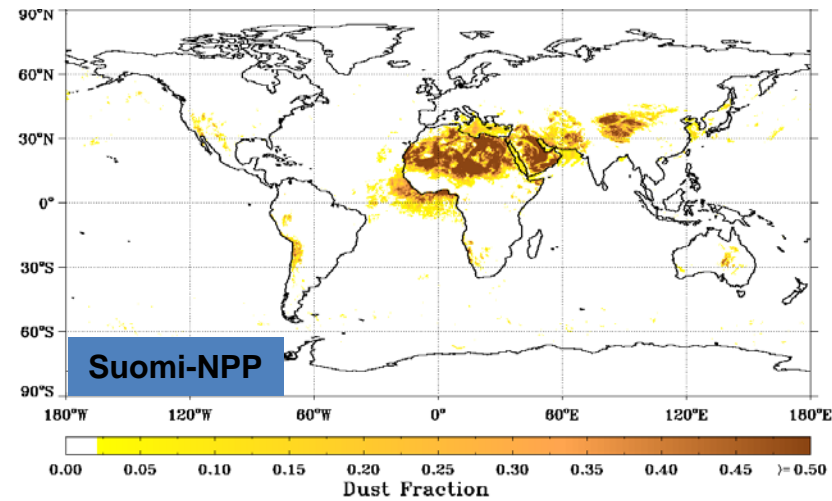
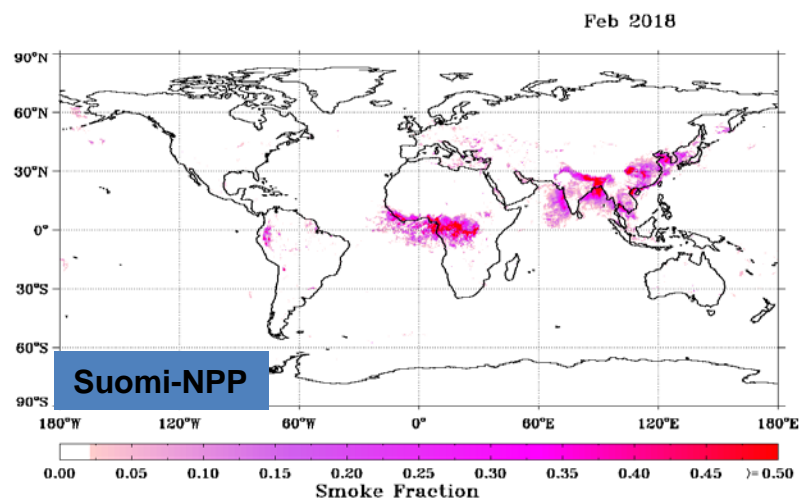
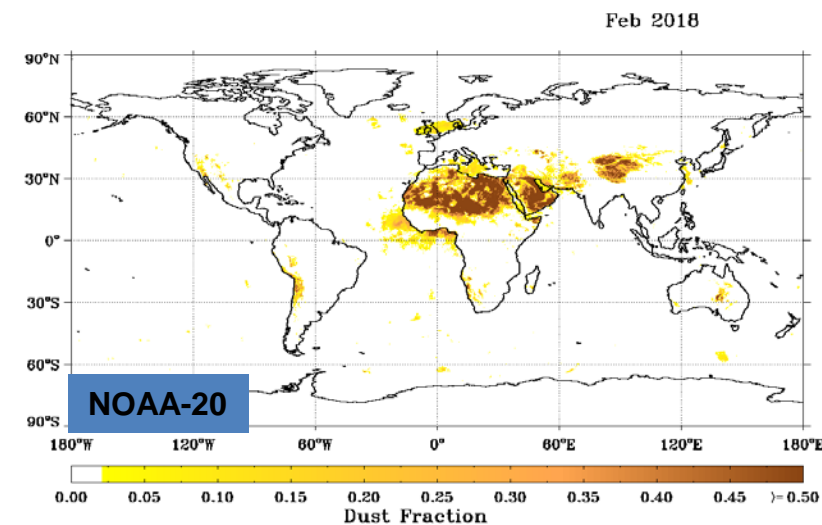
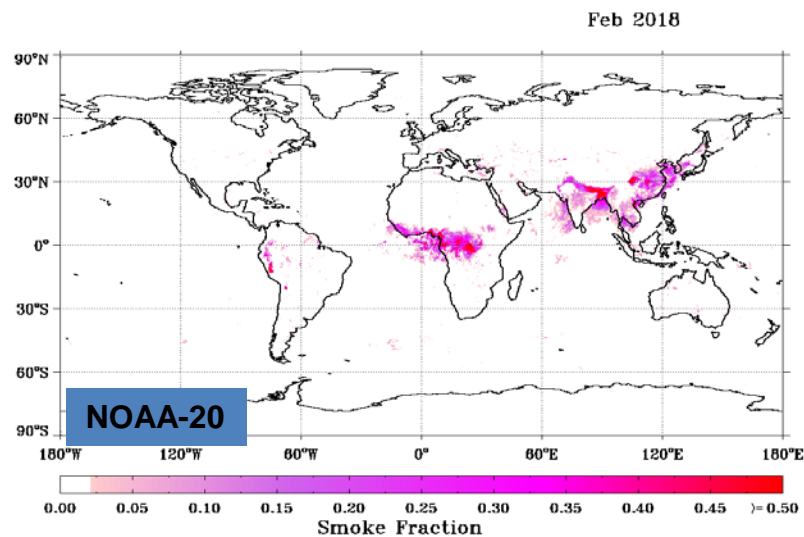
Transatlantic Dust Transport

March 26, 2018



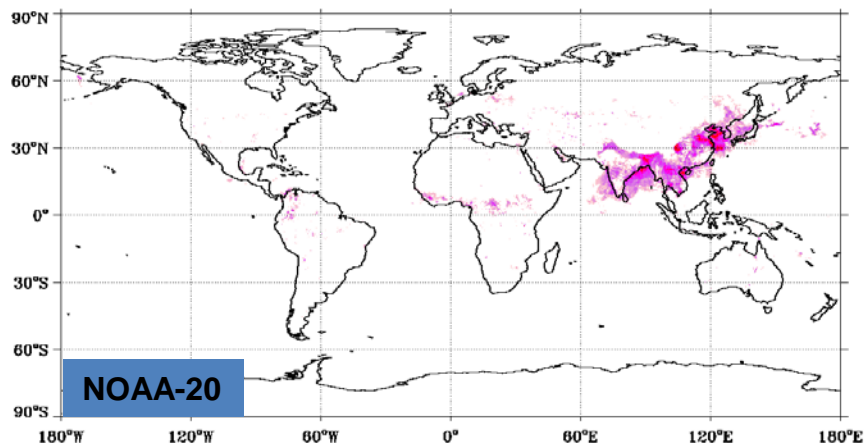
By combining ADP from NOAA-20 with ADP from S-NPP will increase the coverage

VIIRS Smoke and Dust Fractions for February 2018 (0.25° x 0.25°)

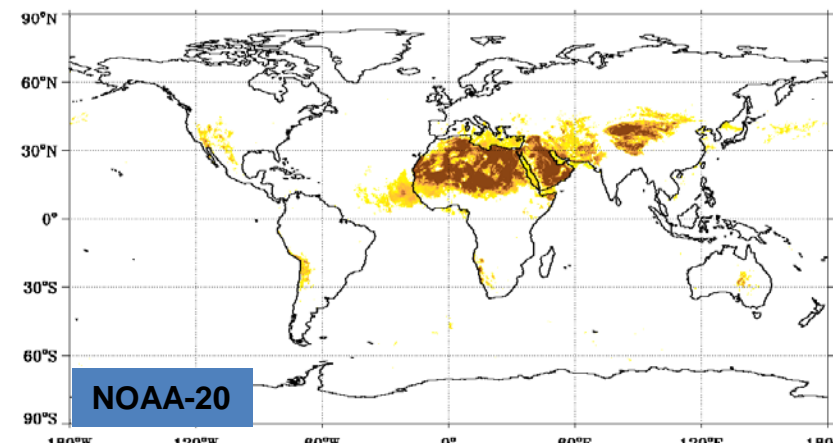


VIIRS Smoke and Dust Fractions for March 2018 (0.25° x 0.25°)

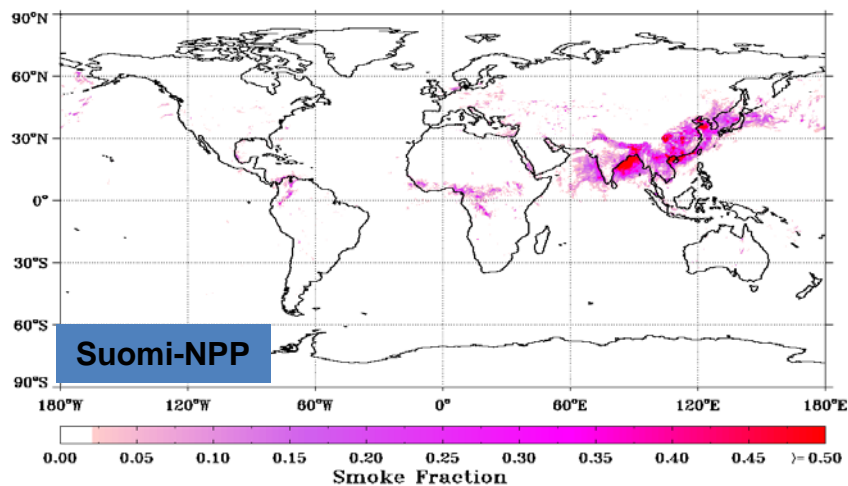
Mar 2018



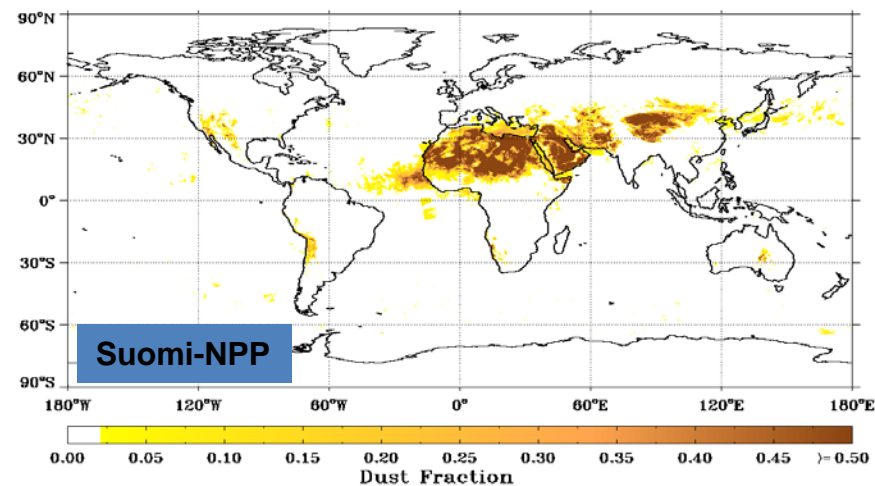
Mar 2018

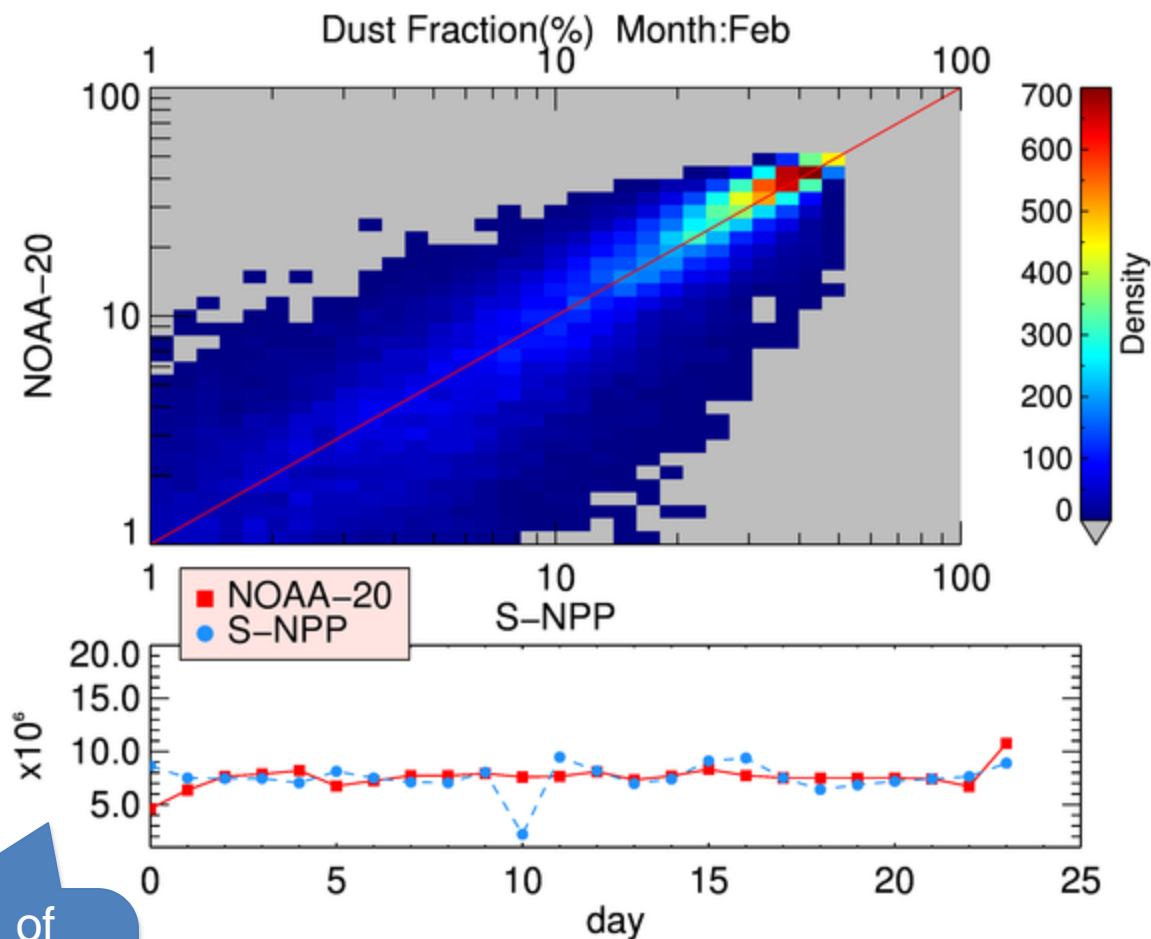


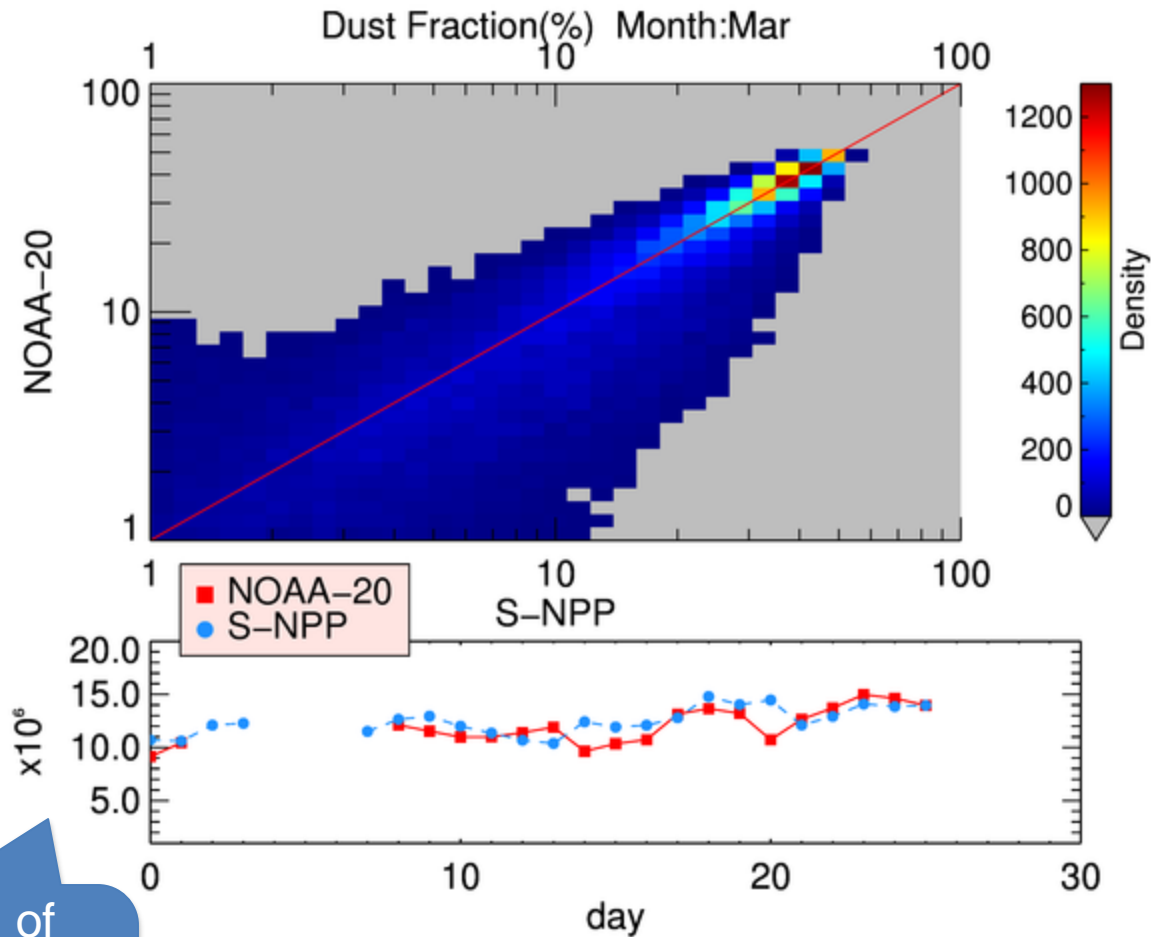
Mar 2018



Mar 2018

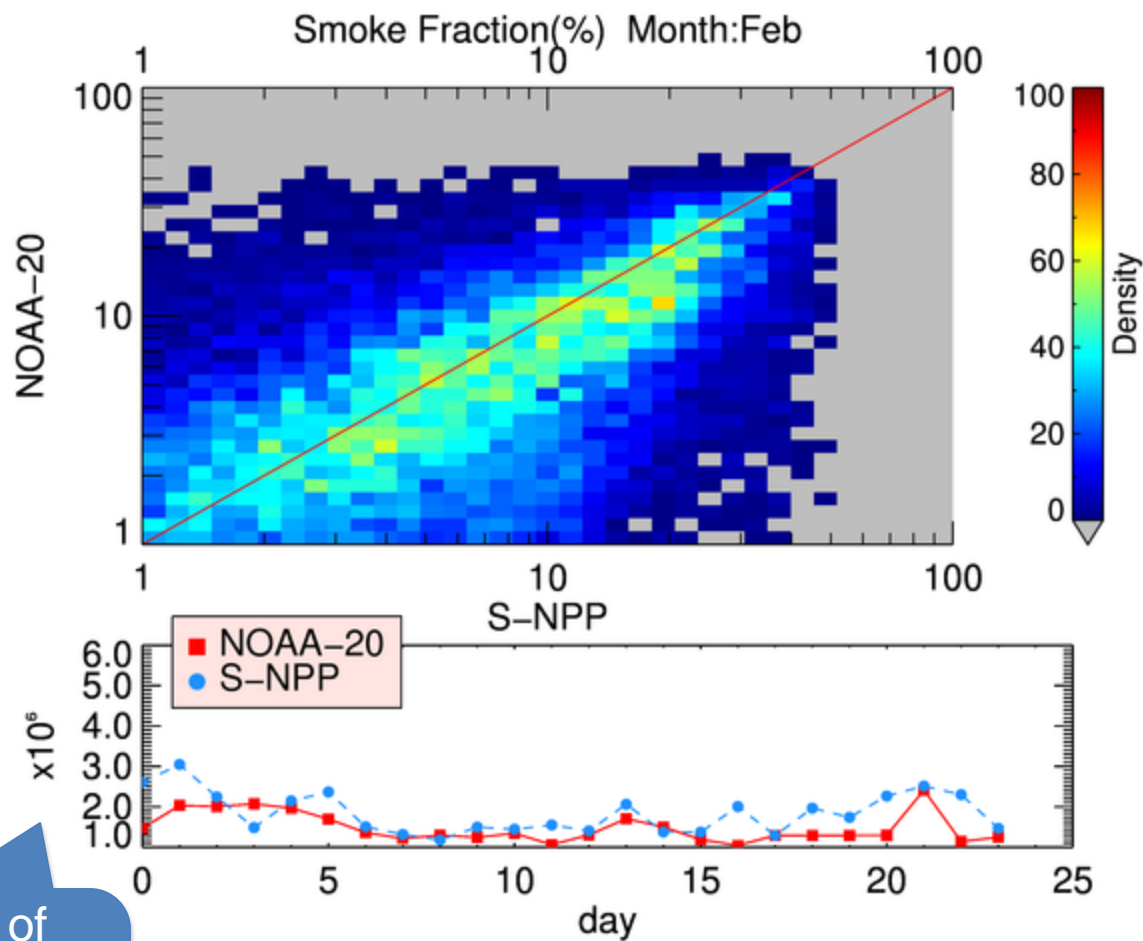


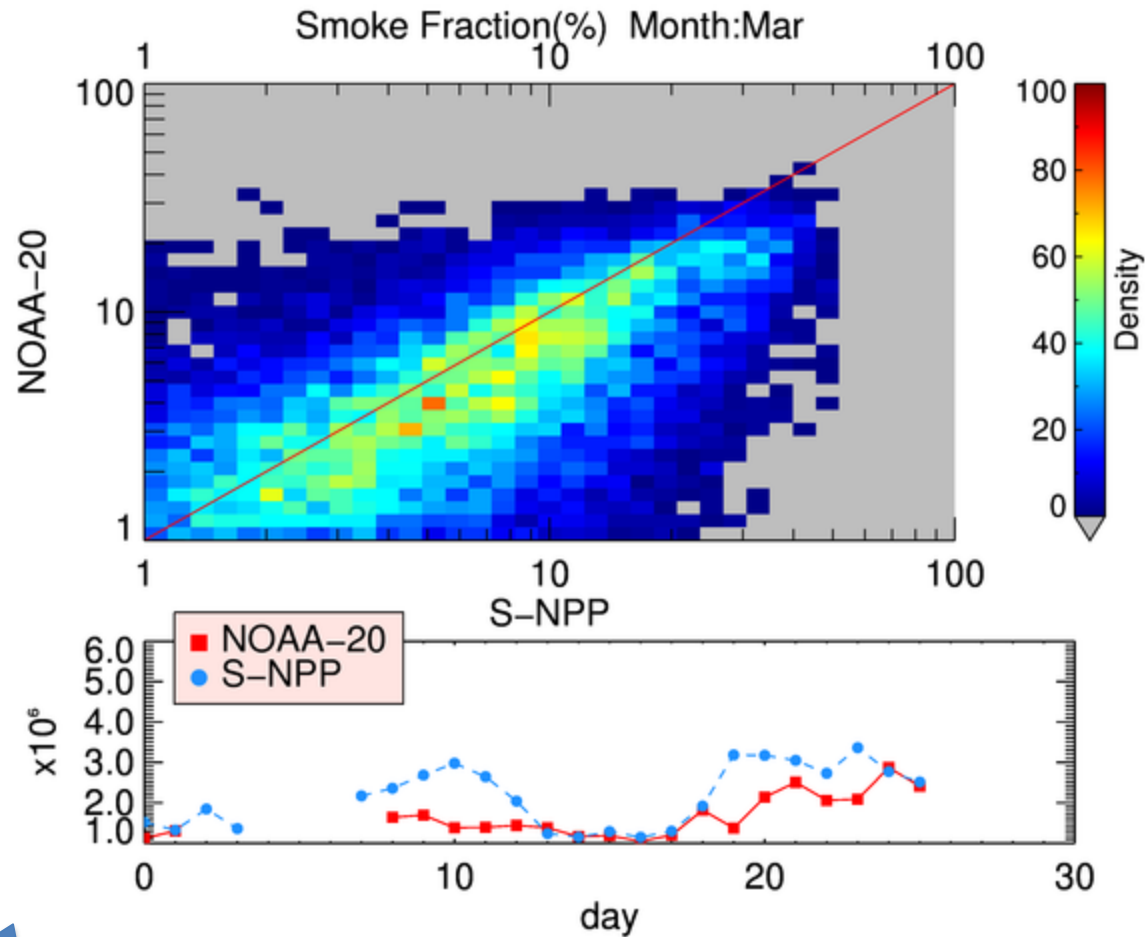




Dust Fraction
($0.25^\circ \times 0.25^\circ$)

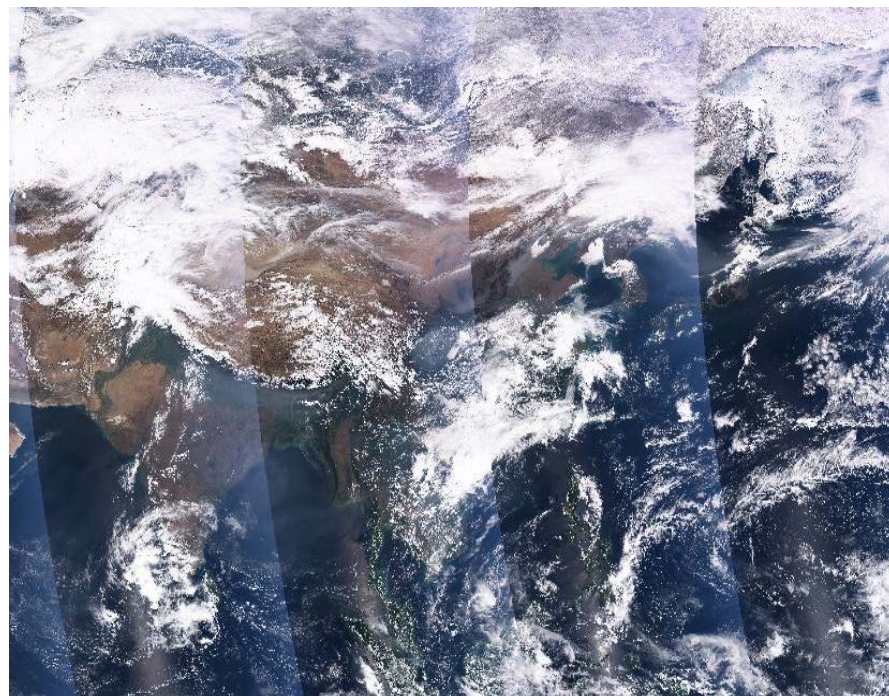
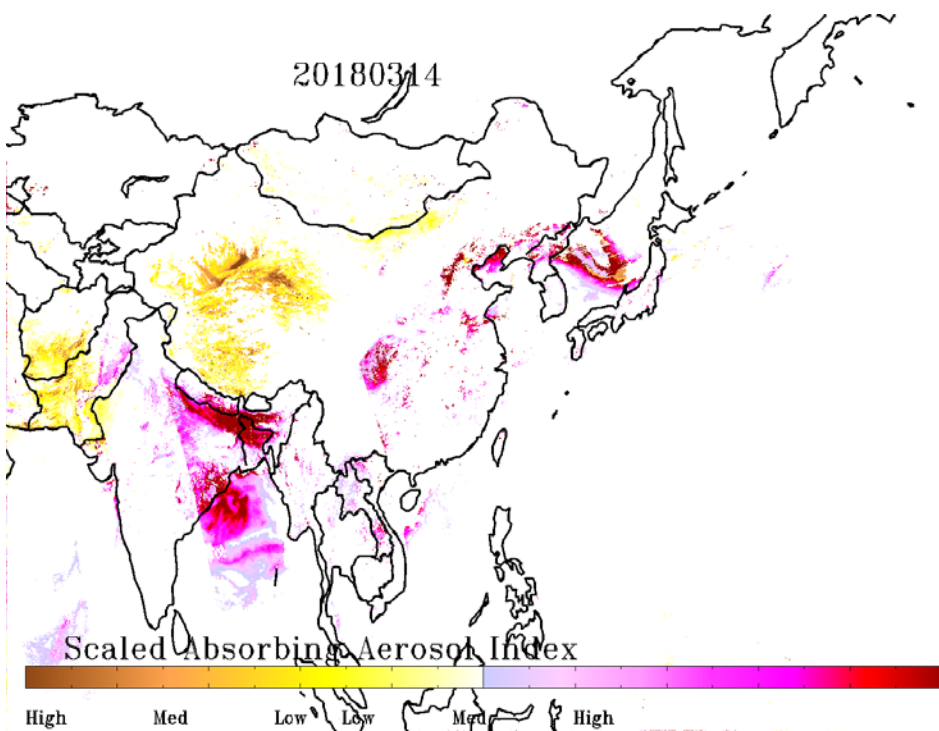
Time series of
total number of
global daily dust
pixels





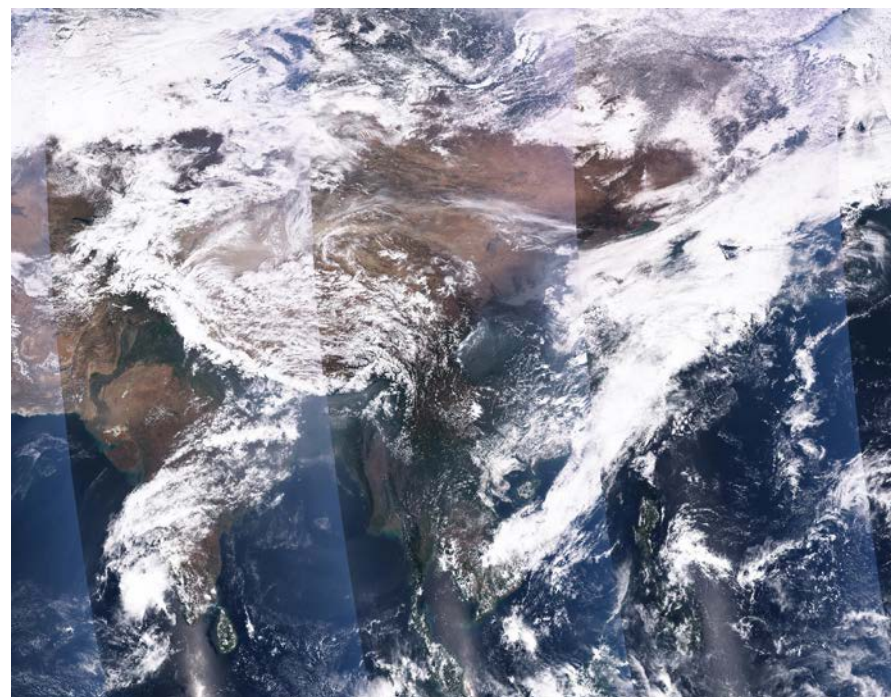
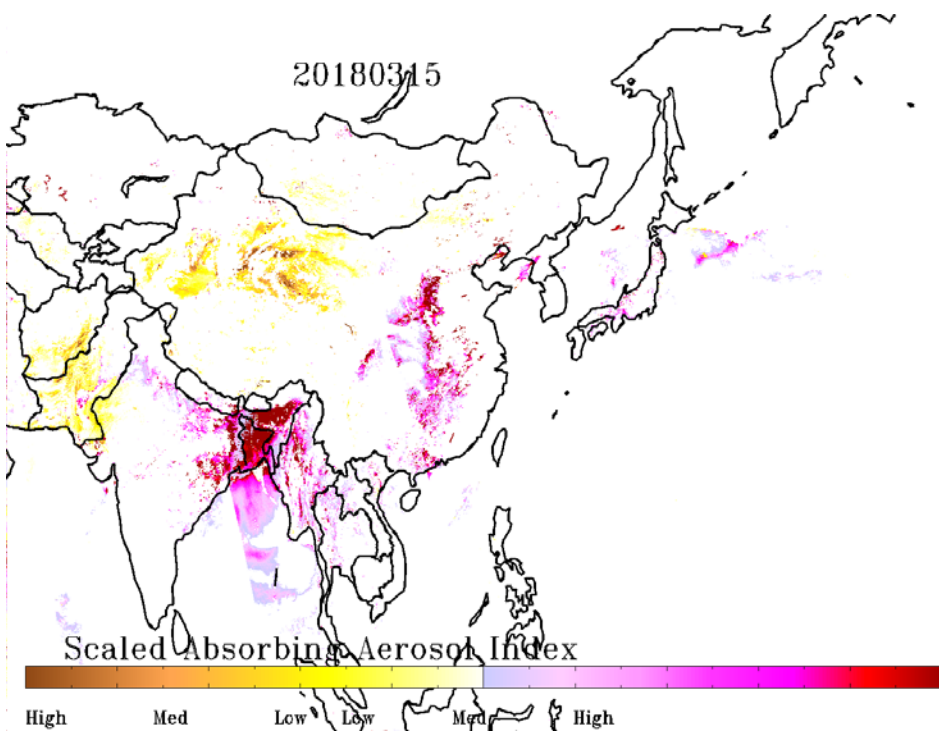
Asian Smog and Dust Events in Asia

March 14, 2018



Asian Smog and Dust Events in Asia

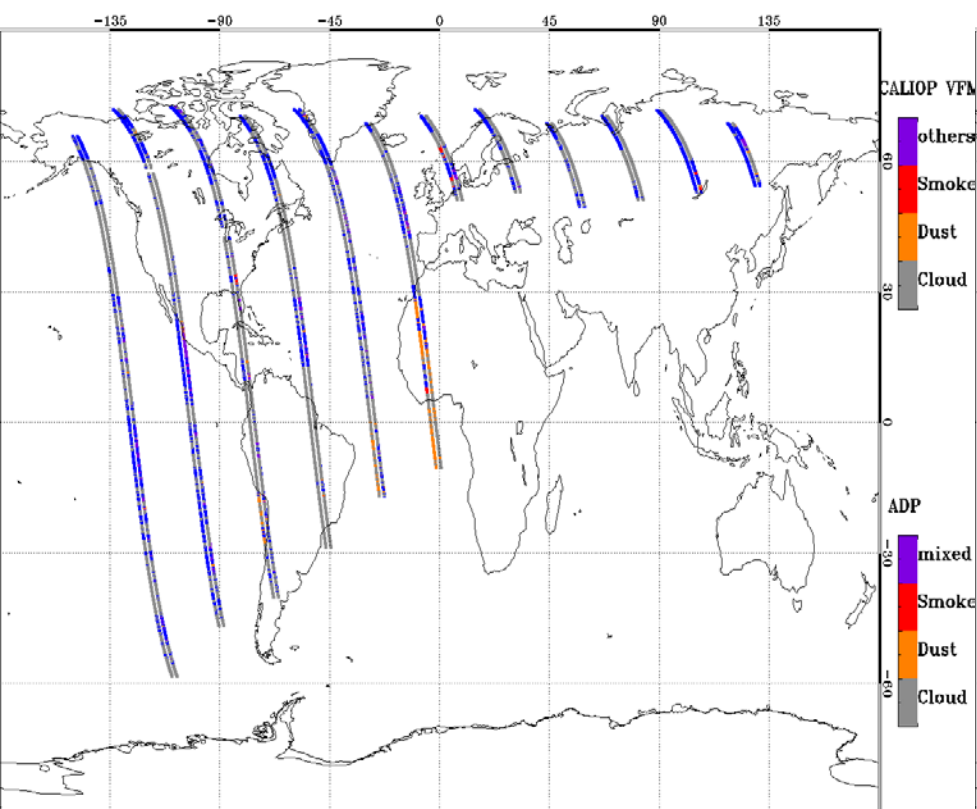
March 15, 2018



Matchup tracks between ADP and CALIPSO VFM

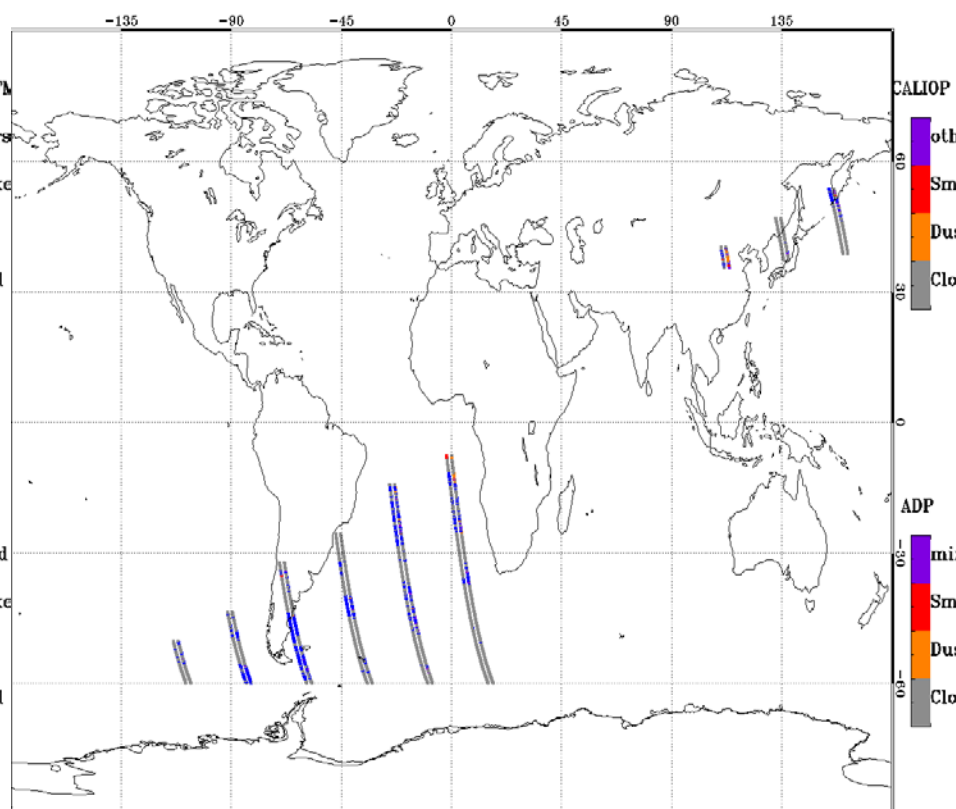
NOAA-20 vs. CALIPSO VFM

20180109 each pair of track: Left-ADP Right-VFM

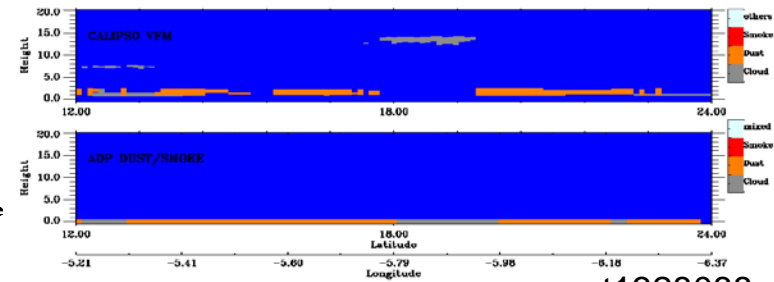
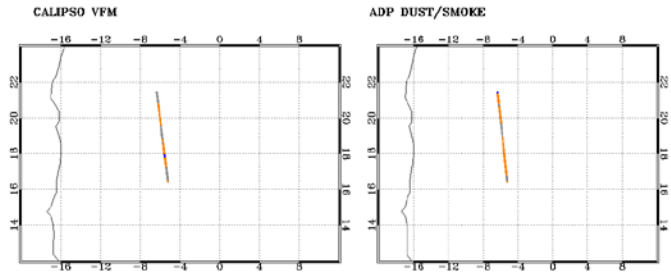
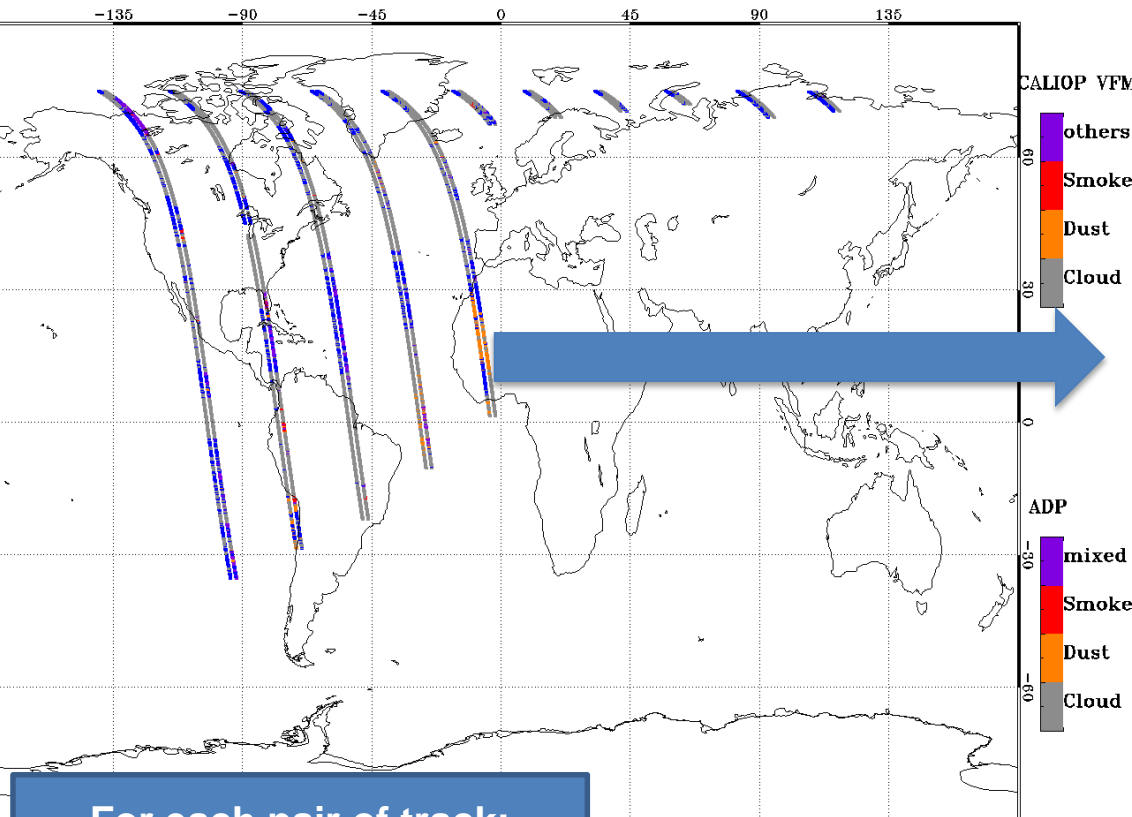


S-NPP vs. CALIPSO VFM

20180109 each pair of track: Left-ADP Right-VFM



Feb 10, 2018

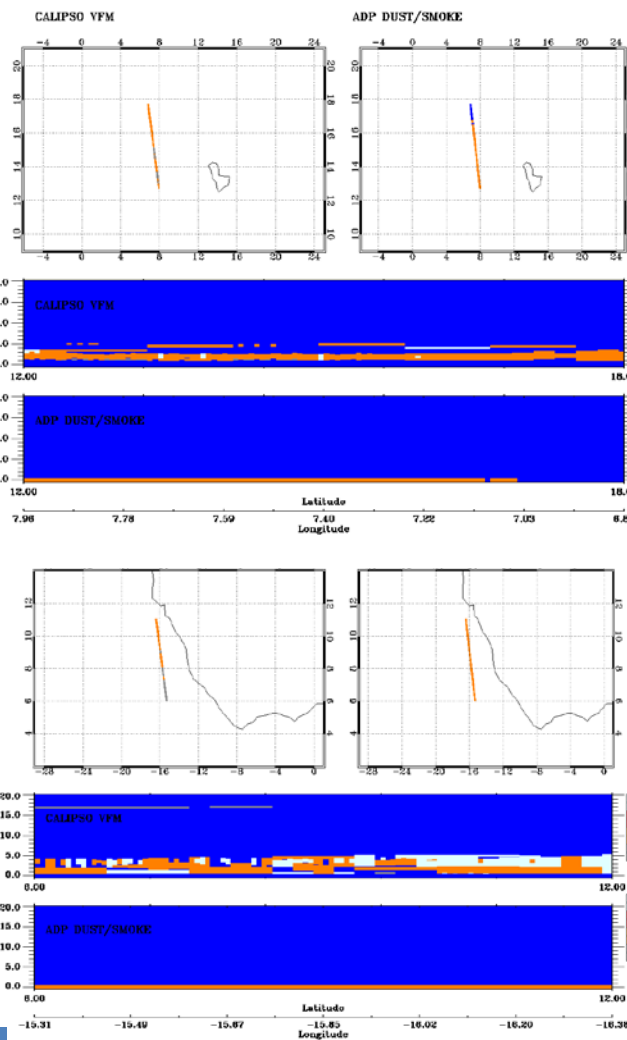
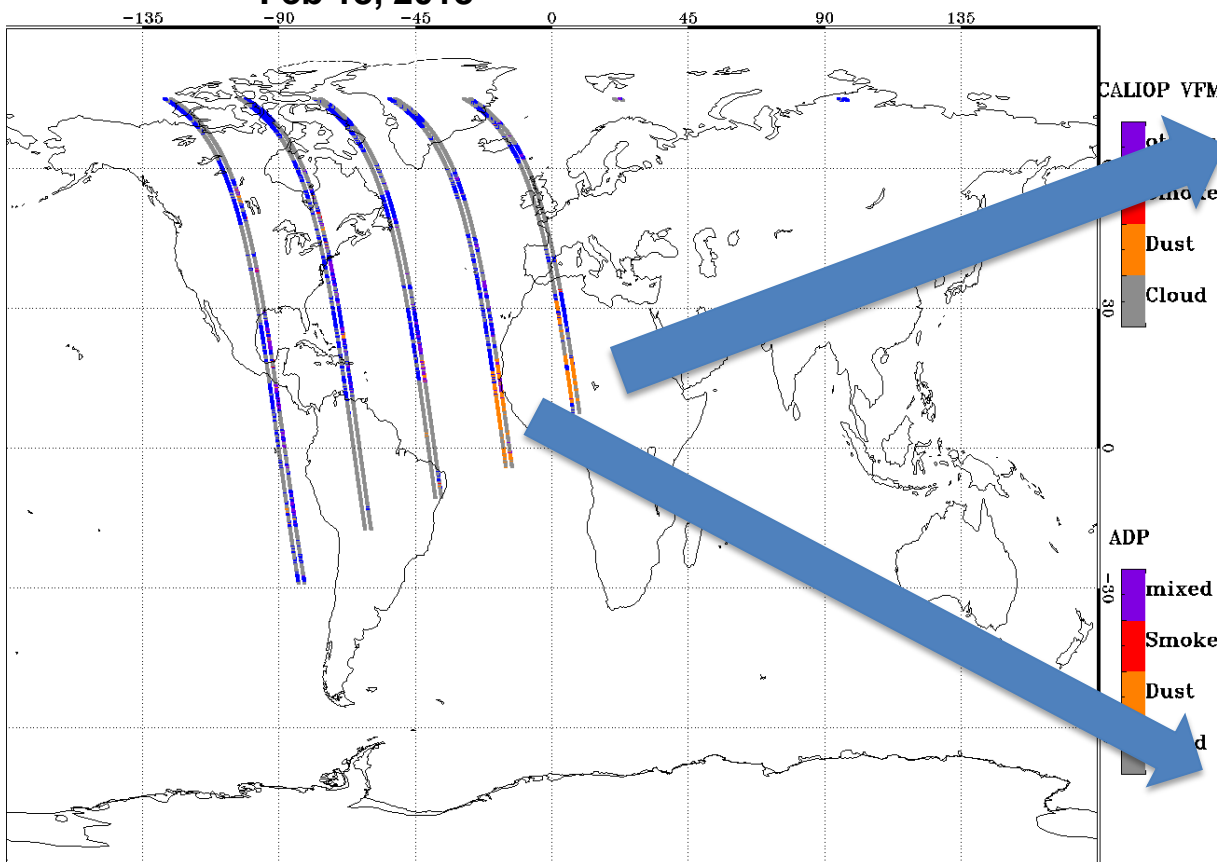


t1328088

For each pair of track:
Left: ADP right: CALIPSO
VFM

| | |
|----------|-----|
| Accuracy | 93% |
| POCD | 89% |

Feb 18, 2018

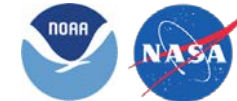


For each pair of tracks:
Left: ADP right: CALISPO
VFM

| | t1415547 | t1236263 |
|----------|----------|----------|
| Accuracy | 95% | 78% |
| POCD | 100% | 100% |



NOAA-20 VIIRS vs. CALIPSO Summary



January 9 – March 31, 2018

Smoke

| Satellite | True positive | False positive | False negative | True negative | Accuracy | POCD | POFD |
|-----------|---------------|----------------|----------------|---------------|----------|------|------|
| NOAA-20 | 103 | 39 | 21 | 2750 | 97.9 | 83.1 | 27.4 |
| S-NPP | 167 | 23 | 30 | 3804 | 98.6 | 84.7 | 12.1 |

Dust

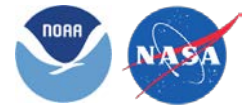
| Time Period | True positive | False positive | False negative | True negative | Accuracy | POCD | POFD |
|-------------|---------------|----------------|----------------|---------------|----------|------|------|
| NOAA-20 | 7586 | 5202 | 603 | 22057 | 83.6 | 92.6 | 40.1 |
| S-NPP | 11312 | 7895 | 901 | 31229 | 82.9 | 92.6 | 41.1 |

Requirement of Correct Detection

Dust 80% over land; 80% over ocean
Smoke 80% over land; 70% over ocean



SNPP VIIRS vs. CALIPSO Summary (NDE EPS July 21, 2017 – March 31, 2018)



Smoke

| Satellite | True positive | False positive | False negative | True negative | Accuracy | POCD | POFD |
|-------------|---------------|----------------|----------------|---------------|----------|------|------|
| S-NPP (NDE) | 1589 | 316 | 64 | 25758 | 98.6 | 96.1 | 16.6 |

Dust

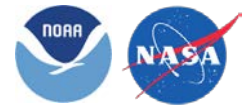
| Time Period | True positive | False positive | False negative | True negative | Accuracy | POCD | POFD |
|-------------|---------------|----------------|----------------|---------------|----------|------|------|
| S-NPP | 34051 | 21418 | 2666 | 86947 | 83.4 | 92.7 | 38.6 |

Requirement of Correct Detection

Dust 80% over land; 80% over ocean
Smoke 80% over land; 70% over ocean



NOAA-20 VIIRS vs. AERONET Summary



January 9 – March 31, 2018

Smoke

| Satellite | True positive | False positive | False negative | True negative | Accuracy | POCD | POFD |
|-----------|---------------|----------------|----------------|---------------|----------|------|------|
| NOAA-20 | 604 | 63 | 375 | 399 | 69.6 | 61.7 | 9.4 |
| S-NPP | 690 | 53 | 380 | 360 | 70.4 | 63.9 | 7.1 |

Dust

| Satellite | True positive | False positive | False negative | True negative | Accuracy | POCD | POFD |
|-----------|---------------|----------------|----------------|---------------|----------|------|------|
| NOAA-20 | 129 | 44 | 88 | 186 | 70.4 | 59.4 | 25.4 |
| S-NPP | 174 | 72 | 121 | 330 | 72.3 | 58.9 | 29.2 |

Requirement of Correct Detection

Dust 80% over land; 80% over ocean
Smoke 80% over land; 70% over ocean

Smoke

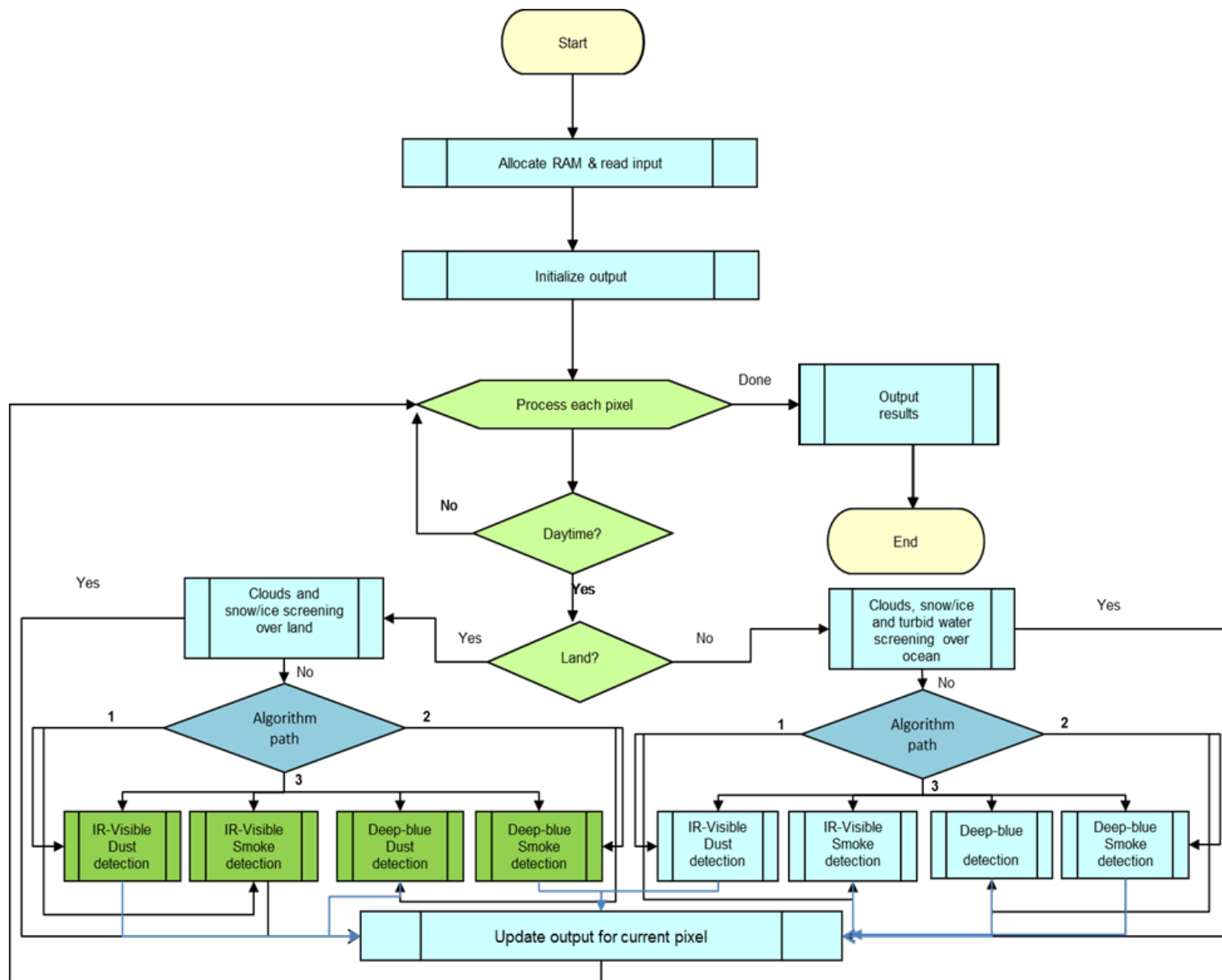
| Satellite | True positive | False positive | False negative | True negative | Accuracy | POCD | POFD |
|-------------|---------------|----------------|----------------|---------------|----------|------|------|
| S-NPP (NDE) | 4074 | 941 | 1230 | 9236 | 85.9 | 76.8 | 18.7 |

Dust

| Satellite | True positive | False positive | False negative | True negative | Accuracy | POCD | POFD |
|------------|---------------|----------------|----------------|---------------|----------|------|------|
| S-NPP(NDE) | 557 | 446 | 166 | 1872 | 79.8 | 77.0 | 44.0 |

Requirement of Correct Detection

Dust 80% over land; 80% over ocean
Smoke 80% over land; 70% over ocean

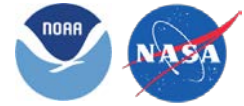


| Confidence Flag | Criteria |
|-----------------|---|
| High | Confidence Value > 0.5 |
| Medium | $0.25 < \text{Confidence Value} < 0.5$ |
| Low | Confidence Value < 0.25 Pixel adjacent to cloud Turbid water Bright pixel Pixel adjacent to snow/ice Cloud shadow Glint |
| No Retrieval | Cloud Snow/ice |

No screening for large solar/satellite zenith angles (values are provided in output for users). We are revising the way we do quality flags for the next algorithm update



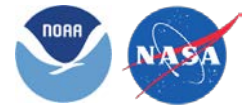
Documents (Check List)



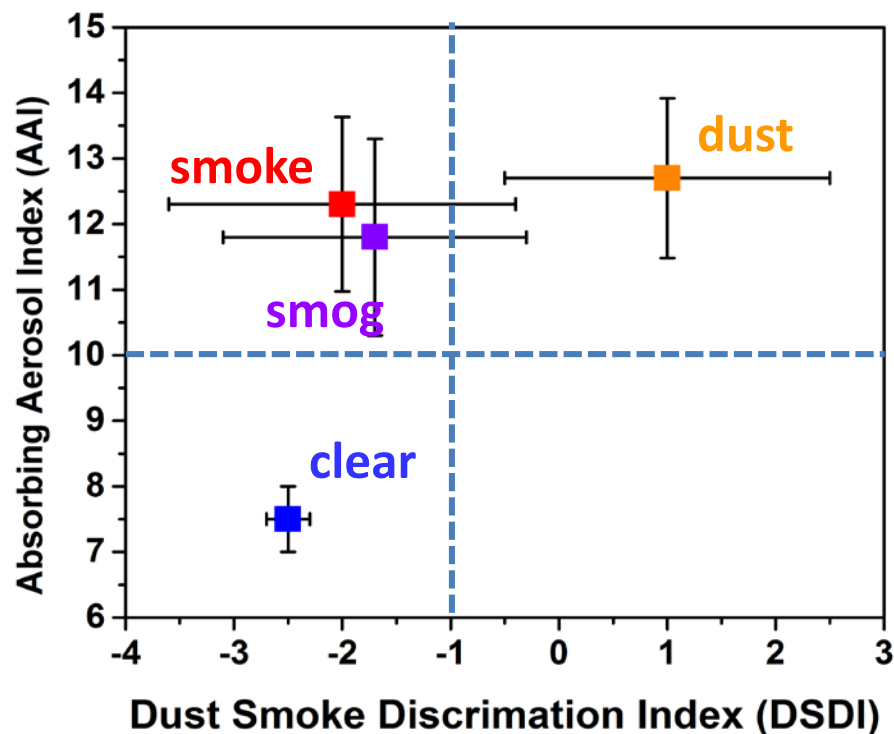
| Science Maturity Check List | Yes ? |
|---|-----------------------------------|
| ReadMe for Data Product Users | Yes (NOAA-20) |
| Algorithm Theoretical Basis Document (ATBD) | Yes (Suomi NPP) |
| Algorithm Calibration/Validation Plan | Yes (Suomi NPP) |
| (External/Internal) Users Manual | Yes |
| System Maintenance Manual (for ESPC products) | Yes |
| Peer Reviewed Publications (Demonstrates algorithm is independently reviewed) | Yes (MODIS) |
| Regular Validation Reports (at least annually) (Demonstrates long-term performance of the algorithm) | JPSS Annual Meeting presentations |



Summary and path forward

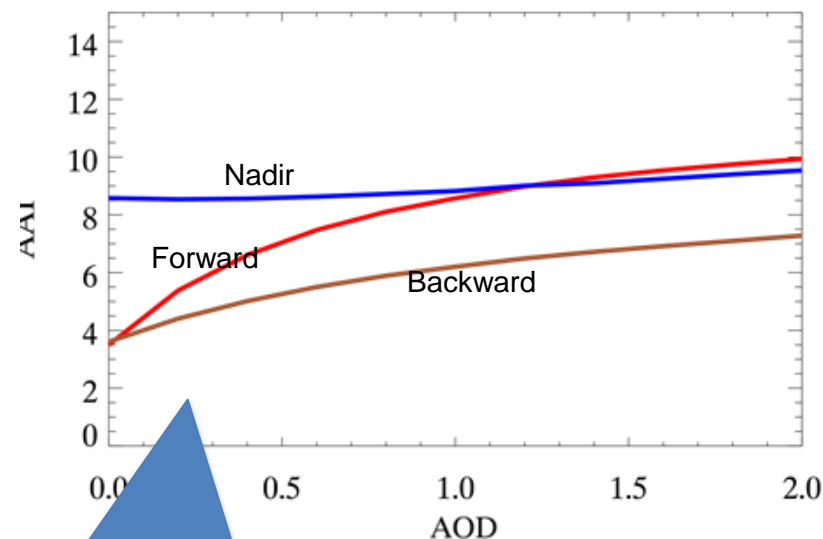
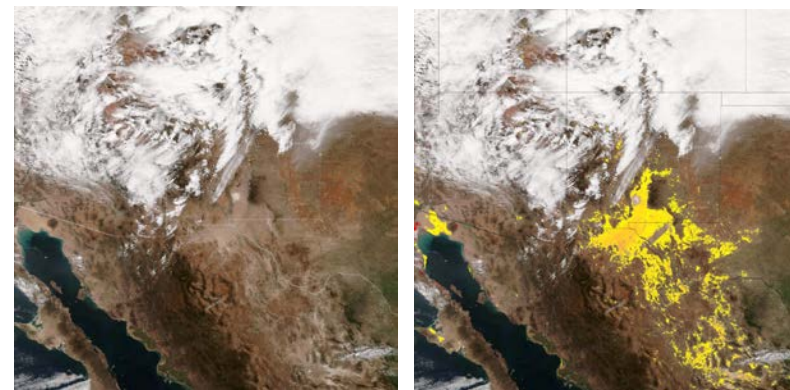


- Disclaimer: NOAA-20 ADP product evaluation is based on off-line runs using IDPS Cloud Mask
- NOAA-20 ADP product **meets requirements** for dust and smoke, based on CALIPSO comparisons
- NOAA-20 ADP product **does not meet** requirements (NOT EXPECTED) based on AERONET comparisons. Reasons: (1) AERONET dust/smoke identification is also based on classification and thus not as accurate as CALIPSO, (2) Number of matchups with AERONET are limited, (3) matchup criteria too strict
- False dust detections have been identified over bright surfaces when satellite observes the Earth in nadir view
 - Algorithm updates to minimize false detections are forthcoming
 - Updates will be implemented for both SNPP and NOAA-20
- AerosolWatch website will incorporate NOAA-20 active fires, ADP, and AOD products as soon as they become provisional.



$$AAI = -100 \left[\log_{10} \left(\frac{R_{0.41}}{R_{0.44}} \right) - \log_{10} \left(\frac{R'_{0.41}}{R'_{0.44}} \right) \right]$$

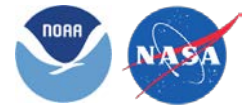
$$DSDI = -10 \log_{10} \left(\frac{R_{0.41}}{R_{2.2}} \right)$$



Theoretical calculations of AAI for three scenes corresponding to nadir, forward, backward scattering geometries



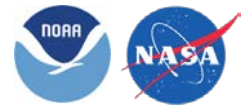
Path Forward/Algorithm Updates



- Further analysis of the data by stratifying the product over land and over water
- Thresholds for various tests specific to NOAA-20 VIIRS as it is in a different orbit (different geometry) and some minor differences in SRFs (*see Laszlo presentation*)
 - Requires several months/at least a year worth of data to do the analysis
- Algorithm changes to IR-Visible part of the algorithm
 - Based on GOES-R (IR-Visible) experience, mainly the way confidence values are estimated
 - If multiple tests are needed to determine dust/smoke and only one test passes, report confidence based on that test. This change will increase the detections
 - Equal weight given to all spectral tests. Use only the most important test in determining confidence value
- Combine solar/satellite zenith angle criteria with confidence flags
- In nadir view geometry, rely on IR-Visible part of the algorithm to minimize false positives



Backup Slide



Example for Calculation of Confidence Level of Dust detection

Deep Blue path

Test1: $AAI \geq \text{threshold1}$

Test2: $DSDI \geq \text{threshold2}$

Confidence values:

$$\text{con_value}_{db} = \frac{\text{con_value}(\text{Test1}) + \text{con_value}(\text{Test2})}{2}$$

For each test, con_value is determined as following:

If $(\text{value} - \text{threshold}) < \text{value}_1$ then $\text{Con_value} = 0.0$

If $\text{value}_1 \leq (\text{value} - \text{threshold}) < \text{value}_2$ then $\text{Con_value} = 0.5$

If $(\text{value} - \text{threshold}) \geq \text{value}_2$ then $\text{Con_value} = 1.0$

value_1 is 5% of threshold, value_2 is 30% of threshold

IR- Visible path

Test 1: $BT_{M15} - BT_{M16} \leq -0.2K$

Test 2: $BT_{M12} - BT_{M15} \geq 15K$

Confidence values:

$$\text{con_value}_{IR_vis} = \frac{\text{con_value}(\text{Test1}) + \text{con_value}(\text{Test2})}{2}$$

For each test, con_value is determined as following:

If $(\text{value} - \text{threshold}) < \text{value}_1$ then $\text{Con_value} = 0.0$

If $\text{value}_1 \leq (\text{value} - \text{threshold}) < \text{value}_2$ then $\text{Con_value} = 0.5$

If $(\text{value} - \text{threshold}) \geq \text{value}_2$ then $\text{Con_value} = 1.0$

value_1 is 5% threshold, value_2 30% of threshold

Ensemble confidence values:
 $\text{con_value}_{db} + \text{con_value}_{IR_Vis}$

high confidence
confidence value > 0.5

Medium confidence
 $0.25 < \text{confidence value} \leq 0.5$

low confidence
confidence value ≤ 0.25

1. Cloud adjacency
2. Turbid water
3. Bright pixel
4. Adjacent to snow/ice pixels
5. within sunglint
6. Cloud shadow