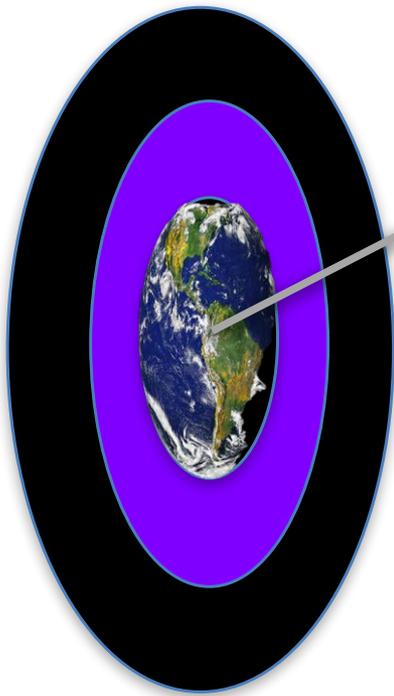


The Dark Target aerosol retrieval algorithm: From MODIS to VIIRS (and beyond)

Robert C. Levy (NASA-GSFC) and the "Dark-Target" retrieval team



At GSFC Building #33:

Shana Mattoo, Virginia Sawyer, Rich Kleidman (SSAI)
Yingxi Shi (USRA), Yaping Zhou (MSU)
Lorraine Remer (UMBC)

Now at NASA – Marshall

Pawan Gupta and Falguni Patadia (USRA)

Outside of #33:

Folks at University of Atmos-SIPS (Wisconsin)

Folks at MODAPS (GSFC)



GCOS Aerosol CDR* Requirements



CDR = Climate Data Record

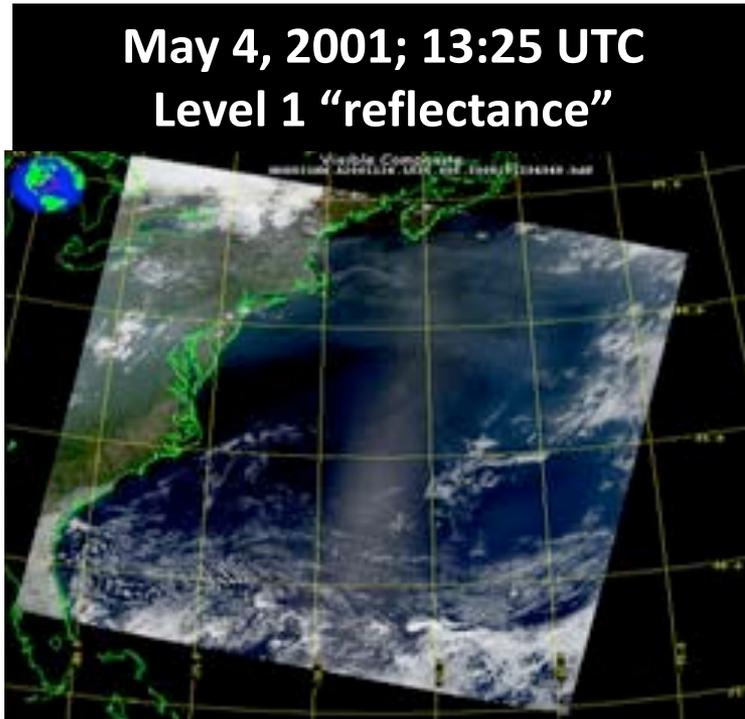
For Aerosol Optical Depth (AOD):

Target metric	Target
Horizontal Resolution	5-10 km, globally
Accuracy	MAX(0.03 or 10%)
Stability / bias	<0.01 / decade
Time Length	30+ years
Temporal Resolution	4 h

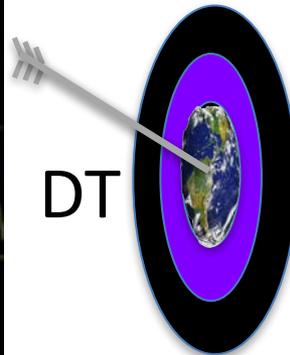
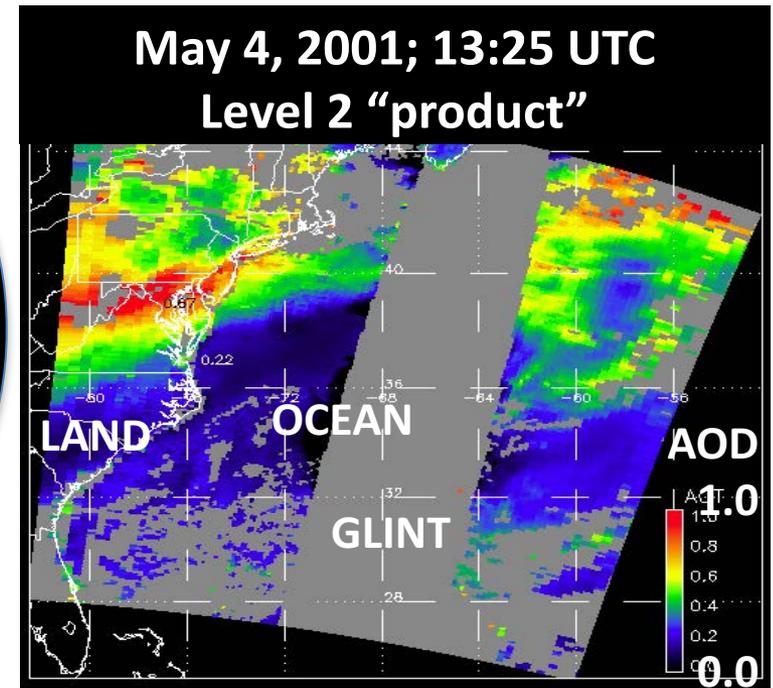
These are requirements for “climate” monitoring
Maybe different requirements for other applications
(air quality, ocean fertilization, weather forecasting...)

Dark-Target: A “Single View” aerosol algorithm

What a sensor observes



Attributed to aerosol (AOD)



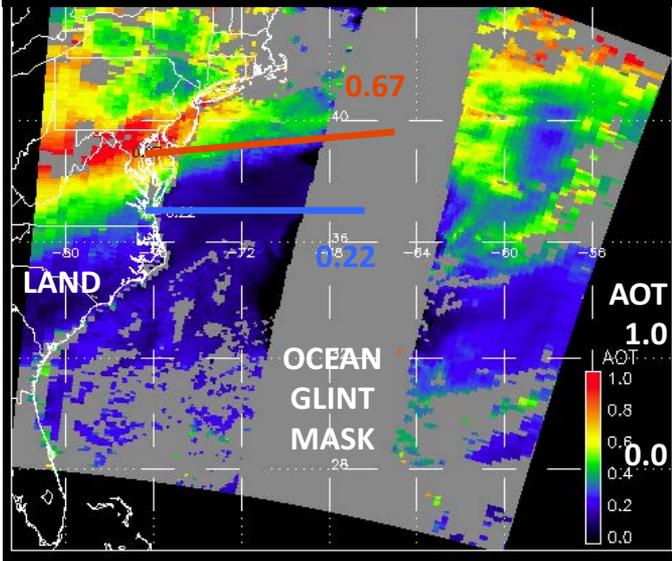
“Established 1997” by Kaufman, Tanré, Remer, etc) for MODIS
“Modified 2005, 2010, 2013, 2015” by Remer, Levy, Gupta, etc

Separate logic over land and ocean
Retrieve: AOD at 0.55 μm , spectral AOD, etc
Can run in near-real-time (NRT; takes 2 minutes)

So where are we?

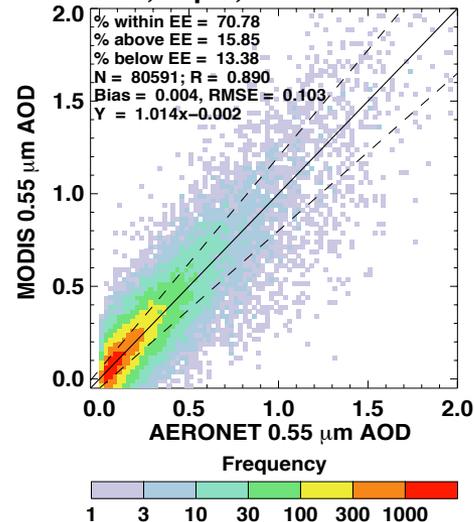
MODIS C6 product (ended 2017)

May 4, 2001; 13:25 UTC
Level 2 “Granule”

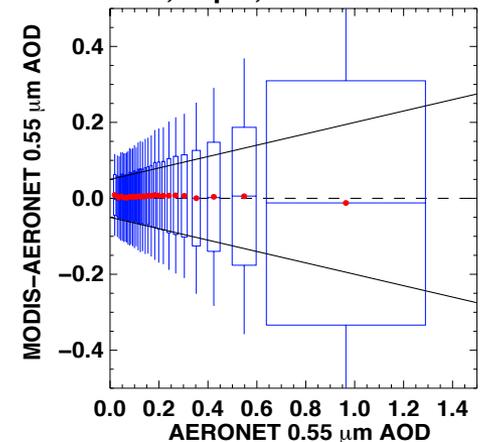


- Compare both land and ocean products to AERONET, separately
- Validation: 66% are within “Expected Error” (EE) defined as
 - Land: $\pm(0.15\tau + 0.05)$
 - Ocean: $\pm(0.10\tau + 0.04)$

C6 Land, Aqua, Mar 2003–Feb 2013



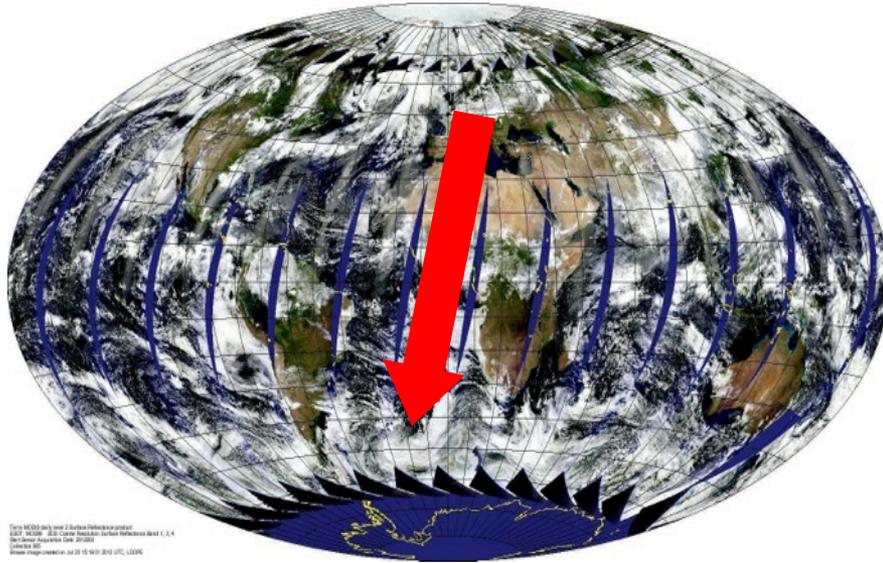
C6 Land, Aqua, Mar 2003–Feb 2013



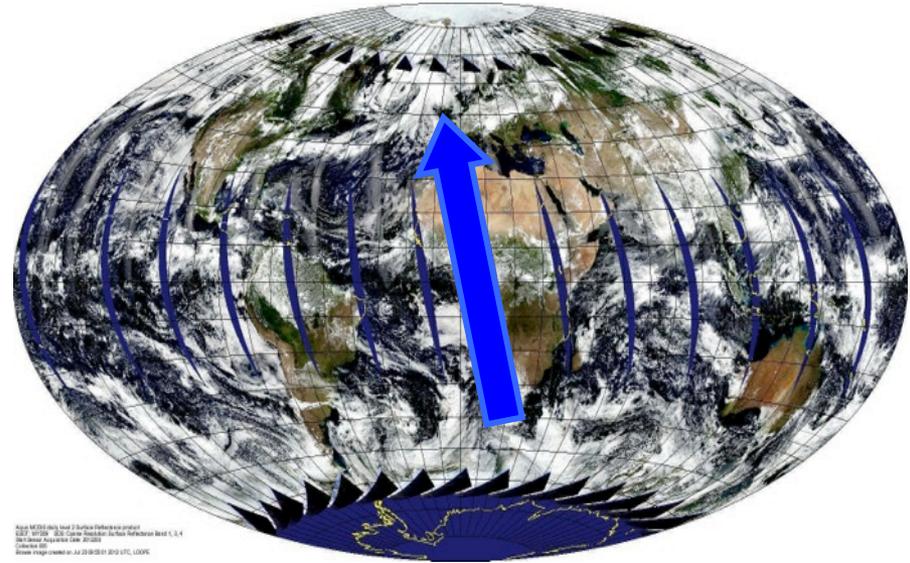
- getting close to CDR accuracy requirements!

MODIS-Terra vs MODIS-Aqua

Terra (10:30, Descending)



Aqua (13:30, Ascending)

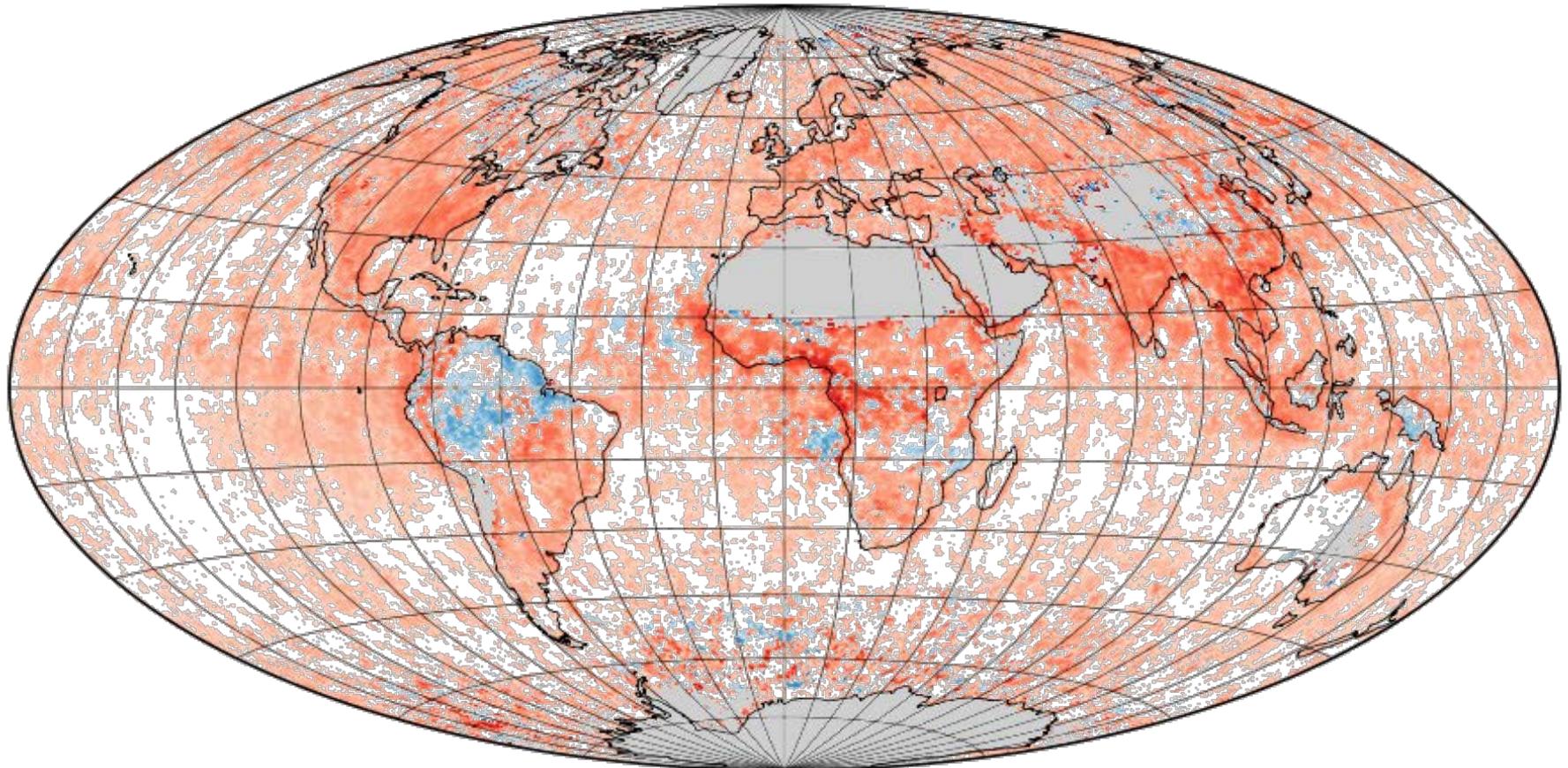


The two MODIS instruments are **TWINS!**
Do they observe the world in the same way?

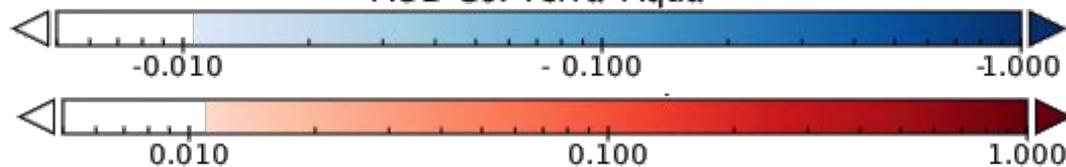
Levy, R. C., et al.: Exploring systematic offsets between aerosol products from the two MODIS sensors, *Atmos. Meas. Tech.*, 11, 4073-4092, 2018.

C6: Terra-Aqua (DT) had global offset of 0.015 (13%)

DT AOD at 0.55 micron: 2008, C6, Terra-Aqua

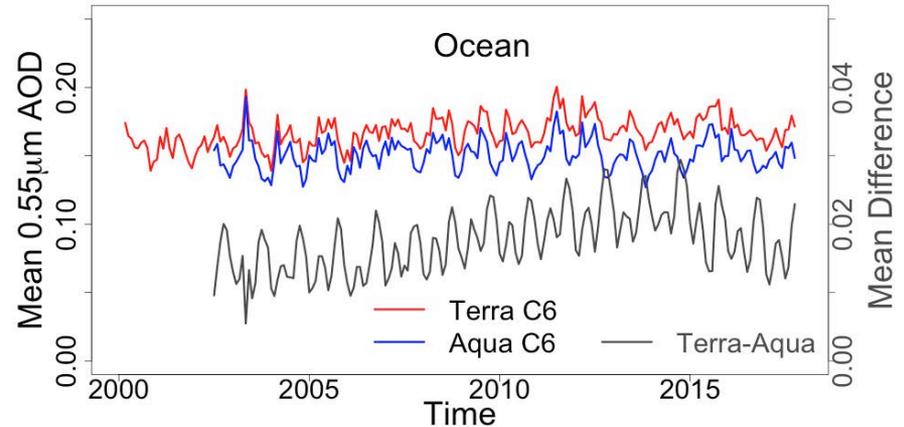
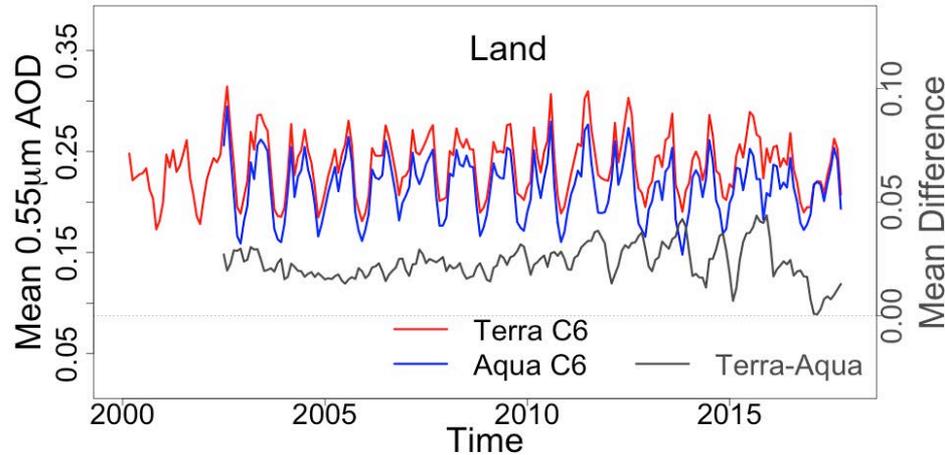


AOD C6: Terra-Aqua



Data Min = -2.024, Max = 3.251, Mean = 0.015

C6: And the offset drifted...

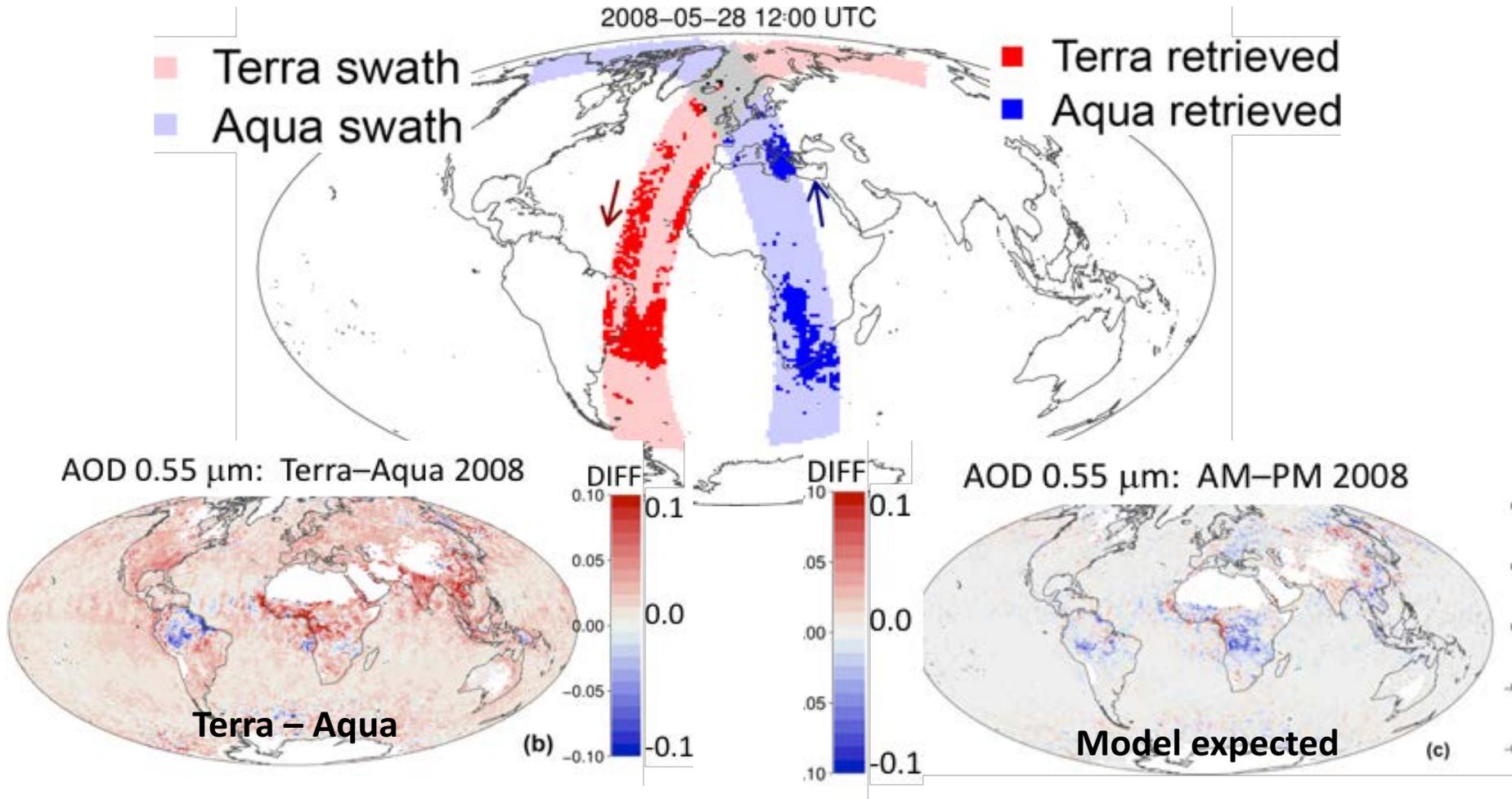


- Terra-Aqua global offset of $\Delta\tau = \sim 0.01-0.02$
- $\Delta\Delta\tau$ is unphysical
- Seasonal pattern/differences were larger in later years (post 2011).

Using “model” did not explain AOD offset

MERRA-2 (replay) sampled at 12:00 UTC on May 25, 2008

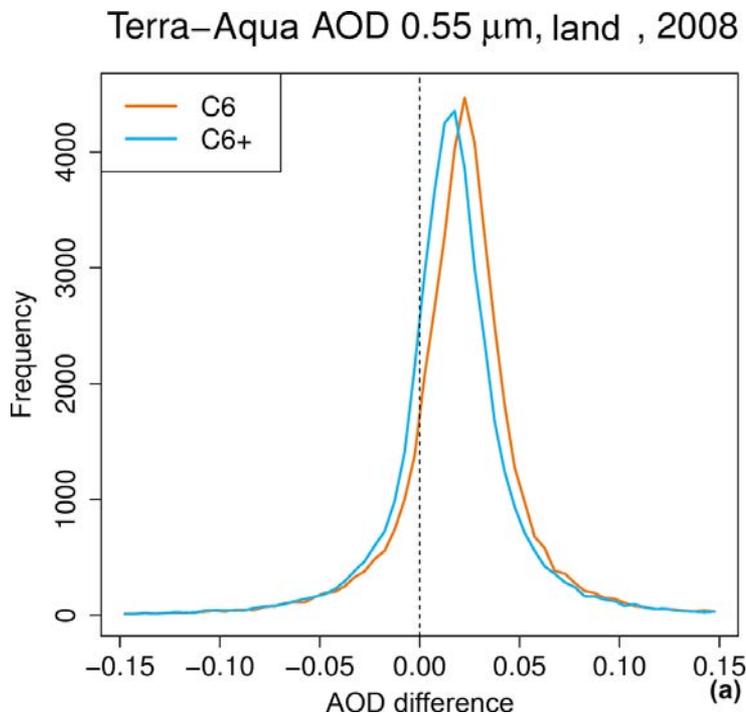
Overpasses within ± 30 minutes



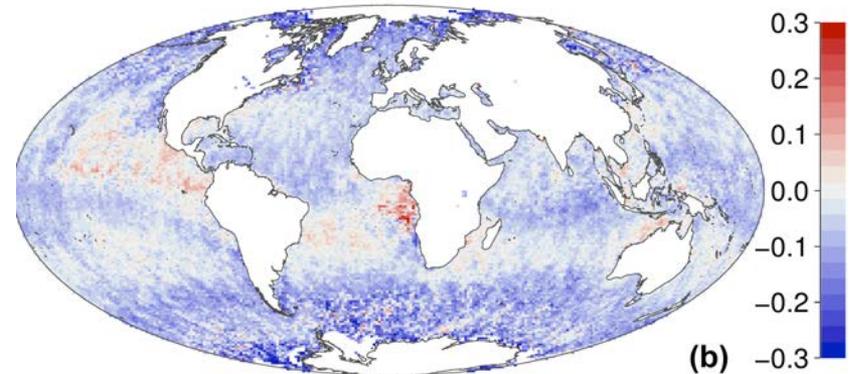
Some similarities in “smoke” regions

Additional calibration “C6+” helped (a bit)

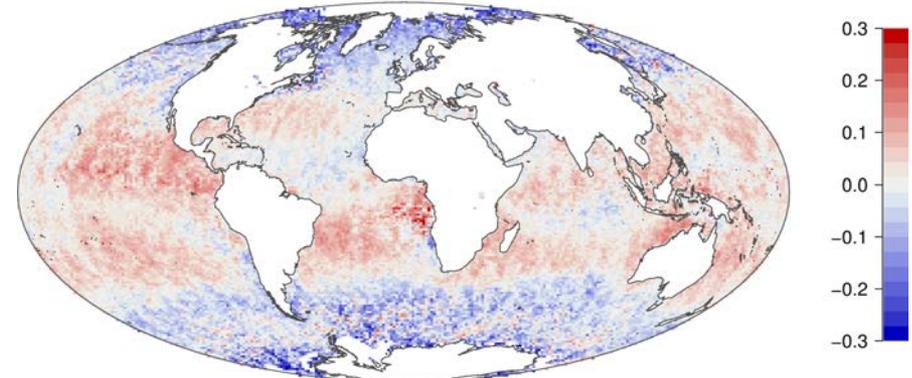
- Over land, AOD offset is reduced (by 0.005)
- Over ocean, negligible change in AOD offset



C6 Terra–Aqua Ångström exponent, 2008



C6+ Terra–Aqua Ångström exponent, 2008

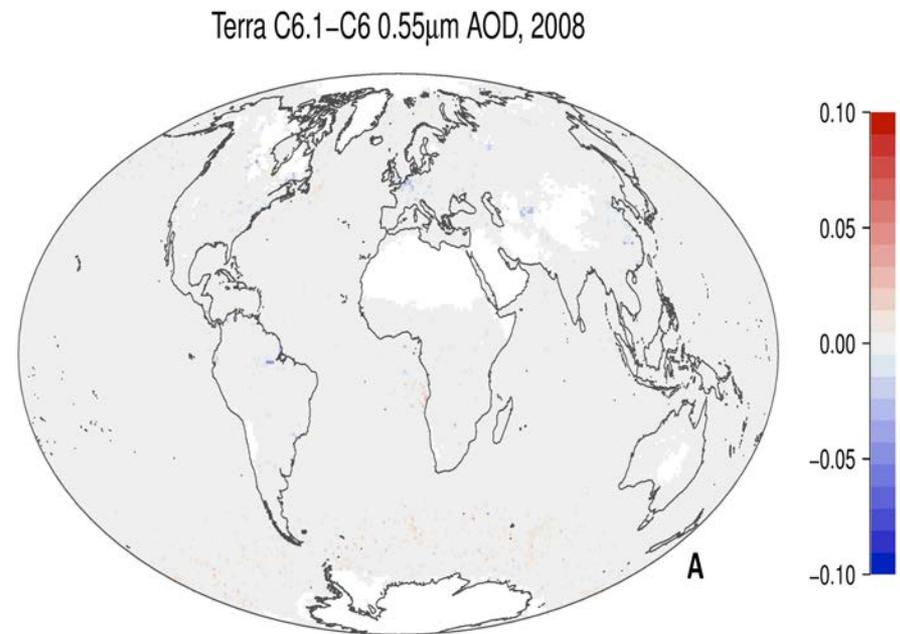


- For AE, C6+ reduces negative offset

What about Collection 6.1 ?

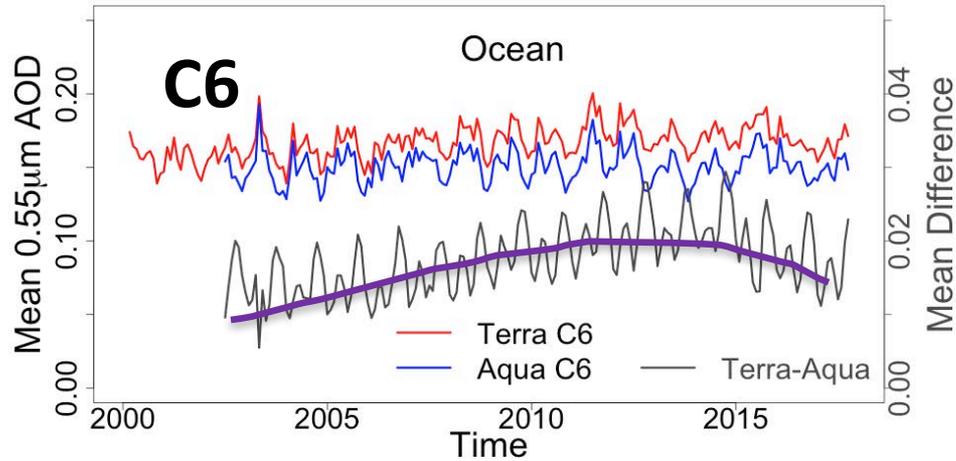
Processing began October 2017

- C6.1 was primarily focused on mitigating thermal infrared drifts and impact on cloud masking
- For DT algorithm, C6.1 included:
 - Correction for bias over urban surfaces
 - Improvement of under-water sediment screening
 - "reaction" to changes in upstream MxD35 cloud mask
 - Some bug fixes related to diagnostics
- DT 6.1 – 6.0: Changes on a global scale? = **Nada!!!**

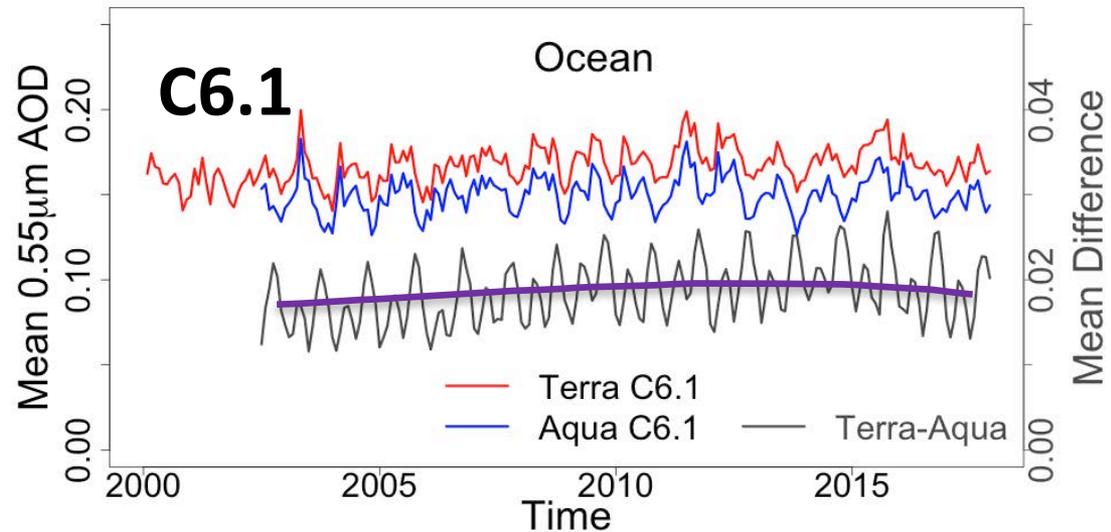


(modis-atmosphere.gsfc.nasa.gov/documentation/collection-61)

C6.1 reduces the global T – A drift!

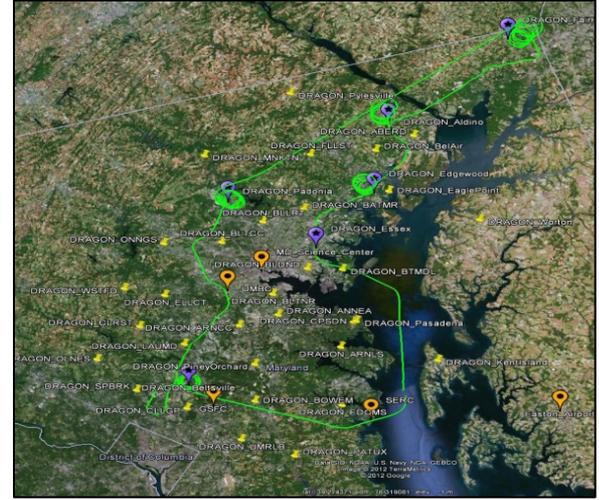
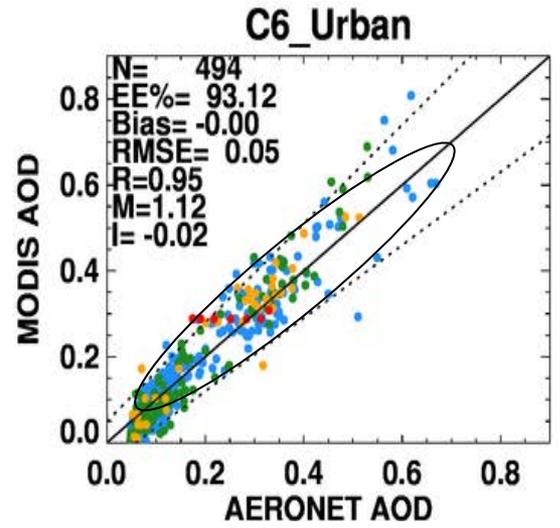
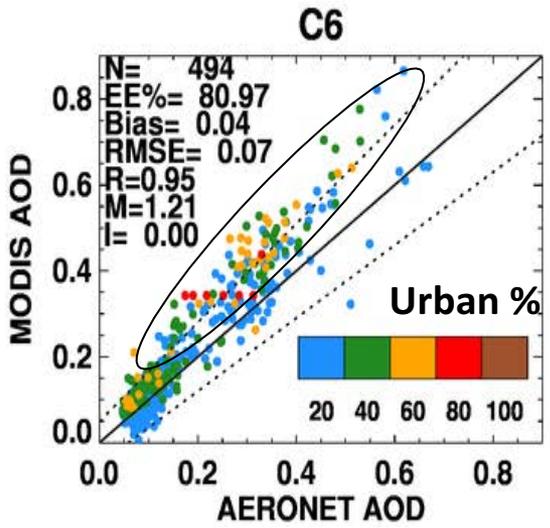


VS



Urban Retrievals in MODIS 6.1

(DISCOVER-AQ, Summer 2011 in Maryland, USA)

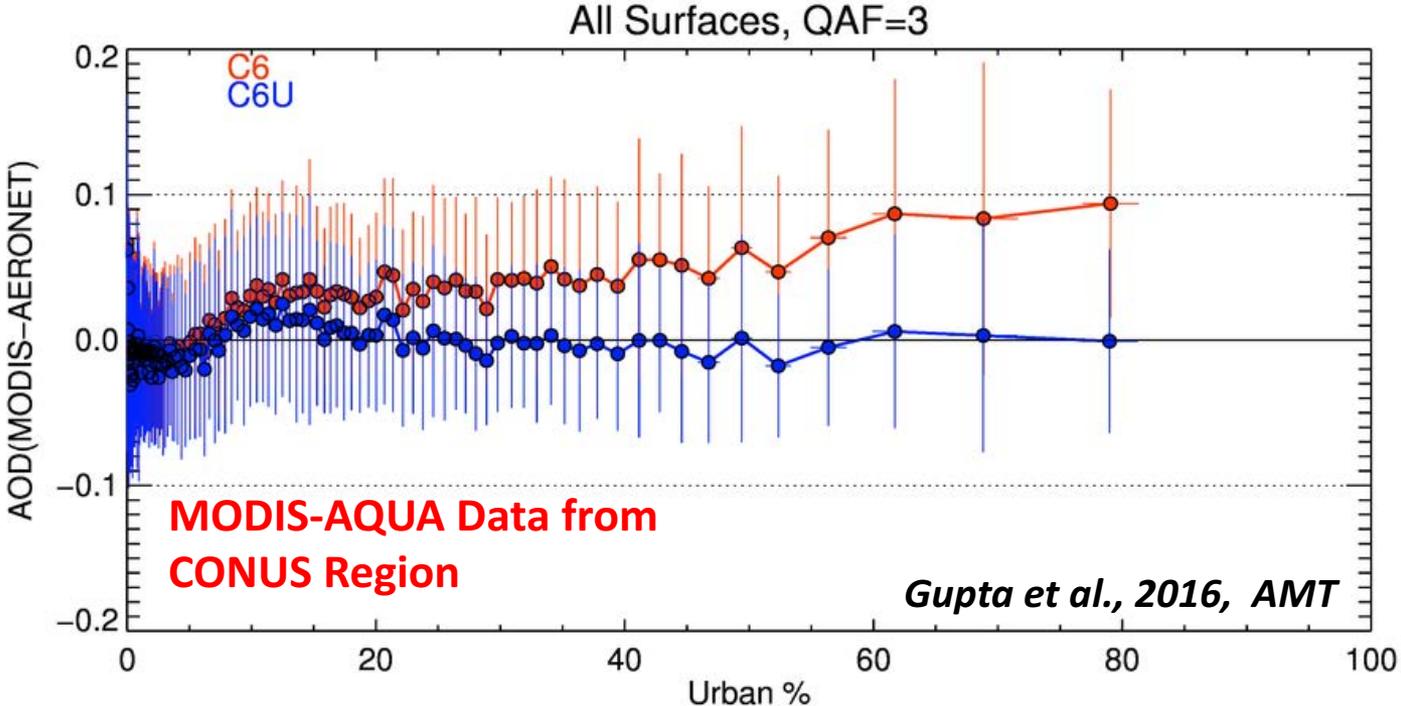


Surface reflectance correction as a function of urban %

→ Significant reduction in AOD bias

Implemented in C6.1

Is local, will not affect Terra-Aqua difference



What about Future MODIS?

(“Maintenance Mode”)

- Our MODIS work is now under Senior Review since late 2017.
- We are funded for “maintenance”. Under this umbrella we are/will:
 - do a comprehensive validation of C6.1.
 - If there is new upstream calibration, we will test if removes Terra-Aqua offset
 - Continue working with users
 - Extract DT algorithm from historic ‘MODIS Toolkits’ so can be run independently of MODAPS
- TBD whether new ‘versions’ (e.g. C6.2) or ‘collections’ (e.g. C7).

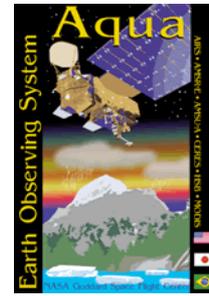
Aerosol Optical Depth (AOD) from MODIS 6.1:

Target metric	Target	Current with MODIS
Horizontal Resolution	5-10 km, globally	10 km over ice-free and cloud-free scenes (No desert for DT)
Accuracy	MAX(0.03 or 10%)	±(0.04+10%): Ocean ±(0.05+15%): Land
Stability / bias	<0.01 / decade	Nearly stable trends, but offsets still
Time Length	30+ years	20 years and counting
Temporal Resolution	4 h	2+ / day (Terra + Aqua)

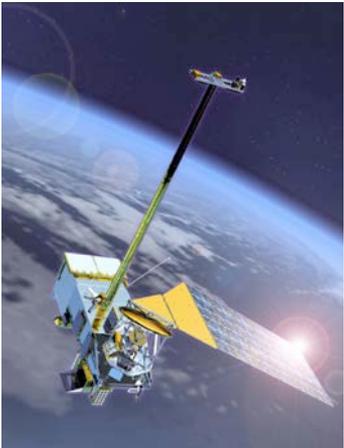
Key: Black = almost there, Blue = on the way, Red = not close or unknown

How do we get closer?

Beyond MODIS



- Terra (18) and Aqua (16) have both exceeded their planned mission lifetimes.
- With luck, they will last until early 2020s.
- But for climate, we need to continue the MODIS record over 30+ years



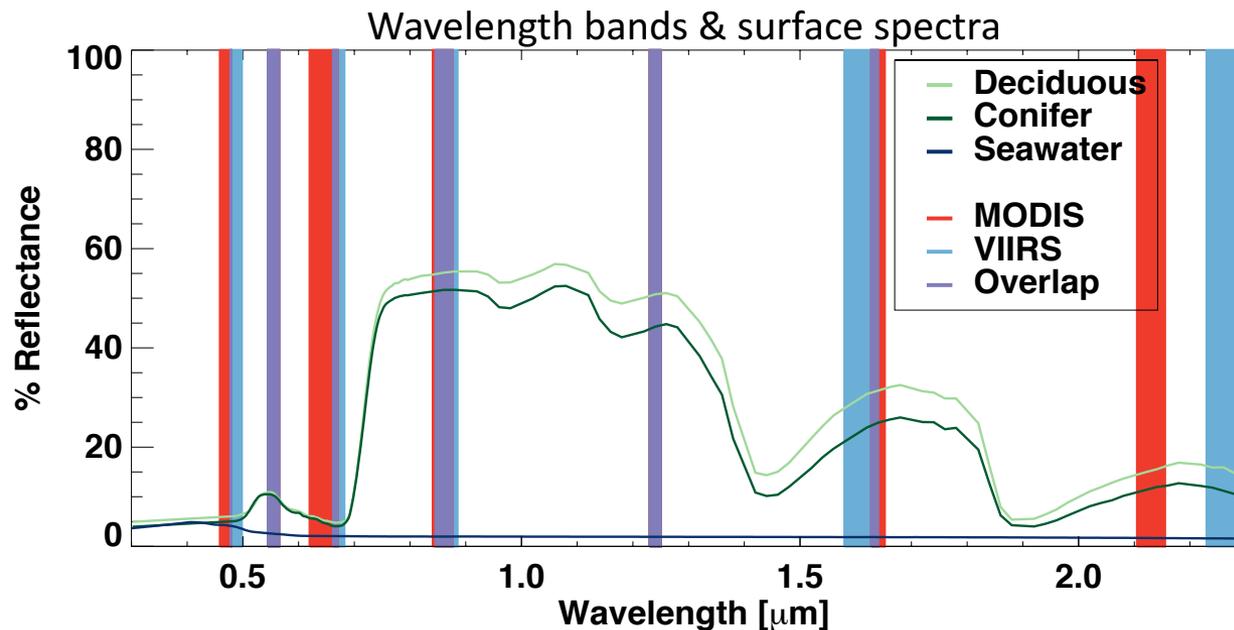
VIIRS!

Visible-Infrared Imager Radiometer Suite aboard Suomi-NPP (and future JPSS)

- The NOAA operational products are “too different” from MODIS for climate research.
- Both DT and DB algorithms are ported

To develop “continuity” we port algorithms! (Example: DT from MODIS → VIIRS)

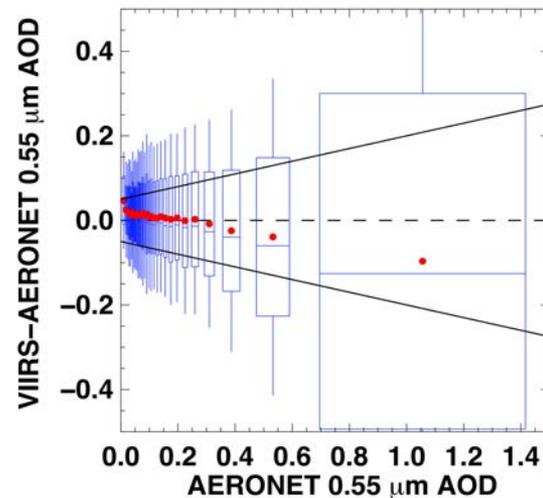
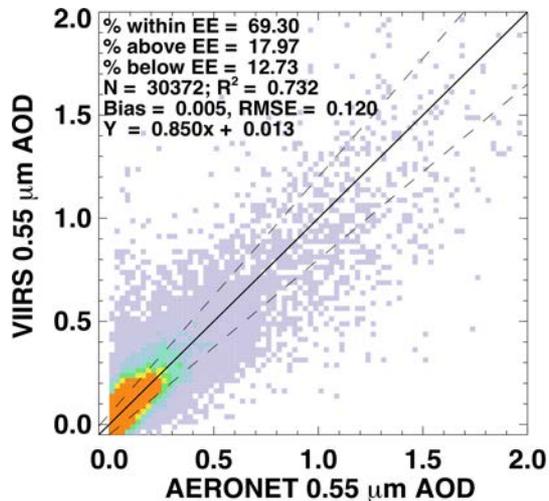
- Deal with differences in wavelengths (gas corrections/Rayleigh, etc)



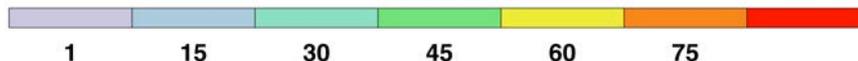
- Deal with differences in resolution, etc.
- Retrieve on VIIRS (compared with retrieval on MODIS):

NASA VIIRS Dark Target Products (2015)

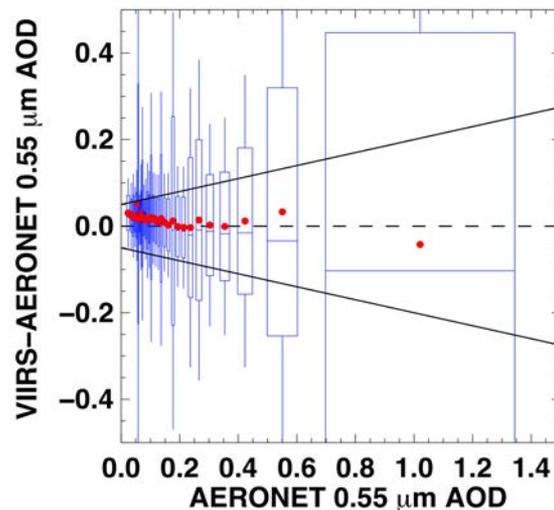
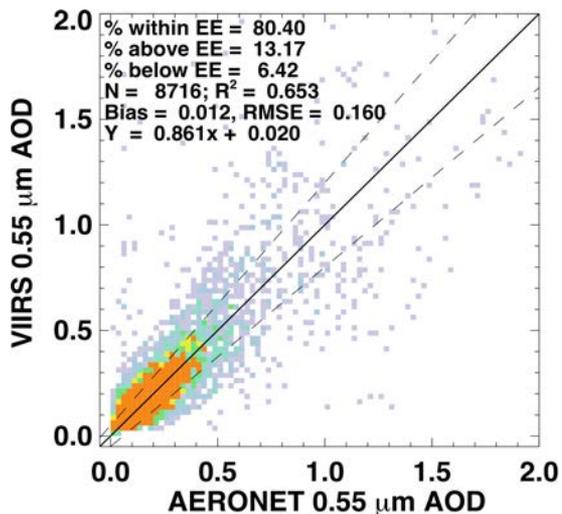
Land



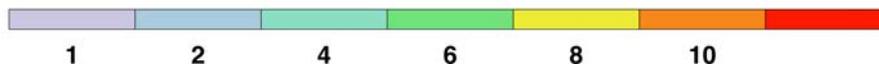
Frequency



Ocean

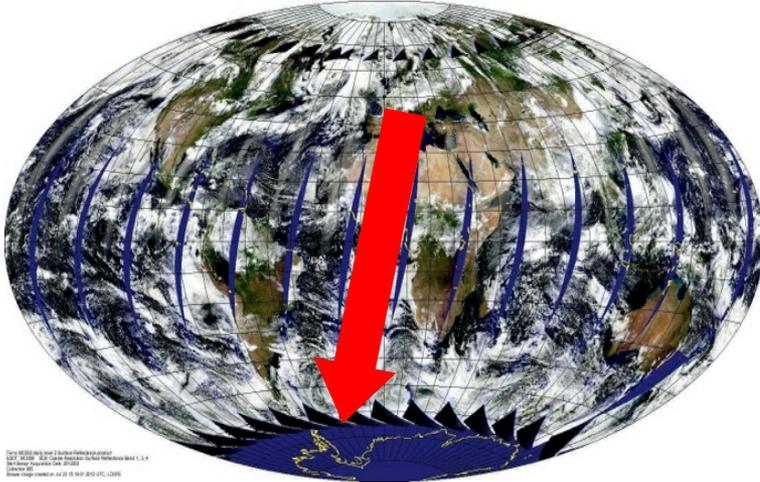


Frequency

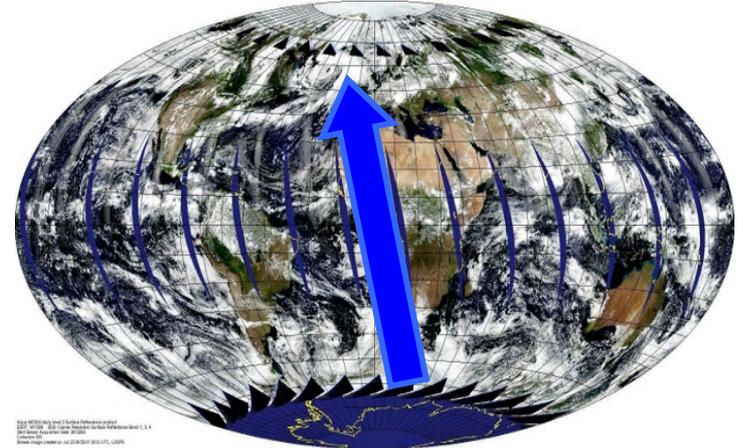


MODIS-Terra vs MODIS-Aqua vs SNPP-VIIRS

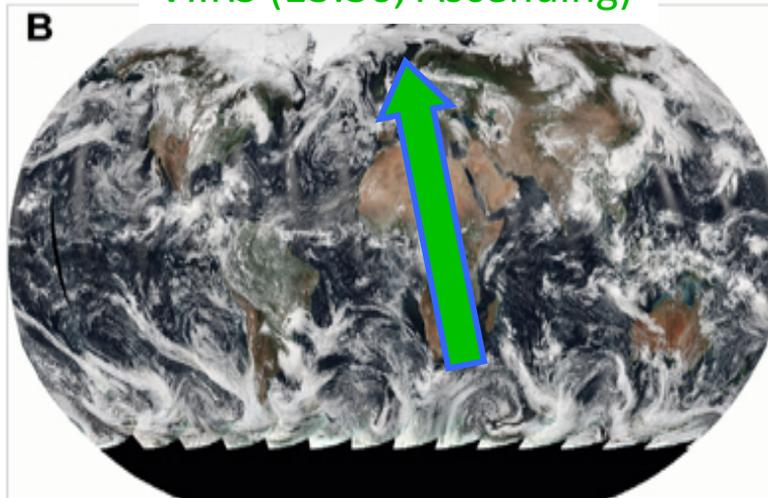
Terra (10:30, Descending)



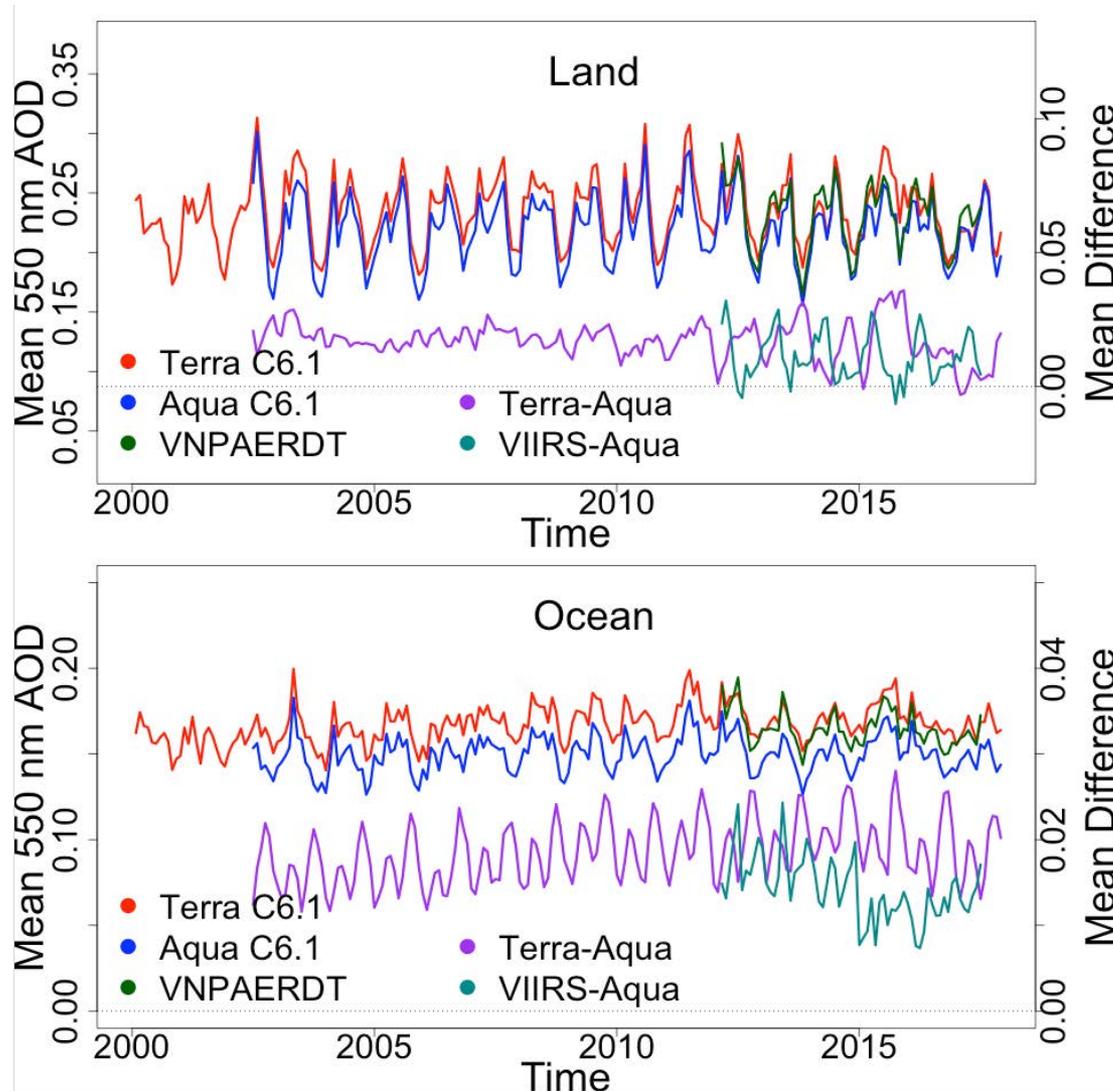
Aqua (13:30, Ascending)



VIIRS (13:30, Ascending)



MODIS-T vs MODIS-A vs VIIRS-SNP



VIIRS-SNPP has small offset compared to MODIS-Aqua but less than Terra
Also noting seasonal cycles are different (VIIRS vs Aqua compared to Terra vs Aqua)

Calibration is hard: "Match files

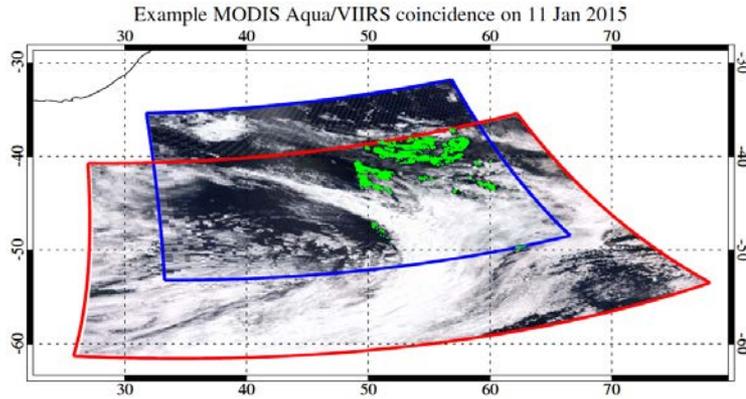
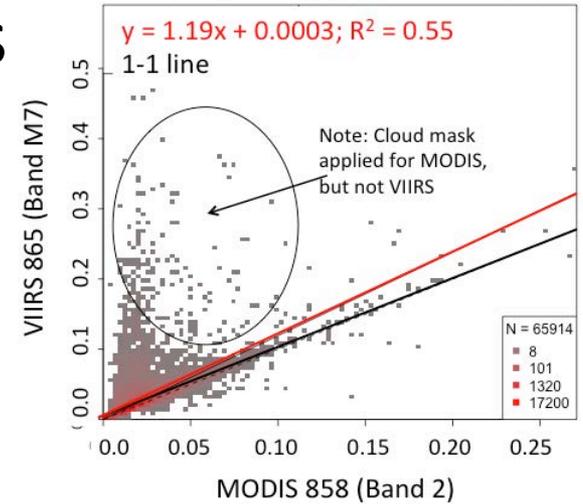
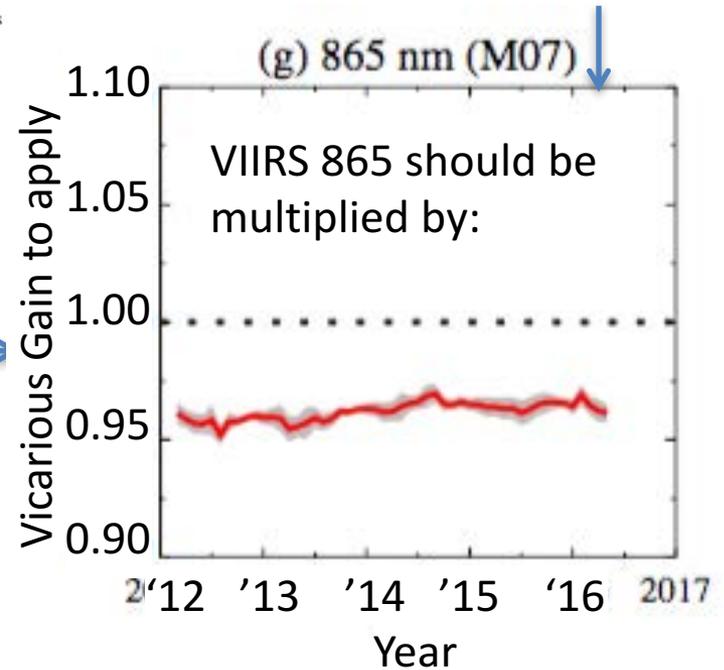
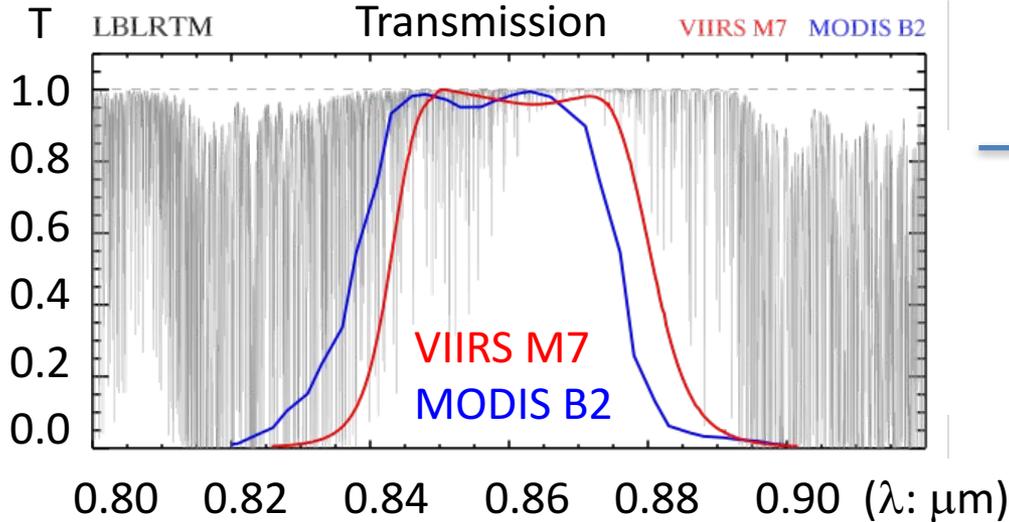


Figure 2. Example MODIS/VIIRS match up for two near-coincident granules (beginning one minute apart). The S-NPP VIIRS granule is outlined in red, and MODIS Aqua in blue. Suitable matched pixels are shown in green.

Reflectance: VIIRS vs MODIS
"Matched" data from 2014-2015



Example: 0.86 μm channel over "clear" sky



Sayer et al., AMT 2016
Meyer et al., this morning

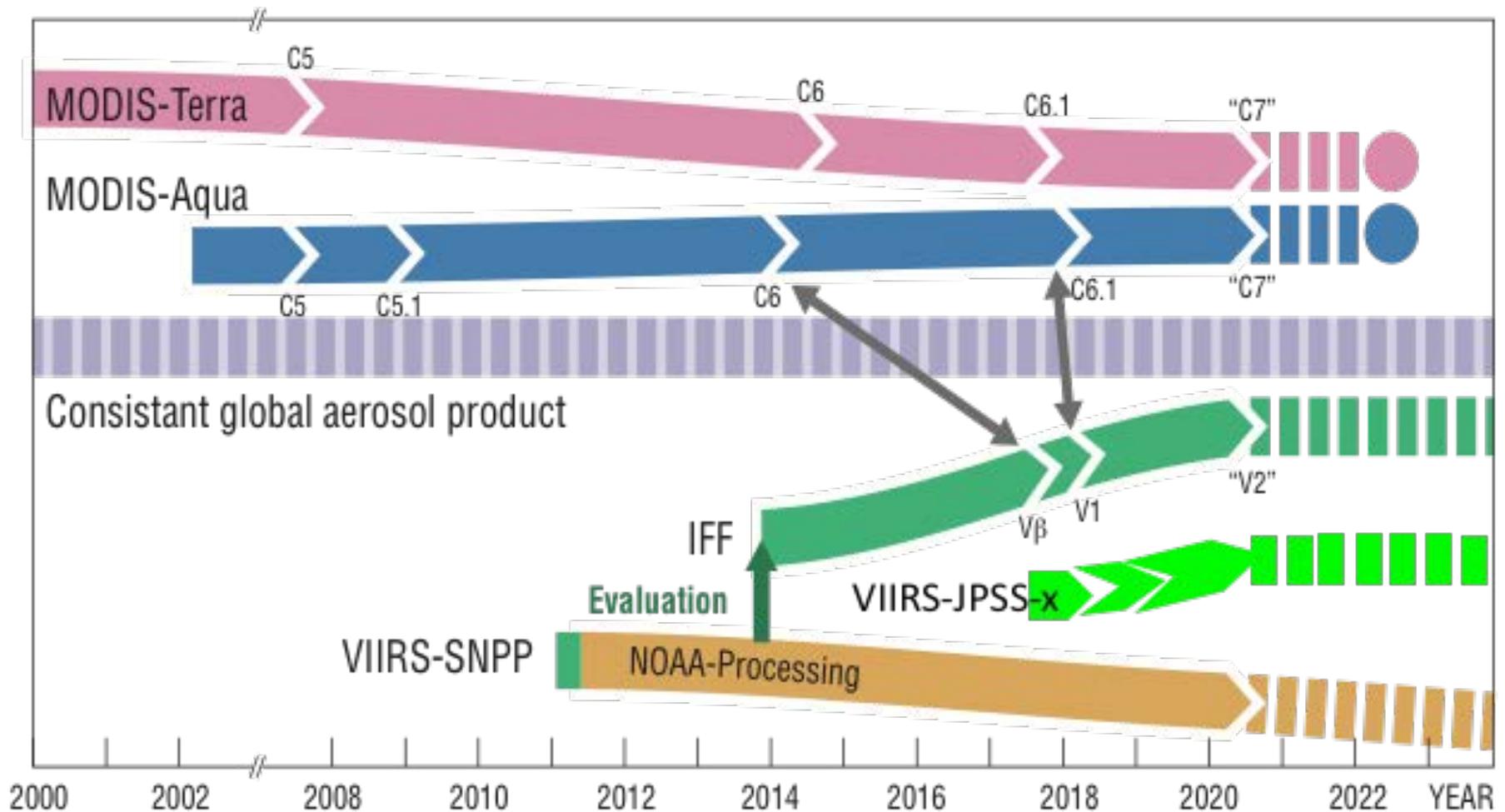
NASA VIIRS vs MODIS (DT)

Parameter	MxD04	AERDT_L2_VIIRS_SNPP
Mission length	Terra (2000-) 10:30 LST Aqua (2002-) 13:30 LST	SNPP (2012-) 13:30 LST JPSS1 (2017-) 13:30 LST
Pixel / Product size (km) nadir (Level 2)	0.5 km → 10 km	0.75 km → 6 km
Granule size (pixels)	5 minute (203x135)	6 minute (404x400)
File Format	HDF4	NetCDF4
Upstream cloud mask	MODIS Cloud mask = MxD35	MODIS-VIIRS Continuity Cloud Mask (MVCM)
Production	LAADS (at GSFC)	SIPS (at U Wisconsin)
Level 3	LAADS (files=MxD08)	SIPS (files = TBD, \$\$\$?)
Public Archive	LAADS (at GSFC)	?????* Pending \$\$\$

VIIRS-SNPP Dark Target schedule/status

- We currently have no funding for this work.
But leveraging MODIS maintenance and other projects.
- Previous testing of VIIRS DT have used Wisconsin's Intermediate File Format (IFF).
- **Current delivered version uses NASA's Level 1B (verified)**
- This "Version 2.0.1" will assume:
 - NASA L1B (calibration),
 - upstream Level 2 (MODIS-VIIRS Continuity cloud mask - MVCCM),
 - Ancillary data = same as MODIS
- **Products (AOD at 0.55 μm , FMW, AE, QA-Confidence, input reflectances, etc.) are identical to MODIS.**
- Plan for re-processing the entire mission (2011-present)
- If there is revised upstream calibration, we can test it.
- Uncertain about what to do with Level 3 (L3)

Towards consistent global aerosol using DT



VIIRS on SNPP (and beyond) should include all updates (e.g. 6.1) for MODIS.

Compared to GCOS requirements

For Aerosol Optical Depth

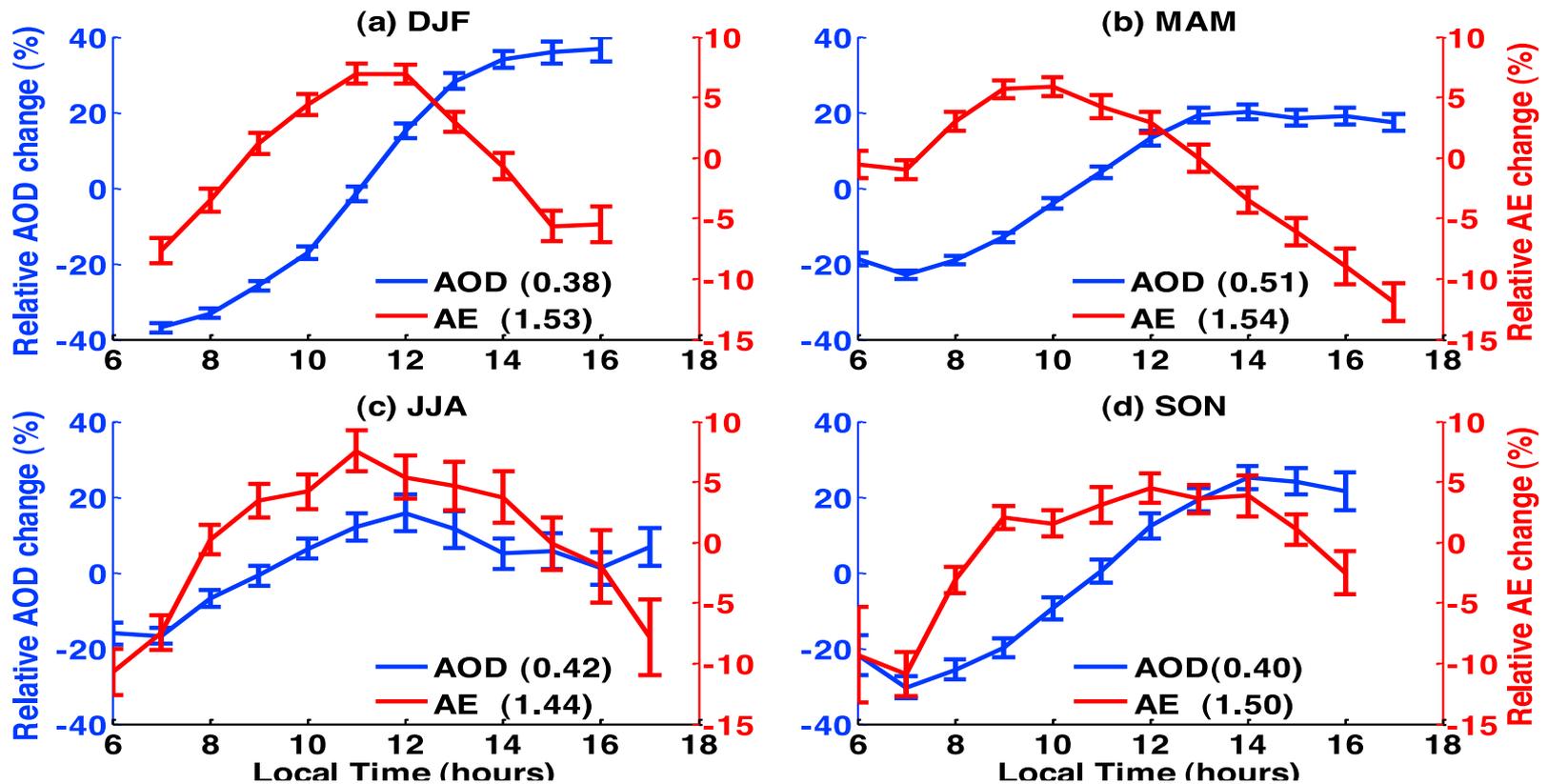
Target metric	Target	Current with MODIS
Horizontal Resolution	5-10 km, globally	≤10 km over ice-free and cloud-free scenes (No desert for DT)
Accuracy	MAX(0.03 or 10%)	±(0.04+10%): Ocean ±(0.05+15%): Land
Stability / bias	<0.01 / decade	Nearly stable trends, but offsets still
Time Length	30+ years	Can do with MODIS + VIIRS
Temporal Resolution	4 h	2+ / day (Terra + Aqua/VIIRS)

- JPSS-1 launched (November 2017), and is in SAME ORBIT as S-NPP!
- JPSS-2, 3 and 4 to launch between 2022, 2026 and 2031.

What's still missing?

Breaking the Temporal Barrier!

% deviation in hourly **AOD** and **AE** relative to the daily means in Mexico City.

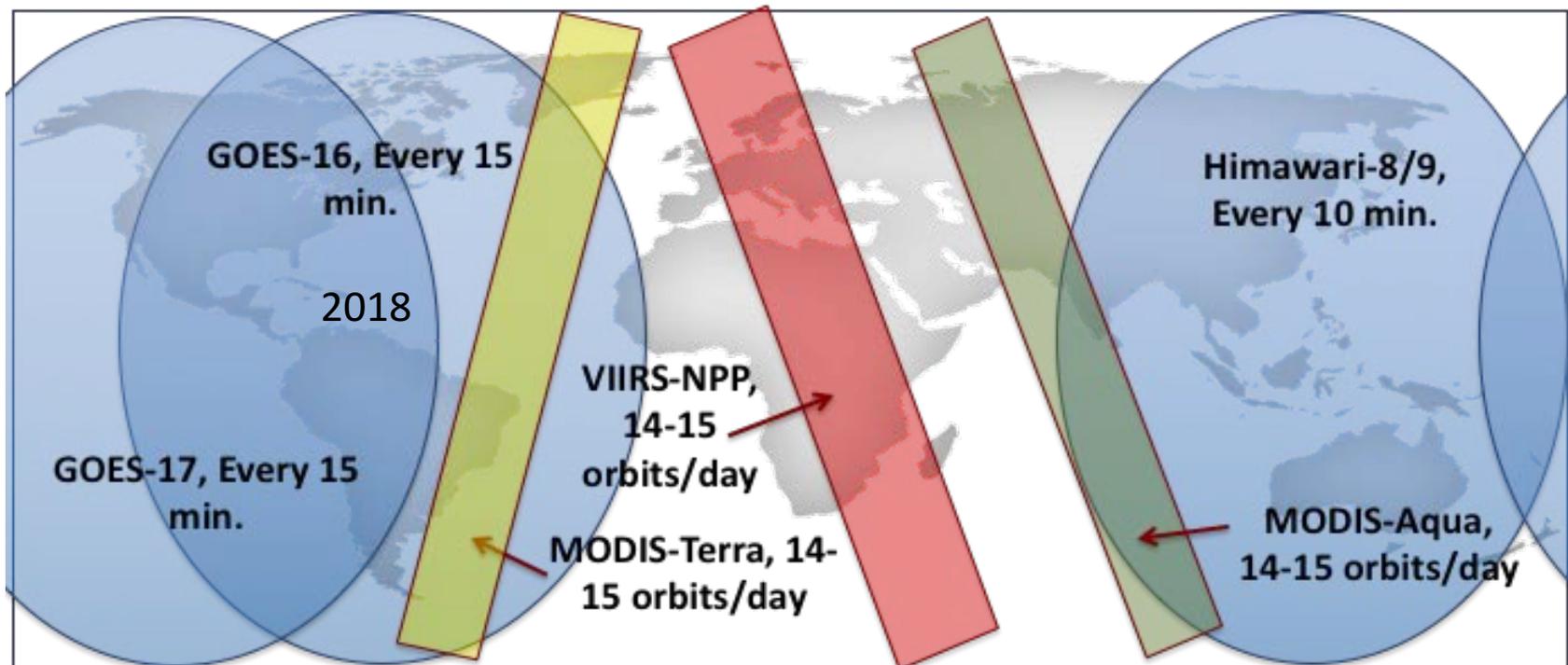


From: Zhang, Y., Yu, H., Eck, T. F., et al. (2012). Aerosol daytime variations over North and South America derived from multiyear AERONET measurements, *J. Geophysical Research*.

Global/Regional/Temporal synergy with **A consistent DT algorithm?**

Statistics of UTC (compare with model)

Statistics of LST (understand local diurnal cycle)



Subject of a recently funded NASA – MEaSUREs project

(with Co-Is = Min Oo, Jennifer Wei, Shobha Kondragunta, Lorraine Remer, Pawan Gupta)

Port DT algorithm to GEO!

Spectral/Spatial: AHI / ABI \approx MODIS / VIIRS

	MODIS	VIIRS	AHI	ABI
Blue	0.47/0.5	0.49/0.75	0.47/1.0	0.47/1.0
Green	0.55/0.5	0.55/0.75	0.51/1.0	
Red	0.66/0.25	0.67/0.75	0.64/0.5	0.64/0.5
NIR	0.86/0.25	0.86/0.75	0.86/1.0	0.86/1.0
NIR	1.24/0.5	1.24/0.75		
Cirrus	1.38/0.5	1.38/0.75		1.38/2.0
SWIR	1.61/0.5	1.61/0.75	1.61/2.0	1.61/1.0
SWIR	2.11/0.5	2.25/0.75	2.25/2.0	2.25/2.0

Some details need to be worked out (e.g. lack of “cirrus” band on AHI);

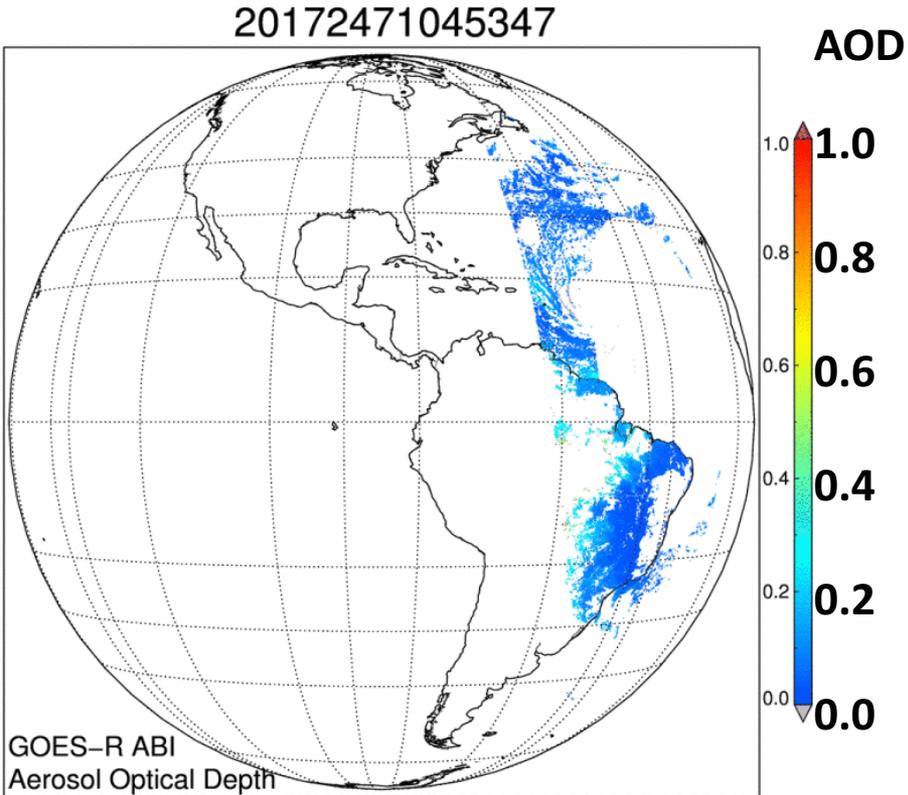
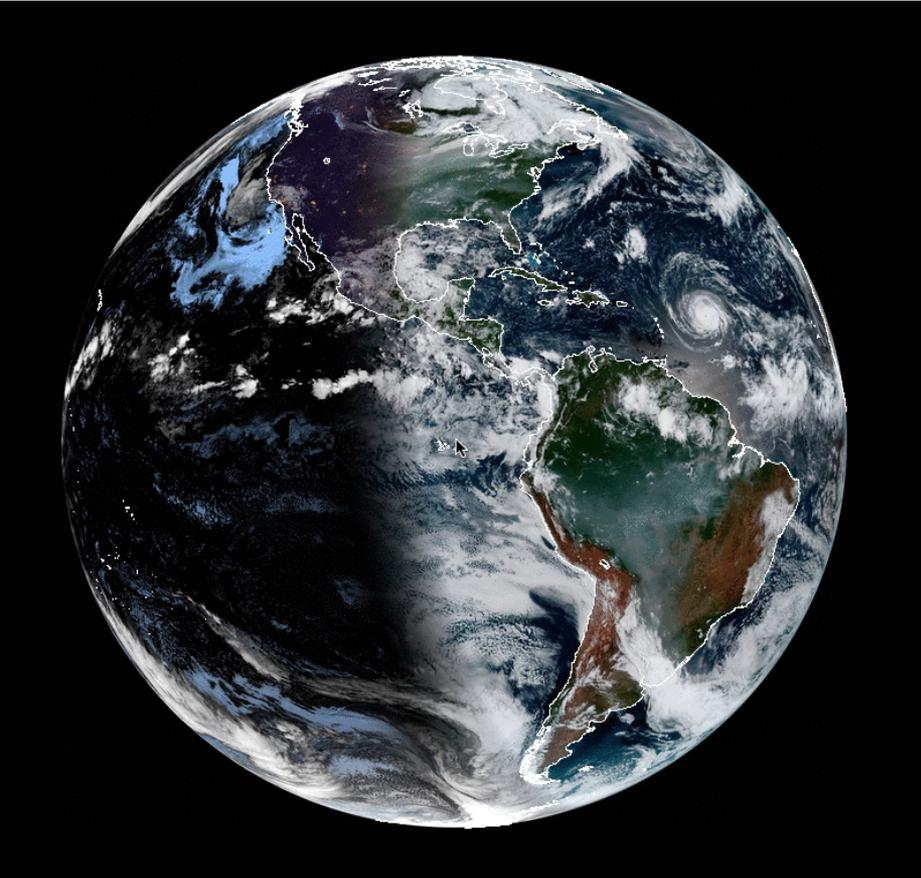
Green band: MODIS/VIIRS @ 0.55 μm , AHI @ 0.51 μm , ABI @ none

In the end, we will report AOD at 0.55 μm for everyone!

Same products as MODIS, including spectral AOD, cloud-cleared reflectance, etc²⁸

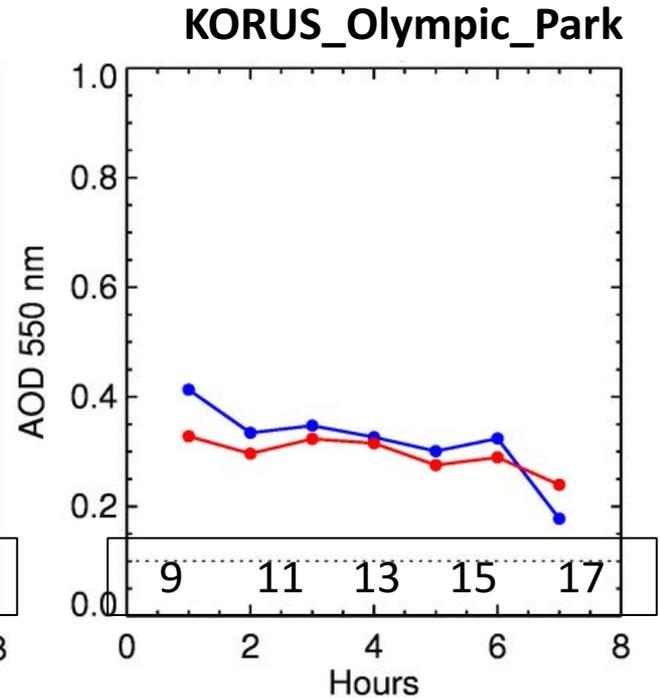
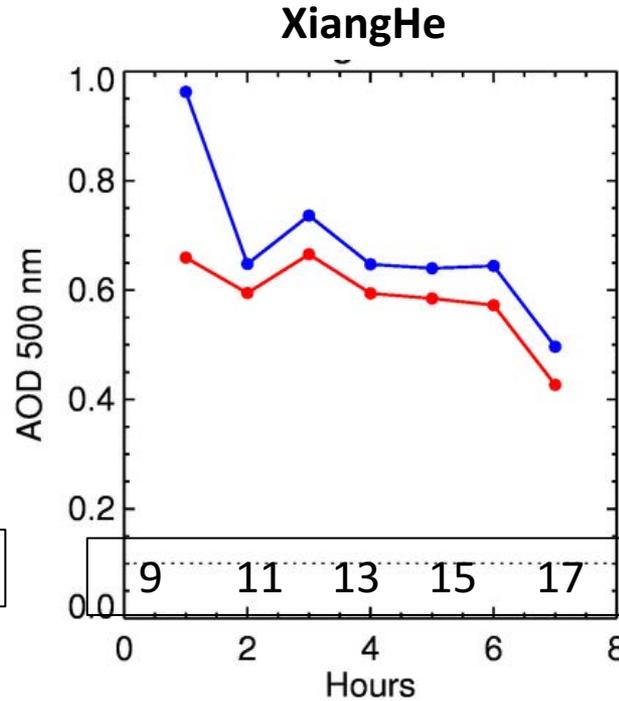
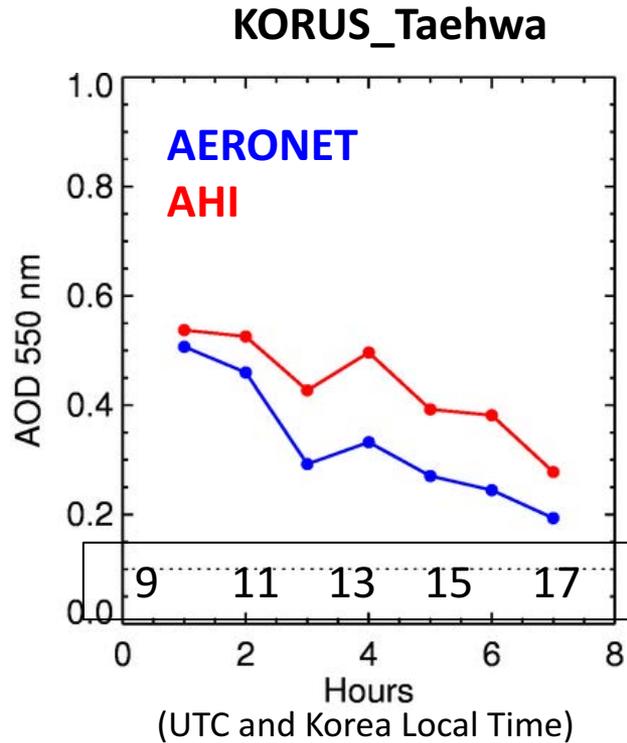
DT: RGB and AOD from ABI for Sep 4, 2017

B.C. Canadian Fires and smoke transport

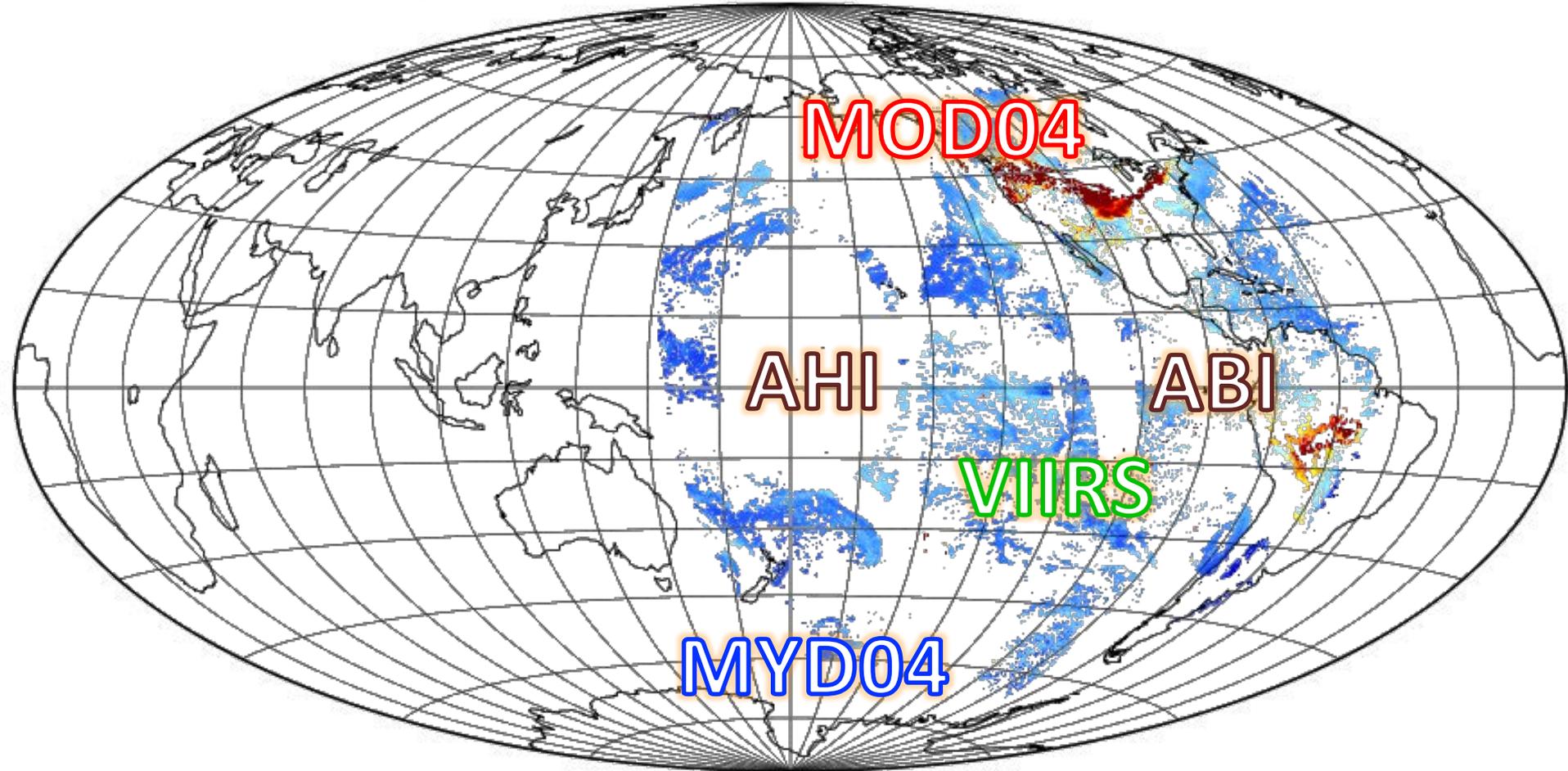


Diurnal Cycle of AODs from AHI (from KORUS-AQ, 2016)

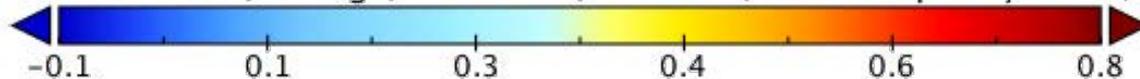
-> GEO does have sensitivity to Diurnal Cycle!!



AOD from LEO + GEO within ± 30 mins Sept 7, 2017 @ 2030 UTC

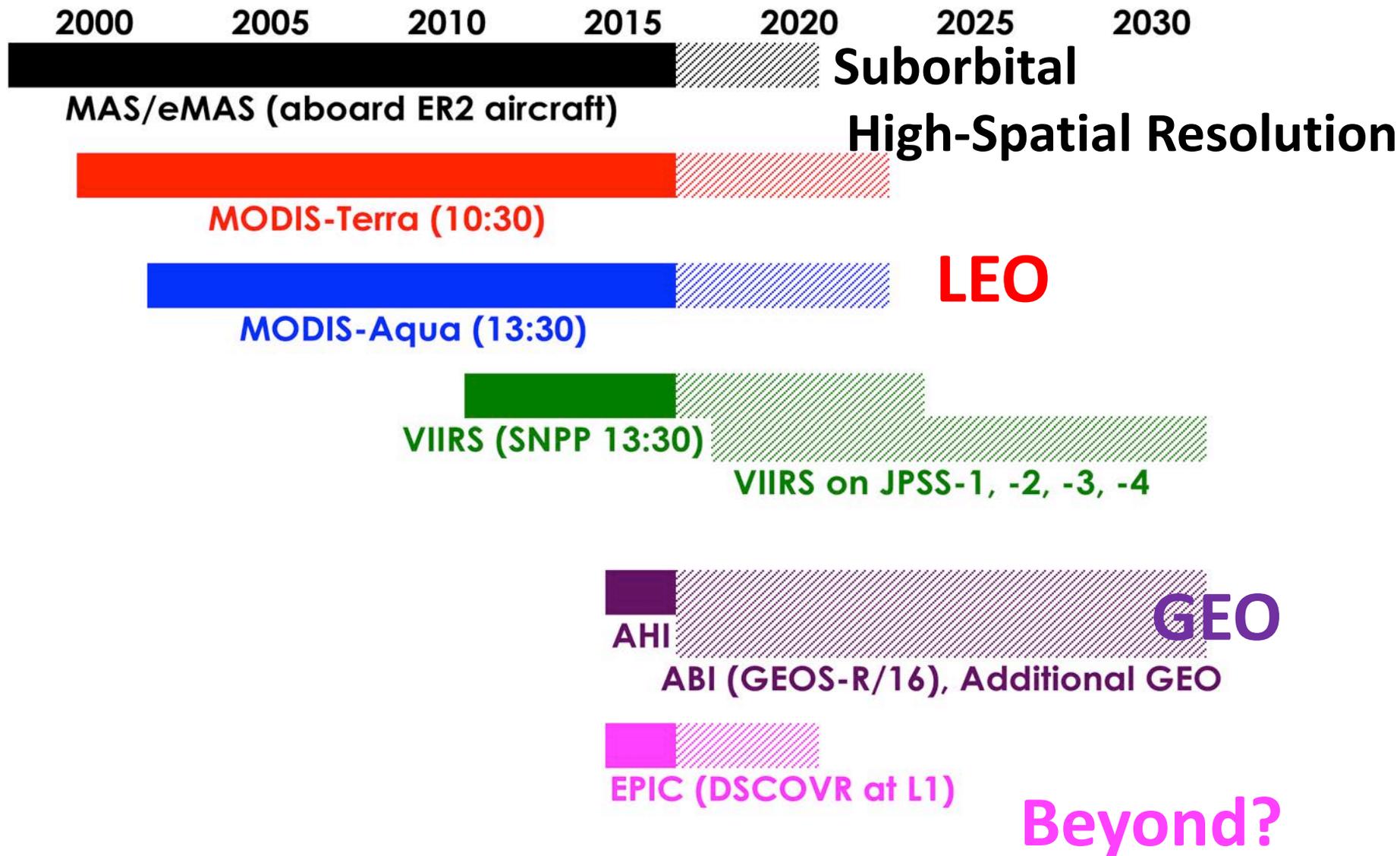


AOT at 0.55 micron for both ocean (Average) and land (corrected) with all quality data (Quality flag = 0, 1, 2, ...)



Data Min = -0.1, Max = 5.0, Mean = 0.2

Towards synergy of aerosol observations



Global Climate Observing System GCOS Aerosol CDR* Requirements



CDR = Climate Data Record

For Aerosol Optical Depth (AOD) from LEO + GEO!

Target metric	Target	with LEO + GEO
Horizontal Resolution	5-10 km, globally	≤10 km over ice-free and cloud-free scenes
Accuracy	MAX(0.03 or 10%)	±(0.04+10%): Ocean ±(0.05+15%): Land
Time Length	30+ years	30+ years (MODIS + VIIRS on JPSSx)
Stability / bias	<0.01 / decade	Not there yet, but possible?
Temporal Resolution	4 h	20+/day (daylight only) where GEO

Key: Black = almost there, Blue = on the way, Red = not close or unknown

By 2021 there will be more GEO sensors (Europe, China, etc)

Now we need to work on improving algorithm, coverage to ice surfaces.

Etcetera

Improvements to DT algorithm/products

- Improved coverage for heavy aerosol events (Indonesian fires, Beijing smoke, etc) = **Yingxi Shi**
- Improved dust detection and dust optical properties to reduce bias for dust climatology = **Yaping Zhou**
- Improved retrievals (and coverage) over coastal environments = **Yi Wang/Jun Wang** (U-Iowa)
- Alternatives for aerosol retrieval over brighter surfaces?
- Retrievals on higher resolution data (eMAS, Landsat, Sentinel) = **Shana Mattoo**

Use of DT products by Science Team

- Synergy with UV radiances (e.g. OMPS/VIIRS) = **Santiago Gásson**
- Correcting for 3D effects in aerosol near clouds = **Tamás Varnai**
- Using DT and other products to look at fires in India = **Pawan Gupta**
- Using DT and other products to look at dust and radiation = **Hongbin Yu**

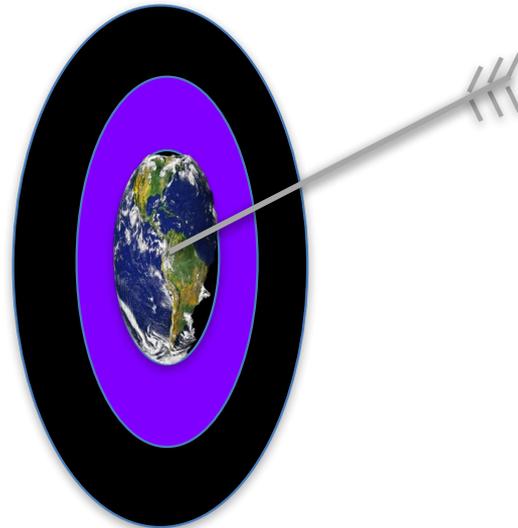
Conclusion I: Long and wide aerosol climatology

- **AOD is an Essential Climate Variable**, can be retrieved with the Dark-Target algorithm, from any sensor that has sufficient observations of multi-spectral (VIS/NIR/SWIR) reflectance.
- Validation shows that **DT on MODIS nearly meets 2 out of 5 requirements of a Climate Data Record**: Spatial resolution and accuracy.
- **MODIS C6.1** is improvement over C6 due to new urban retrieval, and upstream corrections that reduce relative drifting of Terra versus Aqua.
- C6.1 on MODIS still shows **unexplained 10-15% global offset** between Terra and Aqua. With continued updates in calibration/stability of sensor observations, we may meet 3rd CDR requirement of consistency.
- **DT is ported to VIIRS**, and the products are almost consistent enough to continue time series to beyond 30 years, meeting 4th CDR requirement.
- With DT retrieval on **GEO sensors**, and more coming online, we are getting closer to meeting 5th CDR requirement of temporal resolution.

Conclusion II: Long and wide aerosol climatology

- Many folks are currently using or proposing to use DT products from MODIS and/or VIIRS, however, our team is funded only for **MODIS “maintenance”**.
- For now, we **are leveraging GEO funding** to continue delivery of 1st version of VIIRS DT algorithm and products. (We hope this can change!)
- We are grateful for the Wisconsin SIPS to continue supporting our efforts.
- There are still **significant improvements that are possible** for DT algorithm and products.

THANK YOU!



Please see Virginia Sawyer's poster

Some recent publications

1. Levy, R.C., Mattoo, S., Sawyer, V., Shi, Y., Colarco, P.R., Lyapustin, A.I., Wang, Y., Remer, L.A. 2018. Exploring systematic offsets between aerosol products from the two MODIS sensors, *Atmospheric Measurement Techniques Discussions*: 1-37
2. Gupta, P., Remer, L.A., Levy, R.C., Mattoo, S. 2018. Validation of MODIS 3 km land aerosol optical depth from NASA's EOS Terra and Aqua missions, *Atmospheric Measurement Techniques*, 11(5): 3145-3159
3. Patadia, F., Levy, R., Mattoo, S. 2018. Correcting for trace gas absorption when retrieving aerosol optical depth from satellite observations of reflected shortwave radiation, *Atmospheric Measurement Techniques Discussions*, 2018: 1—45
4. Shi, Y. R., Levy, R. C., Eck, T. F., Fisher, B., Mattoo, S., Remer, L. A., Slutsker, I., and Zhang, J.: Characterizing the 2015 Indonesia Fire Event Using Modified MODIS Aerosol Retrievals, *Atmos. Chem. Phys. Discuss.*, <https://doi.org/10.5194/acp-2018-468>, [in review, 2018.
5. Wang, Y., J. Wang, R. C. Levy, X. Xu, and J. S. Reid. 2017. "MODIS Retrieval of Aerosol Optical Depth over Turbid Coastal Water." *Remote Sensing*, 9 (6): 595 [10.3390/rs9060595]