

Satellite remote sensing of aerosol vertical distribution: A critical review and future directions

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**AeroCenter/CPC Seminar
30 March 2021**

Outline

- **Background & Acknowledgements**
- **Importance**
- **Uncertainties**
- **Overview of techniques**
- **Thoughts for future directions**

24 yrs ago: AOD from AVHRR

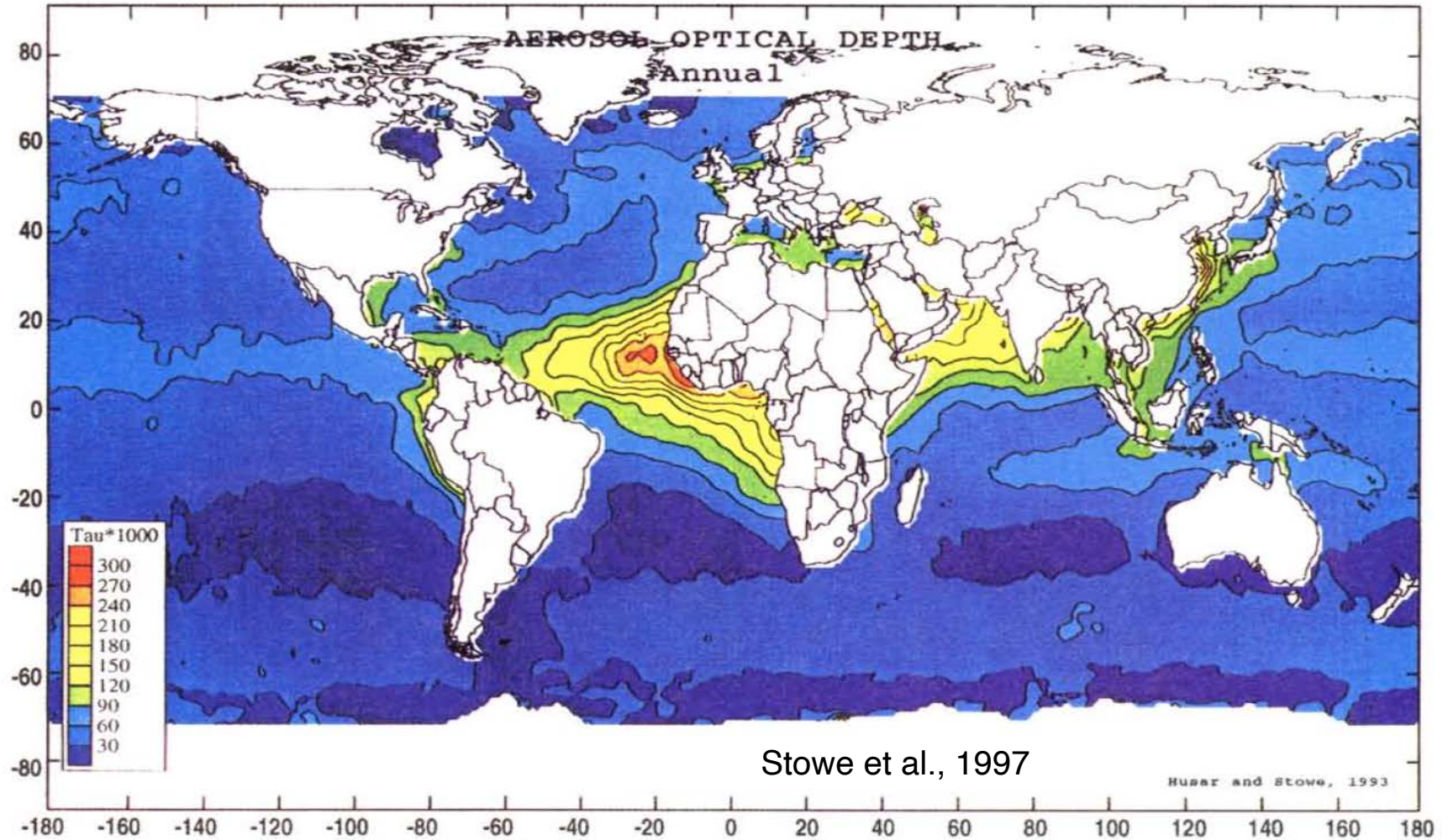
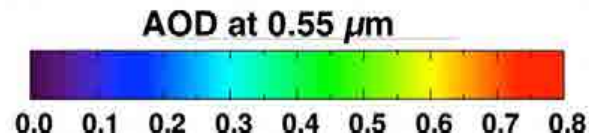
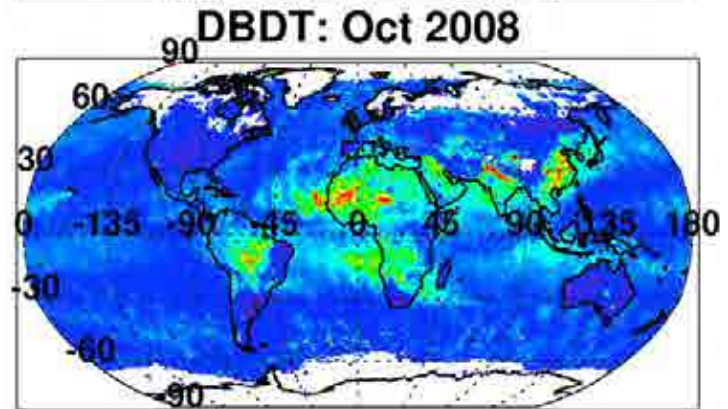
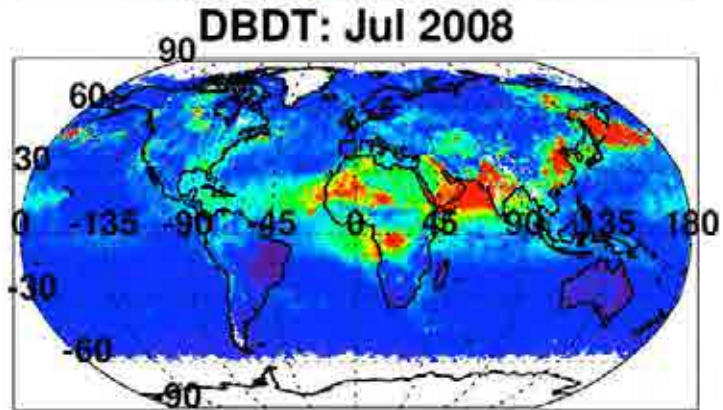
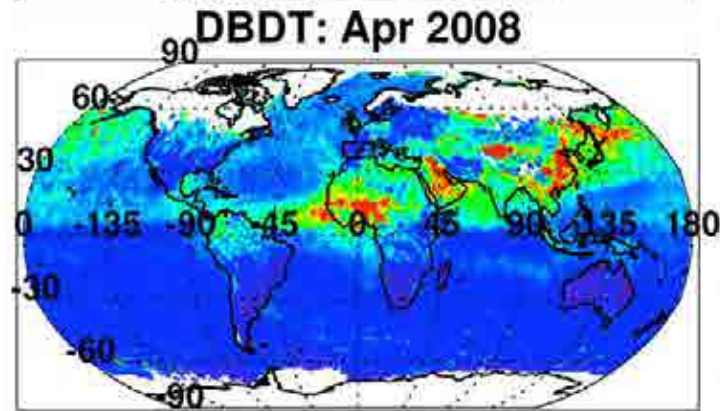
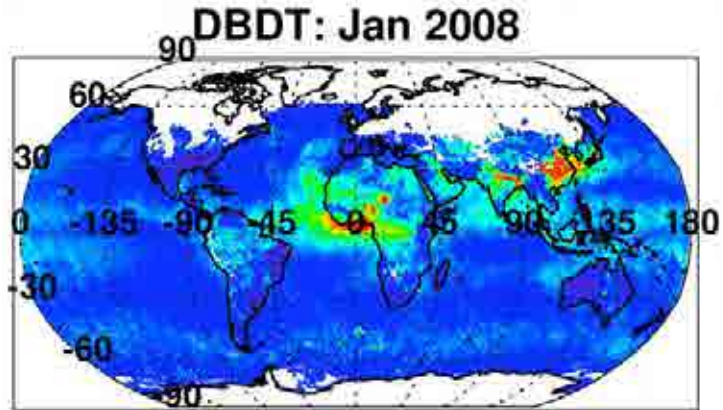


Plate 2. Mean distribution of $\tau_{SATI}^{\wedge}$ at $0.5 \mu m$ for 2 years prior to the eruption of Mount Pinatubo.

MODIS Collect-6 AOD @ 550 nm



Levy et al., 2013

Validation of AOD

Stowe et al., 1997

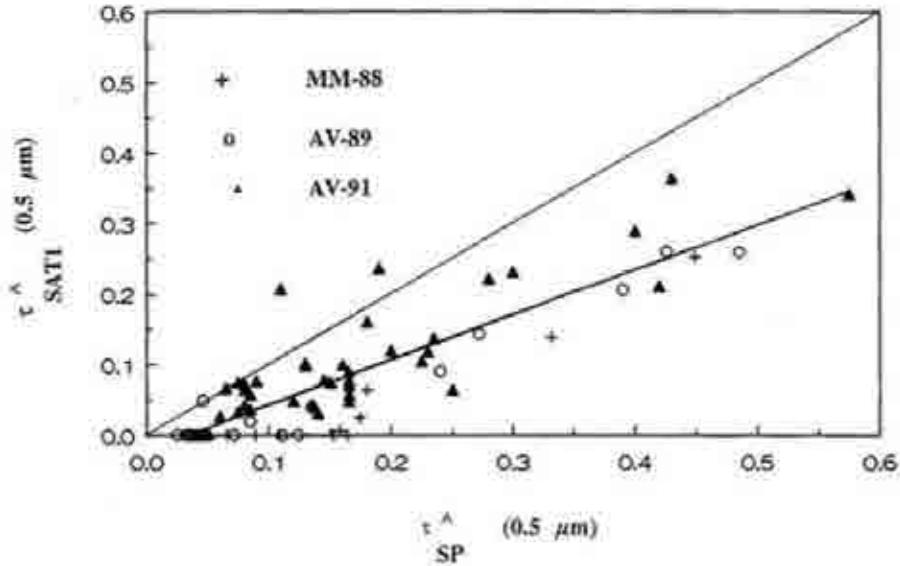
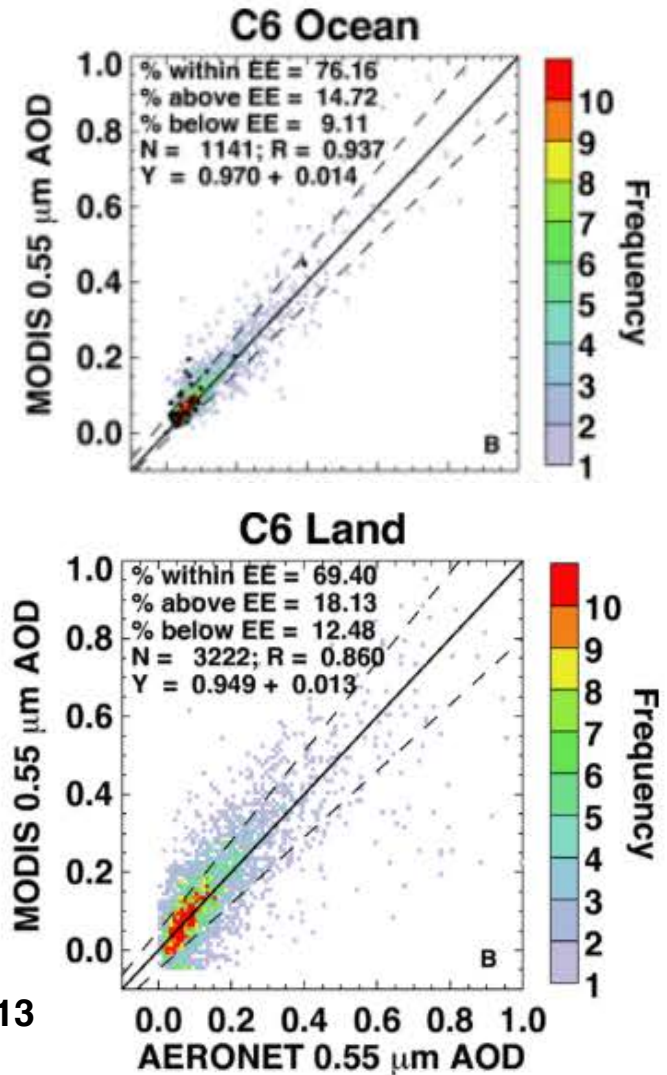


Figure 2. Regression of τ_{SATI}^{A} against Sun-photometer aerosol optical thickness at 0.5- μm wavelength.

Levy et al., 2013



Acknowledgments

Insightful contributions from:

John Yorks, Matthew McGill,
Melanie Follette-Cook, Valentina Aquila,
Virginie Buchard, James Campbell,
Greg Carmichael, Jim Carr,
Alice Crawford, Ken Christin,
Peter Colarco,
Arlindo DaSilva, Minghui Diao,
Michael Garay, Olga Kalashkova,
Nickolay Krotkov, Zhanqing Li,
Kerry Meyer, Stephen Nicholls,
Edward Nowottnick, Jeffrey Reid,
Juli Rubin, Allison Ring,
Joseph Santanello, Ariel Stein, Dong Wu,
Tammy Weckwerth, Ping Yang,
Hongbin Yu, Jianglong Zhang

Fruitful exchanges with:

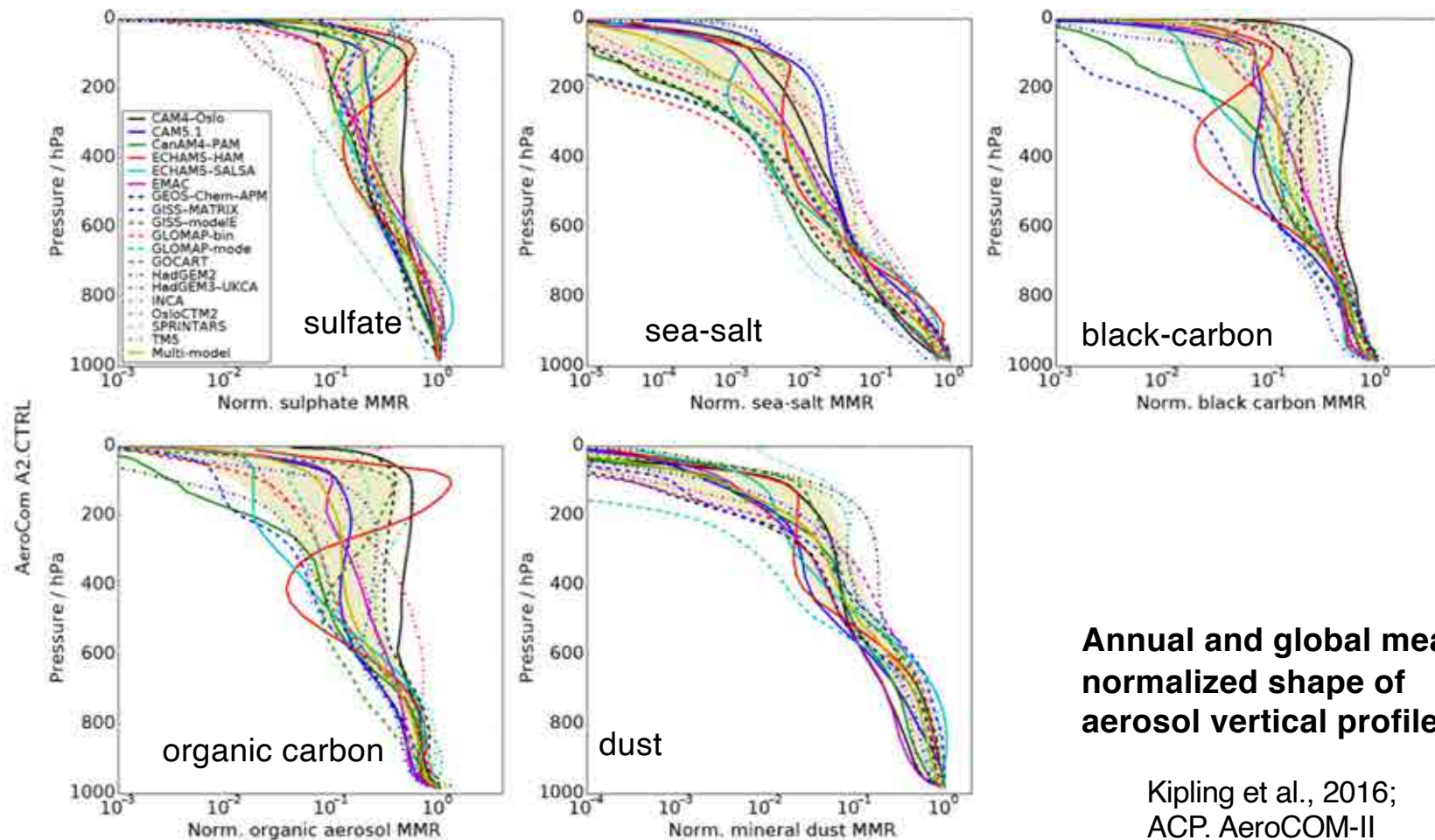
K. Wyat Appel, Shobha Kongdragunta,
Jamie Kibler, Jeff Mcqueen, Yi Ming,
Susan O'Neill, Michael Pavolonis
Oleg Dubovik, Martin de Graaf,
Jhoon Kim, Liu Xu, Richard Ferrare,
ICAP members



Importance of aerosol vertical distribution

- **Monitoring surface air quality from space**
- **Aerosol direct and indirect effects on climate**
- **Aerosol effects on atmospheric chemistry & gas retrievals**
- **Long-range transport and biosphere-atmosphere interactions**
- **Air quality & climate forecast**
- **...**

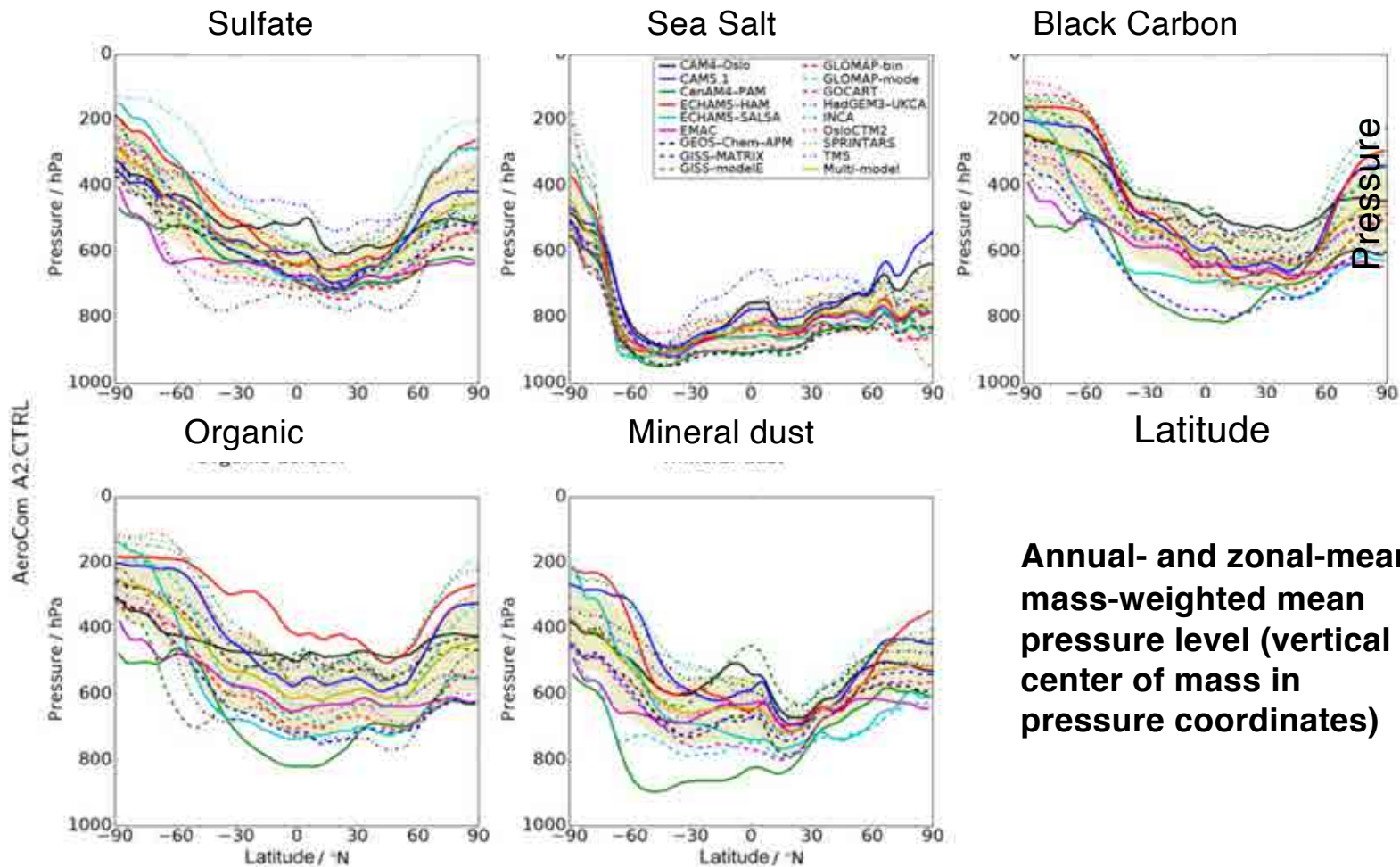
Large uncertainty in aerosol vertical profile (1)



Annual and global mean
normalized shape of
aerosol vertical profile

Kipling et al., 2016;
ACP. AeroCOM-II

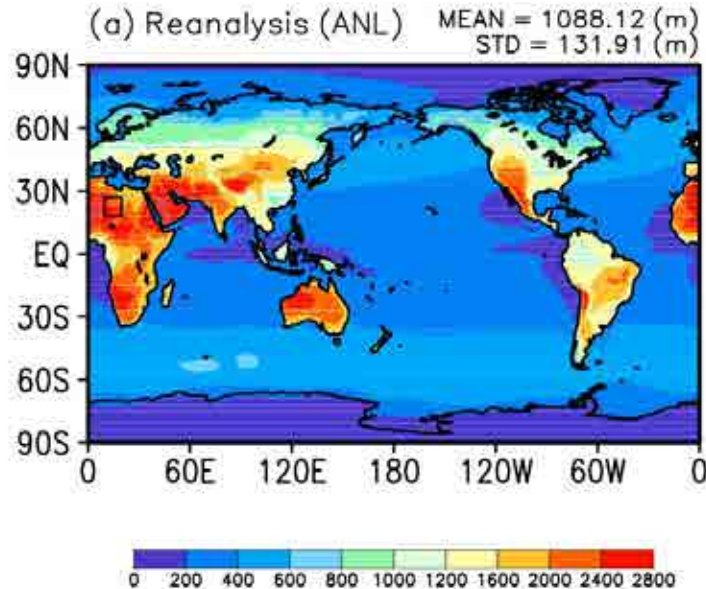
Large uncertainty in aerosol vertical profile (2)



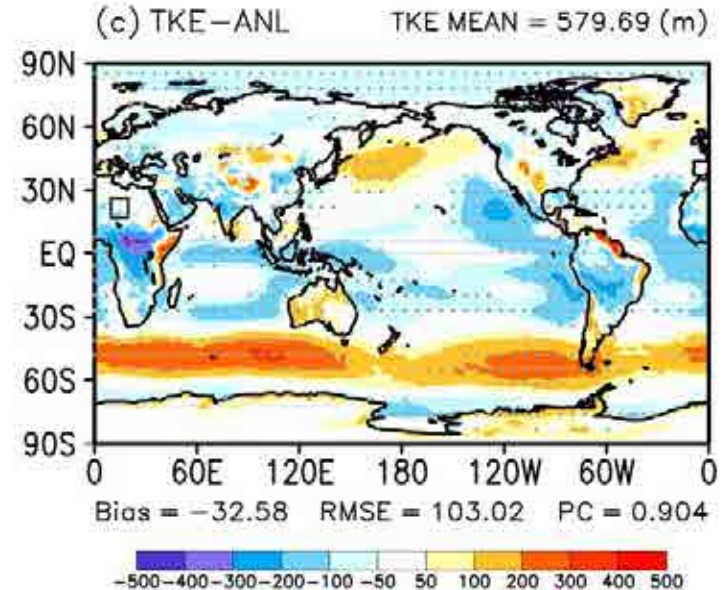
Modeled PBLH itself is elusive in some ways

Definition of PBLH; PBL scheme; ...

PBLH diurnal amplitude



Annual-mean PBLH difference



Shin et al., 2018.

- No observation data for evaluation of global PBLH
- Three re-analysis datasets are used as the baseline
- Inconsistent diurnal variation and definition of PBLH among different models

Different techniques for sensing AVD from space

Active

-Lidar such as CALIOP and CATS

Diurnal variation

Global converge

Passive

- Limb/ occultation: SAGE, OMPS
- Stereo photogrammetry: ATSR, MISR
- UV, Deep Blue + Polarization: OMI, TROPOMI, POLDER/PARASOL
- Oxygen absorption spectroscopy: POLDER and MERIS, OMI, TROPOMI, SCIAMACHY; EPIC/DSCOVR, GEMS
- Infrared: dust and smoke, MODIS, VIIRS, AIRS...

Active + Passive: OMI/OMPS, MODIS/VIIRS, and CALIOP

Elastic backscatter lidar technique (532 nm, polar-orbiting at 700 km ABS)

$$P(r) = E_0 \frac{cA}{2r^2} \left[\frac{3}{8\pi} \beta_m(r) + \frac{p_a(\pi, r)}{4\pi} \beta_a(r) \right] e^{-2 \int_0^r \beta_e(r') dr'} + \overset{\text{M. sca.}}{\downarrow} M(r) + \overset{\text{bkgrd.}}{\downarrow} b$$

Pros

- Details: profiling of aerosol backscattering
- Simplicity: assumption of one unknown, lidar ratio, to derive extinction
- Maturity: demonstrated by CALIPSO and CATS mission already
- Robust: to answer if aerosol layer is above PBLH (mixing layer height)
- All time: day and night

Cons

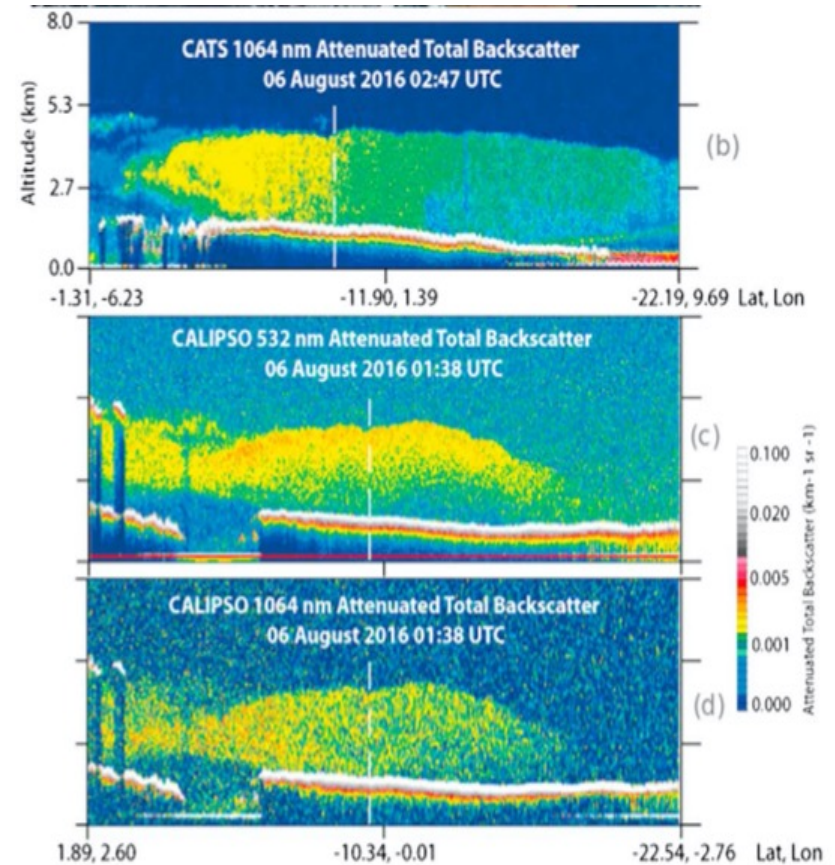
- Narrow: very limited spatial converge; 0.2% of global surface area in 16 days
- Attenuation: lose the signal for moderate-to-thick aerosol layer or low AOD loading
- Less accurate in daytime

Multiple-wavelength lidar with depolarization

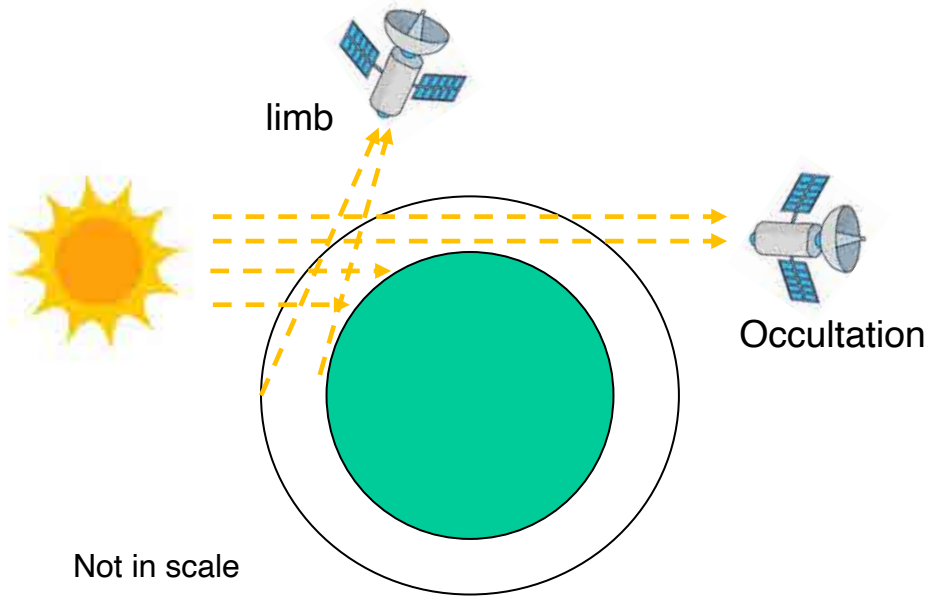
More Pros

- Particle shape:
 - non-spherical vs. spherical
- More constraints:
 - particle size
- More in-depth penetration:
 - possible to probe columnar AOD up to 5 at 1062 nm at night

There are more advanced and complex ones such as HSRL that directly measures aerosol attenuation and backscatter.



Limb/Occultation Technique



Pros

- Upper troposphere and low stratosphere (UTLS)
- Relatively accurate for occultation technique

Cons

- Data is very sparse for occultation technique
- Uncertainty gets larger at lower altitude
- No information for lower troposphere
- Need to assume particle properties for limb technique
- Earth curvature effect

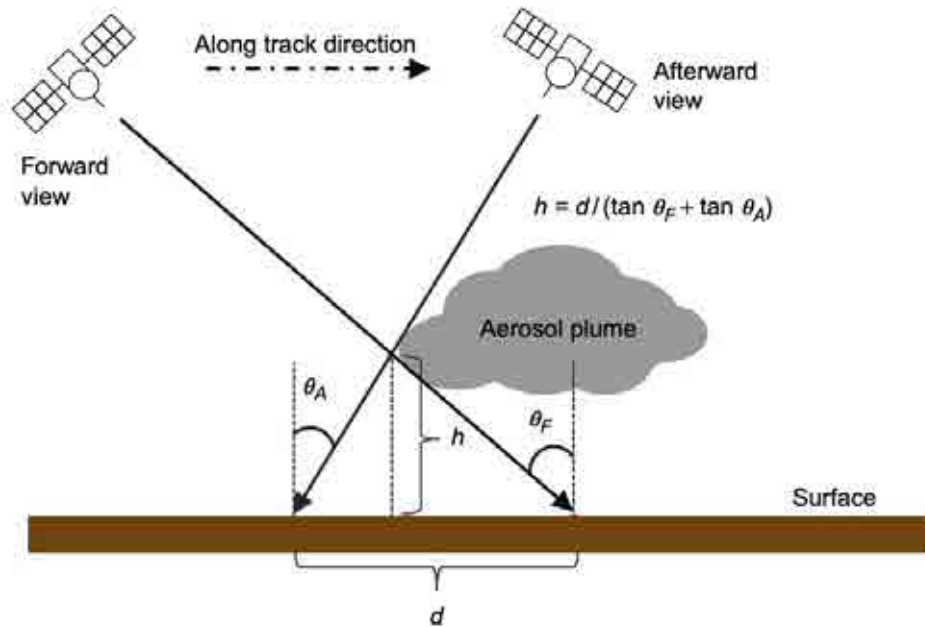
Stereo photogrammetry

Pros

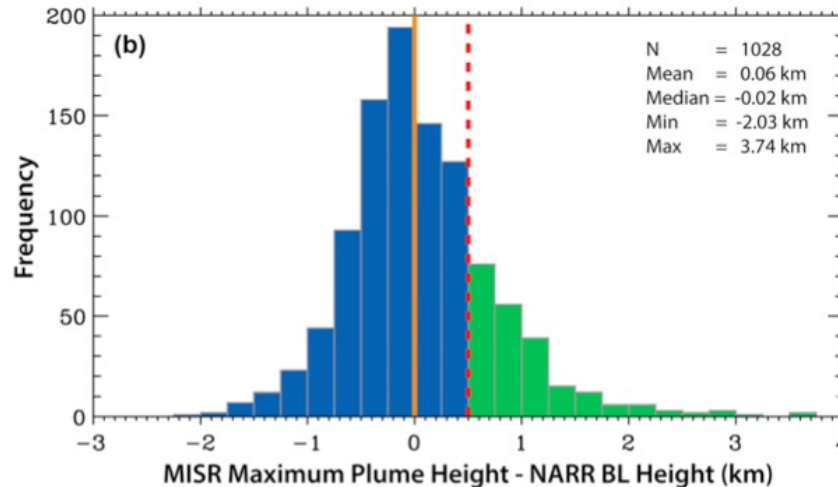
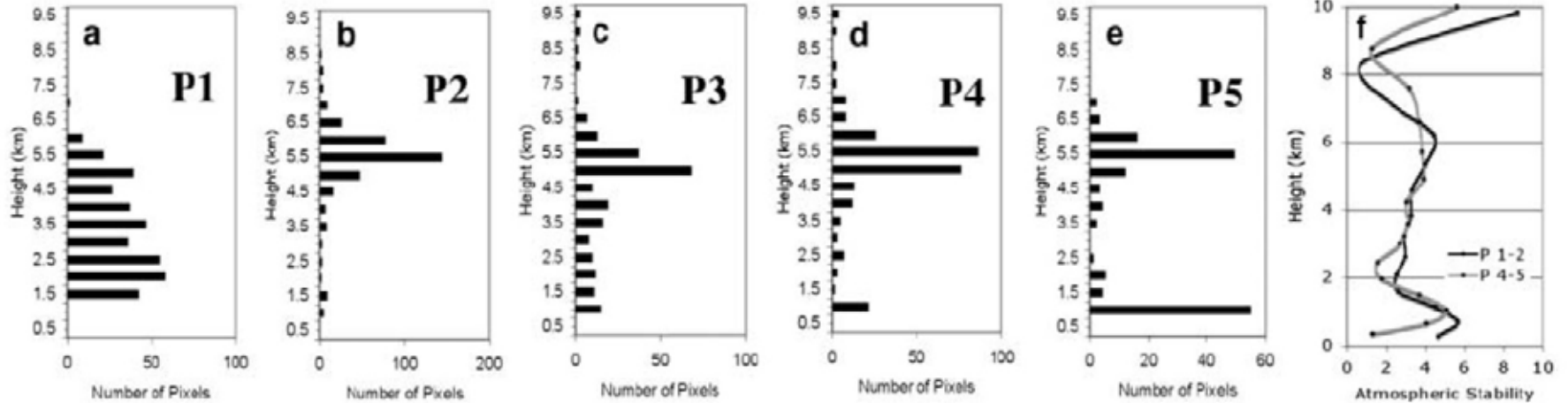
- Simplicity; 1 band & >2 angles
- No need of a priori on particle properties; pure geometry
- Accurate (depending on pixel resolution and georeferencing accuracy)
- Air motion vector (AMV) is retrieved as a by-product

Cons

- Uncertainty subject to the wind-induced parallax displacement, especially in direction along the track
- Requires texturally rich features. (not for well-mixed plumes)
- Not for optically moderate or thin plumes that are transparent to reflect surface features



MISR-based smoke plume height



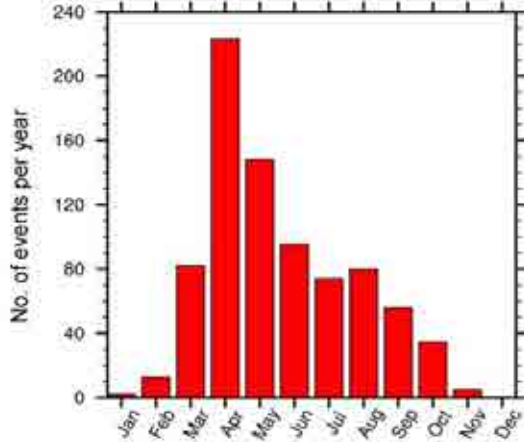
Kahn et al., 2007

Peterson et al., 2014

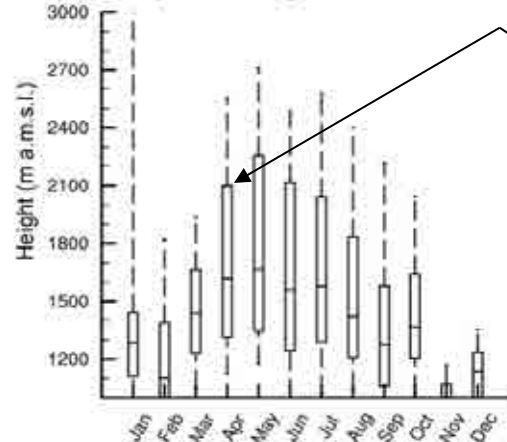
MISR-based analysis of dust plume motion and dust plume height at the dust source region

Yu et al., 2019

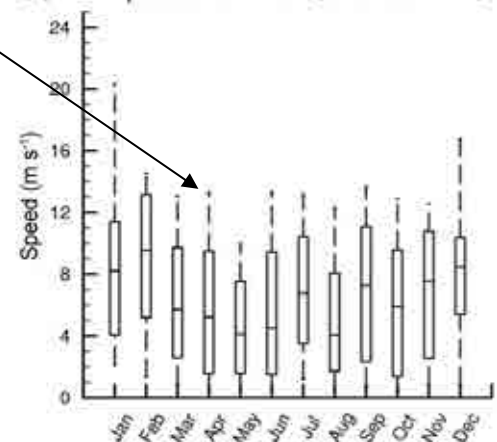
(a) Number of dust events (Taklamakan)



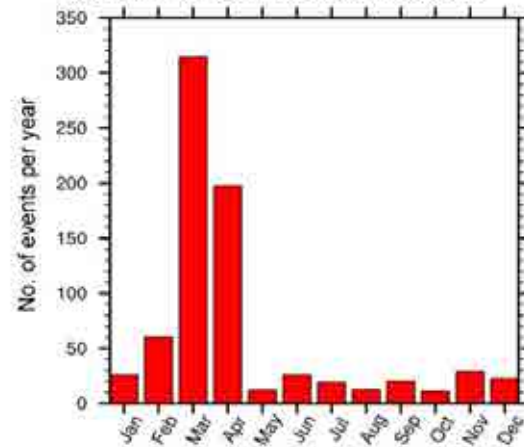
(b) Dust plume height (Taklamakan)



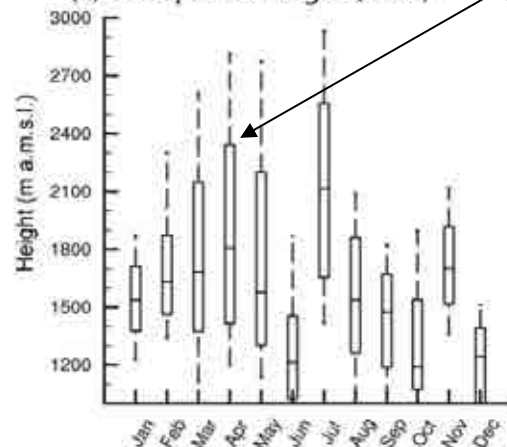
(c) Dust plume motion (Taklamakan)



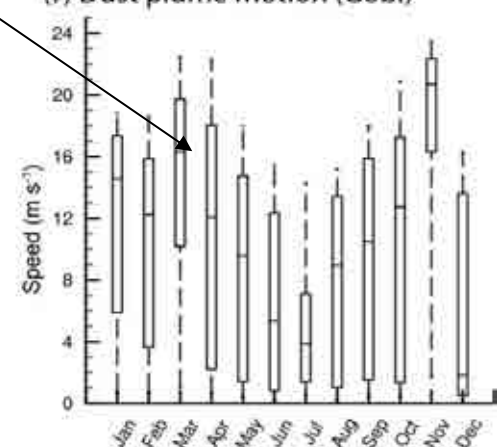
(d) Number of dust events (Gobi)



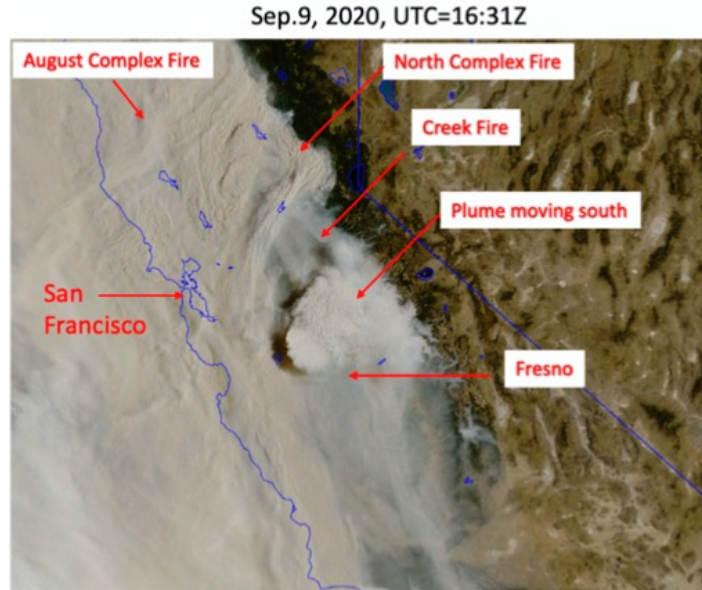
(e) Dust plume height (Gobi)



(f) Dust plume motion (Gobi)

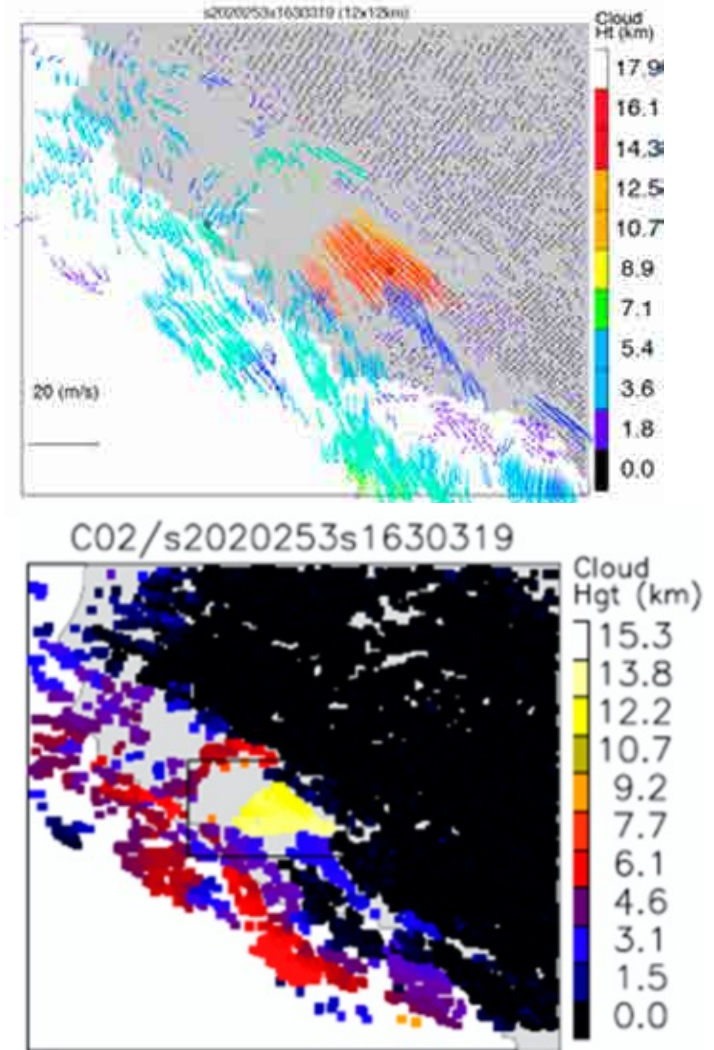


GEO + GEO

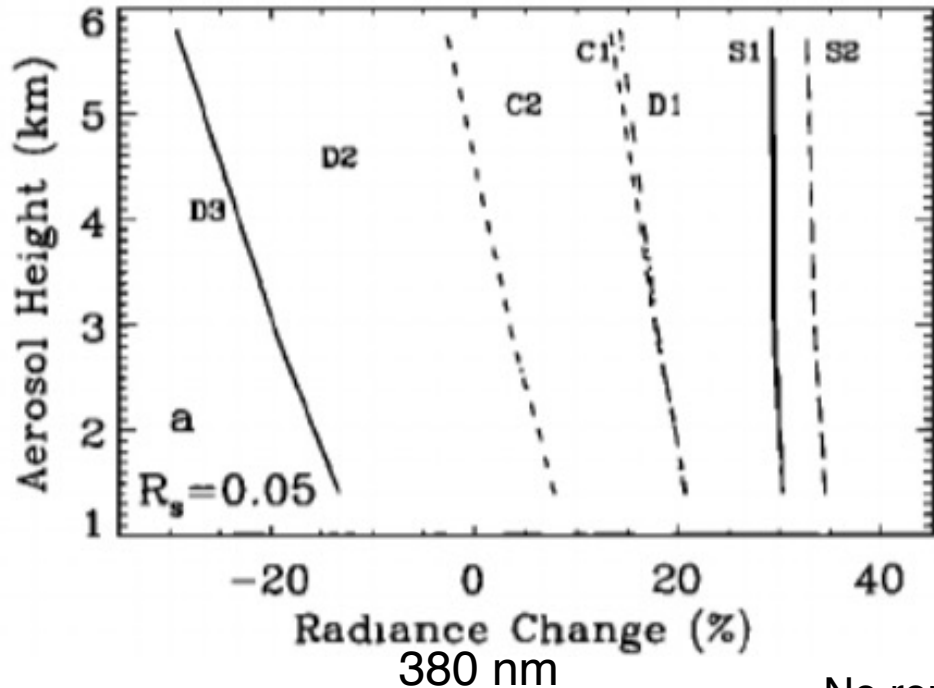


- Minimize the error otherwise possibly in the LEO in the along-track direction
- Has the potential in high temporal frequency
- Other 'cons' remain

Carr et al. (2020)



UV, Deep Blue



Pros

- Rayleigh scattering can be computed accurately
- Less uncertainty in low boundary conditions
- Sensitive to absorption and height

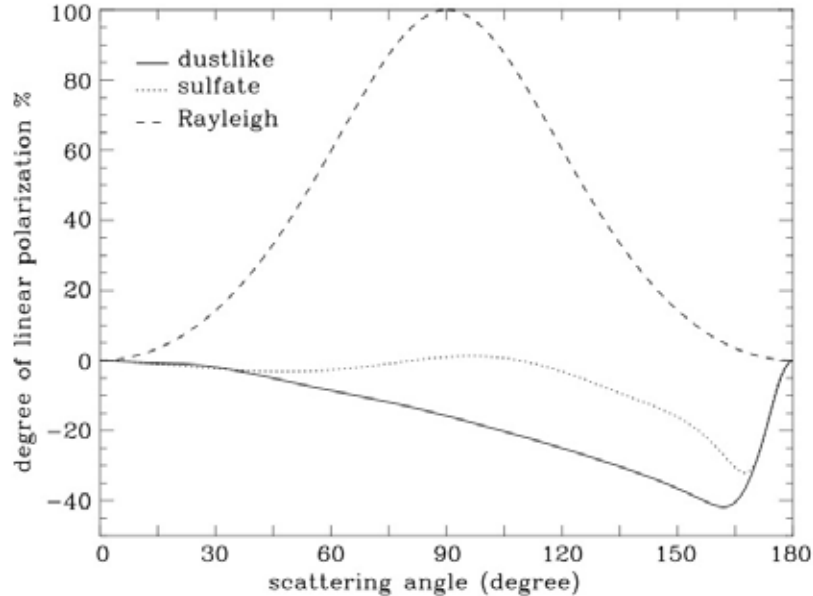
Cons

- Not for non-absorbing aerosols
- Need a priori of aerosol absorption and AOD.

Torres et al., 1998

No routine product yet; case demonstration so far.
Often AOD are retrieved from MODIS/VIIRS and then used as inputs for SSA and Height retrieval.

UV, Deep Blue + Polarization



Pros

- Less sensitivity to aerosol absorption
- For all types of aerosols
- Surface reflectance is low
- Rayleigh scattering can be computed accurately

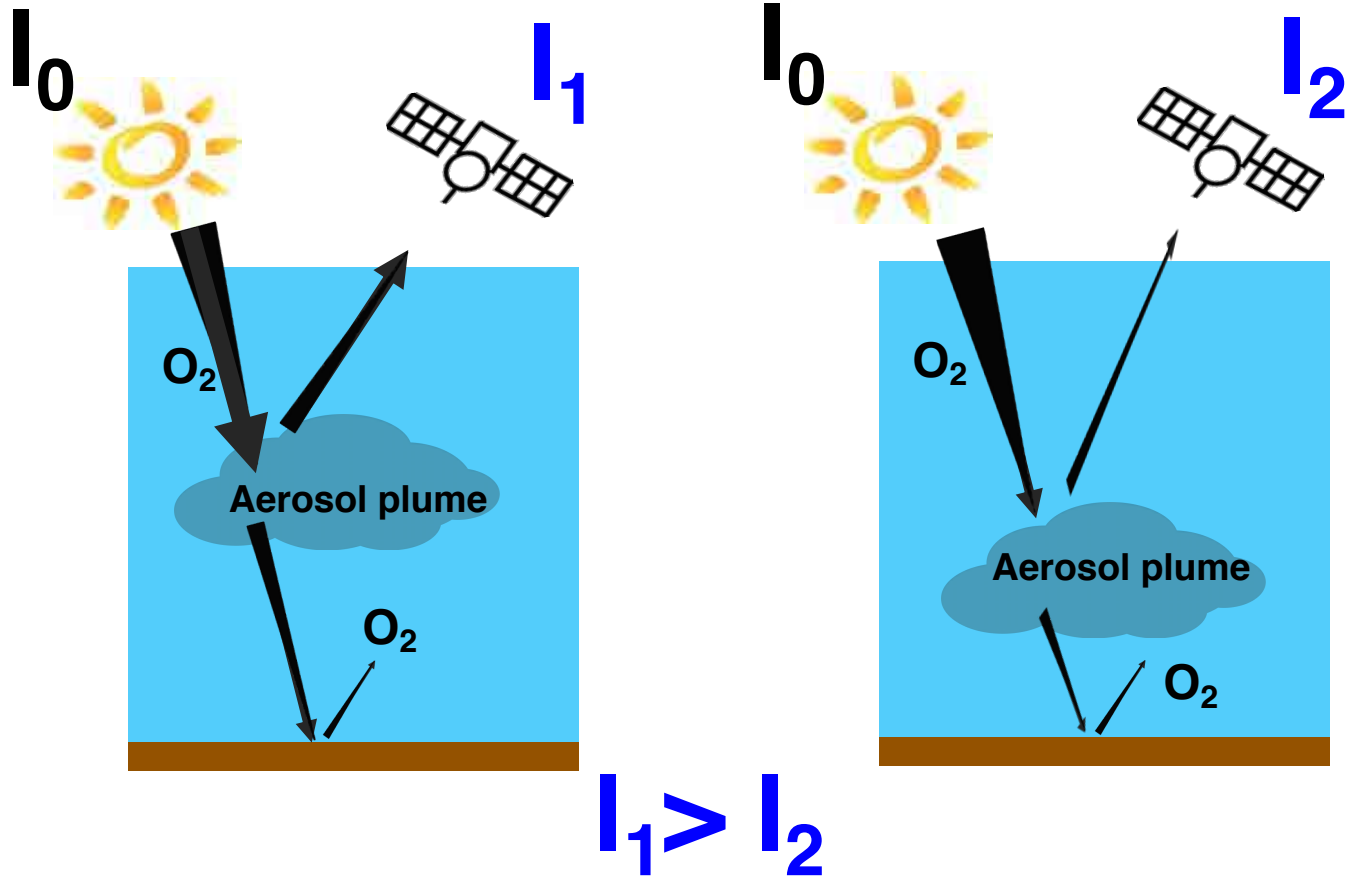
Cons

- Need good constraints of AOD and particle size (and to some degree shape)
- Complexity

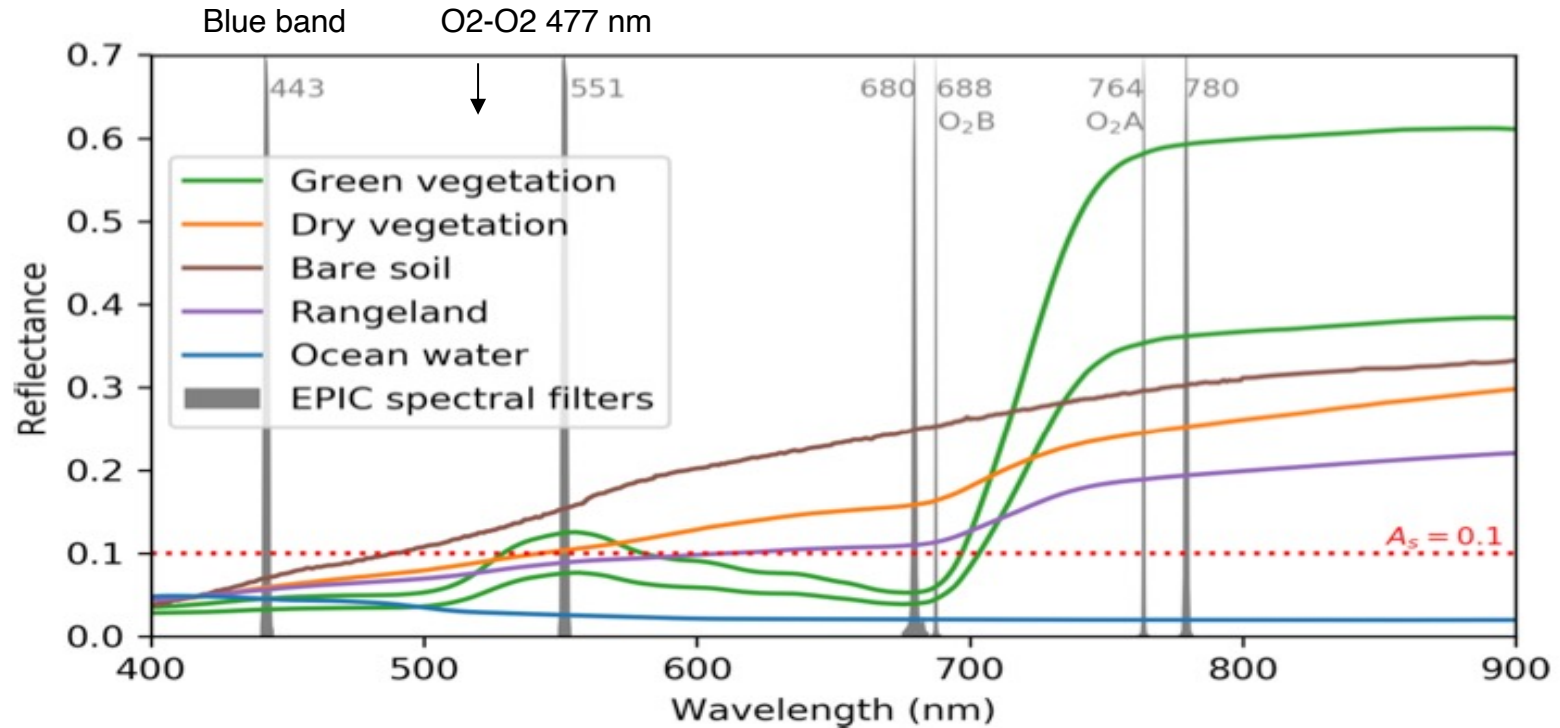
Zeng et al., 2008

Research product exists via GRASP
POLDER/PARASOL; but the product has not
been assessed with real data.

Oxygen absorption spectroscopy

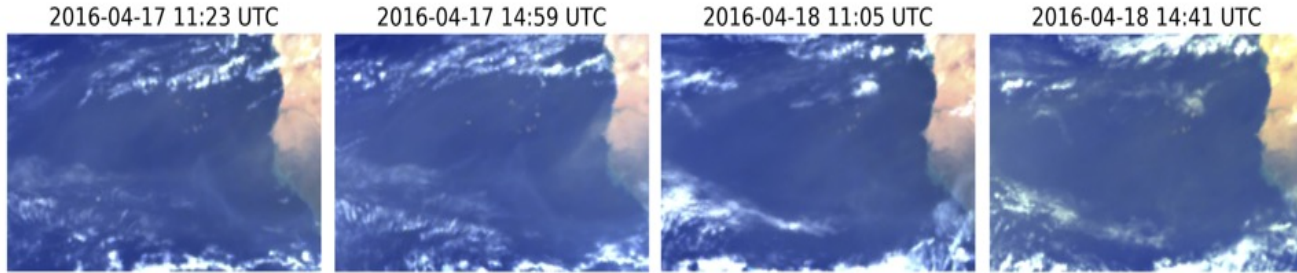
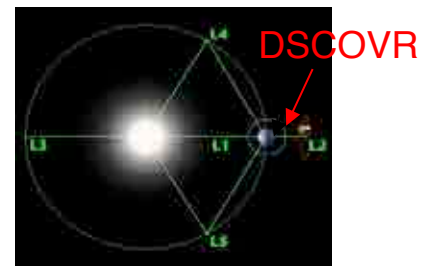


Oxygen absorption bands vs. surface reflectance spectra

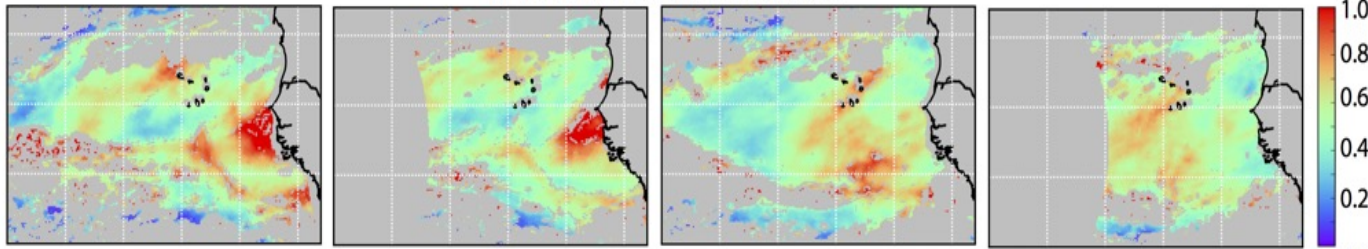


O₂ B-band has moderate absorption, stronger than O₂-O₂ at 477 nm and weaker than O₂ A. O₂ B-band also has very low surface reflectance, comparable if not lower than blue bands, due to Chlorophyll-a absorption.

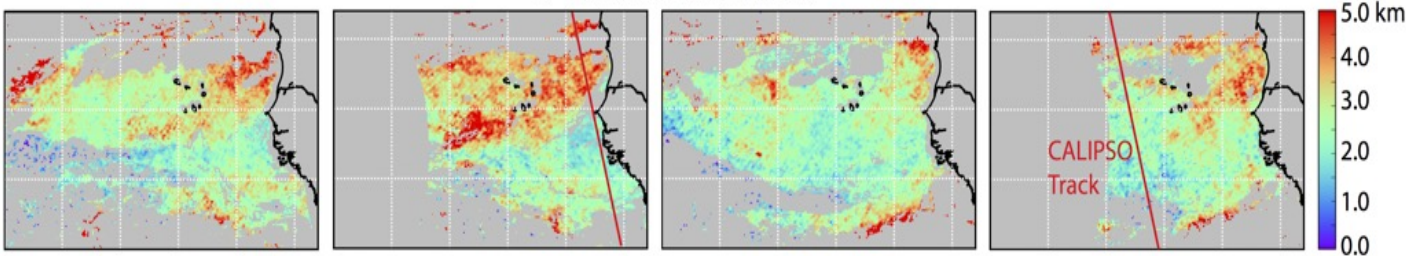
Retrieval of **diurnal variation** AOD from EPIC's O₂ A and B bands



EPIC Retrieved AOD at 680 nm



EPIC Retrieved ALH (km)

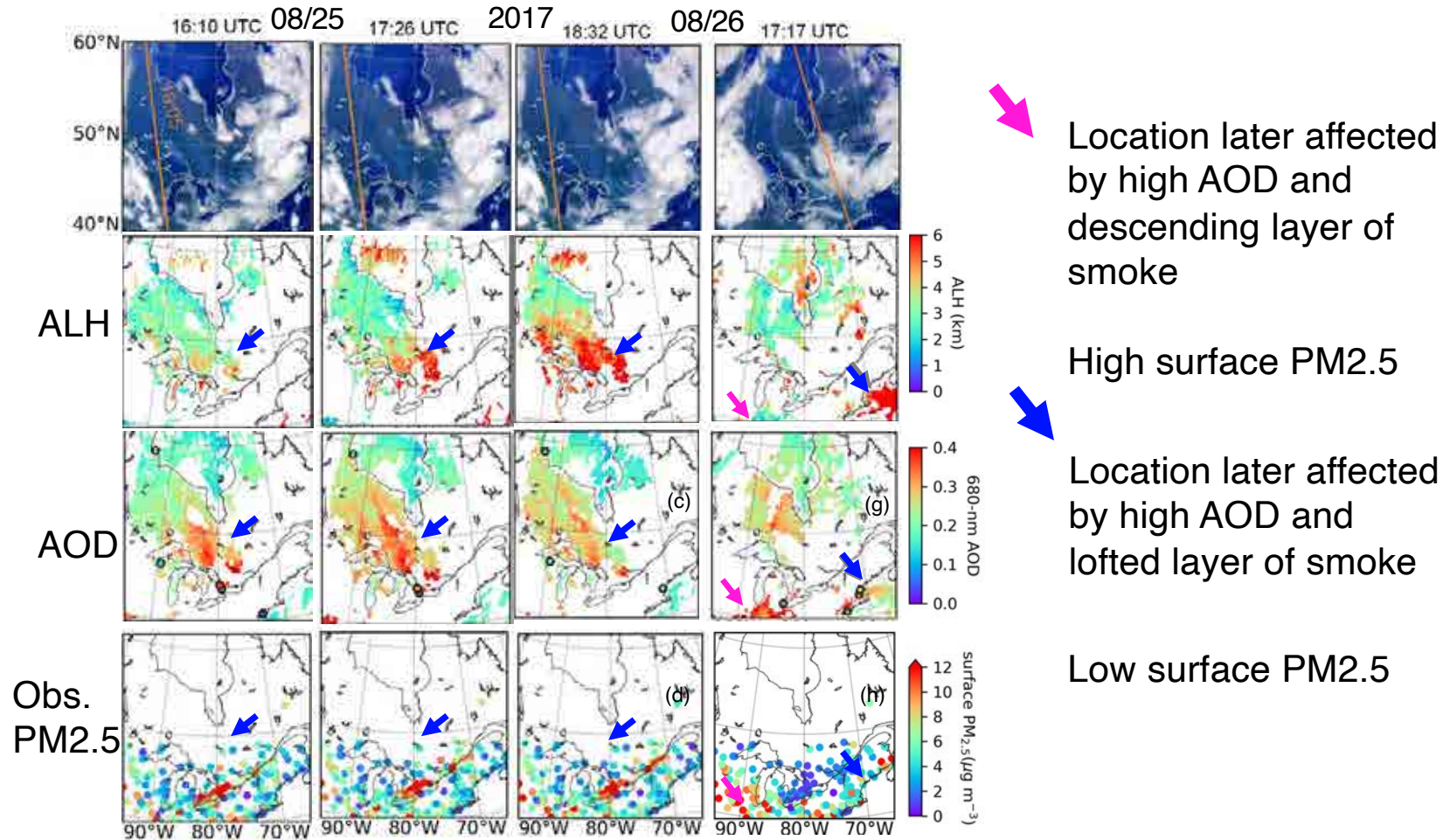


- AOD field clearly indicates mass continuity; high close to the source, and low in downwind.

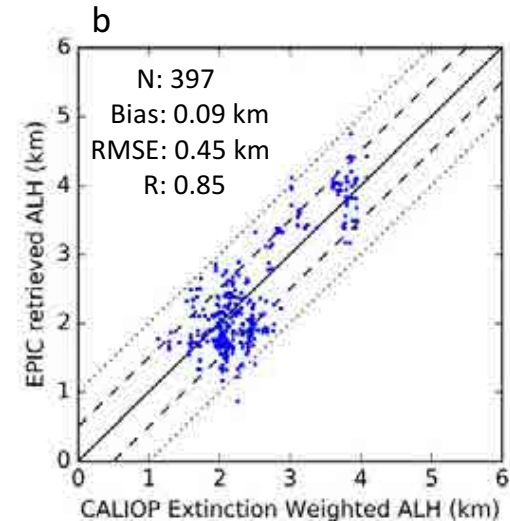
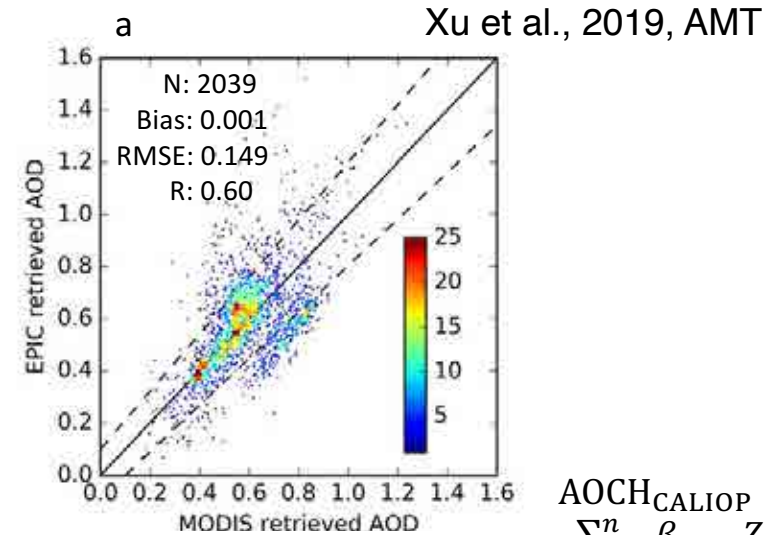
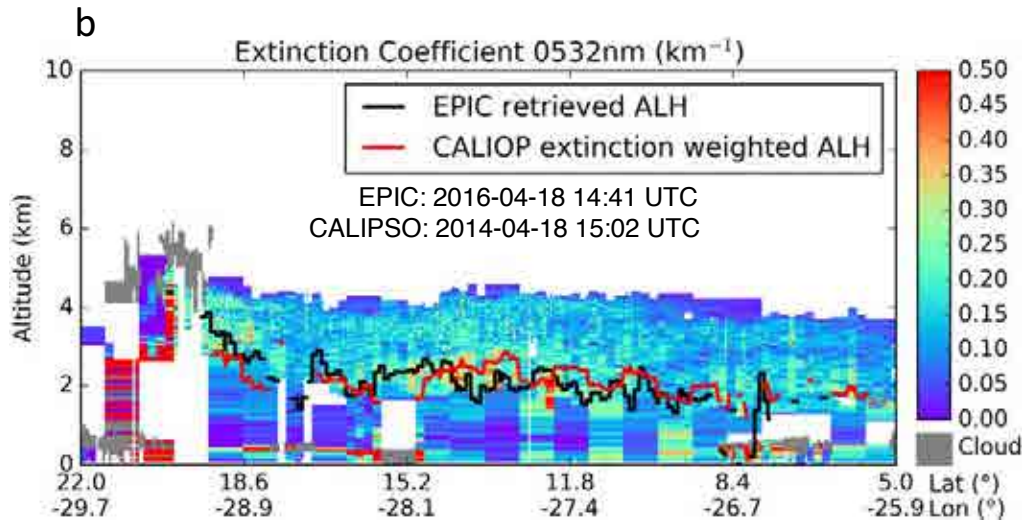
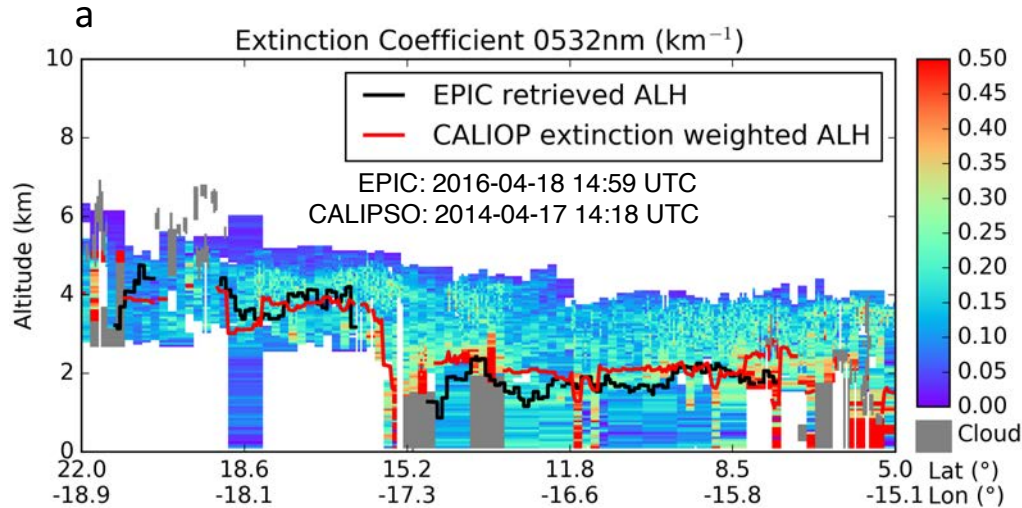
- ALH shows no relationship with AOD

- ALH varies 1 – 5 km.

Implication to surface PM_{2.5} Air Quality Assessment



Validation with MODIS and CALIOP data



$$\text{AOCH}_{\text{CALIOP}} = \frac{\sum_{i=1}^n \beta_{\text{ext},i} Z_i}{\sum_{i=1}^n \beta_{\text{ext},i}}$$

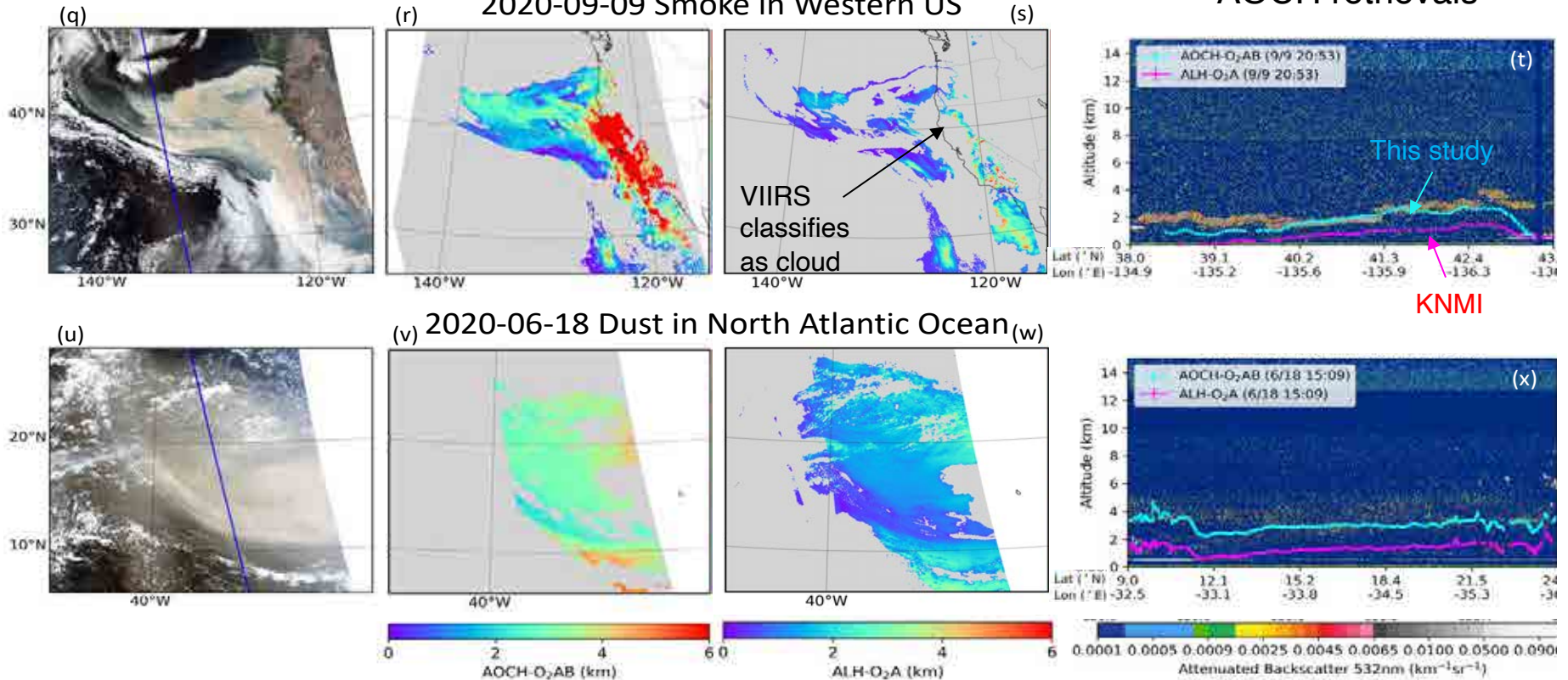
Enabled by TROPOMI

VIIRS

This study

KNMI

CALIOP overlaid with
AOCH retrievals



Algorithms using channels similar as EPIC.

Chen et al., 2021, RSE, In review.
Don't cite or quote

More demonstration

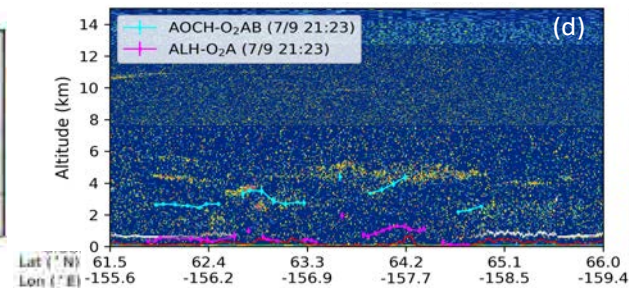
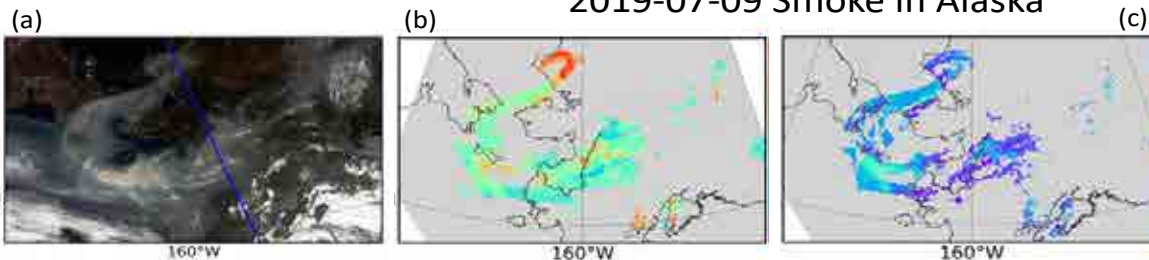
VIIRS

This study

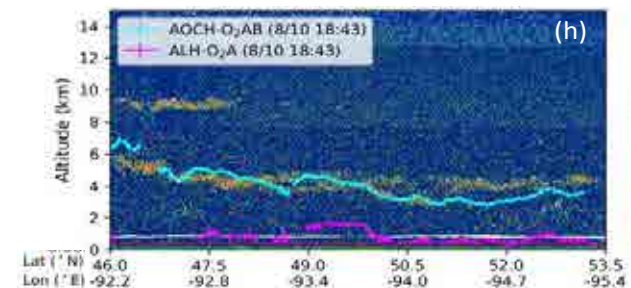
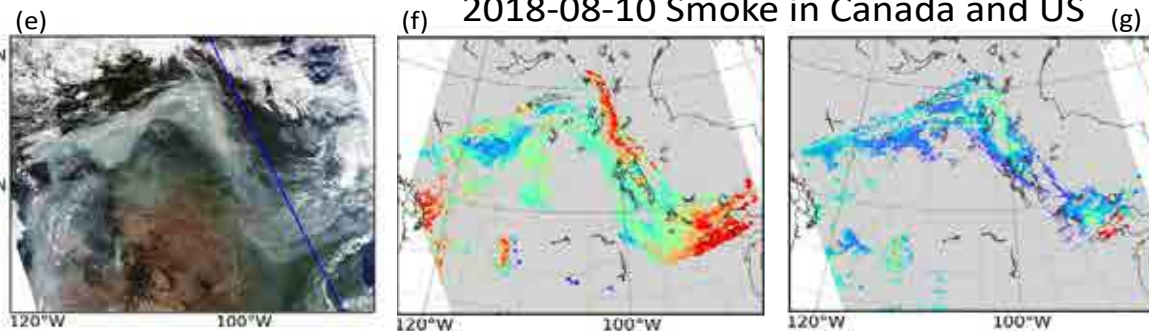
KNMI

CALIOP

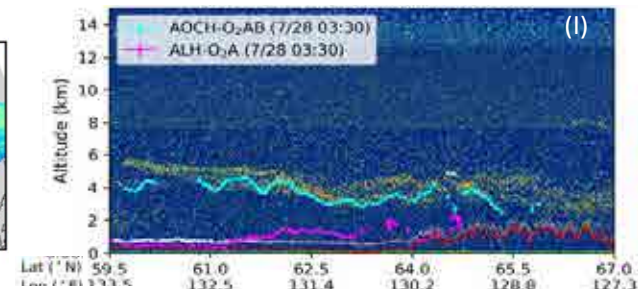
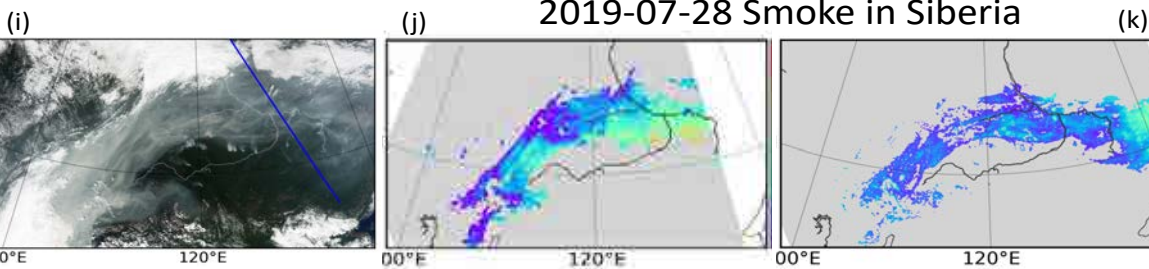
2019-07-09 Smoke in Alaska



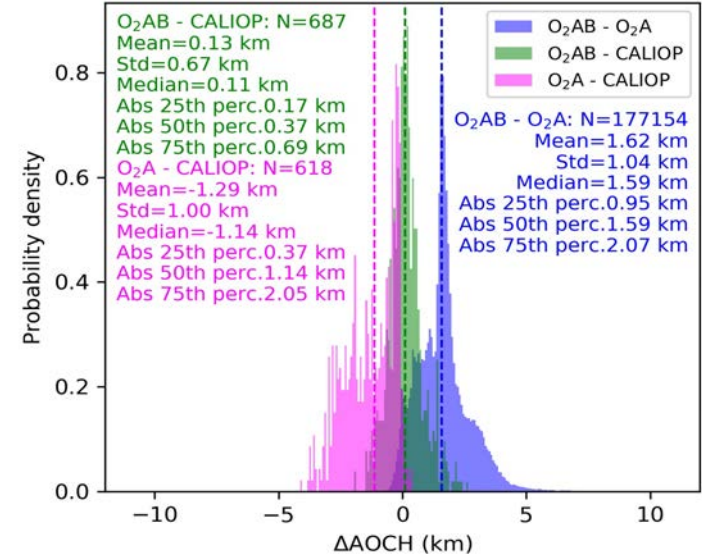
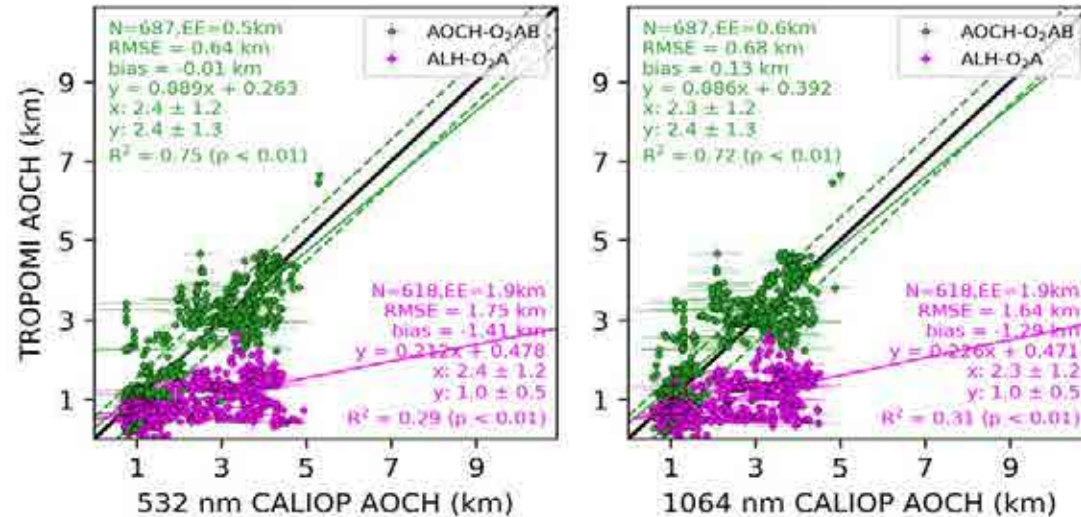
2018-08-10 Smoke in Canada and US



2019-07-28 Smoke in Siberia

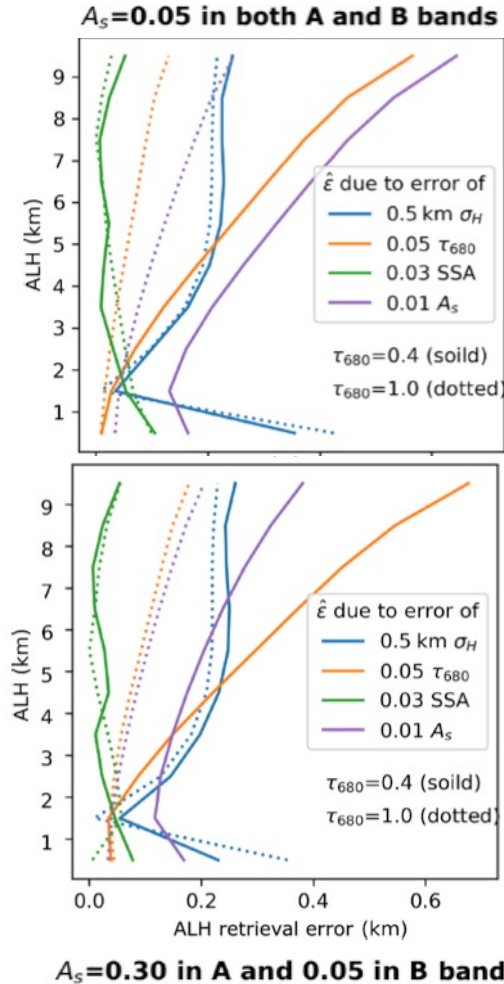


Validation



- TROPOMI operational ALH product based on O₂ A-band has 1.5 km low bias (Nanda et al., 2020)
- This study using O₂ A- and B-bands has mean bias of nearly zero in AOC.

Oxygen absorption spectroscopy



Pros

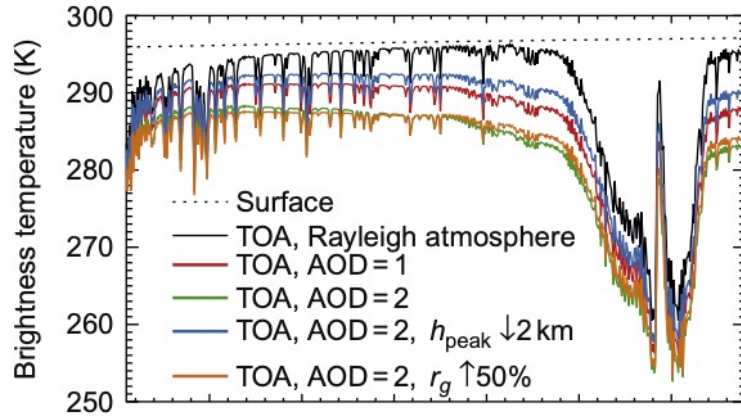
- Surface reflectance is low in O2 B and O2-O2
- Has sensitivity in low, middle and upper troposphere.
- Work well for from source to downwind region
- Sensitive to both scattering and absorption aerosols
- Aerosol optical properties have less uncertainties (as compared to that in UV)
- Simplicity and robustness (the ratio between absorption and continuum bands can be well attributed to the aerosol height)
- Less sensitivity to aerosol absorption

Cons

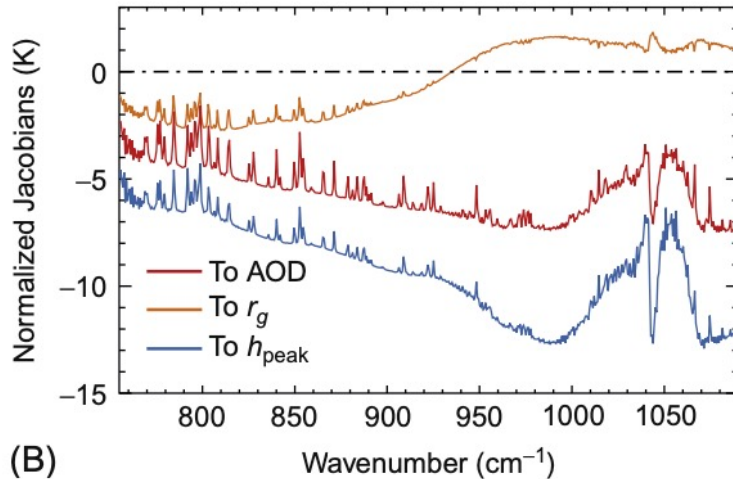
- Subject to the shape of aerosol profile, but that is true for all passive techniques
- Subject to the surface reflectance (with a note that in O2 B-band, the reflectance is low).

Xu et al., 2019

Infrared Techniques



(A)



(B)

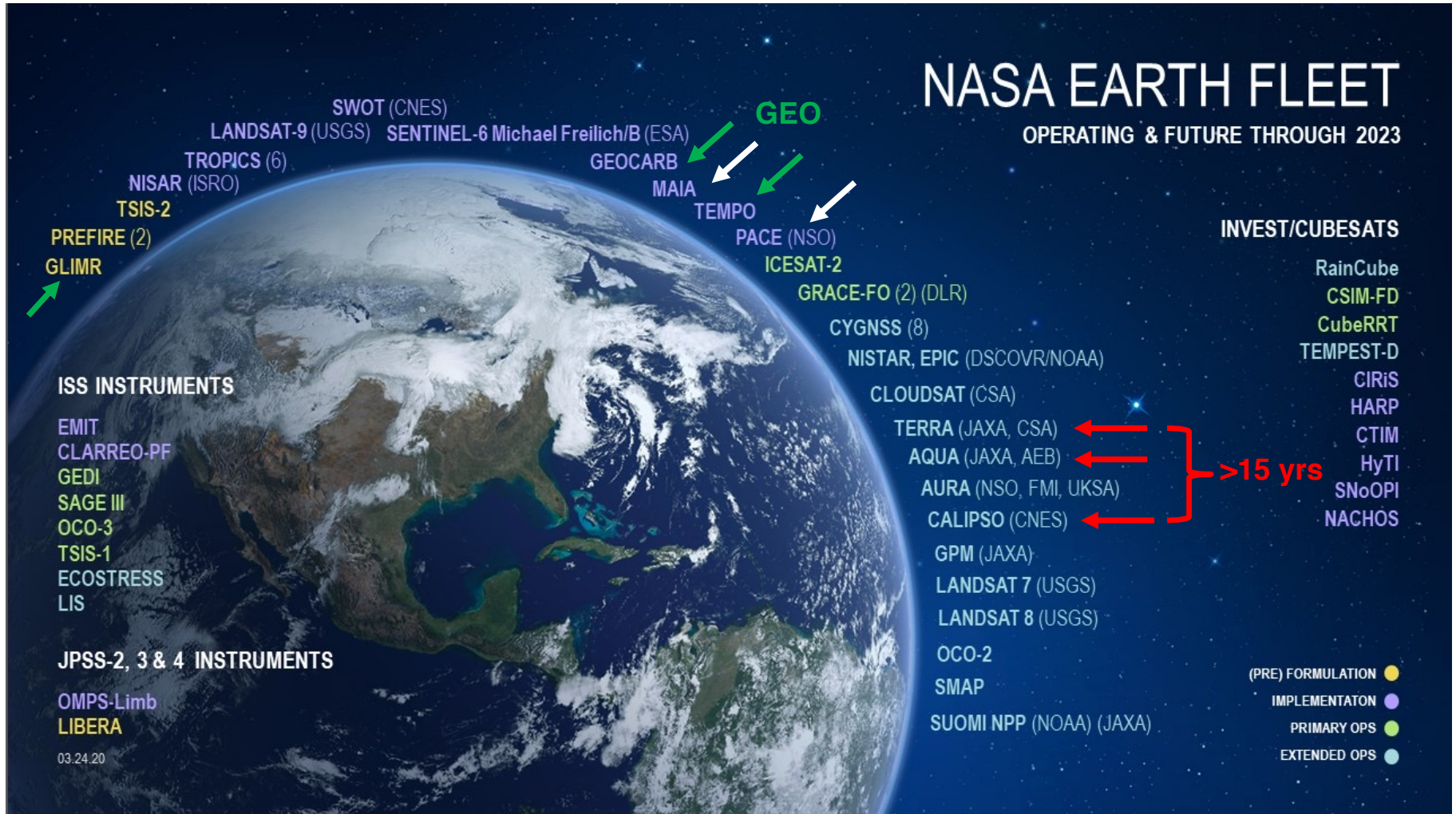
Pros

- Works both at day and night
- Good temporal converge (from GEO)

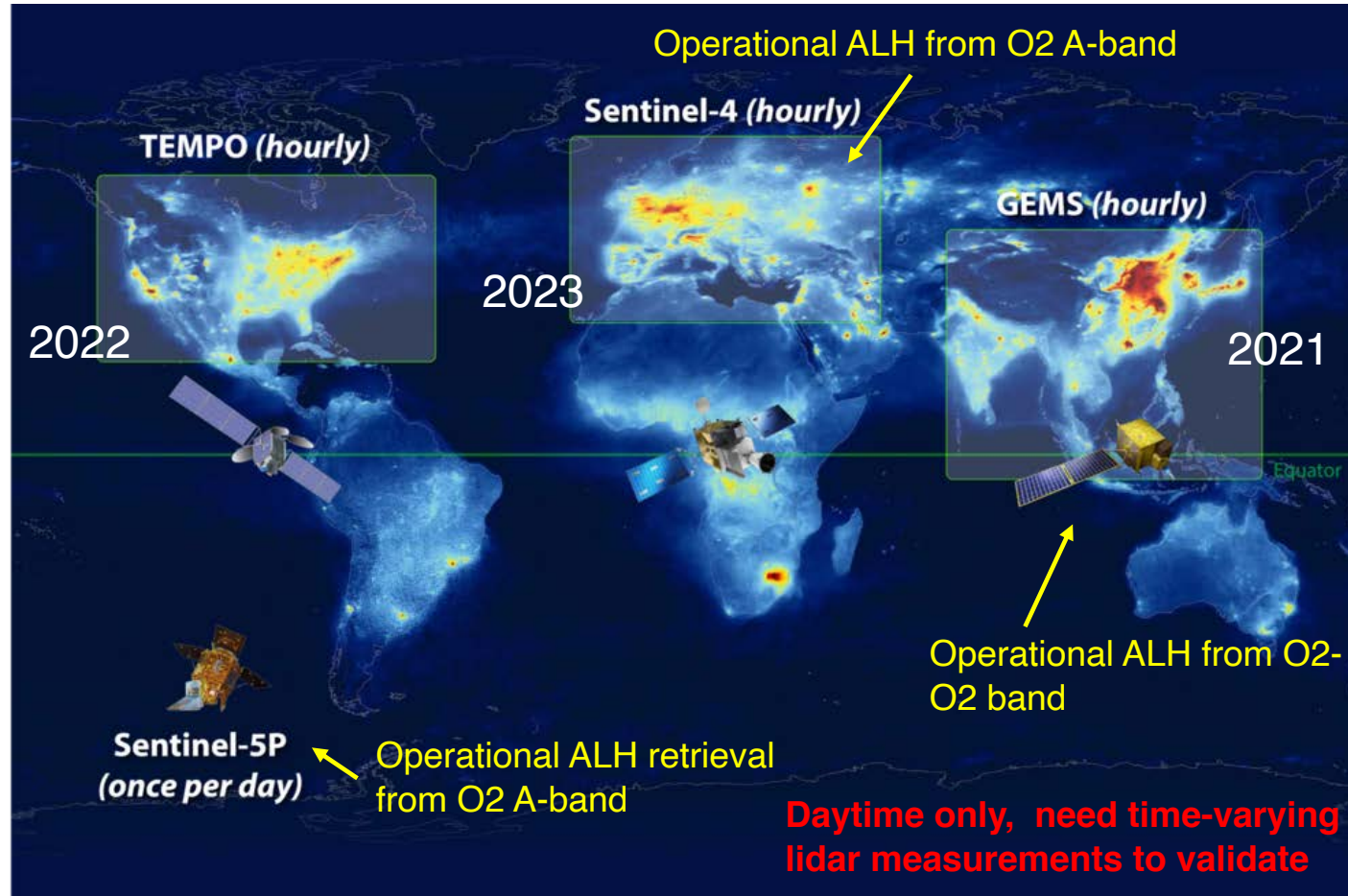
Cons

- Subject to the uncertainties in temperature profile and surface temperature
- Subject to water vapor and gas absorption
- Best for dust particles (and to some degree, thick smoke particles at the source region)
- Subject to the uncertainties of aerosol absorption that is not well constrained in the infrared spectrum, and particle size

Thoughts for future directions



GEO constellation for atmospheric composition



Geostationary and Extended Orbits (GEO-XO)

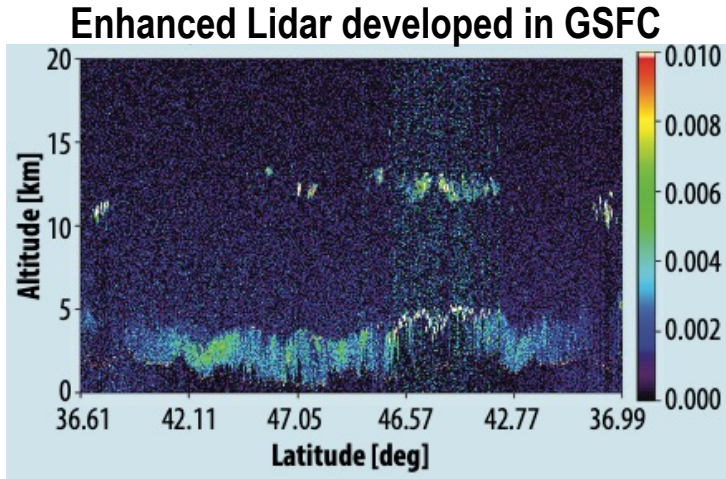
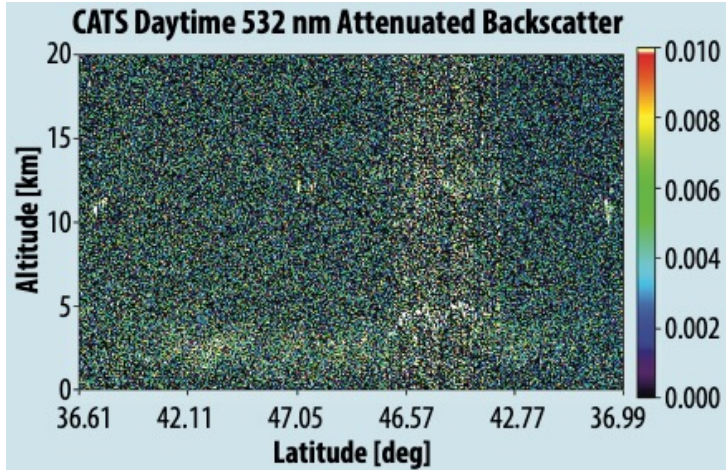


<https://www.nesdis.noaa.gov/GEO-XO>

Now in formulation

Requirements & recommendations of a SmallSat Mission

do we wait before A-CCP in 2028 (or later)?



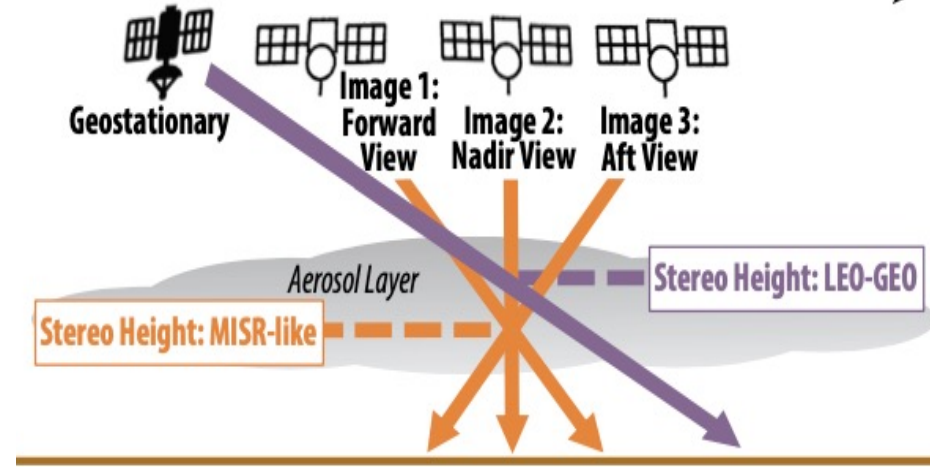
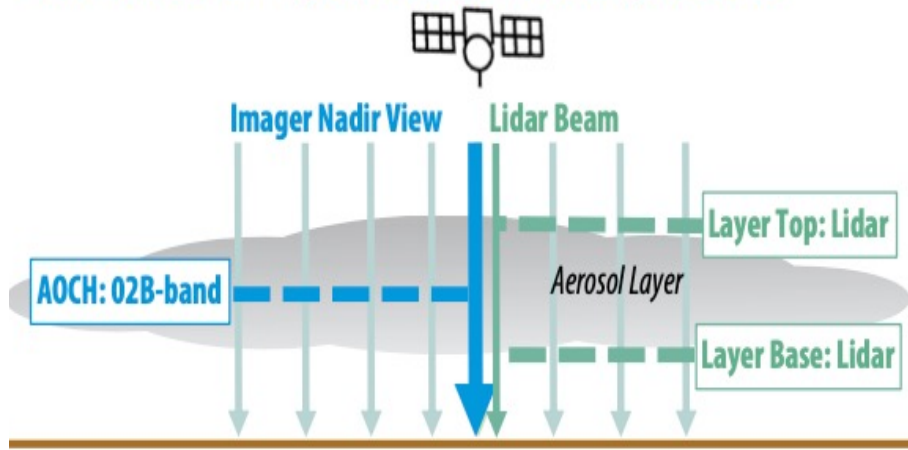
- A pathfinder to A-CCP -> **emergent**
- Fill in the data gap of aerosol vertical profile with unprecedented spatial coverage → **combine active and passive techniques**
- Time-varying measurements to sample the diurnal cycle in the vertical to complement the horizontal observation from GEO -> **inclined LEO**
- Low risk and low cost -> **excellent heritage**
- Near real time for societal benefits -> **data latency < 6 hours**

→ Synthetic data based on newly developed (smaller and enhanced) lidar in GSFC; Courtesy: J. Yorks

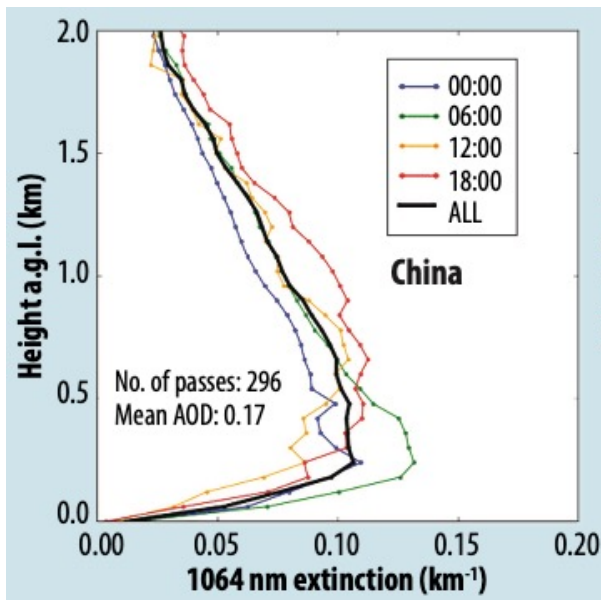
Payloads

- **An elastic (Mie) backscatter lidar**
 - Measure both backscatter and depolarization at 532 nm and 1064 nm (heritage from CALIOP and CATS)
 - Enhanced SNR due to inclined LEO (altitude of ~450 km)
- **A multi-angle view imager with a minimum of 3 bands and 3 angles**
 - Three angles (forward, backward and nadir) for stereo-height mapping
 - Three wavelengths (blue, 670 nm and 688 nm O2 B-band) for plume height mapping
- **Synergistic use of GEO data**
 - Enhance retrieval of stereo height (to minimize the uncertainties from impact of along-the-track motion)

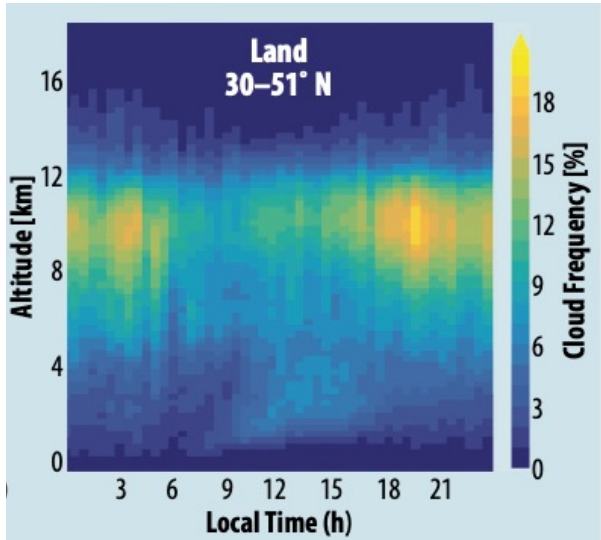
Four techniques together to provide unprecedented characterization of aerosol vertical distribution



- Accuracy: lidar data can help correct localized bias in imager-based height data
- Spatially: imager-based AOCH and stereo height data help expand lidar data
- Temporally: time varying, around-the-clock measurements
- Multiple-angle + O2 B-band further helps the retrieval in the downwind region.
Chen et al., 2021, in review.



Lee et al.,
2019



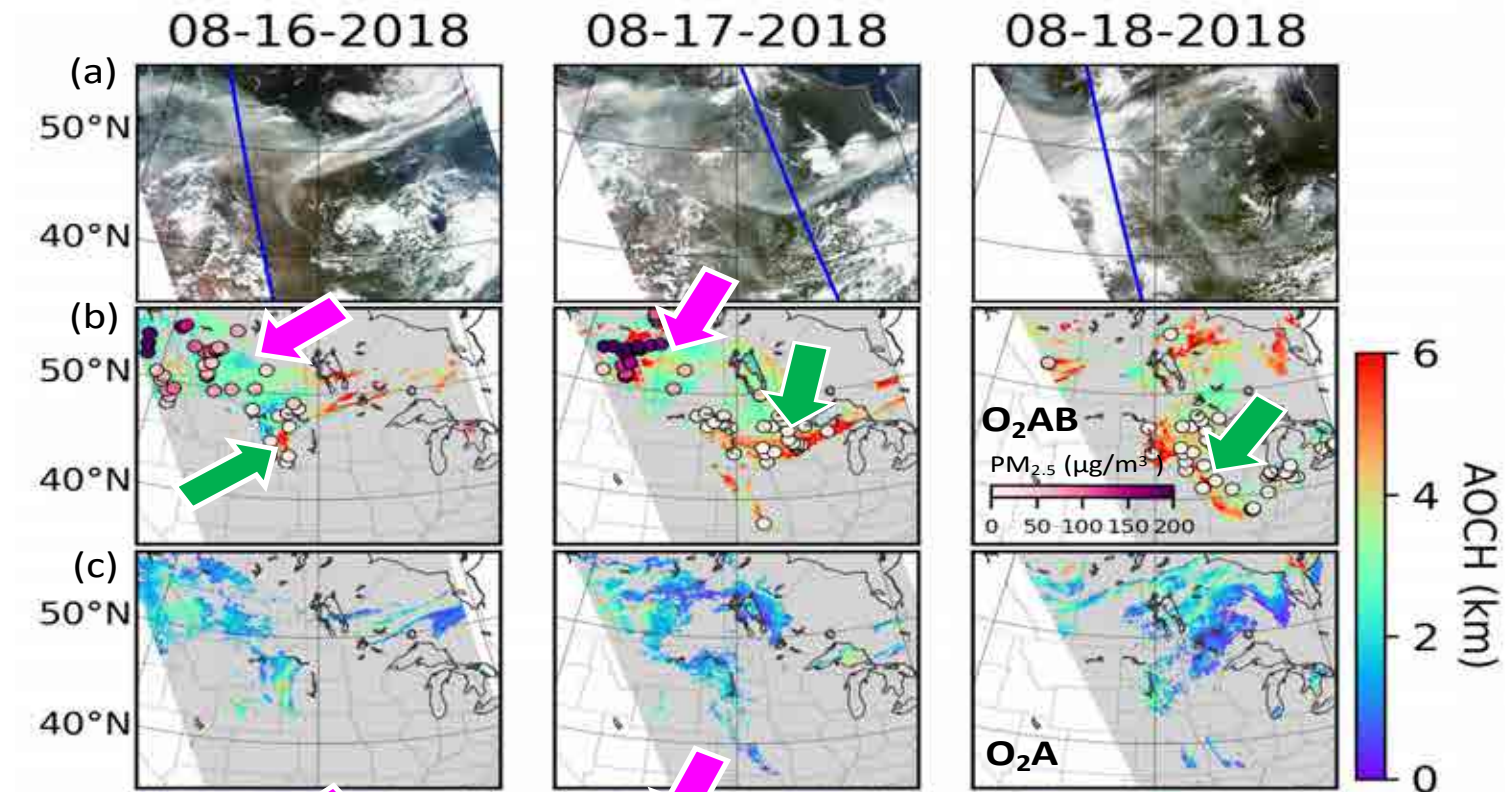
Y. Yorks

Co-benefits

- Cirrus cloud optical properties and forcing
- Characterization of low-level cloud heights
- Surface PM_{2.5} and air quality studies (complementary to MAIA and GEO constellation for atmospheric chemistry)
- Upper Troposphere and Lower Stratosphere (UTLS) studies
- Climate studies for smoke and dust injections and long-range transport
- Operational short-term forecast of aerosol transport
- Boundary layer research
- ...

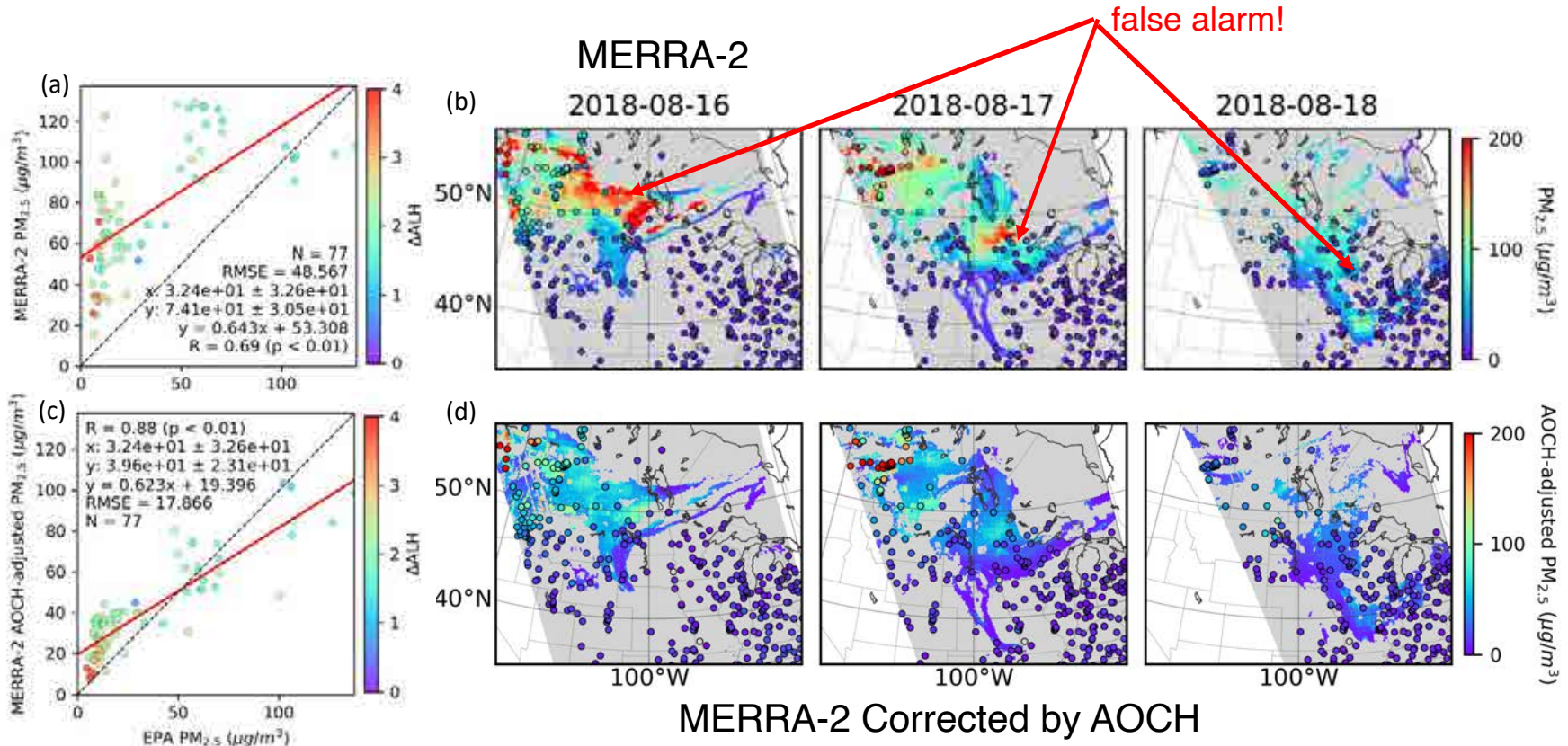
Demonstration for societal benefits

- Air quality forecast is needed by the state/local communities to make advisories/decisions for mitigating public exposure to air pollution.
- Aerosol layer height is one of the most needed information air quality managers wants (based on HAQST group discussion on air quality forecast in smoke conditions).



Improvement on prediction and analysis

- While the measurements of APOCH at fire source region helps, equally and perhaps even more important is the APOCH at the downwind, where the smoke has a far reaching effect.
- This underscores the importance to combine multiple-angle and O₂ absorption band to achieve spatial converge and use lidar for details, bias correction, and information at night.

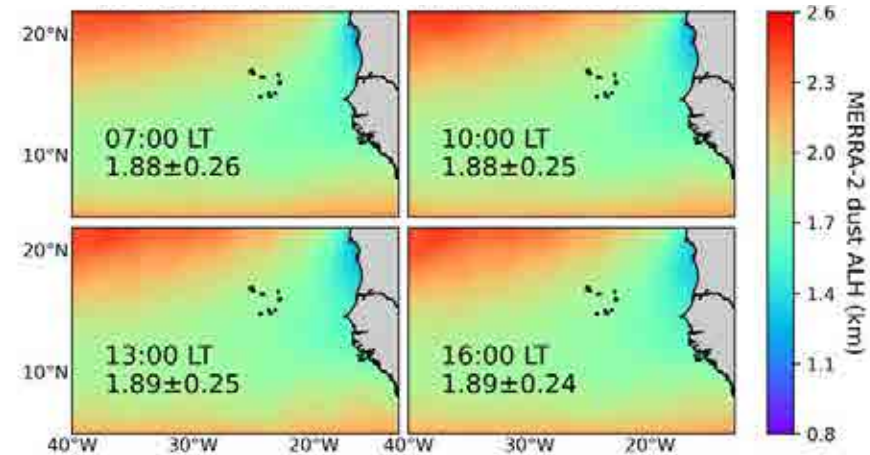


Diurnal variations

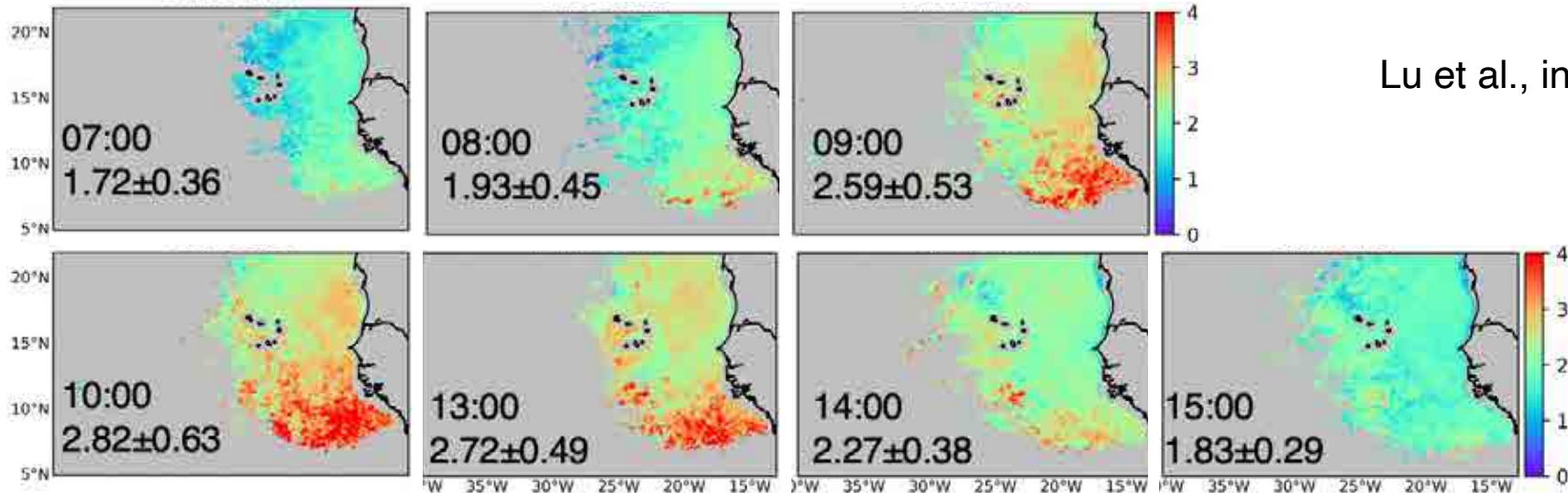
MERRA-2 clearly has deficiency to describe the diurnal variation of dust layer height seen by EPIC

EPIC-based, dust AOCCH at each hour
Multi-yr mean of 2015-2019 in May - Oct

MERRA-2



Lu et al., in prep.



Summary & Outlook

- **A brief review** is given on the satellite remote sensing of aerosol vertical distribution
- **A SmallSat mission** is emergently needed to measure the diurnal variation of aerosol vertical distribution with unpresented spatial coverage and NRT capability
 - Avoiding data gap in Program of Record of aerosol vertical profiles
 - Serving as a pathfinder for future A-CPP and other mission(s)
 - Enhancing the GEO constellation for atmospheric composition
 - Providing complementary information to MAIA, PACE and JPSS
- **Recommendations**
 - Inclined LEO orbit, elastic lidar + multiple-angle view imager (with blue and O2 B-band as a minimum)
 - Field campaigns, surface network, and modeling should be part of the mission
 - GEMS (Asia) and TROPOMI (Europe) have operational product of aerosol height product. As a community, we need to **act now!**

Thank you.



MURI

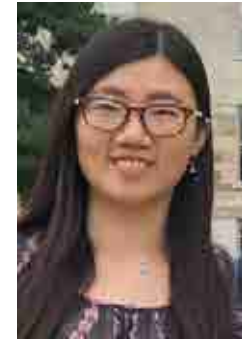


GEO-XO



Xiaoguang Xu
UMBC

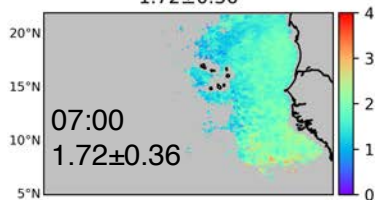
Xu, X., J. Wang, Y. Wang, and A. Kokhanovsky
(2018), Passive remote sensing of aerosol
height. <https://doi.org/10.1016/B978-0-12-810437-8.00001-3>



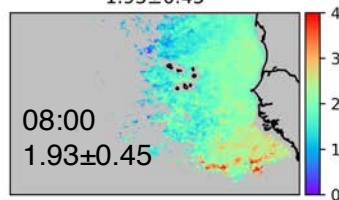
Xi Chen
U. Iowa

For papers and further exchanges, please contact via
jun-wang-1@uiowa.edu
<http://arroma.uiowa.edu>

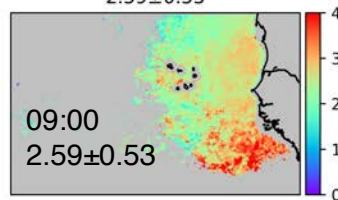
07:00 LT (# of samples:1000)
1.72±0.36



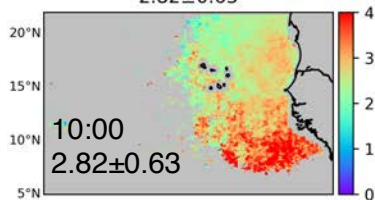
08:00 LT (# of samples:996)
1.93±0.45



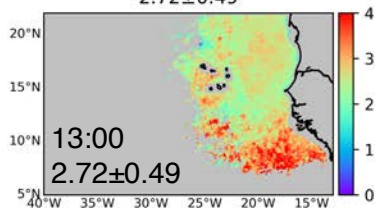
09:00 LT (# of samples:991)
2.59±0.53



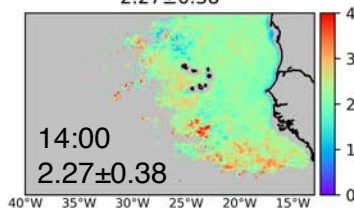
10:00 LT (# of samples:996)
2.82±0.63



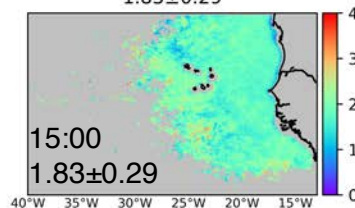
13:00 LT (# of samples:925)
2.72±0.49



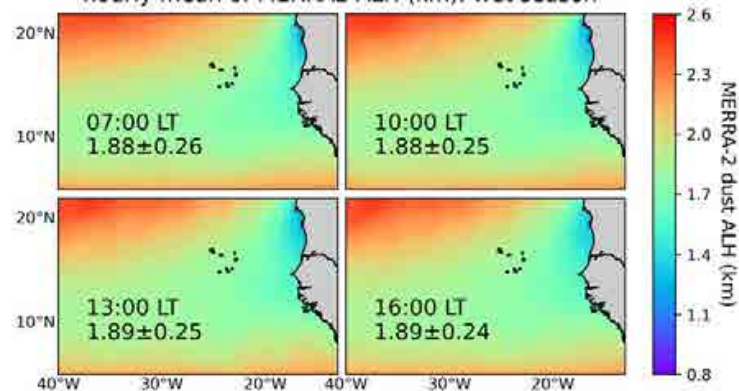
14:00 LT (# of samples:962)
2.27±0.38



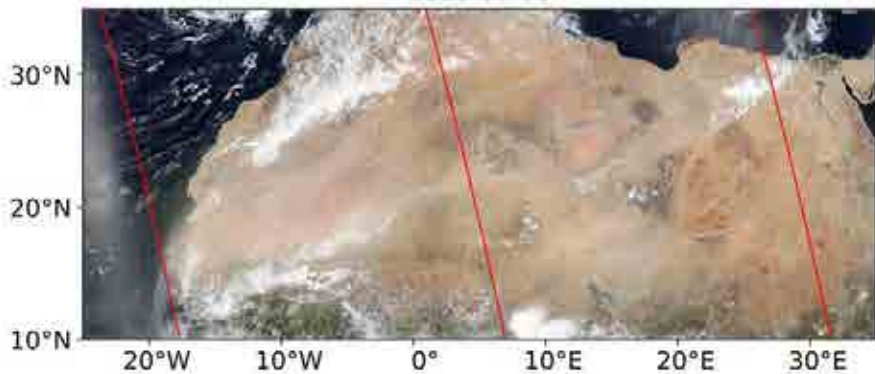
15:00 LT (# of samples:936)
1.83±0.29



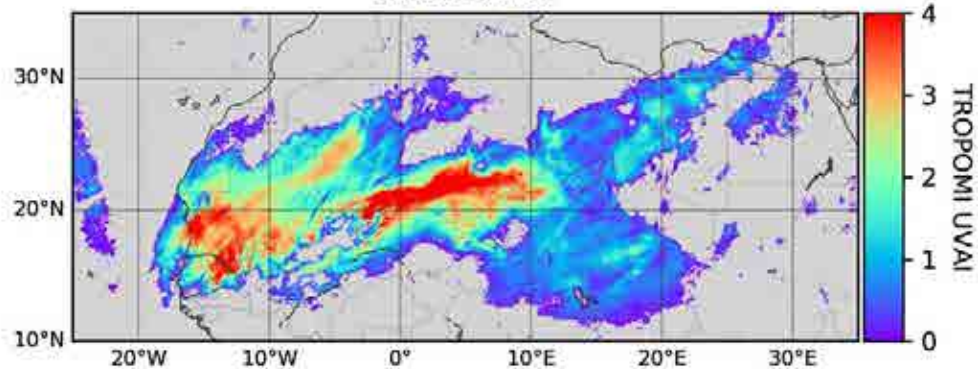
hourly mean of MERRA2 ALH (km): wet season



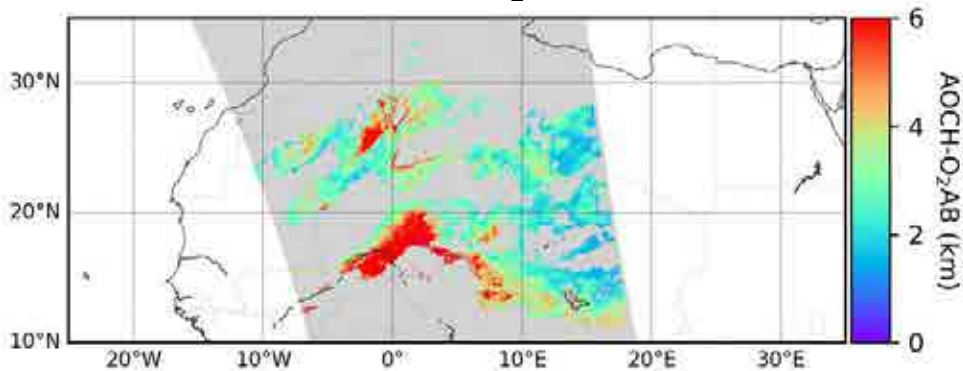
2020-06-06



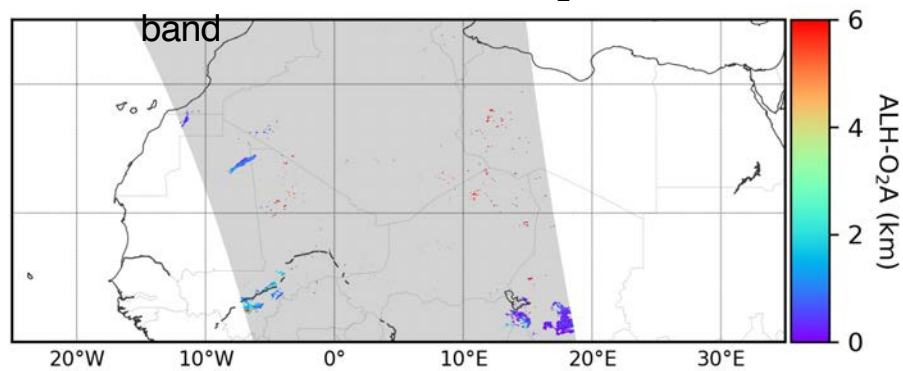
2020-06-06



TROPOMI AOC_H from O₂ B + A band



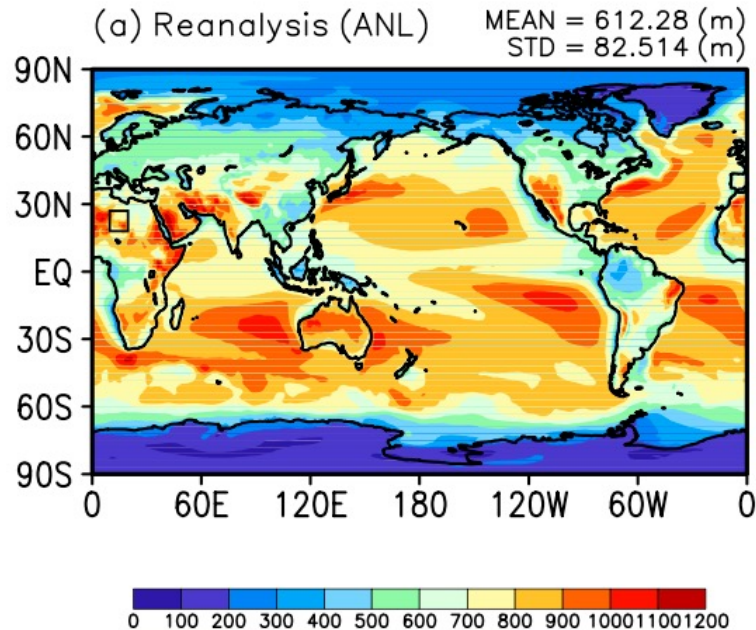
TROPOMI L2 ALH from O₂ A



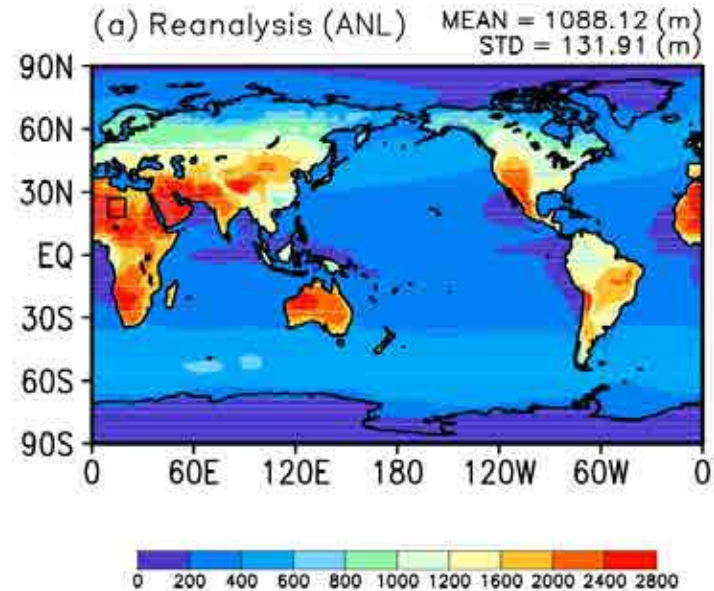
Modeled PBLH itself is elusive in some ways

Definition of PBLH; PBL scheme; ...

PBLH mean from three re-analysis



PBLH diurnal amplitude



A rising trajectory of geostationary satellites for air pollution

GEMS 02/18/2020;
TEMPO & Sentinel-4,
2022/23



GEO-XO
2030?



Kim et al.,
2020
Chance et
al., 2019
Zoogman et
al, 2017

Fishman et
al., 2012

Lahoz et
al., 2012

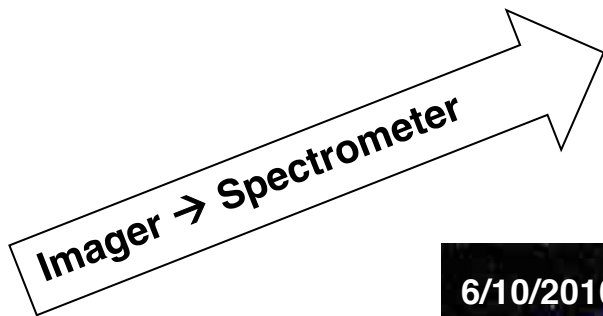
Schmit et al.,
2017

Lee et al., 2010.
RSE
6 visible
2 NIR

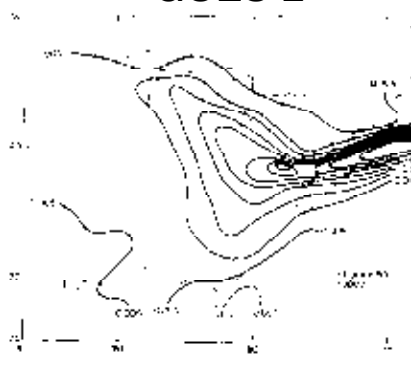
MSG, 8/28/2002
12 channels
2 visible

6/10/2010
GOCI

GOES-R
2016

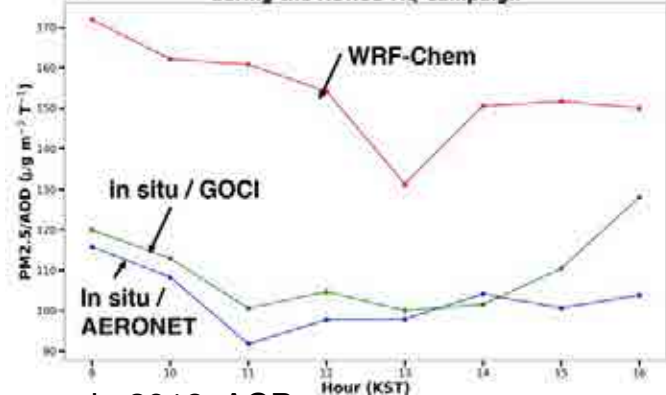


GOES-2



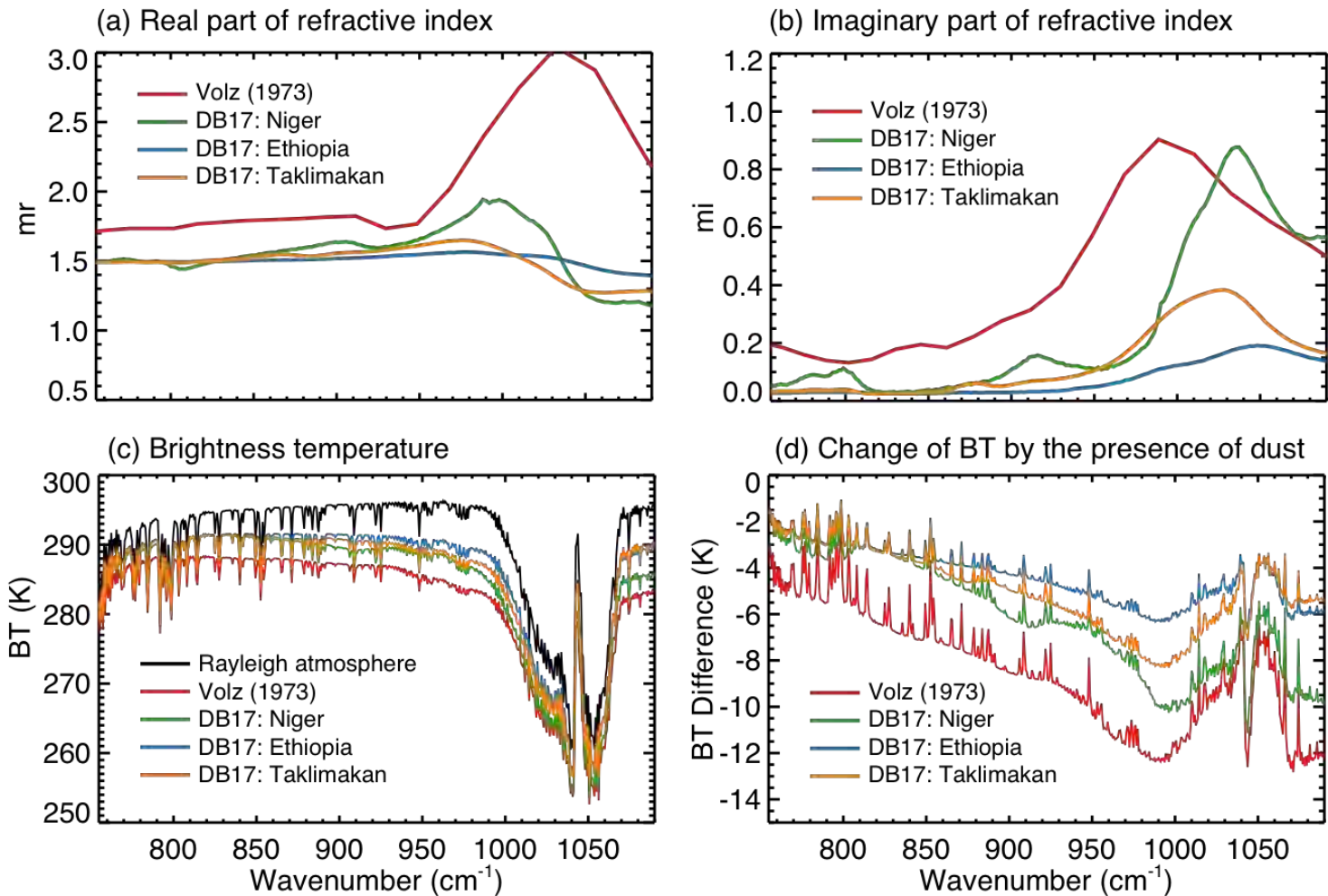
Fraser et a., 1984, AE

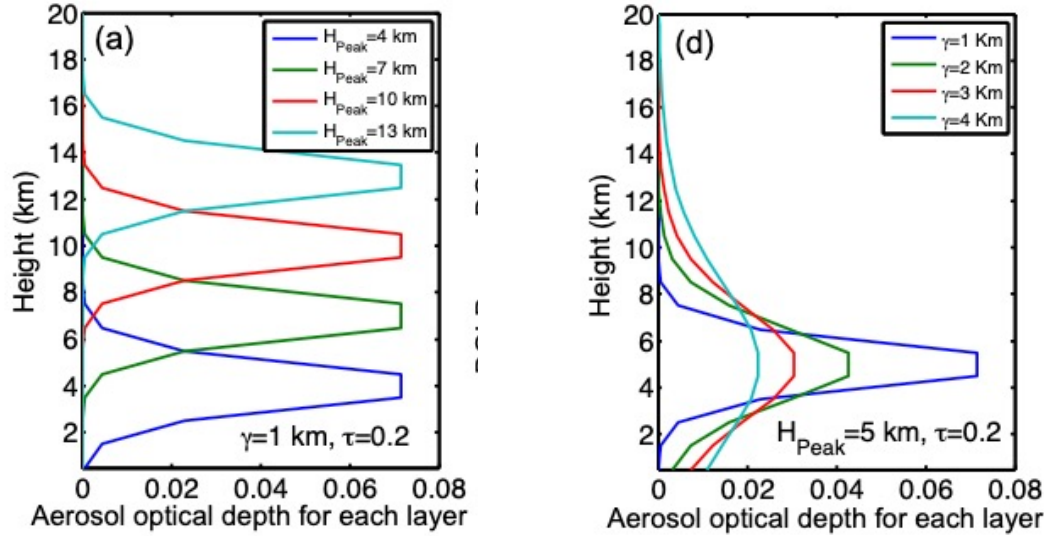
Diurnal Variation of PM_{2.5}/AOD Ratio during the KORUS-AQ Campaign



Lennartson et al., 2018, ACP

Impacts on dust refractive index uncertainty on the infrared spectra





$$\tau_A(z) = K \frac{\exp(-\gamma|z - z_{peak}|)}{[1 + \exp(-\gamma|z - z_{peak}|)]^2} \quad (32)$$

where K is a constant related to τ_{a0} , γ is related to half-width constant σ by $\gamma = \ln(3 + \sqrt{8})/\sigma$, and z_{peak} is the height having peak loading.