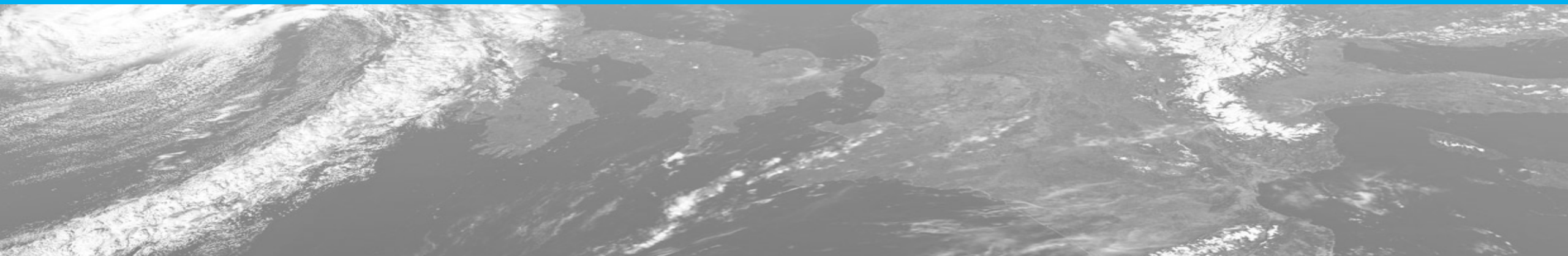




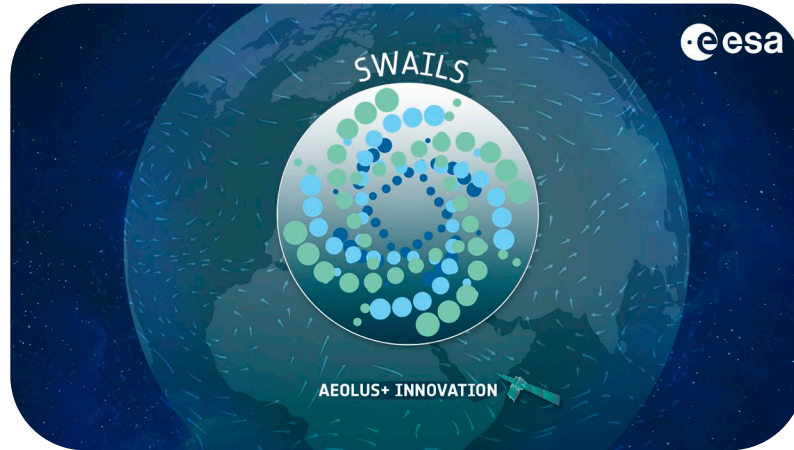
Lidar Aerosol Retrieval based on Information from Surface Signal of Aeolus

L. Labzovskii, G. J. van Zadelhoff, D. Donovan, D. Josset

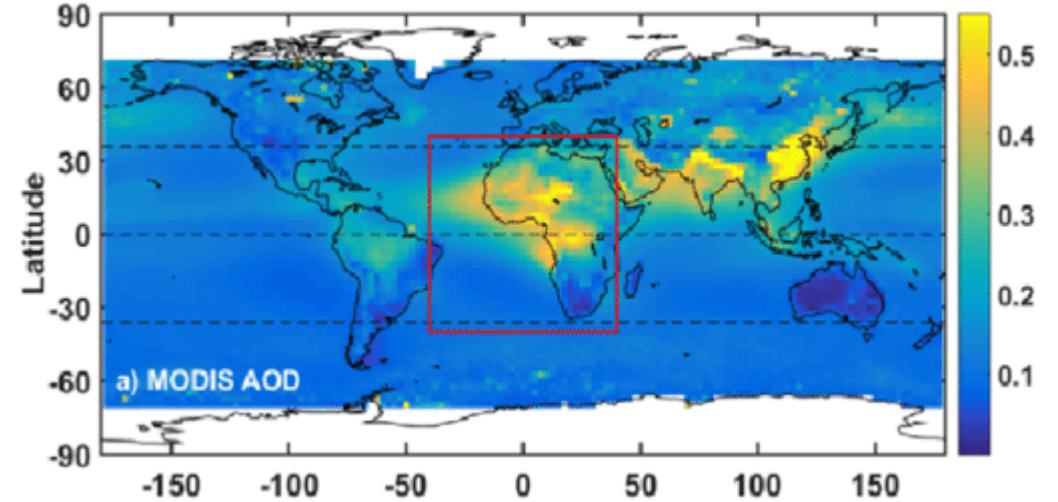




RESEARCH AIM AND MOTIVATION



AOD distribution [Wang et al., 2018]



LARISSA – Lidar Aerosol Retrieval Based on Information from Surface Signal of Aeolus

RESEARCH AIM

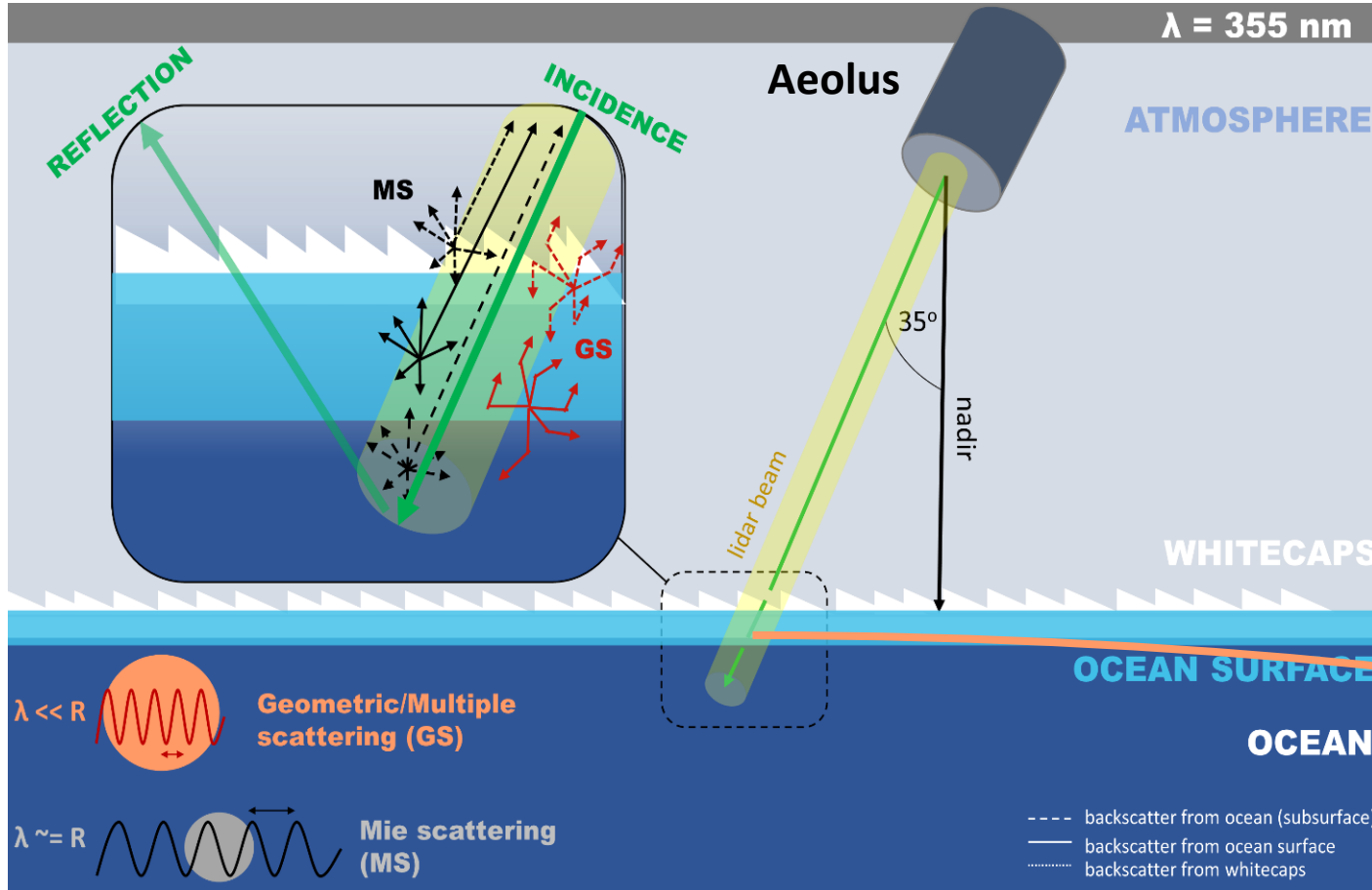
To introduce independent AOD retrieval using lidar surface returns (LSR) from ocean for Aeolus

IMPLICATIONS

- New **independent** estimates from lidar surface returns -> No **assumption about** aerosol microphysics
- Empirically untested AOD retrieval at these lidar settings -> 37.5° incidence, UV wavelength, LSR-based method
- Support **future aerosol-oriented spaceborne instruments** -> such as ATLID on EarthCARE

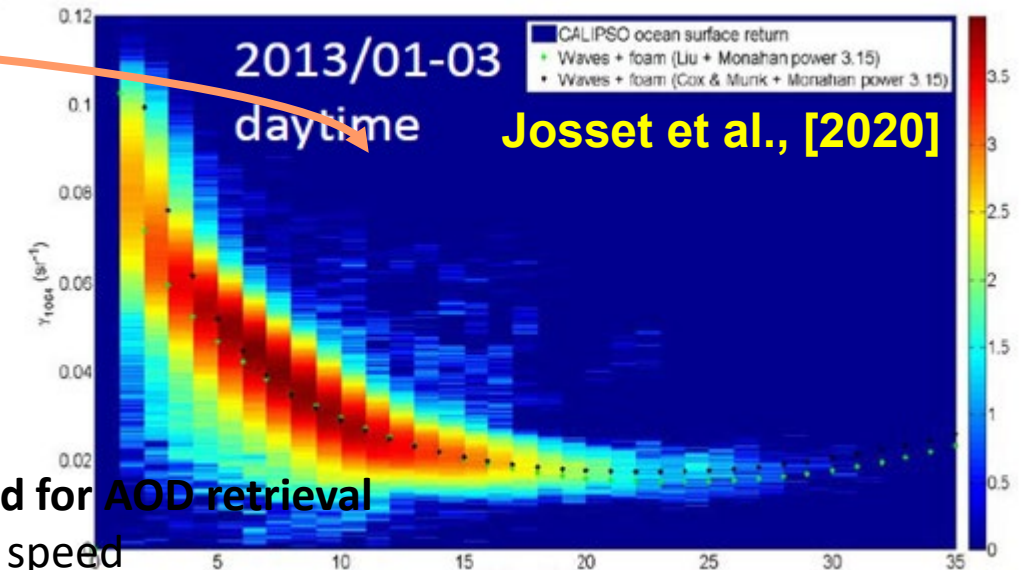


FUNDAMENTALS OF LSR-BASED AOD RETRIEVAL FOR AEOLUS



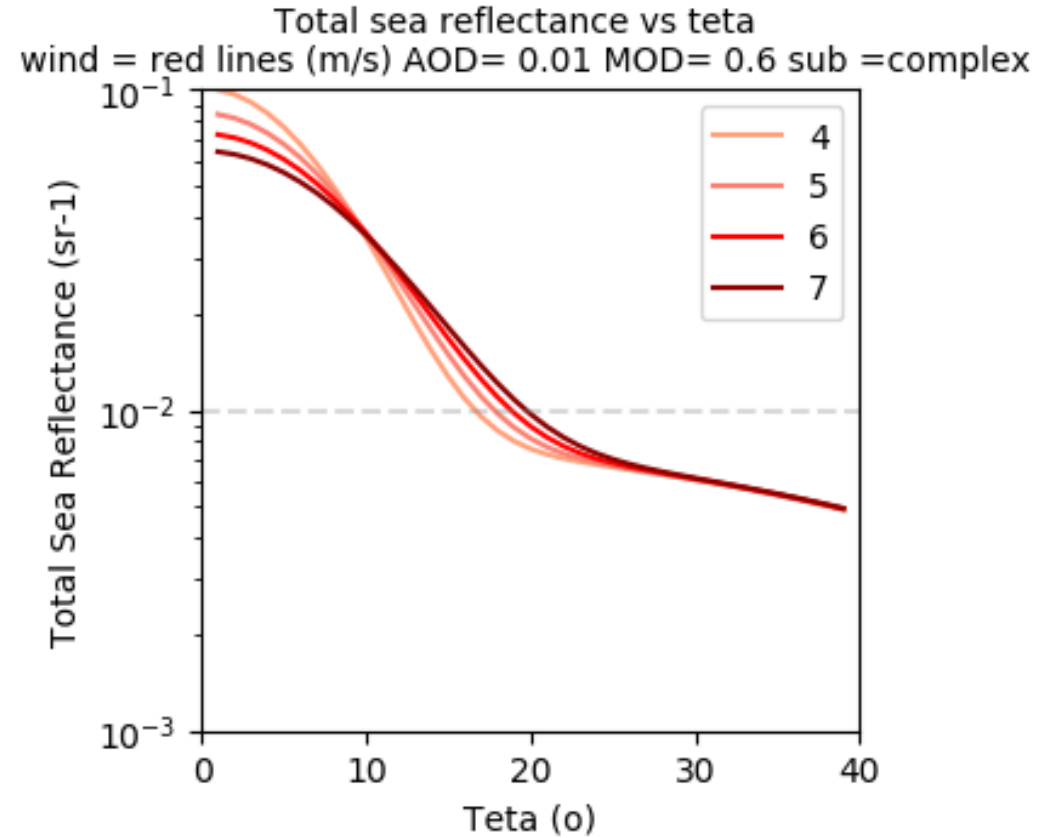
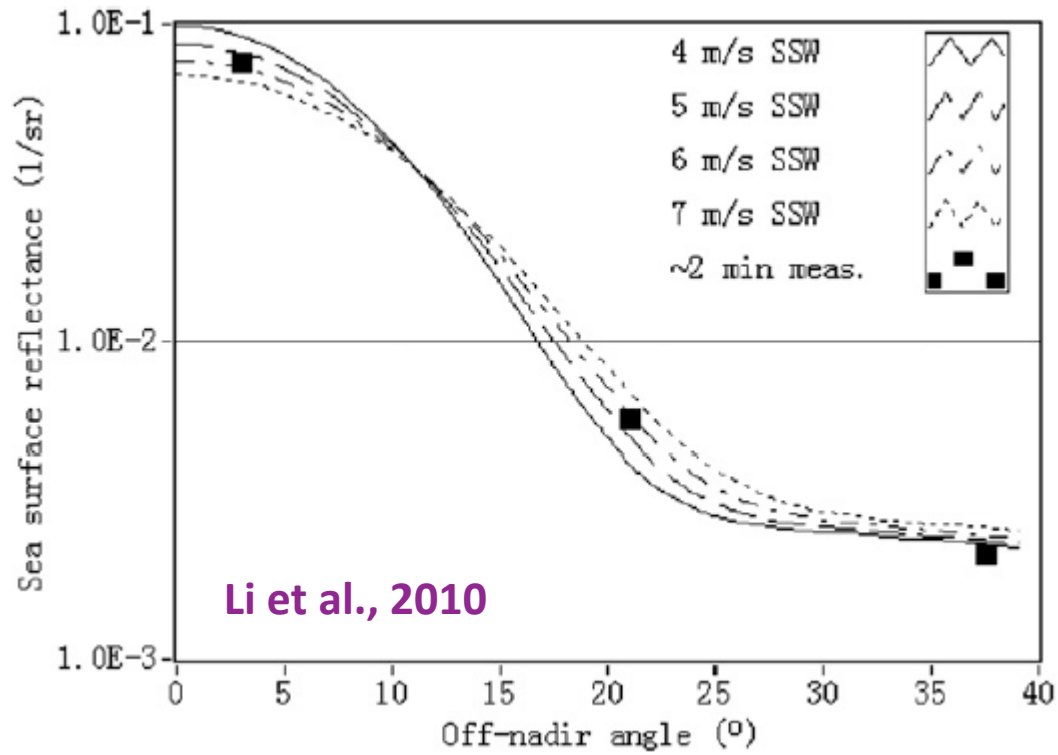
Instrument and data

- **Instrument:** ALADIN (Atmospheric Laser Doppler Instrument) onboard Aeolus
- **Wavelength:** $\sim 355 \text{ nm}$
- **Period:** Intensive Observation Period (IOP: 14 – 23 September 2019)
- **Input data:**
 - **L2 data:** Surface Integrated Attenuated Backscatter (from Mie Signal)
 - **AUX_MET:** Simulated near-surface wind speed
- **Validation data:**
 - **AEL PRO_L2:** Extinction Coefficient, Rayleigh Backscattering



- Light reflected away -> 2% of remaining backscattered light **can be used for AOD retrieval**
- In simple words -> **Inverse relationship** between LSR and surface wind speed
- Why complicated? -> Highly non-nadir angle of incidence, subsurface contribution at 355 nm

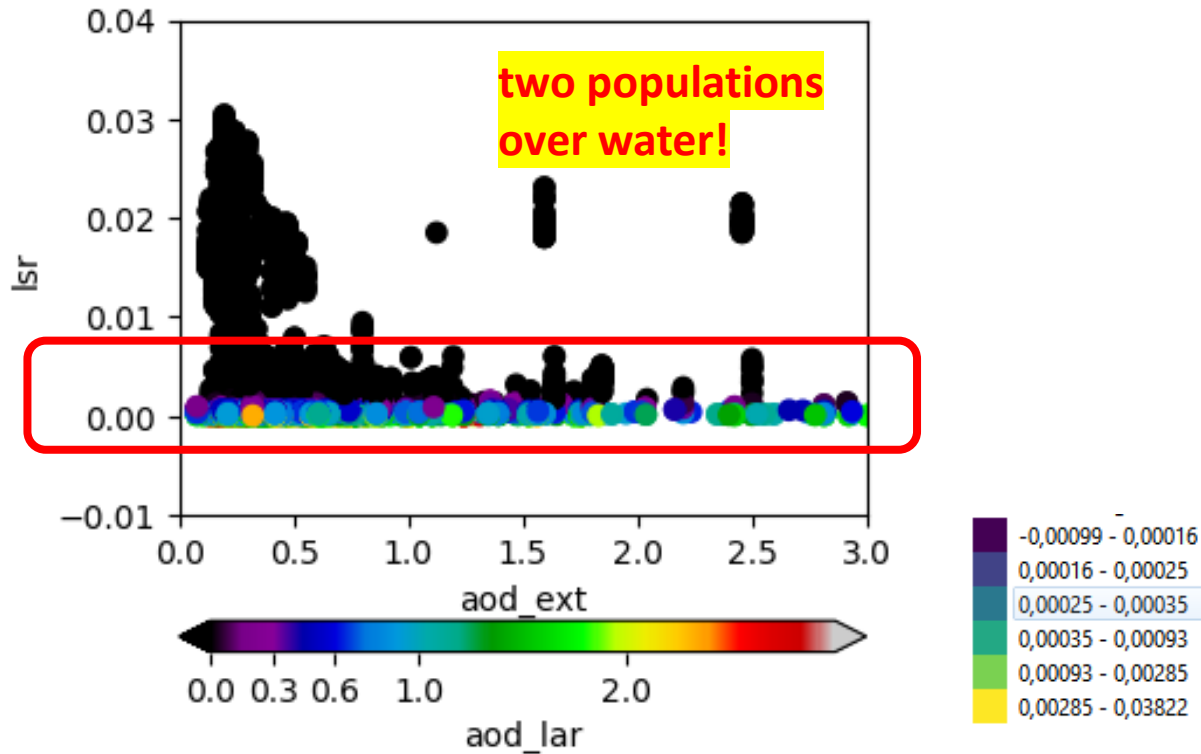
SUMMARIZED SURFACE REFLECTANCE CALCULATION



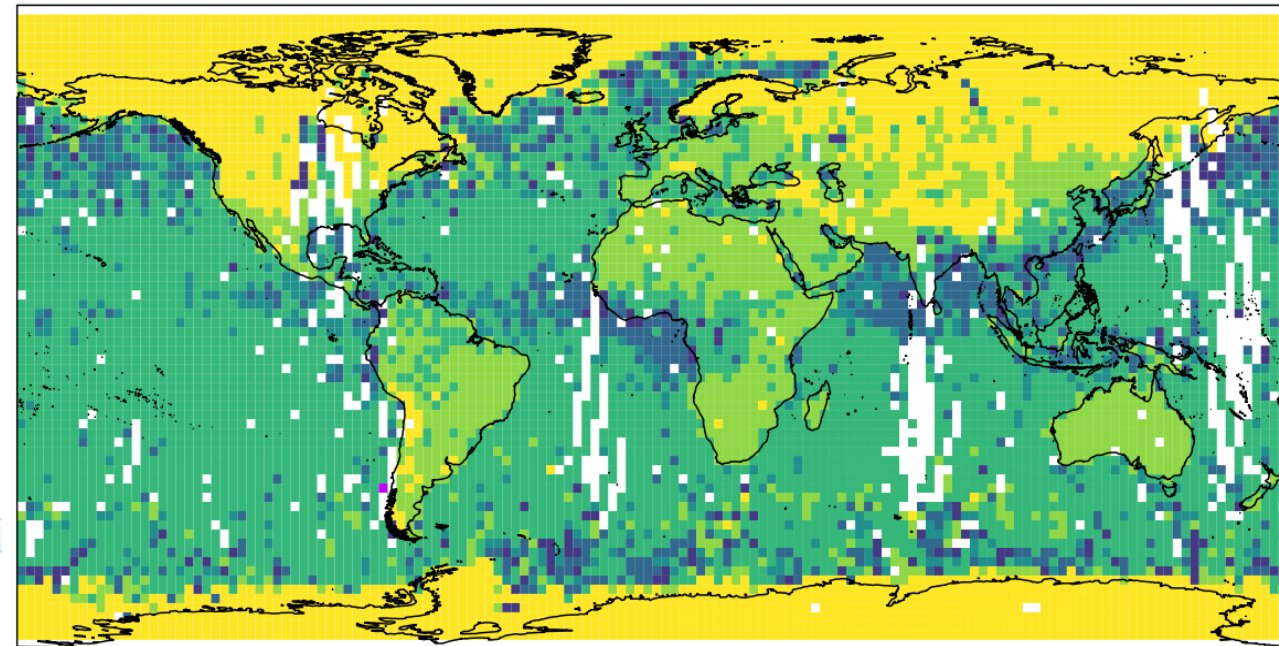
- **Good agreement with previous works** [Li et al., 2010] -> while Josset-2010 equation applied
- Despite good agreement in pattern/magnitude -> Potential **overestimation of subsurface component** at 37.5°

LSR WITH RELATION TO LAND COVER: FIRST 10 DAYS OF IOP

LARISSA aggregated | Horiz av = 30 | Flag = 100 | Peak = no
cor=-0.0 | wind = 0-30 m/s |



Lidar Surface Returns / Surface Integrated Attenuated Backscatter (sr^{-1})



MARCH – APRIL – MAY 2019

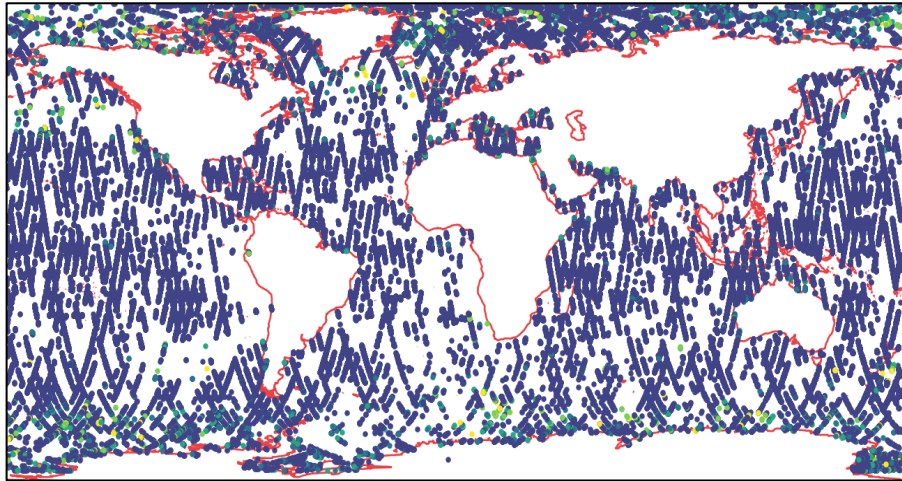
- There are two populations -> Weak LSR ($0.0001 - 0.002 \text{ sr}^{-1}$) and strong LSR ($0.002 - 0.04 \text{ sr}^{-1}$)
- **Many satisfactory returns over oceans (19-34%)** according to SIAB vs $\text{SIAB}_{\text{error}}$ estimate
- As expected -> **Strongest UV returns over white surface** (Albedo > 0.90 for fresh snow [Varotsos et al., 2014; Weiler, 2017])
- Beyond expectations -> A week of **LSR reflects land cover patterns** (dark forests and arid areas are discernible)

WHERE IS USEFUL LSR POPULATION IS LOCATED? STRONG OR WEAK SIGNAL?

Weak population leads to erroneous estimates of AOD (< 0)

LSR (sr⁻¹)

- -0.0001 - 0
- 0 - 0.0008
- 0.0008 - 0.0013
- 0.0013 - 0.0017
- 0.0017 - 0.0023
- 0.0023 - 0.3



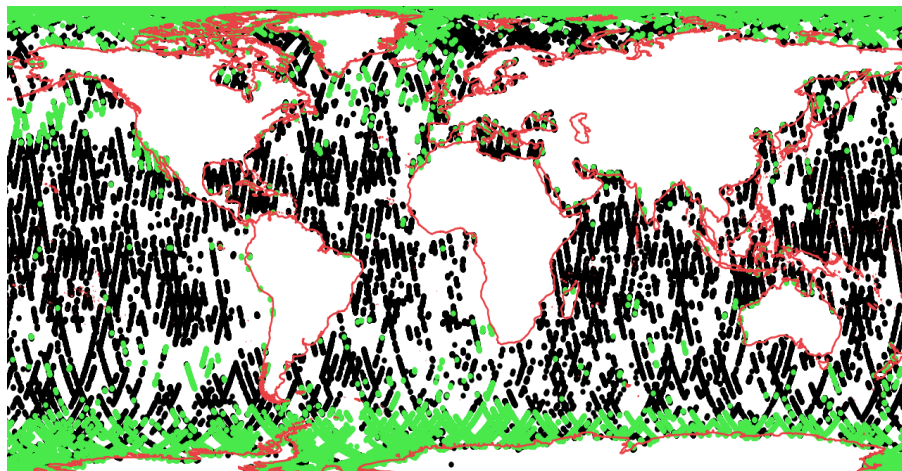
$$AOD = \frac{1}{2} \ln\left(\frac{R_s + R_w + R_u}{\gamma}\right) - OD_m$$

γ – LSR

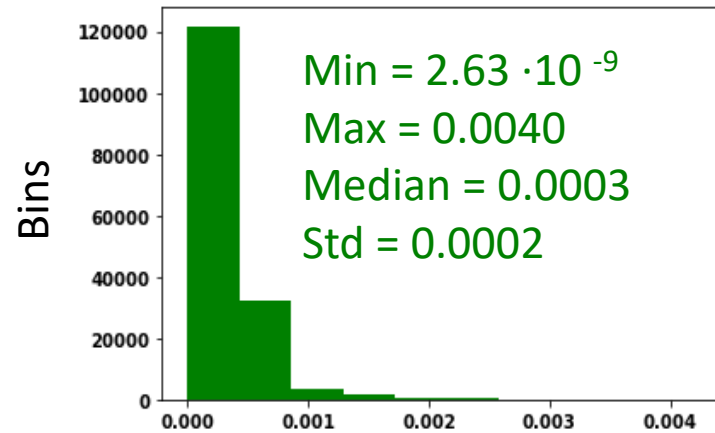
s, w, u – specular, whitecaps, subsurface

OD_m – molecular optical depth

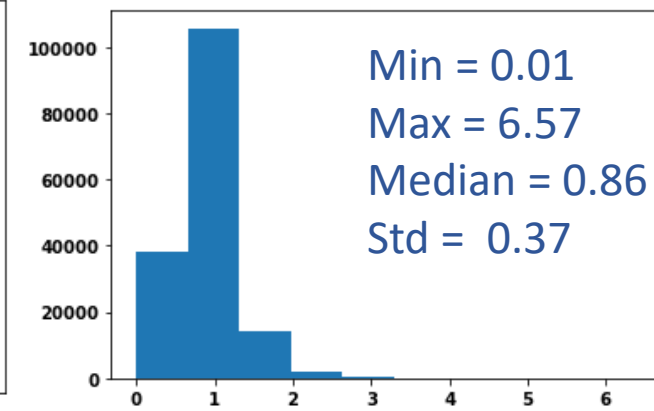
NEGATIVE AOD / POSITIVE AOD



LSR (sr⁻¹)

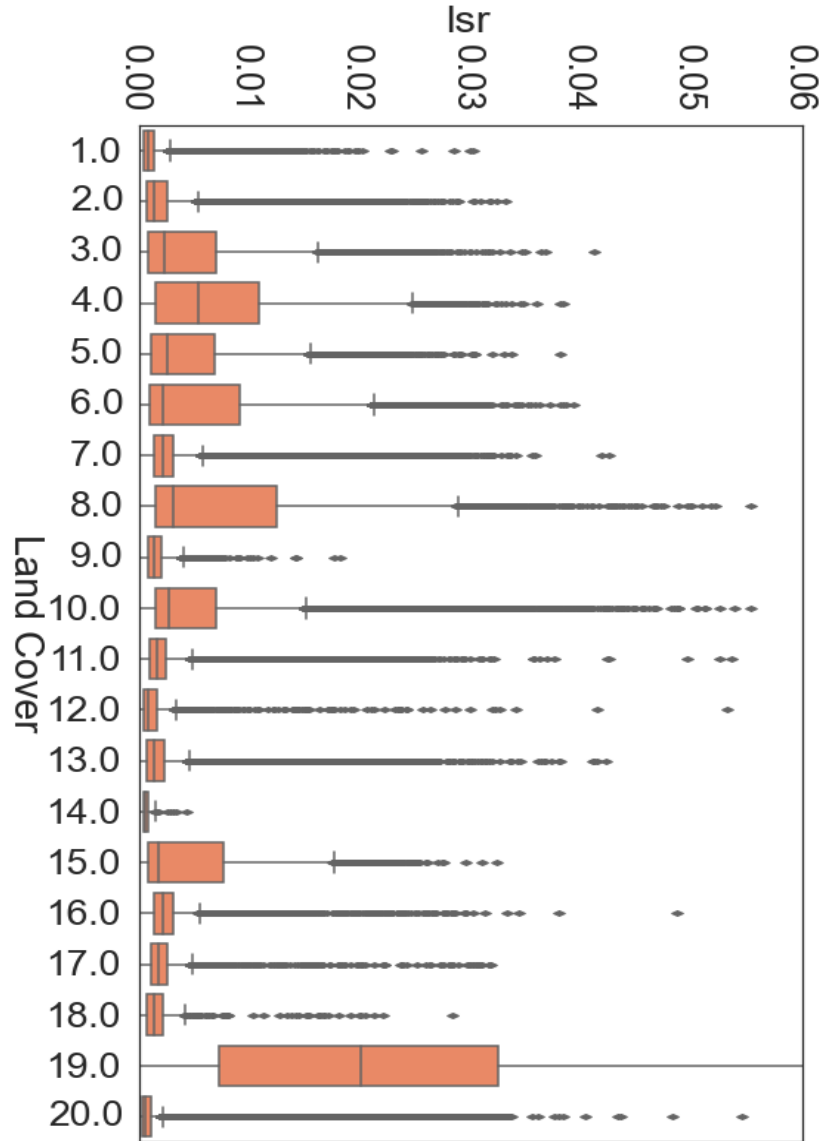


AOD LARISSA

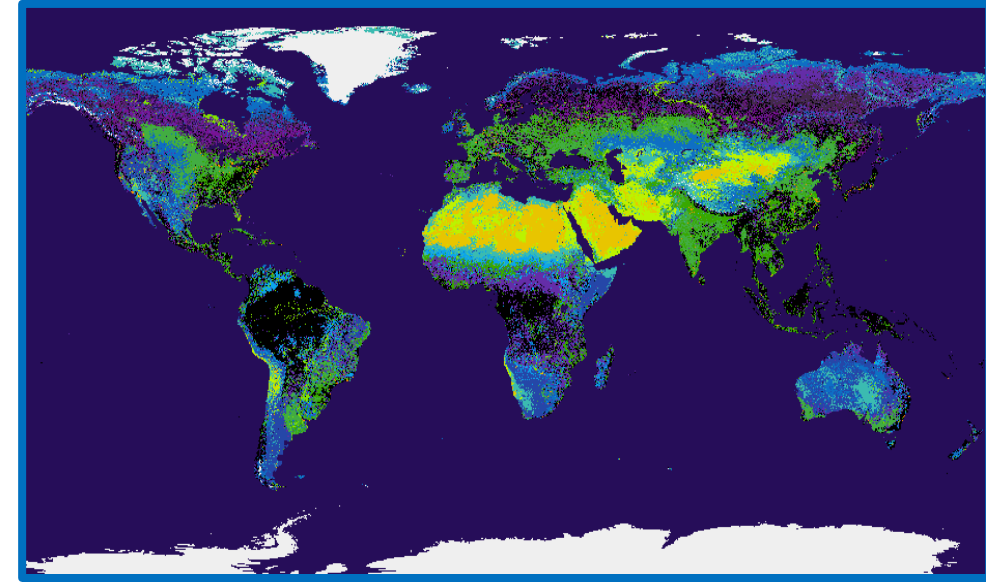


- Useful LSR range = 0.001 – 0.004 (+/- 0.002)

ESTIMATE OF LSR BASED ON LAND COVER WITHOUT SEA ICEA



- 1 Broadleaf Evergreen Forest
- 2 Broadleaf Deciduous Forest
- 3 Needleleaf Evergreen Forest
- 4 Needleleaf Deciduous Forest
- 5 Mixed Forest
- 6 Tree Open
- 7 Shrub
- 8 Herbaceous
- 9 Herbaceous with Sparse Tree/Shrub
- 10 Sparse vegetation
- 11 Cropland
- 12 Paddy field
- 13 Cropland Other Vegetation
- 14 Mangrove
- 15 Wetland
- 16 Bare area, consolidated (gravel,rock)
- 17 Bare area, unconsolidated (sand)
- 18 Urban
- 19 Snow Ice
- 20 Water bodies

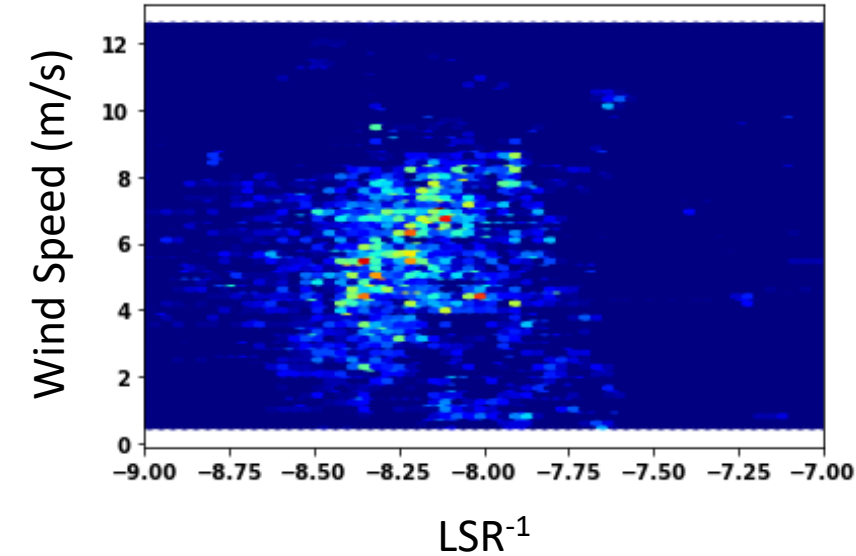


GET: https://github.com/globalmaps/gm_lc_v3
Land Cover (GLCNMO) - Global version - Version 3

- Ice masking by using OSI-SAF ice mask -> Helps tackling the **strong LSR problem over sea**

LSR SENSITIVITY TO WIND IN NORTH PACIFIC

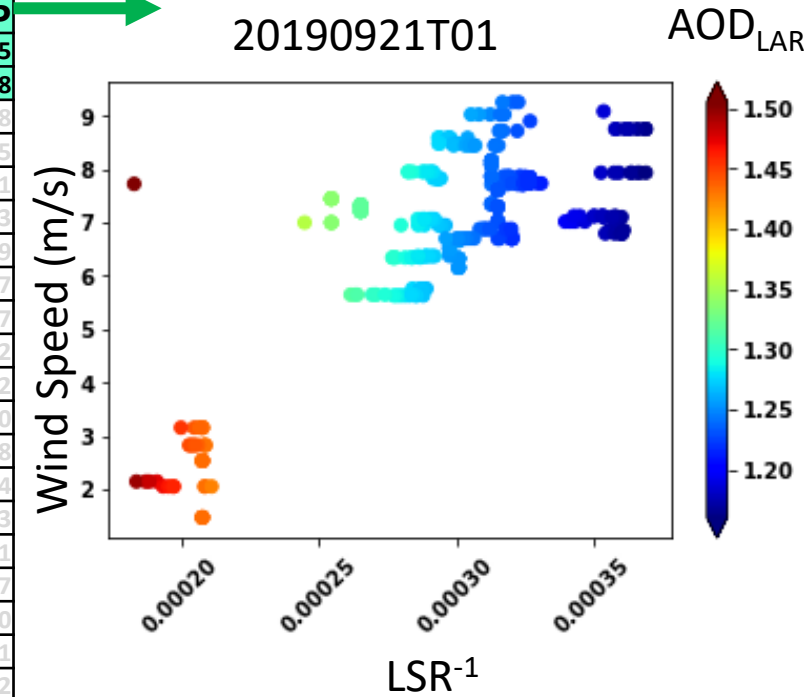
NORTH PACIFIC AGGREGATED



DATE	CORREL
global_ 20190919T00 (FEW POINTS)	0.97
global_ 20190921T01	0.75
global_ 20190921T03	0.65
global_ 20190919T13	0.58
global_ 20190914T03	0.48
global_ 20190920T16	0.45
global_ 20190914T14	0.41
global_ 20190919T16	0.33
global_ 20190915T03	0.29
global_ 20190918T02	0.27
global_ 20190915T15	0.27
global_ 20190921T17	0.22
global_ 20190915T01	0.22
global_ 20190918T13	0.20
global_ 20190917T16	0.18
global_ 20190914T15	0.14
global_ 20190918T16	0.13
global_ 20190914T17	0.11
global_ 20190919T02	0.07
global_ 20190917T04	0.00
global_ 20190919T15	-0.11
global_ 20190919T04	-0.12
global_ 20190920T13	-0.13
global_ 20190921T14	-0.14
global_ 20190920T15	-0.17
global_ 20190915T17	-0.18
global_ 20190915T14	-0.36
global_ 20190917T14	-0.43
global_ 20190918T14	-0.50
global_ 20190917T01	-0.52
global_ 20190918T04	-0.55



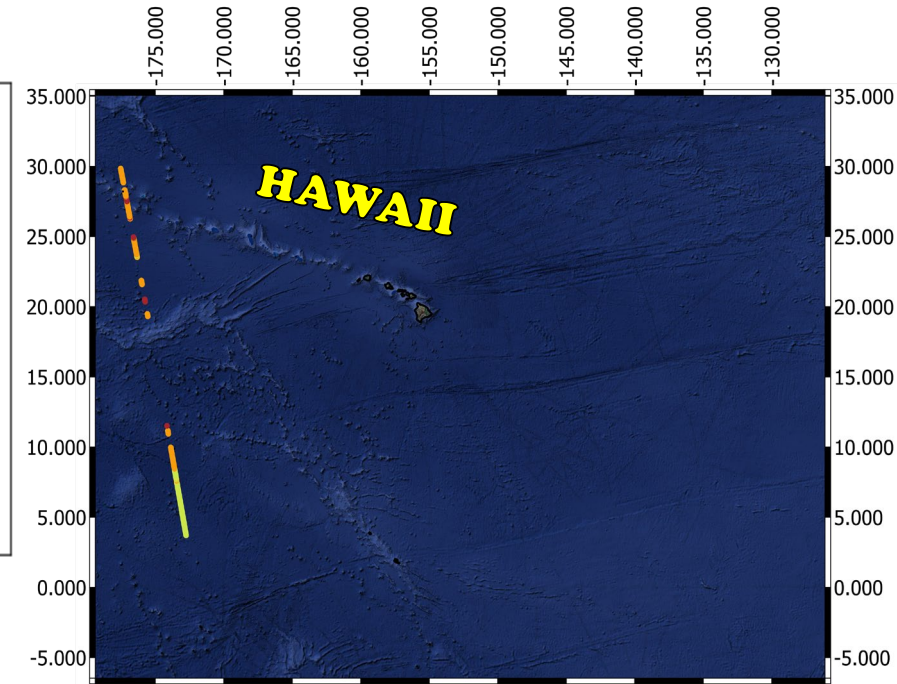
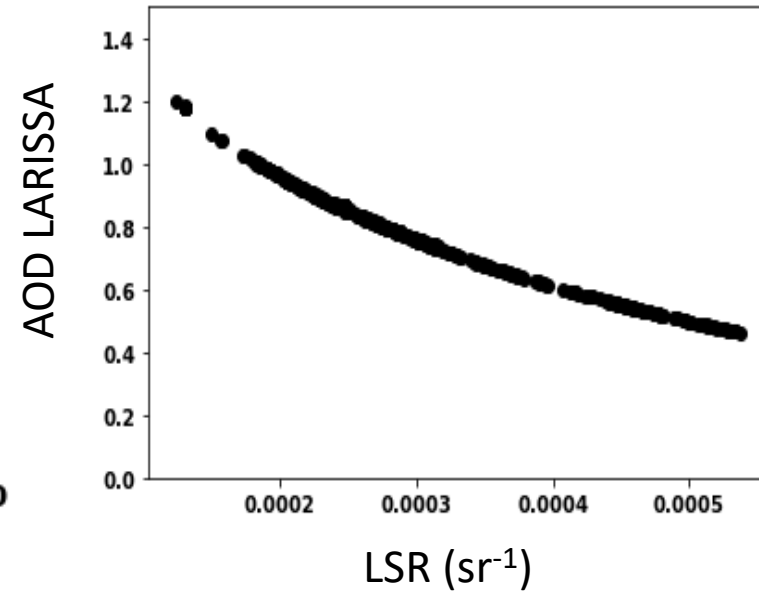
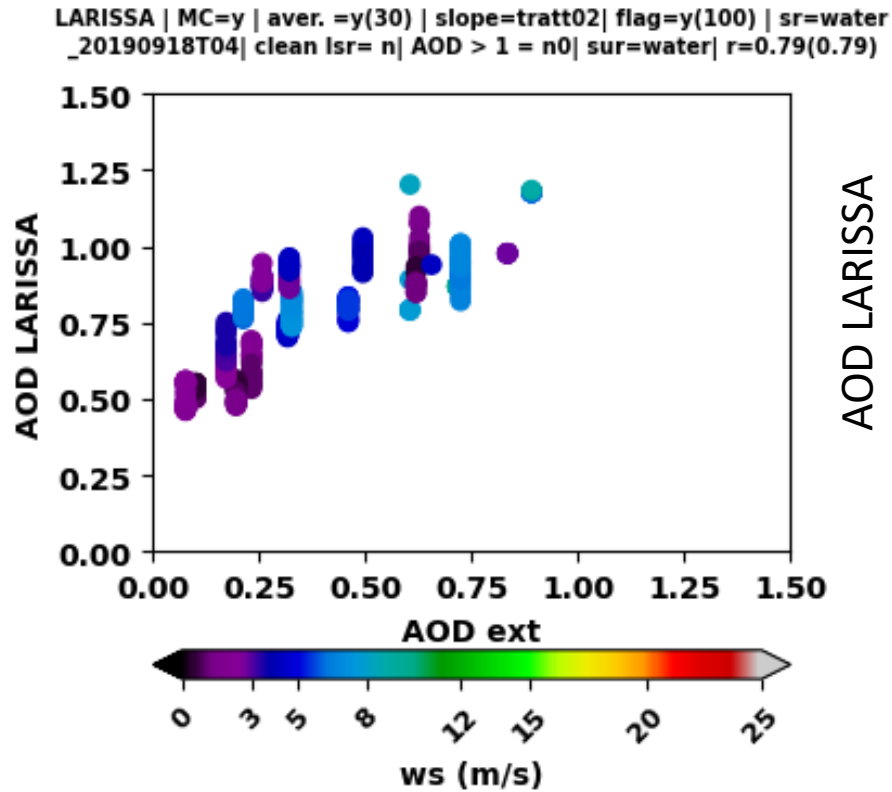
20190921T01



- In some cases positive, in some -> Inverse association between LSR and wind speed



VALIDATION OF AOD_LARISSA vs AOD_EXT

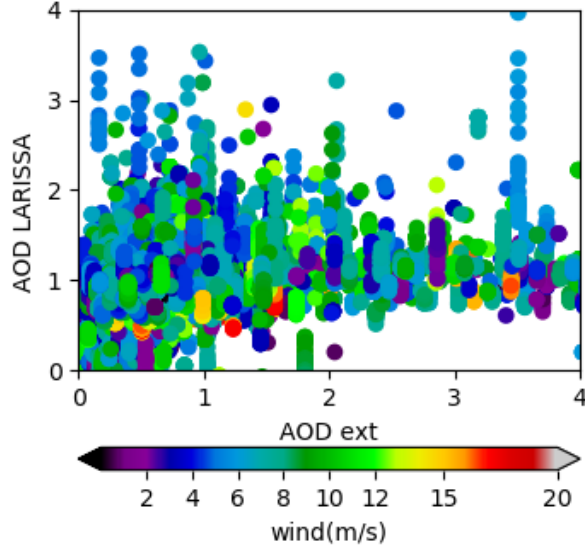


- The best AEL_PRO – LARISSA agreement case
- This case has good agreement -> **Only useful LSR signals (< 0.0005)**
- LSR signal might require filtering based on magnitude as well
- Offset of ~0.50 between LARISSA and AEL_PRO -> Systematic or not?

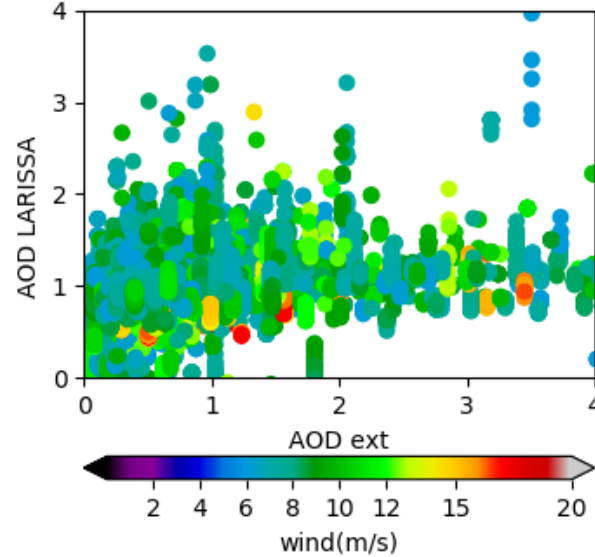
GLOBAL SCALES: NO STRONG SENSITIVITY TO WIND SPEED



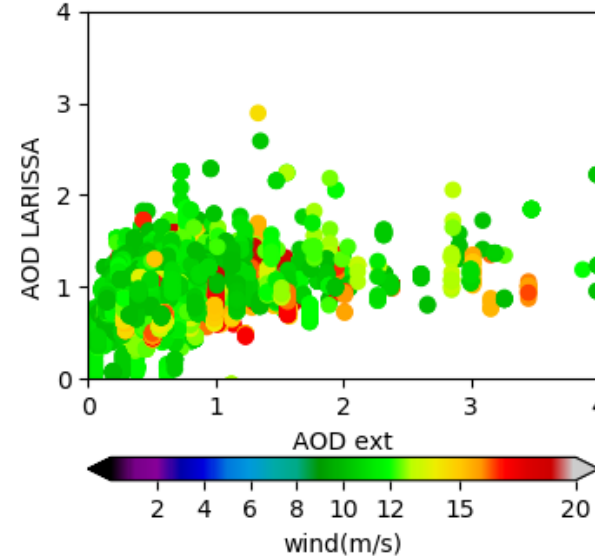
LARISSA aggregated | Horiz av = 30 | Flag = 100 | Peak = no
cor=-0.01 | wind =0-30 m/s |



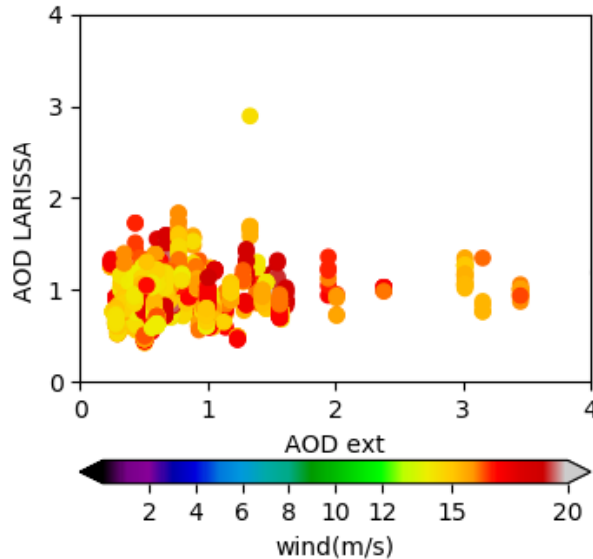
LARISSA aggregated | Horiz av = 30 | Flag = 100 | Peak = no
cor=-0.02 | wind =6-30 m/s |



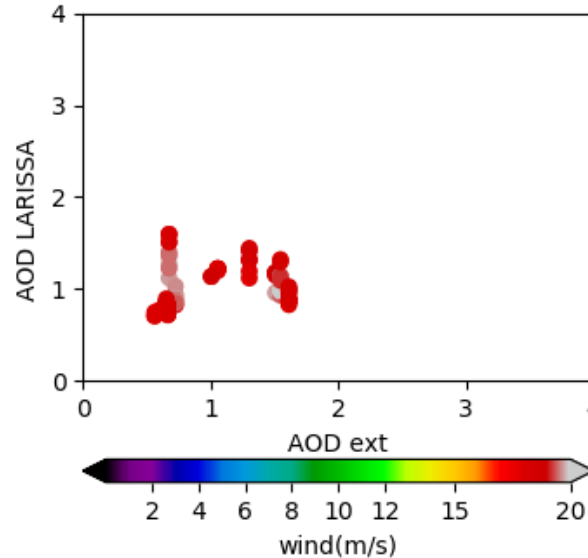
LARISSA aggregated | Horiz av = 30 | Flag = 100 | Peak = no
cor=0.02 | wind =10-30 m/s |



LARISSA aggregated | Horiz av = 30 | Flag = 100 | Peak = no
cor=0.52 | wind =14-30 m/s |



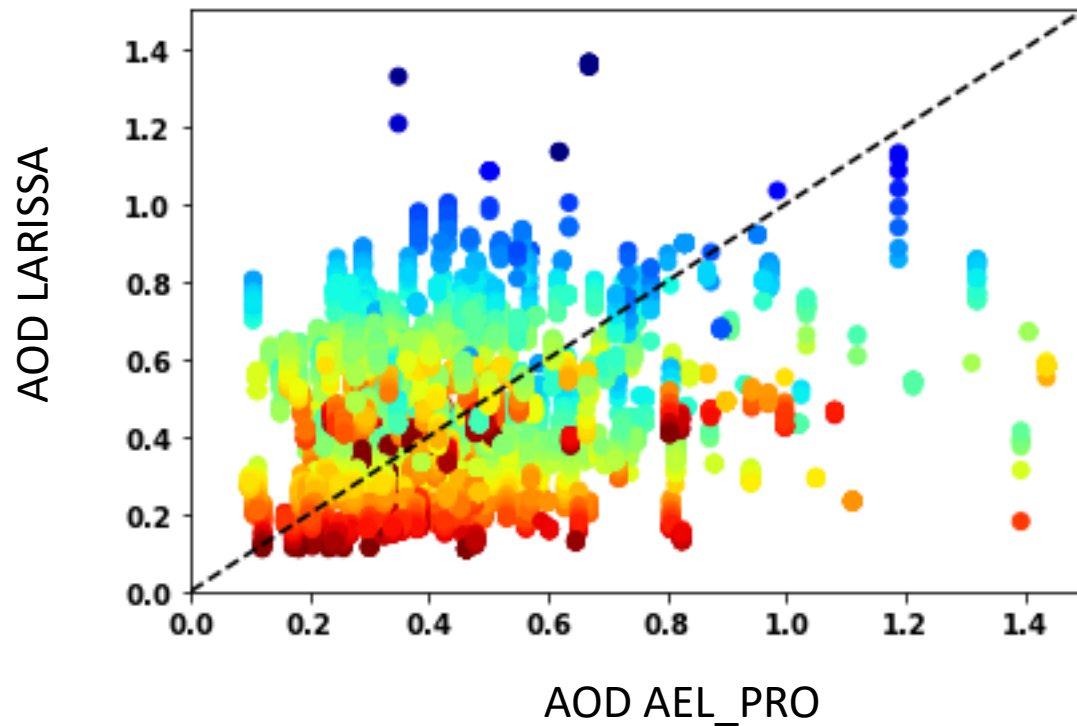
LARISSA aggregated | Horiz av = 30 | Flag = 100 | Peak = no
cor=0.63 | wind =18-30 m/s |



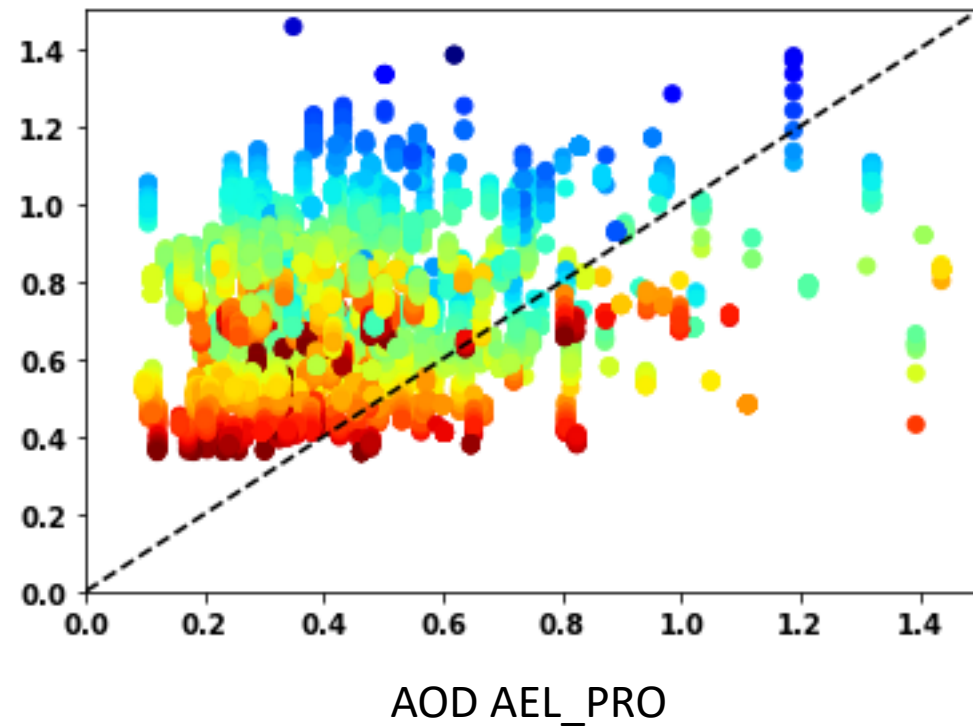
- Every plot -> **Binning based on wind range**
- At 10-30 m/s -> Visible improvement
- At 14-30 m/s -> Quantitative improvement (**r = 0.52**)
- Overestimation of AOD by LARISSA -> Offset is systematic

COMPARISON OF AOD_LARISSA vs AOD_AELPRO

Aggregated orbit: North Pacific (LARISSA corrected)



Aggregated orbit: North Pacific (uncorrected)

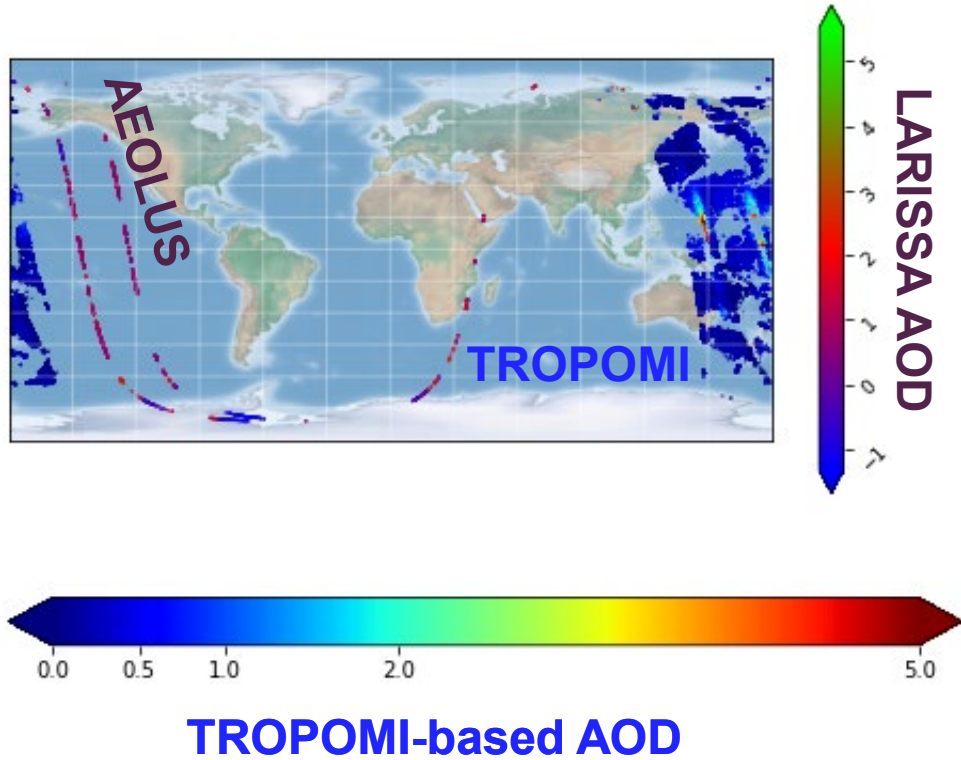


- The correction of 0.50 (for AOD) seemingly corrects the lack of AEL_PRO-LARISSA agreement
- Indication of consistent offset because these cases are taken from various orbits, but gap -> Consistent



LARISSA vs TROPOMI

_20190917T015423035_00



OVERALL RESULTS

- No statistical agreements for aggregated data, but some strong agreement cases (for OMI $r > 0.70$, for TROPOMI $r \sim 0.60$) can be found

LARISSA – TROPOMI agreement (r)

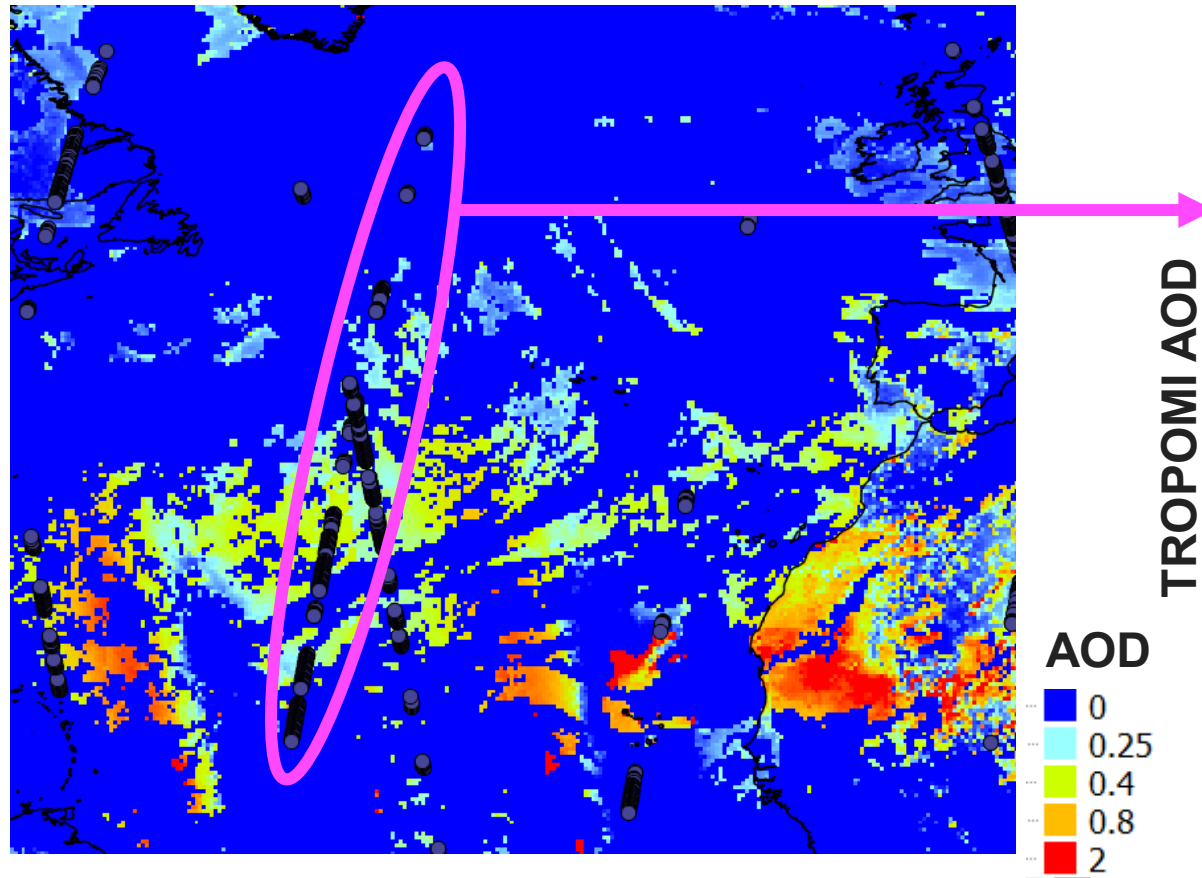
Date	LAR vs TROP (AOD > 0.3)
14.09.2019	0.20
15.09.2019	0.01
17.09.2019	0.40
18.09.2019	-0.10
19.09.2019	-0.36
20.09.2019	0.16
21.09.2019	0.15

LARISSA – OMI agreement (r)

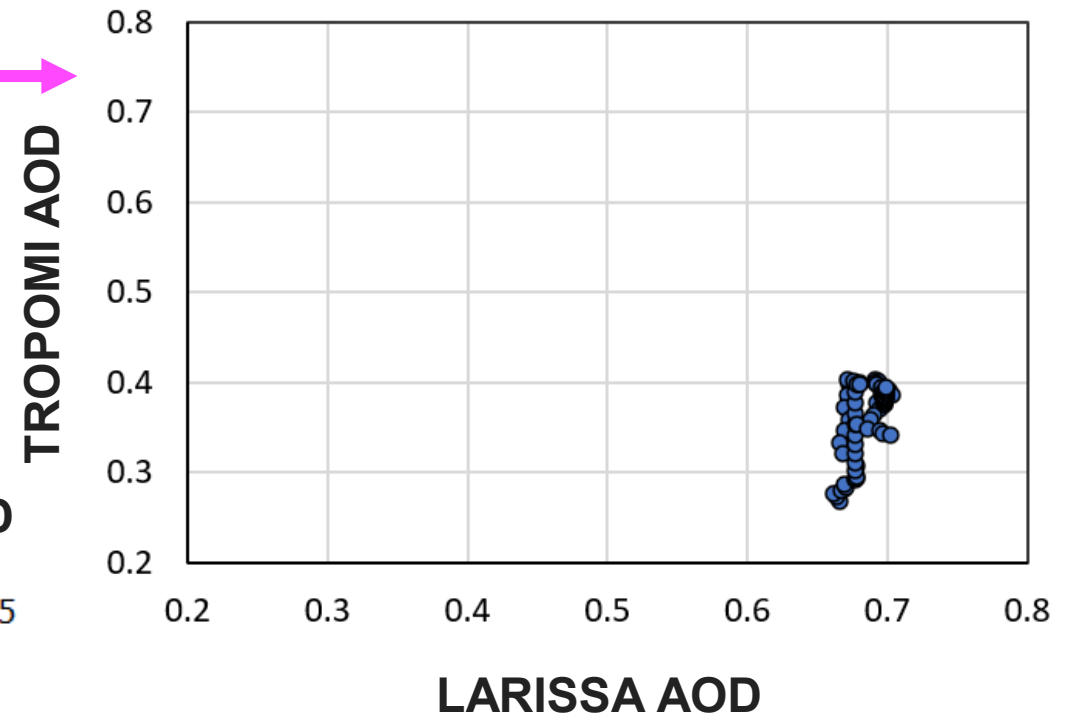
Date	LAR vs TROP (AOD > 0.3)
14.09.2019	0.17
15.09.2019	0.01
17.09.2019	0.01
18.09.2019	0.01
19.09.2019	0.12
20.09.2019	0.17
21.09.2019	0.07

CAN WE FIND THE SHORTEST TIME DIFFERENCE BETWEEN TROPOMI AND AEOLUS?

TROPOMI vs AEOLUS 2019 09 17



2019_09_17 TROPOMI vs LARISSA



- One of the best agreement cases
- $R = 0.60$ between TROPOMI AOD and LARISSA
- Once again $\sim +0.30$ offset of LARISSA compared to validation source is noticed, LARISSA always overestimates validation sources

CONCLUSIONS

- Non-nadir LSR-based AOD retrieval from Josset et al., [2010] applied with unique lidar setup (37.5° incidence, UV wavelength) -> **tested for Aeolus for the first time**
- The signal strength of the Aeolus ocean LSR is weak and **dominated by sub-surface reflectance**
- Sea surface reflectance model -> **Fair agreement with previous expectations** -> Subsurface might be overestimated
- Agreement between $AOD_{LARISSA}$ and $AOD_{AEL-PRO}$ **strongly varies** ($r = 0.01 - 0.89$), worse for AOD_{LAR} vs AOD_{TROP} (< 0.60)
- Offset between $AOD_{LARISSA}$ and reference AOD datasets -> Direct input for future similar retrievals, explaining why **sub-surface reflectance is overestimated**
- Additional result -> **Unexpectedly clear gradient between not only land and sea, but between different land cover types** when LSR is averaged on 1x1 degree grid



**THANK YOU FOR
ATTENTION**

AEOLUS

LARISSA AOD

AELPRO AOD

EXTERNAL DATA

TROPOMI AOD 355 NM

OMI AOD 355 NM

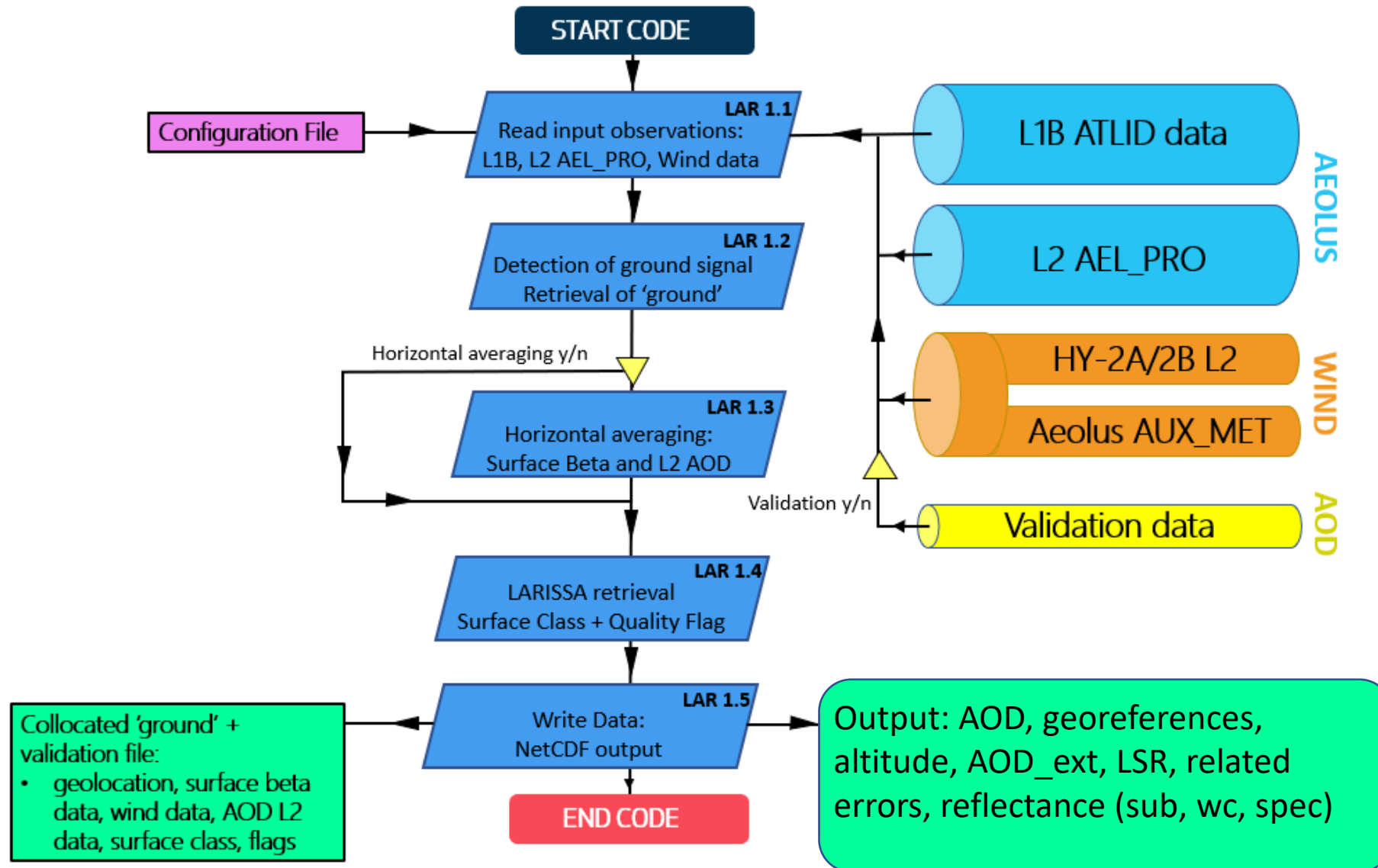
AERONET (ISLANDS)

AERONET (MARITIME)

VALIDATION BLOCK



THE STATUS OF THE SOFTWARE BY LAST PM



- All modules had been created and finalized according to the commitments by previous PM, but some optimizations were still required (done now)



SPECULAR TERM

$$\gamma = T_L^2 \left(\frac{(1-W)\rho_0}{4\pi\sigma^2\cos^5(\theta')} \exp\left(\frac{-\tan^2(\theta')}{\sigma^2}\right) + W \cdot \frac{R_{f,eff}}{\pi} \cos(\theta') \right. \\ \left. + \frac{(1-W_{\downarrow} \cdot R_{f,eff\downarrow} - (1-W_{\downarrow})R_{s\downarrow}(\theta'_{\downarrow})) [(1-W)]}{(1-r_f R_u)} \cos(\theta') \frac{T_{s\uparrow}(\theta'_{\uparrow})}{m_{\uparrow}^2} \frac{R_u}{Q(\theta'_{\uparrow})} \right. \\ \left. + \frac{(1-W_{\downarrow} \cdot R_{f,eff\downarrow} - (1-W_{\downarrow})R_{s\downarrow}(\theta'_{\downarrow}))}{(1-R_{f,eff}R_u)} W \left(\frac{1-R_{f,eff}}{\pi} \cos(\theta') R_u \right) \right)$$

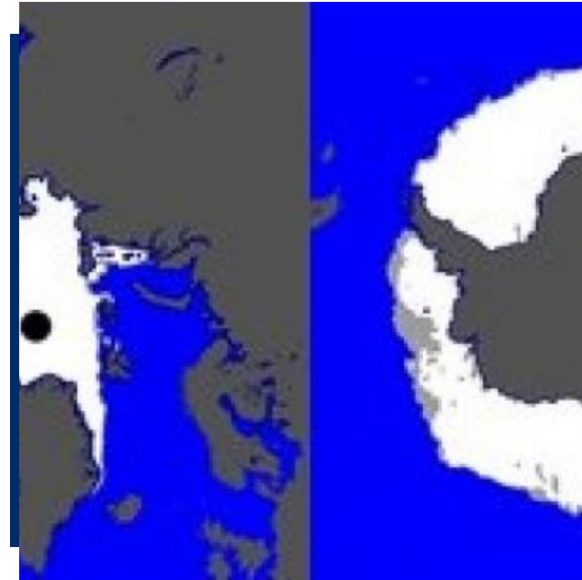
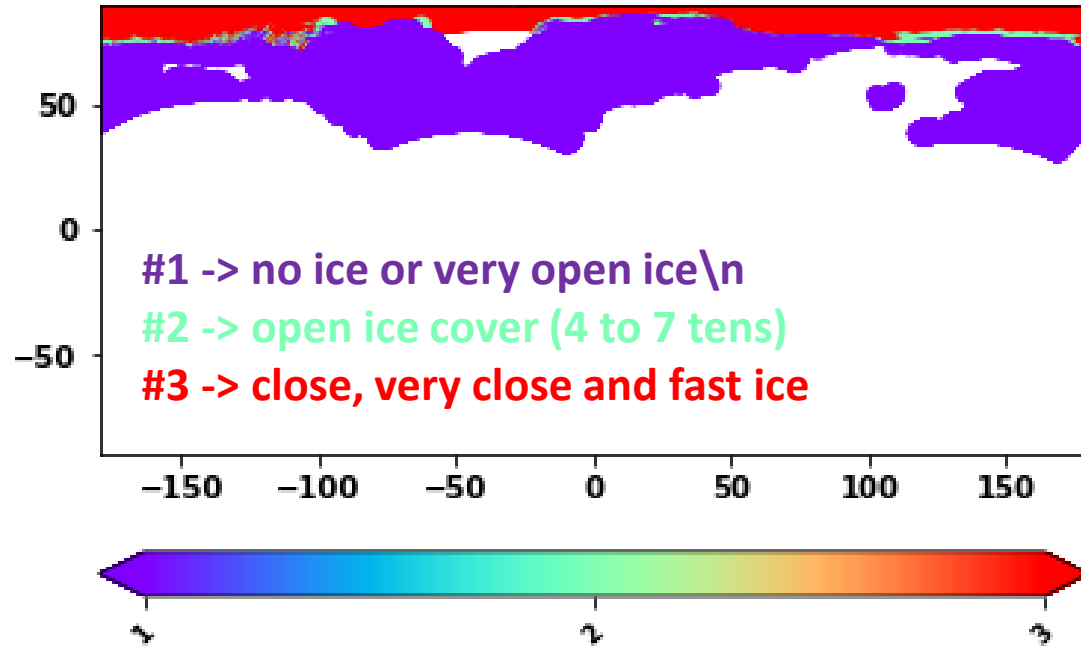
WHITECAPS TERM

```
spec_term = ((1-w_area) * fresnel) / (4 * np.pi * slope * np.cos(np.deg2rad(angle))**5) * np.exp((-np.tan(np.deg2rad(angle))**2)/slope)
```

```
wc_term = w_area * (w_ref/np.pi) * np.cos(np.deg2rad(angle)) #calculating whitecap terms of summarized reflectance
```

- I assume this effect might be related to wind/slope or angle?

ICE MASK USE



Global Sea Ice Edge

● Operational

version OSI-403-b since
 15/09/2015, version OSI-403-c
 since 30/05/2017

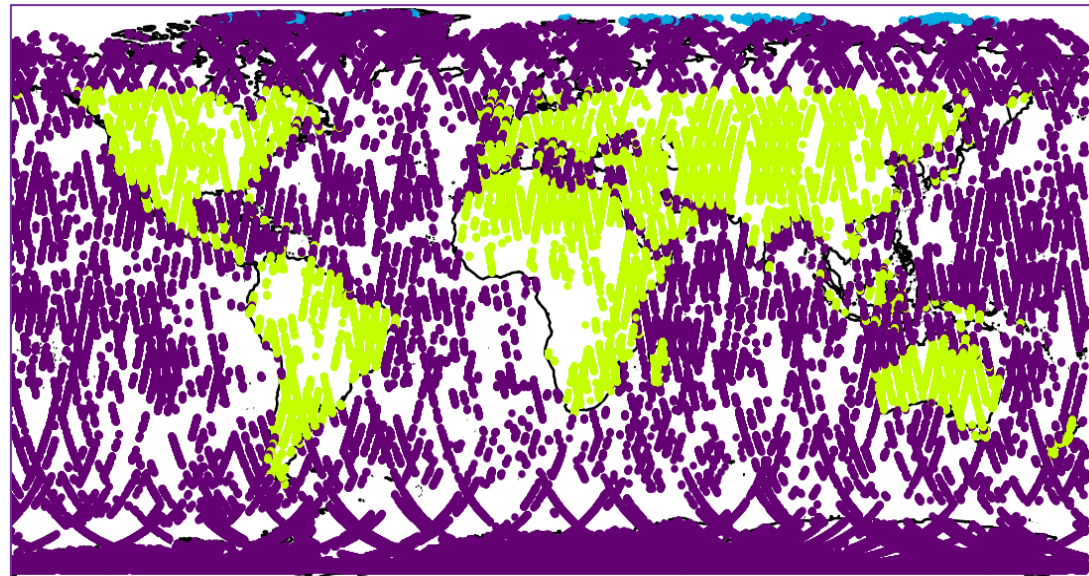
Variable	Description	Local File
S-OSI_NOR_MULT_GL_NH_EDGEEn_-201909151200Z.nc	Daily Sea Ice Edge Analysis from OSI SAF EUMETSAT	Local File
confidence_level	confidence level	Geo2D
ice_edge	sea ice edge	Geo2D
lat	latitude coordinate	Geo2D
lon	longitude coordinate	Geo2D
Polar_Stereographic_Grid	Polar Stereographic Grid	—
status_flag	status flag for sea ice edge retrieval	Geo2D
time	reference time of product	—
time_bnds	time bnds	1D
xc	x coordinate of projection (eastings)	1D
yc	y coordinate of projection (northings)	1D

- Based on ASCAT backscatter
- We can choose 2 and 3 (stringent threshold) to filter out all possible ice cases
- The box within specific grid cell is chosen and ice flag is assigned

CHECKING THE CONSISTENCY OF ICE MASK



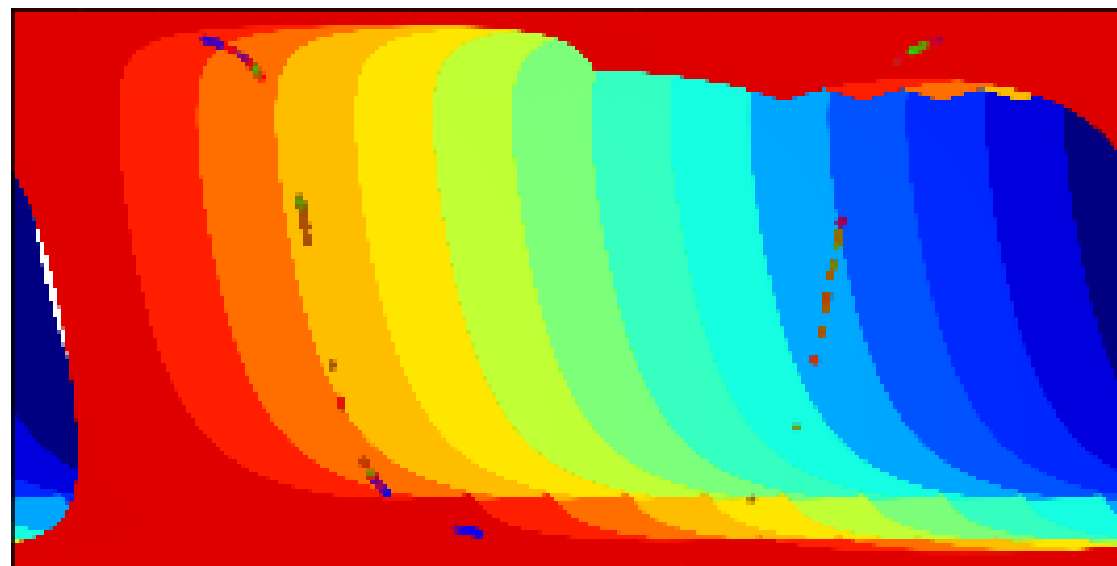
ICE MASK | FLAG = 4



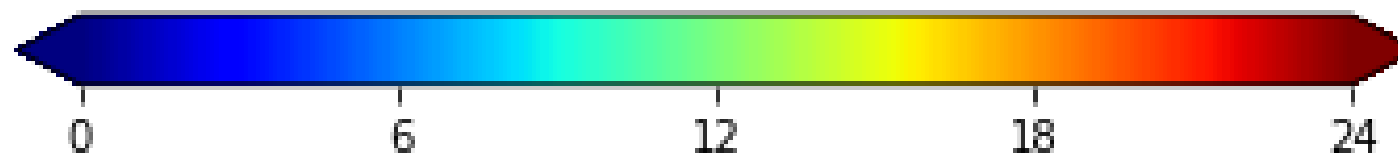
NOT ICE | FLAG = 1,2,3

LARISSA vs TROPOMI TIMING

_20190917



TIME OF OVERPASS



- There is no perfect timing collocation, but we can aggregate TROPOMI and Aeolus observations daily by assuming homogeneity of aerosol layers and collocate TROPOMI points based on defined time/location difference