

# Can AEOLUS estimate ocean color parameters? Aeolus+ Innovation AEOLUS Ocean Colour (AOC)

Jamet, C.<sup>1</sup>, E., Belakebi-Joly<sup>2</sup>, F. Poustomis<sup>2</sup>, E. Lecuyer<sup>1</sup>, X., Mériaux<sup>1</sup>, Q., Cazenave<sup>3</sup>, J., Delanoë<sup>3</sup> and C., Flamant<sup>3</sup>

<sup>1</sup> LOG, ULCO, France

<sup>2</sup> NOVELTIS, France

<sup>3</sup> LATMOS, France

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# NO UNFORTUNATELY

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# General objectives

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  - lidar-derived optical parameters
    - particulate attenuated backscatter  $\beta_p$
    - attenuation coefficient  $K_L$

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    - attenuation coefficient  $K_L$
  - ocean optical parameters related to ocean optical properties
    - diffuse attenuation coefficient  $K_d(355)$
    - particulate backscattering parameter  $b_{bp}(355)$

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    - diffuse attenuation coefficient  $K_d(355)$
    - particulate backscattering parameter  $b_{bp}(355)$
  - biogeochemical parameters related to marine biogeochemical cycles
    - coloured dissolved organic matter CDOM
    - particulate organic carbon  $POC$
    - phytoplankton carbon  $C_{phyto}$

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- Derivation of Ocean Color parameters from Aeolus
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# Principle of the algorithm

## HSRL capabilities of ALADIN

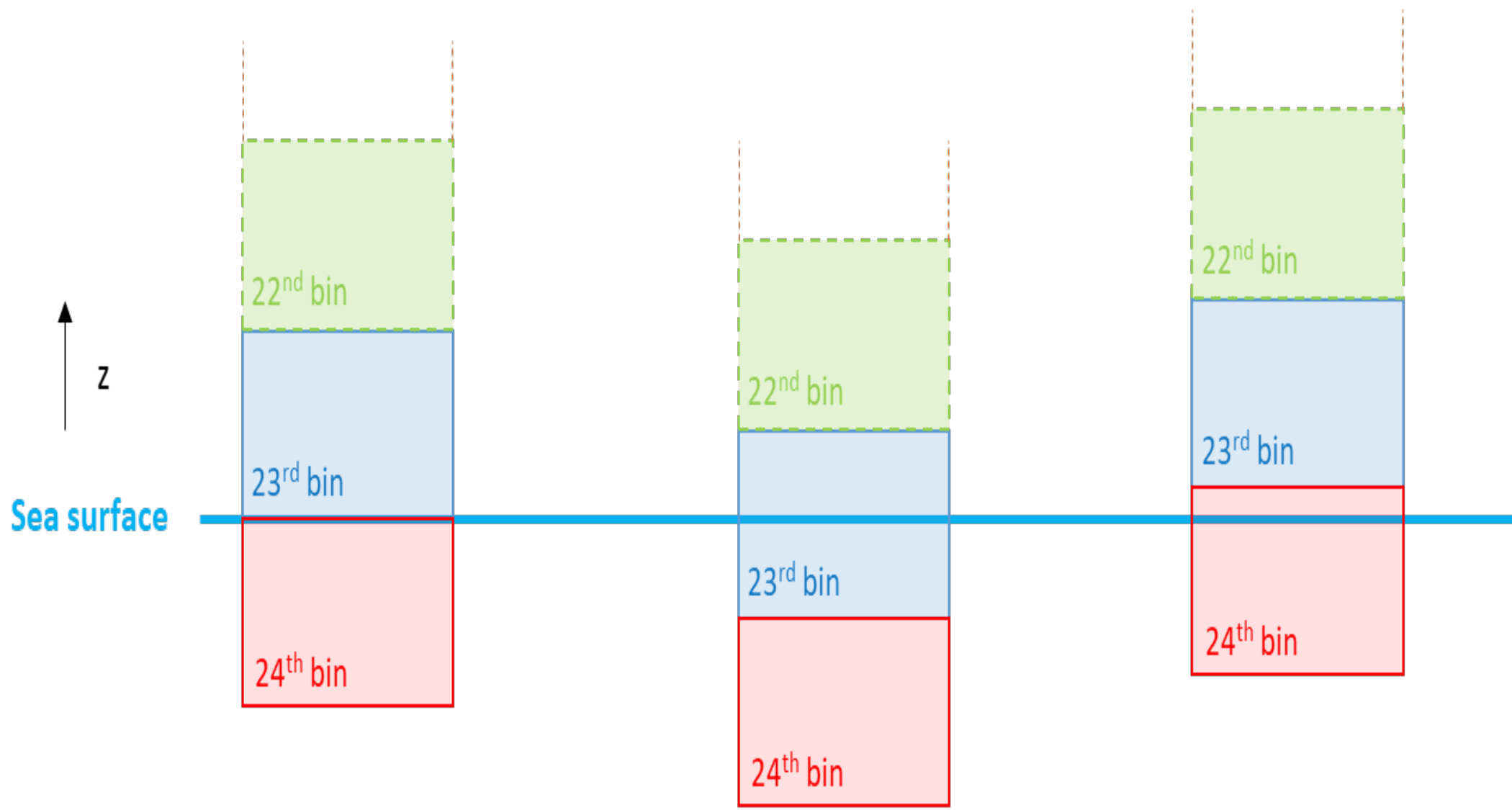
$$\left. \begin{aligned} S_M(z) &= K_{Ray} \left[ \frac{A}{(nH+z)^2} \right] (C_1\beta_M + C_2\beta_P) \left[ \exp\left(-\int_0^z K_L(z') dz'\right) \right]^2 \cdot (T_A)^2 \\ S_P(z) &= K_{Mie} \left[ \frac{A}{(nH+z)^2} \right] (C_4\beta_M + C_3\beta_P) \left[ \exp\left(-\int_0^z K_L(z') dz'\right) \right]^2 \cdot (T_A)^2 \end{aligned} \right\} \beta_P = \beta_M \frac{(K_{Ray}C_1 - S_R K_{Mie} C_4)}{(S_R K_{Mie} C_3 - K_{Ray}C_2)}$$

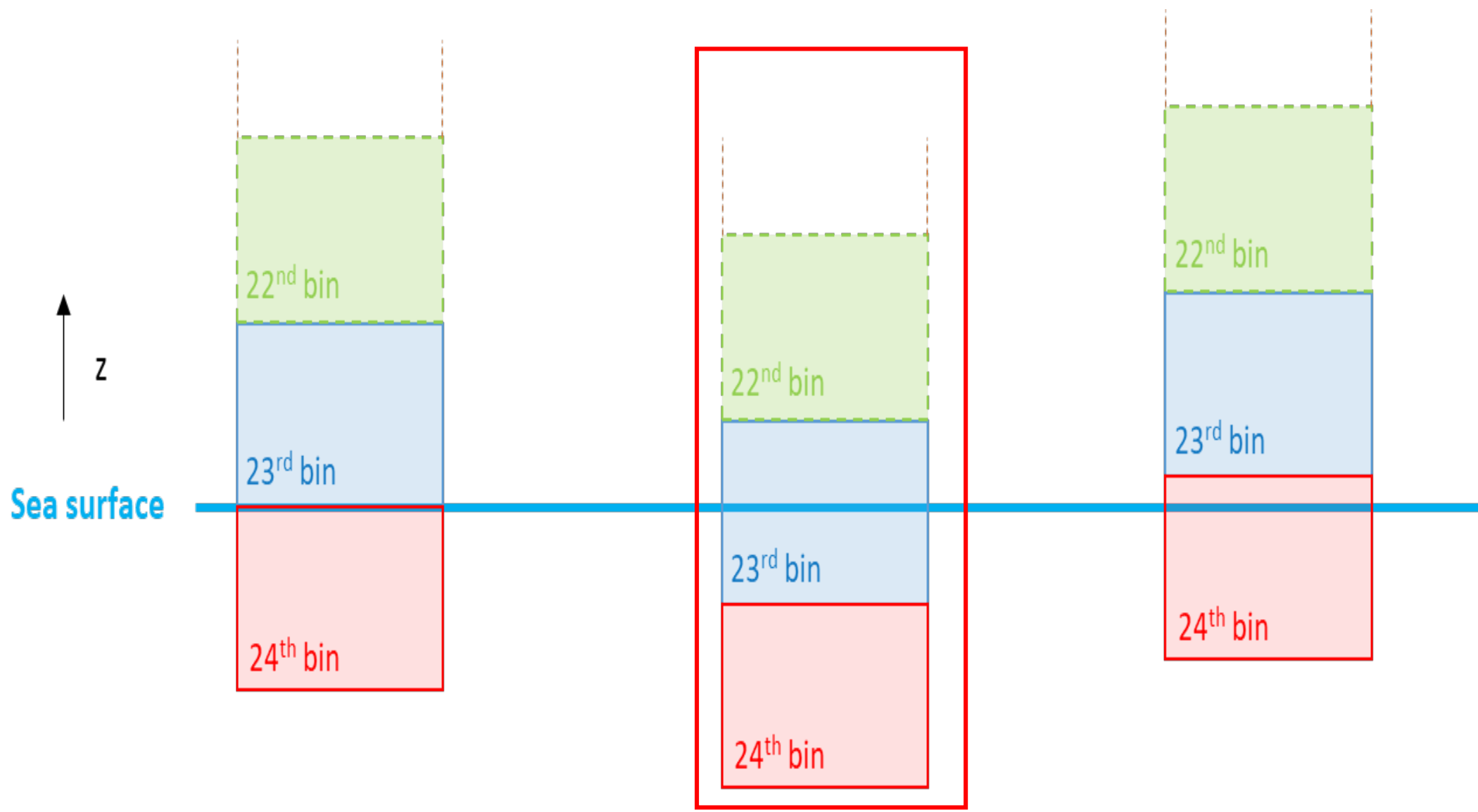
with  $\frac{S_M(z)}{S_P(z)} = S_R$

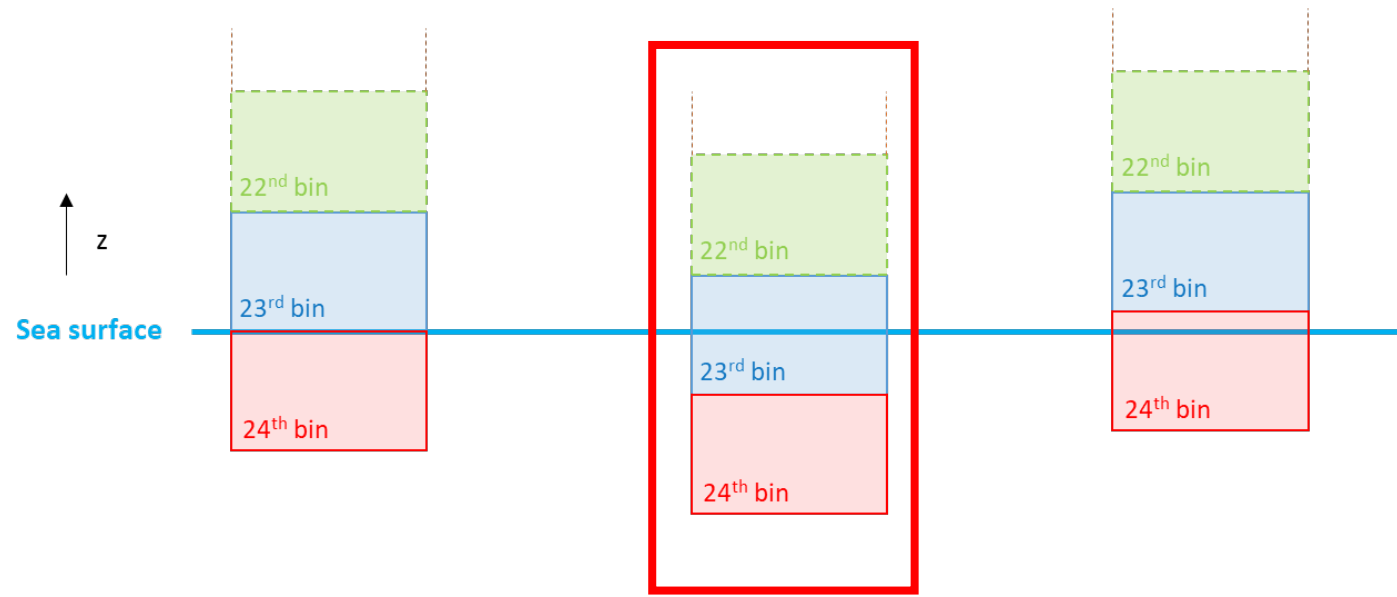
$\beta_M$  a constant

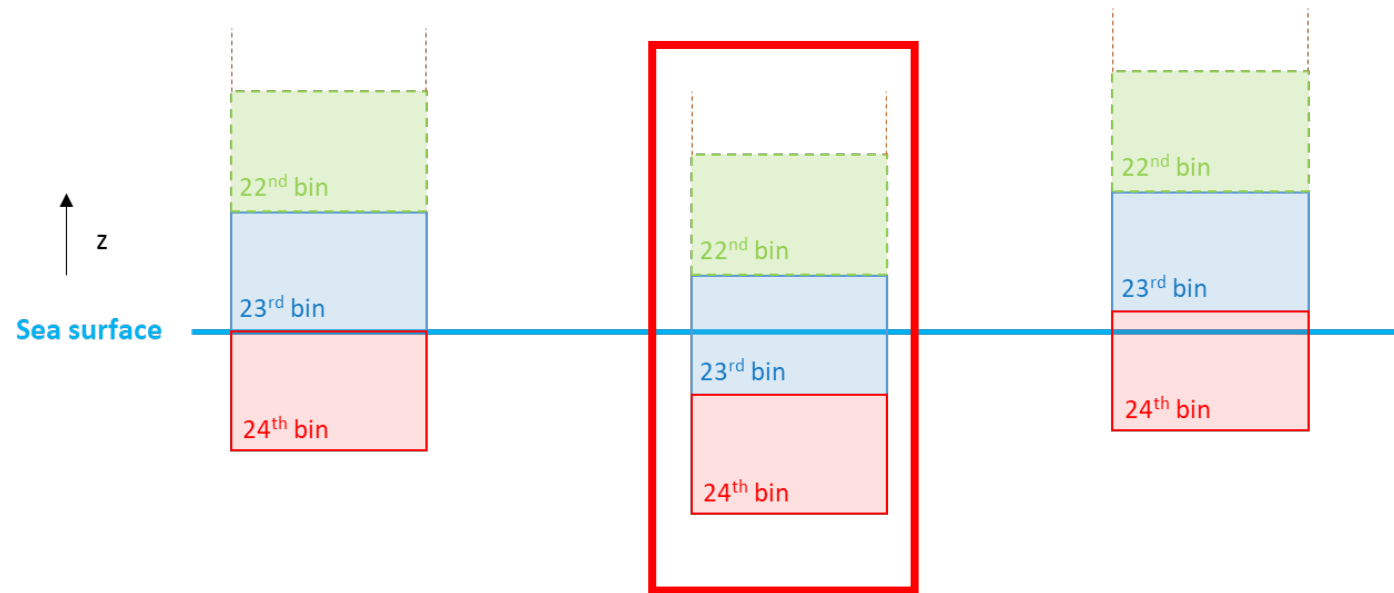
$C_1 = 1.14$ ,  $C_2 = 1.64$ ,  $C_3 = 1.3$ ,  $C_4 = 1$  (Collaboration with Alain Dabas from Meteo-France)





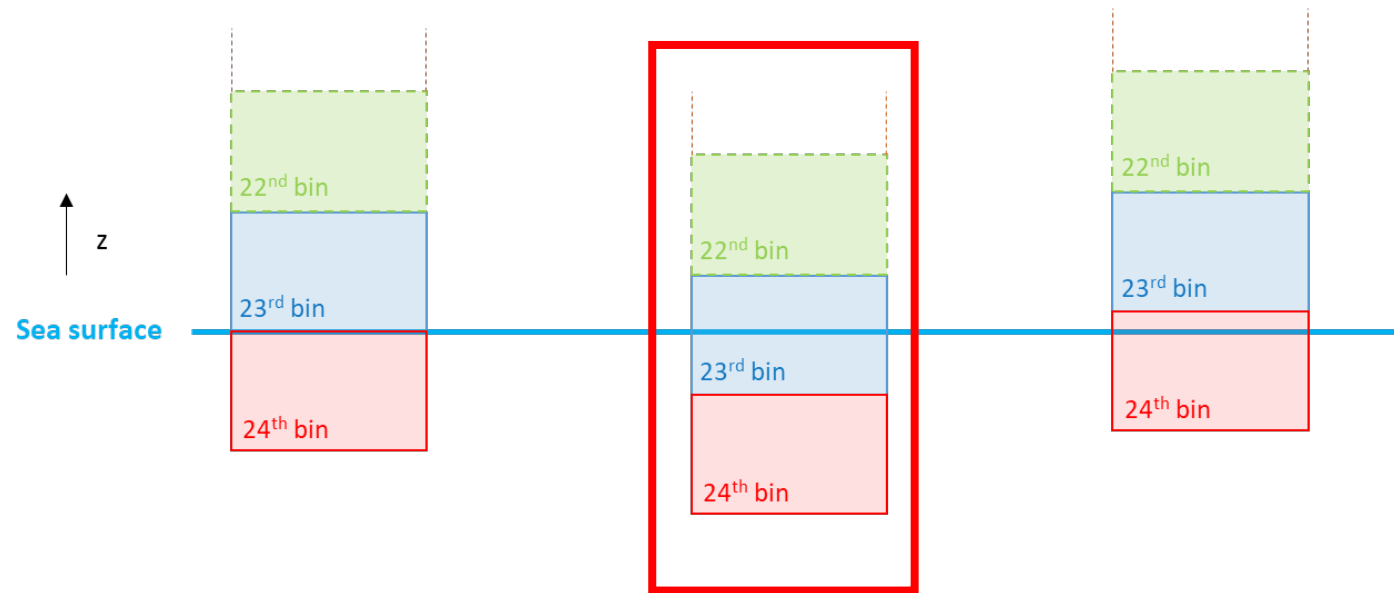






$$S(23) = S_{\text{atm}}$$

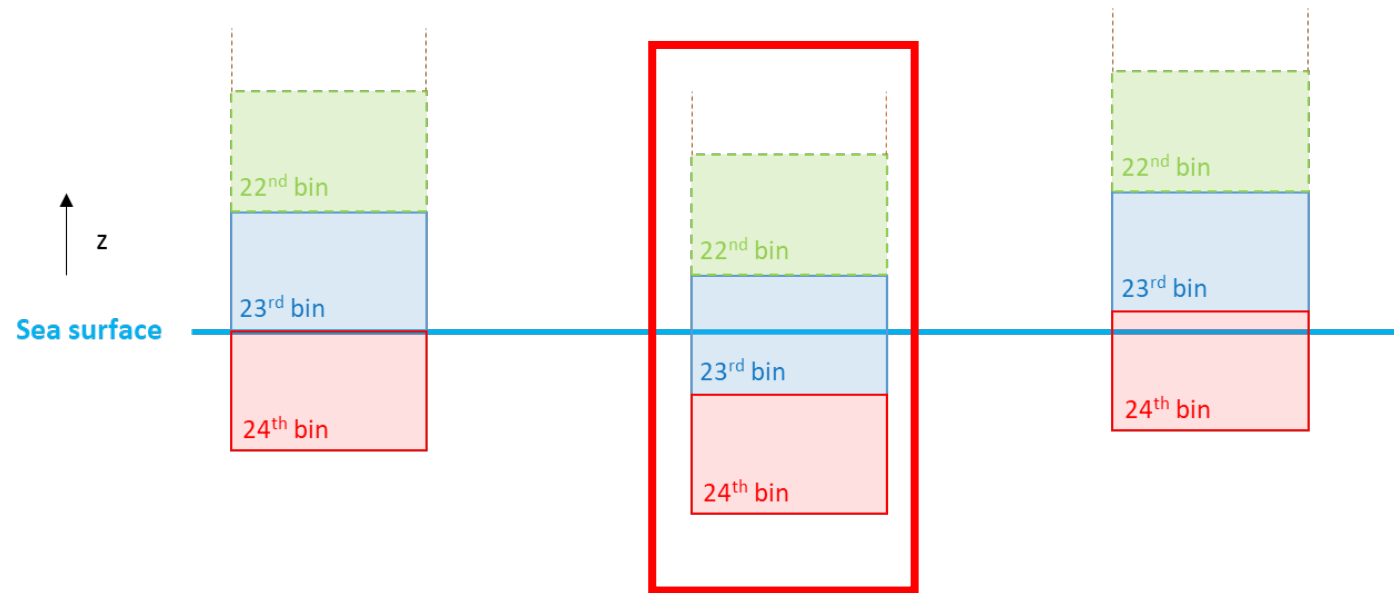
Correction using bin 22 with the hypothesis of an homogeneous atmosphere between 0 and 1 km altitude



$$S(23) = S_{\text{atm}} + S_s$$

Correction using bin 22

$\approx 0$  for observation angle of  $35^\circ$

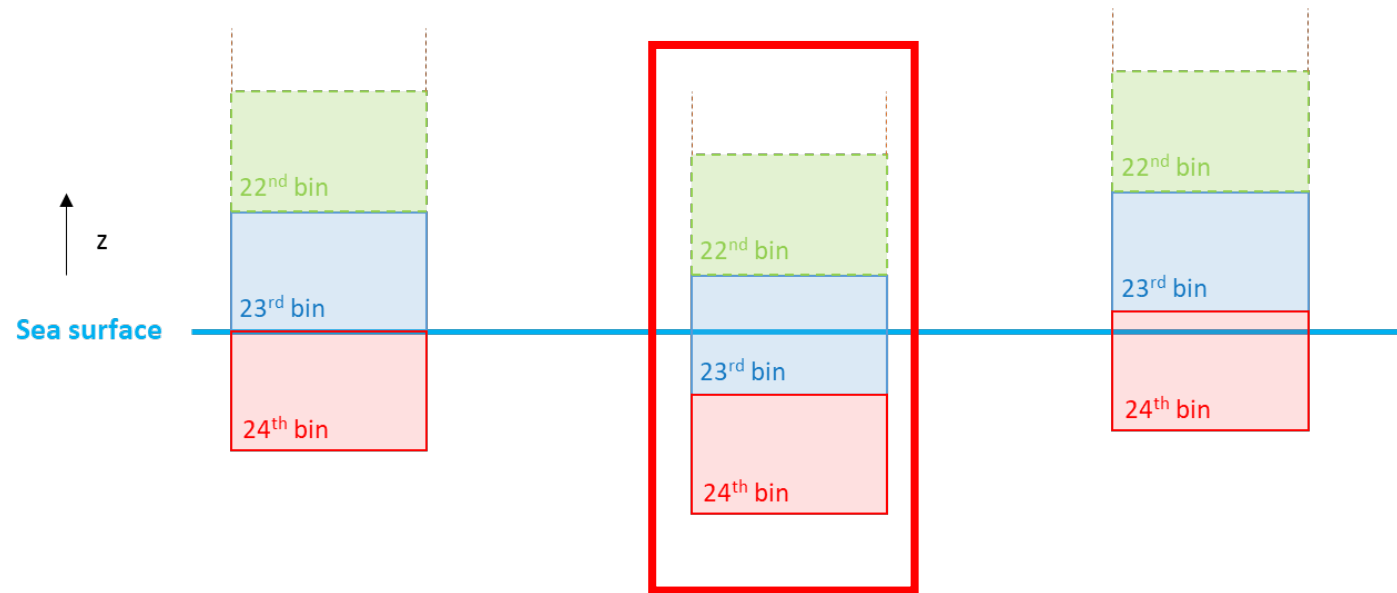


$$S(23) = S_{\text{atm}} + S_s + S_{\text{wc}}$$

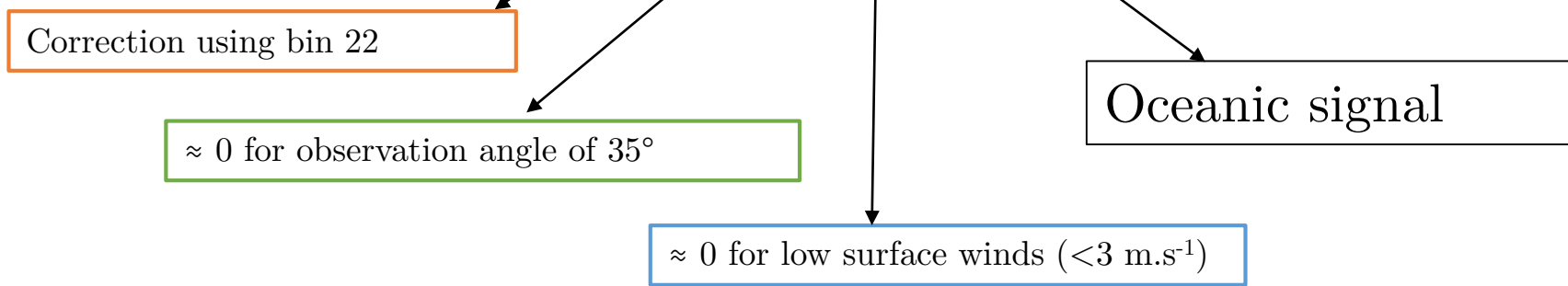
Correction using bin 22

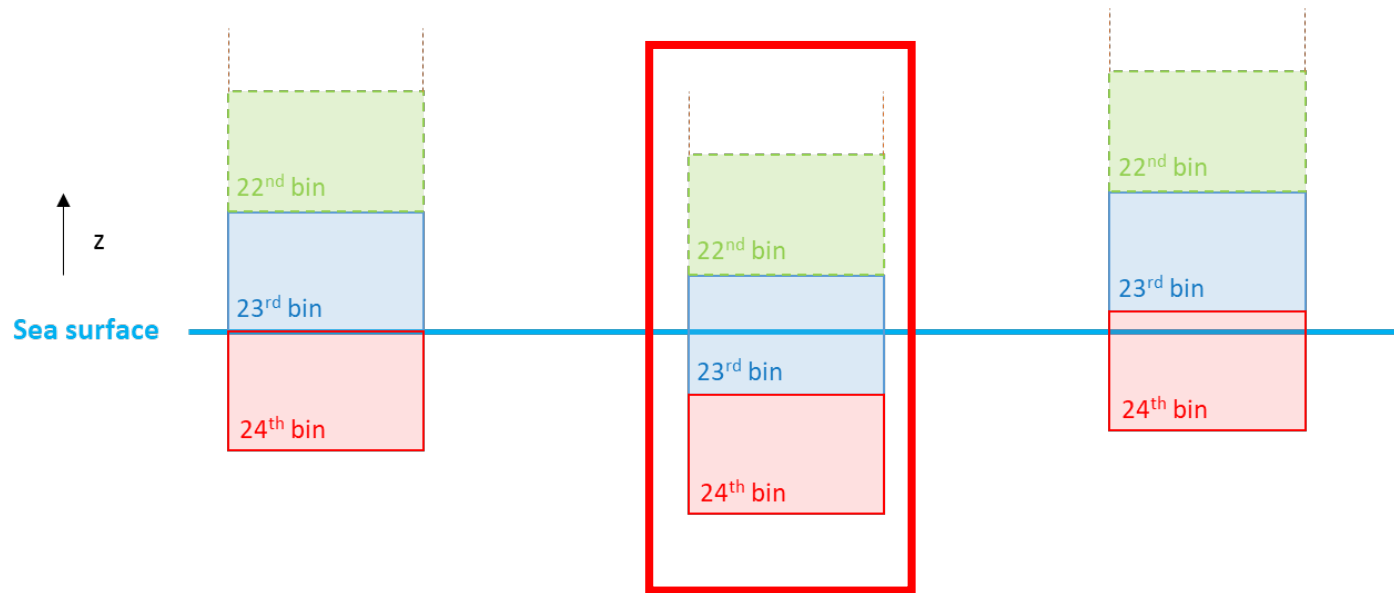
$\approx 0$  for observation angle of  $35^\circ$

$\approx 0$  for low surface winds ( $< 3 \text{ m.s}^{-1}$ )

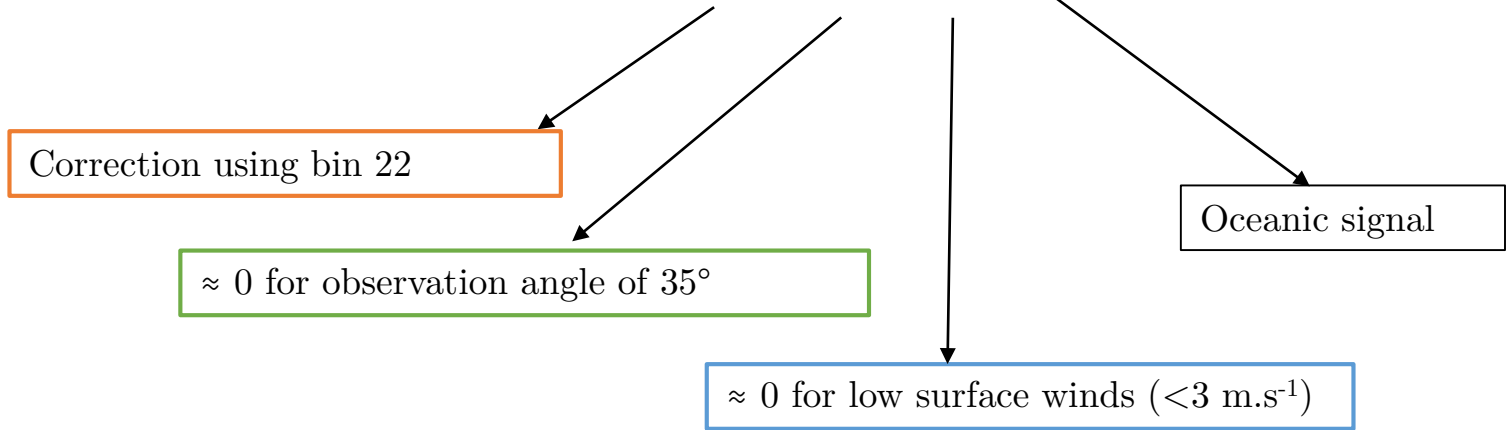


$$S(23) = S_{\text{atm}} + S_s + S_{\text{wc}} + S_w$$

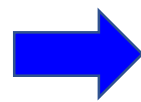




$$S(23) = S_{\text{atm}} + S_s + S_{\text{wc}} + S_w$$



$$\beta_P = \beta_M \frac{(K_{Ray} C_1 - S_R K_{Mie} C_4)}{(S_R K_{Mie} C_3 - K_{Ray} C_2)}$$



Particulate back-scattering coefficient  $b_{bp}$   
 $b_{bp} = 2 \cdot \chi \pi \beta_P$



# Sensitivity studies

1. No M1 calibration bias. No cross-talk. Bin only in ocean
  2. M1 calibration bias. No cross-talk. Bin only in ocean
  3. M1 calibration bias. Cross-talk. Bin only in ocean
  4. M1 calibration bias. Cross-talk. Bin partly in ocean (no atmospheric correction, no consideration of wind)
  5. M1 calibration bias. Cross-talk. Bin partly in ocean (atmospheric correction, no consideration of wind)
  6. M1 calibration bias. Cross-talk. Bin partly in ocean (atmospheric correction, consideration of wind)
- BASELINE 11

# Validation exercise

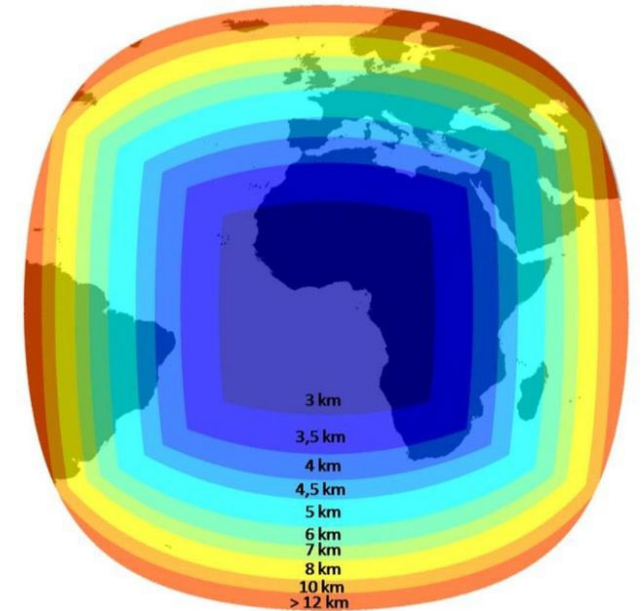
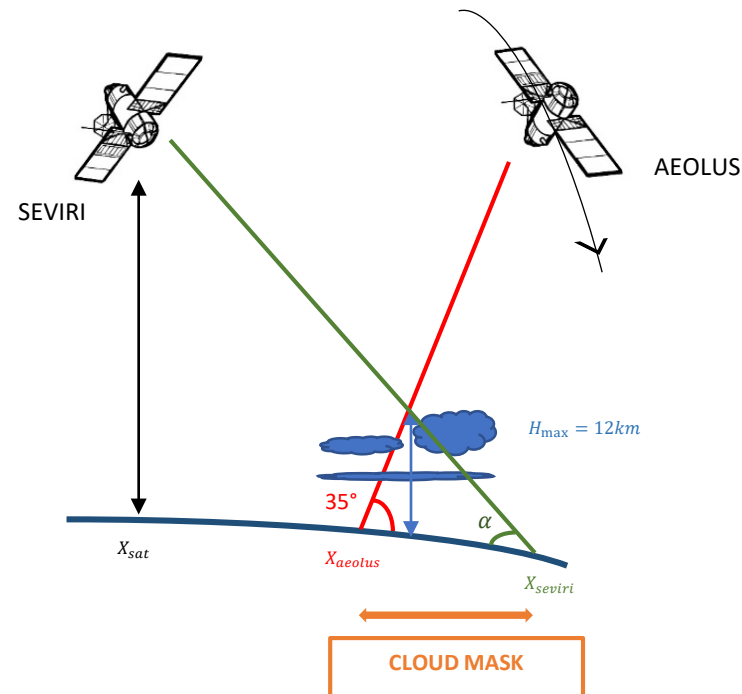
- BGC-ARGO (Claustre et al., 2022) :  $b_{bp}(700)$
- **Match-ups exercise:**
  - July 2019 – October 2020
  - Cloud-free AEOLUS obs. using SEVIRI cloud mask

# Cloud mask

- It should be verified thoroughly that no cloud will impact the analysis

- › Use of the SEVIRI Cloud Mask:

- › Temporal resolution: 15 minutes
- › Spatial resolution: about  $4 \times 4 \text{ km}^2$
- › Spatial coverage: latitude  $-90 : 90$  , longitude  $-90 : 90$
- › Pixel categorization:
  - 0 = clear sky over water,
  - 1 = clear sky over land,
  - 2 = cloud,
  - 3 = not processed
- › View angle: variable



*Spatial resolution and coverage of the SEVIRI instrument*  
Source : <https://www.soda-pro.com/>

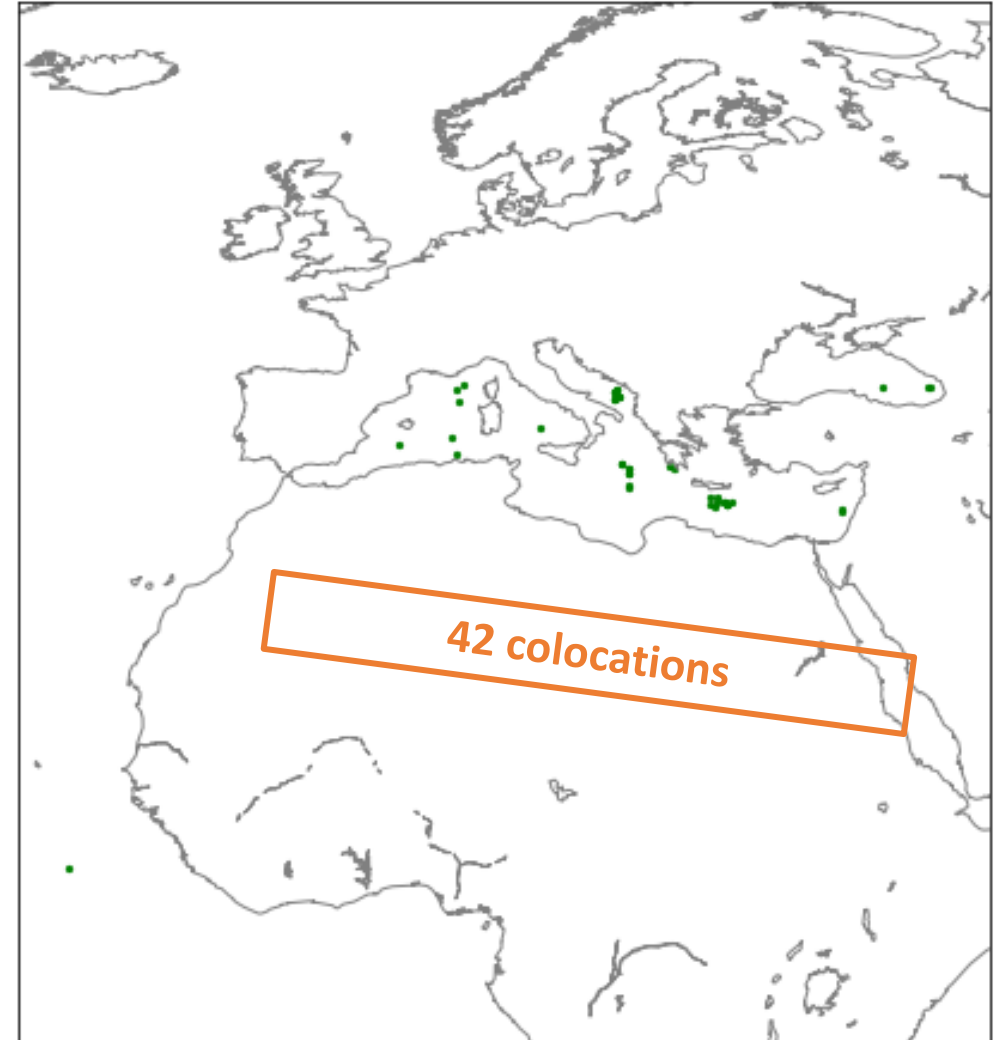
# Validation exercise

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- **Match-ups exercise:**

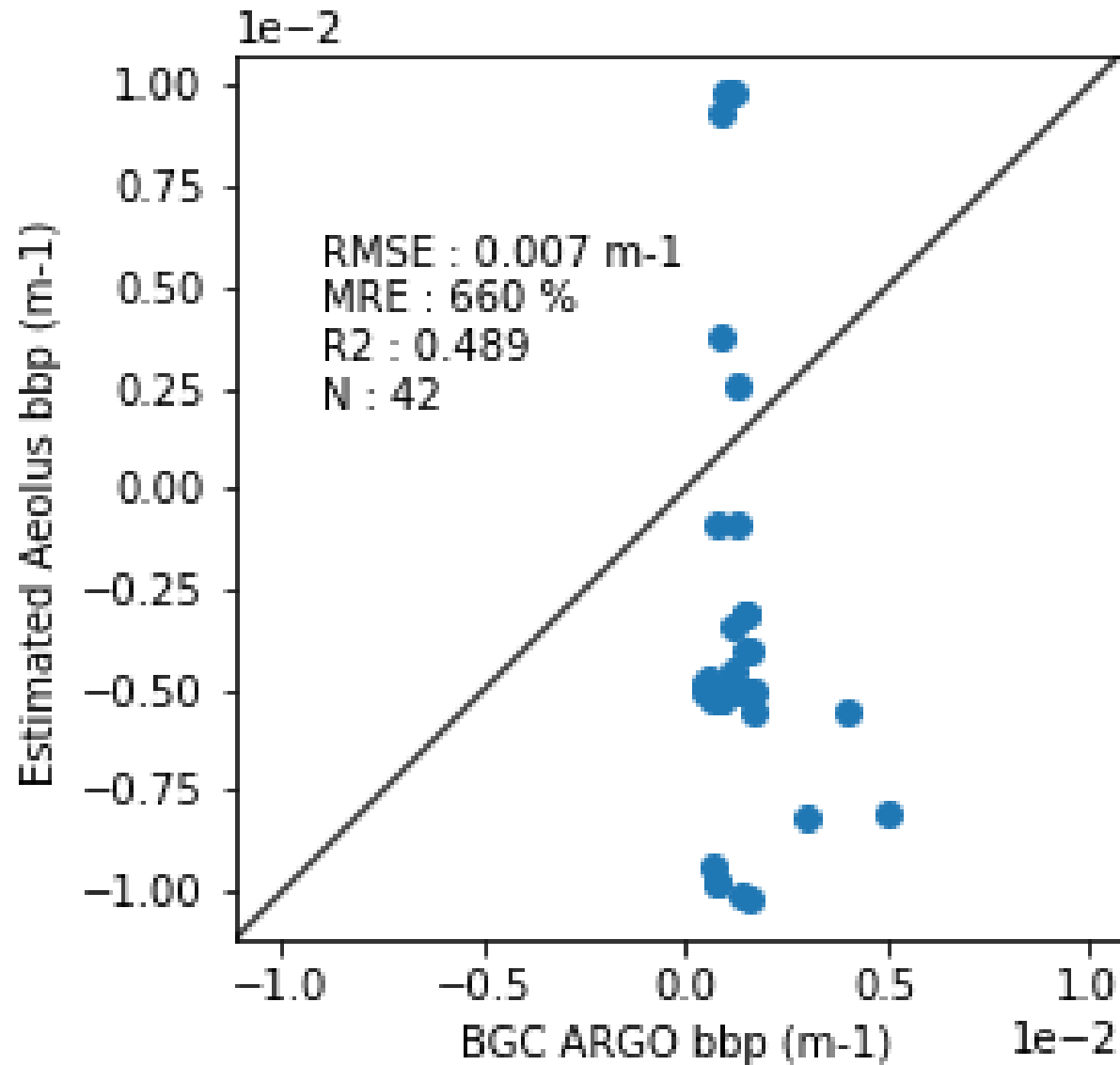
- July 2019 – October 2020
- Cloud-free AEOLUS obs. using SEVIRI cloud mask
- Time difference : +/- 24h
- Distance difference :
  - If SST < 15 °C, +/- 15 km
  - If SST > 15°C, +/- 50 km

Collocation found between Aeolus, BGC Argo and CALIOP measurements



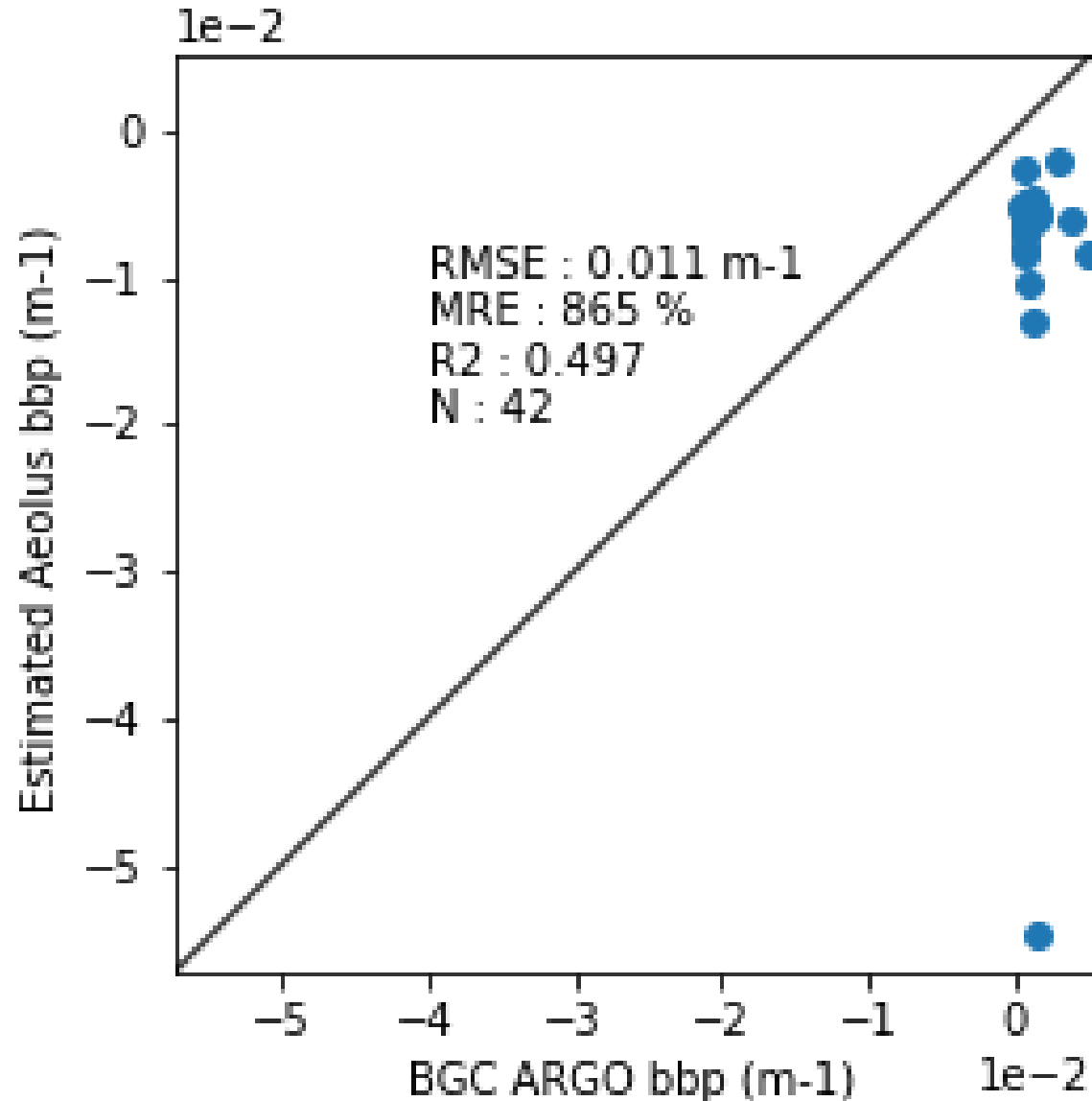
# M1 calibration bias. Cross-talk. Bin partly in ocean (no atmospheric correction, no consideration of wind)

$$S(23 \text{ or } 24) = S_w$$



# M1 calibration bias. Cross-talk. Bin partly in ocean (atmospheric correction, no consideration of wind)

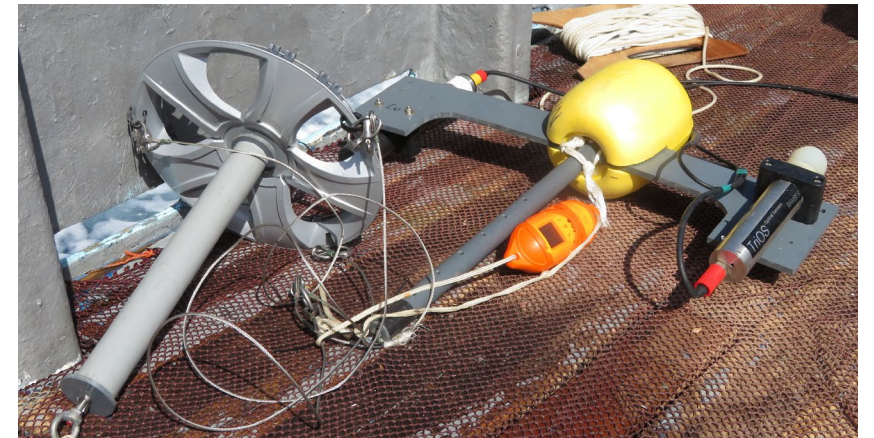
$$S_{atm}(23) = S_{atm}(22) \frac{altitude\_bin(23)}{height\_bin(23)}$$





# Validation in Cabo Verde during the JATAC and CADDIWA campaigns

- 7-22 September 2021
- 6 days at sea
- Radiometry (Rrs) btw 350 and 900nm
- Diffuse attenuation coefficient  $K_d$  until 30m ( $c < K_L < K_d$ )
- Particulate back-scattering coefficients  $b_{bp}$  until 30m ( $b_{bp} = 2 \cdot \chi \pi \beta_P$ )
- Concentrations of CDOM (2m), chl-a (2-20m) and POC (2-10m)



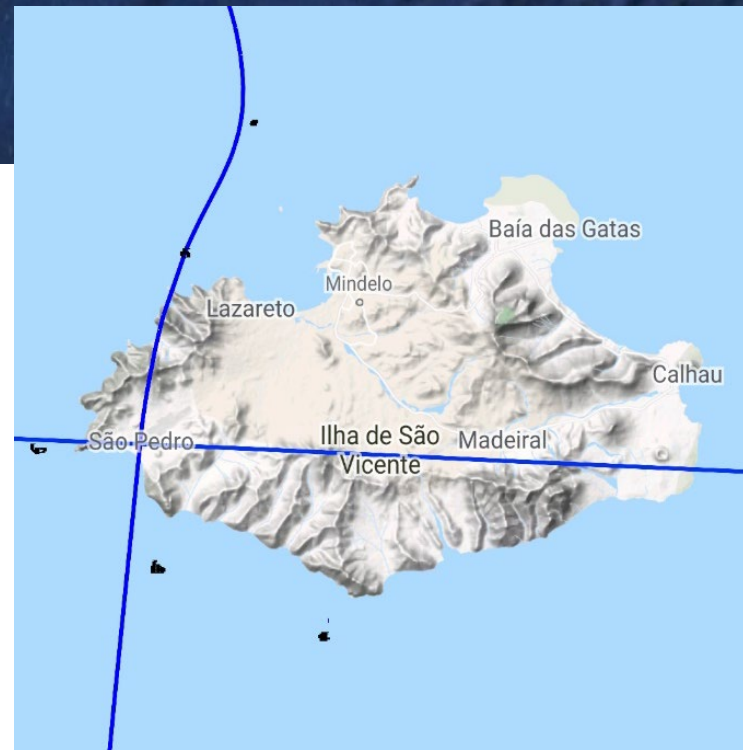


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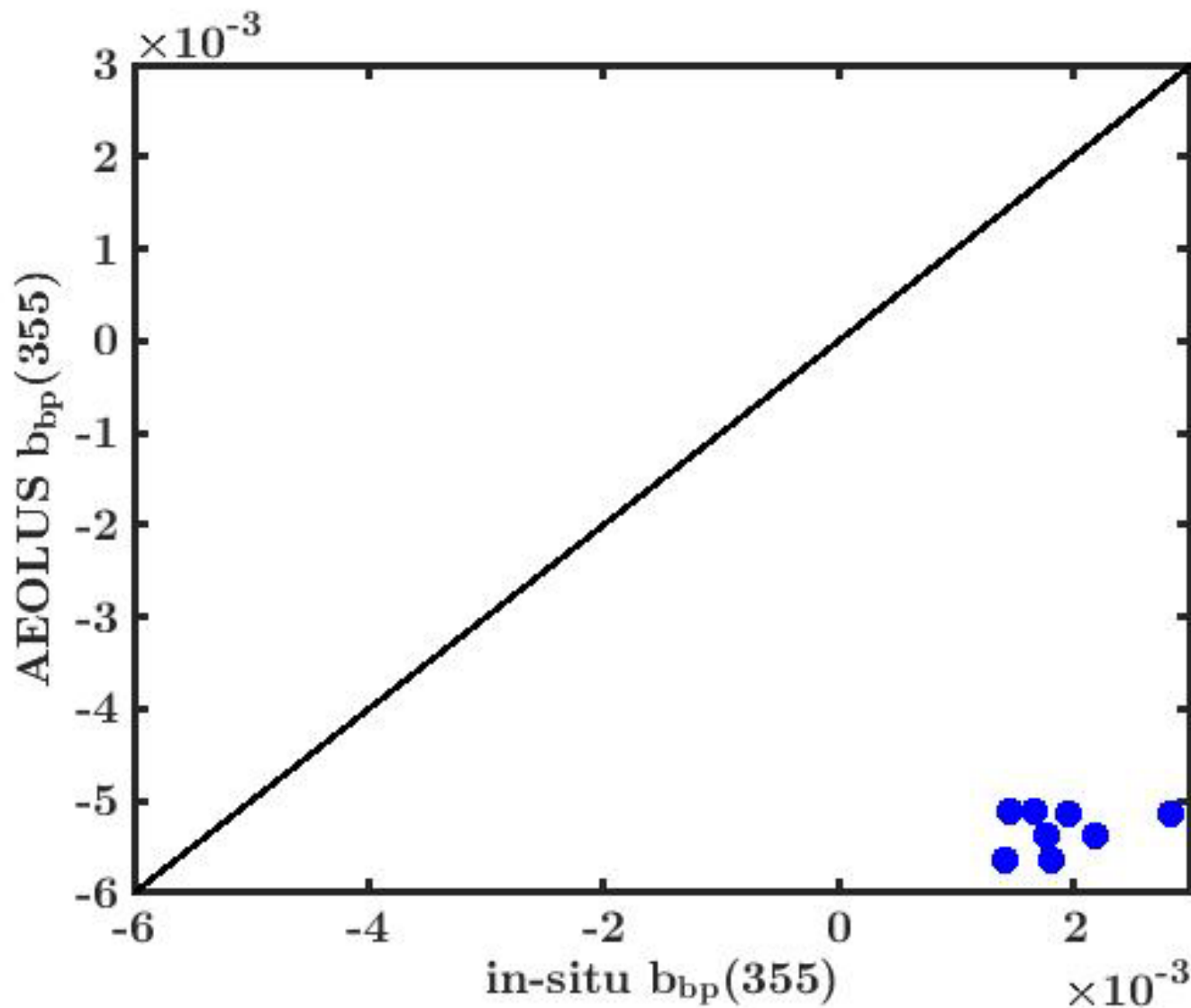
- Number of co-locations :

Lidar	Dates	# co-locations
ADM/AEOLUS	10-15-17-22 sept. 2021	9
LNG	10-17-18 sept. 2021	11





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$$S_{atm}(23) = S_{atm}(22) \frac{altitude\_bin(23)}{height\_bin(23)}$$

# Impact of the hypothesis

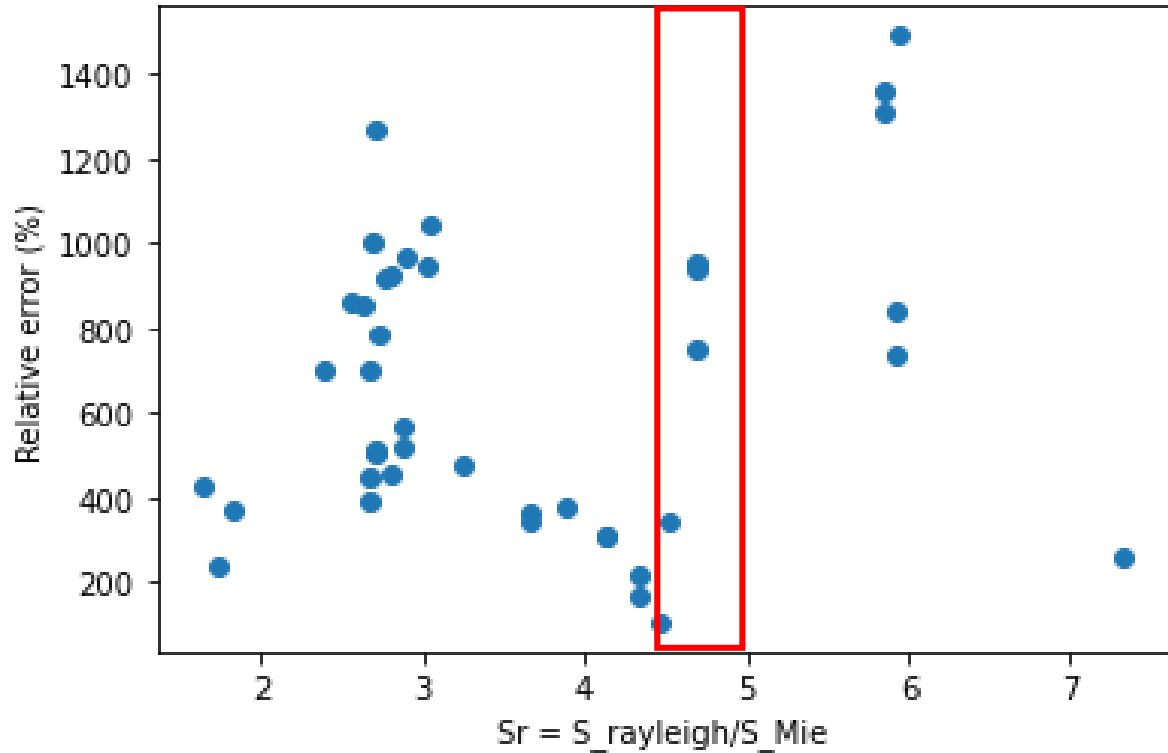
- Range of  $S_R$
- Impact of the wind
- Homogeneity of the marine boundary layer

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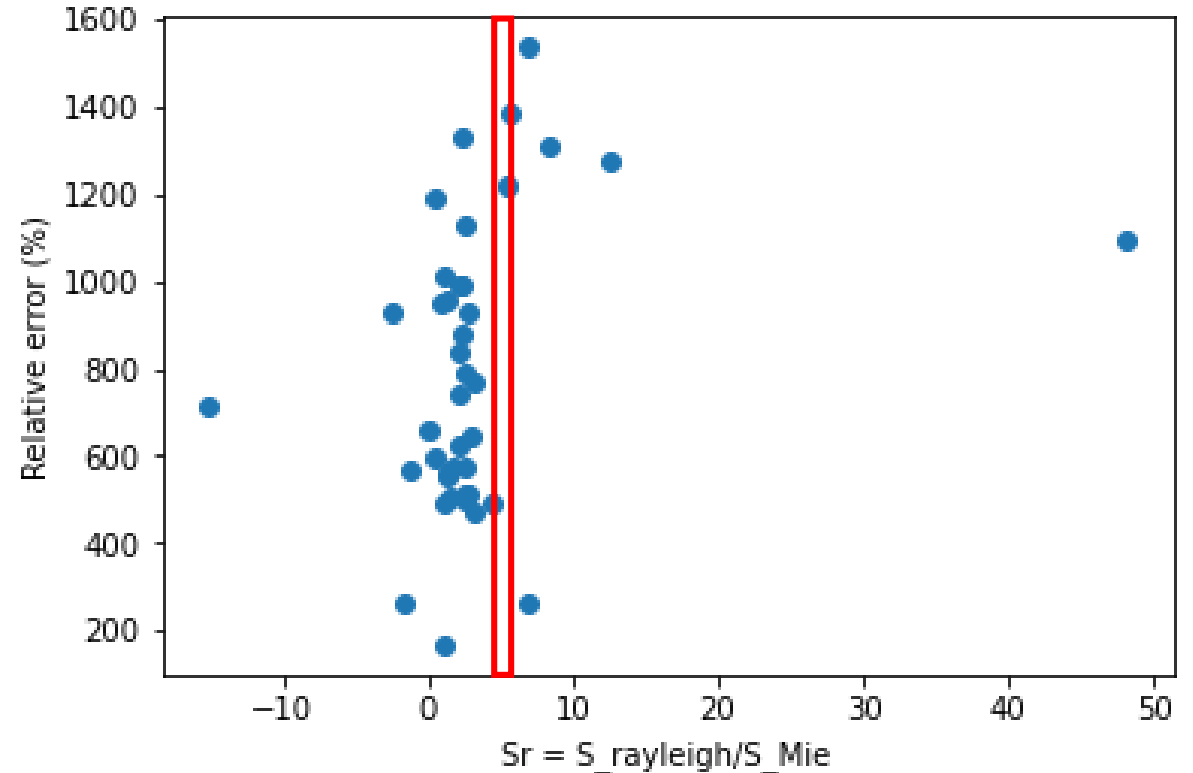
# M1 calibration bias. Cross-talk. Bin partly in ocean (atmospheric correction, no consideration of wind)

$$\beta_P > 0 \Rightarrow 4.5 < S_R < 5$$



Without atmospheric correction

$$S(23 \text{ or } 24) = S_w$$

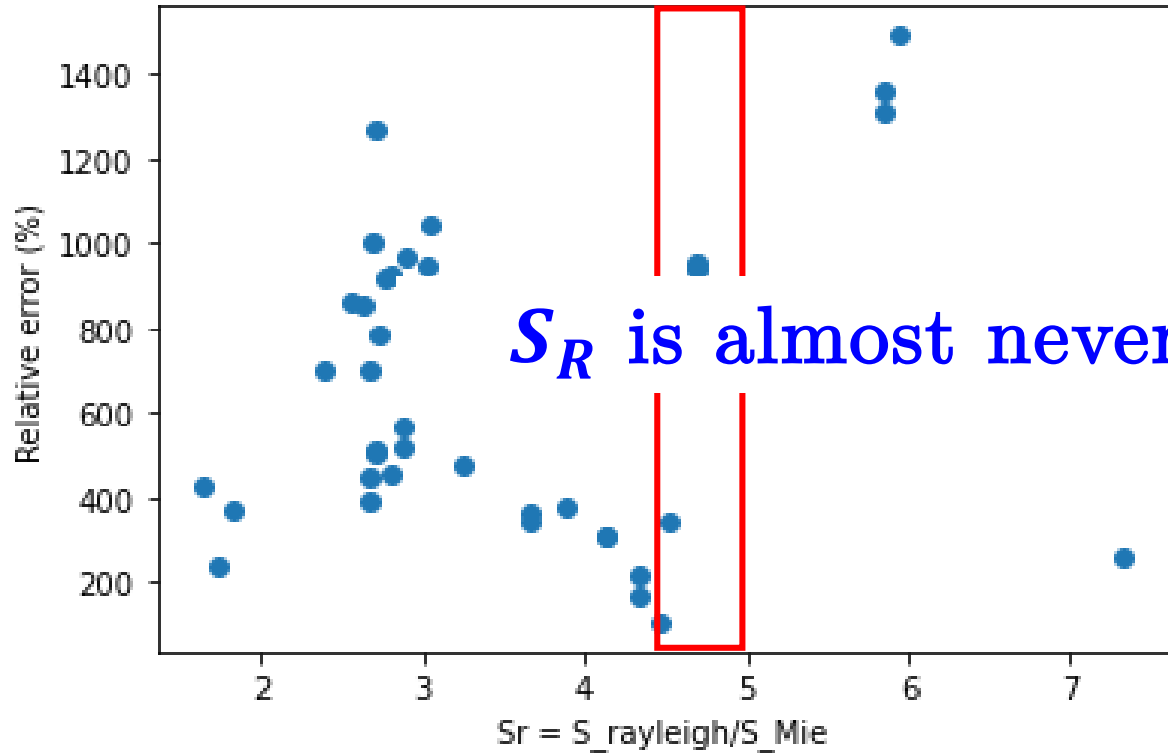


With atmospheric correction

$$S(23 \text{ or } 24) = S_{\text{atm}} + S_w$$

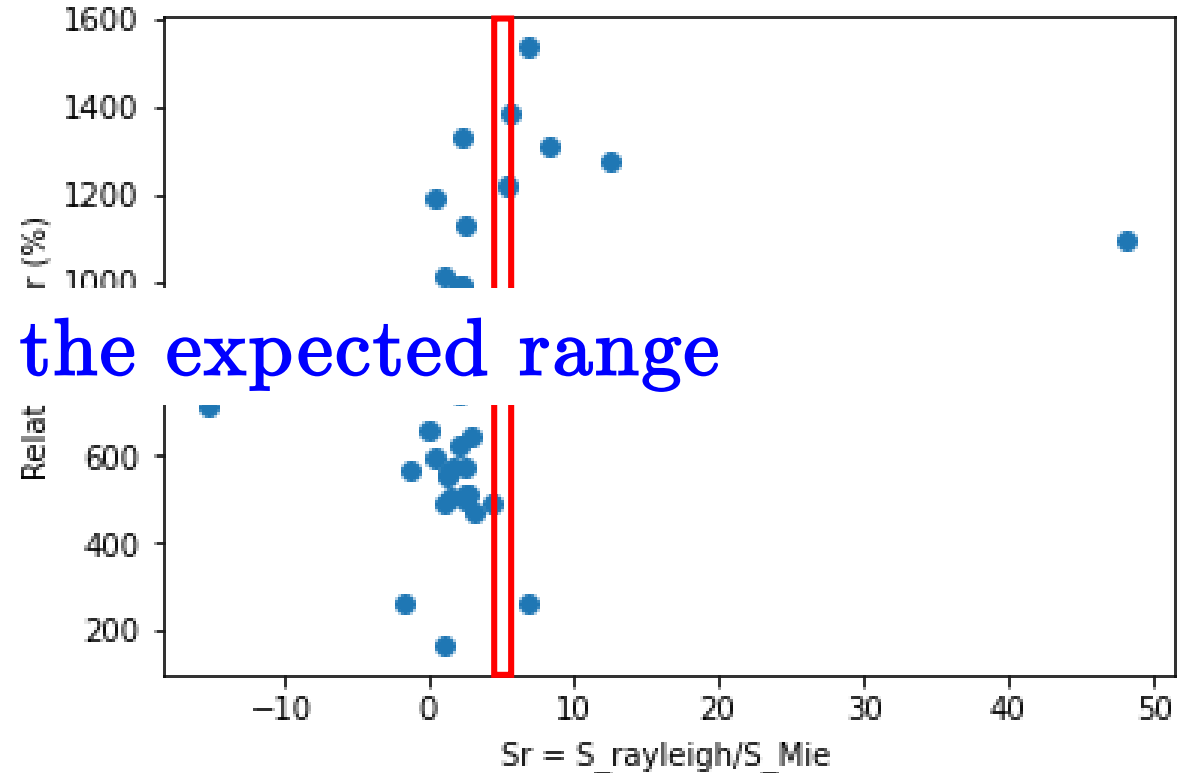
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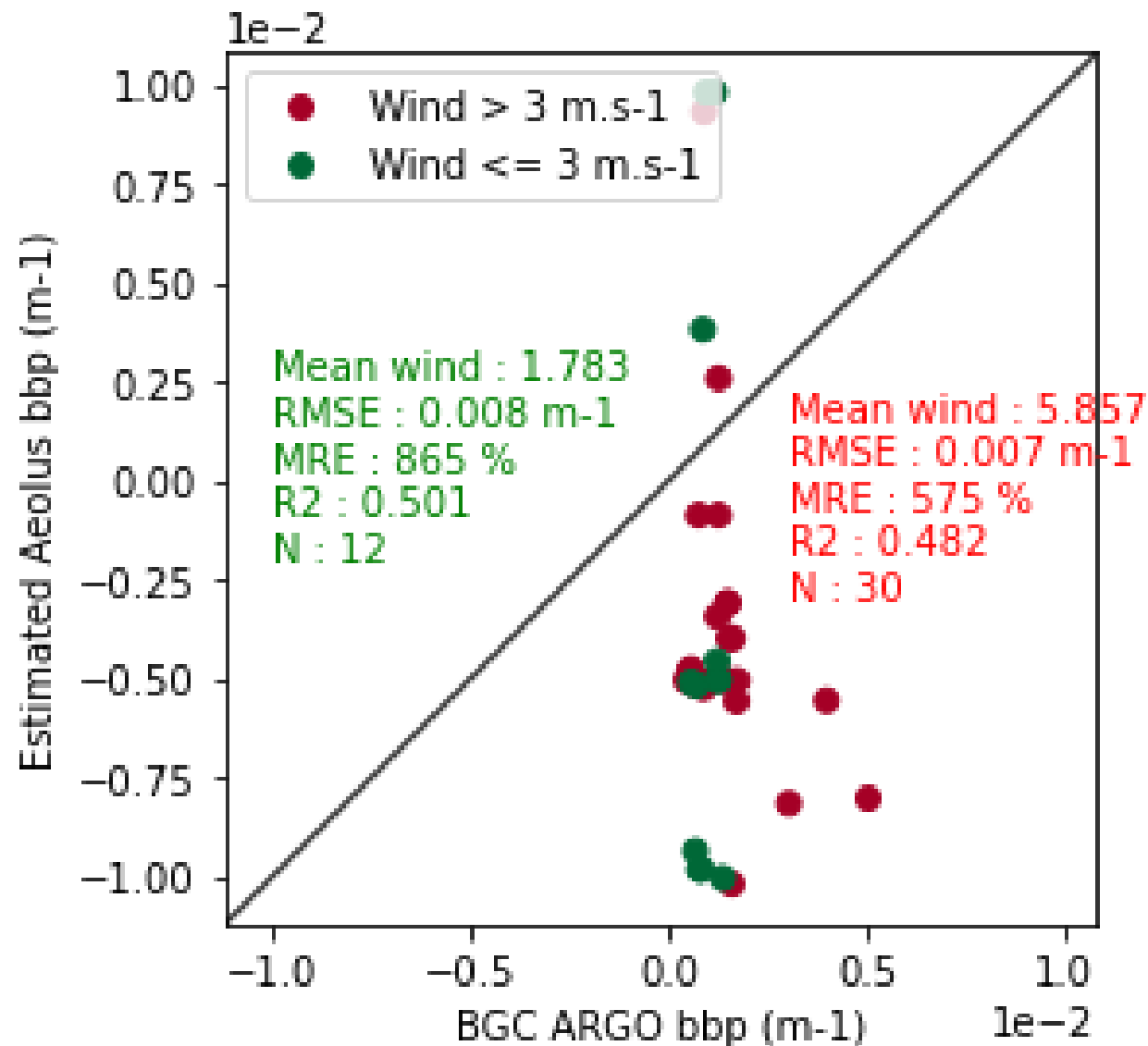
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# Impact of the hypothesis

- Range of  $S_R$
- **Impact of the wind**
- Homogeneity of the marine boundary layer

# M1 calibration bias. Cross-talk. Bin partly in ocean (no atmospheric correction, consideration of wind)

ERA5 reanalysis data used at the time and location of AEOLUS observations.



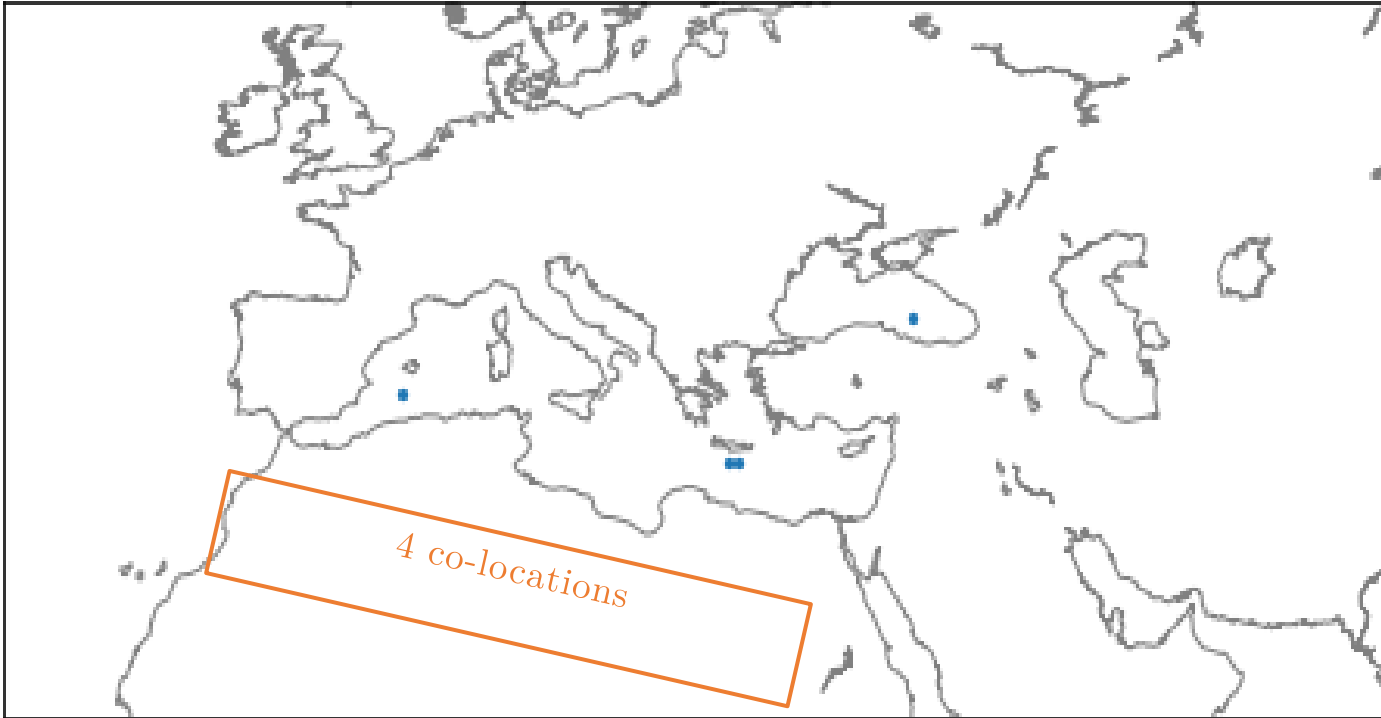
# Impact of the hypothesis

- Range of  $S_R$
- Impact of the wind
- **Homogeneity of the marine boundary layer**



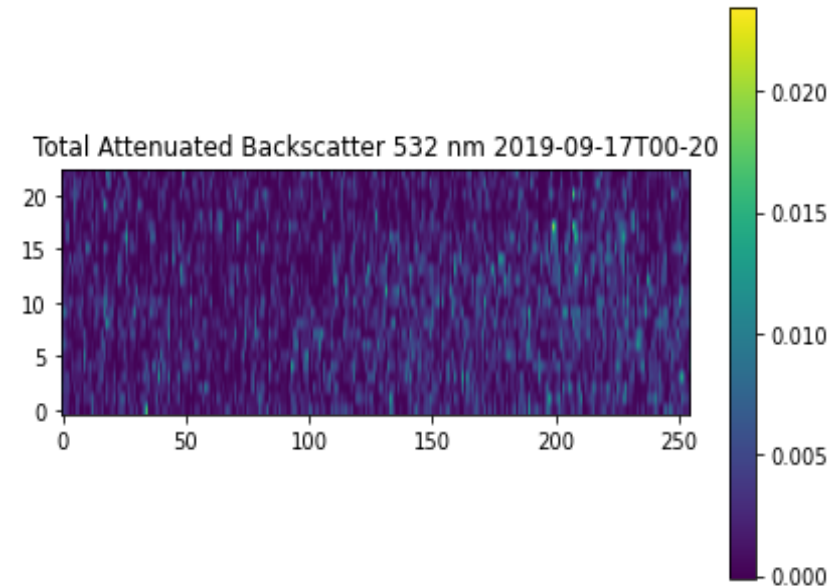
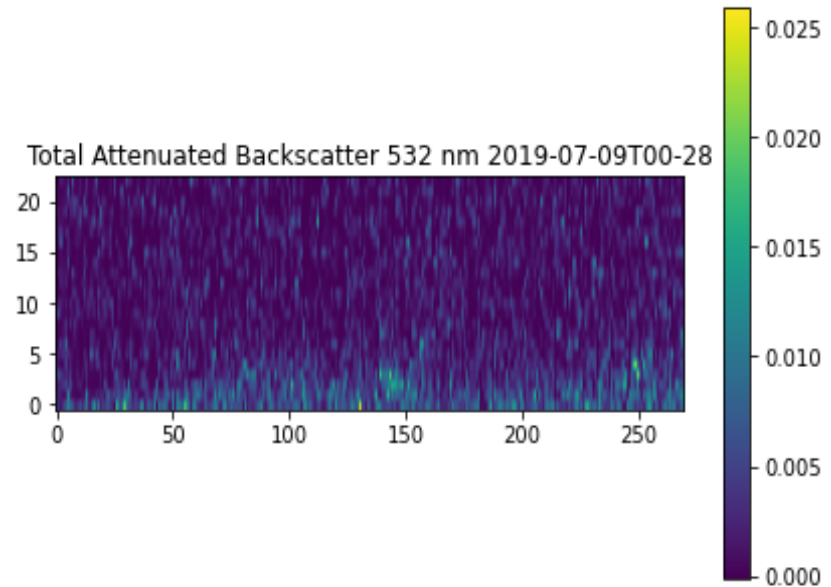
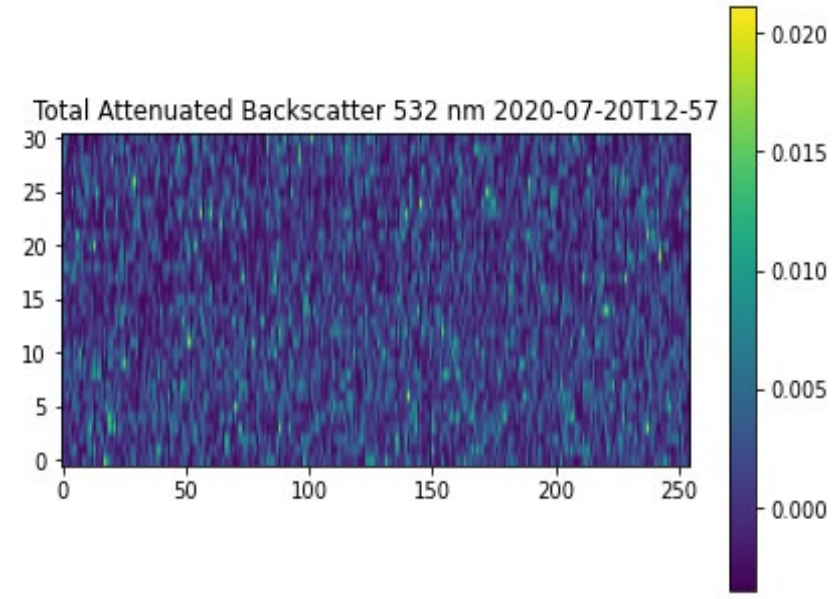
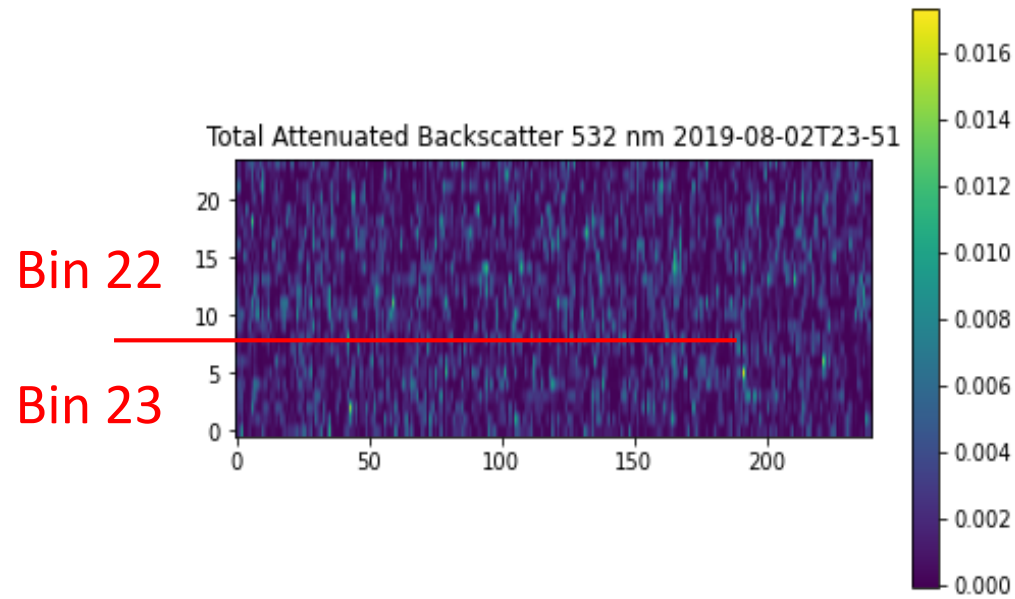
# Hypothesis on the homogeneity of the lower atmosphere

Collocation found between Aeolus, BGC Argo and CALIOP measurements



	Obs 1	Obs 2	Obs 3	Obs 4
SP dist 1 (km)	99	3.5	26	54
SP dist 2 (km)	63	3.3	32	49
TP dist (h)	8:30	28:40	4:00	4:07

# Hypothesis on the homogeneity of the lower atmosphere



	Observation 1		Observation 2		Observation 3		Observation 4	
	22nd bin	23rd bin	22nd bin	23rd bin	22nd bin	23rd bin	22nd bin	23rd bin
count	1440	240	3315	255	1620	270	1530	255
mean ( $km^{-1}sr^{-1}$ )	0.00172	0.0015	0.0016	0.0015	0.00398	0.00171	0.00242	0.00266
median ( $km^{-1}sr^{-1}$ )	0.00103	0.00076	0.00082	0.00095	0.003	0.00092	0.00173	0.00215
std ( $km^{-1}sr^{-1}$ )	0.00202	0.00177	0.00357	0.00356	0.00368	0.00216	0.00241	0.00237
abs relative difference (%)	12.79		6.25		57.03		9.91	
$b_{bp}$ predicted	-0.00803		-0.00518		0.00931		0.00381	
relative error (%)	259.53		698.14		953.36		345.06	

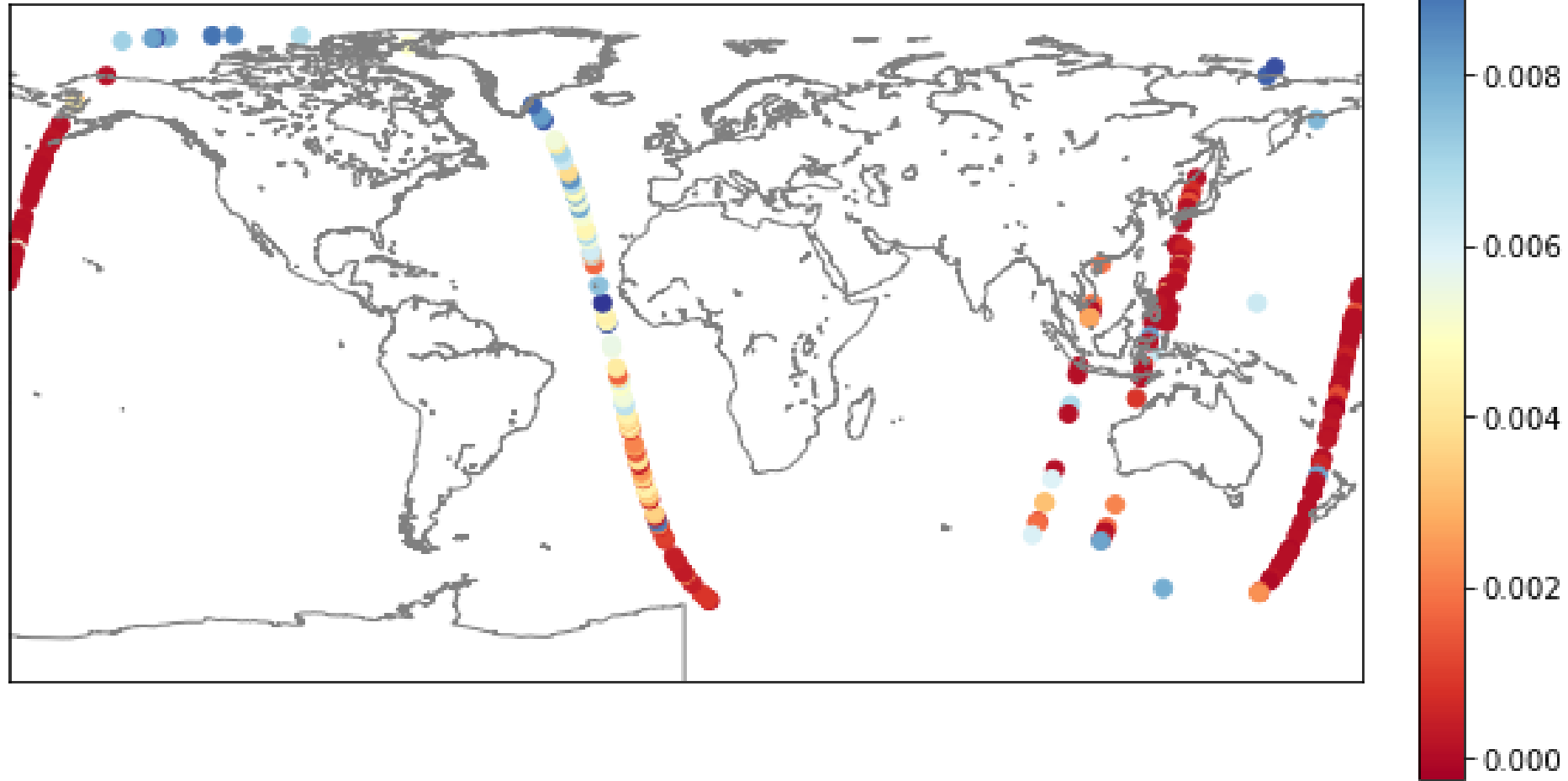
Statistical summary of the total backscatter at 532 nm above the 4 co-locations studied with a comparison between backscatter values in the 22nd and the 23rd bin

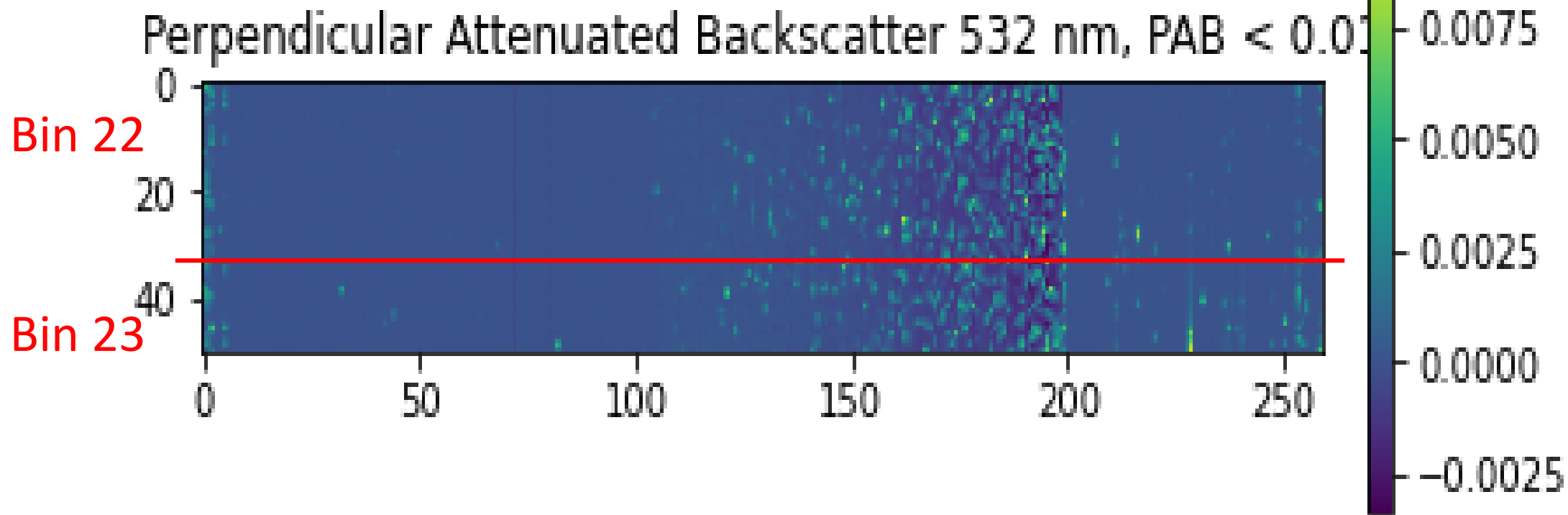
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Hypothesis acceptable for 3 out of 4 observations

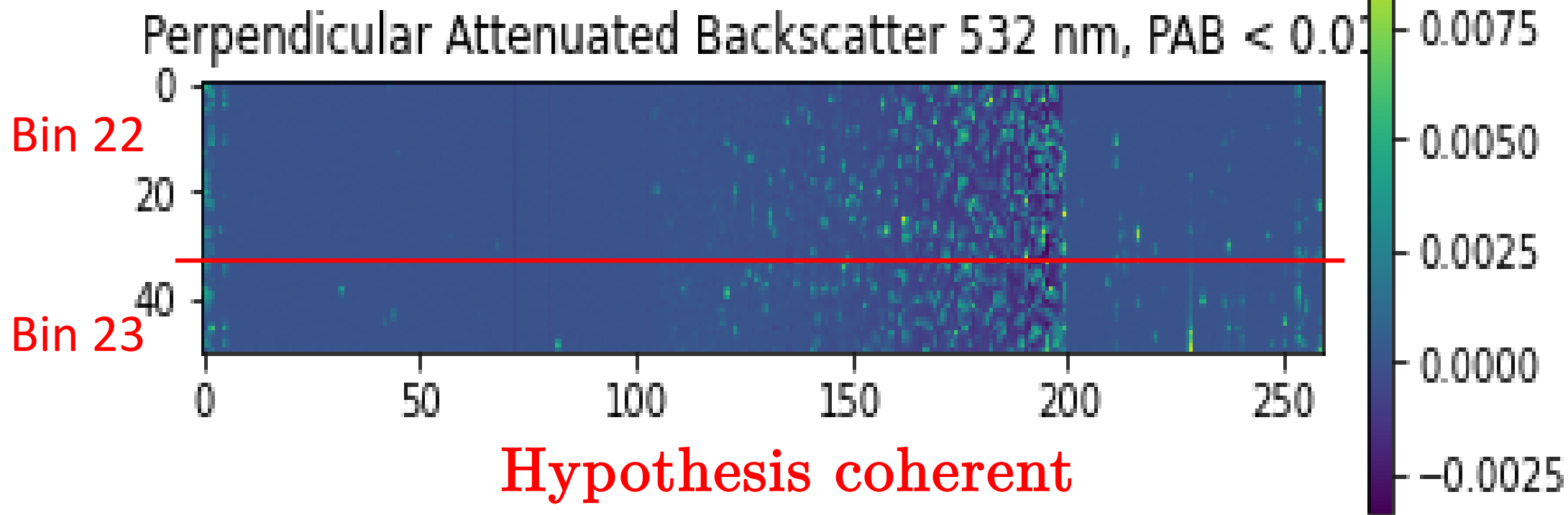
- 259 observations found without clouds between ALADIN and AEOLUS

Calipso / Aeolus colocations colored by maximum Perpendicular Attenuated Backscatter





Mean absolute difference (%)	3.89
Median absolute difference (%)	1.30
Std of absolute difference (%)	7.64
Max absolute difference (%)	64.37
Min absolute difference (%)	0.02
Count	259



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# Conclusions and Perspectives

- Use of HSRL capabilities to develop an oceanic algorithm
    - Estimation of the particulate back-scattering coefficient  $b_{bp}(355)$
    - Use of bin #23 : partly in atmosphere, partly in ocean, interface air-sea
    - Correction of atmosphere using bin #22
    - Validation in open ocean waters and Cabo Verde coastal waters
- Only negative values of  $b_{bp}(355)$  : not physical



# Conclusions and Perspectives

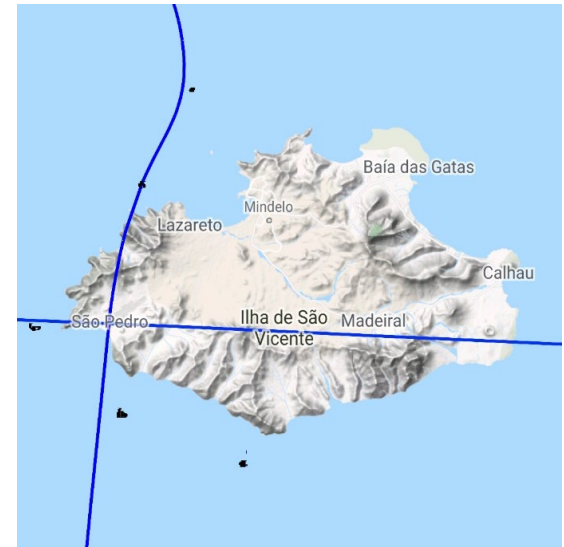
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  - Hypothesis of homogeneous lower atmosphere
  - Impact of wind
  - Range of validity on  $S_R$

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- **Sensitivity studies :**
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  - Impact of wind
  - Range of validity on  $S_R$
- **Main causes :**
  - Vertical resolution
  - SNR too low

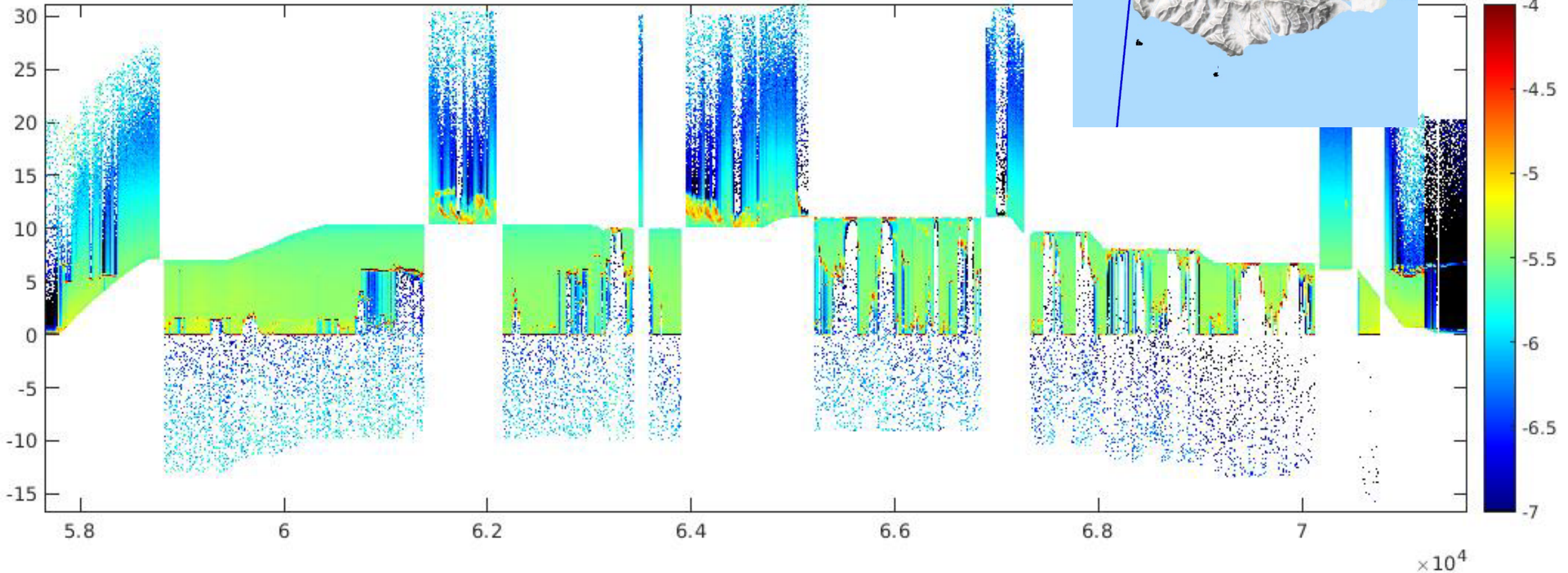
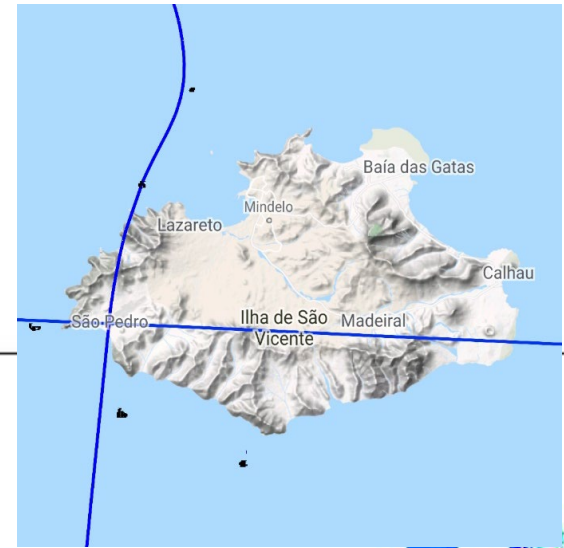
# Perspectives

- Perspectives :
  - Applying HSRL algorithm to LNG airborne lidar



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Attenuated backscatter lidar return signal at 355 nm in the Rayleigh channel

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  - Development of an algorithm using only the Mie channel

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  - Simulation of AEOLUS-2 with ocean capabilities (cross-polarization)

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  - Simulation of AEOLUS-2 with ocean capabilities
  - Study of ATLID
    - Higher vertical and horizontal resolution
    - Cross-polarization
    - Need  $C_x$  values for ocean



# Acknowledgments

- CNES for funding through the TOSCA program
- ESA for funding through the AEOLUS+-Innovation call
- The Ocean Science Mindelo Center (OSCM) for the help to organize this campaign and the use of their facilities: Pericles Silva, Ivanice Monteiro and Elizandro Rodrigues
- The captain and the fishermen of the Gamboa ship
- Alain Dabas and his team from Meteo-France for providing the Cx values for the ocean

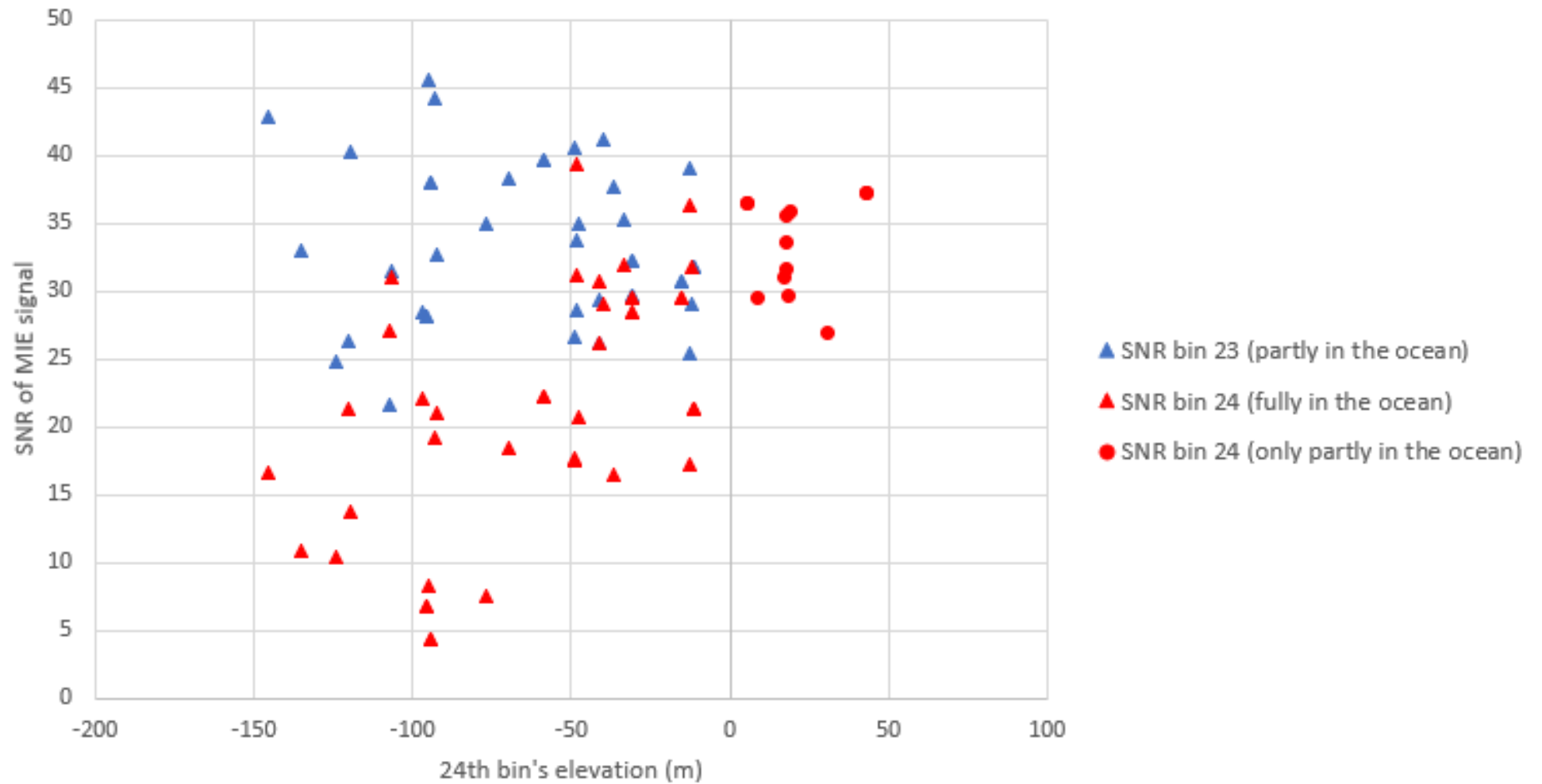
Thank you for your attention

Merci

ευχαριστώ

# General objectives

- Derivation of Ocean Color parameters from Aeolus
  - lidar-derived optical parameters
    - particulate attenuated backscatter  $\beta_p$
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  - ocean optical parameters related to ocean optical properties
    - diffuse attenuation coefficient  $K_d(355)$
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  - biogeochemical parameters related to marine biogeochemical cycles
    - particulate organic carbon  $POC$
    - phytoplankton carbon  $C_{phyto}$
    - coloured dissolved organic matter (CDOM)
- Potentials of these AOC products
  - Provide optical ocean properties in the UV
  - Study the diurnal variability of phytoplankton
  - Characterize the degradation of organic matter due to UV solar light, especially in Polar Regions.



SNR(24) < SNR(23)

# General objectives

- **2 core goals**
- Demonstrate the Aeolus potential to measure subsurface ocean particulate backscattering and the diffuse attenuation coefficient parameters in the UV
- Assess Aeolus potentials to estimate biogeochemical parameters linked to ocean colour and the ocean carbon cycle: particulate organic carbon (POC), phytoplankton carbon (C<sub>phyto</sub>) and coloured Dissolved Organic Matter (CDOM)

# General objectives

- **2 core goals**

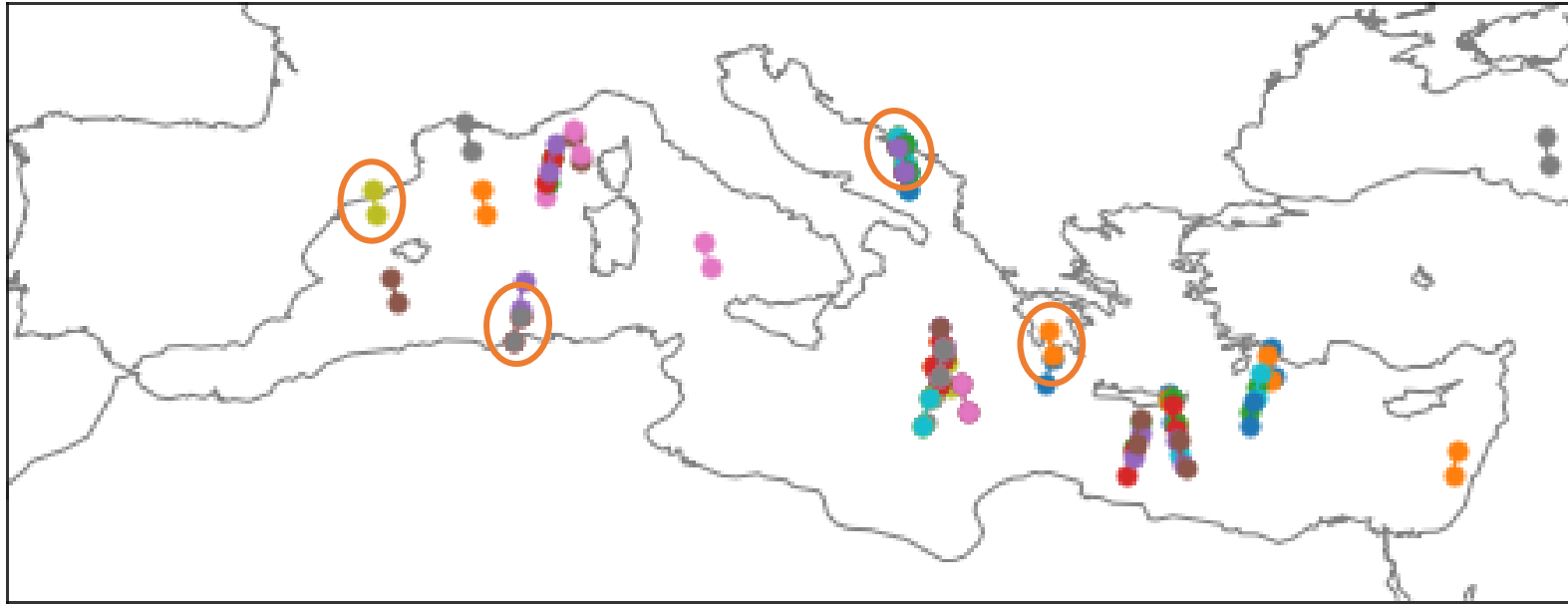
- Demonstrate the Aeolus potential to measure subsurface ocean particulate backscattering and the diffuse attenuation coefficient parameters in the UV
- Assess Aeolus potentials to estimate biogeochemical parameters linked to ocean colour and the ocean carbon cycle: particulate organic carbon (POC), phytoplankton carbon (C<sub>phyto</sub>) and coloured Dissolved Organic Matter (CDOM)

- **6 Technical / Scientific objectives**

- Development of a processing algorithm to generate Aeolus lidar-derived optical properties ( $\beta_P(355)$  and  $K_L(355)$ ) from the co-polar backscatter signal;
- Development of a processing algorithm to generate Aeolus ocean optical parameters ( $b_{bp}(355)$  and  $K_d(355)$ ) from the lidar-derived parameters;
- Development of a retrieval scheme to generate more added-value biogeochemical estimates related to ocean colour from Aeolus measurements ( $POC$ ,  $C_{phyto}$ ,  $CDOM$ ), derived from the ocean optical parameters;
- Evaluation and validation of Aeolus ocean optical estimates compared to other space-borne products (albeit at other wavelengths) and *in situ* data;
- Evaluation and validation of Aeolus biogeochemical estimates against other products (space-borne products, *in situ* measurements, model simulations, etc.);
- Assessment of the benefits of ocean colour products derived from Aeolus measurements in terms of knowledge gain on the functioning of ocean ecosystems, in particular regarding the global carbon cycle.

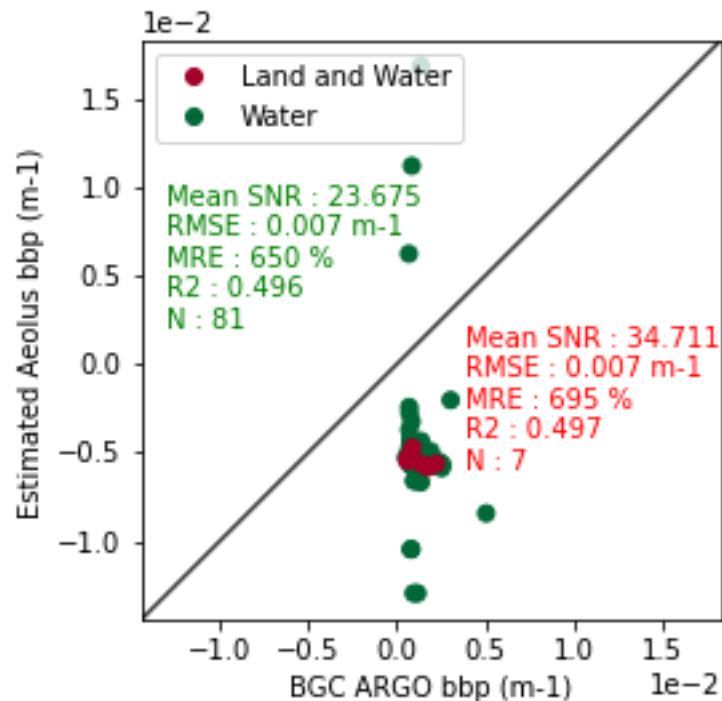
# Validation of AOC products

- M1 calibration bias. Cross-talk. Bin partly in ocean (atmospheric correction, no consideration of wind)
  - › AEOLUS observations affected by the ground

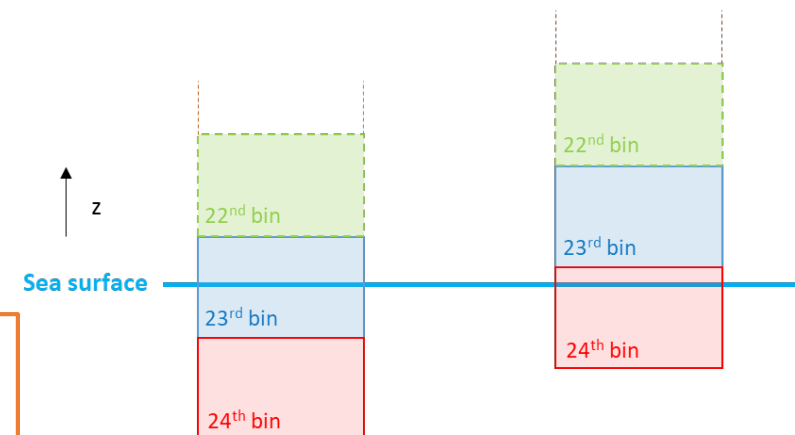


# Validation of AOC products

- M1 calibration bias. Cross-talk. Bin partly in ocean (atmospheric correction, no consideration of wind)
  - › Global results of  $b_{bp}$  retrievals



$$S_{atom}(23) = S_{atm}(22) \frac{altitude\_bin(23)}{height\_bin(23)}$$



AEOLUS observations partly on ground removed in the algorithm