

Ocean Surface Topography Science Team Meeting, 21-25 October 2019, Chicago, IL



## Reducing the high-frequency noise in Jason-3 and Sentinel-3A SWH data

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# Motivation (1/3) → room for improvement

-2

- Boosted interest in SWH parameter
  - Development of new retracker (ADAPTIVE) that better fits conventional LRM waveforms and reduces the 20-Hz SWH noise level by -60% for Jason-3 [Thibaut et al, 2017]
  - Availability of several processings for SAR altimetry data that allow to resolve shorter-scale ocean features (<100 km) [Dinardo et al, 2015; Phalippou and Demeester, 2011; Moreau et al, in preparation]
  - Growing interest to maximize coastal retrievals and to analyze wave-current interactions that predominates at scales below 100 km [Ardhuin et al, 2017; Quilfen and Chapron, 2019]
- Start of the ESA Sea-State Climate Change Initiative activity in 2018 to compare different SWH estimations through a Round Robin exercise to select the best algorithm and construct a consistent SWH dataset
- ➔ **CNES/CLS participation amongst several teams to the ESA Sea-State CCI project by providing SWH datasets for the Round Robin evaluation**

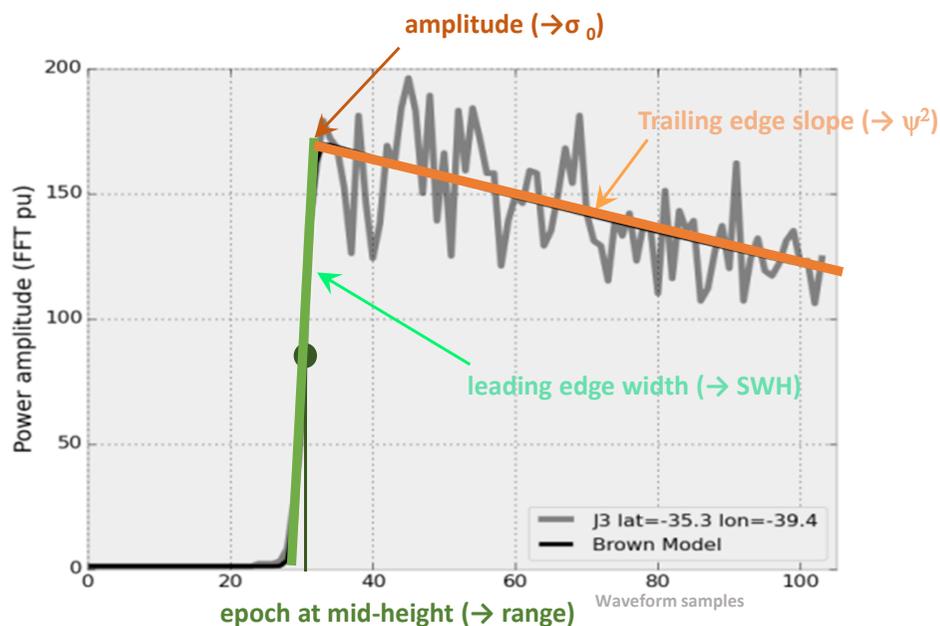
## Motivation (2/3) → improvement in precision aspect

-3

- Different aspects could be improved:
  - accuracy, precision, continuity between different altimetric missions, stability in time-series, correlated errors, ...
- We focus here on the SWH data precision to improve the signal-to-noise ratio to increase the consistency between different missions and processing algorithms at intermediate scales and identify short wavelength features ( $< 100$  km).
- We propose an additional post-processing step that is not in the family of noise filtering approaches (i.e. low-pass filtering) where one gets systematic loss of small-scale geophysical information depending on the cut-off choice.
- We rather propose an empirical correction that reduces the high-frequency variability in the SWH estimations

# Motivation (3/3) → observations of correlated errors

-4

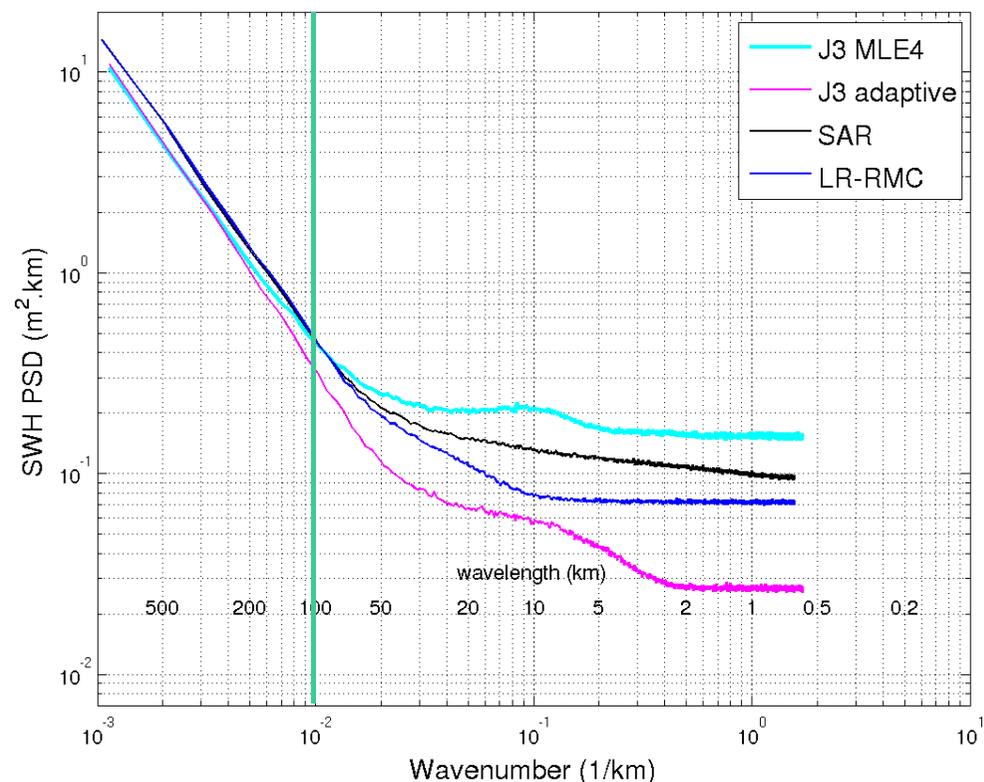


- Retracking algorithms are used to fit altimeter waveforms to give simultaneous estimates of range, significant wave height (SWH), backscatter coefficient ( $\sigma_0$ ) and provide sometimes also the slope of the waveform trailing edge ( $\psi^2$ )
- Estimated from noisy waveform inputs, these estimates display correlated errors
  - in  $\sigma_0$  and  $\psi^2$  values from the trailing edge data
  - In SWH and range values from the leading edge data
- Several studies [Zaron and DeCarvalho, 2016; Tran et al, 2019; Quartly et al, 2019] have improved the precision of the SSH estimations by reducing the correlated errors between range and SWH
- The objective here is to perform similar empirical adjustment to improve SWH estimations

- Data analyzed
- Cross-spectral analyses
- Empirical model to reduce high-frequency noise in SWH
- SWH spectrum impact
- Variance reduction statistics
- Coastal results
- 1-Hz benefit

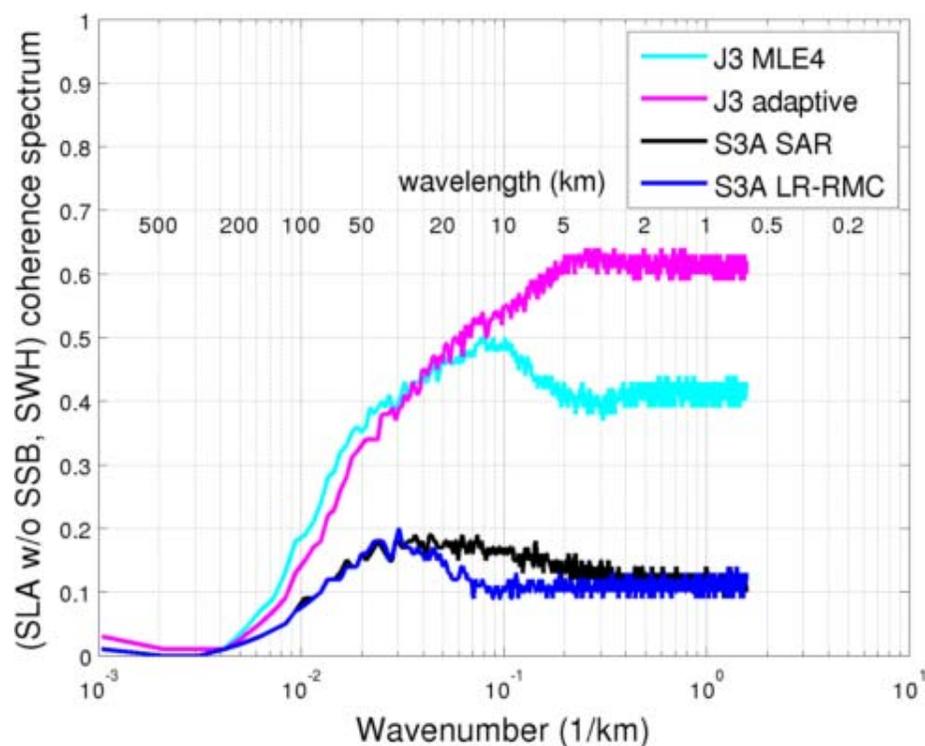
# Data analyzed → high-rate 20-Hz products

- Jason-3
  - Cycles 23-59 (1-year)
  - MLE4 retracker for conventional LRM data
  - Numerical ADAPTIVE retracker
  
- Sentinel-3A
  - CNES S3 Processing Prototype (F. Boy)
  - Cycles 6 to 20 (1-year)
  - Unfocused SAR (SAR mode) processing
  - Low-resolution with range migration correction (LR-RMC) processing
  
- SWH estimations from conventional altimetry (adaptive retracker) are less noisy than SAR SWH (UF-SAR or LR-RMC)
  
- No white noise floor but a red noise is observed for UF-SAR SWH



| Noise Floor (cm rms) |          |     |        |
|----------------------|----------|-----|--------|
| MLE4                 | ADAPTIVE | SAR | LR-RMC |
| 51                   | 21       | 39  | 34     |

# Cross-spectral analyses → Magnitude-squared coherency -7

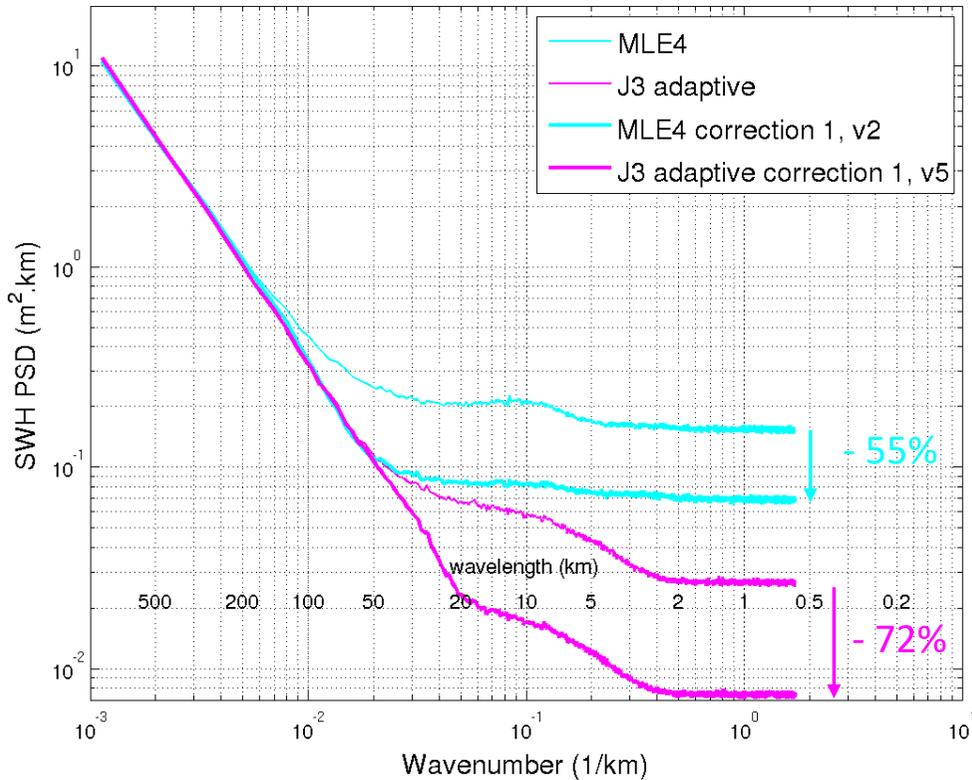


- MSC is the square of the linear correlation coefficient between two variables with respect to wavelength ( $\lambda$ )
- Here is the relationship between SLA (Orbit – Range – MSS) and SWH, not in order to analyze SSB range correction but to display how variances in SLA and variances in SWH are related for  $\lambda < 100$  km
- For Jason-3 retracker, more than 40% of the variances are correlated for  $\lambda < 50$  km, reaching  $\sim 60\%$  for  $\lambda < 5$  km in the case of the adaptive retracker
- For Sentinel-3A, this correlation is lower than 20% for  $\lambda < 50$  km
- These indicate that the reduction of the correlated high-frequency errors should be larger for conventional LRM data than in the case of the delay-doppler data

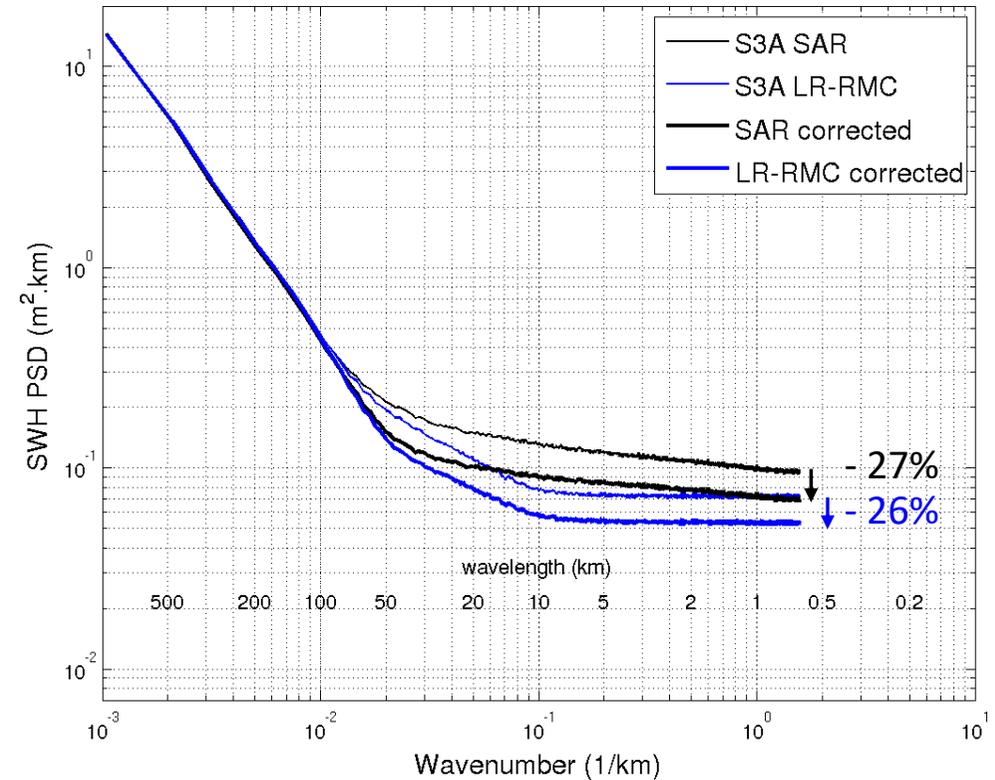
- Mimic the Zaron and DeCarvalho [2016]'s empirical approach developed to correct 1-Hz SSH by reducing the SSH noise correlated with the SWH noise
- Tran et al [2019] adapted the approach to correct high-rate (20-Hz) SSH data with a high-frequency adjustment (HFA) term to better isolate the retracker-based noises:  $SSH_{corr} = SSH - HFA$
- The HFA approach is reverse here to correct 20-Hz SWH values by reducing the SWH noise correlated with the SLA noise:  $SWH_{corr} = SWH - HFA$ 
  - For J3:  
$$HFA = (\alpha + \beta * SWH_{smooth\_xkm}) * (SLA - SLA_{smooth\_ykm})$$
$$SLA = ORBIT - range - MSS\_CNESCLS2015$$
  - For S3A:  
$$HFA = (\alpha + \beta * SWH_{smooth\_xkm}^{-1} + \gamma * SWH_{smooth\_xkm}^{-0.5}) * (SLA - SLA_{smooth\_xkm})$$
$$SLA = ORBIT - range - S3A\_Mean\_Profile$$
  - the data filtering depends on mission, processing mode, retracking algorithm

# SWH spectra

Jason-3 HR, cycle 33 & 51

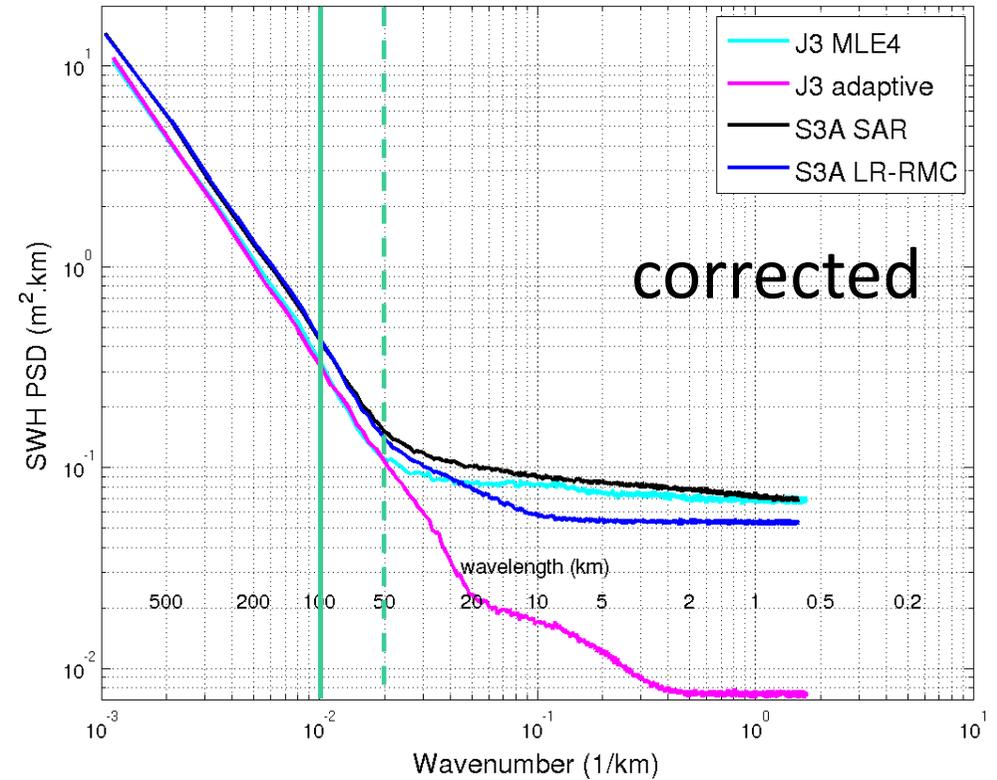
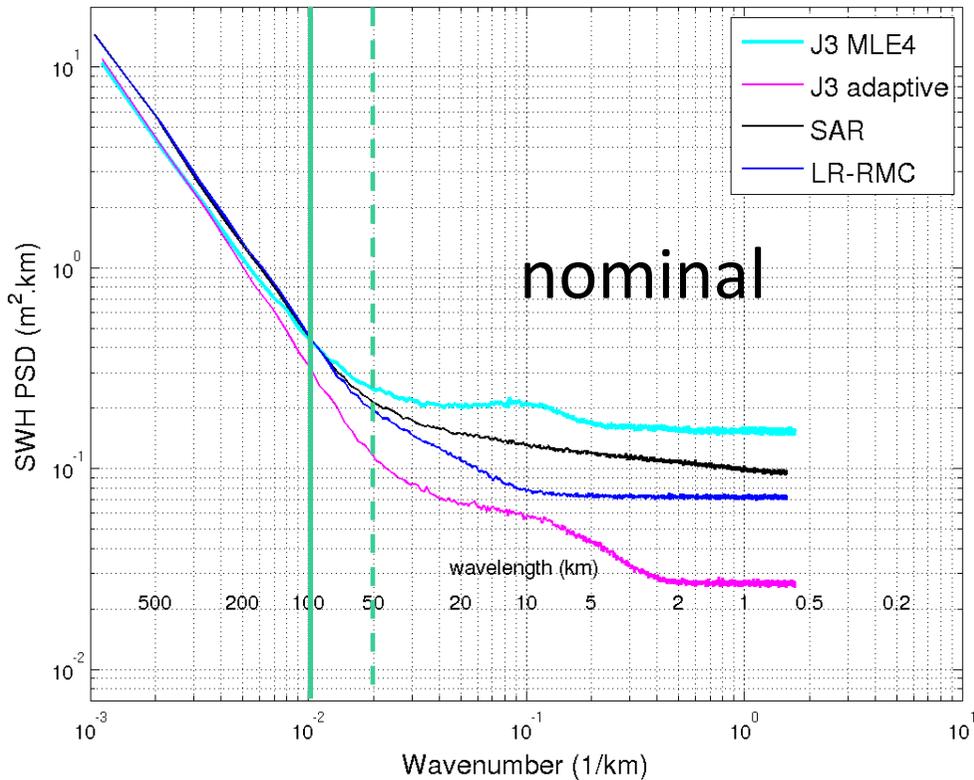


S3APP v2.1 HR, cycles 12 & 20



- By design, only SWH data content at  $\lambda < 100$  km is impacted
- SWH variance is largely reduced in this high-frequency interval

SWH spectra → improved consistency between missions for  $\lambda$  in [50, 100] km <sup>-10</sup>  
 variance of corrected MLE4 close to variance of corrected UF-SAR



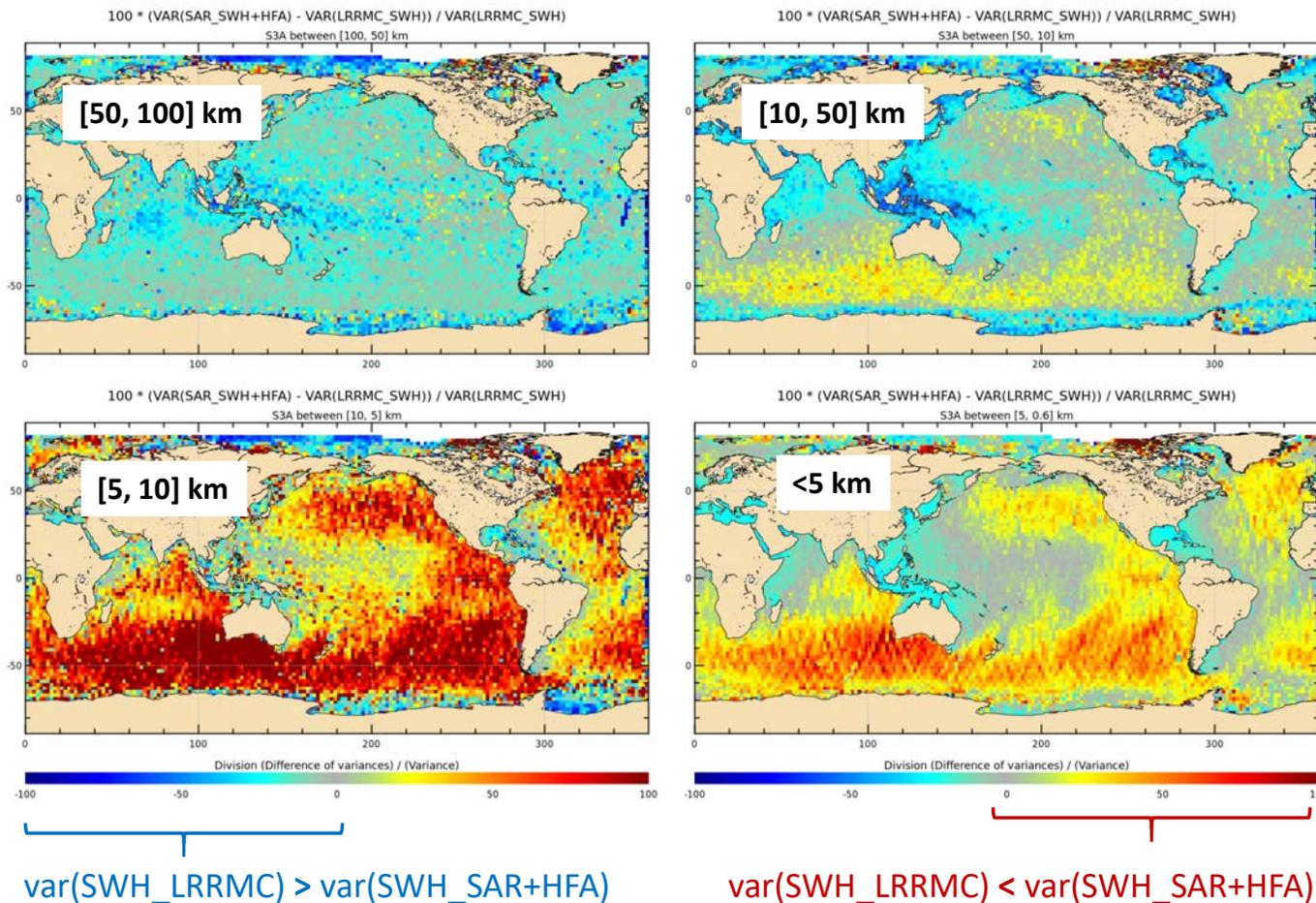
Noise Floor (cm rms)

| MLE4 | MLE4_corr | ADAPTIVE | ADAPTIVE_corr | SAR | SAR_corr | LR-RMC | LR-RMC_corr |
|------|-----------|----------|---------------|-----|----------|--------|-------------|
| 51   | 34        | 21       | 11            | 39  | 33       | 34     | 29          |

# variance comparison (%) → feature in SAR red noise

-11

$\text{var}(\text{SWH\_SAR+HFA})$  vs  $\text{var}(\text{SWH\_LRRMC})$



- SAR spectral slope (“red noise”) is still there for  $\lambda < 50$  km after HFA application
- By lowering the high-frequency variability at a level similar to the LR-RMC one, differences can be more easily described
- Clear correlations with swell regions are shown
- Confirming previous results on swell induced effects [Moreau et al, 2018; Raynal et al, 2018]

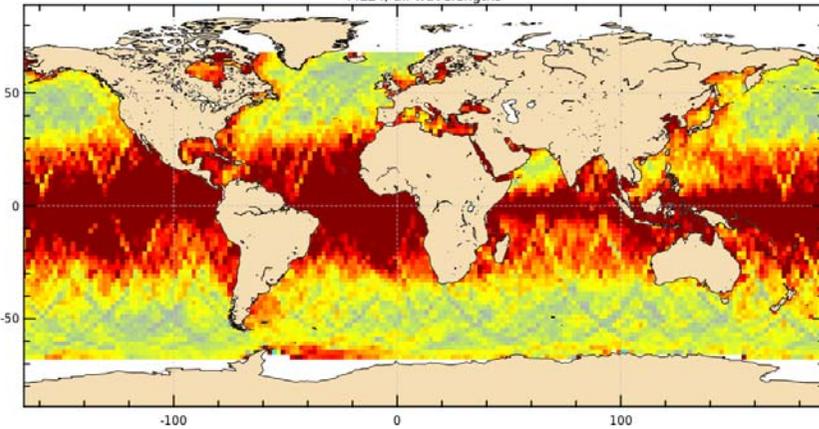
# Variance reduction maps

Variance comparison (%), nominal data, MF-WAM used as reference

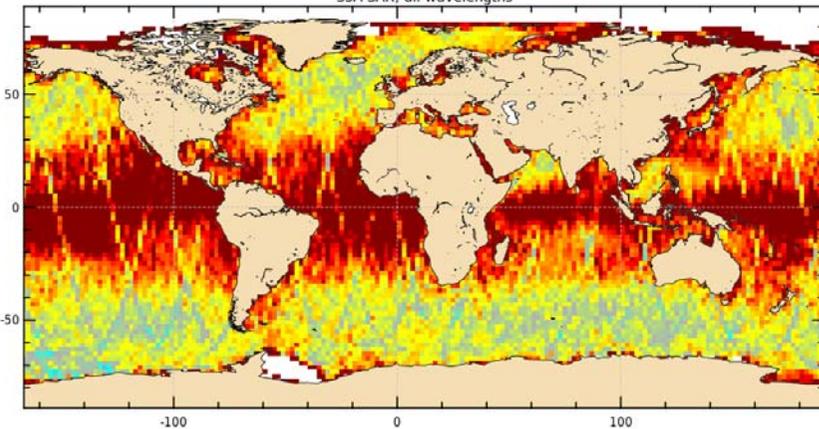
Percentage of Variance reduction (considering one year of data)  

$$PVR = 100 * ( \text{var}(\text{New\_SWH}) - \text{var}(\text{reference\_SWH}) ) / \text{var}(\text{reference\_SWH})$$
-12

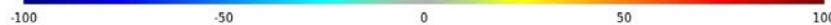
100 \* (VAR(SWH) - VAR(HS\_WAM)) / VAR(HS\_WAM)  
MLE4, all wavelengths



100 \* (VAR(SWH) - VAR(HS\_WAM)) / VAR(HS\_WAM)  
S3A SAR, all wavelengths



Division (Difference of variances) / (Variance)

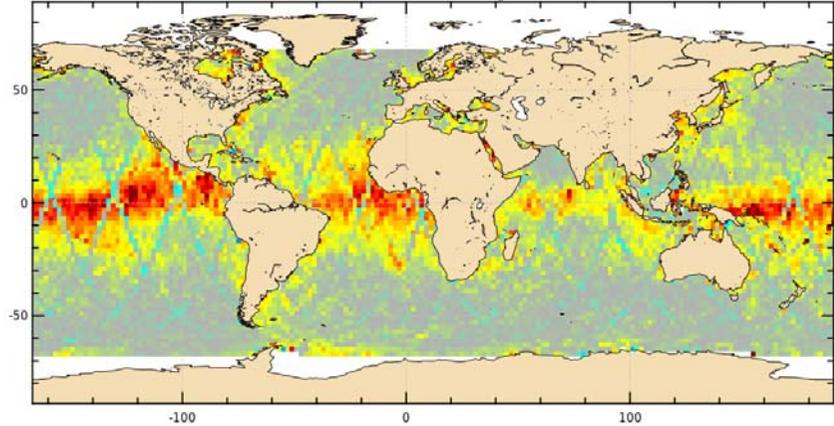


## MLE4

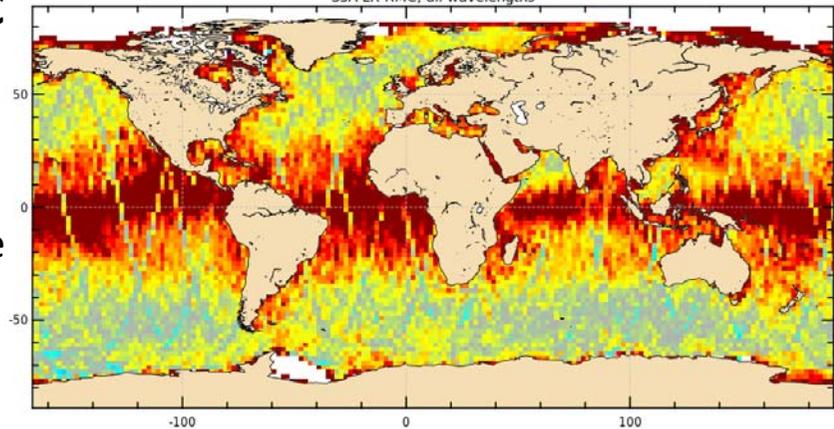
Altimetric SWH data are highly variable in the inter-tropical regions where low SWH conditions are observed

## ADAPTIVE

100 \* (VAR(SWH) - VAR(HS\_WAM)) / VAR(HS\_WAM)  
ADAPTIVE, all wavelengths



100 \* (VAR(SWH) - VAR(HS\_WAM)) / VAR(HS\_WAM)  
S3A LR-RMC, all wavelengths



Division (Difference of variances) / (Variance)



## SAR

The ADAPTIVE estimations display the lowest variabilities when one compares with those from the model data → retrieved waves are more stable in time

## LR-RMC

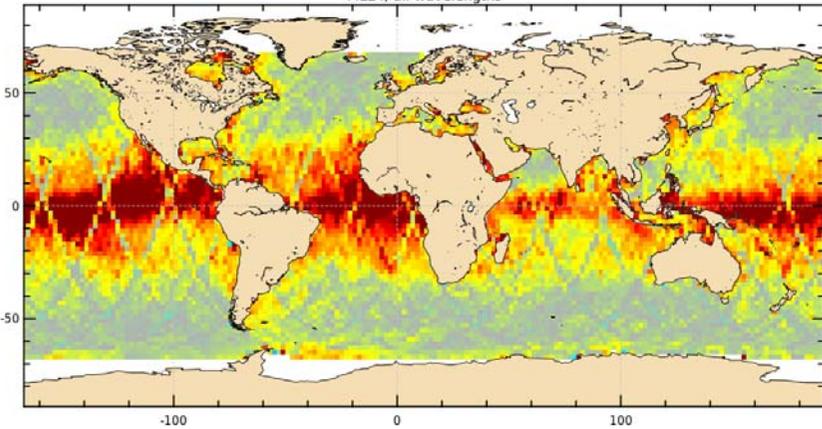
# Variance reduction maps

Variance comparison (%), corrected data, MF-WAM used as reference

Percentage of Variance reduction (considering one year of data)  

$$PVR = 100 * ( \text{var}(\text{New\_SWH}) - \text{var}(\text{reference\_SWH}) ) / \text{var}(\text{reference\_SWH})$$
-13

$100 * (\text{VAR}(\text{SWH}+\text{HFA}) - \text{VAR}(\text{HS\_WAM})) / \text{VAR}(\text{HS\_WAM})$   
 MLE4, all wavelengths

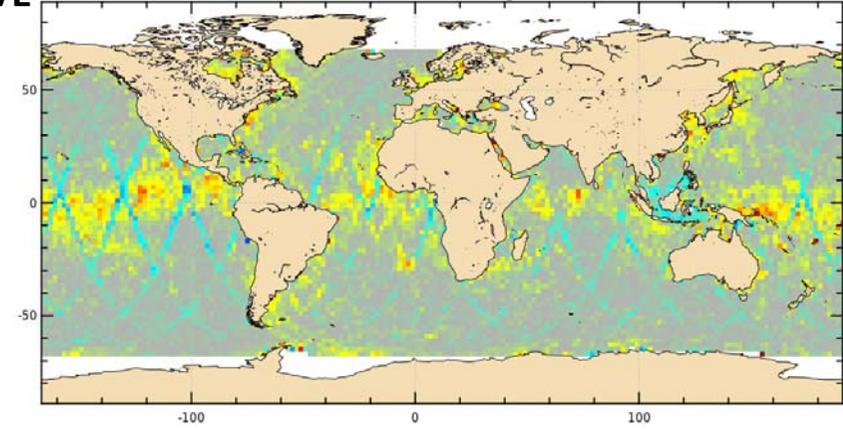


**MLE4  
+ HFA**

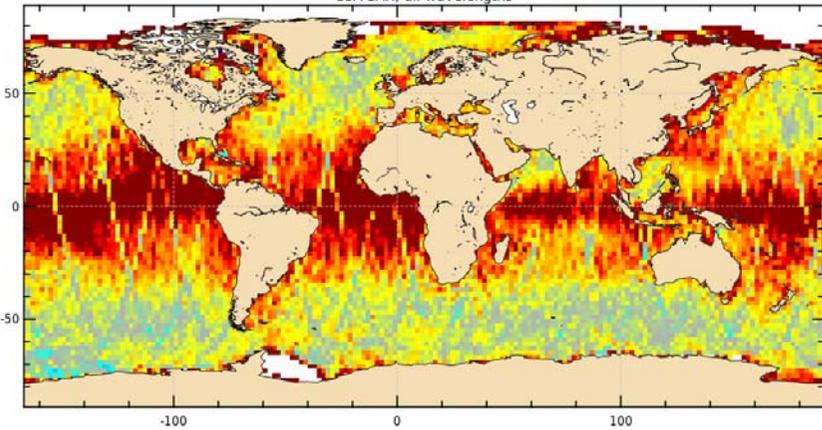
**ADAPTIVE  
+ HFA**

The extent of the red color zone tightens around the equator

$100 * (\text{VAR}(\text{SWH}+\text{HFA\_v5}) - \text{VAR}(\text{HS\_WAM})) / \text{VAR}(\text{HS\_WAM})$   
 ADAPTIVE, all wavelengths



$100 * (\text{VAR}(\text{SWH}+\text{HFA}) - \text{VAR}(\text{HS\_WAM})) / \text{VAR}(\text{HS\_WAM})$   
 S3A SAR, all wavelengths

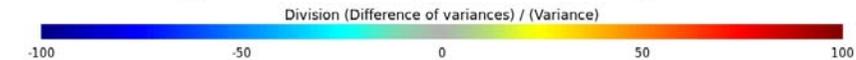
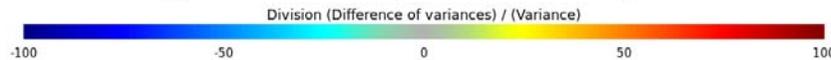
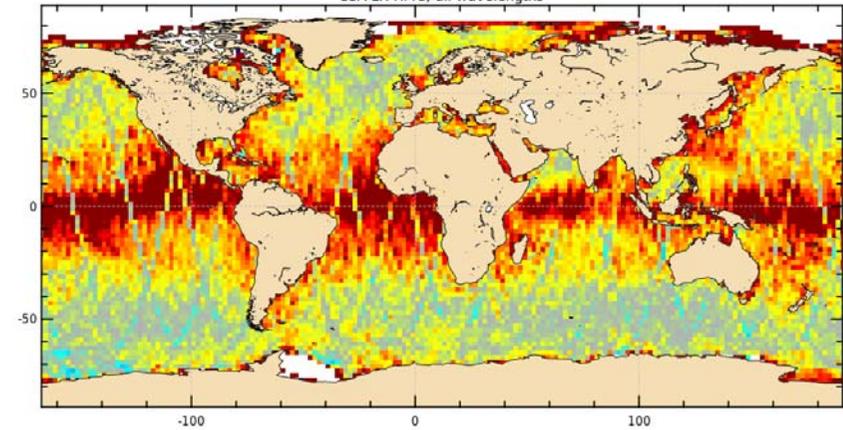


**SAR  
+ HFA**

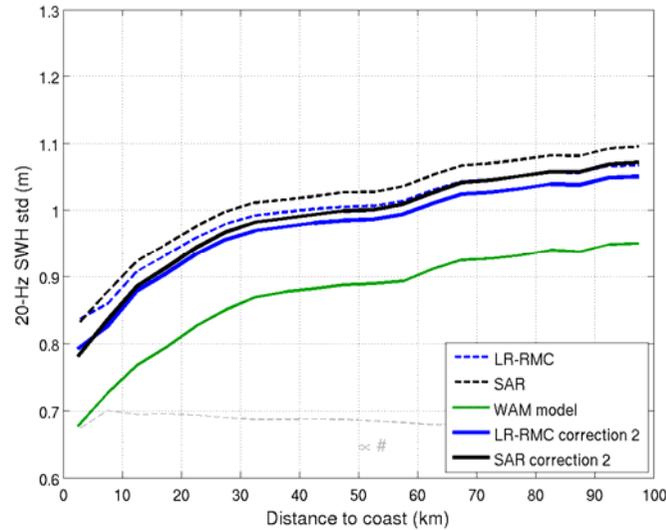
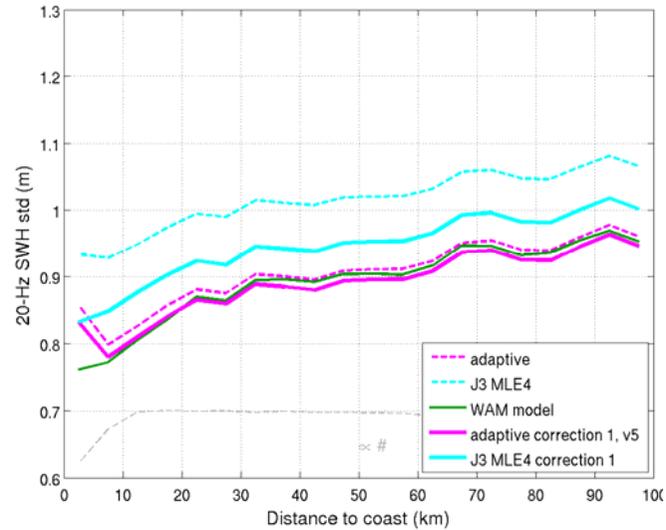
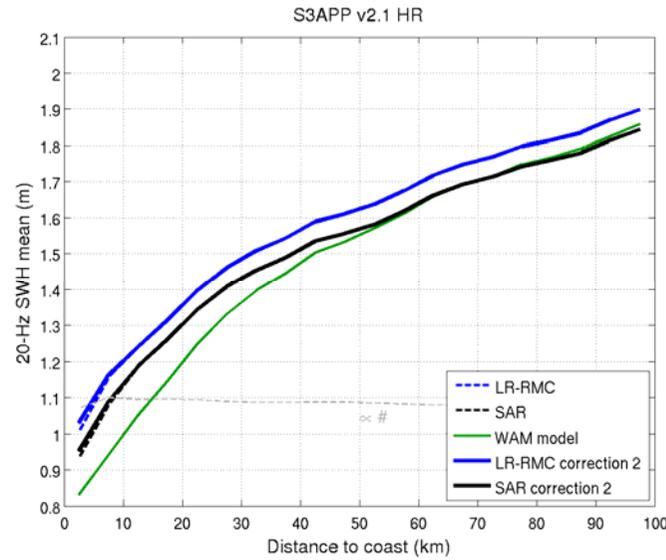
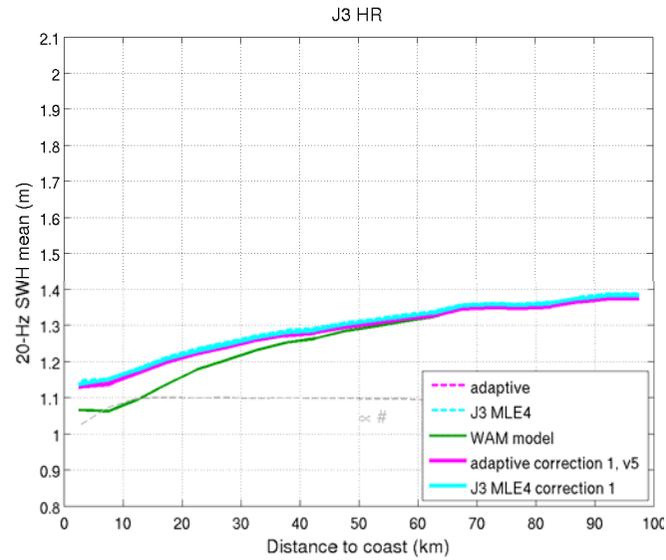
**LR-RMC  
+ HFA**

The reduction of the HF noise leads to reduce the local temporal variability which is now closer to model variations → help for model assimilation exercise to better seen shorter-scale features?

$100 * (\text{VAR}(\text{SWH}+\text{HFA}) - \text{VAR}(\text{HS\_WAM})) / \text{VAR}(\text{HS\_WAM})$   
 S3A LR-RMC, all wavelengths



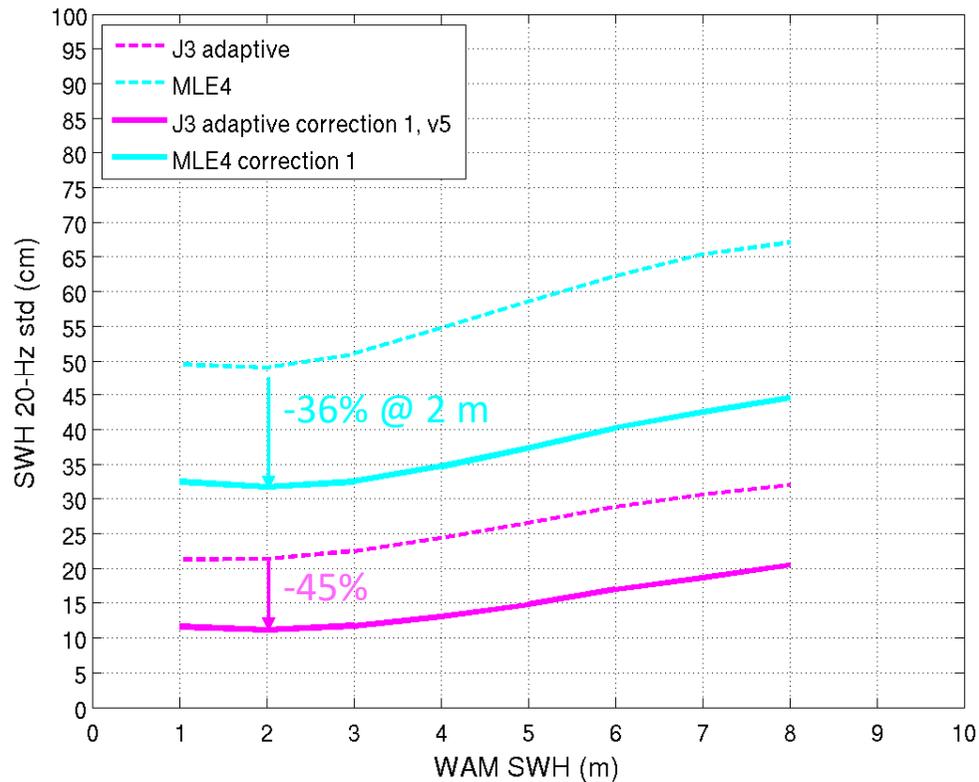
# Coastal results



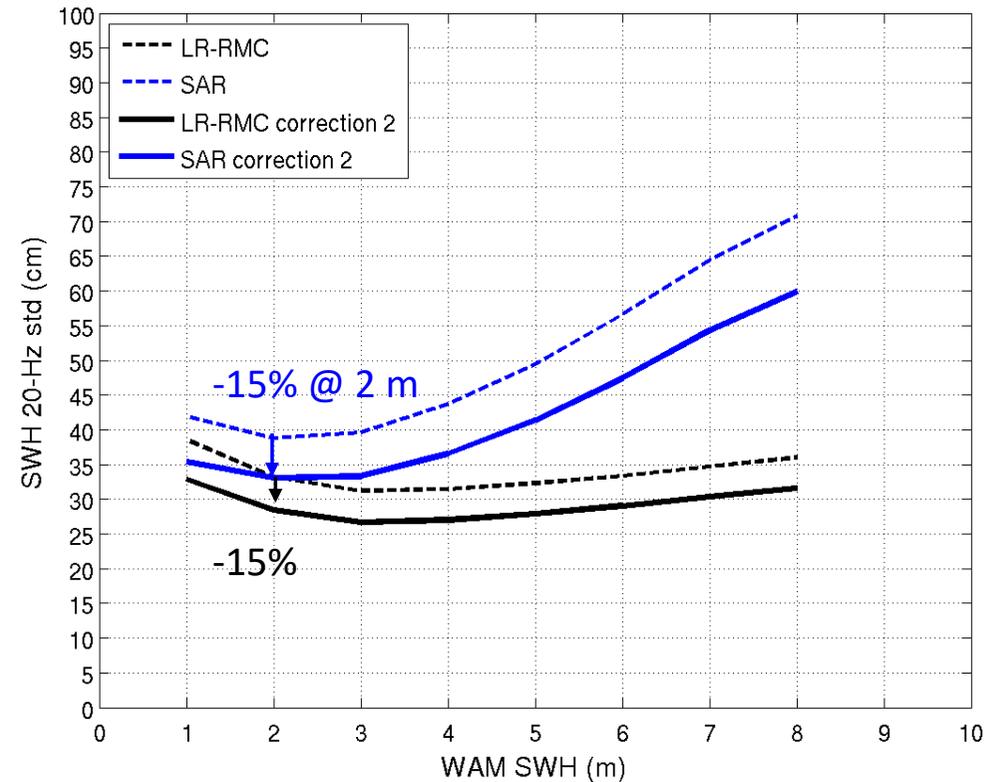
- No change is observed in term of bias
- Reductions of the data variability are obtained even in coastal regions

# 1-Hz benefit

Jason-3 HR (cycles 33 & 51)



S3APP v2.1 HR (cycles 12 & 18)



- The reduction of the high-frequency content in 20-Hz data leads automatically to reduce the 1-Hz data noise

- Large improvements are obtained in the retrieval of SWH estimations
  - for LRM data thanks to Adaptive retracker + HFA
  - for SAR data thanks to LR-RMC processing + HFA
- These two solutions have been provided for the ESA Sea-State CCI Round Robin exercise; Quarterly [2019] followed close pathway; have a look at F. Schlembach's poster presenting the Round Robin results; have a look also at Y. Quilfen's poster presenting another approach for denoising SWH data.
- LR-RMC demonstration products will be made available by the end of the year and a paper is in preparation [Moreau et al; 2020]
- Adaptive retracker + HFA will be used in the reprocessing of ERS and ENVISAT/RA-2 in the frame of the Fundamental Data Record For Altimetry activity (ESA project)

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Thank you