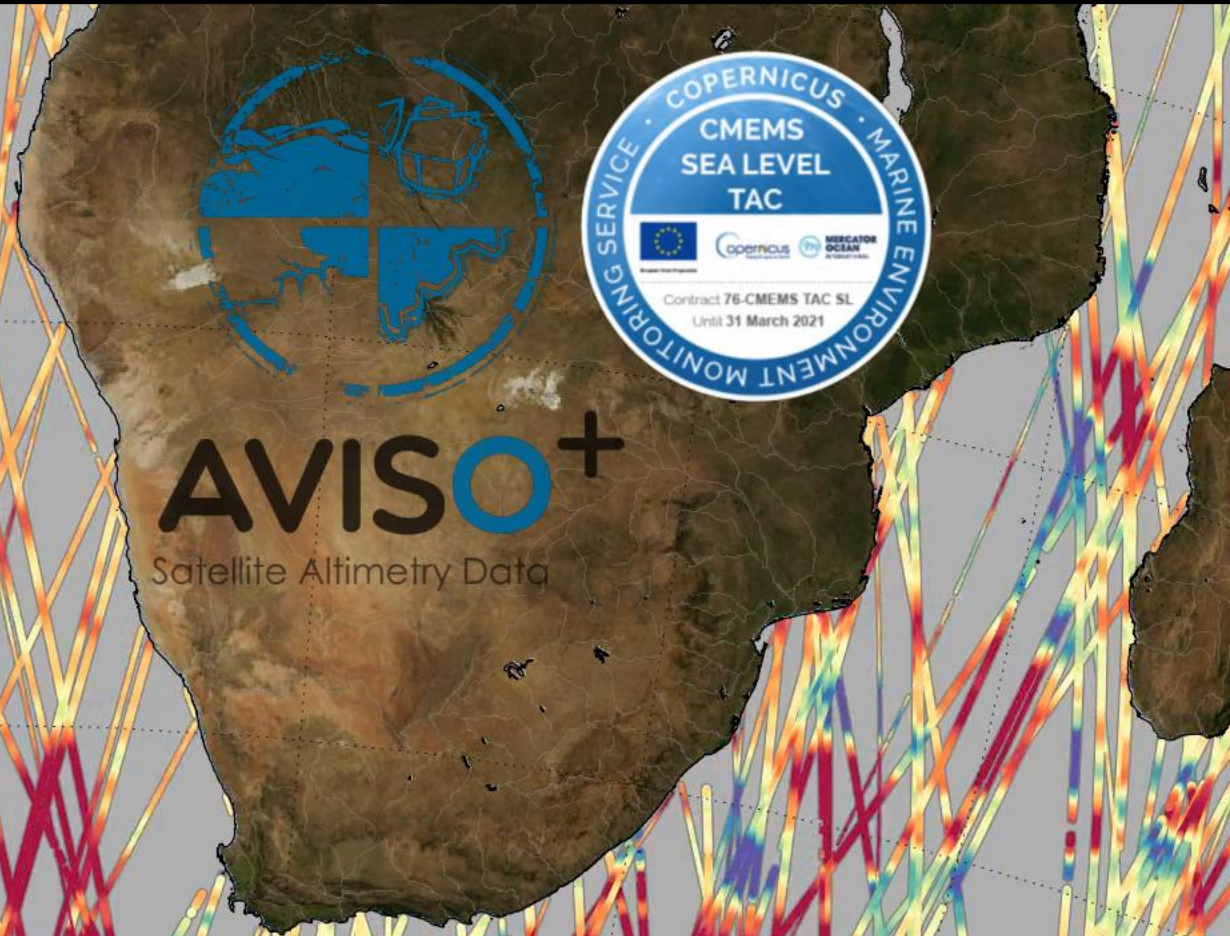


# Overview of Level-4 gridded products and operational outlook



M. Ballarotta & J. Wang  
with contribution from: C. Ubelmann, V. Bellemin-Laponnaz, F. Le Guillou, G. Meda, C. Anadon, A. Laloue, A. Delepouille, Y. Faugere, M.I. Pujol, R. Fablet, G. Dibarboure, S. Metref, E. Carli, R. Morrow .....

Sea Level Anomaly  
(All sat)

# Content

- Introduction & context
- First mapping experiment at global/regional scale with SWOT data
- Conclusions
- Future activities

Before April 2023, only simulations through **Observing System Simulation Experiments (OSSE)** have been conducted to study the **contribution of wide-swath systems (like SWOT)** to mapping systems

2015

2016

2017

2018

2019

2020

2021

2022

2023

Dynamic Interpolation of Sea Surface Height and Potential Applications for Future High-Resolution Altimetry Mapping

Clement Ubelmann, Patrice Klein, and Lee-Lueng Fu

Print Publication: 01 Jan 2015

DOI: <https://doi.org/10.1175/TECH-D-14-00152.1>

Page(s): 177–184

<https://doi.org/10.5194/gmd-16-1405-2018>  
© Author(s) 2018. This work is distributed under the Creative Commons Attribution 4.0 License.

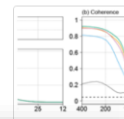
Research article | @

Article Peer review Metrics Related articles

16 Nov 2018

Contribution of future wide-swath altimetry missions to ocean analysis and forecasting

Antonio Bonaduce, Mounir Benkiran, Elisabeth Remy, Pierre Yves Le Traon, and Gilles Garric



Research Article | Free Access

An Observing System Simulation Experiment for Ocean State Estimation to Assess the Performance of the SWOT Mission: Part 1—A Twin Experiment

Zhijin Li, Jinbo Wang, Lee-Lueng Fu



Ocean Modelling  
Volume 135, March 2019, Pages 40-55

Quantifying wavelengths constrained by simulated SWOT observations in a submesoscale resolving ocean analysis/forecasting system

Joseph M. D'Addezio, Scott Smith, Gregg A. Jacobs, Robert W. Helber, Clark Rowley, Innocent Souopgui, Matthew J. Carrier

<https://doi.org/10.5194/gmd-16-2119-2023>

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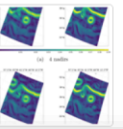
Article Assets Peer review Metrics Related articles

Development and technical paper | @

19 Apr 2023

4DVarNet-SSH: end-to-end learning of variational interpolation schemes for nadir and wide-swath satellite altimetry

Maxime Beauchamp, Quentin Febvre, Hugo Georgenthum, and Ronan Fablet



ORIGINAL RESEARCH article

Front. Mar. Sci. 22 July 2021

Sec. Ocean Observation

Volume 8 - 2021 | <https://doi.org/10.3389/fmars.2021.691955>

Assessing the Impact of the Assimilation of SWOT Observations in a Global High-Resolution Analysis and Forecasting System Part 1: Methods

Mounir Benkiran, Giovanni Ruggiero, Eric Grainer, Pierre-Yves Le Traon, Elisabeth Remy, Jean Michel Lelouche, Romain Bourdaille-Badie, Yann Drilet, Babette Tchouang

ORIGINAL RESEARCH article

Front. Mar. Sci. 26 August 2021

Sec. Ocean Observation

Volume 8 - 2021 | <https://doi.org/10.3389/fmars.2021.687414>

Assessing the Impact of the Assimilation of SWOT Observations in a Global High-Resolution Analysis and Forecasting System – Part 2: Results

Babette C. Tchouang, Mounir Benkiran, Pierre-Yves Le Traon

VOLUME 38 JOURNAL OF ATMOSPHERIC AND OCEANIC TECHNOLOGY APRIL 2021

Mapping Altimetry in the Forthcoming SWOT Era by Back-and-Forth Nudging a One-Layer Quasigeostrophic Model

FLORIAN LE GUILLOU, SAMMY METREF, EMMANUEL COSME, CLÉMENT UBELMANN, MAXIME BALLAROTTA, JULIEN LE SOMMER, AND JACQUES VERRON

Université Grenoble Alpes, CNRS, IRD, Grenoble INP, IGE, Grenoble, France  
Ocean Next, Grenoble, France  
Collecte Localisation Satellites, Ramonville-Saint-Agne, France

Research Article | Free Access

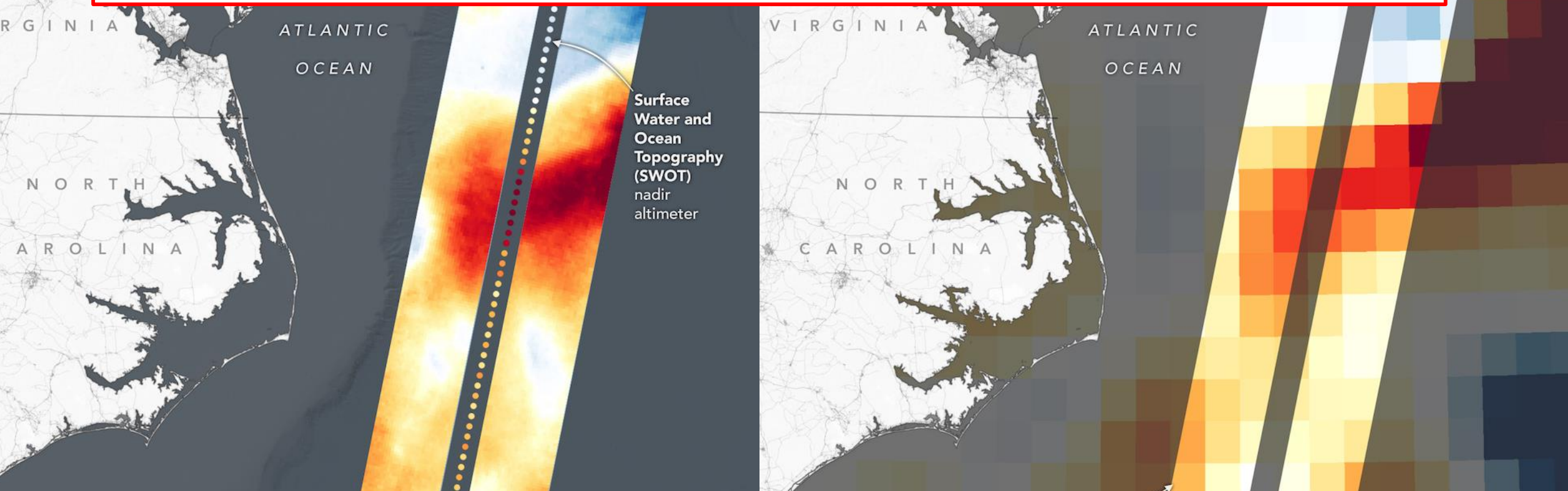
Reconstructing Fine-Scale Ocean Variability via Data Assimilation of the SWOT Pre-Launch In Situ Observing System

Matthew R. Archer, Zhijin Li, Jinbo Wang, Lee-Lueng Fu

On the Development of SWOT In Situ Calibration/Validation for Short-Wavelength Ocean Topography

Jinbo Wang, Lee-Lueng Fu, Bruce Haines, Matthias Lankhorst, Andrew J. Lucas, J. Thomas Farrar, Uwe Send, Christian Meinig, Oscar Schofield, Richard Ray, Matthew Archer, David Aragon, Sebastien Bigorre, Yi Chao, John Kerfoot, Robert Pinkel, David Sandwell, and Scott Stalin

Now, **REAL SWOT** product are available making it possible to design **Observing System Experiments (OSE)** to study the **contribution of wide-swath systems** to mapping systems

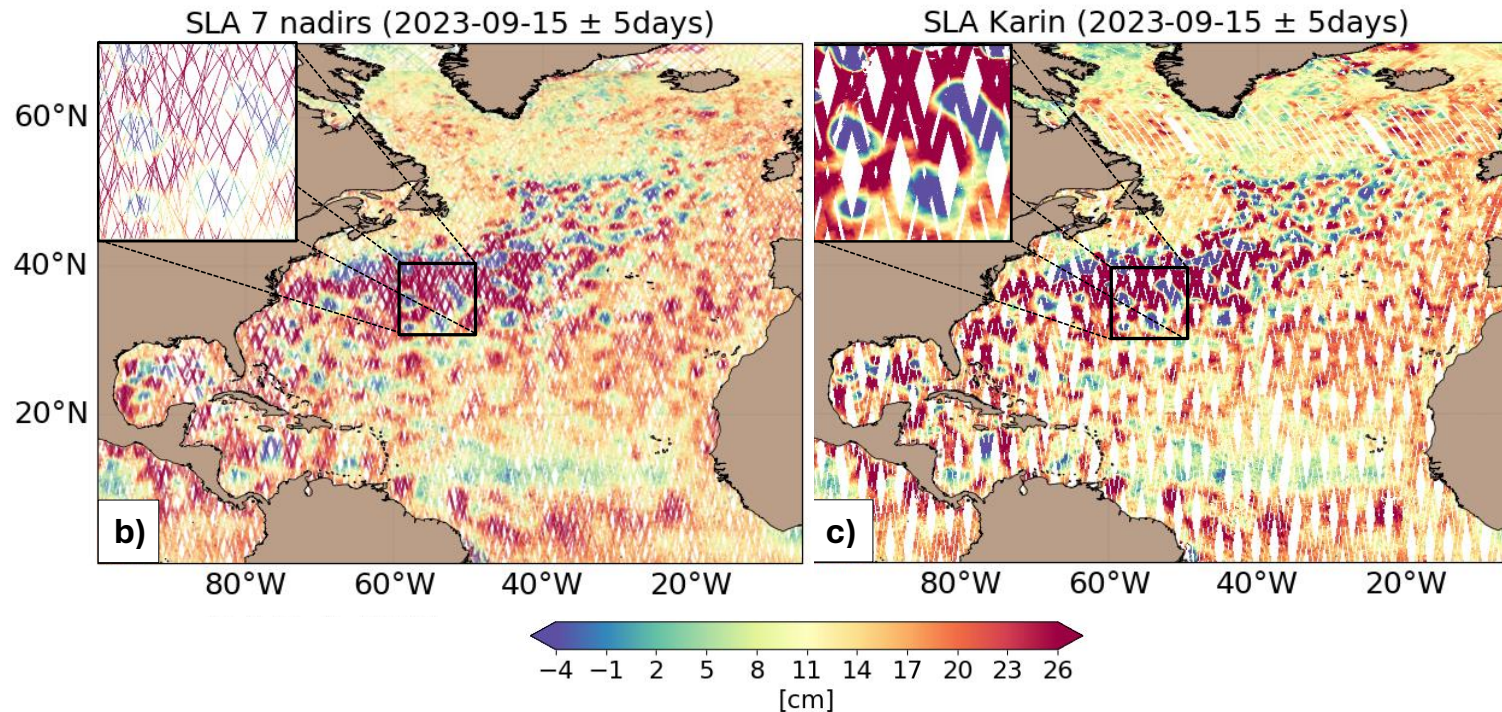


- => assess the impact of these new wide-swath data in the current global/regional mapping system through the use of Observing System Experiments (OSE)
- => in various context/application: DT/REP, NRT, Forecasting
- => investigate which mapping method is able to resolve finer oceanic scale

First mapping experiments at  
global/regional scale

# Input data:

Product type	Nadirs Sea-level anomaly Level 3 products	SWOT Sea-level anomaly Level 3 products
Product ref.	SEALEVEL_GLO_PHY_L3_NRT_008_044	SWOT_L3_SSH
Spatial coverage	[0°E:360°E] [90°S:90°N]	[0°E:360°E] [90°S:90°N]
Temporal coverage	From 2023-07-01 to 2023-12-01	From 2023-07-27 to 2023-11-30



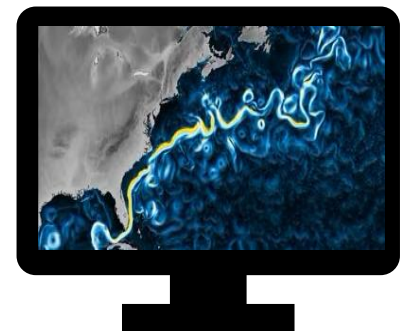
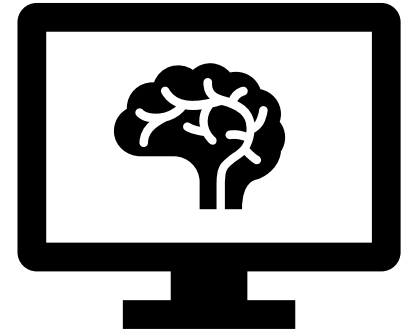
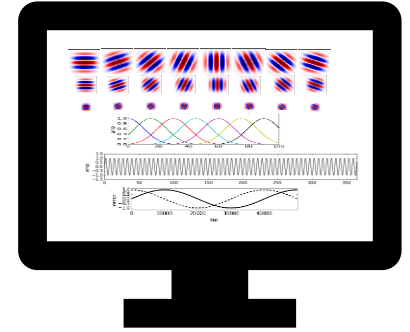
**2 Experiments** were carried out: 1) using **nadir only**, 2) using **nadir and SWOT**

## Three mapping methods are tested:

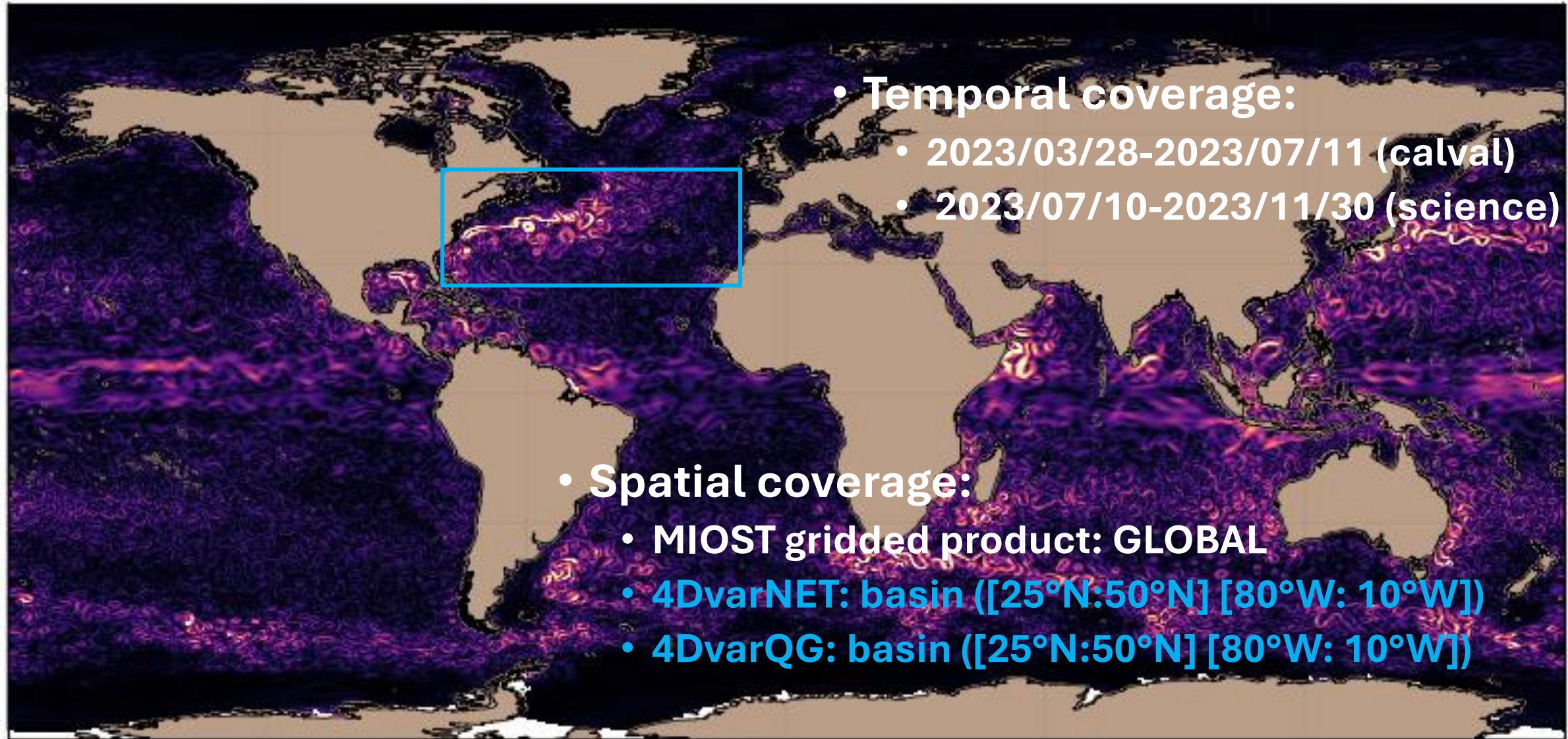
**MIOST (Ubelmann et al., 2021):** a method accounting for various modes of variability of the ocean surface topography (e.g., geostrophic, barotrope, equatorial waves dynamic ...) by constructing several independent components within an assumed covariance model.

**4DvarNET (Fablet et al., 2021):** a data-driven approach combining a data assimilation scheme associated with a deep learning framework. This neural network framework involves the joint training of the representation of the ocean dynamic, as well as of the solver of the data assimilation problem.

**4DvarQG (Le Guillou et al., 2021) :** a 4-Dimensional variational (4DVAR) scheme with a Quasi-Geostrophic (QG) model



# Experimental Products



- **Temporal coverage:**

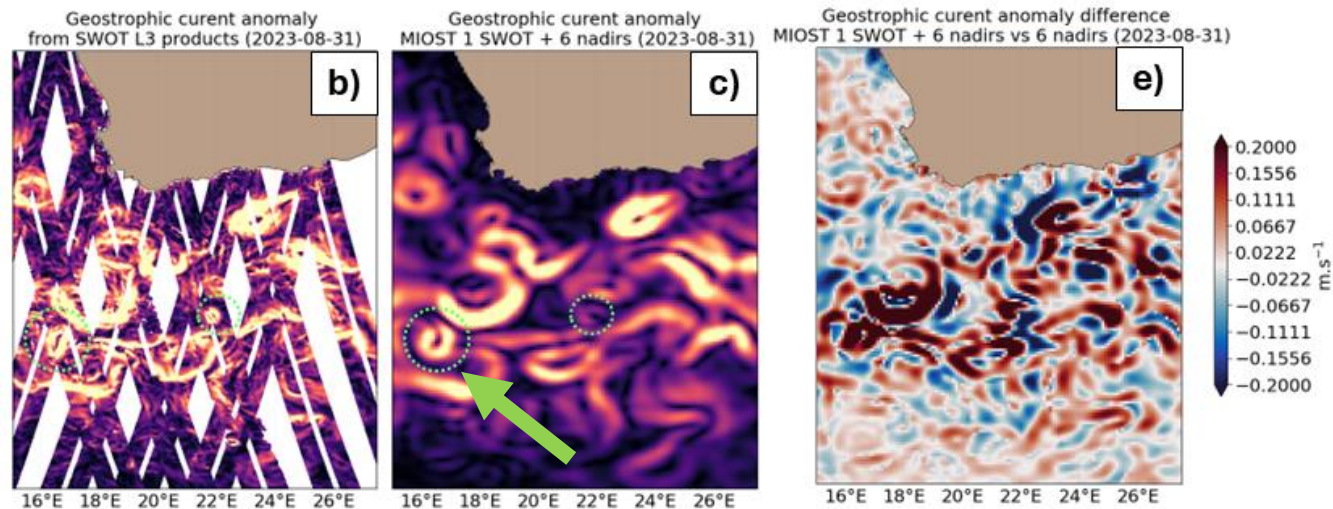
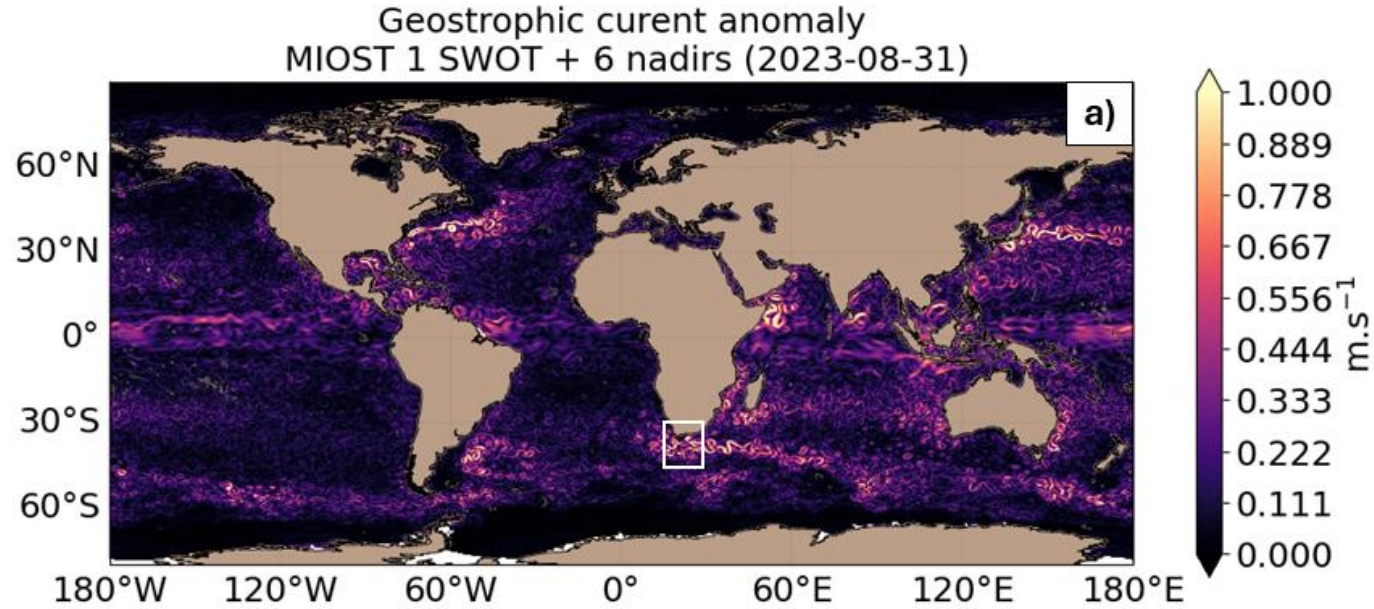
- 2023/03/28-2023/07/11 (calval)
- 2023/07/10-2023/11/30 (science)

- **Spatial coverage:**

- MIOST gridded product: GLOBAL
- 4DvarNET: basin ([25°N:50°N] [80°W: 10°W])
- 4DvarQG: basin ([25°N:50°N] [80°W: 10°W])



# Wide swath altimetry enables better positioning of oceanic structures (eddies, fronts, etc...)



## Validation metrics:

One altimeter (SARAL/Altika) is excluded from the mapping to assess the mapping error. We focus here on the effective resolution metric, which is given by the wavelength  $\lambda_s$  where the Signal to Noise Ratio  $SNR(\lambda_s)$  is 2, i.e., the wavelength where the  $SSH_{\text{error}}$  is two times lower than the signal  $SSH_{\text{alongtrack}}$

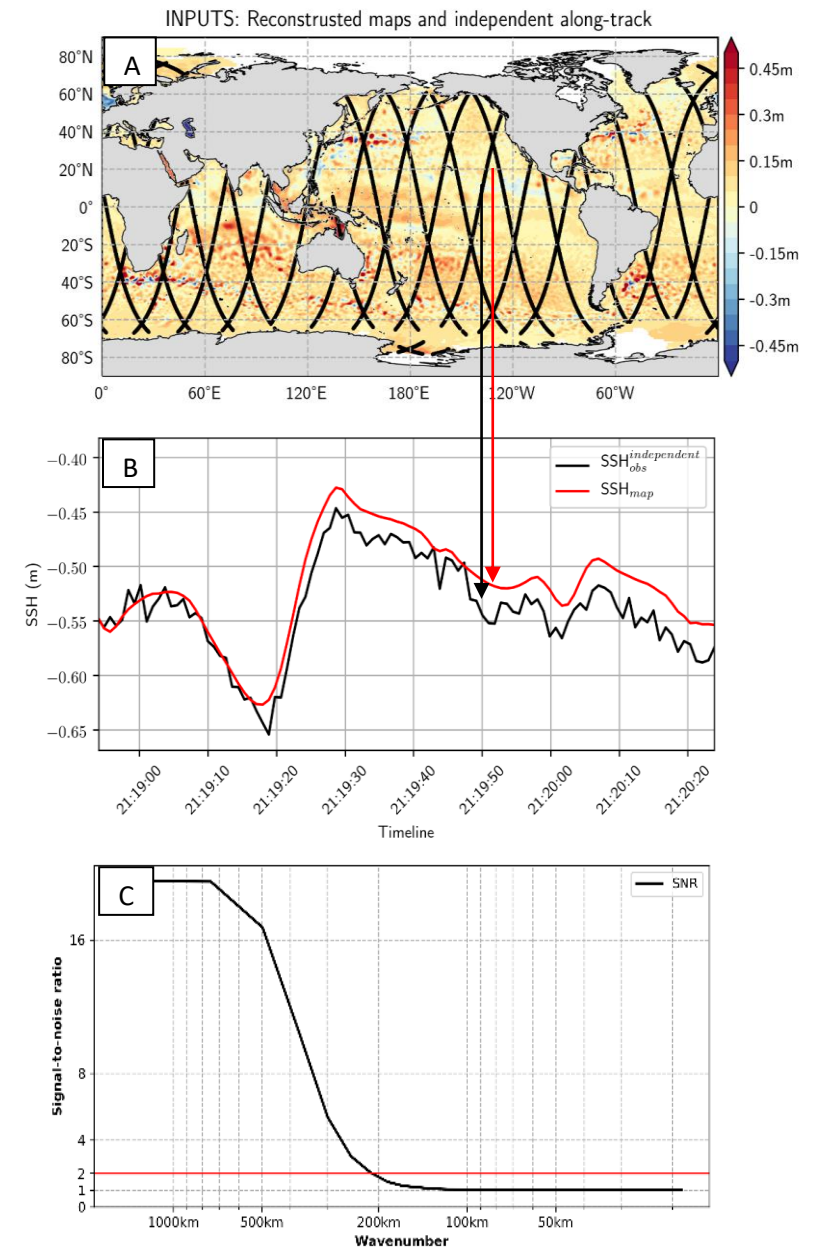
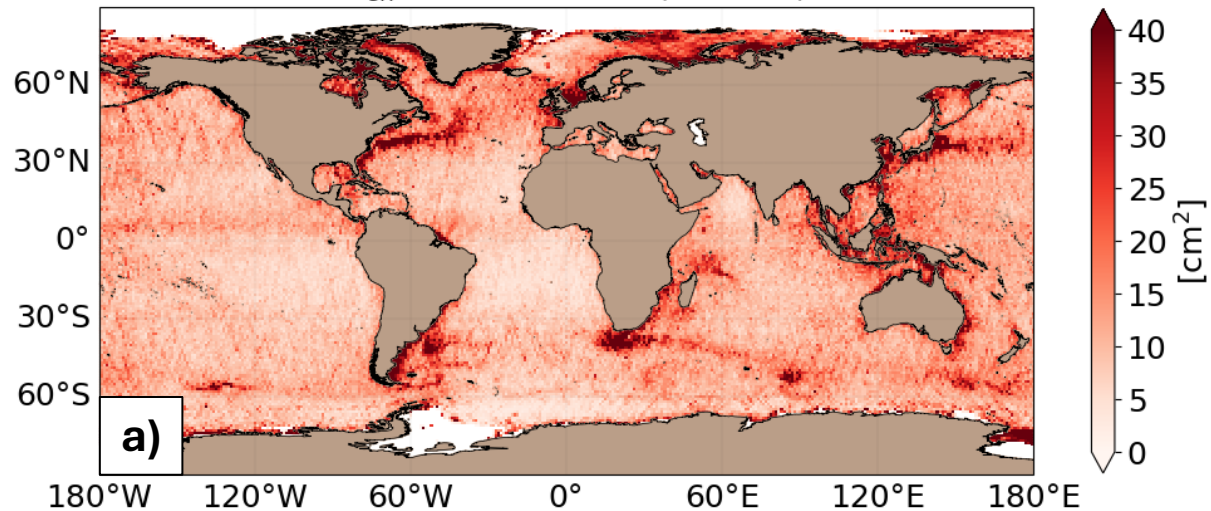


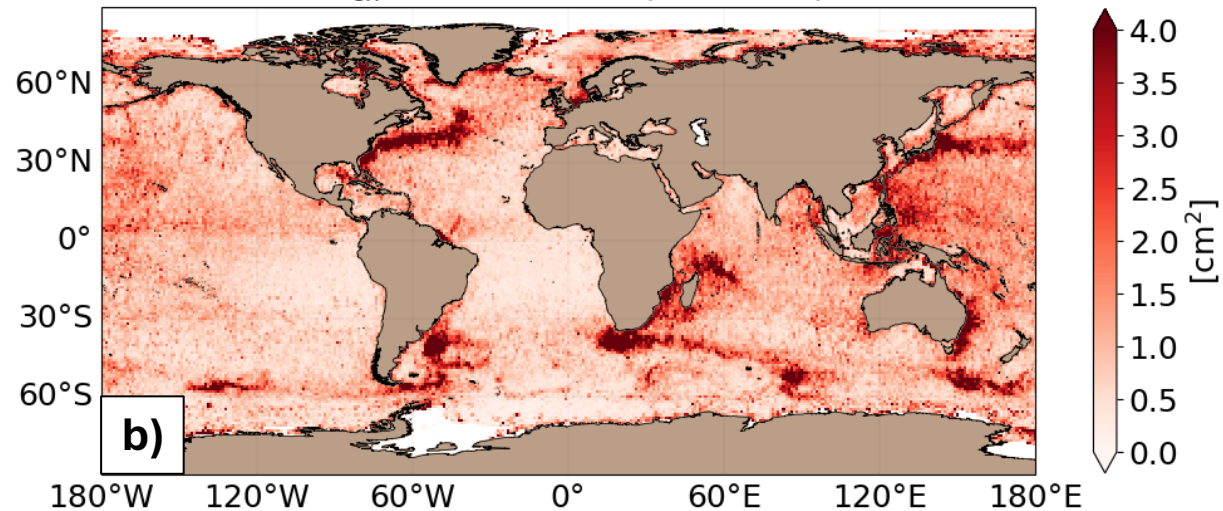
Fig.: Example of spectral analysis: A) inputs SSH gridded and along-track fields, B) colocation gridded SSH and along-track SSH; and C) Signal-to-Noise ratio

Error variance reduction in energetic currents (Gulfstream, ACC, Kuroshio...) when integrating SWOT into a 6 nadirs altimeter constellation (~15% error reduction in high variability, 10% error reduction in low variability region)

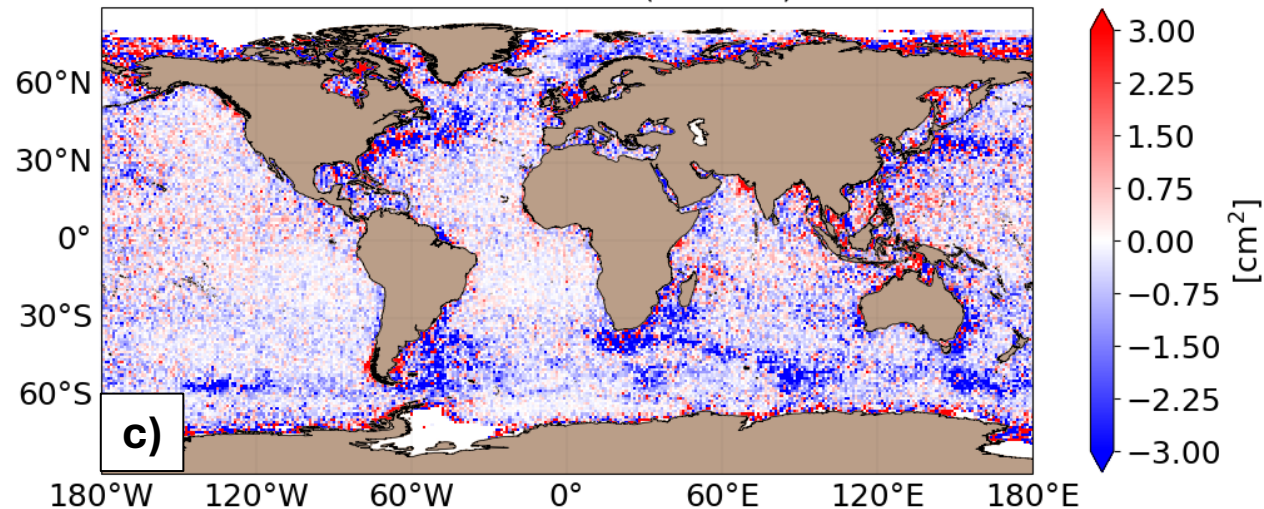
$\Delta\sigma_{err}$  MIOST 6 nadirs (all scale)



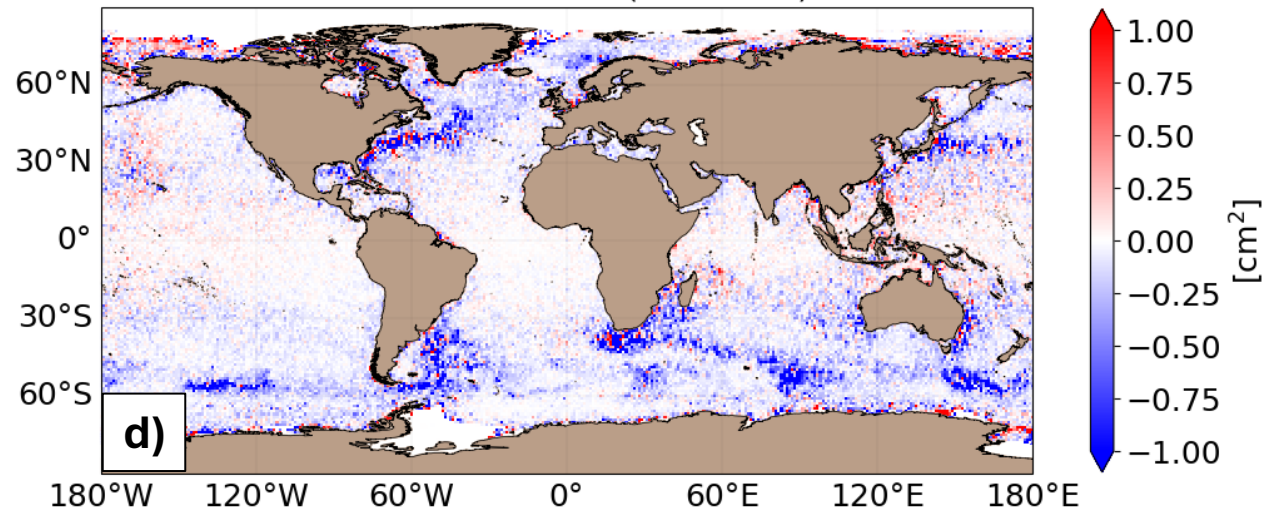
$\Delta\sigma_{err}$  MIOST 6 nadirs (65-200km)



$\Delta\sigma_{err}$  MIOST 1 SWOT + 6 nadirs vs MIOST 6 nadirs (all scale)



$\Delta\sigma_{err}$  MIOST 1 SWOT + 6 nadirs vs MIOST 6 nadirs (65-200km)



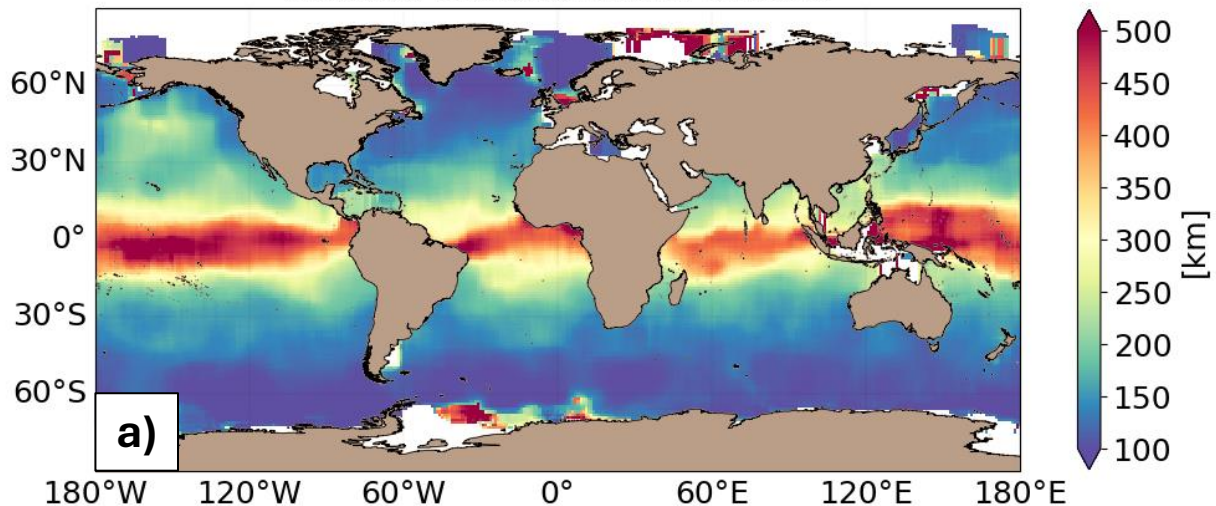
Improved mapping with SWOT



degrade mapping with SWOT

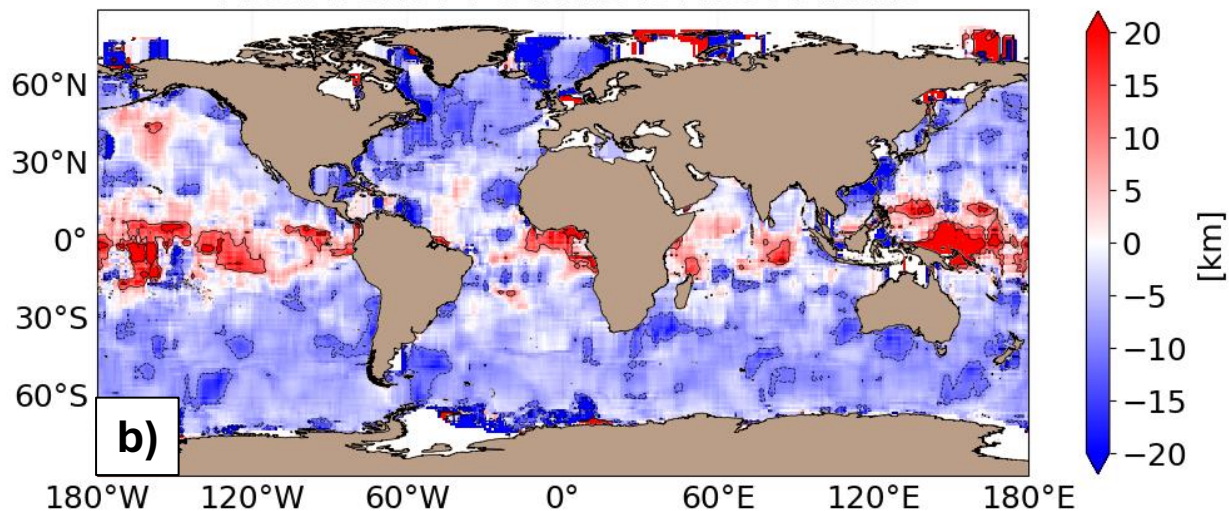
Gain in effective resolution when integrating SWOT into a 6 nadirs altimeter constellation: overall good benefit of SWOT (**finer resolution ~5-10km, 20km locally**) except in regions characterized by specific atmospheric and oceanic conditions, such as tropical rainfall, wet troposphere, as well as areas affected by storm tracks or internal tides.

Effective resolution MIOST 6 nadirs

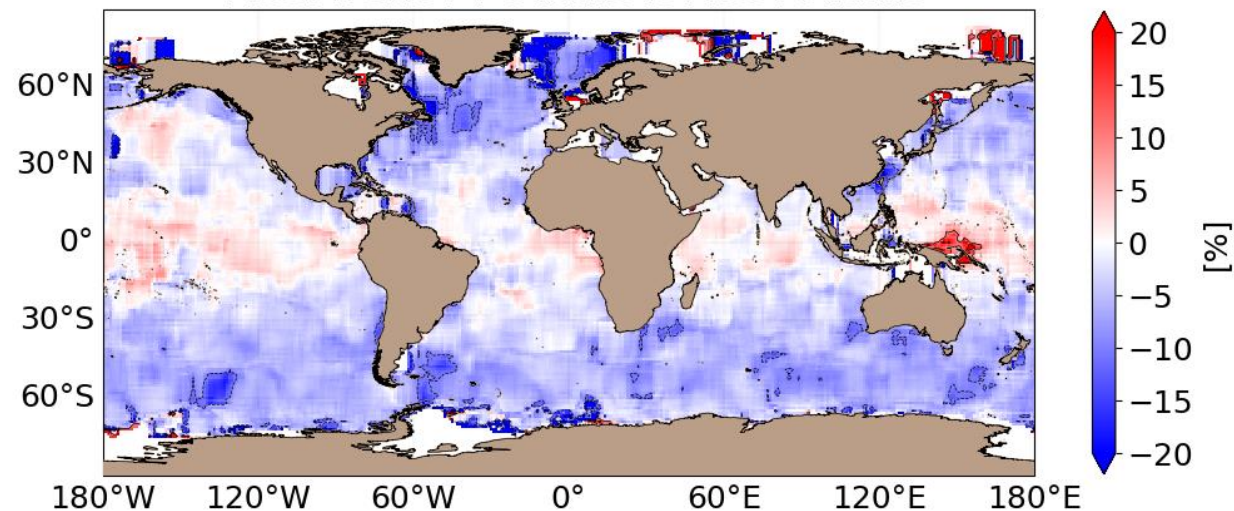


**Wide swath altimetry**  
enables **finer** resolution in  
maps

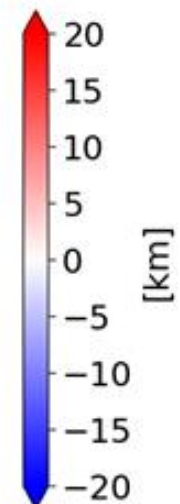
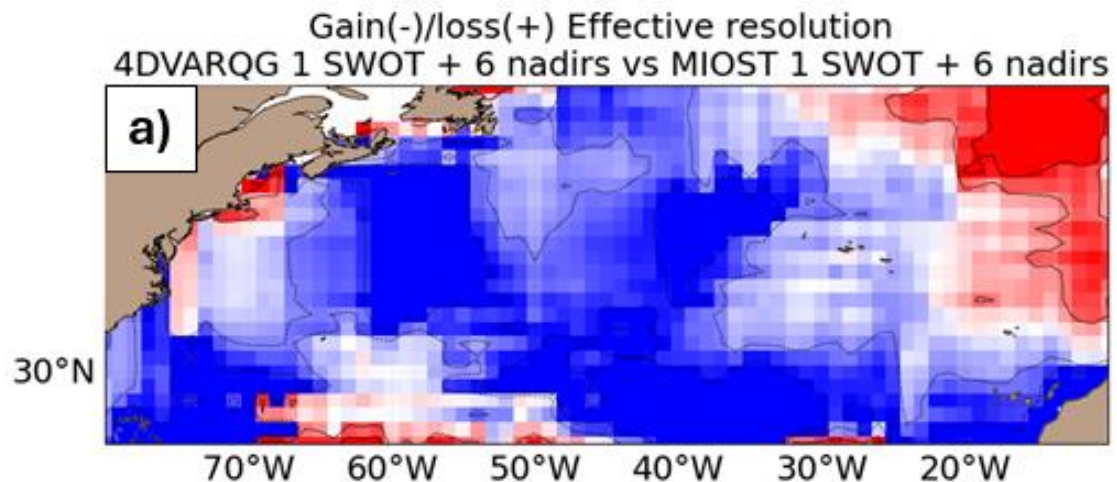
Gain(-)/loss(+) Effective resolution  
MIOST 1 SWOT + 6 nadirs vs MIOST 6 nadirs



Gain(-)/loss(+) Effective resolution  
MIOST 1 SWOT + 6 nadirs vs MIOST 6 nadirs



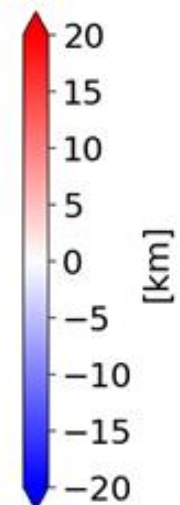
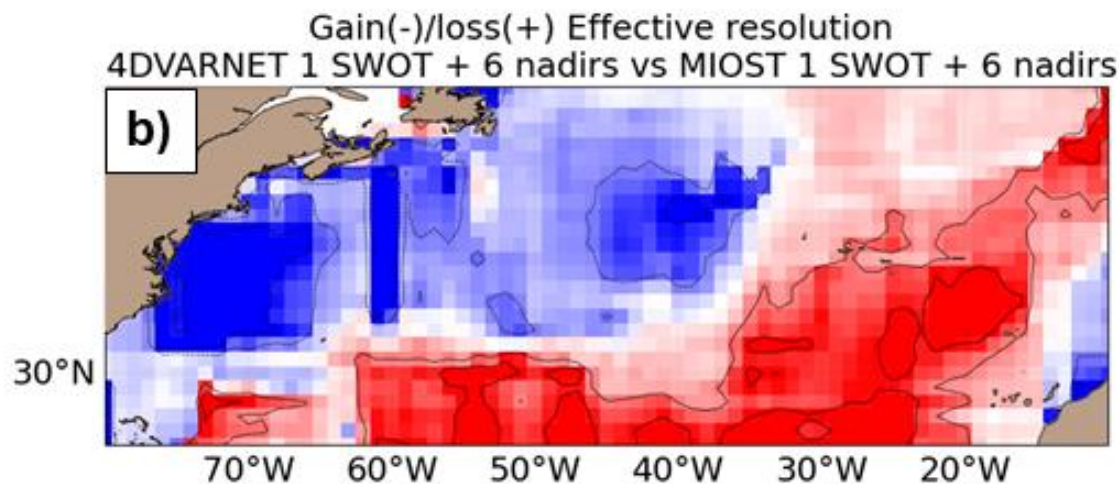
# Dynamical & Data-driven mapping approaches enable finer resolution



**Finer** resolution in 4DvarQG than in MIOST products



**Coarser** resolution in 4DvarQG than in MIOST products



**Finer** resolution in 4DvarNET than in MIOST products



**Coarser** resolution in 4DvarNET than in MIOST products

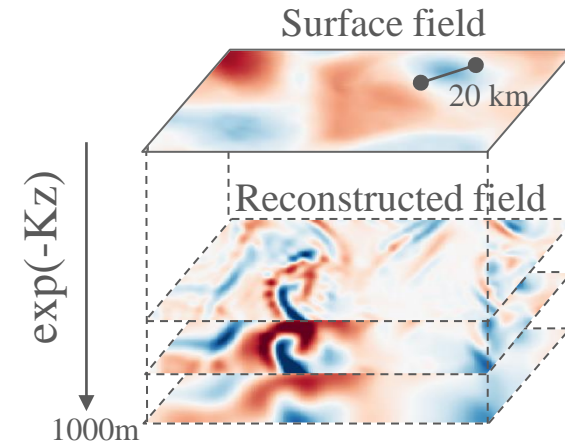
# Regional studies/applications: E. Carli et al.

Reconstruction of **3D balanced motions from 2D surface fields** projection at depth

- Mesoscale and large submesoscale structures (>20 km)
- Coherent structures along the water column

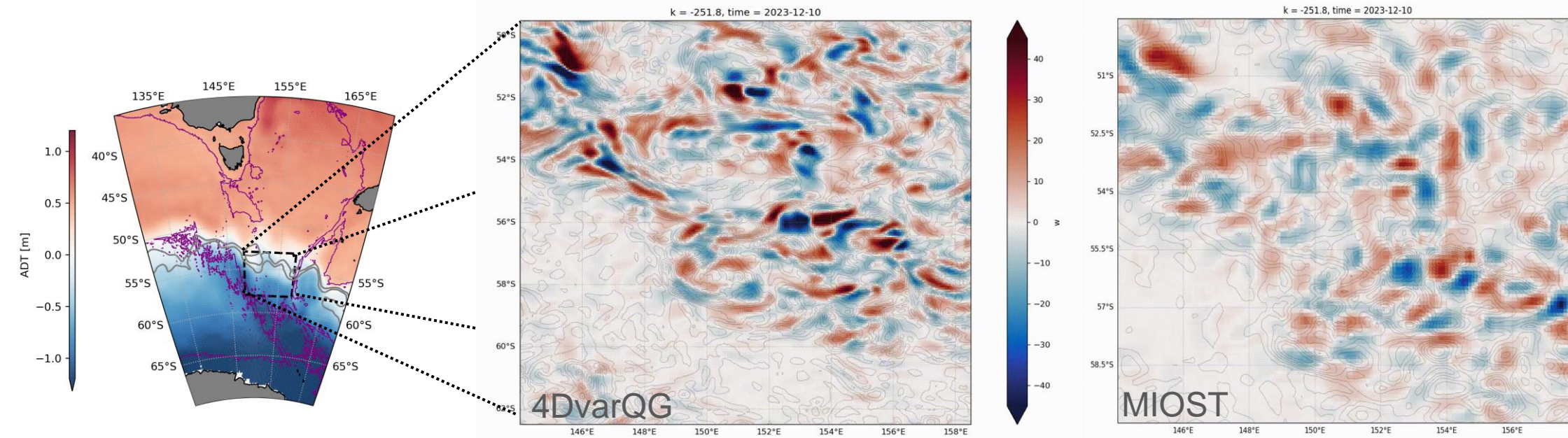
## ASSUMPTIONS

- Exponential decay of the reconstructed fields
- Constant vertical stratification
- Conservation of potential vorticity in the domain
- Horizontal boundaries: double periodic domain
- Vertical boundaries: semi-infinite domain



Klein and Lapeyre (2006)  
Klein et al. (2009)  
Lapeyre (2017)

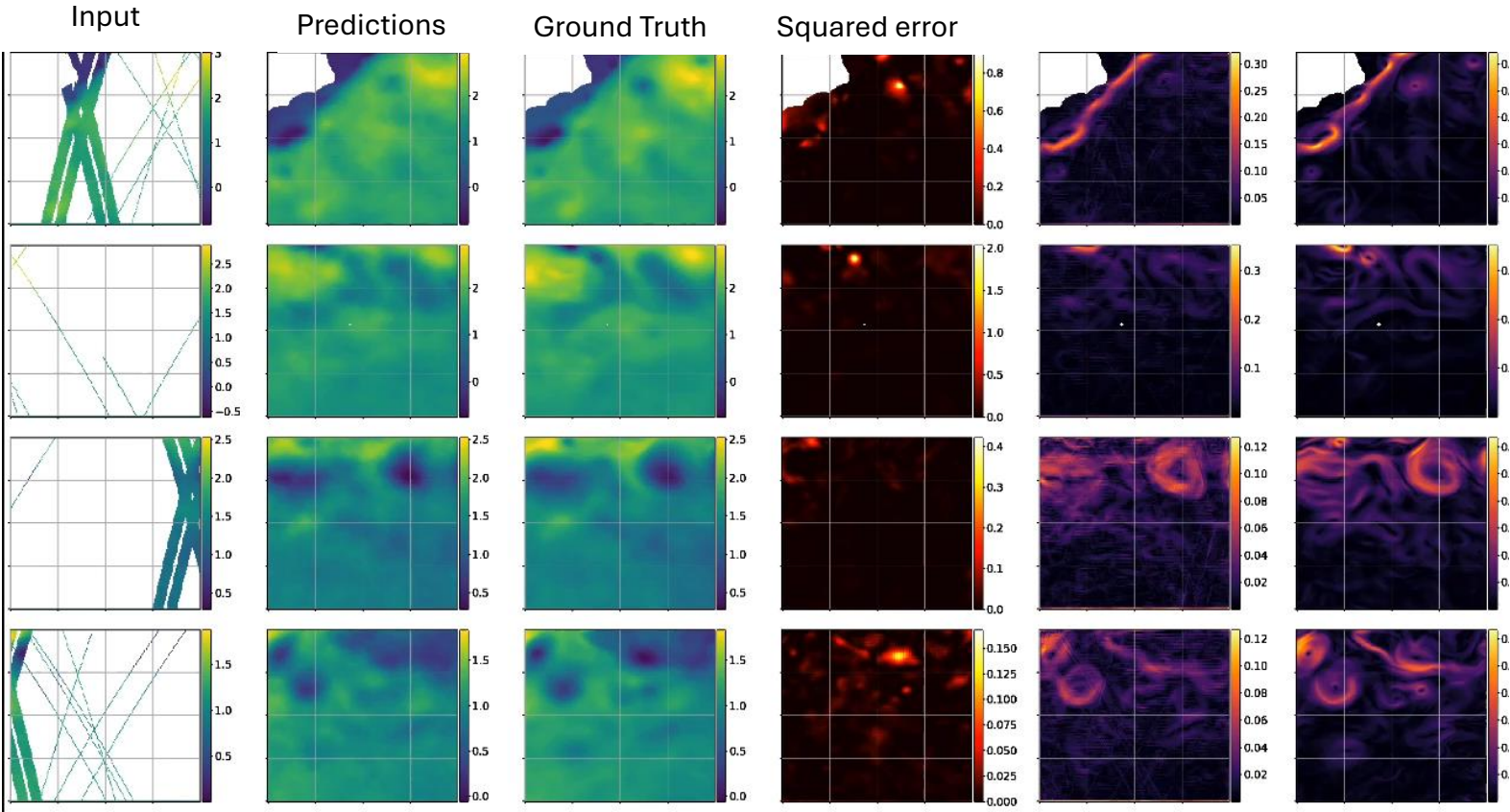
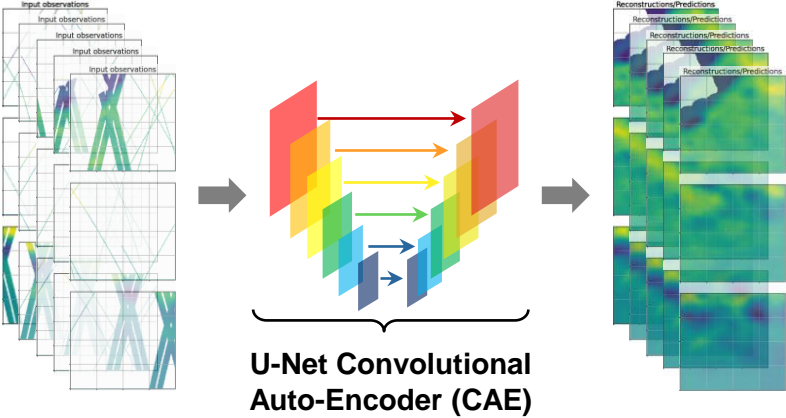
**Vertical velocity  $w$  [m/d] @250m with surface strain rate contours is sensitive to the 2D surface fields used to project the solution**



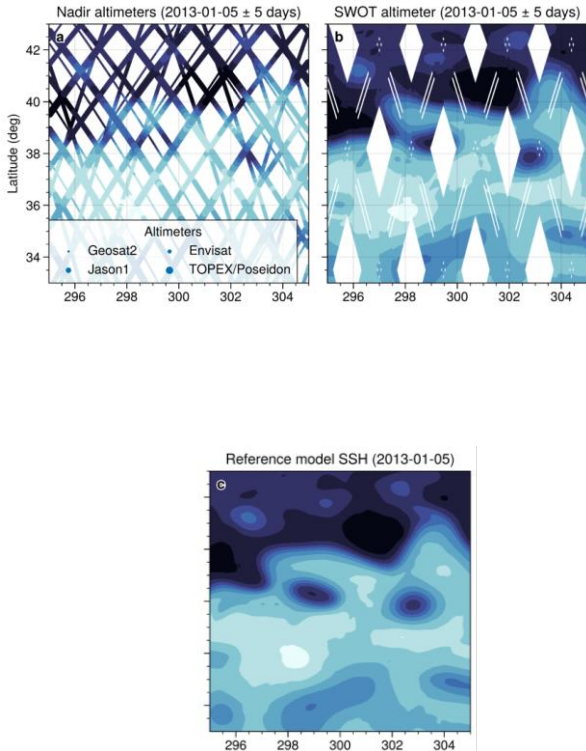
# AI-based ultra-resolution satellite data assimilation – working progress

Edwin Goh, Alice Yepremyan, Jinbo Wang, Brian Wilson  
 Jet Propulsion Laboratory

- Based on `2023_SSH_mapping_train_eNATL60_test_NATL60`
- Convolutional Autoencoder (CAE)
- Data: NATL60 high-res ocean simulation (1/20° grid spacing). Consists of SWOT + 4 Nadir.
  - Training: Jan 2, 2013 → Sep 30, 2013
    - Train for 400 epochs
  - Testing: Oct 22, 2012 → Dec 2, 2012



# Data availability



The **SWOT\_L3\_SSH** product, derived from the L2 SWOT KaRIn low-rate ocean data products (NASA/JPL and CNES), is produced and made freely available by AVISO and DUACS teams as part of the DESMOS Science Team project. AVISO/DUACS, 2023. <https://doi.org/10.24400/527896/A01-2023.018>. The **Near-Real-Time (NRT) Level-3** altimeter satellite **along-track data** are distributed by the EU Copernicus Marine Service (product reference SEALEVEL\_GLO\_PHY\_L3\_NRT\_008\_044, Pujol et al., 2023).

The experimental gridded products (MIOST, 4DvarNET & 4DvarQG) computed with nadirs and wide swath (v0.3) altimetry are also made available on the **AVISO+ portal**. <https://www.aviso.altimetry.fr/en/data/products/sea-surface-height-products/global/experimental-multimission-gridded-l4-sea-level-heights-and-velocities-with-swot.html>

**A collaborative data-challenge** focusing on the integration of SWOT data into mapping systems is currently under construction:

[https://github.com/ocean-data-challenges/2024\\_DC\\_SSH\\_mapping\\_SWOT\\_OSE](https://github.com/ocean-data-challenges/2024_DC_SSH_mapping_SWOT_OSE)

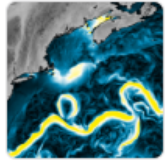


# Conclusions

- SWOT data are available since April 2023 and can now be integrated into mapping systems
- Various mapping algo to test: data-driven, dynamical mapping, classical statistical linear mapping (OI) ....
- First results on the impact of Karin the current L4 product : mapping error reduced by 10-15%, finer resolution (up to 20km locally)
- Data-driven & dynamic resolved finer scale than OI
- Products available on AVISO+
- **Don't hesitate to give us feedbacks on these experimental products**  
(=> [aviso-swot@altimetry.fr](mailto:aviso-swot@altimetry.fr))

# Future work & Operational outlook

- **Further validations, understand what happen in the equatorial & north pacific regions**
- **Increase collaboration (e.g., regional data-challenge over Californian/Mediterranean Xover)**
- **Release of L4 product based on the v1.0 L3 Karin SSH product**
  - ⇒ period from 2023-07-27 to 2024-05-01
- **MIOST Mapping Algorithm Solution:**
  - Planned as the reference mapping algorithm for upcoming CMEMS Level-4 (L4) altimeter product reprocessing DT24.
  - Will also be used for near-real-time (NRT) L4 products.
  - MIOST L4 product, incorporating Karin data, planned to be distributed through CMEMS from mid-2025.
- **4DvarNET Solution:**
  - Shows good performance for regional products.
  - Requires further refinement for global application before CMEMS integration.
- **4DvarQG Solution:**
  - Good for regional scale applications.
  - Development efforts in progress to extend to a global scale.
- **Exploration of Other Mapping Techniques:**
  - Deep learning approach by Martin et al. (2024) has shown high efficiency in resolving small oceanic features.
  - A global map solution has been successfully processed using SSH only and combined SSH+SST data.
  - Others ?



# Ocean Data Challenges

Hosting collaborative data challenges related to oceanography.

29 followers <http://ocean-data-challenges.github.io>

Unfollow

**MORE INFO: <https://github.com/ocean-data-challenges>**

README.md



## The available data challenges are:

### Level 3 SWOT processing

- 2024-DC SWOT denoising OSE By Datlas, CLS and IMEDEA A challenge CNES on removing the uncorrelated KaRIN instrumental noise from the SWOT data.
- 2022-DC SWOT error calibration Gulf Stream By Datlas, CLS, IMT-Atlantique and MEOM A challenge on the SWOT satellite spatially correlated error calibration in the Gulf Stream region.
- 2022-DC SWOT karin error filtering North Atlantic By Datlas and CLS A challenge on the SWOT Karin instrumental error filtering in the North-Atlantic basin.

### Level 4 SSH processing

- 2024-DC 4DMedSea ESA mapping OSE By Datlas and CLS A challenge ESA - 4DMedSea project to provide SSH products in the Mediterranean for 4D reconstructions.
- 2023-DC global altimetry mapping OSE By Datlas and CLS A challenge on real conventional nadir mapping at global scales and in regional zooms.
- 2023-DC SSH HF mapping in California OSSE By Datlas and MEOM A challenge on mapping high frequency SSH with artificial SWOT and nadir data in the Californian SWOT Xover.

View as: Public

You are viewing the README and pinned repositories as a public user.

Get started with tasks that most successful organizations complete.

### Discussions

Set up discussions to engage with your community!

[Turn on discussions](#)

### People



Invite someone

### Top languages

Jupyter Notebook Python

## MORE INFO:

Working group on the topic of “open science, data, and algorithm.”

See Github page

The screenshot shows the GitHub profile page for the organization 'SWOT-community'. At the top, there is a navigation bar with a search bar and icons for repository management. Below the navigation bar, the organization's profile is displayed, including a blue circular logo, the name 'SWOT Community', and a bio: 'This is a code space for the global SWOT mission community. We share experience, code, research and much more. Our mission is to increase the value of SWOT.' A red URL 'https://github.com/SWOT-community' is overlaid on the profile. To the right of the profile is a 'Follow' button. Below the profile, there is a 'Pinned' section showing a repository named '.github' with the description 'Introduction'. Below that is a 'Repositories' section with a search bar and filters for 'Type', 'Language', and 'Sort'. Two repositories are listed: 'CNES-AVISO' (Public, Jupyter Notebook, 12 stars, BSD-3-Clause license, 2 forks, 0 issues, updated 3 days ago) and 'SWOT-galleries' (Public, Build Sphinx galleries from SWOT Community projects, 0 stars, Apache-2.0 license, 0 forks, 0 issues, updated 4 days ago). On the right side of the page, there is a 'View as: Member' dropdown menu, a note about viewing the README and pinned repositories as a member, a link to create a README file, and a section for 'Top discussions this past month' featuring a discussion titled 'open science working group project ideas' with 1 upvote and 0 comments. At the bottom, there is a 'People' section.

SWOT-community

Search: Type to search

Overview Repositories 6 Discussions Projects 1 Packages Teams 8 People 31

# https://github.com/SWOT-community

**SWOT Community**  
This is a code space for the global SWOT mission community. We share experience, code, research and much more. Our mission is to increase the value of SWOT.

Follow

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Introduction

Repositories

Find a repository... Type Language Sort New

**CNES-AVISO** Public  
Jupyter Notebook ☆ 12 BSD-3-Clause 2 0 0 Updated 3 days ago

**SWOT-galleries** Public  
Build Sphinx galleries from SWOT Community projects  
☆ 0 Apache-2.0 0 0 0 Updated 4 days ago

View as: Member

You are viewing the README and pinned repositories as a member of the SWOT Community organization.

You can create a README file visible only to members of the organization.

Top discussions this past month

open science working group project ideas  
↑ 1 ↓ 0

View all discussions

People

THANK YOU



# Conclusions

