

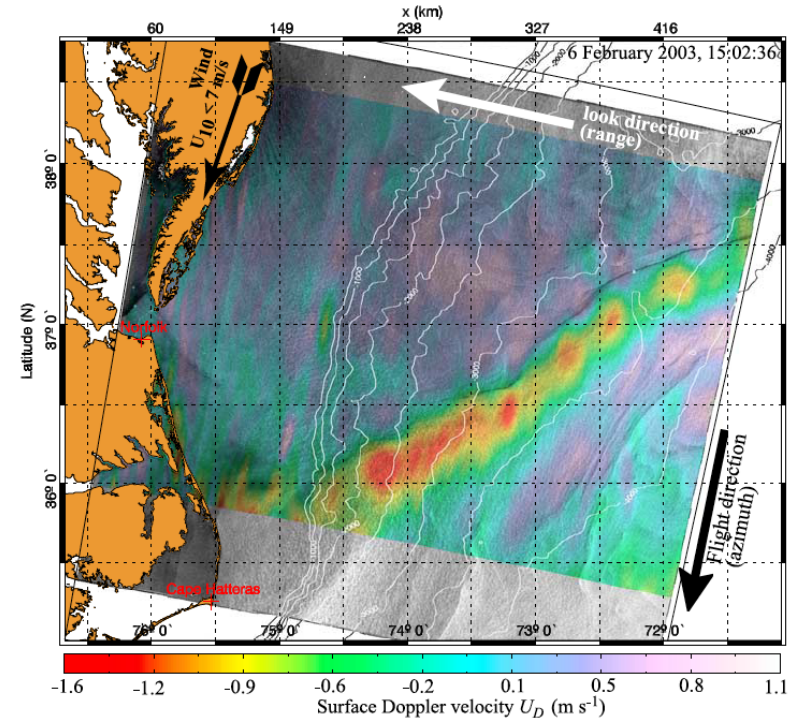
# Reconstruction of ocean velocities from the synergy between existing SSH and SST measurements

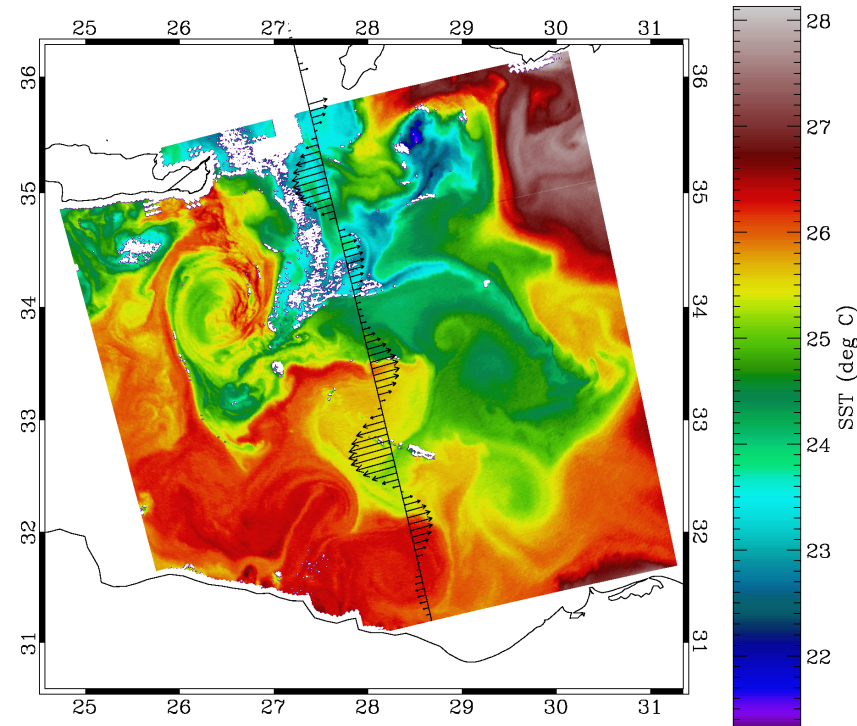
J. Isern-Fontanet

Institut Català de Ciències del Clima, Barcelona, Catalonia

# Motivation

- Radar technology has proven to be extremely useful for the estimation of ocean currents
  - Radar altimeters are key part of the Global Ocean Observing System
  - New methods have been developed to retrieve currents from SAR
- New types of radar are being developed: SWOT and Wavemil.
- Then, why should we try to reconstruct ocean velocities from SST observations?
  - Long time-series are available  $\Rightarrow$  important for climate studies.
  - Low cost and sustainable  $\Rightarrow$  based on well known technologies.
  - Existence of many dedicated instruments  $\Rightarrow$  AVHRR, MODIS, AATSR, SEVIRI, AMSR, TMI, VIIRS, SLSTR
  - **Complementary to existing radar measurements**  $\Rightarrow$  synergy between SST and radar measurements can improve the retrieval of ocean velocities.





- Current **SST** and **SSH** observations are synergetic:
  - **MW/IR radiometers (SST)** provide information about the location and geometry of ocean structures but it is difficult to recover velocities.
  - **Altimeters (SSH)** provide information about ocean velocities but it is difficult to recover the location and geometry of ocean structures.
- Objective: exploit such synergy for the retrieval of 3D ocean currents from present and past satellites to improve operational services and get insight on Earth climate

# SST and SSH within the eSQG framework

Within the eSQG approach proposed by Lapeyre and Klein (JPO 2006) **SSH and SST contain the same information** and both can be used to reconstruct 3D ocean dynamics (Isern-Fontanet et al. JGR 2008):

**SST ( $T_s$ )**

$$\hat{\psi}(\vec{k}, z) = \frac{g\alpha'}{\rho_0 f_0 n_e} \frac{\hat{T}_s(\vec{k})}{k} \exp(n_0 k z) \quad (1)$$

$$\hat{b}(\vec{k}, z) = -\frac{g\alpha'}{\rho_0} \hat{T}_s(\vec{k}) \exp(n_0 k z) \quad (3)$$

**SSH ( $\eta$ )**

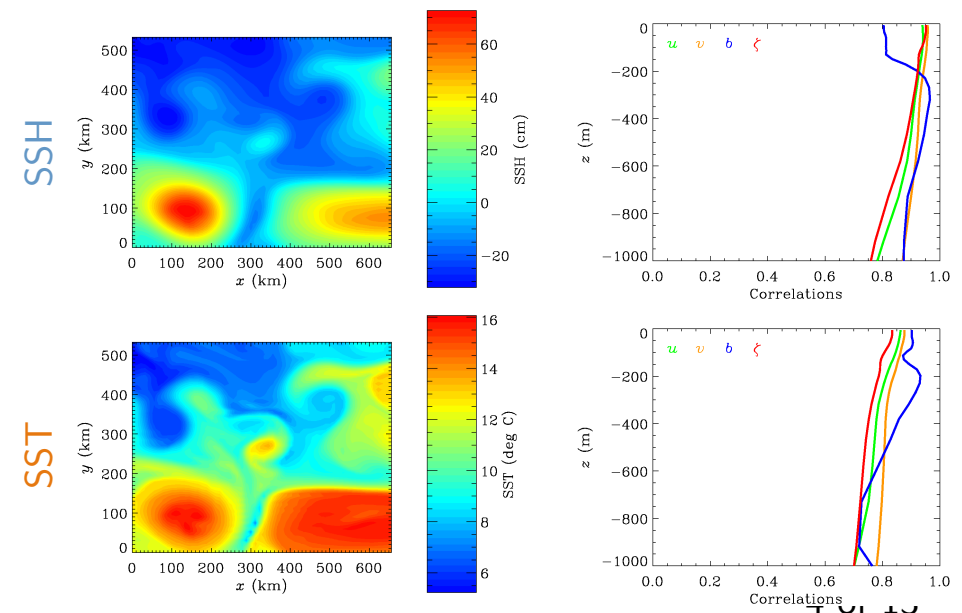
$$\hat{\psi}(\vec{k}, z) = \frac{g}{f_0} \hat{\eta}(\vec{k}) \exp(n_0 k z) \quad (2)$$

$$\hat{b}(\vec{k}, z) = g n_e k \hat{\eta}(\vec{k}) \exp(n_0 k z) \quad (4)$$

- Within eSQG **SSH** and **SST** are related by:

$$\hat{\eta}(\vec{k}) \propto k^{-1} \hat{T}_s(\vec{k}) \quad (5)$$

- Numerical simulations unveiled the key role of the ML in the reconstruction from **SST**
  - **SST** has to be a proxy of density anomaly below the ML  $\Rightarrow$  deep ML.

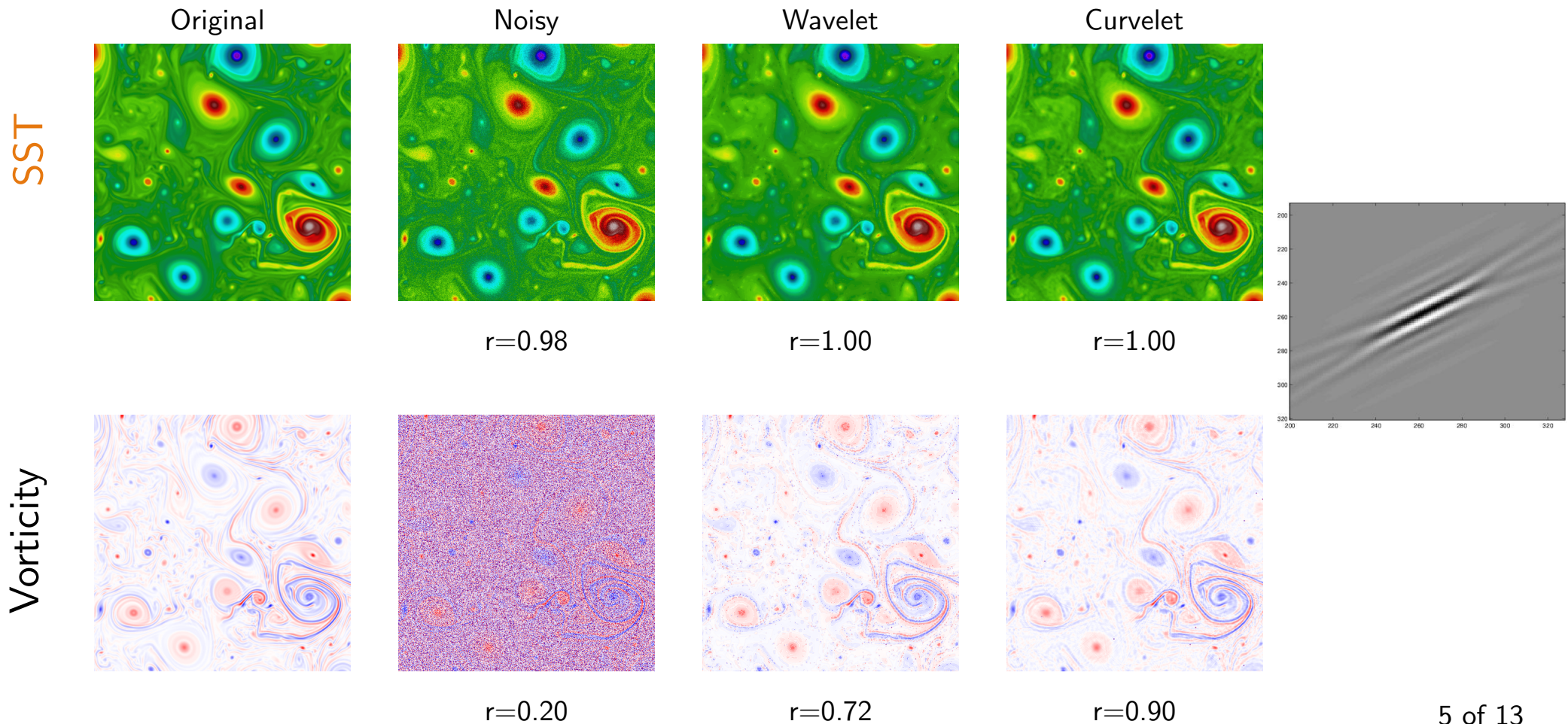




# Flow reconstruction from real SST observations

Flow reconstruction from real SST requires a careful preprocessing if high spatial resolutions are required

- We have adapted image denoising techniques used in fields such as Astronomy: **wavelet and curvelet denoising**
- We tested these methods adding noise to simulated SST fields ( $\sigma_{\delta T}=0.05$  K):

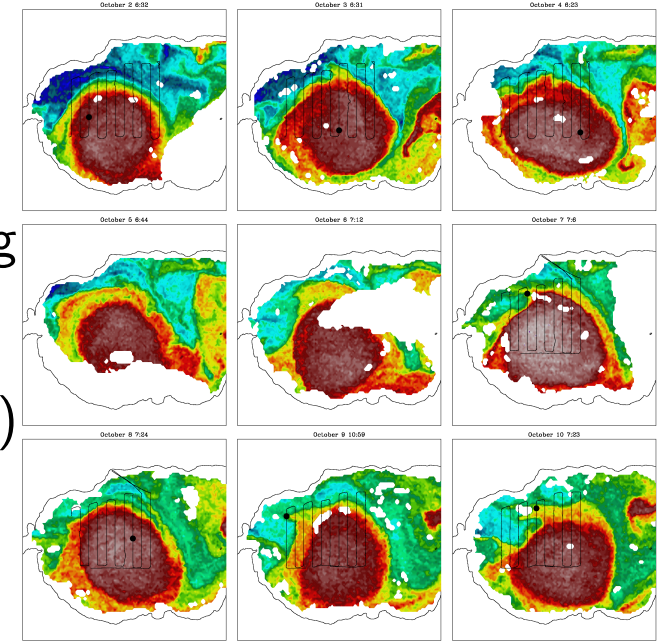


# Validation with in situ measurements: The OMEGA cruise

The eSQG approach has been validated against measurements done during the OMEGA cruise: ADCP and SeaSoar

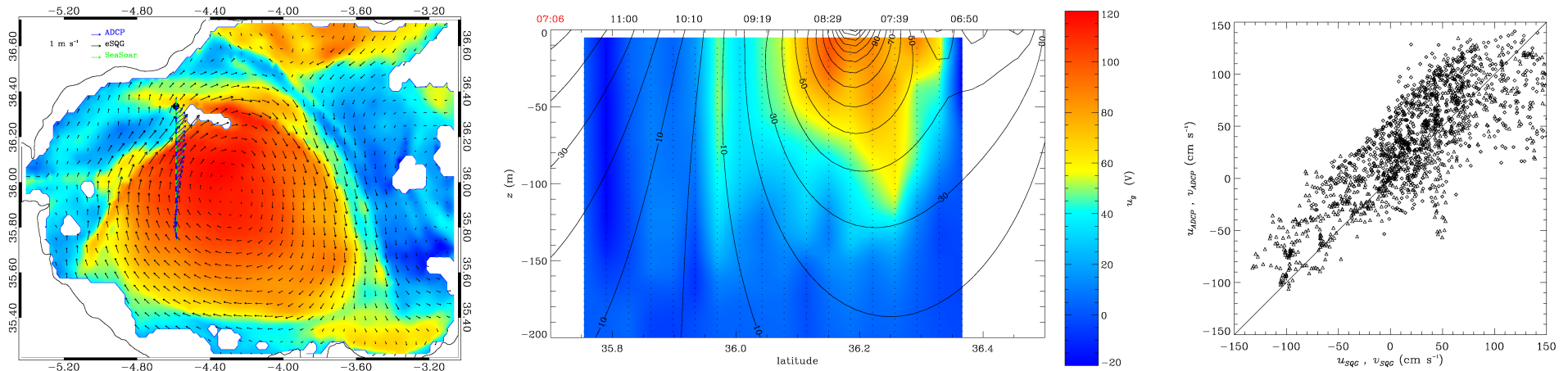
- 3D velocities have been estimated from AVHRR BT using

$$\hat{\psi}(\vec{k}, z) = \frac{g\alpha'}{\rho_0 f_0} \frac{\hat{T}_B(\vec{k})}{n_e k} \exp(n_0 k z) \quad (6)$$



$n_e$  and  $n_0$  were adjusted to observations.

- Velocities derived for each image were then interpolated in time and space to ship measurements.



- Good correlation between in situ and satellite derived velocities:  $r \sim 0.88$

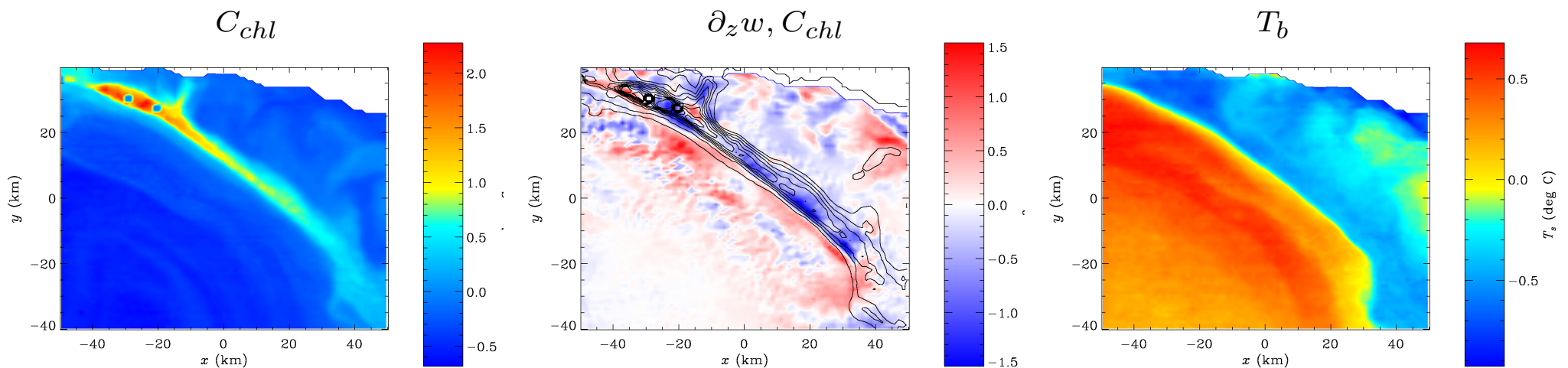
# Reconstruction of vertical velocities

Using the buoyancy equation it is possible to find an equation for vertical velocities within the eSQG approach (Lapeyre and Klein JPO 2006):

$$\hat{w}(\vec{k}, z) = \frac{1}{n_e} \left[ J(\widehat{\psi_s}, b_s) \exp(n_0 k z) + J(\widehat{\psi}, b) \right] \quad (7)$$

where  $\psi(\vec{x}, z)$  and  $b(\vec{x}, z)$  are derived from SST and/or SSH.

- We have successfully tested this approach using SST and SSH from high resolution numerical simulations of forced geophysical turbulence (Klein et al. GRL 2009).
- We have used this approach to retrieve  $\partial_z w$  from MODIS SST observations and we have compared them to chlorophyll patterns for very simple situations:



- We are looking for nice in situ experiments to quantitatively validate this approach!

## The heuristic approach

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- The eSQG approach gives good results for the reconstruction of the 3D ocean dynamics from satellite **SST**
- However, the reconstruction can be still improved if we exploit the synergy between **SST** and **SSH**
- As a first step, we introduce a transfer function  $F_T(k)$  such that

$$\hat{\psi}_s(\vec{k}) = g f_0^{-1} F_T(k) \hat{T}_s(\vec{k}) \quad (8)$$

Notice that eSQG  $\Rightarrow F_T(k) \propto k^{-1}$

- Our approach is to determine the transfer function  $F_T(k)$  from observations

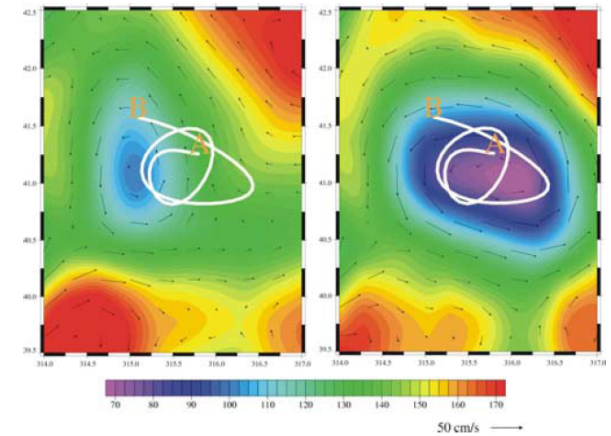
$$F_T(k) = \frac{|\hat{\eta}|(k)}{|\hat{T}_s|(k)} \quad (9)$$

**Rule of thumb:** take the phase from **SST** and the spectrum from **SSH**



# Initial validation of the heuristic approach

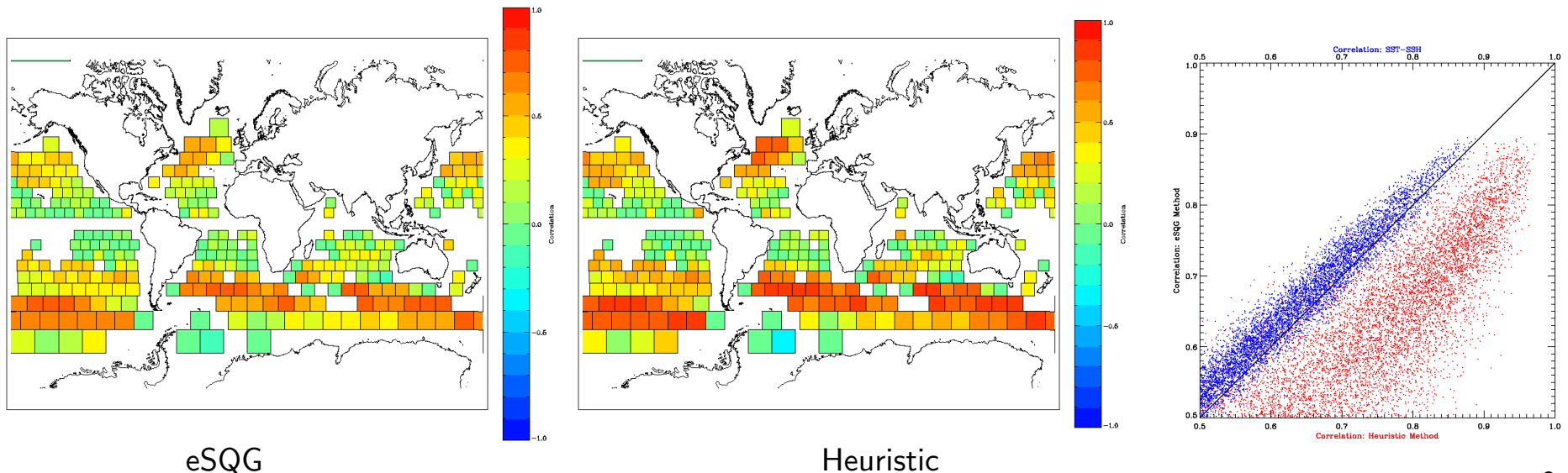
- As in Isern-Fontanet et al. GRL 2006, we validate it using microwave SST observations and altimetric maps
  - L3 AMSR-E SST maps (REMSS)
  - 4-altimeter MADT (AVISO) for 2002-2005
- The flow has been reconstructed from SST using 3 different transfer functions for wavelengths:  $100 \text{ km} \leq \lambda \leq 400 \text{ km}$ .



Pascual et al GRL 2006

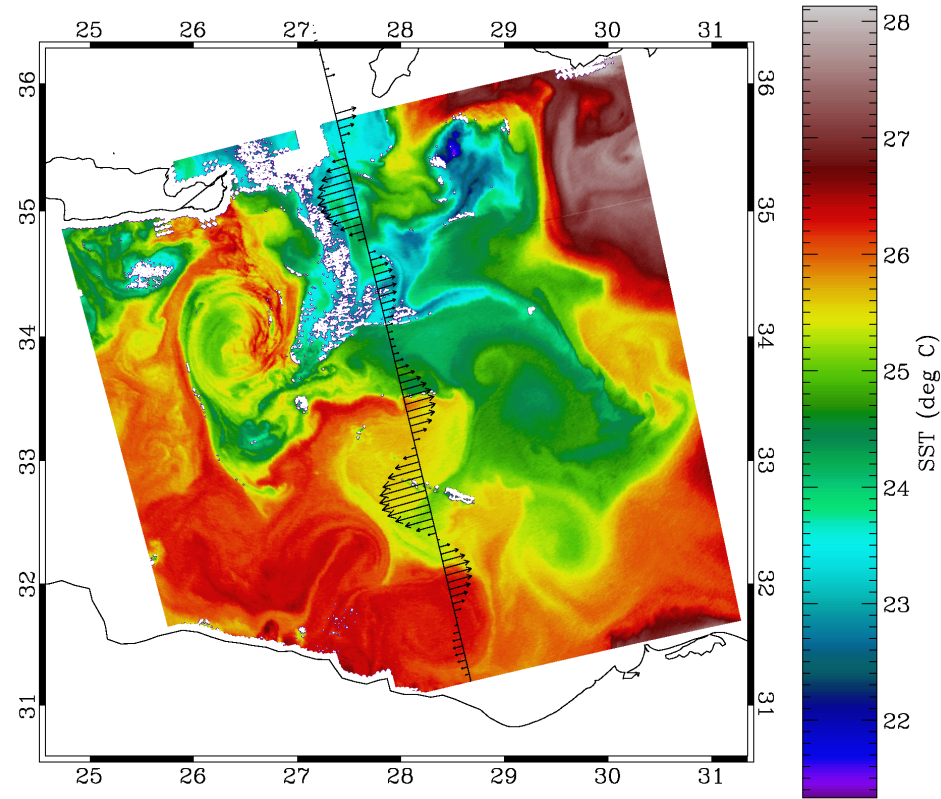
$$F_c(k) \propto 1, \quad F_{sqq} \propto k^{-1} \quad \text{and} \quad F_T(k) = \frac{|\hat{\eta}|(k)}{|\hat{T}_s|(k)} \quad (10)$$

- Comparison of the correlation between the reconstructed stream-function and SSH:



C. González-Haro PhD Thesis

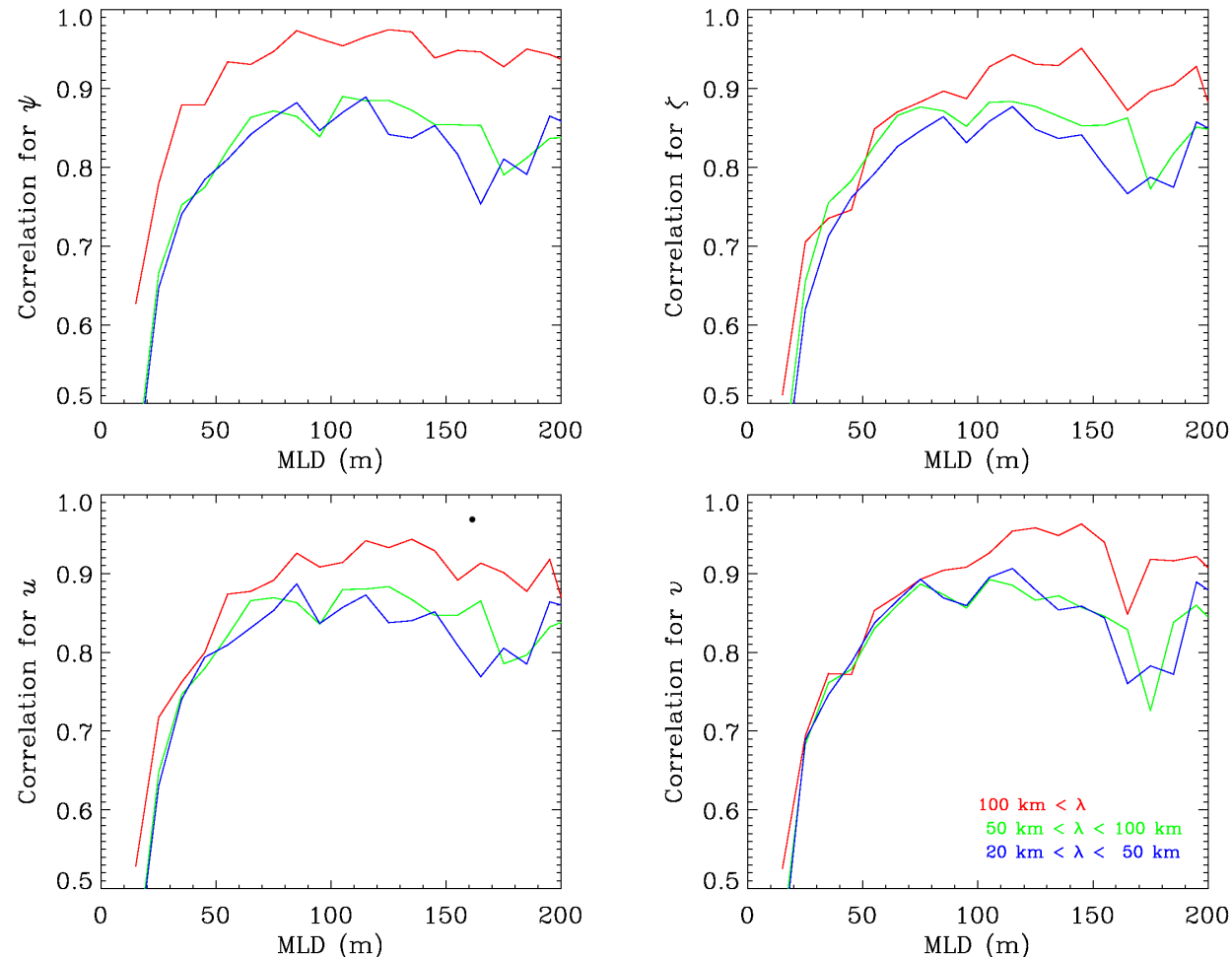




- We are currently adapting this approach to Envisat observations: one IR radiometer and one simultaneous and collocated altimeter
  - SST and BT data from AATSR for the period 2002-2011
  - We clip the stream-function derived from SST to altimetric measurements
- However, the structures present in SST/BT may have a phase shift to respect the 'true' stream-function  $\Rightarrow$  we need to identify when our approach can be directly applied.

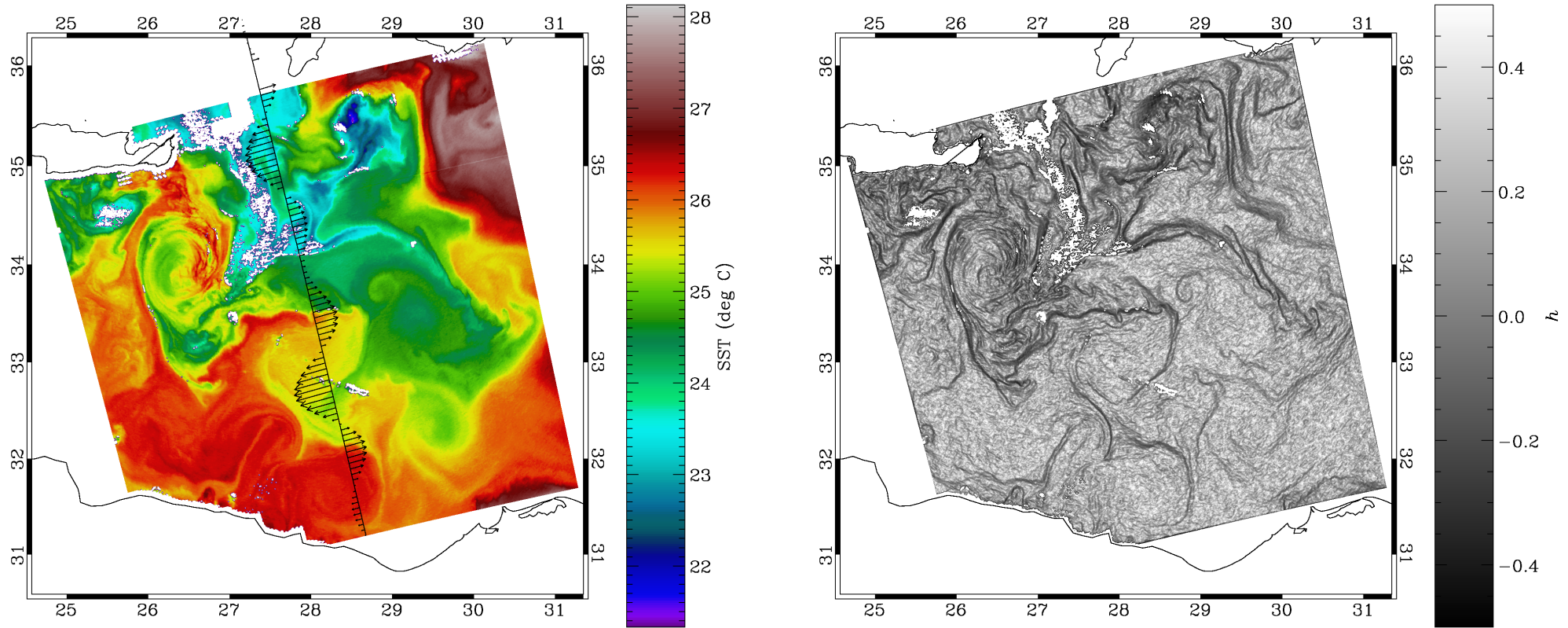
# Importance of the ML depth for the reconstruction

To explore the conditions under which our heuristic approach is valid we have analyzed realistic numerical simulations of the Mediterranean sea.



- Best results are obtained for  $\text{MLD} > 70 \text{ m}$ .
- Complements the study done in Isern-Fontanet et al. JGR 2008.

# Identification of image characteristics



- We are investigating metrics for cataloguing existing SST data
  - The objective is to quickly find images that match predefined dynamical criteria.
- Most of the effort is been done in the **characterization of structures in SST images**.
  - We use **singularity analysis** tools developed to characterize natural images.
  - In collaboration with A. Turiel ( $\Rightarrow$  Parallel Session 5-1 at 14:15.)

- Using the eSQG approximation, the high resolution 3D velocity field can be reconstructed from a single SST or SSH snapshot.
- The methodology required to apply this approach to real high resolution SST images is mature.
- Existing radiometers provide information about the relative position of ocean structures while existing radar altimeters provide information about the energy at each scale
  - The exploitation such synergy improves the reconstruction of velocities.
- Best reconstruction results are obtained for deep MLD.
- Requirements  $\Rightarrow$  improve the access to high resolution BT and SST
  - It took several months to download ATS\_TOA\_1P and ATS\_NR\_2P products!