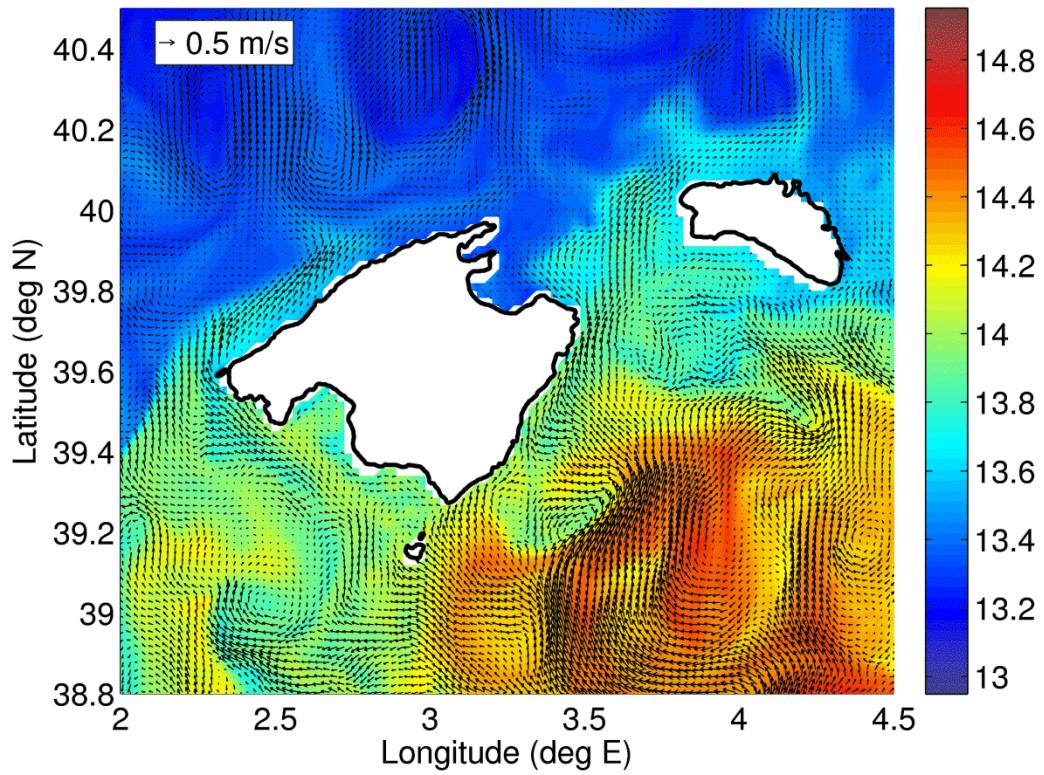


# Predicción oceánica: el nuevo papel de los planeadores submarinos



WMOP ocean forecast  
valid for 13-Mar-2014 00:00:00 [lead time of 0h]  
Surface temperature (deg C) and currents



## Baptiste Mourre



Balearic Islands  
Coastal Observing  
and Forecasting  
System



# Outline



## **1) Introduction**

Ocean prediction models, underwater gliders  
and data assimilation.

## **2) Impact of glider fleet data assimilation in the Ligurian Sea**

## **3) Glider adaptive sampling**

Concept and glider mission planning.

At-sea experiment.

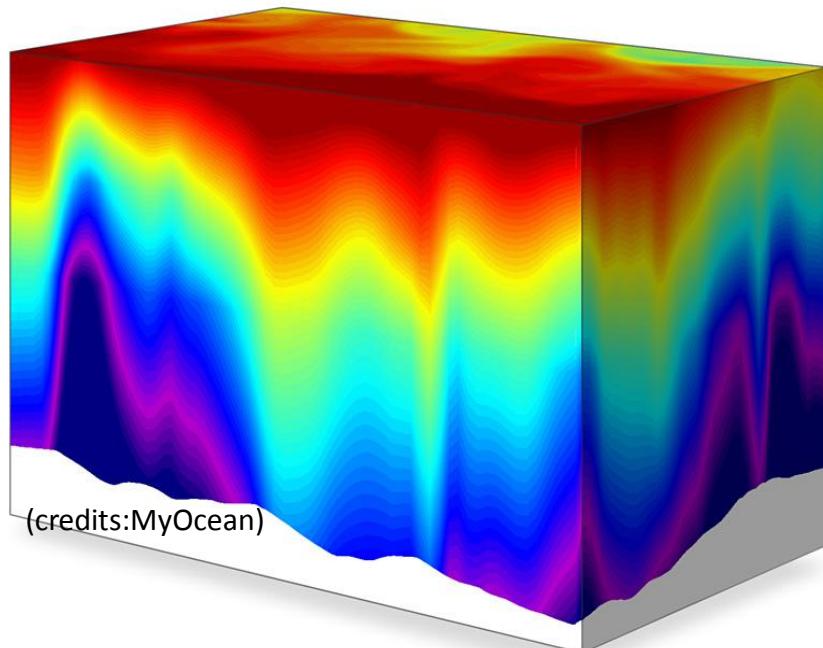
Observing System Simulation Experiments.

## **4) Conclusions**

# Introduction: models

## Why models ?

3D representation of the state of the ocean (in terms of physical variables: temperature, salinity, currents) from surface to bottom, over extended areas, at any time of a simulated period.



# Introduction: models

## What do ocean models do ?

Numerically integrate in time the equations describing the ocean flow, given an **initial state** and the **external forcing** (atmosphere, rivers, lateral open boundaries) during the simulation period.

$$\frac{\partial \mathbf{U}_h}{\partial t} = - \left[ (\nabla \times \mathbf{U}) \times \mathbf{U} + \frac{f}{2} \nabla (\mathbf{U}^2) \right]_h - f \mathbf{k} \times \mathbf{U}_h - \frac{J}{\rho_o} \nabla_h p + \mathbf{D}^U$$

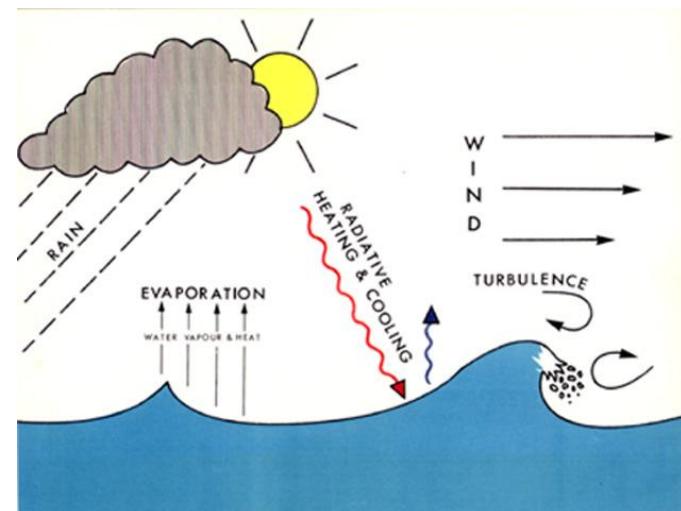
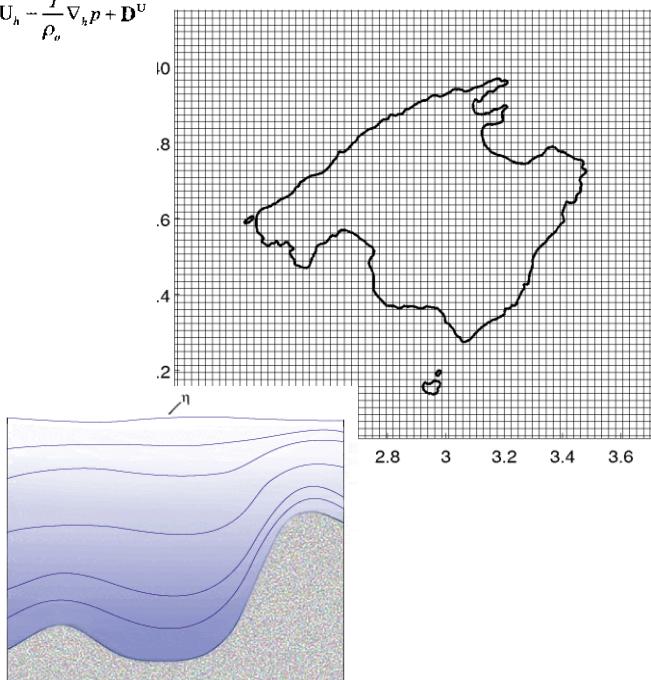
$$\frac{\partial p}{\partial z} = -\rho g$$

$$\nabla \cdot \mathbf{U} = 0$$

$$\frac{\partial T}{\partial t} = -\nabla \cdot (T \mathbf{U}) + D^T$$

$$\frac{\partial S}{\partial t} = -\nabla \cdot (S \mathbf{U}) + D^S$$

$$\rho = \rho(T, S, p)$$

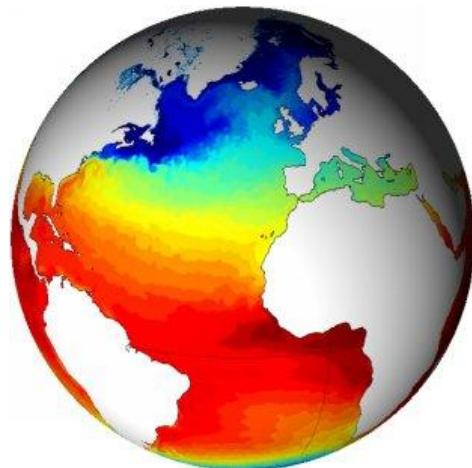


(credits:NOC)

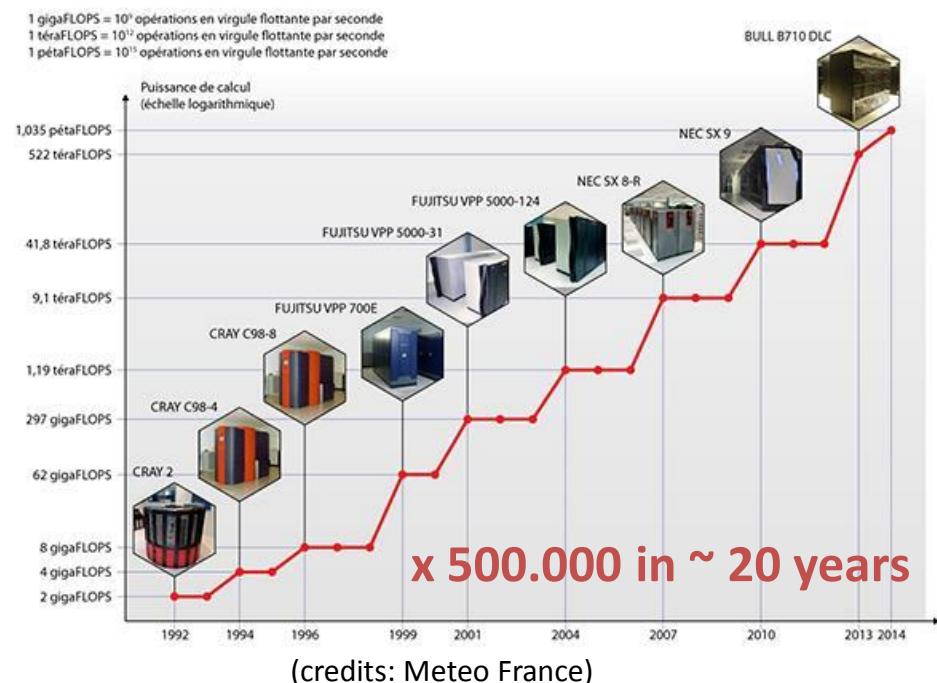
# Introduction: models

Over the last few years, operational high-resolution regional predictions have become affordable due to:

1) Maturity of global/basin-scale operational predictions



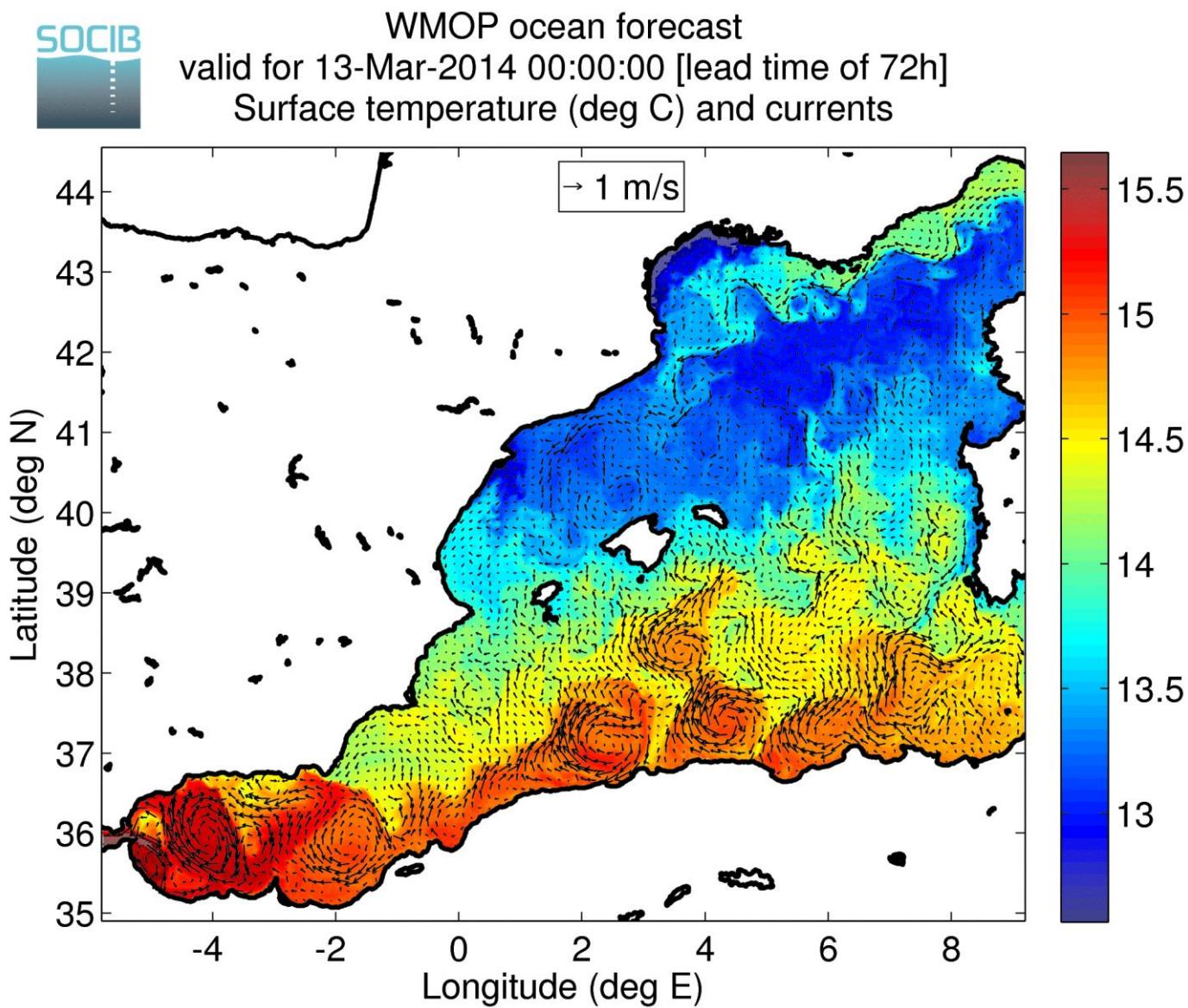
2) Exponentially increasing computing capacity



# Introduction: models

< 2km resolution

1h15 computation  
for a 3-day forecast



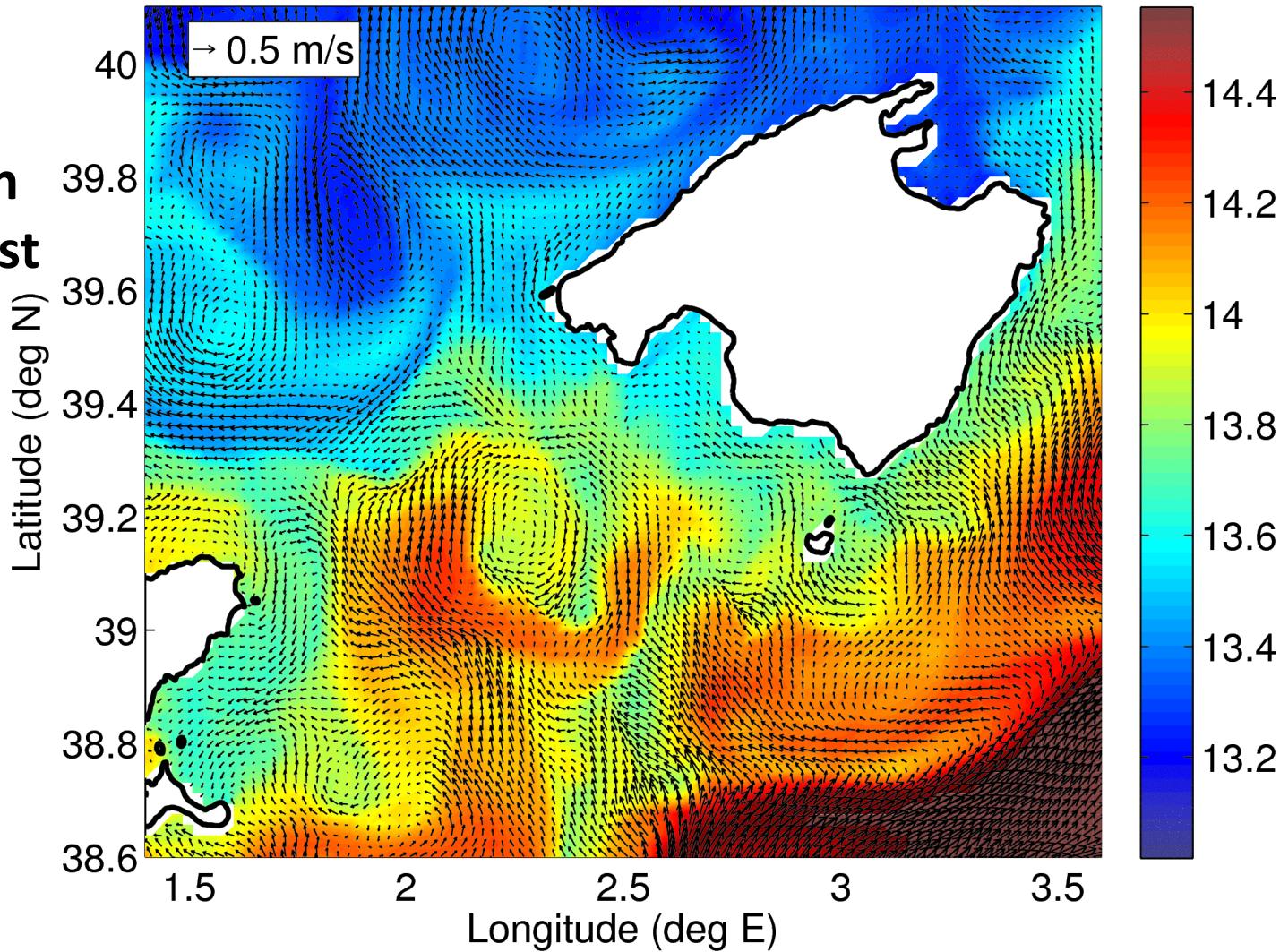
# Introduction: models



WMOP ocean forecast  
valid for 13-Mar-2014 00:00:00 [lead time of 72h]  
Surface temperature (deg C) and currents

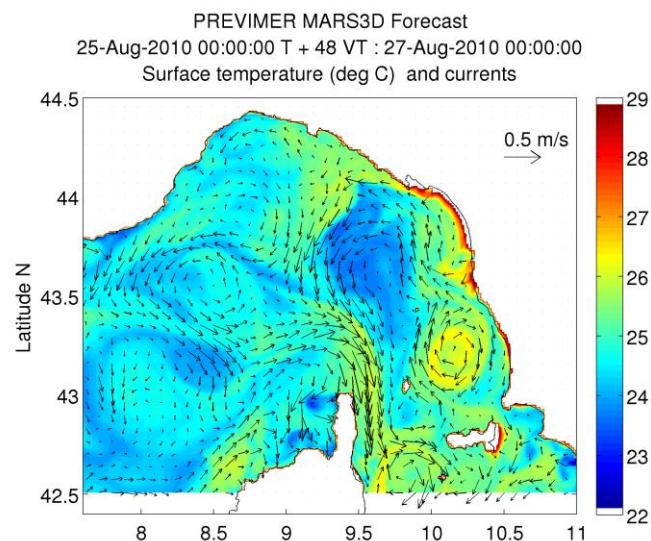
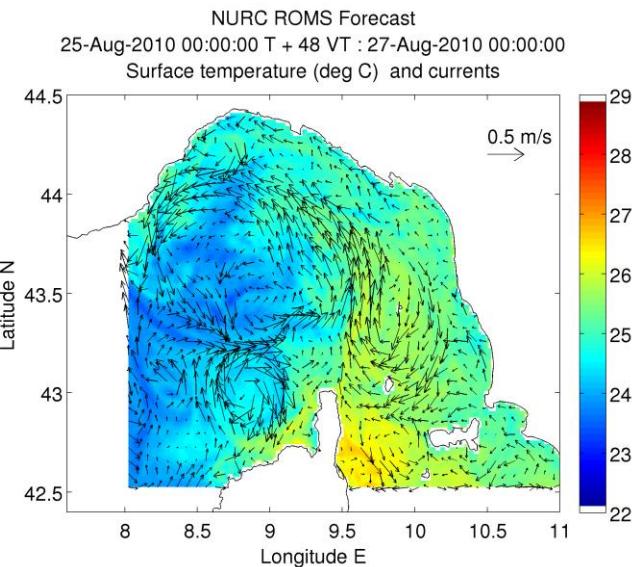
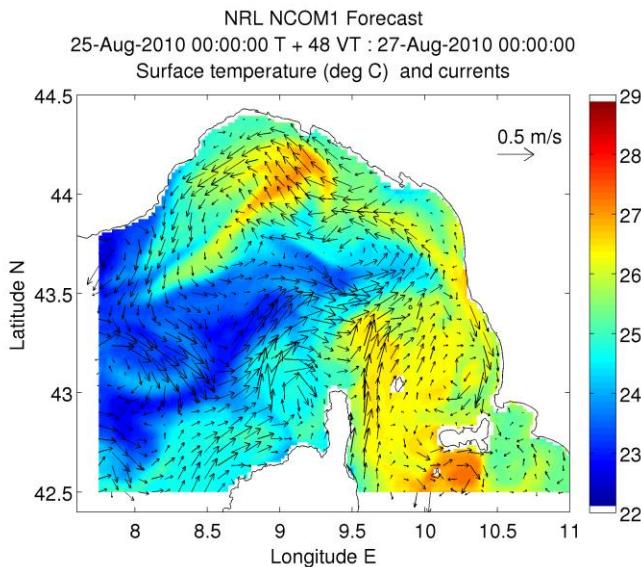
< 2km resolution

1h15 computation  
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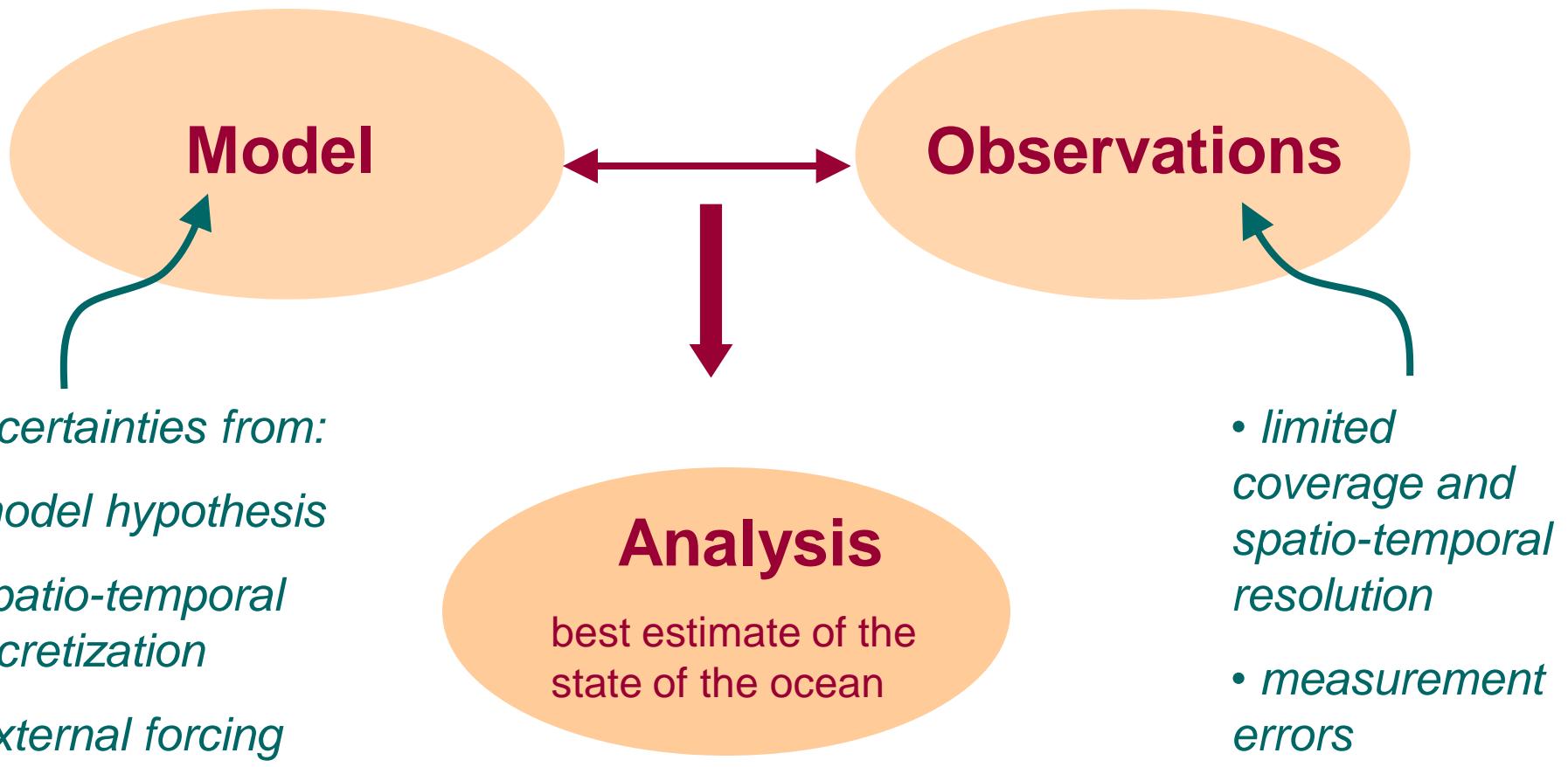
# Introduction: models

## Are these predictions reliable ?



# Introduction: data assimilation

## Need for data assimilation !



# Introduction: observations

## Ocean observations:

**Satellite**



**Gliders**



**Ship-based CTDs**



**Profiling floats**



**Moorings**



**HF radar**



**Multi-platform observations,  
available in near real-time.**

→ ocean observatories

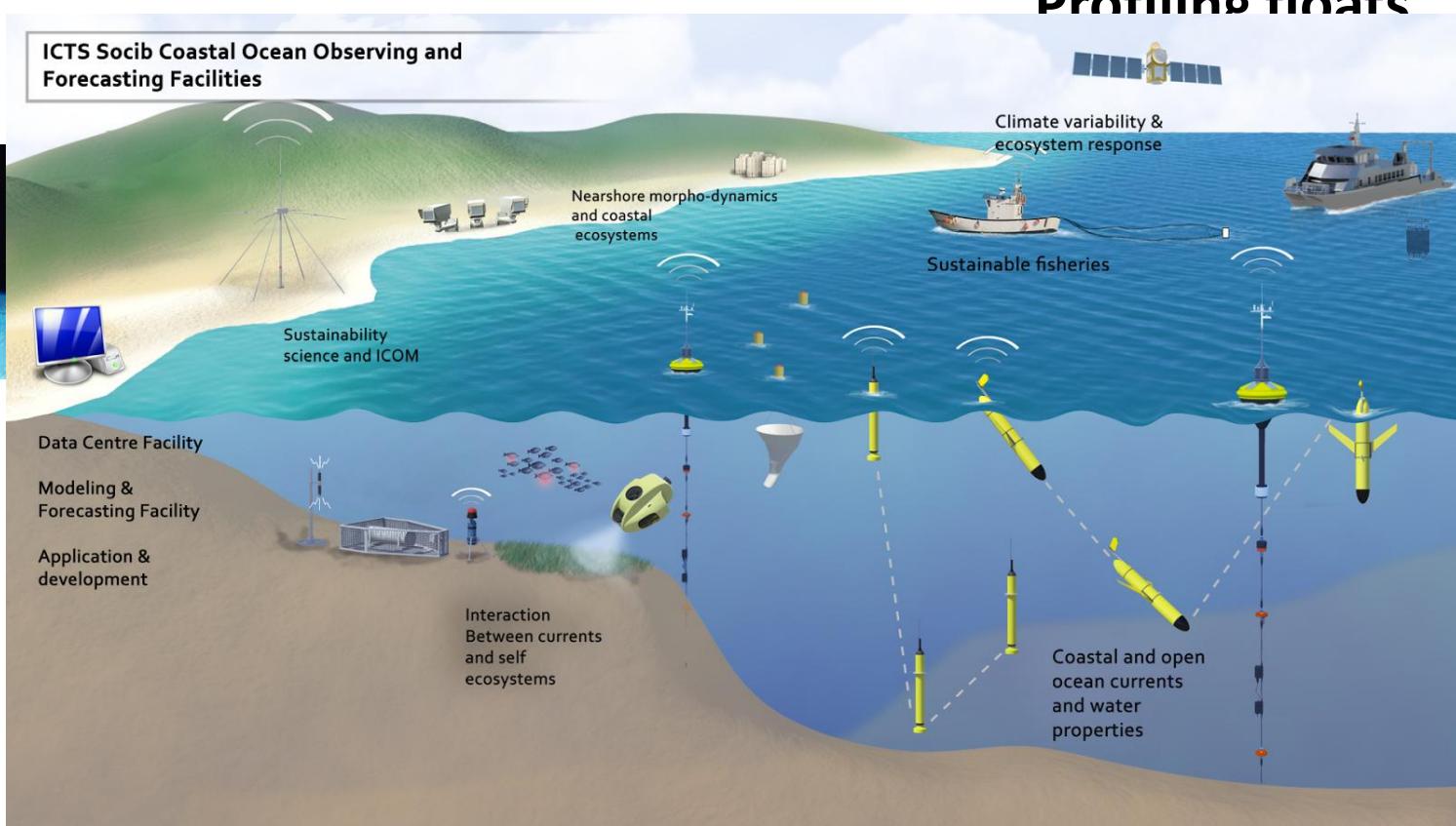
# Introduction: observations

## Ocean observations:

### Satellite



### Gliders



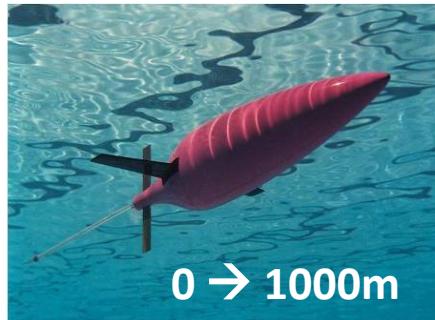
**Multi-platform observations,  
available in near real-time.**

→ ocean observatories

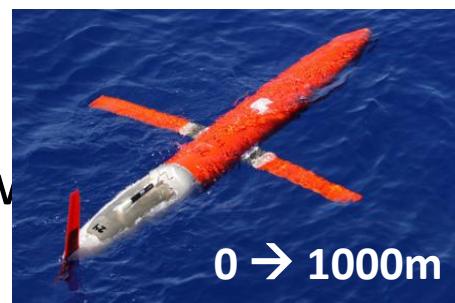
# Introduction: observations

## underwater gliders

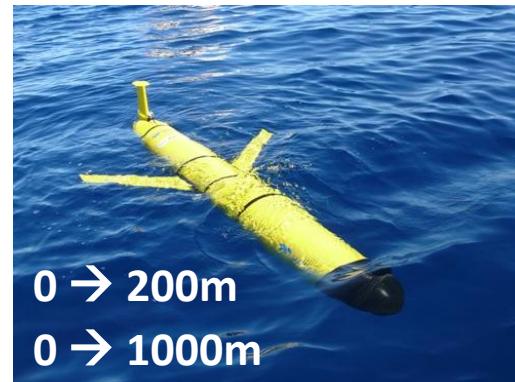
allow an autonomous, controllable, cost-effective, long-duration, high-spatial-resolution sampling of the ocean in both coastal and deep environments



Seaglider



Spray



Slocum



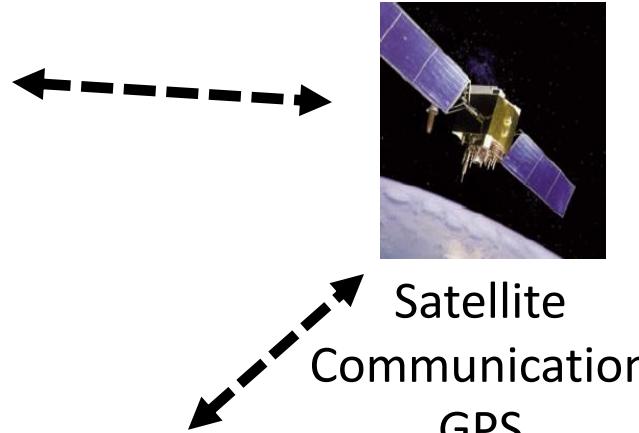
0 → 700m

SeaExplorer

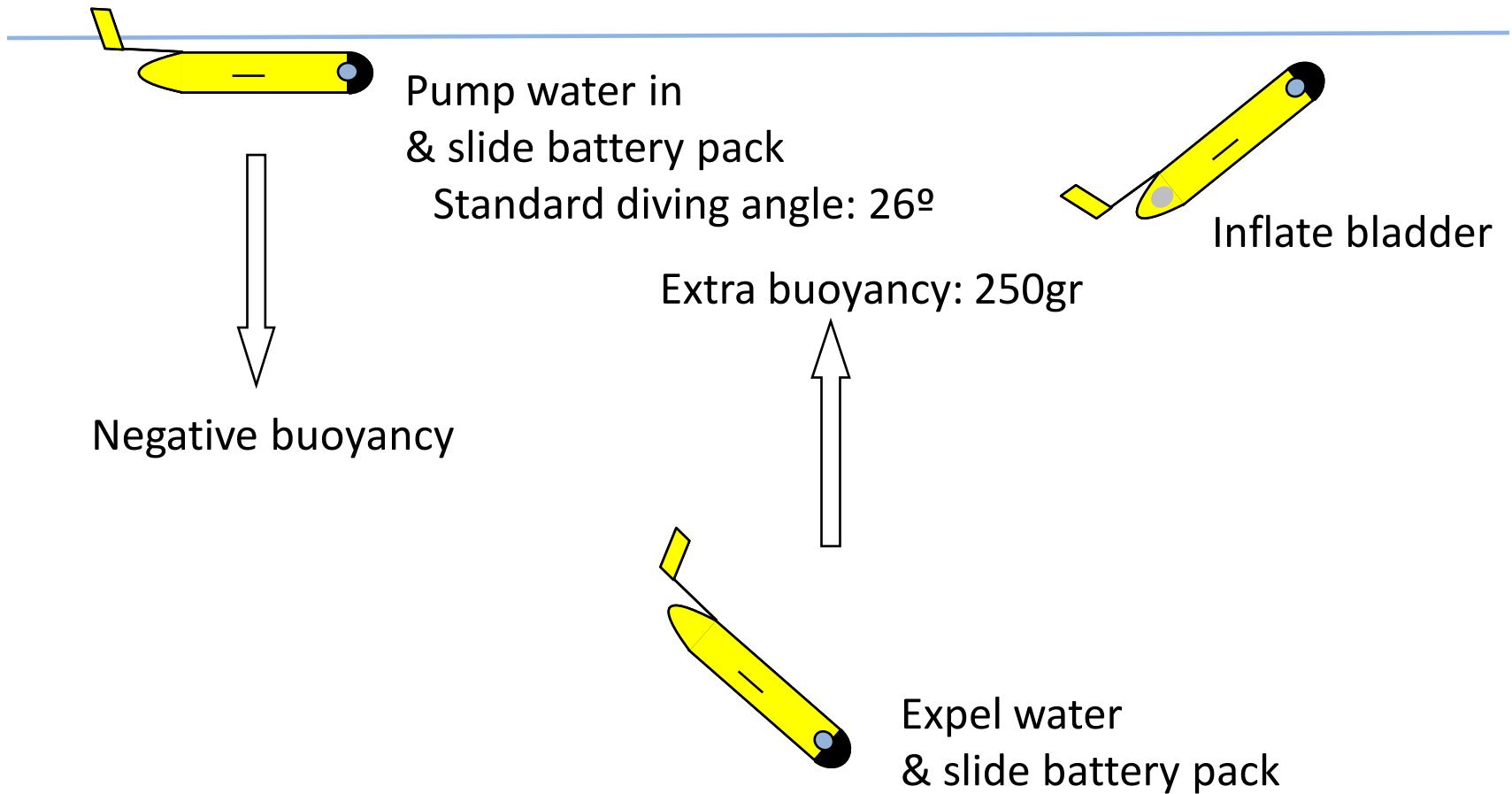
# How does a Slocum glider work ?



Control Centre



Satellite  
Communication  
GPS



# How does a Slocum glider work ?

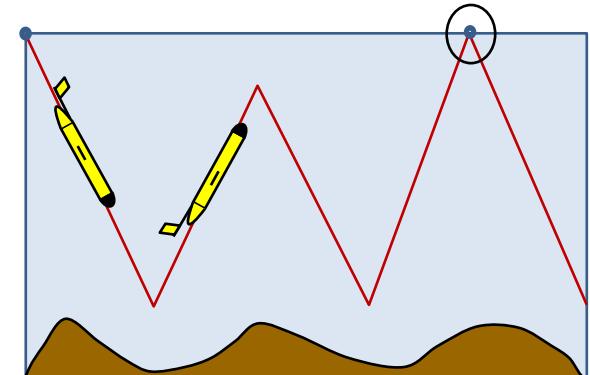


Horizontal distance ~ 800 m (for a 200-m dive)

Travel time ~ 45 min

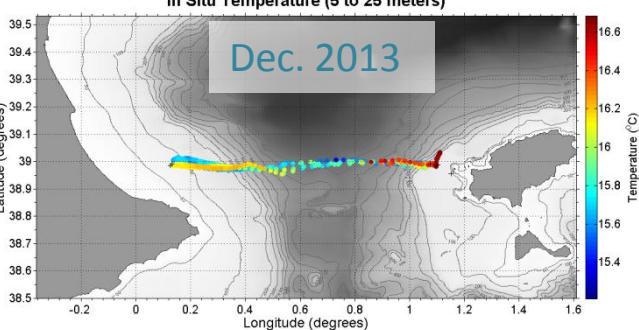
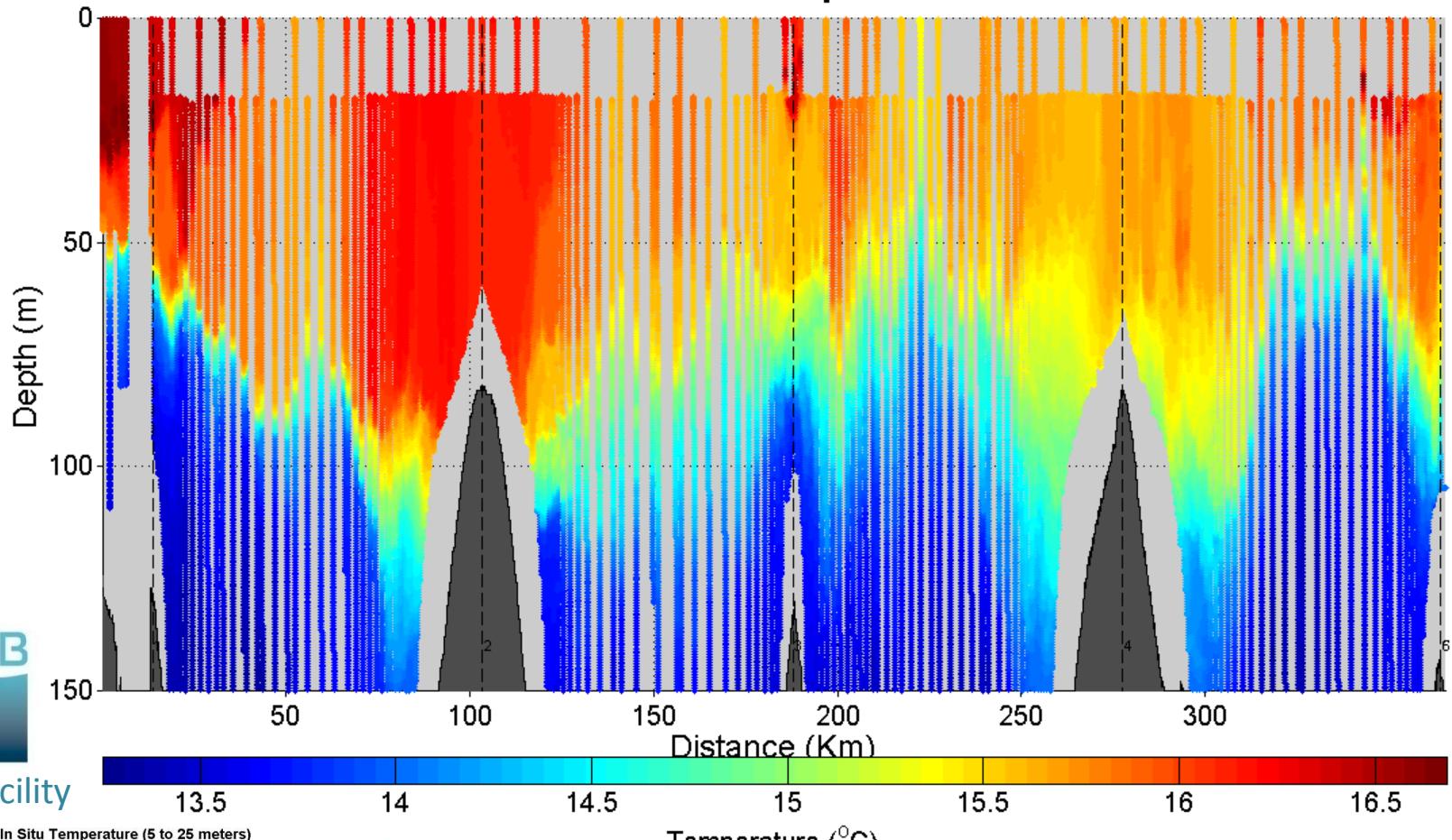
Horizontal speed 0.2-0.4 m/s

Vertical Speed 0.1-0.2 m/s

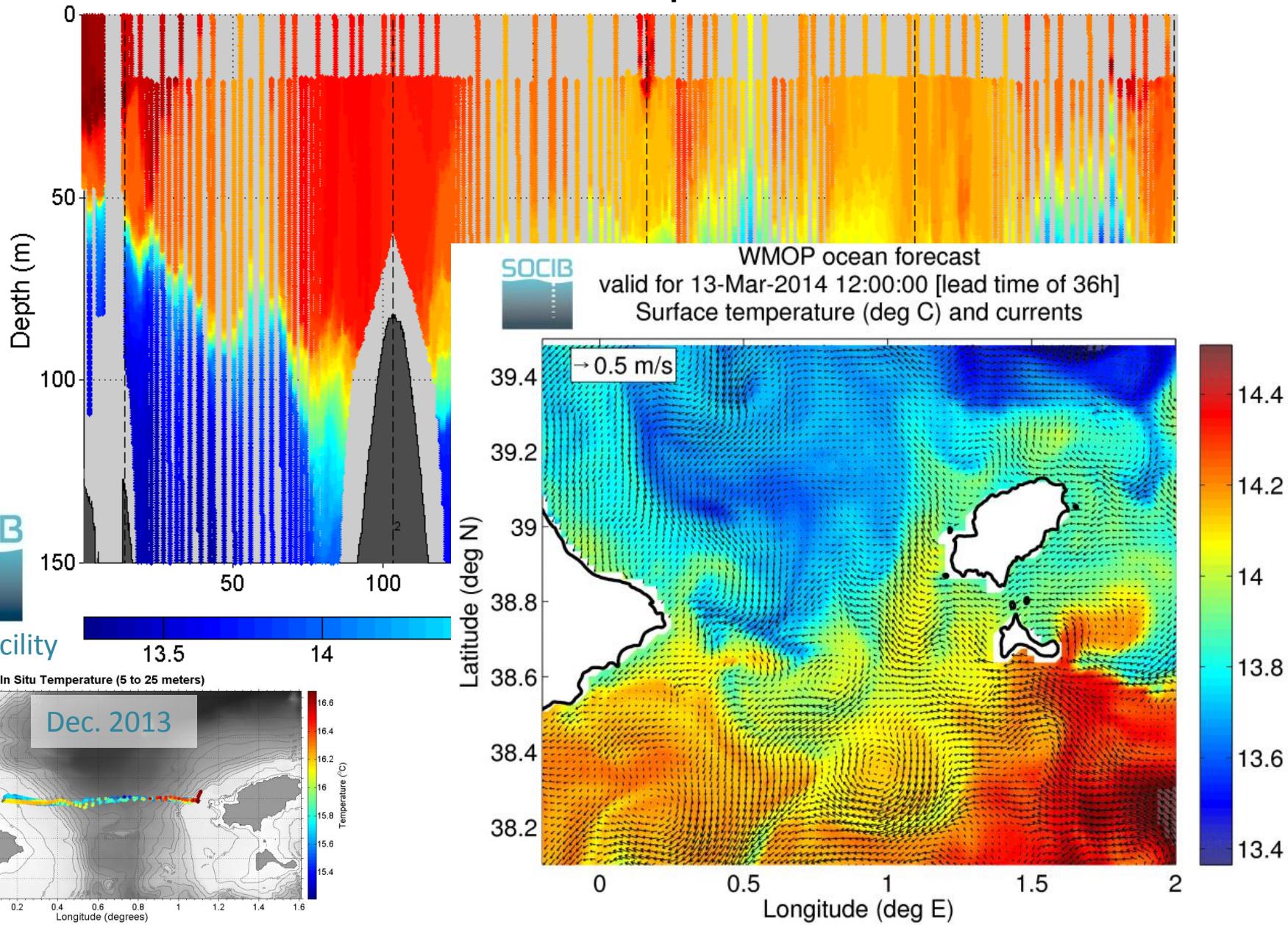


→ <http://followtheglider.com/>

# Typical glider temperature data set



# Typical glider temperature data set



# Outline

## 1) Introduction

Ocean prediction models, underwater gliders  
and data assimilation.

## → 2) Impact of glider fleet data assimilation in the Ligurian Sea

## 3) Glider adaptive sampling

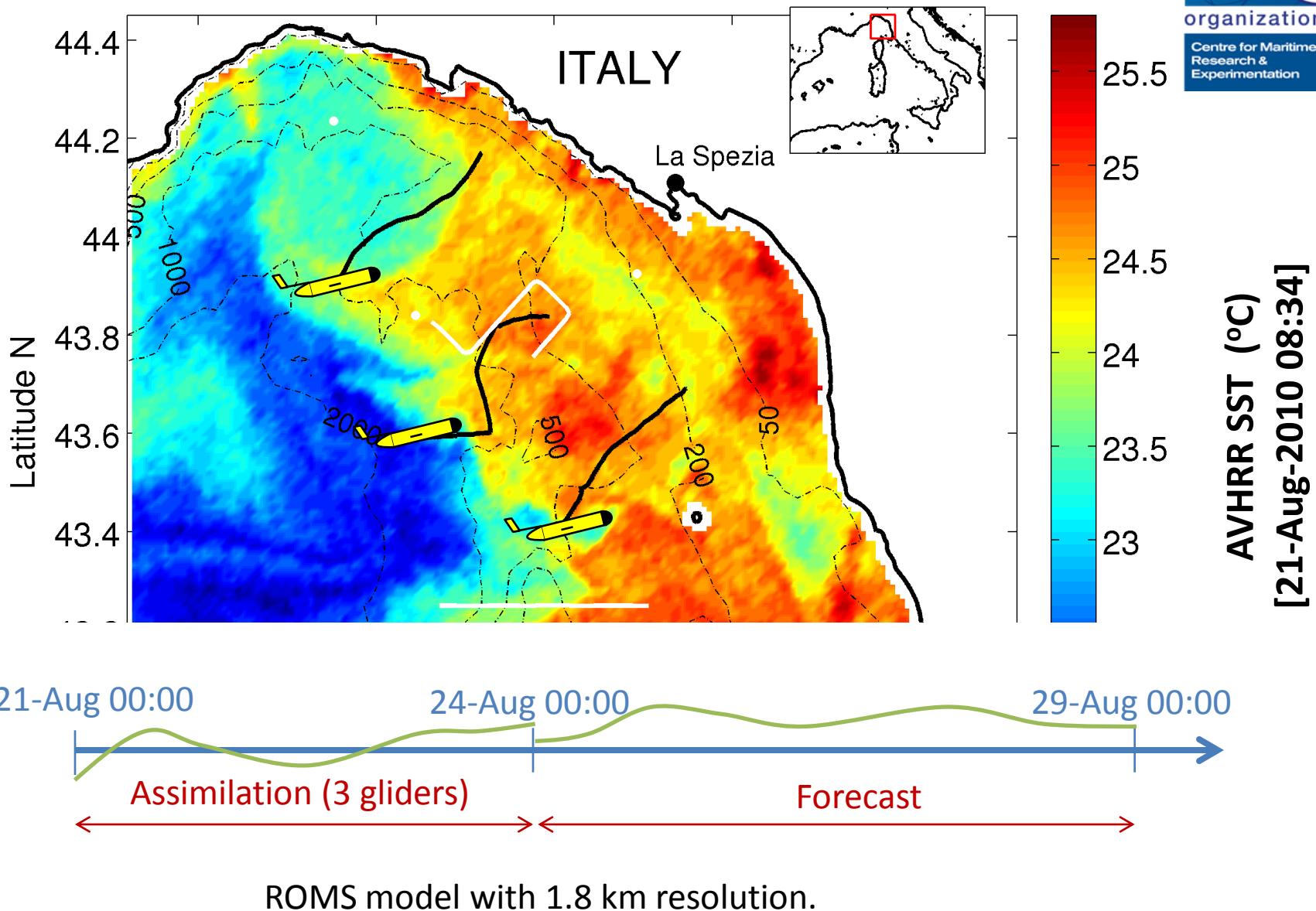
Concept and glider mission planning.

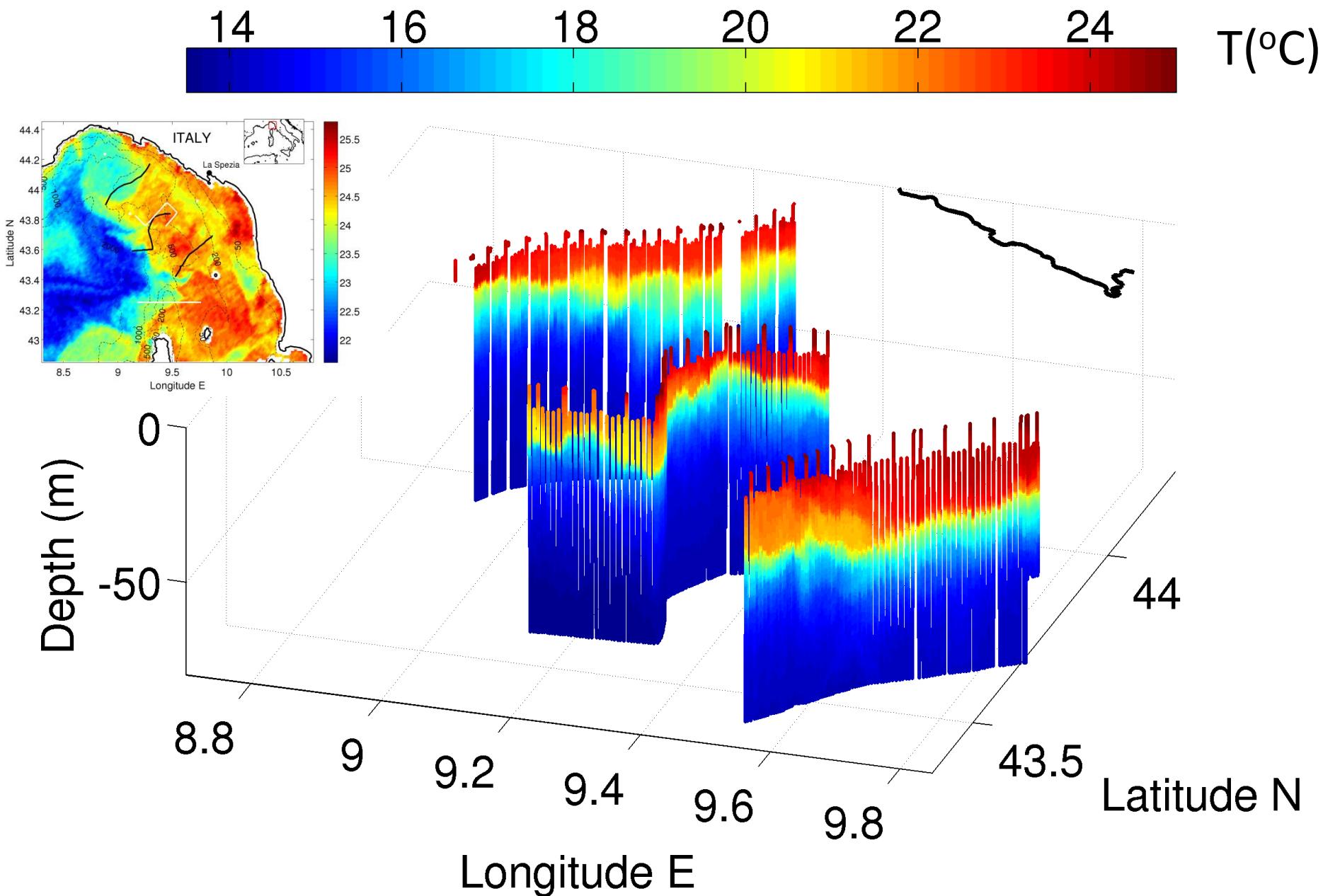
At-sea experiment.

Observing System Simulation Experiments.

## 4) Conclusions

# Glider fleet data assimilation experiment

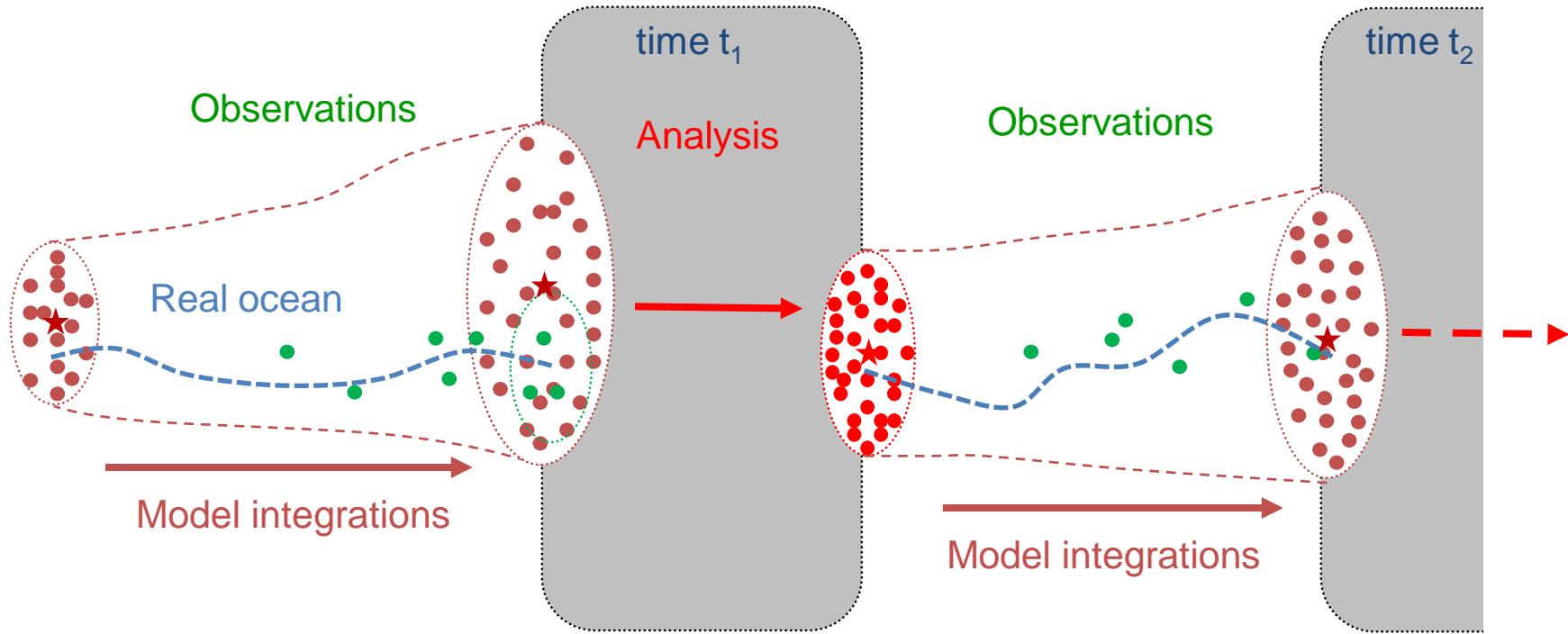




# Glider fleet data assimilation experiment

Data assimilation: ensemble Kalman filter

Ensemble of 96 simulations, including perturbations of the initial conditions, wind and lateral boundaries.

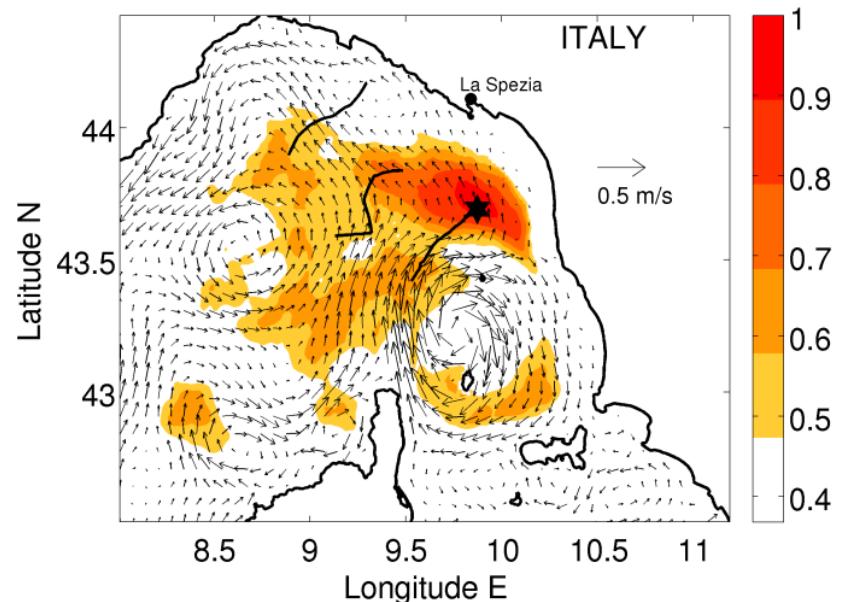
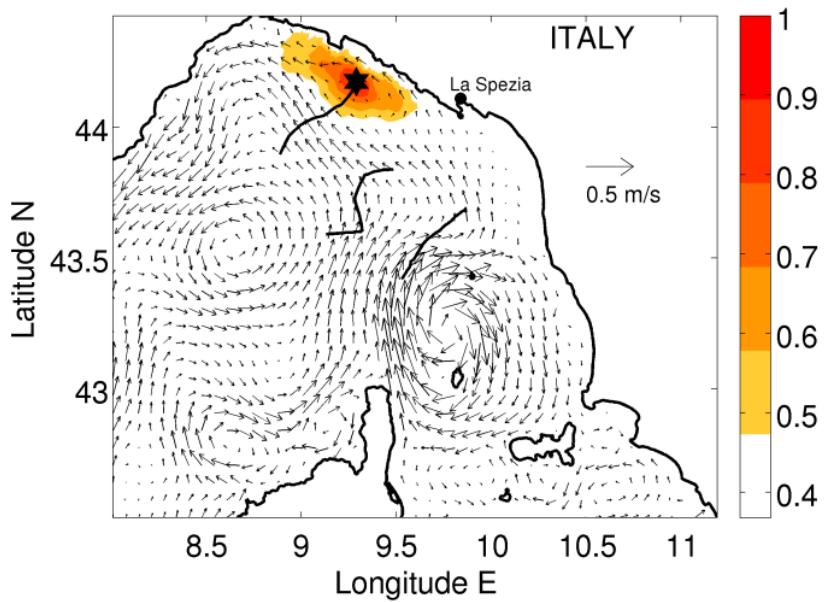
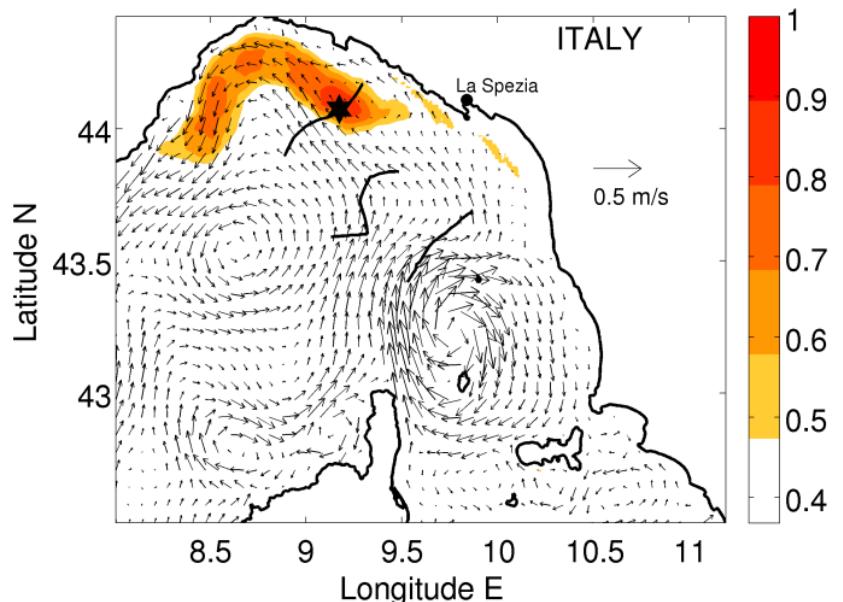
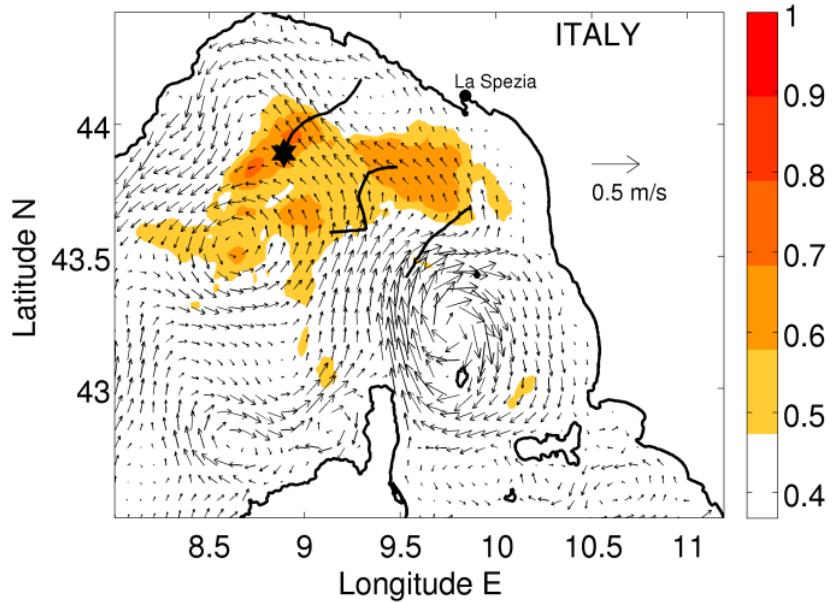


★ Ensemble mean: best estimate.

Ensemble spread: associated error.

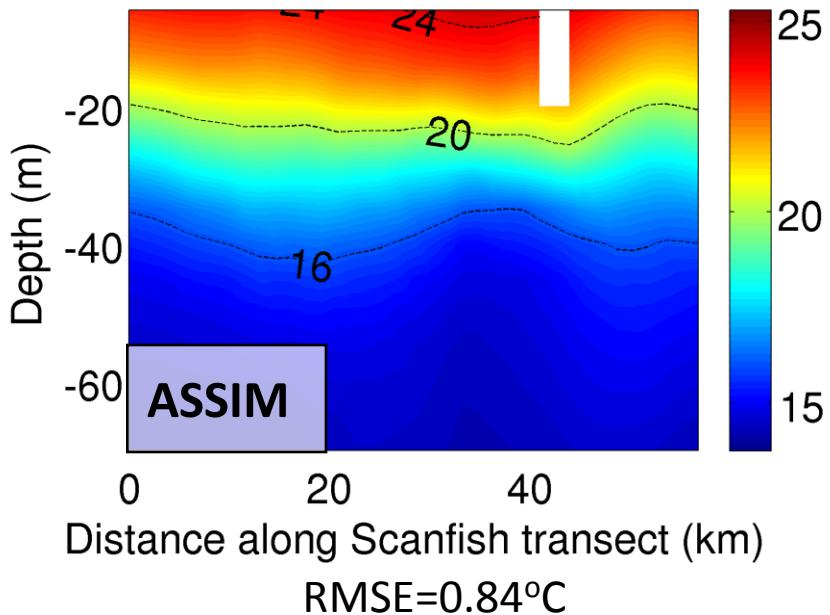
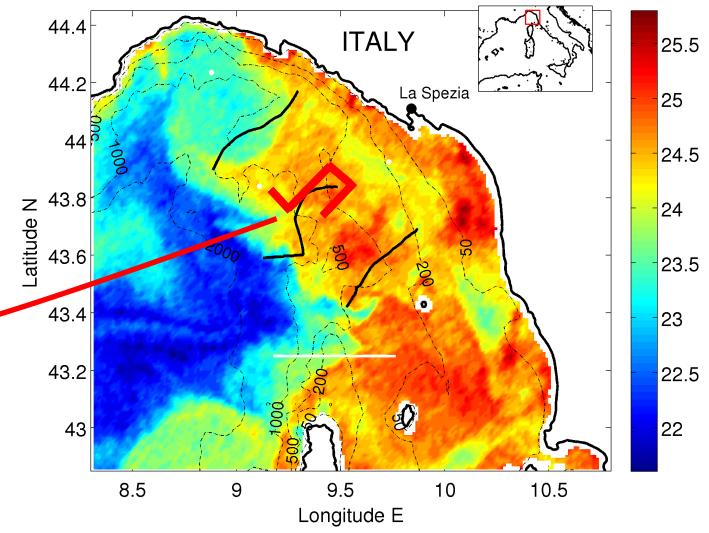
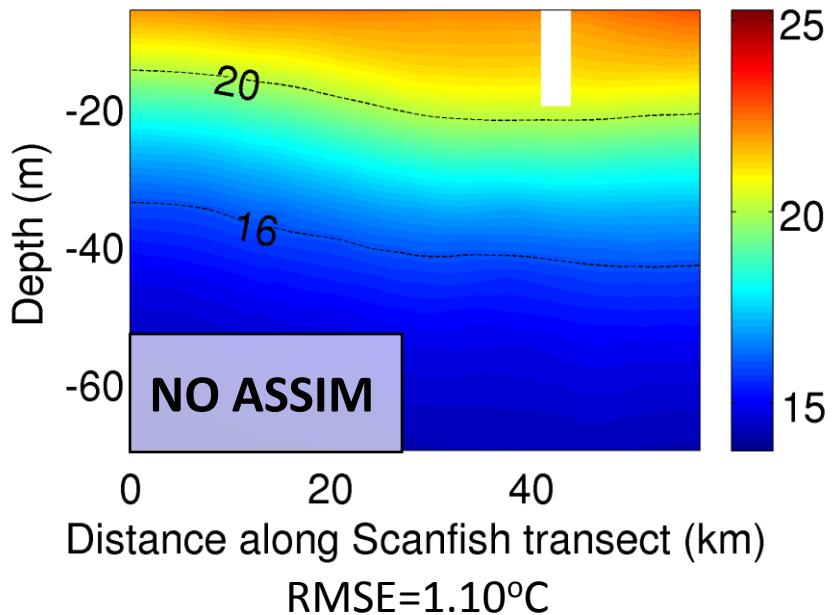
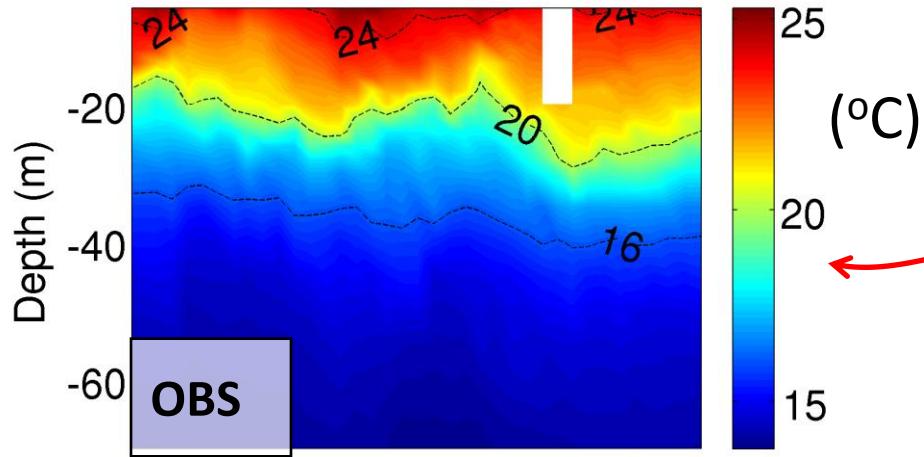
Ensemble covariances (spatio-temporal and multivariate): used to correct non-observed areas/variables.

# Temperature model error correlations at 20m



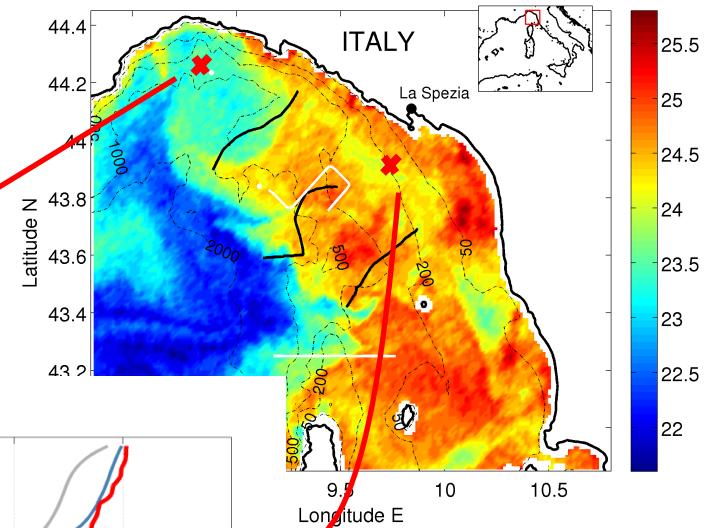
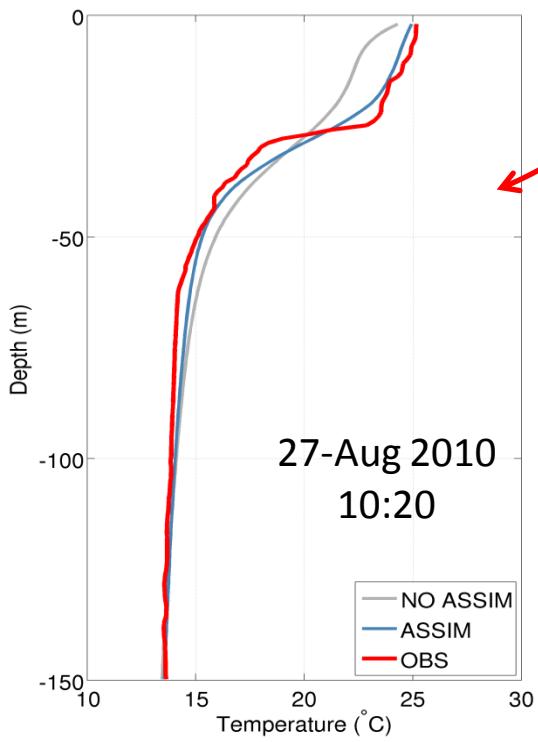
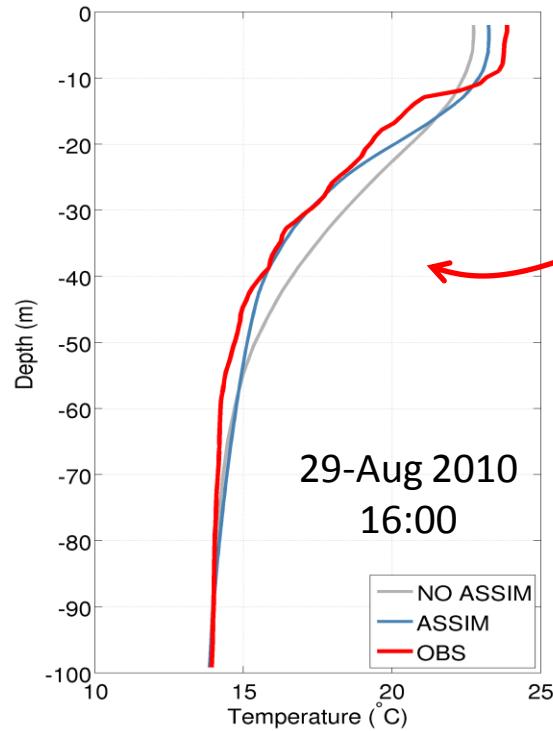
# Glider fleet data assimilation experiment

## Validation against Scanfish data



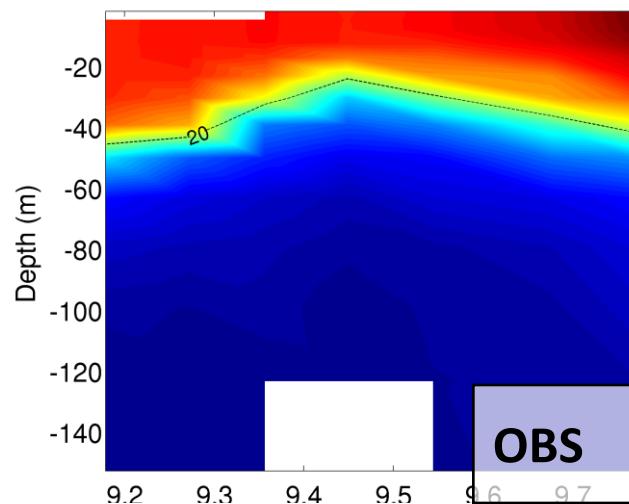
# Glider fleet data assimilation experiment

## Validation against CTD data

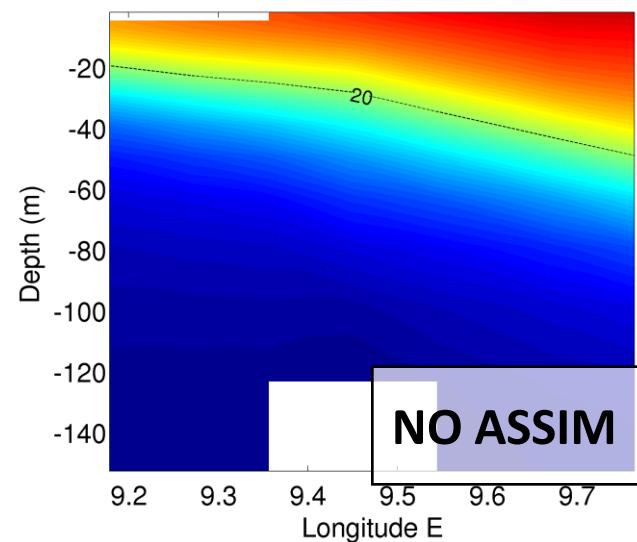
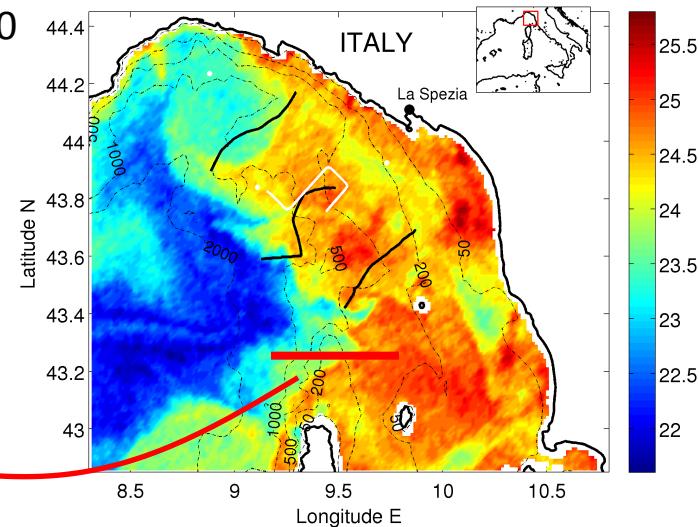


# Glider fleet data assimilation experiment

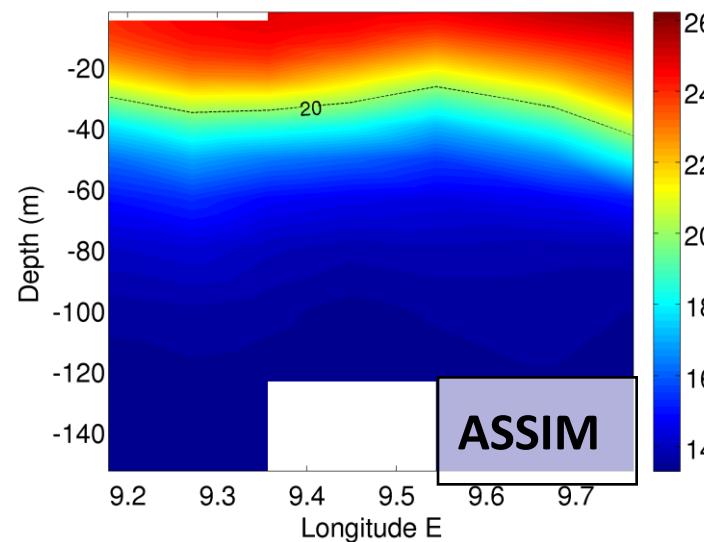
Validation against CTD data



27-Aug 2010  
22:00



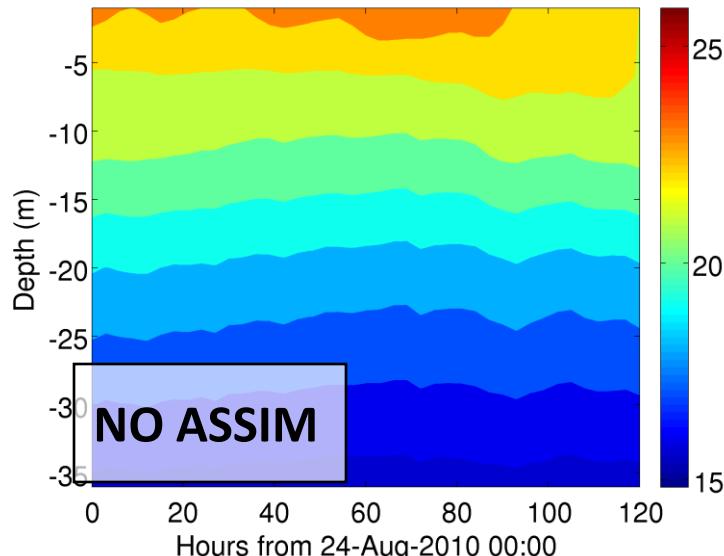
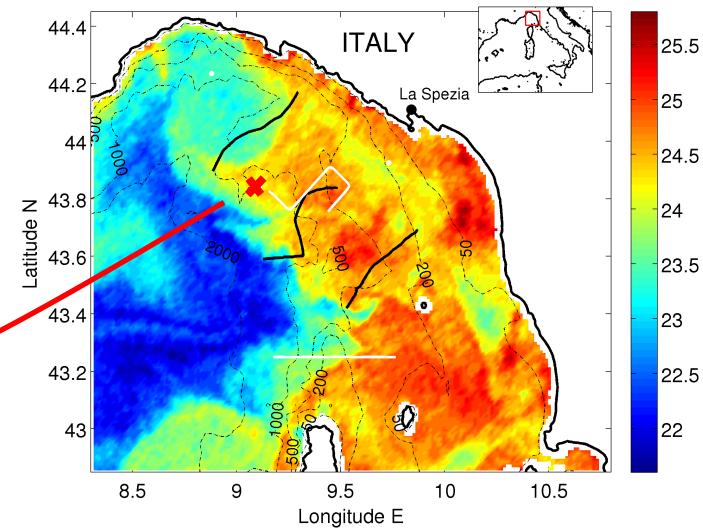
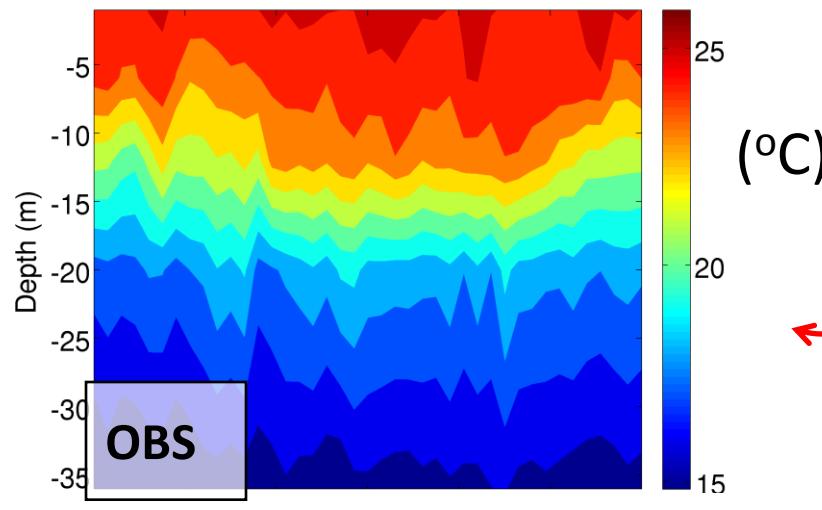
RMSE=1.95°C



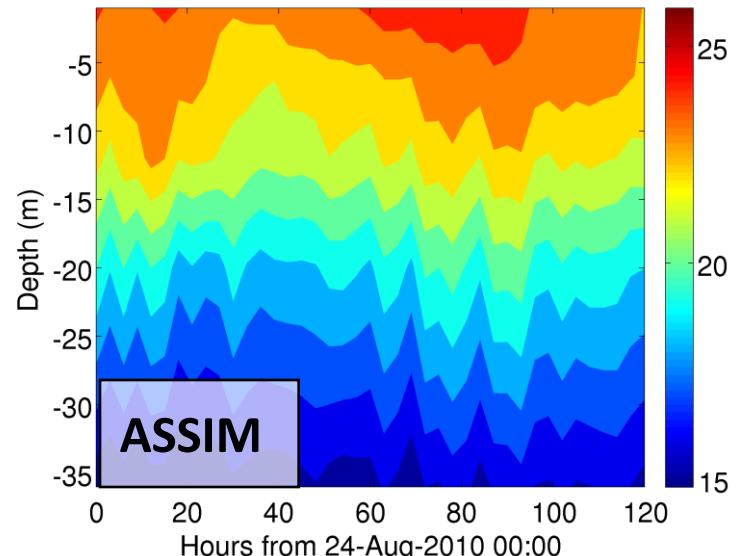
RMSE=1.16°C

# Glider fleet data assimilation experiment

## Validation at ODAS mooring



RMSE=1.66 $^{\circ}\text{C}$



RMSE=1.15 $^{\circ}\text{C}$

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## 3) Glider adaptive sampling

Concept and glider mission planning.

At-sea experiment.

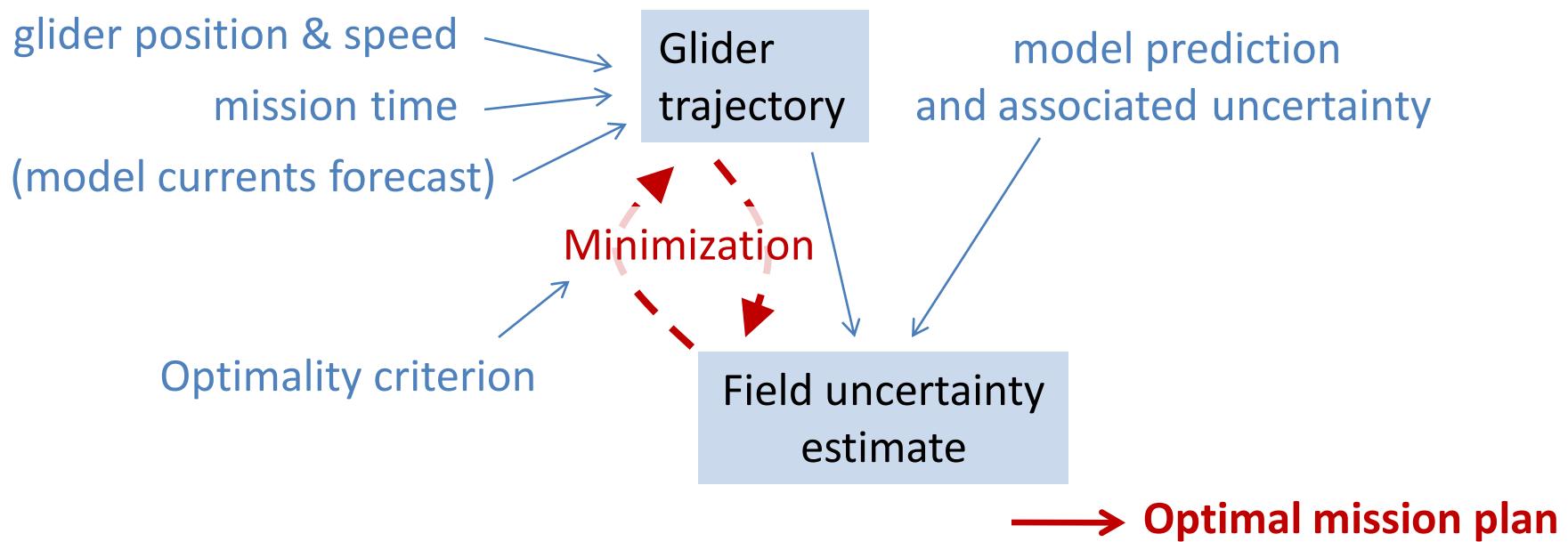
Observing System Simulation Experiments.

## 4) Conclusions

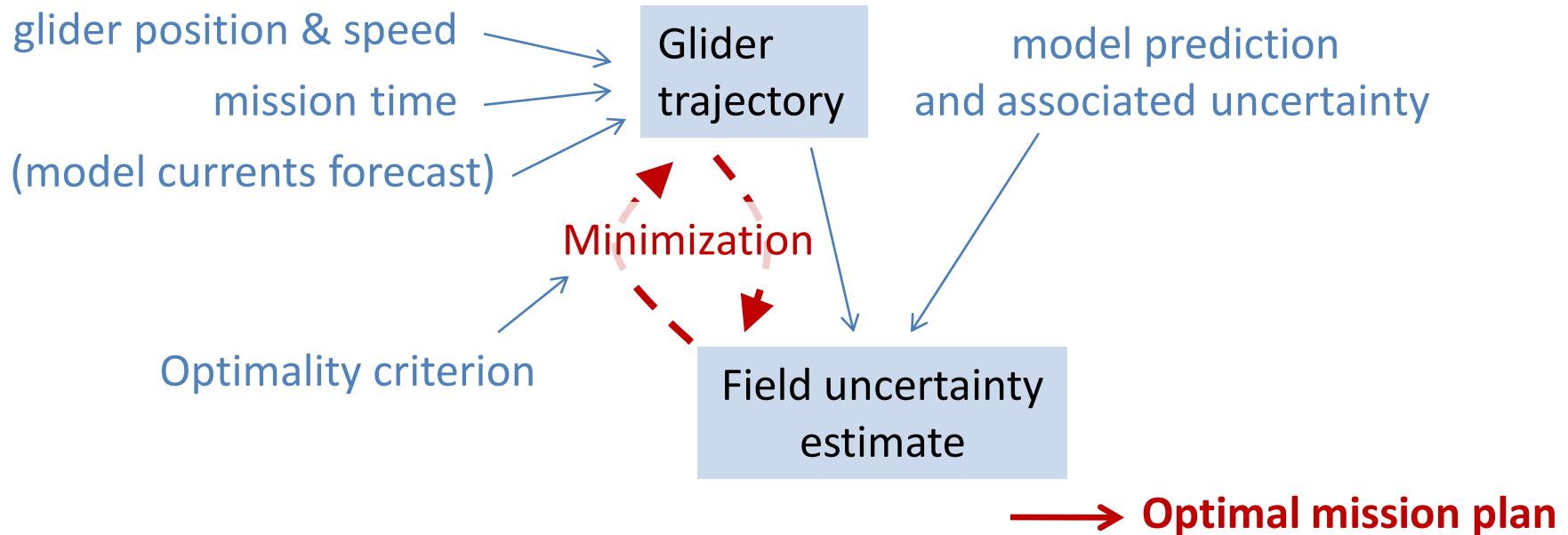
# Adaptive sampling: concept

**Two-way satellite communications: gliders are controllable !**

The glider sampling can be adapted each time the glider communicates at the sea surface, so as to minimize the ocean model forecast uncertainty.



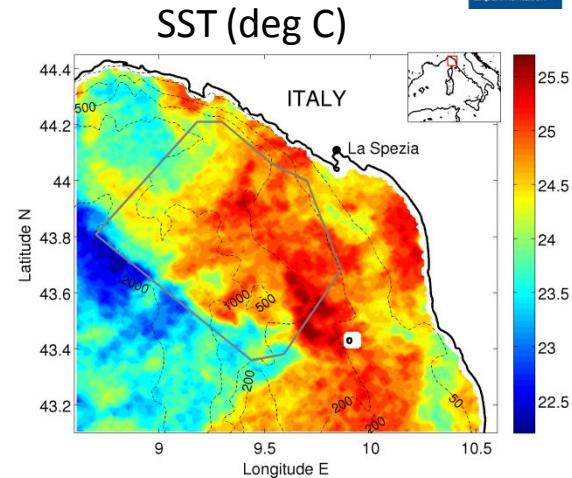
# Adaptive sampling: concept



- Process aiming at defining **timely reachable** trajectories.
- During the mission, the glider surfaces several times between two waypoints and **corrects its heading** according to (i) its actual position and (ii) the estimation of the local oceanic current field deduced from the mismatch between the planned and actual positions of the platform.

# Adaptive sampling: at-sea experiment

(i) A first glider is piloted to reduce the model temperature uncertainties (here 3DSE) in a limited area of the Ligurian Sea during three 48-hour cycles from 20 to 26 August 2010.



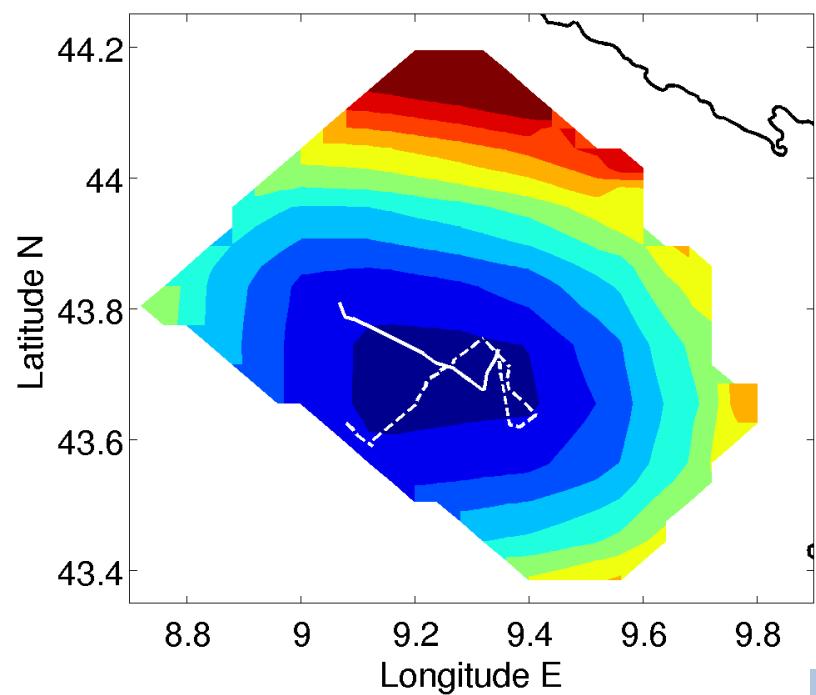
- (ii) During the same period, a second glider flies in the same area but without any adaptive sampling control.
- (iii) Two model forecasts are produced assimilating either the first or second glider.
- (iv) Independent data from CTDs, gliders, ship surface CTD, Scanfish and ODAS mooring are used to evaluate the forecasts.

# Adaptive sampling: at-sea experiment

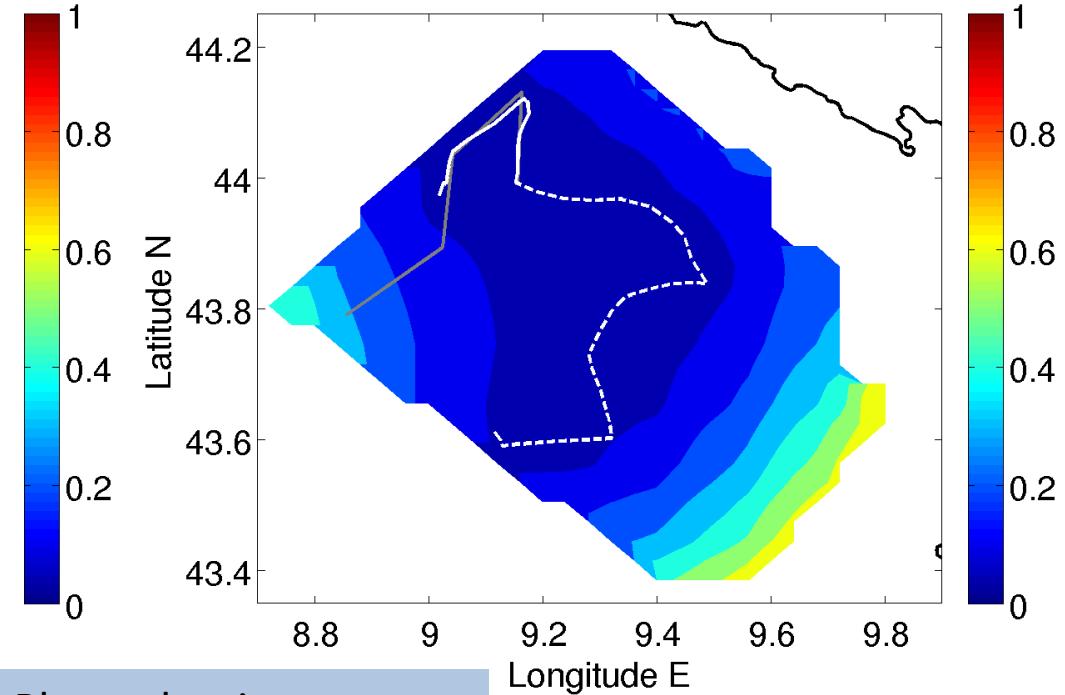
Model predicted uncertainty ( $^{\circ}\text{C}$ )

[26-28 August]

No adaptive sampling [26 - 28 August]



Adaptive sampling [26 - 28 August]



Mean value: **0.42  $^{\circ}\text{C}$**

Planned trajectory —  
Real trajectory —

**0.19  $^{\circ}\text{C}$**

**Reduction of the predicted uncertainty with adaptive sampling**

# Adaptive sampling: at-sea experiment

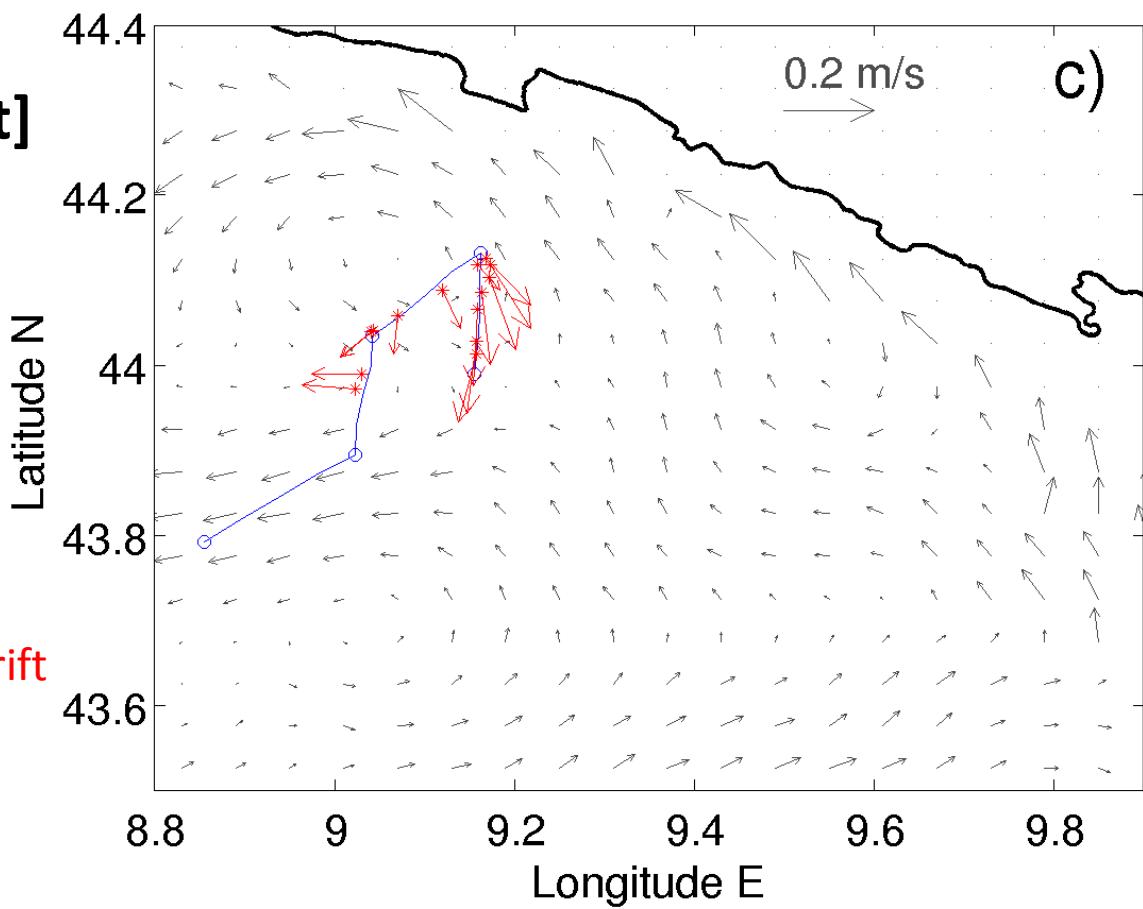
Significant errors in the predicted ocean currents prevented the glider from completing the planned trajectories.

[24-26 August]

—  
Planned trajectory

→  
Vel. estimated from glider drift

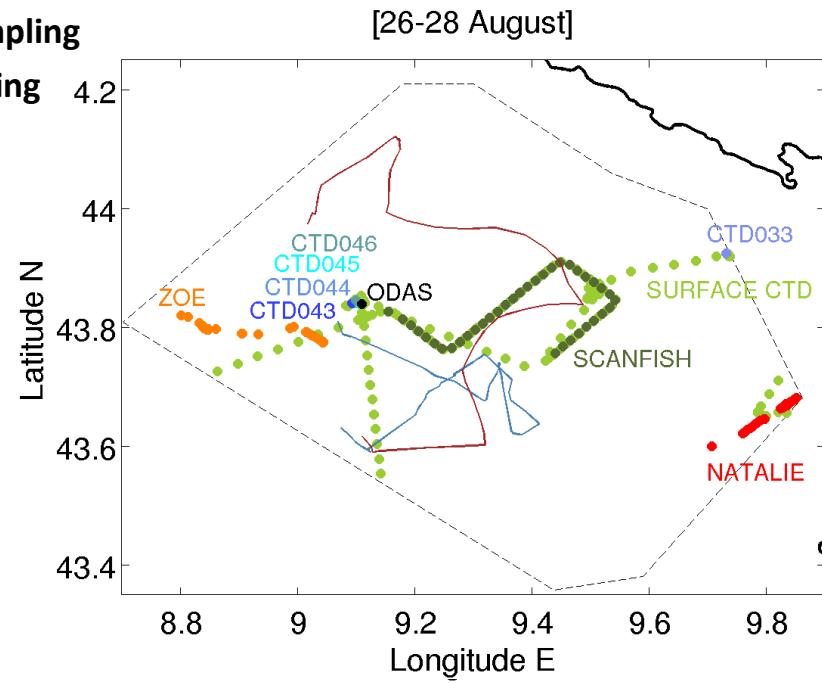
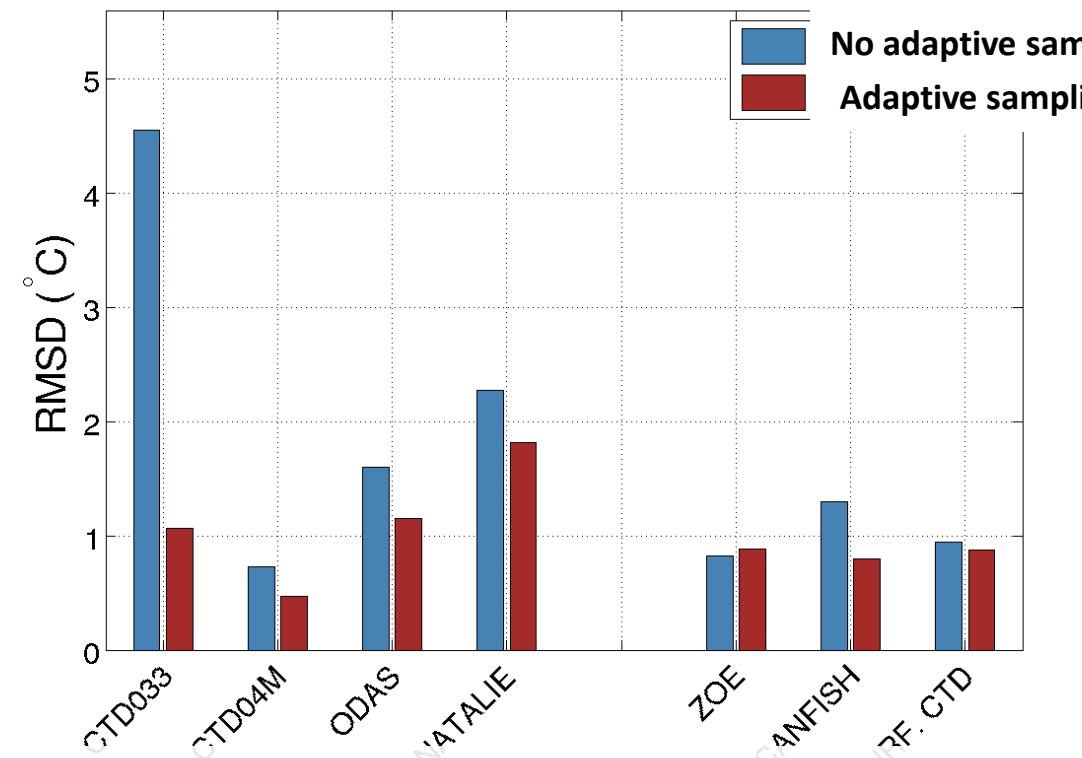
→  
Vel. predicted by the model



# Adaptive sampling: at-sea experiment

Root-Mean-Square Differences between model predictions and observations (temperature)

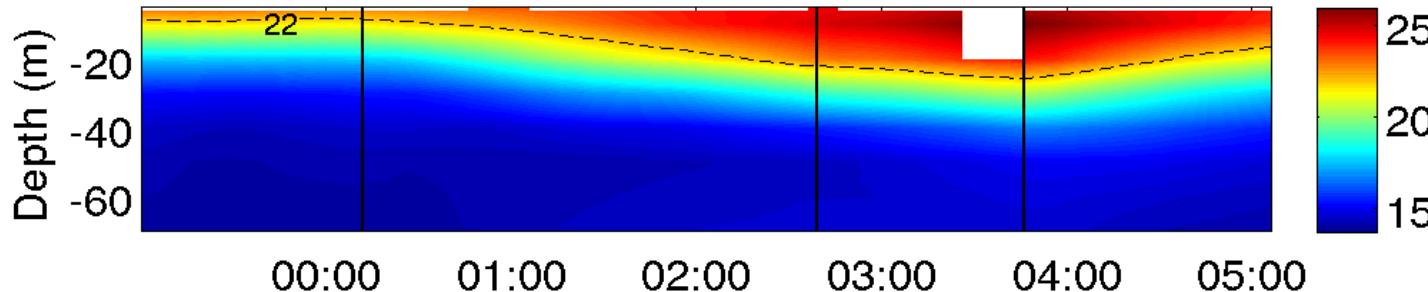
[26-28 August]



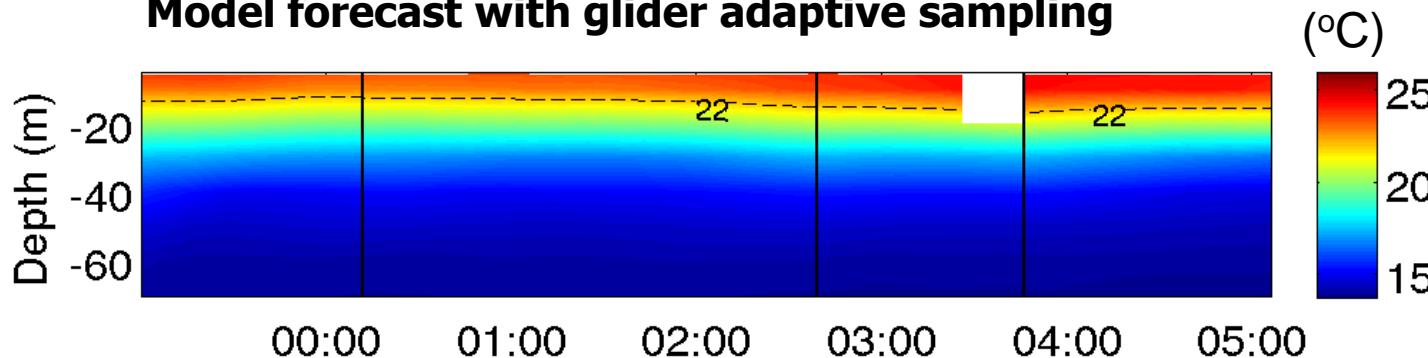
Reduction of the temperature error with adaptive sampling  
(total error reduced by 18%)

# Adaptive sampling: at-sea experiment

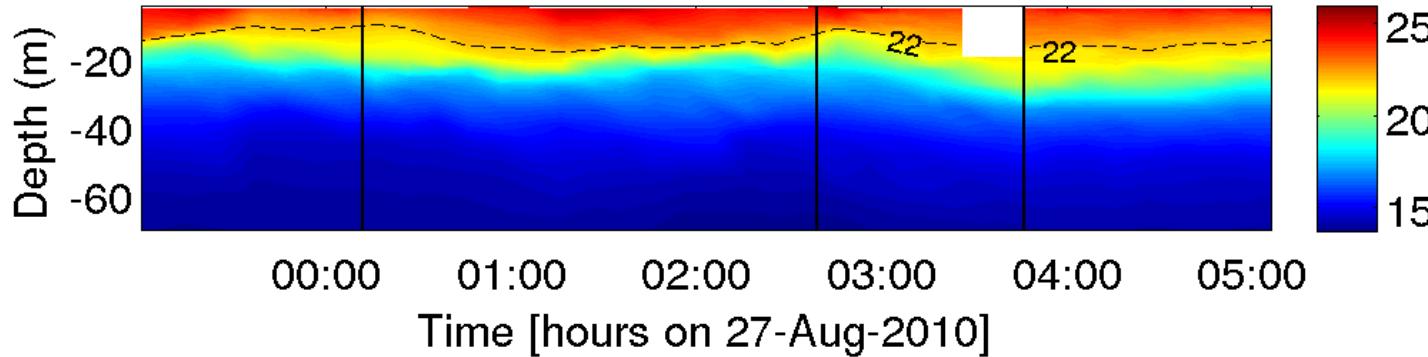
**Model forecast without glider adaptive sampling**



**Model forecast with glider adaptive sampling**



**ScanFish observations**

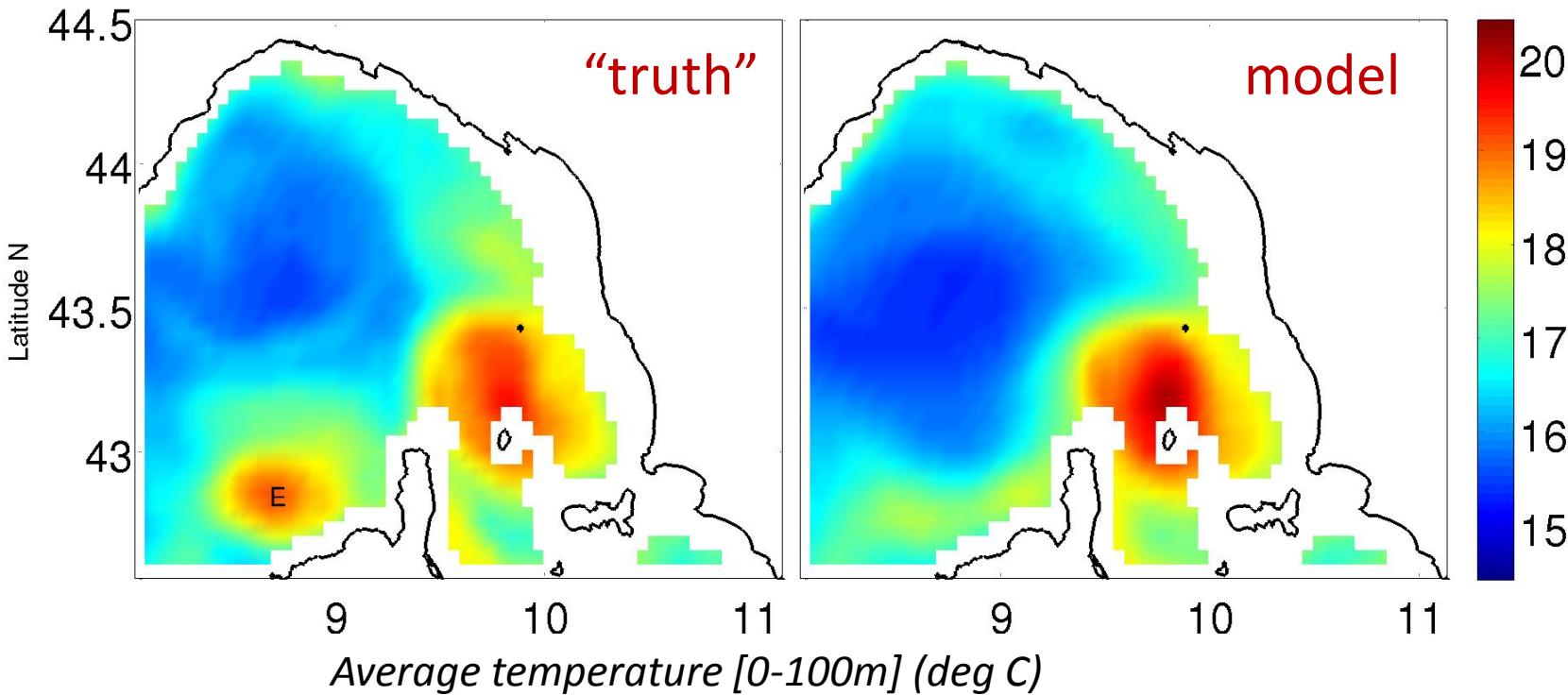


# Adaptive sampling: OSSEs

OSSEs: Observing System Simulation Experiments

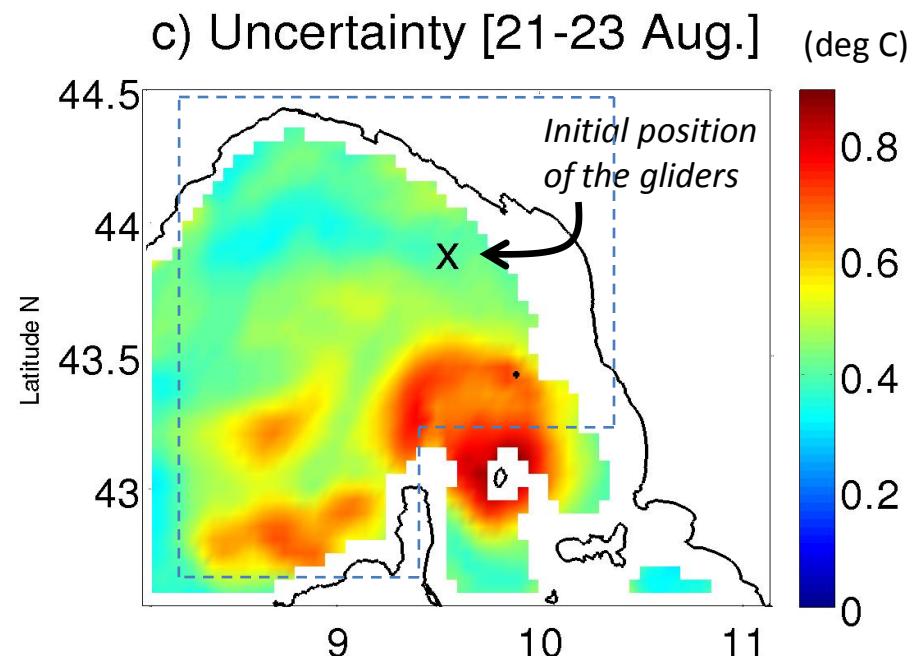
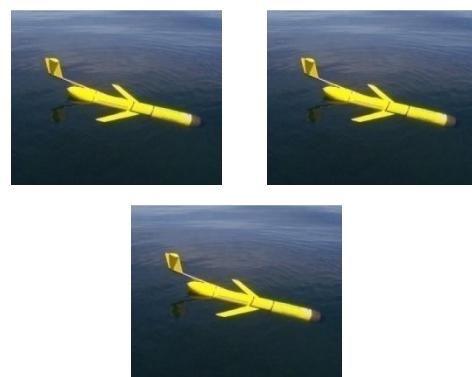
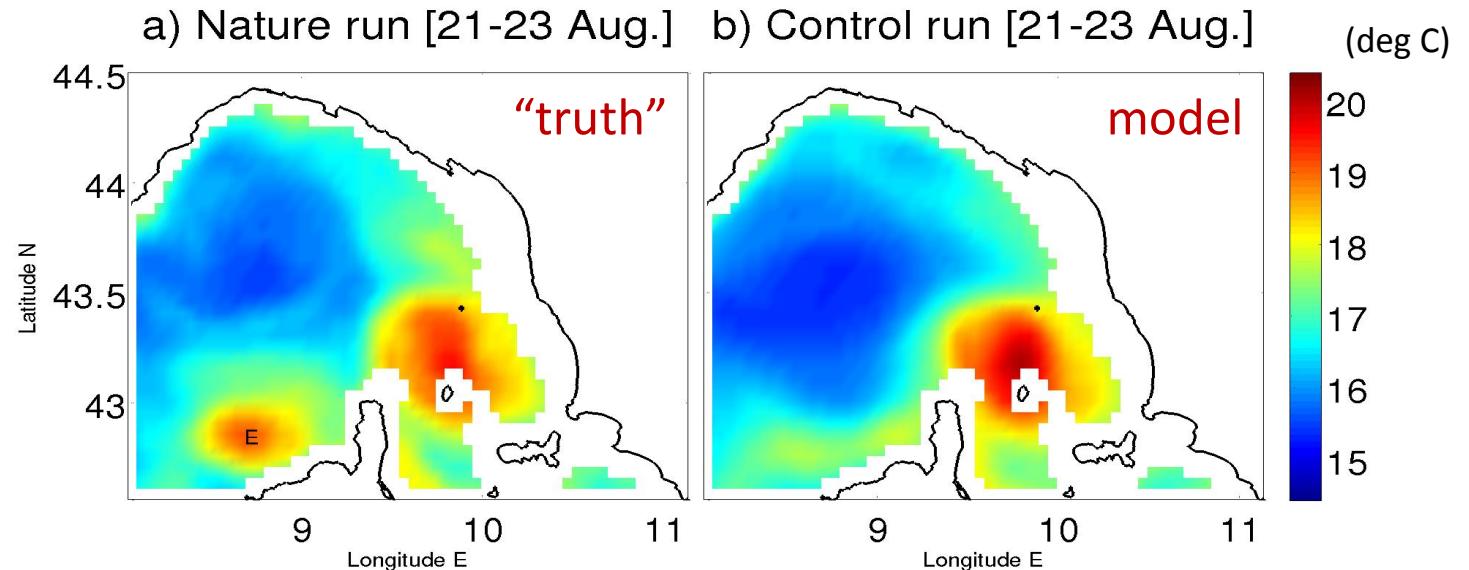
→ evaluate the potential contribution of observations  
to model forecasts

a) Nature run [21-23 Aug.] b) Control run [21-23 Aug.]

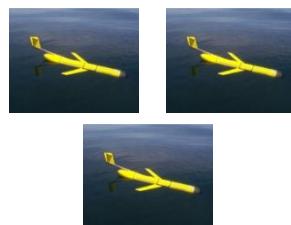


Observations simulated from the “truth” and assimilated in the control simulation.

# Adaptive sampling: OSSEs



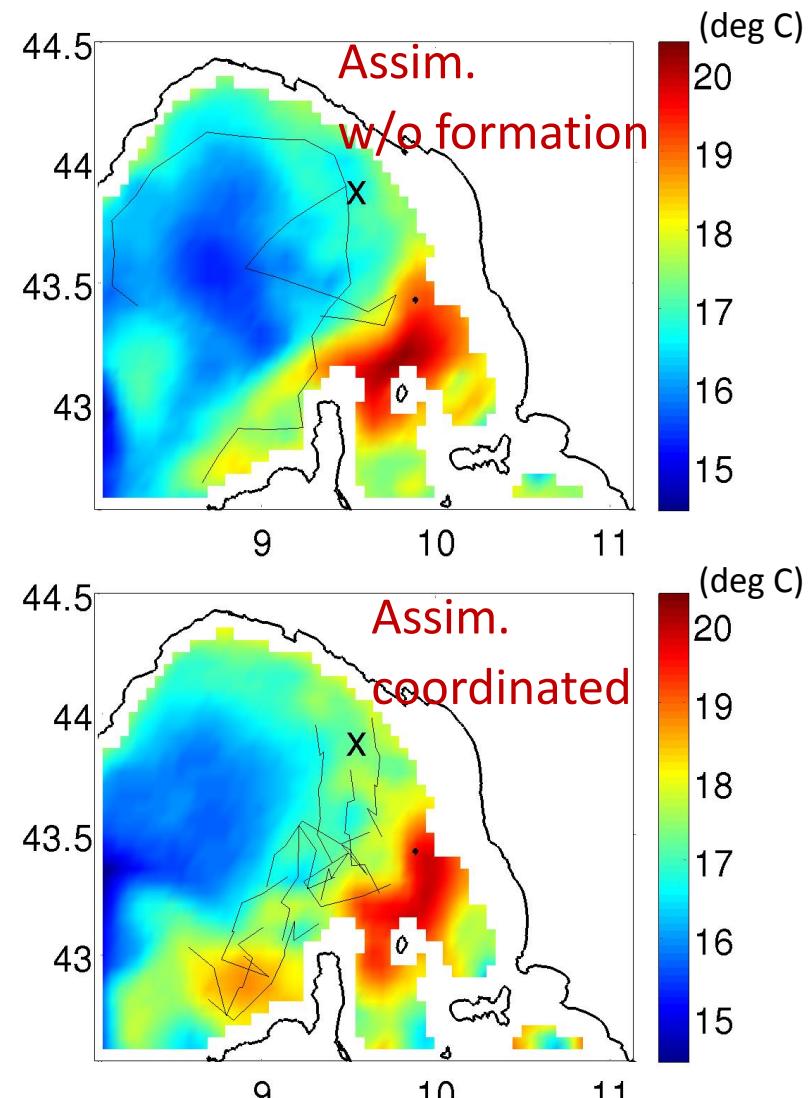
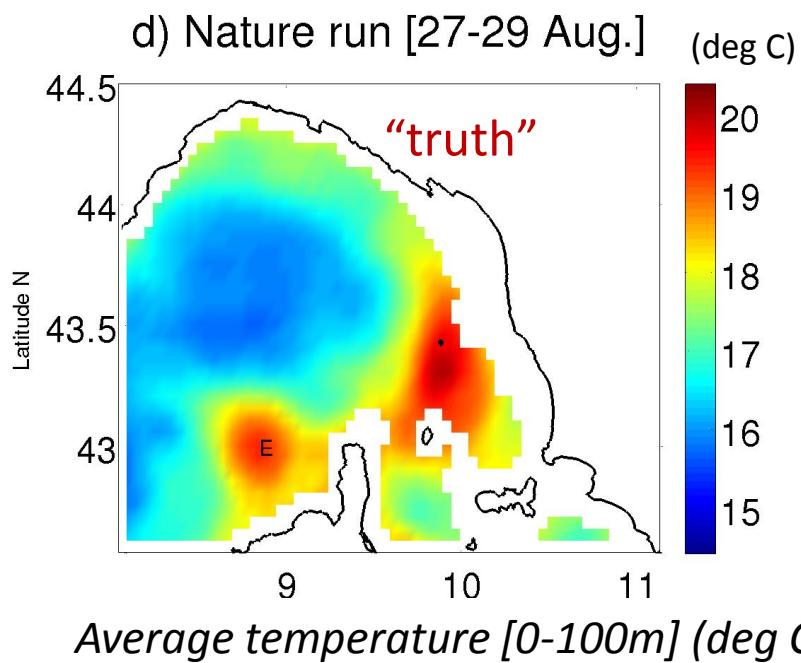
# Adaptive sampling: OSSEs



cooperative

without formation

coordinated (triangular formation)



# Conclusions

## 1) Introduction

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Concept and glider mission planning.  
At-sea experiment.

Observing System Simulation Experiments.



## 4) Conclusions

# Conclusiones

## Predicción oceánica:

modelos hidrodinámicos de alta resolución operacionales a escala regional  
→ mesoescala / sub-mesoescala

## Planeadores submarinos:

proporcionan secciones con observaciones oceánicas de alta resolución  
(+ información sobre velocidades integradas sobre la vertical)

## Asimilación de los datos de planeadores submarinos:

potencial para mejorar la predicción sobre zonas de  $\sim 100 \times 100 \text{ km}^2$

## Muestreo adaptativo:

las plataformas están dirigidas hacia las zonas de mayor incertidumbre del modelo.

Campaña 2010: es 1) factible y 2) útil !

Reconstrucción de un remollino por una flota de 3 planeadores: formación geométrica necesaria para poder representar su estructura en el modelo.

# Conclusiones

**Predicción oceán**  
modelos hic  
→

**Planeadores sub**  
proporciona  
(+ informaci

**Asimilación de lo**  
potencial pa

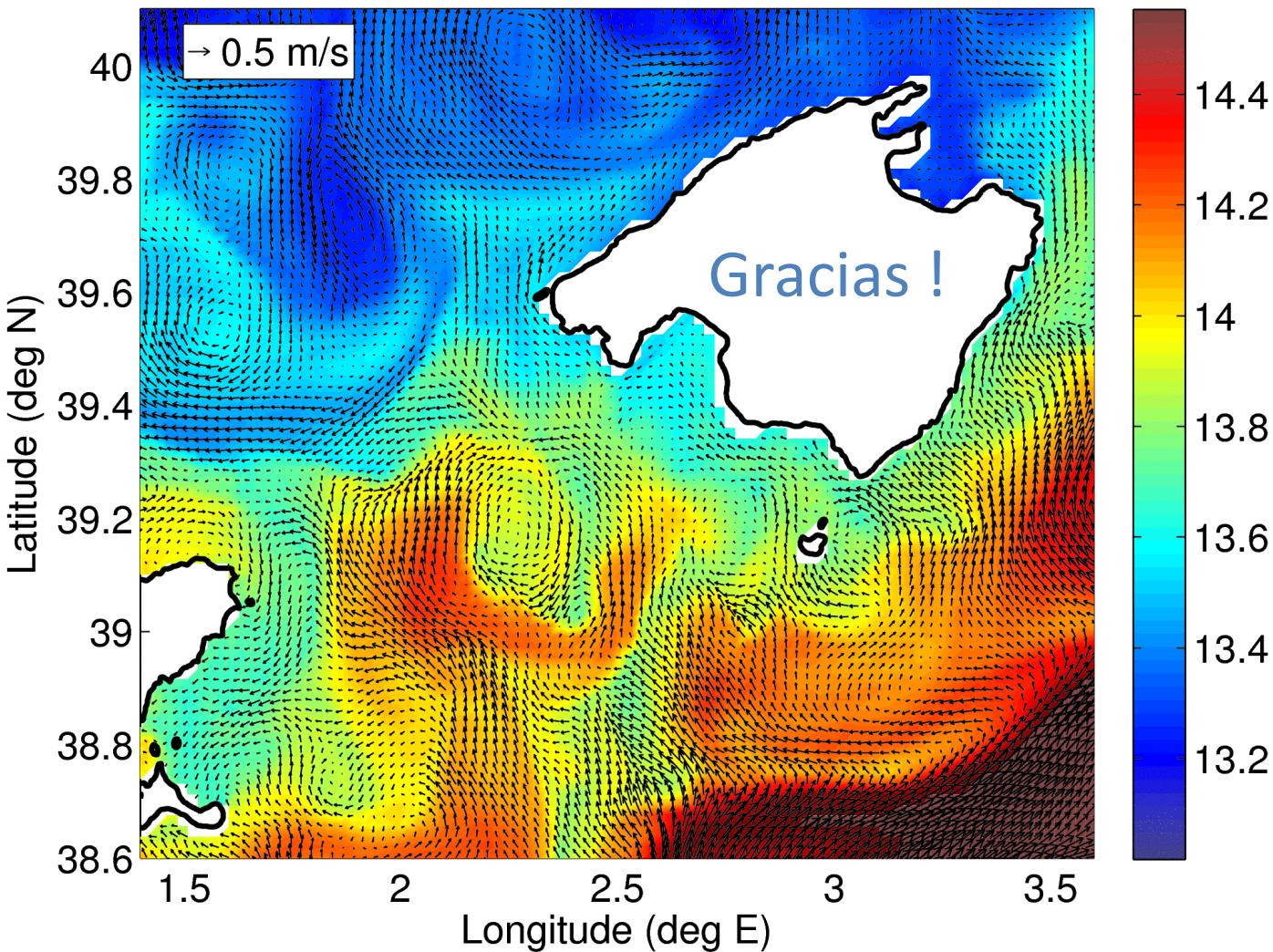
**Muestreo adapta**  
las plataform  
mc  
Campaña 20  
Reconstrucc  
geométrica



WMOP ocean forecast

valid for 13-Mar-2014 00:00:00 [lead time of 72h]

Surface temperature (deg C) and currents



## Optimum Sampling Designs for a Glider–Mooring Observing Network

A. ALVAREZ AND B. MOURRE

*NATO Undersea Research Center-NURC, La Spezia, Italy*

(Manuscript received 17 June 2011, in final form 21 October 2011)

Deep-Sea Research I 68 (2012) 68–78



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journal homepage: [www.elsevier.com/locate/dsri](http://www.elsevier.com/locate/dsri)



Instruments and Methods

Benefit assessment of glider adaptive sampling in the Ligurian Sea

Baptiste Mourre\*, Alberto Alvarez

*NURC, Viale San Bartolomeo 400, La Spezia, Italy*



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## A comparison of the performance of the 3-D super-ensemble and an ensemble Kalman filter for short-range regional ocean prediction

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## Oceanographic Field Estimates from Remote Sensing and Glider Fleets

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