

Statistical Assessment of the Black Sea Observing Systems: ARGO Floats and Altimetry During 2005-2012

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Motivation

- *Estimating the possible outcome of using profiling float data as an enhancement to the data used at present in the operational modeling of the Black Sea*

Basic questions:

- *Does using Argo data improve (and how much) the quality of state estimates based on Altimetry and SST?*
- *How much Argo data is justifying their use in operational practice? This question is similar to the one addressed for the altimetry: How much in the forecast skill degrades when the number of altimeters is varied.*

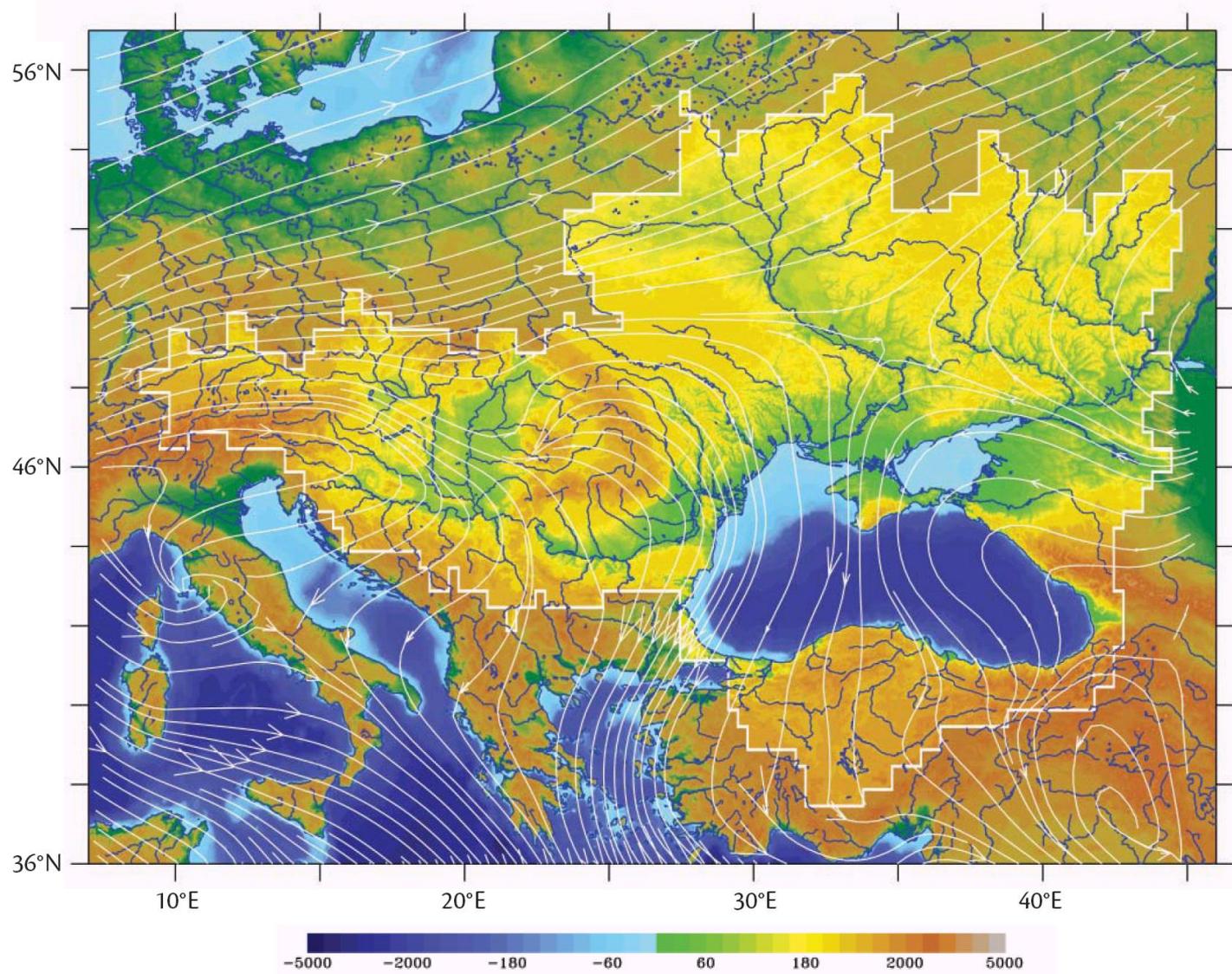
Outline

- *Black Sea circulation*
- *Profiling float observations in the Black Sea*
- *Black Sea thermohaline state as seen in Argo observations*
- *Numerical modelling and data assimilation*
- *Experiments and results*

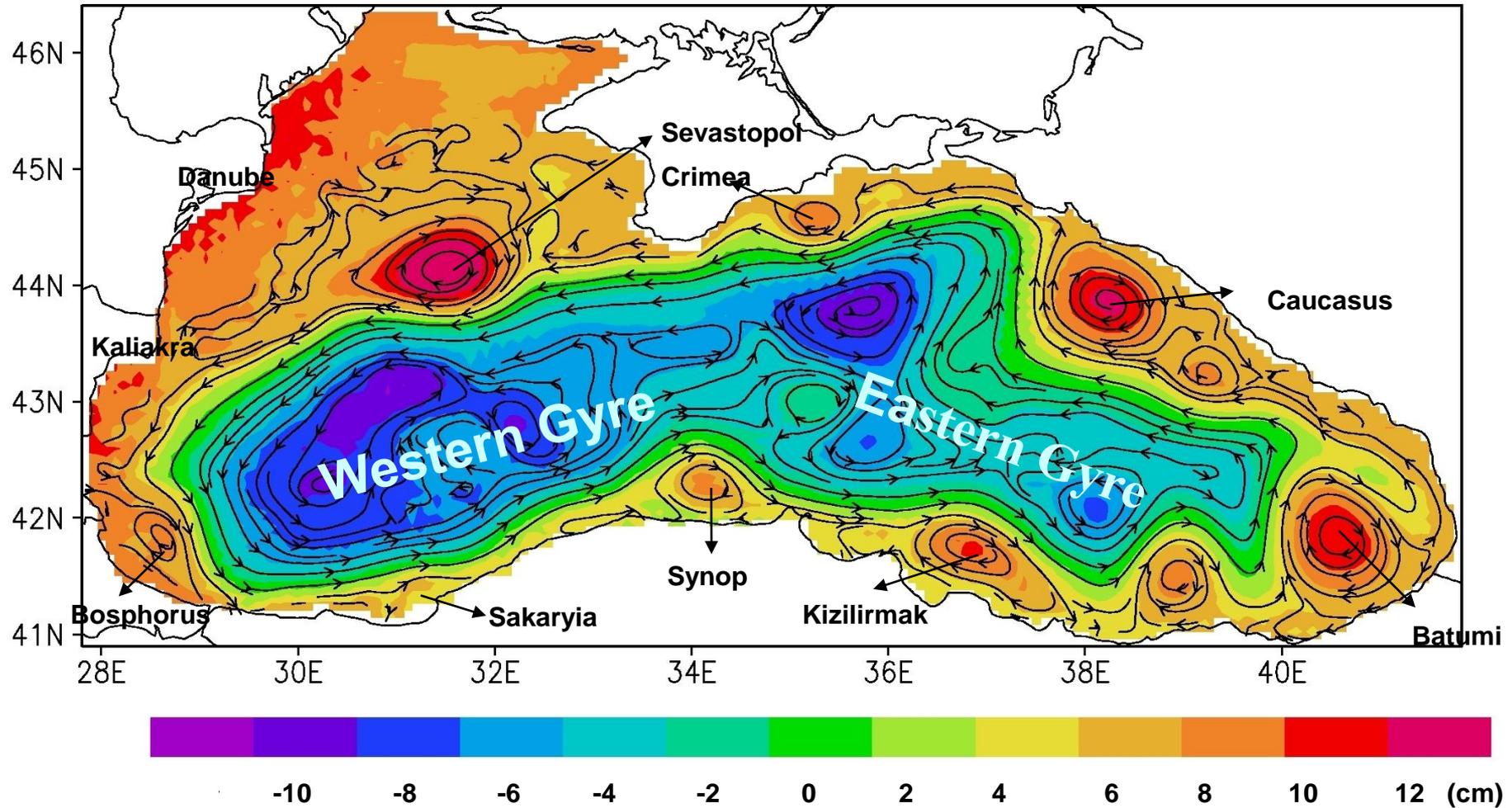
About the Black Sea: a deep estuarine basin

The total freshwater supply of $300\text{km}^3/\text{year}$ is large compared to the basin volume ($\sim 5.4 \times 10^5 \text{ km}^3$)

Unique water properties are due to small exchange in the straits.



Two-gyre circulation plus anticyclonic coastal circulation

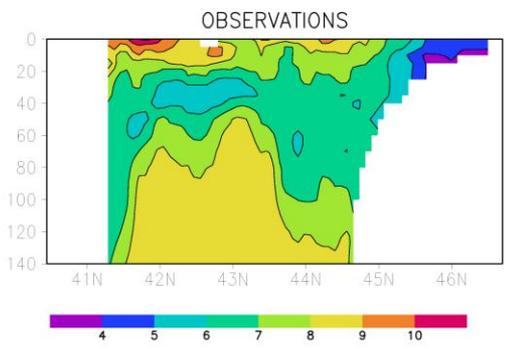
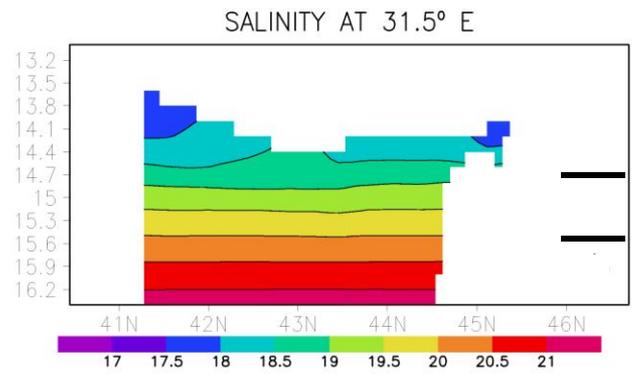
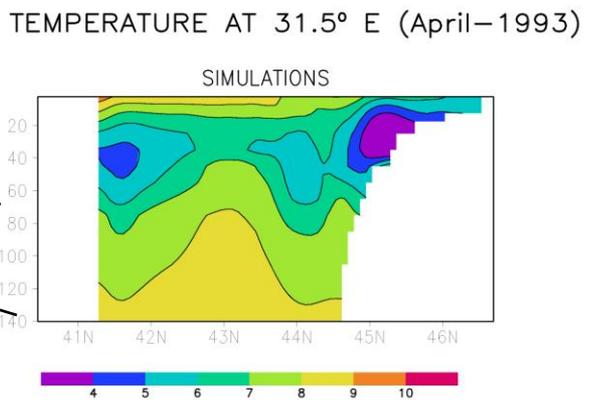
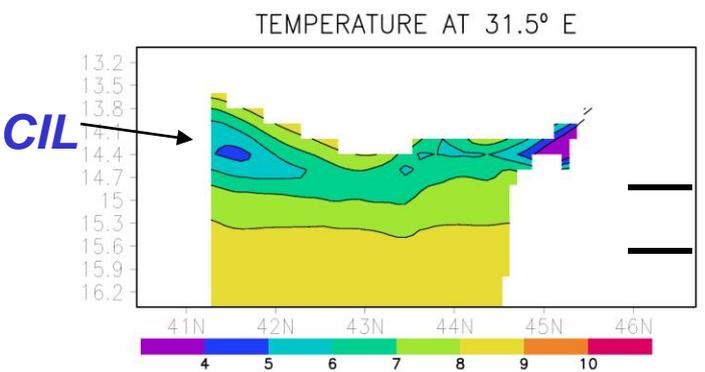


*Seasonal amplitude of sea level: ~10 cm,
winter intensification of circulation*

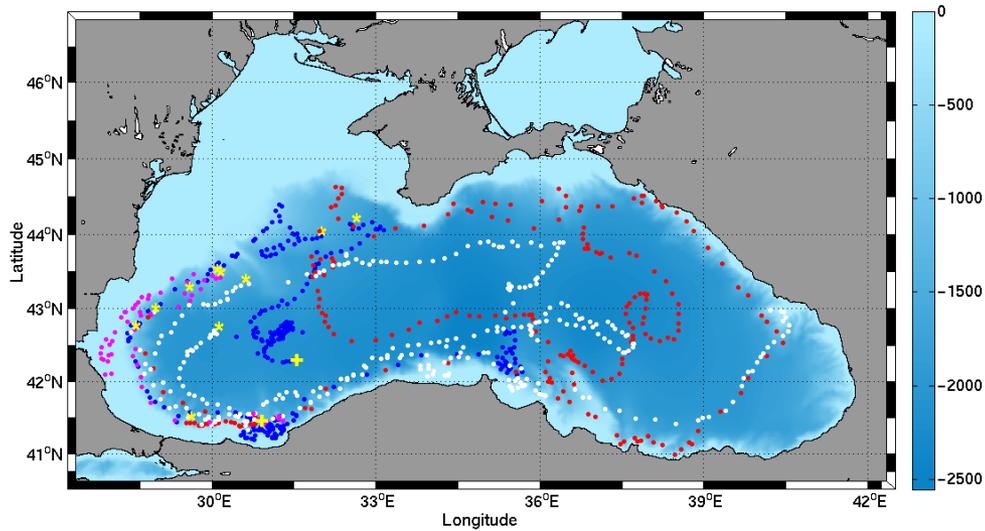
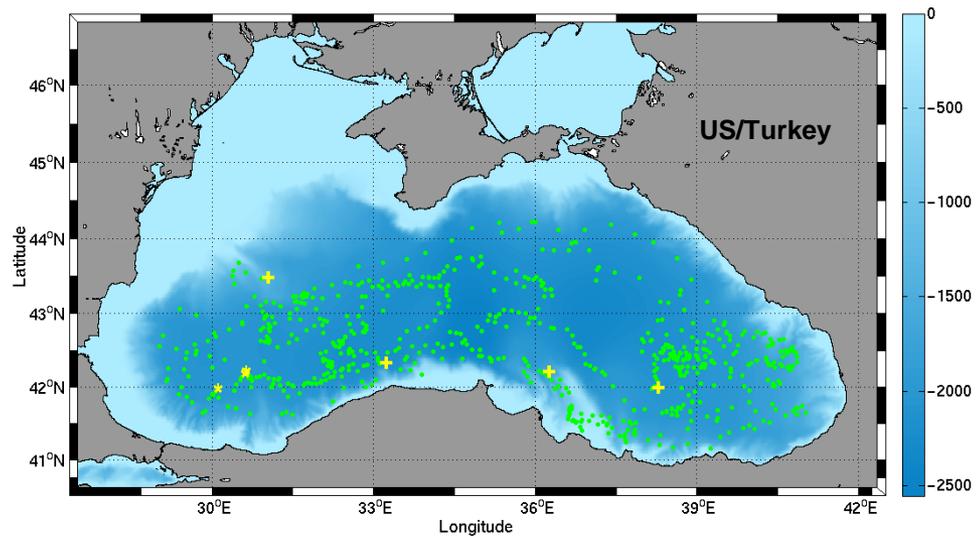
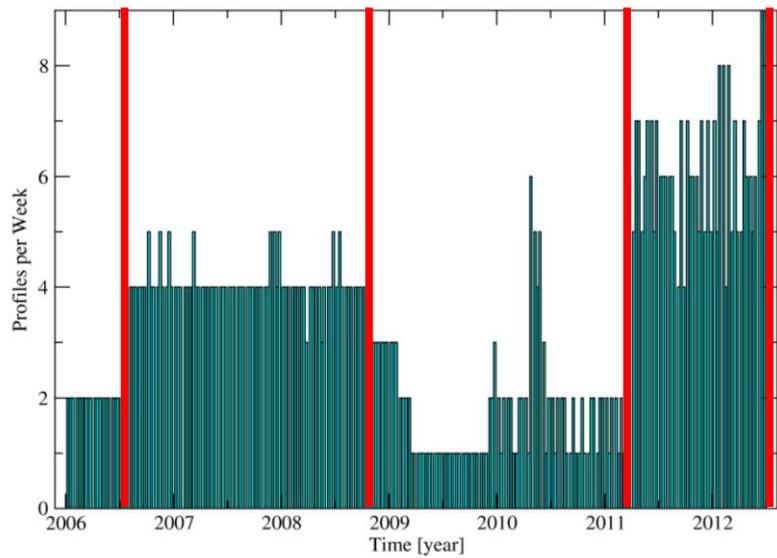
Strong vertical stratification (two layers), use of density coordinates

Below $\sigma_t = 15.5$ stratification is entirely dependent on salinity.

The vertical circulation ($\sim 10^5 \text{m}^3/\text{s}$) is much weaker than the horizontal circulation ($\sim 5 \times 10^6 \text{m}^3/\text{s}$) and comparable with the amount of water entrained by the Mediterranean plume.

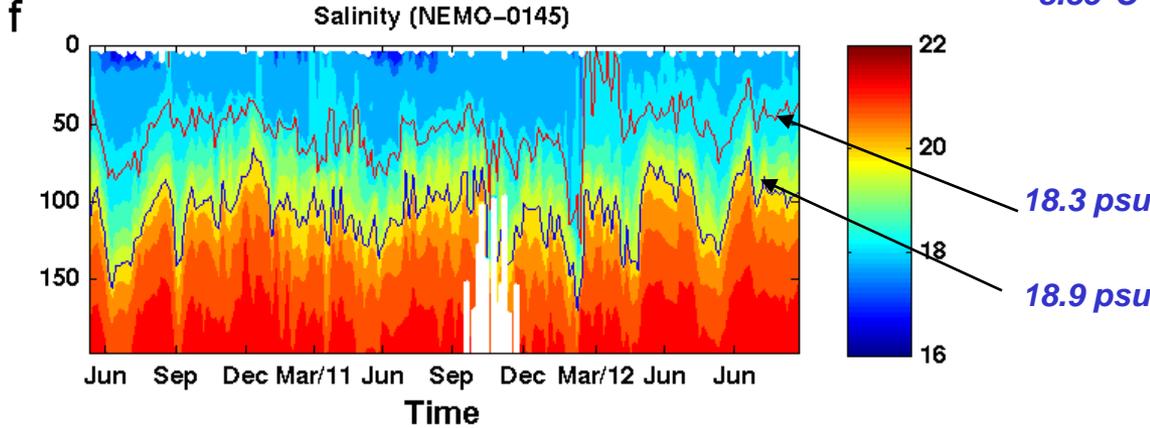
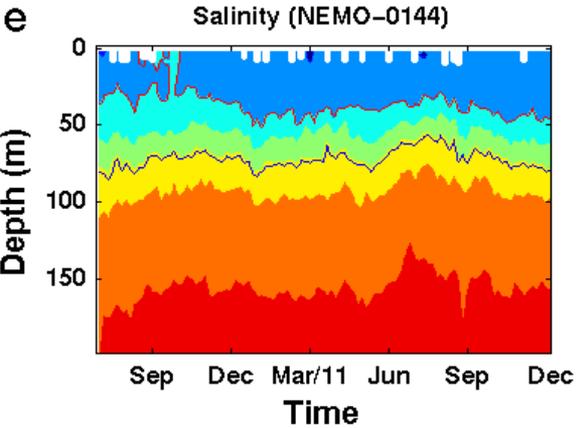
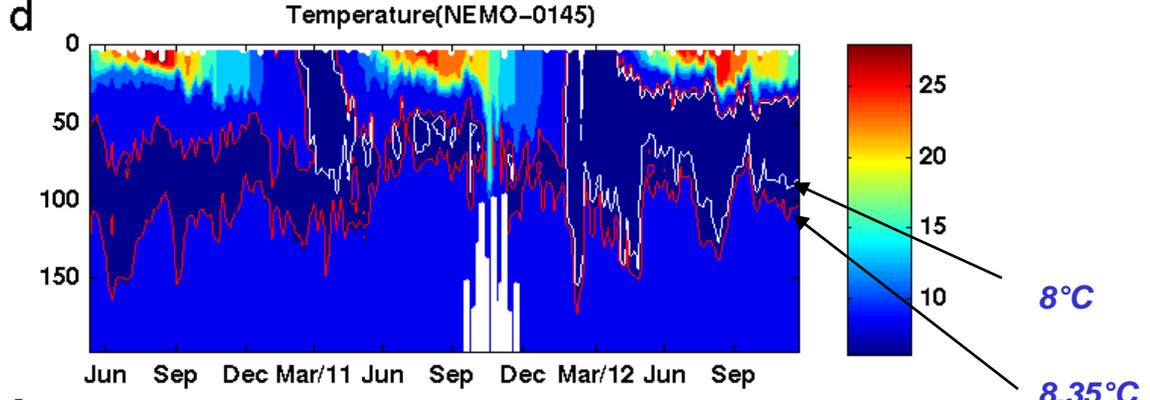
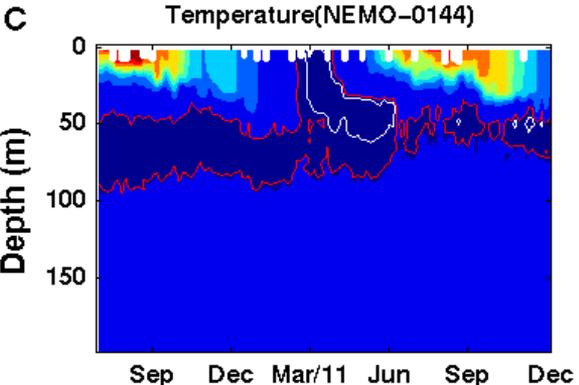


Temporal Coverage of ARGO Float Measurements



- | | |
|------------|----------|
| France | PROVOR |
| ● France | PROVOR + |
| ● Germany | NEMO + |
| ● Germany | NEMO |
| Bulgaria | APEX |
| ● Bulgaria | APEX |
| Bulgaria | APEX |
| Italy | ARVOR |
| Italy | ARVOR |
| Italy | ARVOR |

Argo is the only observation platform that provides global-scale information for constraining salinity



The model (NEMO)

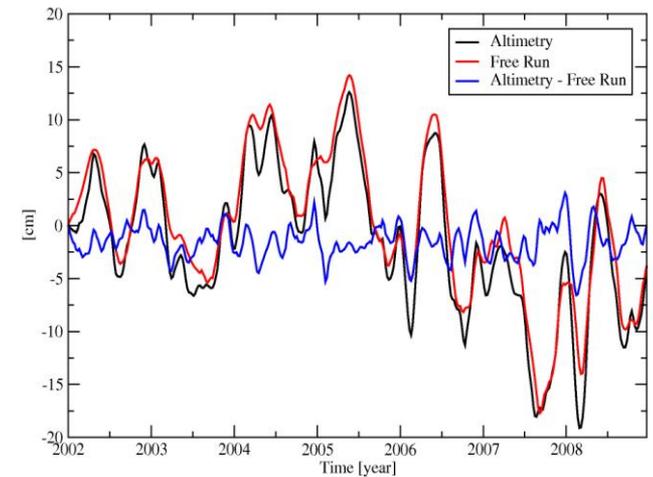
Resolution: - horizontal $\sim 1/12$ deg
- vertical 31 z-levels

Forcing: -ECMWF atmospheric data;
- statistically reconstructed river runoff;
- Bosphorus transport constrained by altimeter observation prescribed as inflow of salty water at 75m
- the Kerch straits is closed

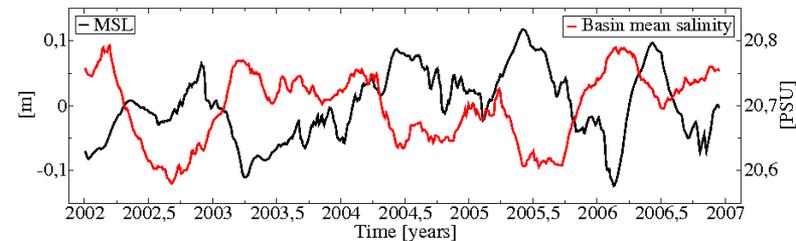
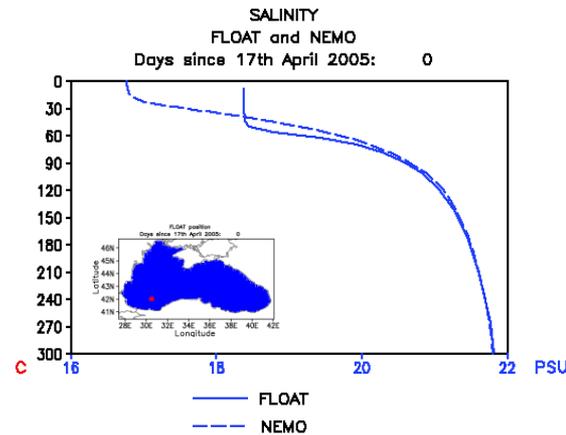
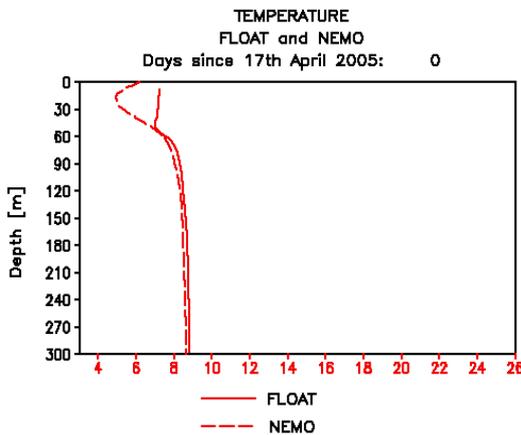
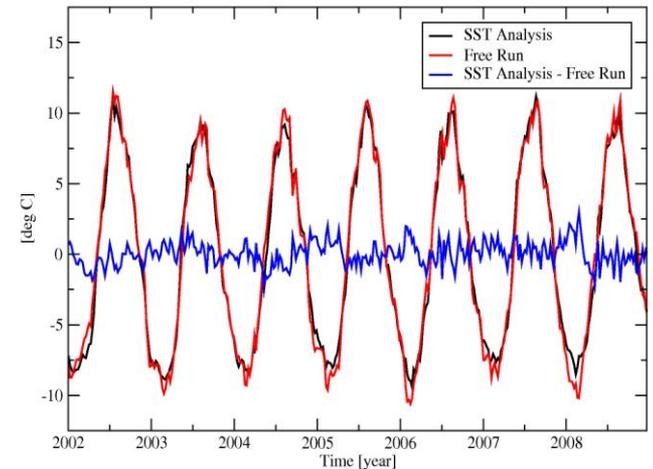
In Assimilation Mode:

- Aviso Altimetry (weakly)
- SST Analysis: Reynolds (daily)

Basin Mean SLA - Simulated Steric Signal



Basin Mean SSTA

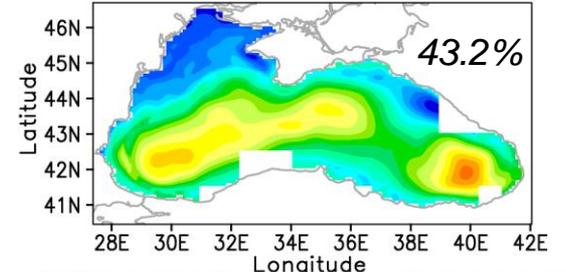
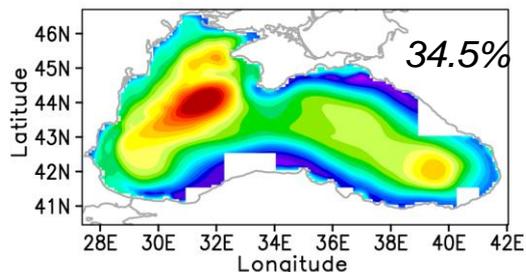
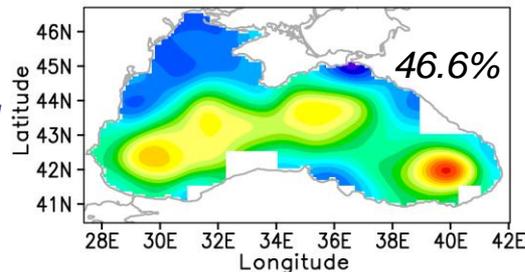


Altimetry

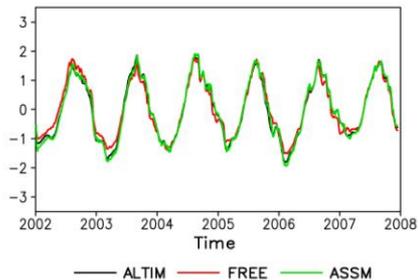
Free run

Assimilation run

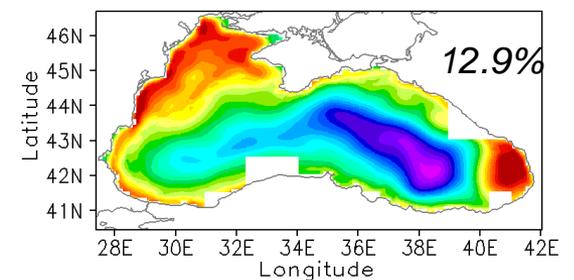
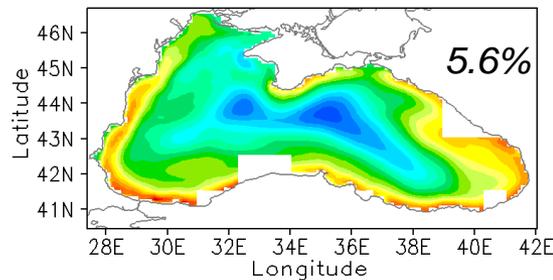
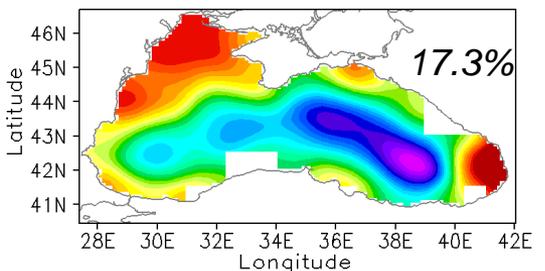
EOF-1



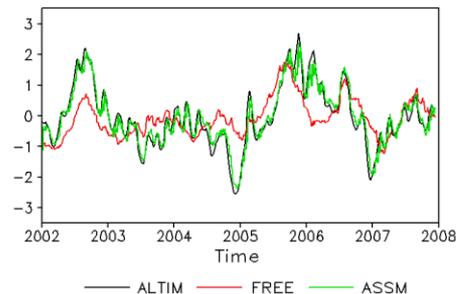
PC-1



EOF-2



PC-2



For the analyses to be described below we need a model, which has a good performance.

The General Concept of Linear State Reconstruction of hydrophysical states

*Le Hénaff et al. (2009): **representer matrix** spectra method identifies patterns in observation space, which can be well measured by the network.*

*Frolov et al. (2008): **optimal linear estimation** of the ocean state from given measurements.*

We are following Frolov et al. (2008) and look for a optimal linear estimator.

*Task: reconstruct ocean state from observations taking into account both the **prior distribution of the state** and measurement errors (**the network** is assessed in terms of its **ability to capture the natural variability** of the system).*

Simple Theory of Linear State Reconstruction of hydrophysical states. Definitions:

x ($dim=N$) is the state vector (temporal mean removed),

H ($dim=M \times N$) is the observation operator which maps X onto a measurement vector y ($dim=M$)

$$y = Hx + \epsilon$$

ϵ Gaussian measurement noise.

P the prior covariance matrix of the state vector X

G error covariance matrix

Task: using a linear approach to estimate the state X from a given measurement y :

$$x = Ky$$

That is to find the reconstruction matrix K .

Simple Theory (continued)

Using the “*model world*” we interpret X and y as full (Global) and sub-sampled (Local) state.

Then we could interpret the above method as a reconstruction of the „Global“ state from a sub-sampled state.

K minimises the absolute reconstruction error and can be found after minimizing the error of reconstruction

$$d = x - K(Hx + \epsilon) = \min$$

K is the well known Kalman gain matrix

$$K = PH^T(HPH^T + G)^{-1}$$

Simple Theory (continued)

The optimal re-construction can be interpreted as an **analysis with no information from the forecast**,

i.e., the **mean state is taken as the a priori state estimate**.

Schulz-Stellenfleth and Stanev (2010):

1. The expression for the reconstruction error simplifies to the posterior error

2. **Error estimates for the re-constructions can be calculated from the given covariance matrix and the measurement operator:**

$$\Gamma_{t_i} = \sqrt{\frac{1}{m} (P(t_i) - P(t_i)H^T (HP(t_i)H^T + R)^{-1}HP(t_i))}$$

Reduce the dimension of the problem: express the state in terms of EOFs:

$$P = VUV^T$$

To get a realistic Γ , we need to use a realistic P .

In the following demonstration P is derived from 8-years simulation.

Experiments and results

OSE:

can **assess the degradation in quality of a forecast or analysis** when where different components of the observing system are used/not used (dependence of the skill of a model on each observation type).

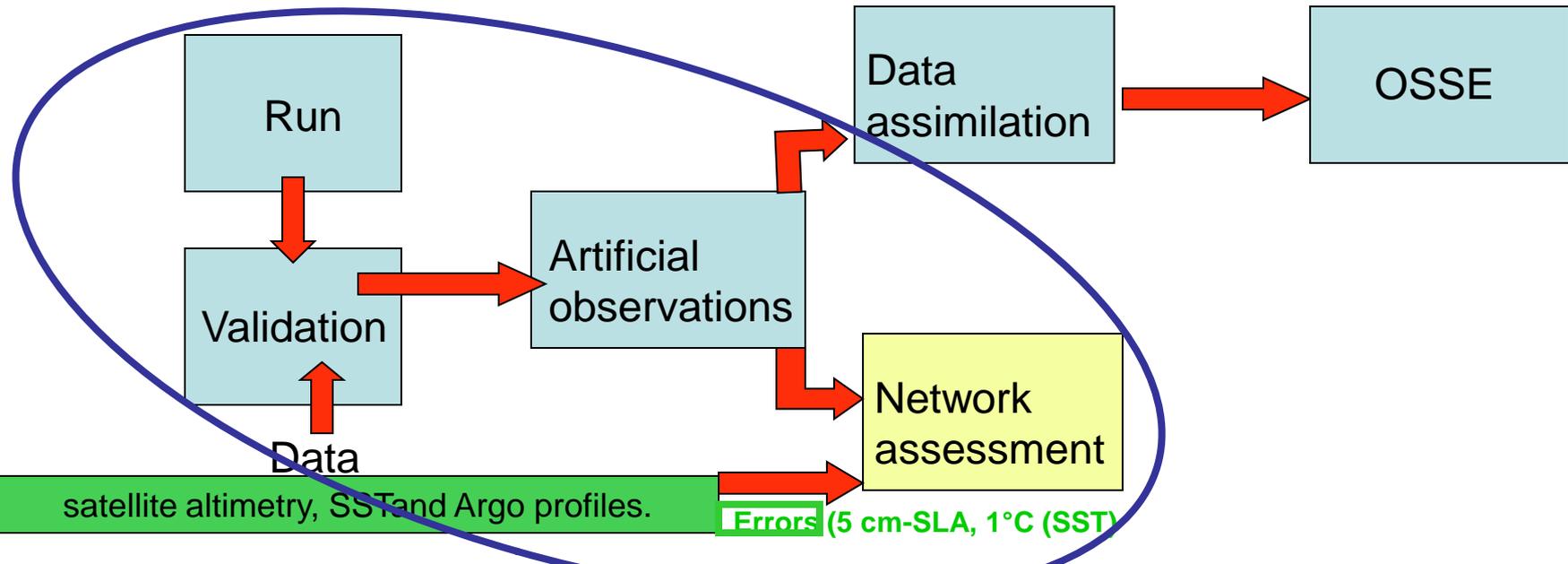
ADJOINT- and ensemble-based approaches:

can be used to design and **evaluate ocean observing systems**.

OSSEs

often involve so twin experiments, where a **model is sampled in a way that resembles real observations**, and those observations are assimilated into an alternative model.

Model

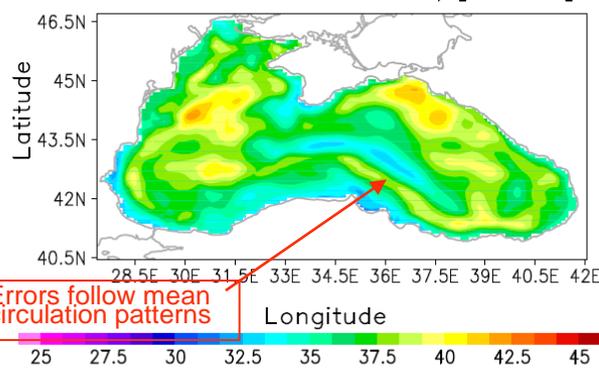


Annual mean error (**salinity**)

Fresh water zone Shows big errors

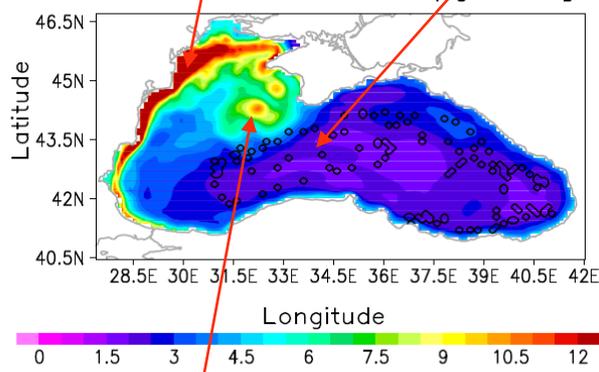
Errors are strongly dependent on the position of observations

Salt. Rec. Error Vertical Mean (0-70m)
01.06.2007 - 31.05.2008 | [% STDV]



Errors follow mean circulation patterns

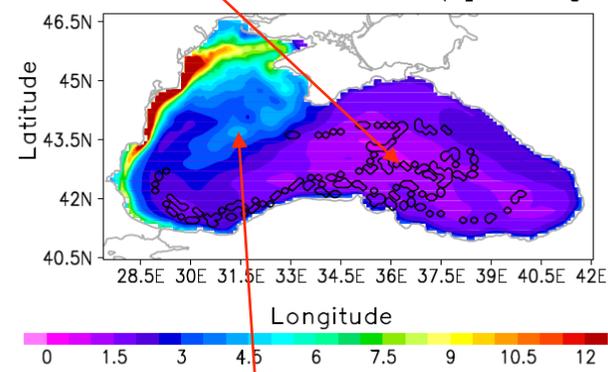
Salt. Rec. Error Vertical Mean (0-70m)
01.06.2007 - 31.05.2008 | [% STDV]



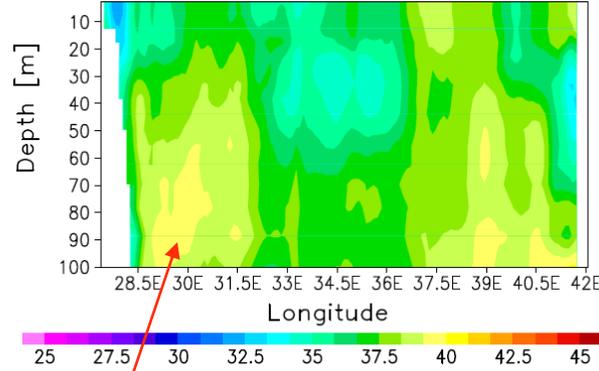
Fresh water zone Shows big errors

Errors are strongly dependent on the position of observations

Salt. Rec. Error Vertical Mean (0-70m)
01.06.2011 - 31.05.2012 | [% STDV]

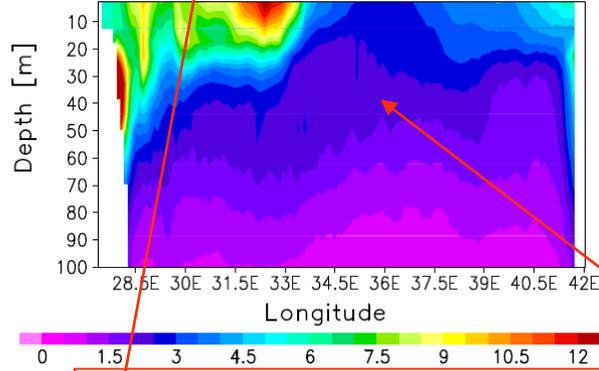


Salt. Rec. Error Horizontal Mean
01.06.2007 - 31.05.2008 | [% STDV]



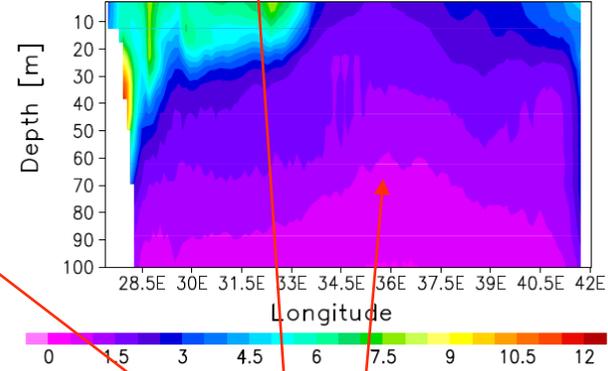
Errors increase with depth

Salt. Rec. Error Horizontal Mean
01.06.2007 - 31.05.2008 | [% STDV]



Sub-basin scale eddies (Sevastopol) show larger errors (diapycnic processes and watermass formation)

Salt. Rec. Error Horizontal Mean
01.06.2011 - 31.05.2012 | [% STDV]



Errors propagate with the water masses

2011 is not shown because observational positions (SLA) are the same and P does not differ much.

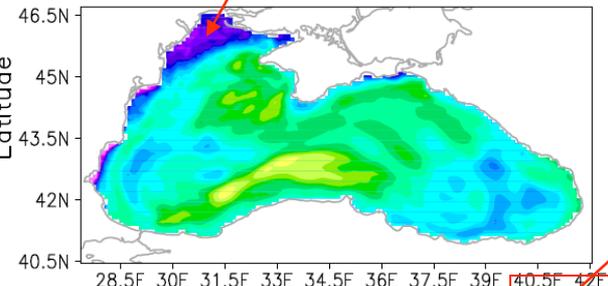
Profile data reduce substantially errors in deep ocean.

Relevance to rim current and mesoscale (eddy) variability, as well as to shelf sea salinity dynamics.

Annual mean error (**temperature**)

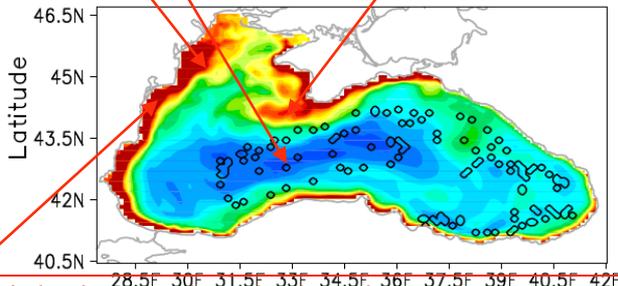
Low errors in the shallow sea

Temp. Rec. Error Vertical Mean (0-70m)
01.06.2007 - 31.05.2008 | [% STDV]



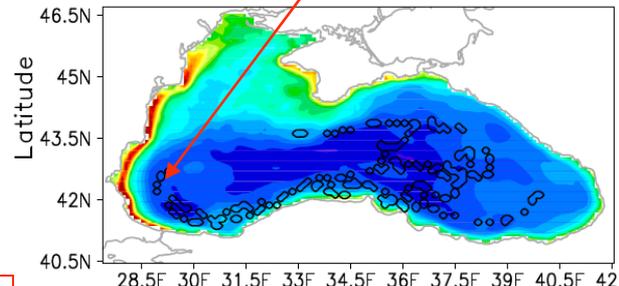
Argo data decrease the errors in the open-sea (relatively higher errors in the coastal zone and behind the headlands)

Temp. Rec. Error Vertical Mean (0-70m)
01.06.2007 - 31.05.2008 | [% STDV]

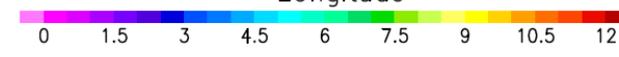
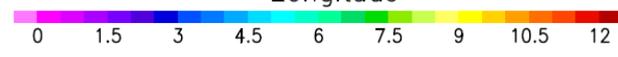
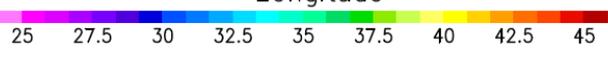


Differently from salinity, errors in individual years can change a lot (Argo closer to the Western coast).

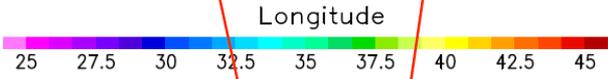
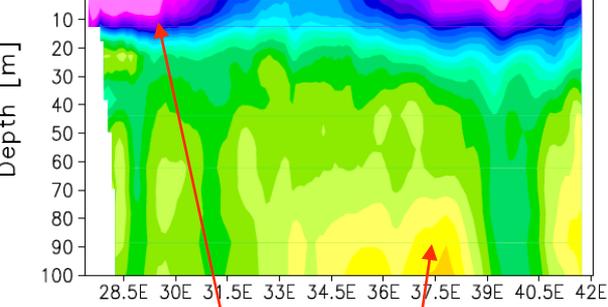
Temp. Rec. Error Vertical Mean (0-70m)
01.06.2011 - 31.05.2012 | [% STDV]



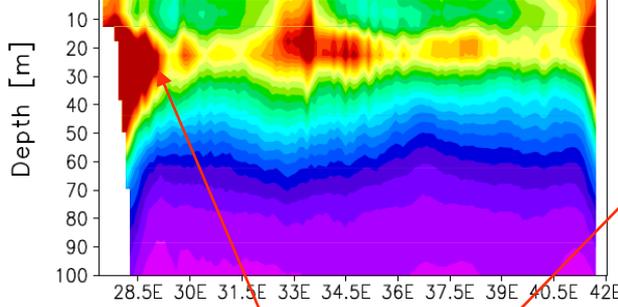
low correlation between inner basin and coastal watermasses



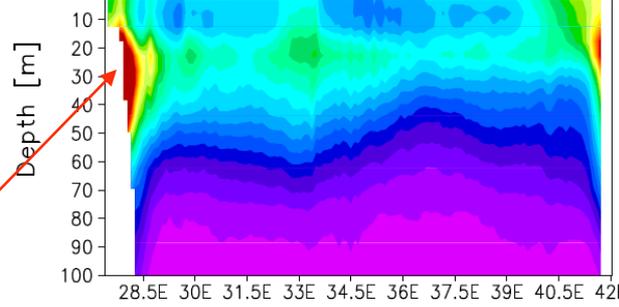
Temp. Rec. Error Horizontal Mean
01.06.2007 - 31.05.2008 | [% STDV]



Temp. Rec. Error Horizontal Mean
01.06.2007 - 31.05.2008 | [% STDV]



Temp. Rec. Error Horizontal Mean
01.06.2011 - 31.05.2012 | [% STDV]



Low errors in surface ocean
(The impact of SST observations)

CIL development
No similar problem is seen in salinity.

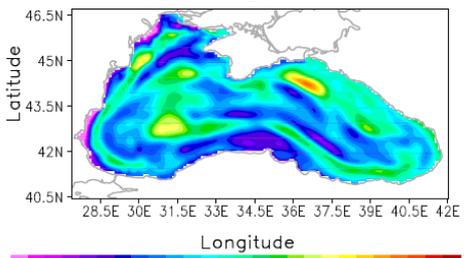
In the deep ocean the situation is similar to the one of salinity (but opposite patterns).

Relevance to mesoscale (eddy) variability, mixed layer dynamics, water mass formation (incl. upper-ocean properties).

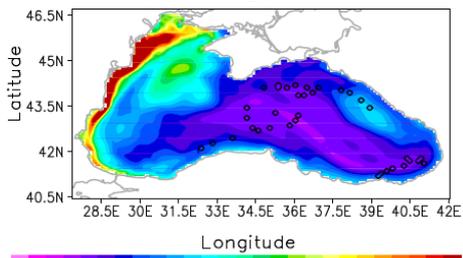
Winter

S

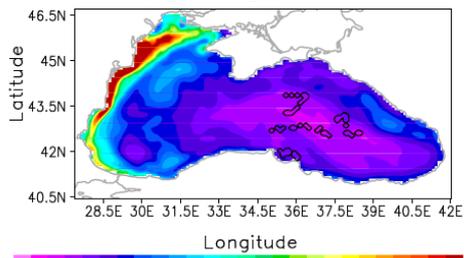
Rec. Error Vertical Mean (0-70m)
Salinity [% STDV] / DJF 2007



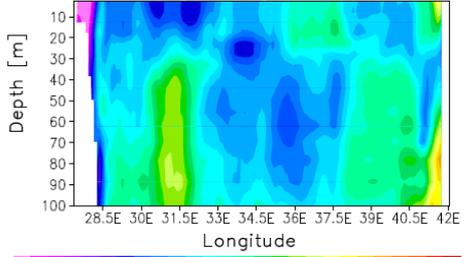
Rec. Error Vertical Mean (0-70m)
Salinity [% STDV] / DJF 2007



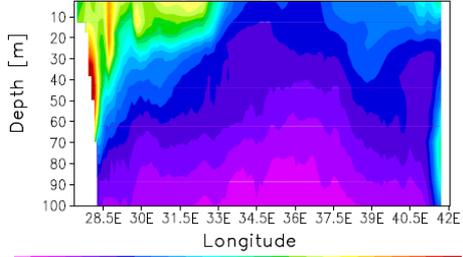
Rec. Error Vertical Mean (0-70m)
Salinity [% STDV] / DJF 2011



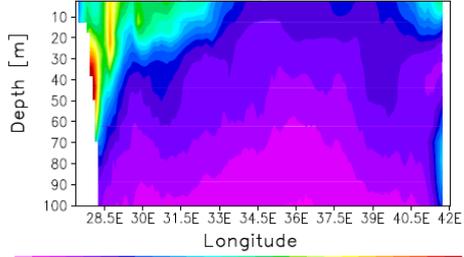
Rec. Error Horizontal Mean
Salinity [% STDV] / DJF 2007



Rec. Error Horizontal Mean
Salinity [% STDV] / DJF 2007



Rec. Error Horizontal Mean
Salinity [% STDV] / DJF 2011

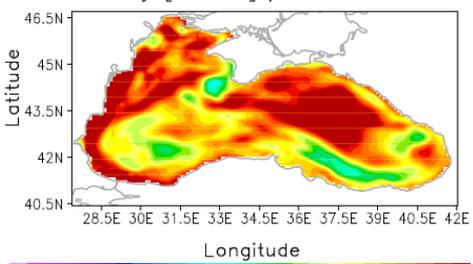


Something unexpected: the role of fresh water fluxes

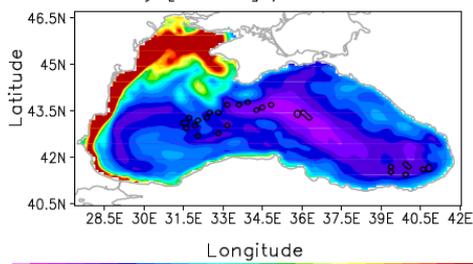
Highest seasonal reconstruction error, due to the high spring freshwater input and restratification due to heating

Spring

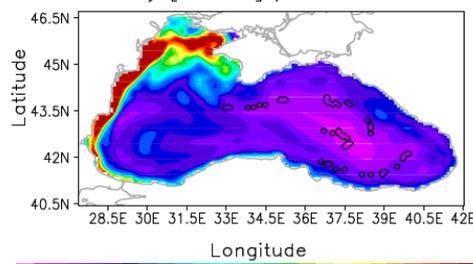
Rec. Error Vertical Mean (0-70m)
Salinity [% STDV] / MAM 2007



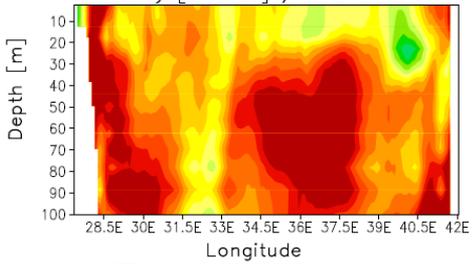
Rec. Error Vertical Mean (0-70m)
Salinity [% STDV] / MAM 2007



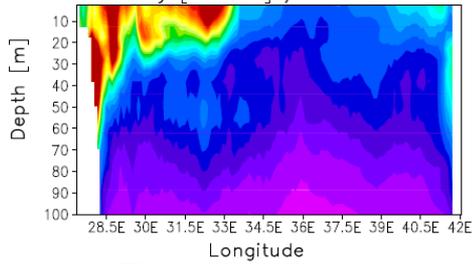
Rec. Error Vertical Mean (0-70m)
Salinity [% STDV] / MAM 2011



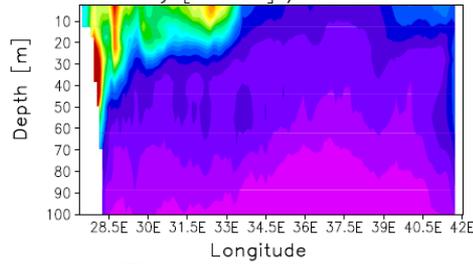
Rec. Error Horizontal Mean
Salinity [% STDV] / MAM 2007



Rec. Error Horizontal Mean
Salinity [% STDV] / MAM 2007



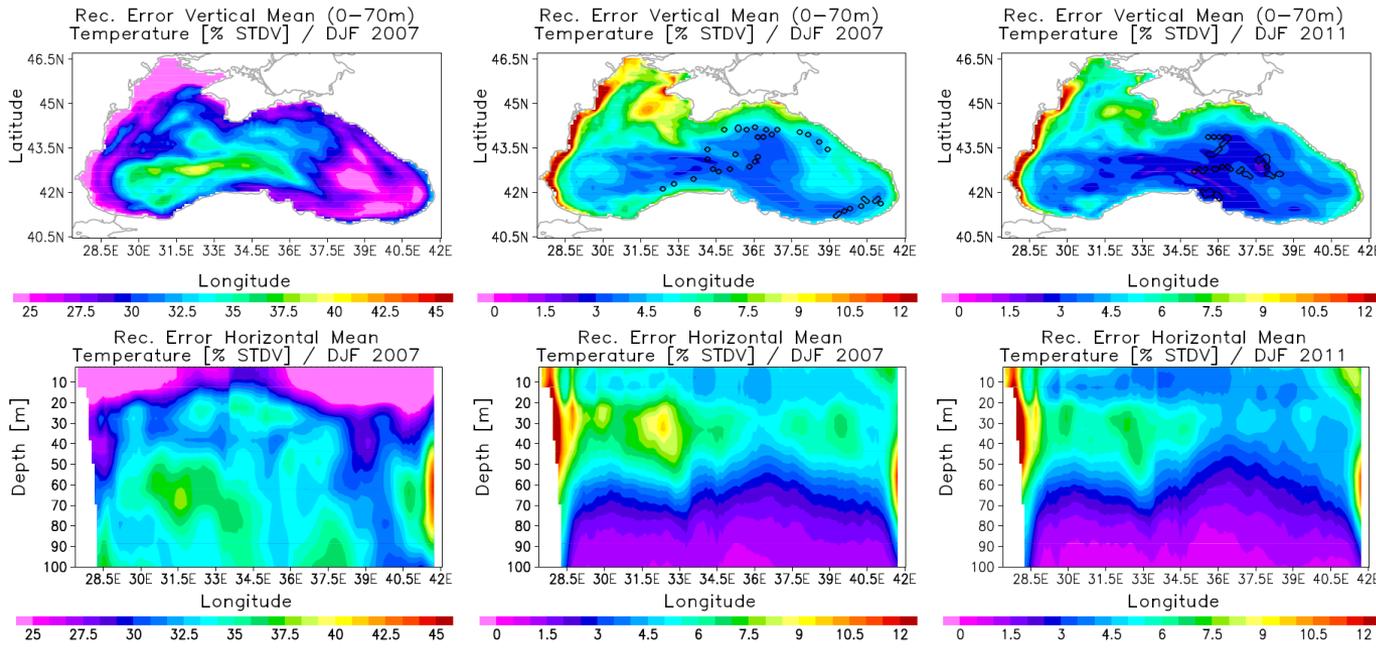
Rec. Error Horizontal Mean
Salinity [% STDV] / MAM 2011



Winter

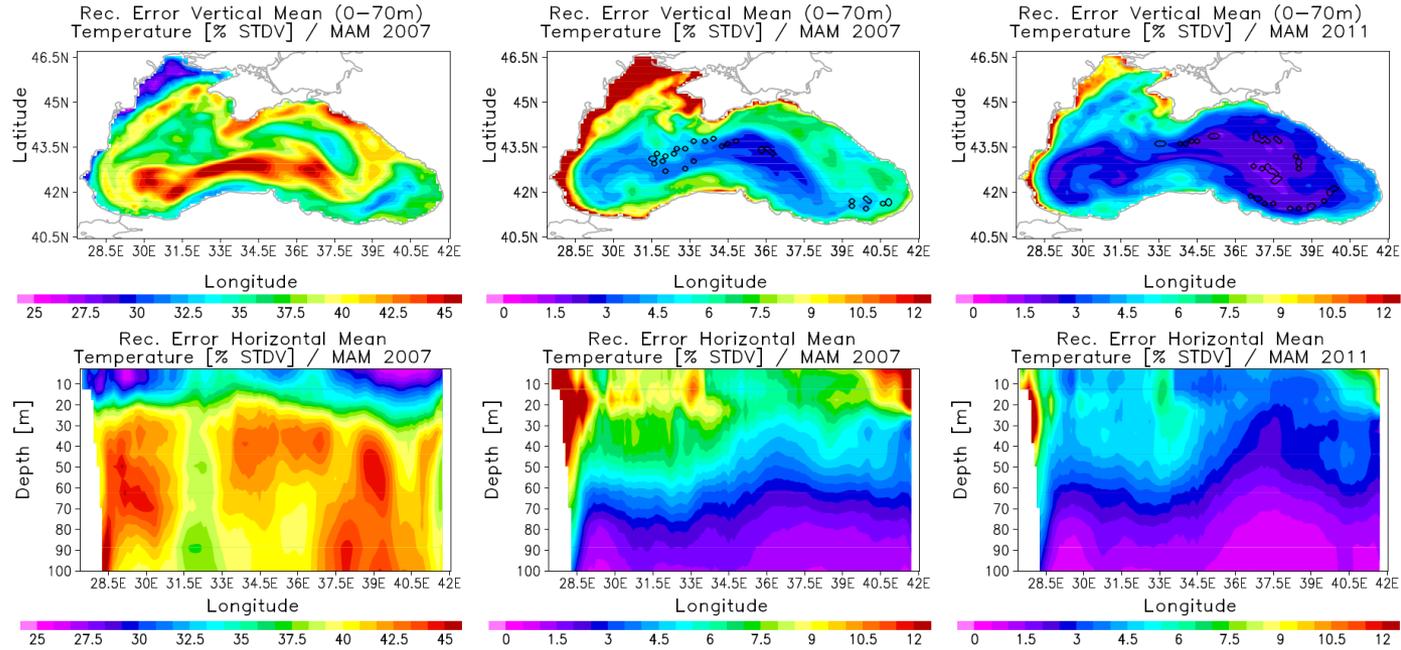
Winter mixing enables the deeper penetration of surface signals (strongest vertical mixing in shelf/anticyclonically dominated parts of the basin)

T



The role of stratification

Enhanced stratification reduces the depth of penetration of surface signals. Error field „sees“ the rim current when the stratification is strong.



Spring

Conclusions

We quantified the impact of different observations on an analysis, given the assumed errors.

In areas of intense meso-scale variability and diapycnic exchange the errors are high. Special care is needed.

Positive expectations for the transition of OSE/OSSE activities towards routine monitoring of the Black Sea observational network.