

Evolution of the Mercator global system at 1/12° with a focus on data assimilation updates

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1. Current data assimilation system

2. Main ingredients of the new system: some issues we faced and the solutions we implemented

3. Description of the main updates of the system

4. Performances of the new system compared to the current one



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- Analysis kernel:
 - Based on the SEEK kernel formulation

$$\mathbf{K} = \mathbf{S}_n \left[\mathbf{I} + (\mathbf{H} \mathbf{S}_n)^{\mathrm{T}} \mathbf{R}^{-1} (\mathbf{H} \mathbf{S}_n) \right]^{-1} (\mathbf{H} \mathbf{S}_n)^{\mathrm{T}} \mathbf{R}^{-1}$$

- 3DFGAT method to calculate innovation vector
- 2D_{x,y} Localization technique
- Background error covariances P^f: multivariate 3D anomalies
 - State vector SIC, SIU, SIV, SITHI, SITEM,SST, H, HBRST, HBAR, T, S, U, V
 - Sub-space is built from an ensemble of anomalies (A)

$$\mathbf{P}^{\mathrm{f}} = \frac{1}{n} \mathbf{A} \mathbf{A}^{\mathrm{T}} = \mathbf{S}_{n} \mathbf{S}_{n}^{\mathrm{T}}$$

Adaptive scheme for the background error variance

<u>IAU</u>:

Incremental Analysis Update \rightarrow to distribute the correction in time on *H*, *T*, *S*, *U*, *V*, *SI*

Assimilated observations:

Altimetric along-track SLA, satellite SST, T/S vertical profiles (Argo network, XBTs, CTDs, ...), satellite sea ice concentration



Analysis kernel:

+ 3D-Var T/S large scale bias correction

 $P^{f} = \frac{1}{A}A^{T} = S_{u}S_{u}^{T}$

Based on the SEEK kernel formulation

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Represented by 3D modes coming from a set of anomalies (statistical approach)

> The method consists to generate a set of anomalies from a long simulation





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Use of this set of anomalies for the analysis stage to compute P^f





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Adaptive Scheme for the background error variance

The adaptativity technic is based on the work of Desroziers and Ivanov (2001) and aims to estimate a scalar α for each local region, that multiplies the local restriction of **P** in order to be consistent with innovation statistics, so that the following equation is satisfied for each local region and each analysis cycle:

 $d^T[\boldsymbol{\alpha}(HS)(HS)^T + R] d = n$

n = number of independent data

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CATOR

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Objective: Develop a new version of PSY4 in order to improve, among others:

- Analysis and forecast skills, representation of mesoscale activity
- Mass / steric distribution (loss of mass and too much steric in the current system...)
- Equatorial dynamics and interaction with biogeochemistry



The new less filtered SLA data contains a lot of noise (significant below 30 km)



EPCATOR

Cloud Dispersion

inc vs inno in SLA near 60w40n on 20130417



→ A lot of spread in the innovation !

A lot of correlated noise in the SST L3S ODYSSEA

IEPCATOR







→ Estimation of the radius of observations decorrelation

- · Use innovation statistics from a dense observing network
- Assume horizontally uncorrelated observation errors
- Calculate a histogram of background innovation covariances binned by horizontal separation
- Fit an isotropic correlation model, extrapolate to zero separation to estimate the correlated (forecast) and uncorrelated (observation) error partition

HL1986 decorrelation scale in SST



HL1986 decorrelation scale in SLA

 \rightarrow The correlated noise of SLA under **70 km** is often dominant.

 \rightarrow The correlated noise of SST under **40 km** is often dominant.



- → Need for the SEEK analysis to use super-observations (SLA and SST) to filter out scales that the model does not resolve (we use the previous values of correlation estimated with the HL1986 method)
- → Use of dedicated L3S SST observation errors
- → Use of DUACS (SLA) and OSTIA (SST) L4 gridded products to adapt the background error variance. These data are different from those assimilated in the new system, which was not possible in the previous analysis system



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Update of NEMO version

❑ Update of the NEMO model with the possibility to activate new numerical schemes (Time-splitting, VVL) and new functionalities (parallel I/O management), update of sea-ice model (LIM2 → LIM3) and use of multi sea ice categories



Use of new anomalies base

❑ Update of the NEMO model with the possibility to activate new numerical schemes (Time-splitting, VVL) and new functionalities (parallel I/O management), update of sea-ice model (LIM2 → LIM3) and use of multi sea ice categories

□ Use of a **new anomalies base** computed from GLORYS12 reanalysis



Use of new anomalies base

Power spectral density of the SSH anomalies over the Gulf Stream region



Anomalies bases	Spatial filtering (Shapiro)	Temporal filtering (Hanning)
	~ 7 dx	~ 24 days
	~ 4 dx	~ 24 days
	~ 4 dx	~ 48 days

As the analysis increment is a linear combination of anomalies, this allows us to get an idea of the scales that the analysis system will be able to correct.





Impact of the new background error covariances

from Benkiran et al., 2021



Standard deviation of the SSH error



25



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□ Use a 4D version of analysis



The 4D method uses an ensemble of trajectories of climatological model anomalies to fit the innovation in the Data Assimilation window. The 4D scheme allows a better approximation of the anomaly matrix.



from Benkiran et al., 2021



The S_{4D} covariance matrix corresponds to the S_{3D} matrix augmented with past and future anomaly matrices. In the 4D method the obs operator applied to the anomalies takes into account the temporal dimension.



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New hybrid MDT

❑ Update of the NEMO model with the possibility to activate new numerical schemes (Time-splitting, VVL) and new functionalities (parallel I/O management), update of sea-ice model (LIM2 → LIM3) and use of multi sea ice categories

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□ Use a 4D version of analysis

□ New hybrid MDT



New hybrid MDT

from Gasparin et al., 2021





a-b-c : mean of surface Chl concentration *minus* obs.

d-e-f : equatorial section of mean nitrate concentration *minus* obs.

The use of biased MDT for the assimilation of altimetry causes **unrealistic upwelling** by reducing the horizontal convergence in the western equatorial Pacific.



Optimization of bias correction

❑ Update of the NEMO model with the possibility to activate new numerical schemes (Time-splitting, VVL) and new functionalities (parallel I/O management), update of sea-ice model (LIM2 → LIM3) and use of multi sea ice categories

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New hybrid MDT

Optimization of bias correction



Parameters optimization for bias correction

Residual of temperature at 140 m (left: actual parameters, right: new optimized parameters)





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The influence of SLA and SST L3S on the multivariate analysis, which is the slope between increment and innovation, is strong in the new system (a slope > 40% is ideal)

Influence of SLA (old system PSY4)



-50 -30 -10 10 30 50

Influence of SST (old system PSY4)



Mm -- 10.690 * Mm - 32.506

Influence of SLA (new system GLO12)



Influence of SST (new system GLO12)







Cloud Dispersion

residual vs innovation in T on 20130807 at 156m

Cloud Dispersion residual vs innovation in T on 20130807 at 156m





Cloud Dispersion

Performances of the system

Cloud Dispersion

residual vs innovation in T on 20130807 at 1942m residual vs innovation in T on 20130807 at 1942m 0.4 0.4 **GLO12** PSY4 Celsius Celsius celsi⊔s Celsi⊔s residual in residual in 1950 m .⊆ 2, 0.0 - Lesidual 0.0 v.o-v.o-Celsius Celsius -0.4-0.4-0.2 0.0 0.2 innovation in Celsius -0.4 0.4 -0.4 -0.2 0.0 0.2 innovation in Celsius 0.4 0.94 -0.00 0.01 0.02 0.98 0.59 0.00 0.02 0.06 0.82 fit slope fit bias Fit slope Fit bios Desroziers obs ratio = 1.4Desroziers obs ratio = 1.2fit err fit err stddev stddey correlation correlation



Cloud Dispersion

residual vs innovation in S on 20130807 at 92m

residual

∃'

psu

0.25 -0.00 0.03 0.12 0.66

Cloud Dispersion residual vs innovation in S on 20130807 at 92m





Cloud Dispersion

residual vs innovation in S on 20130807 at 1942m

Cloud Dispersion residual vs innovation in S on 20130807 at 1942m





The SEEK analysis of GLO12 is well balanced on the vertical and between T and S We are close to 1 which represents the optimum



CORREL = correlation between innovation and increment

AMPL= optimal increment amplification that minimizes the analysis residual without taking into account system errors DRZ = ratio from Desroziers diagnostic



SST innovations are larger and noisier with ODYSSEA than with OSTIA in cold stratified seas

OSTIA minus PSY4 on 07-08-2013





ODYSSEA minus GLO12 on 07-08-2013







GLO12 has less regional bias in SLA El Nino 2015 is better predicted

PSY4 mean SLA innovation in 2015



GLO12 mean SLA innovation in 2015



- 0.4 0 0.4



Mean salinity bias







RMS salinity









RMSE / Mean bias (analysis – obs) for Salinity 0 – 500 m





MERCATOR





SST





Mean bias (analysis – obs) for SST



j2

c2

h2

i2n

j3

i2

c2

j1q

h2

i2n

jЗ

— s3a

— s3a







SIC







MERCATOR

from Bourdallé-Badie's heavy work...



Global evolution of Mass, Steric and total SSH



Production of a new simulation at 1/12° from October 2016 to present
→ In parallel, two "twin" simulations will be performed (1/4° with assimilation, 1/12° without assimilation)

Transfer to the "operational team" for a near-real time production



Extra slides



Summary

A major release is planned for the end of 2022. The objective is to improve, among others, the analysis and forecast skills, the representation of mesoscale activity, the mass/steric distribution (loss of mass and too much steric in the current system), the equatorial dynamics and interaction with biogeochemistry. This release will include:

- A new version of NEMO (more coherent bulk formulation, more advanced sea ice model with the possibility to represent the ice in different categories).
- The use of high resolution spatial and temporal atmospheric forcing.
- The assimilation of L3 ODYSSEA SST product instead of L4 OSTIA.
- The use of a refined Mean Dynamic Topography allowing, among others, to better represent the equatorial dynamics.
- The use of a new anomalies base from GLORYS12 Mercator reanalysis.
- The use of a 4D approach with the data assimilation scheme, allowing an improvement in the spatiotemporal continuity of mesoscale structures.
- The use of assimilated "super-observations" to filter out scales that the model does not resolve.
- An improvement of mass/steric separation during data assimilation with the inclusion of monthly corrections of GMSL instead of a trend.
- An improvement of the parameterizations of the temperature and salinity bias correction method.



Construction of super-observations

ODYSSEA SST L3S



- Red dots are ORCA0.5 T-grid points and black lines represent the grid element associated with the red dots
- NEMO fields are « average » values of the black mesh.
- SST L3S has a much higher resolution than ORCA0.5 (analysis resolution) in terms of number of data points and resolved structures.
- Gradients within each mesh are not resolved by the analysis.



Construction of super-observations

<u>SLA</u>

