



# Towards probabilistic analyses and predictions of the Green Ocean using a stochastic NEMO-PISCES modelling system

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# Context / motivations / goals

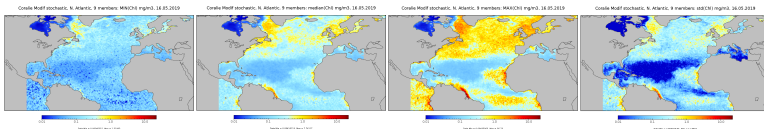
- ▶ **H2020 SEAMLESS general objective and motivation** : provide CMEMS with **robust modelling/assimilation methods** to deliver useful **indicators** of climate-change impacts and food security in marine ecosystems.
- ▶ **Among the blocking points** : Many **CMEMS MFC products** describing ocean ecosystems and BGC currently **do not include robust uncertainty estimates**.
- ▶ **IGE team goals** : Explore **innovative inversion methods to unlock pitfalls of CMEMS operational systems**, with a focus on GLO/IBI MFC "Green Ocean" applications, through:
  - ✓ Transition **from deterministic to probabilistic ocean BGC modelling** based on stochastic parameterizations of uncertainty sources, and
  - ✓ ...development of **ensemble-based inversion methods** dealing with non Gaussian pdfs to assimilate CMEMS L3 Ocean Colour data.



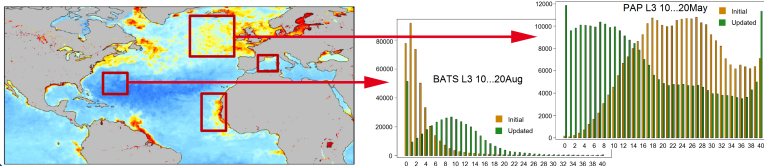
# Methodology

**Approach** : *Decoupling between (i) prior pdf generation using full-complexity physical/BGC model, and (ii) Bayesian inversion step (including local anamorphic transformations, Brankart et al., 2012)*

- (i) **Prior pdf** : 2019 GLO NEMO-PISCES 40-member ensemble NEMO-PISCES based on stochastic perturbations, assuming uncertain bio parameters, mesoscale feature locations and subgrid-scale processes (Garnier et al., 2016; Leroux et al., 2022).

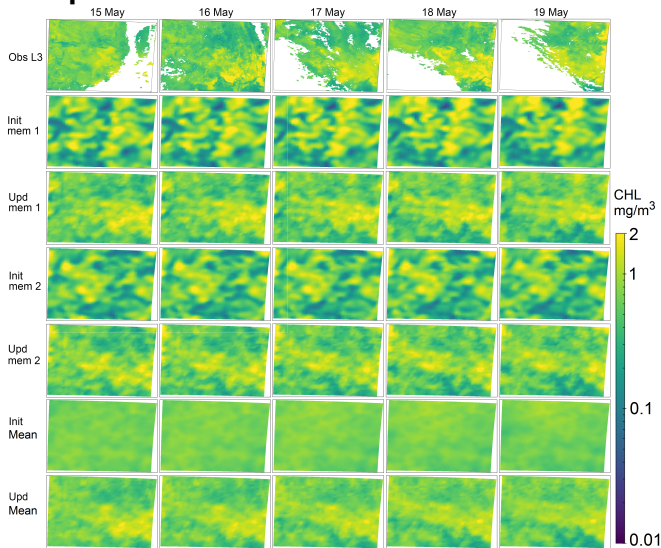


- (ii) **Posterior pdf** : 4D multivariate regional inversions of L3 CMEMS OC data using LETKF/SEEK (smoother-like scheme with space-time localization).



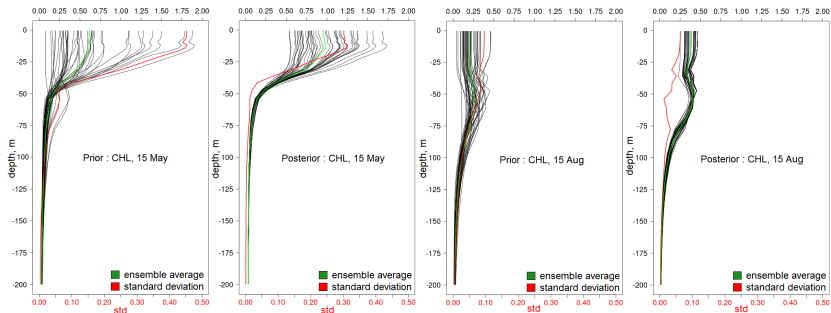
# Space-time estimation for PAP (16°30'W, 48°50'N)

## Surface maps



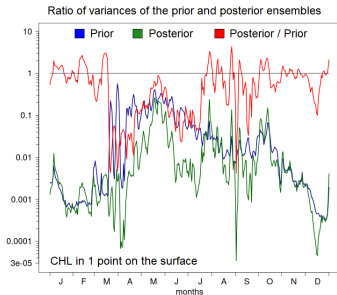
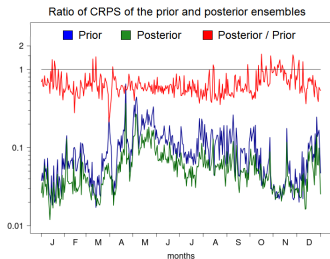
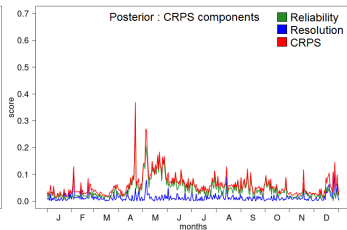
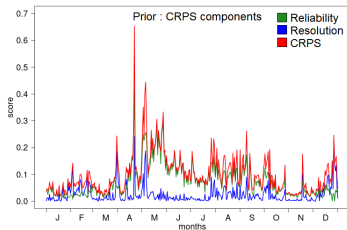
# Space-time estimation for PAP (16°30'W, 48°50'N)

## Projection of surface OC information on the vertical



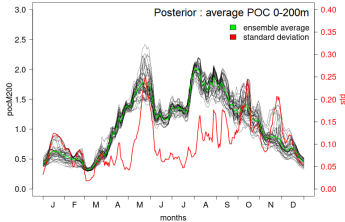
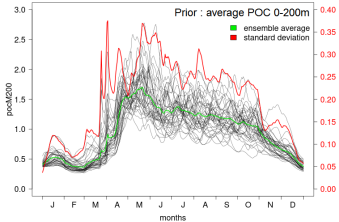
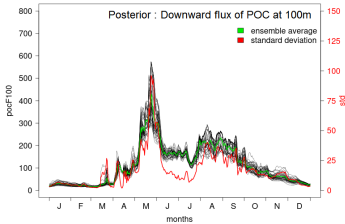
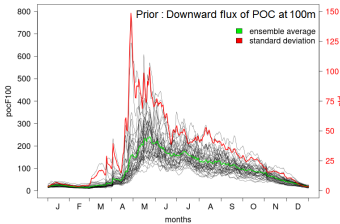
# Metrics for PAP (16°30'W, 48°50'N)

## Posterior/prior CRPS and ensemble variance in 1 point



# Uncertainty reduction for selected indicators

- ✓ Downward flux of Particulate Organic Carbon interpolated at 100m
- ✓ Average POC content, 0–200 m



# Conclusions...

- A **new 4D space-time scheme** has been developed as a natural extension to sequential ensemble analysis/forecast in place today (such as LETKF) in CMEMS MFCs.
- **Controlability of key indicators** (POC, NPP, trophic efficiency) is demonstrated in PAP region, except for specific time periods. Other results (not shown here) suggest lower performance in BATS region.
- Accounting of additional (or **revising assumptions** about the) uncertainty sources in models and assimilated data is **part of the process**.
- The overall approach provides a **methodology to help decide whether to faithfully catalog a new product** with objective added value to users and scientists.

## ...and perspectives

- ✓ **Ongoing**: exploration of the skill of the method for **probabilistic forecasts** (and associated predictability time scales).
- ✓ **Next step**: **joint inversion of satellite ocean color and altimetric data**, bringing additional constraints and further reduction of uncertainties on estimated quantities.
- ✓ **Sensitivity to observation error statistics** needs further investigation.

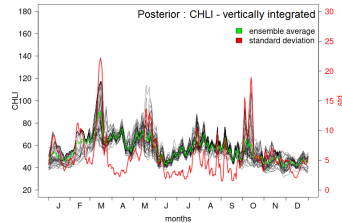
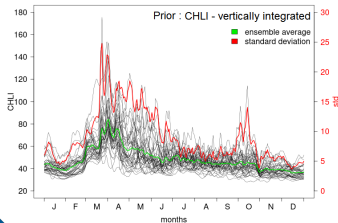
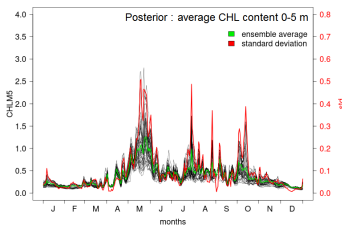
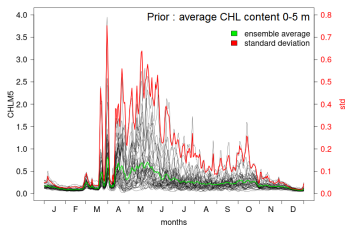


THANK YOU



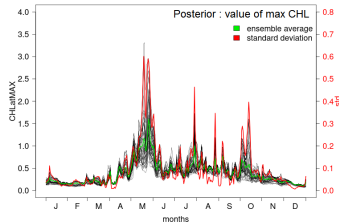
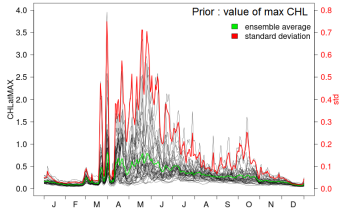
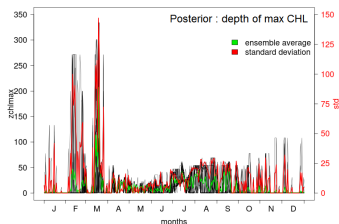
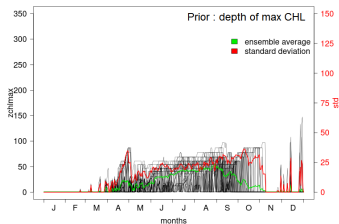
# Appendix: Uncertainty reduction for selected indicators

- ✓ Chlorophyll average (0–5 m)
- ✓ Chlorophyll - vertically integrated (0 – bottom)



# Appendix: Uncertainty reduction for selected indicators

- ✓ Depth of Max CHL (straight computation)
- ✓ Max CHL along the vertical



# Appendix: Uncertainty reduction for selected indicators

- ✓ Average ( DIA/PHYTO ) where TotPhyto>0.01
- ✓ Depth of max nitracline gradient

