

#### Predicting the green ocean: main achievements from the CMEMS biogeochemical models and perspectives.

Marilaure Grégoire, Gianpiero Cossarini, Corinne Derval, Elodie Gutknecht, Susan Kay, Julien Lamouroux, Helen Morrison, Coralie Perruche, Annette Samuelsen, Lena Spruch, Anna Teruzzi, Luc Vandenbulcke, Karina Von Schuckmann, Tsuyoshi Wakamatsu





2021 United Nations Decade of Ocean Science 2030 for Sustainable Developme

## **Outlines**

**O**E



#### **Overview of system évolutions over 2015-2024**:

- Model structure
- Coupling with the physics
- Model resolution
- Boundary conditions
- Products delivery
- Products quality
- Data Assimilation
- Products use

#### **SWOT** anlysis

Ocean Predict Copernicus Marine Forecasting Centers

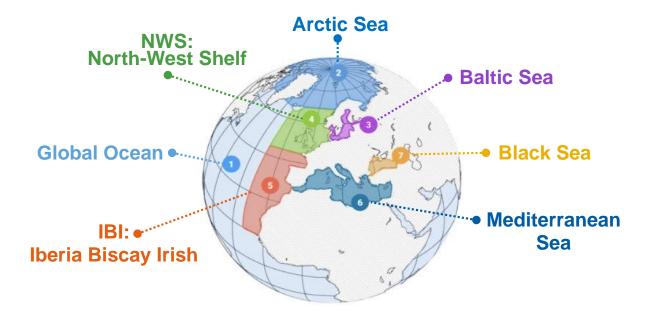


2021 United Nations Decade of Ocean Science 2030 for Sustainable Development

The Copernicus Marine Forecasting Centers (7) cover the global ocean and 6 marginal seas.

--> specific biogeochemical characteristics

--> need of specialized BGC models tailored to these distinct environments



Six BGC models (ECOSMO, ERGOM, BAMBHI, PISCES, BFM, ERSEM)



#### Ocean Predict System evolution- Model structure

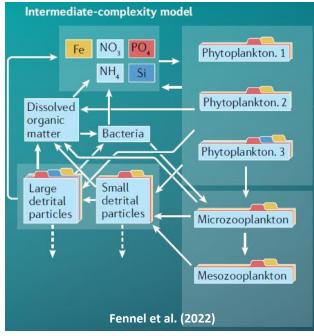




#### From the beginning of Copernicus (2015):

## Six BGC models (ECOSMO, ERGOM, BAMBHI, PISCES, BFM, ERSEM) with:

- intermediate to high complexity model (~20-40 state variables)
- nutrients: NO3, NH4, PO4, SiO4
- oxygen cycle
- Plankton functional types approach:
  - at least diatoms and non-diatoms groups
  - 2 or more zooplankton size classes



#### Ocean Predict System evolution- Model structure



Commedication
 Commedi

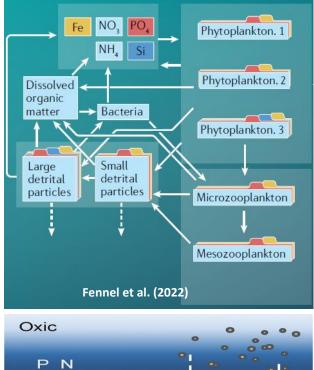
From the beginning of Copernicus (2015) to the end of the Copernicus phase 2 (2024) : :

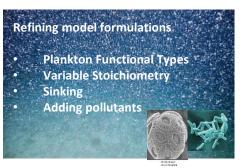
Six BGC models (ECOSMO, ERGOM, BAMBHI, PISCES, BFM, ERSEM) with:

- intermediate to high complexity model (~20-40 state variables)
- nutrients: NO3, NH4, PO4, SiO4
- oxygen cycle
- Plankton functional types approach:
  - at least diatoms and non-diatoms groups
  - 2 or more zooplankton size classes
- variable stoichiometry
- carbon chemistry
- better light treatment and optics
- coupling with benthos
- adding PFTs

Carbon chemistry DIC pH pCO2 Alk

#### Intermediate-complexity model





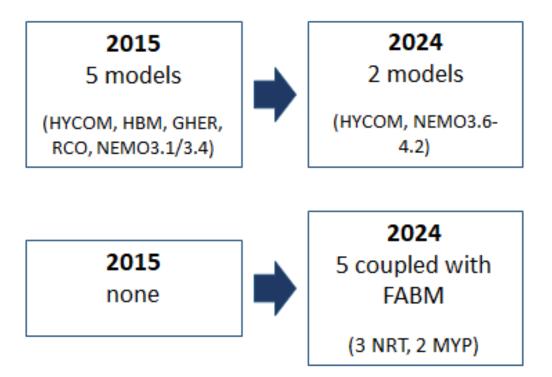
Ocean System evolution – coupling with the physics **Syn** 



2021 United Nations Decade 2030 for Sustanable Development

#### **Physical models**

- homogenization of model systems with more use of NEMO and FABM
- Online coupling (5), offline coupling (2)









#### Resolution

NRT	horizontal (ki	resolution m)	vertical levels					
	2015	2024	2015	2024				
ARC	12 km	6.25 km	12	40				
BAL	2 km	2 km	25	56				
BLK	5 km	2.5 km	31	59				
GLO	27.5 km	27.5 km	50	50				
IBI	3.1 km	3.1 km	50	50				
MED	6.9 km	4.6 km	73	125				
NWS	7 km	2.9 km	24	50				

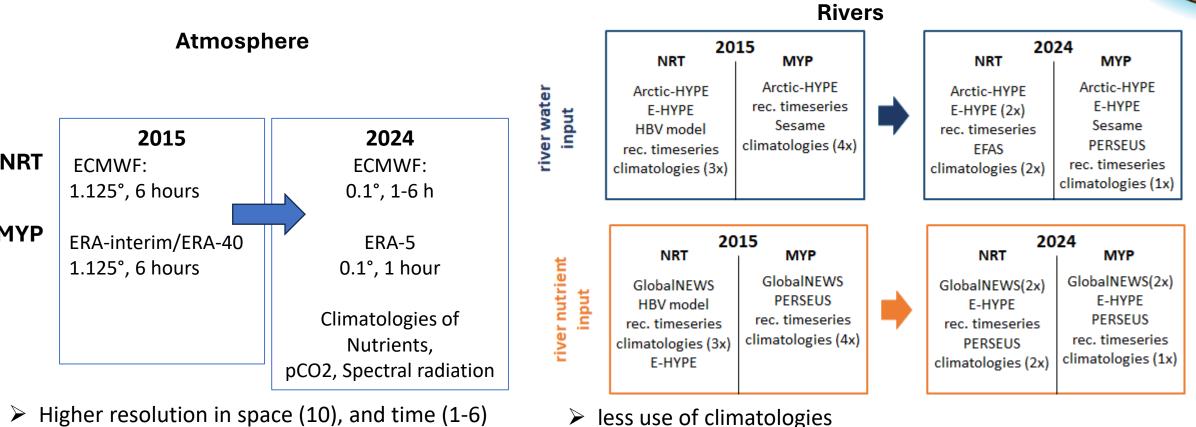
МҮР		resolution m)	vertical levels						
	2015	2024	2015	2024					
ARC	25	25	12	40					
BAL	3.7	2	56	56					
BLK	15	2.5	31	59					
GLO	27.5	27.5	75	75					
IBI	9.25	3.1	50	50					
MED	6.9	4.6	73	125					
NWS	12.3x7.4	12.3x7.4	24	24					

- > increase in horizontal (submesoscale in NRT) and/or vertical resolution for 5 out of 7 MFC in NRT and MYP systems
- Increased alignement between NRT, MYP

Ocean System evolution – boundary conditions Predict



(CF unesco 2021 United Nations Decade of Ocean Science for Sustainable Developmen



- $\blacktriangleright$  Higher resolution in space (10), and time (1-6)
- > Nutrients inputs



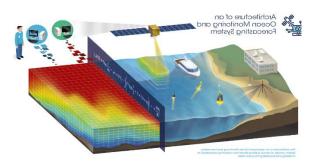




From the beginning of Copernicus (2015) :

Distributed products :

- Plankton: Chla, Phyto in carbon, Primary Production
- Nutrients (NO3, PO4),
- Oxygen





- Daily Mean
- Monthly mean

Multi Year Reanalysis: last decades (at least 2007-2010)

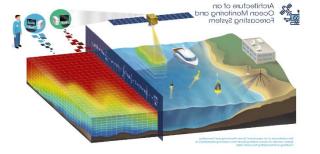
#### From the beginning of Copernicus (2015) to the end of the Copernicus phase 2 (2024) :

#### Distributed products :

• Plankton: Chla, Phyto in carbon (total and *functional groups*), Primary Production

Predict System evolution- Products

- Nutrients (NO3, PO4),
- Oxygen
- biomass of Zoo in carbon
- Carbonate: pH, DIC, spCO2, fCO2
- Optics (*Kd*)



unesco

2021 United Nations Decade



- Monthly mean
  - Daily Mean (MYP)
    - Hourly Mean
    - (air-sea fluxes)

Multi Year Reanalysis: last decades (at least 2007-2021) Interim: up to m-1



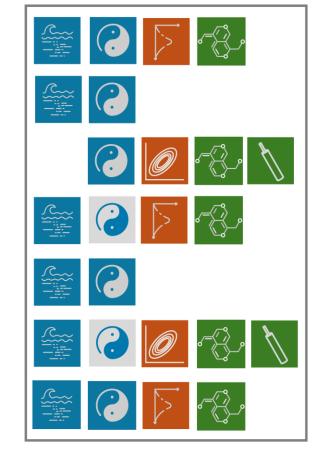
#### System evolution – Data Assimilation

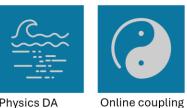






NRT (~2024)

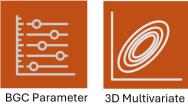






Physics DA

Offline coupling





+ 1D projection



Estimation

Satellite Chl DA

Satellite PFT DA BGC Argo DA



System Change/ Discontinuation

DA





BGC in-situ DA

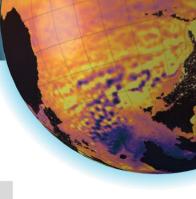


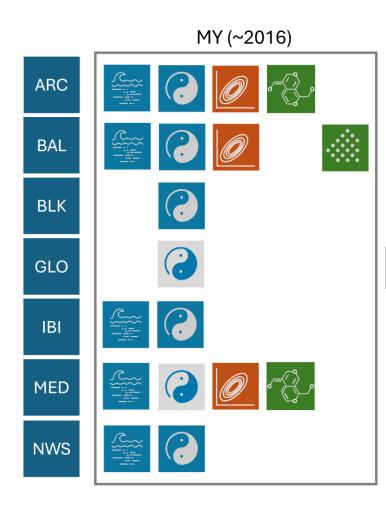
System evolution – Data Assimilation



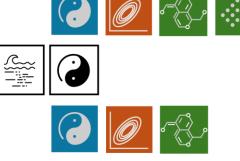
مہرہ ا

(CF 2021 United Nations Decade 2030 of Ocean Science for Sustainable Development





MY(~2024)









Physics DA



Online coupling Offline coupling



Estimation





2D DA

**BGC** Parameter 3D Multivariate DA



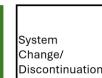
Satellite Chl DA



+ 1D projection

Satellite PFT DA





BGC Argo DA





System evolution – Products Quality

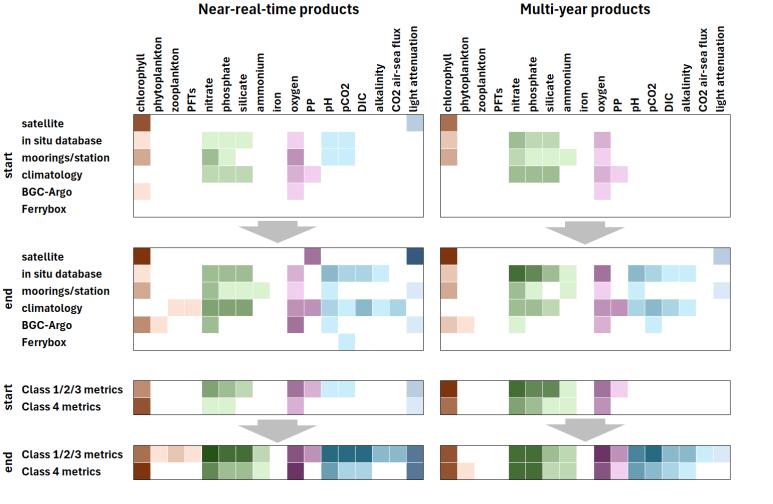




Observations and metrics used in product quality documents.

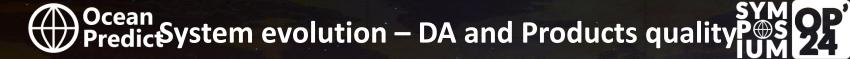
Darker colour show more PUs using it.

More use of quantitative metrics using modelobservation matchups (GODAE Class 4)



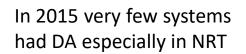
PUs are using a wider range of data sources

More variables are assessed





2021 United Nations Decade 2030 of Ocean Science 2030 for Sustainable Development



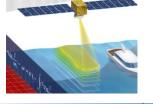
Ocean PredictSystem evolution – DA and Products quality



2021 United Nations Decade 2030 for Ocean Science 2030 for Sustainable Development

In 2015 very few systems had DA especially in NRT

Nearly at 2020 most of the systems with assimilation of satellite chlorophyll



Improvements in most of MFCs (specific MFC)
Horizontal gradients and seasonal patterns
Horizontal gradients and seasonal patterns
(Basin wide estimation, MED; Seasonal patterns, NWS)

an dictSystem evolution -	- DA and Products quality I	Image: Second system       Image: Second system         Image: Second
In 2015 very few systems had DA especially in NRT	Nearly at 2020 most of the systems with assimilation of satellite chlorophyll	In 2023 assimilation of profiles more widely adopted
Variable	Improvements in most of MFCs (specific MFC)	Improvements in most of MFCs (specific MFC)
Chlorophyll	Horizontal gradients and seasonal patterns	Vertical distribution (deep chlorophyl maximum, MED)
Primary production	Horizontal gradients and seasonal patterns	
Phytoplankton functional types	(Basin wide estimation, MED; Seasonal patterns, NWS)	
Nutrient		Vertical distribution
Oxygen		Vertical distribution (oxygen penetration depth, BLK)



#### **Products Use– Indicators**



Unesco tregovernmental Ocarographic Commission

#### Mapping BGC products to indicators



GOOS list of BGC-related EOVs

Biogeochemistry	Biology and Ecosystems							
	Phytoplankton biomass and diversity							
Oxygen	Zooplankton biomass and diversity							
Nutrients	Fish abundance and distribution							
Inorganic carbon	<i>Marine turtles,</i> birds, mammals abundance and distribution							
Transient tracers	Hard coral cover and composition							
Particulate matter	Seagrass cover and composition							
Nitrous oxide	Macroalgal canopy cover and composition							
Stable carbon isotopes	Mangrove cover and composition							
Dissolved organic carbon	Microbe biomass and diversity (*pilot)							
	Invertebrate abundance and distribution (*pilot)							



#### **Products Use- Indicators**



Integovernmetal Commission Commis

#### Mapping BGC products to indicators



GOOS list of BGC-related EOVs

Biogeochemistry	Biology and Ecosystems
	Phytoplankton biomass and diversity
Oxygen	Zooplankton biomass and diversity
Nutrients	Fish abundance and distribution
Inorganic carbon	<i>Marine turtles,</i> birds, mammals abundance and distribution
Transient tracers	Hard coral cover and composition
Particulate matter	Seagrass cover and composition
Nitrous oxide	Macroalgal canopy cover and composition
Stable carbon isotopes	Mangrove cover and composition
Dissolved organic carbon	Microbe biomass and diversity (*pilot)
	Invertebrate abundance and distribution (*pilot)

Available from Copernicus Marine Service NECCTON (see S. Ciavatta talk). EOVs under development or capable of development



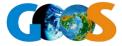
#### **Products Use- Indicators**







VARIABLES



GOOS list of BGC-related EOVs

#### PROCESS RATES

**Ocean Monitoring Indicators OMIs** 

- 23 OMIs for monitoring changes in the BGC ocean state and ocean health
- **Mostly based on observations** (for now) but BGC models are improving (e.g. version refinement, new parameterizations, data assimilation, etc.)

Biogeochemistry	Biology and Ecosystems							
	Phytoplankton biomass and diversity							
Oxygen	Zooplankton biomass and diversity							
Nutrients	Fish abundance and distribution							
Inorganic carbon	<i>Marine turtles,</i> birds, mammals abundance and distribution							
Transient tracers	Hard coral cover and composition							
Particulate matter	Seagrass cover and composition							
Nitrous oxide	Macroalgal canopy cover and composition							
Stable carbon isotopes	Mangrove cover and composition							
Dissolved organic carbon	Microbe biomass and diversity (*pilot)							
	Invertebrate abundance and distribution (*pilot)							

In	dicator framework	Indicator type	
	Copernicus Ocean Monitoring Indicators Specificity: dissemination of numerical value <b>in</b> <b>operational mode</b>	Chlorophyll & primary production (14) Eutrophication & bloom (1) Ocean acidification (2) Ocean deoxygenation (2) Oligotrophication (4)	eurostat 14 LIFE BELOW ₩ATER
GCOS	GCOS-WMO Global Climate Indicator framework	Ocean acidification	
	GOOS Ocean Indicator framework	Ocean acidification Ocean deoxygenation Net community Production	



## SWOT

**SWOT** 

Analysis





### Strengths

- Coordinated
- Common best practices and high quality standards for system development and evolution.
- Increased quality, resolution, extension, ...
- Diversified number of BGC products

### Opportunities

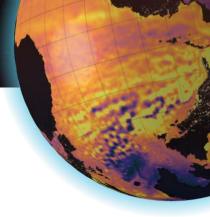
- Novel bgc data : type, resolution, quality
- High requirements for bgc products
- Use of ML as model emulator
- Stochastic approaches
- Coupling with other Copernicus services to improve boundary conditions
- Transition towards a DTO that includes bgc products an emulators
- Connexion with biology and users applications

### Weaknesses

- Boundary conditions for bgc variables
- Lack of bgc data
- Uncertainty quantifications
- Benefit of increased resolution difficult to demonstrate
- Contribution to decision making process and indictaors definition still limited

### Threats

- Computing resources very huge of ensemble system with increased resolution
- Funding support to bgc observation
- No improvement of boundary conditions
- Mismatch of users needs and products/service delivery
- Huge amount of information in the digital twin ocean

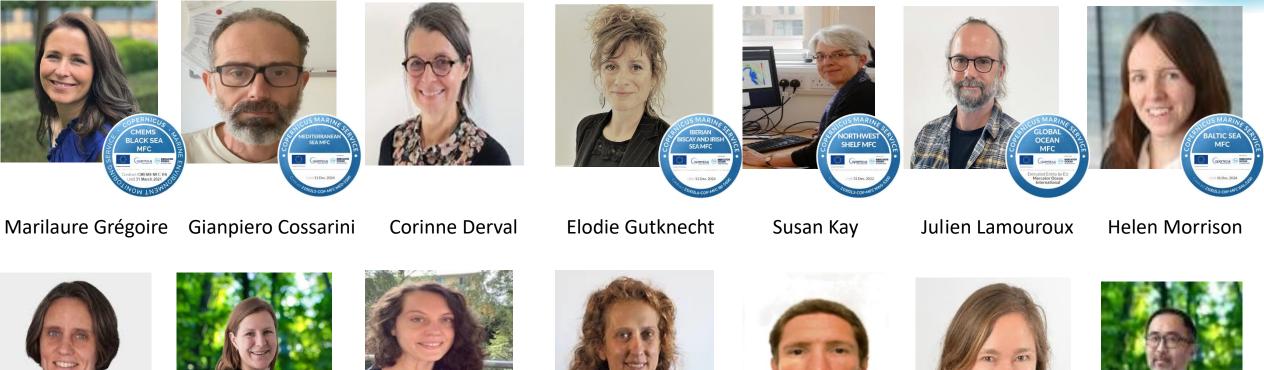


















2021 United Nations Decade 2030 of Ocean Science for Sustainable Develop

**ADVANCING OCEAN PREDICTION SCIENCE FOR SOCIETAL BENEFITS** 

Thank you!







EU

@ceanobs

INTERNATIONAL OCEAN GOVERNANCE















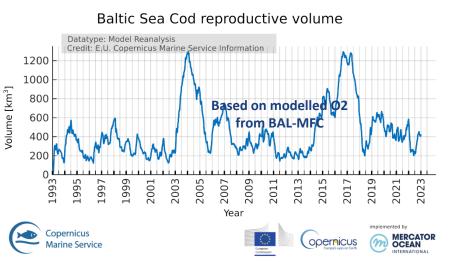
Products Use– Indicators & users services

#### Commission Commis

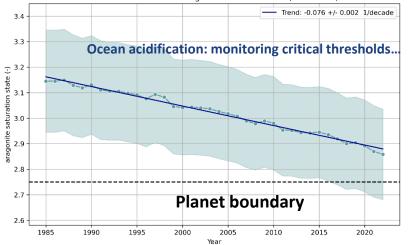
#### **Example of OMIs**

Ocean

redict



#### Time Series of CMEMS aragonite saturation state (1985-2022)



#### From model outputs to services and "what-if" scenarios

- The service supports policymakers and agencies in water quality management, flood risk mitigation and sustainable use of resources.
- BGC models remain critical tools for setting up what-if scenarios (e.g. hindcasts/projections)

	ARC NRT/MY	NRT 003_007	MY 003_012	NRT 007_010	MY 007_005	NRT 001_028	MY 001_029	MY Nekton 001_033	NRT 005_004	MY 005_003	NRT 006_014	MY 006_008	NRT 004_002	MY 004_011
Monitoring porpoise in Kattegat Natura 2000 protected area														
Warning system for land-based pollution in the Romanian coastal area														
ForCOAST														
Metocean analysis to support Maritime Spatial Planning in the western Black Sea Basin														
Supporting the MSFD directive in the Black Sea														
Mapping marine biodiversity issues to better plan the deployment of offshore wind farms														
Monitoring coastal waters of the Lisbon Area (Portugal) in support of EU directive implementation														
Marine Data Viewer: Uniting In-Situ Measurements, Models, and Satellites for Essential Ocean Variables														
Modelling Reveals New Insights on Phytoplankton Blooms in NW Iberian Upwelling														
Real-time assessment of MPAs with marine megafauna movements and bio-physical ocean variables														
A model to support sea turtle protection at sea														
COASTSERV: Downscaled CMEMS products for high-resolution coastal models														
The Brazilian Sea Observatory - Coastal Service														
LAMBDA PROJECT – Land-Marine Boundary Development & Analysis														
UMITRON PULSE: high-resolution ocean data map for aquaculture farmers														
EMERGE: Modeling ocean pollution from ship emissions														
Copernicus Marine for Maritime Spatial Planning: The PLASMAR Project														
Predicting the habitat and distribution of giant squid														
Support to exploration activities for Deep Sea Mining														
Modelled prey fields predict predator foraging success														
Tracking whales in the North-Atlantic														
Early warning in the Mediterranean Sea														
CONNECT Tagus – water quality and extreme water levels in the Tagus Estuary														
Offshore aquaculture systems for salmon farming														
Teaching Marine Biogeochemistry at the Shelf Edge														
OCEANA Marine expeditions to fill key gaps in biodiversity data														
Sustainable monitoring of transparent coastal waters by high-resolution satellites														
Enhancing traceability and tracking in Aquaculture and fisheries supply chain through the use of														
blockchain and earth observation														
Map2Fish – A fish stock service for tourism														
JellyX: A Monitoring tool to detect jellyfish swarms														
Web Service Platform for Maltese coastal waters														
Met-Ocean studies and key environmental parameters for floating offshore wind technology														
Northern Adriatic sea water quality for aquaculture and tourism sectors - Cadeau project														
Support to Maritime Spatial Planning European Directive														
OCEan Biological Information Service: OCEBIS														
Eutrophication and acidification in marine ecosystems: North Sea use case														
Marine Assessments in support to MSFD														
	Carto	grant	ny of	Cone	rnicu	s Mar	ino u	50-02		sing E		IFC s	istom	



**Products Use- Indicators** 



3.0

2.9

2.8

2.7

2.6

1985

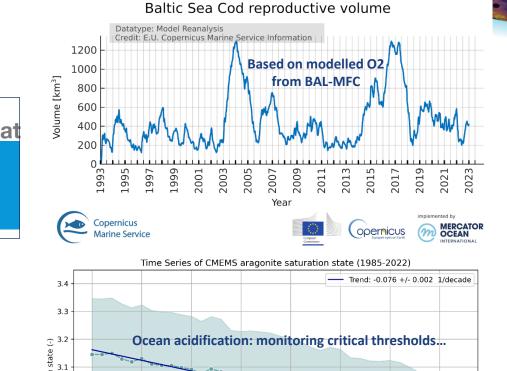
1990

1995

#### Longerphic Commission Comm

# Ocean Monitoring Indicators OMIs related to biogeochemistry

Indicators



2000

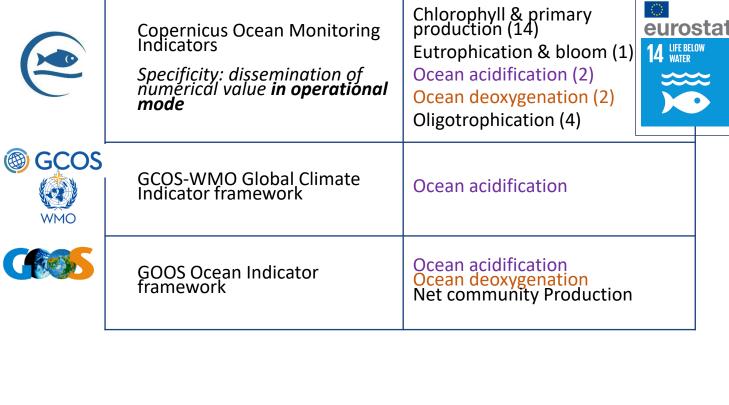
2005 Year

**Planet boundary** 

2010

2015

2020



**Indicator framework** 



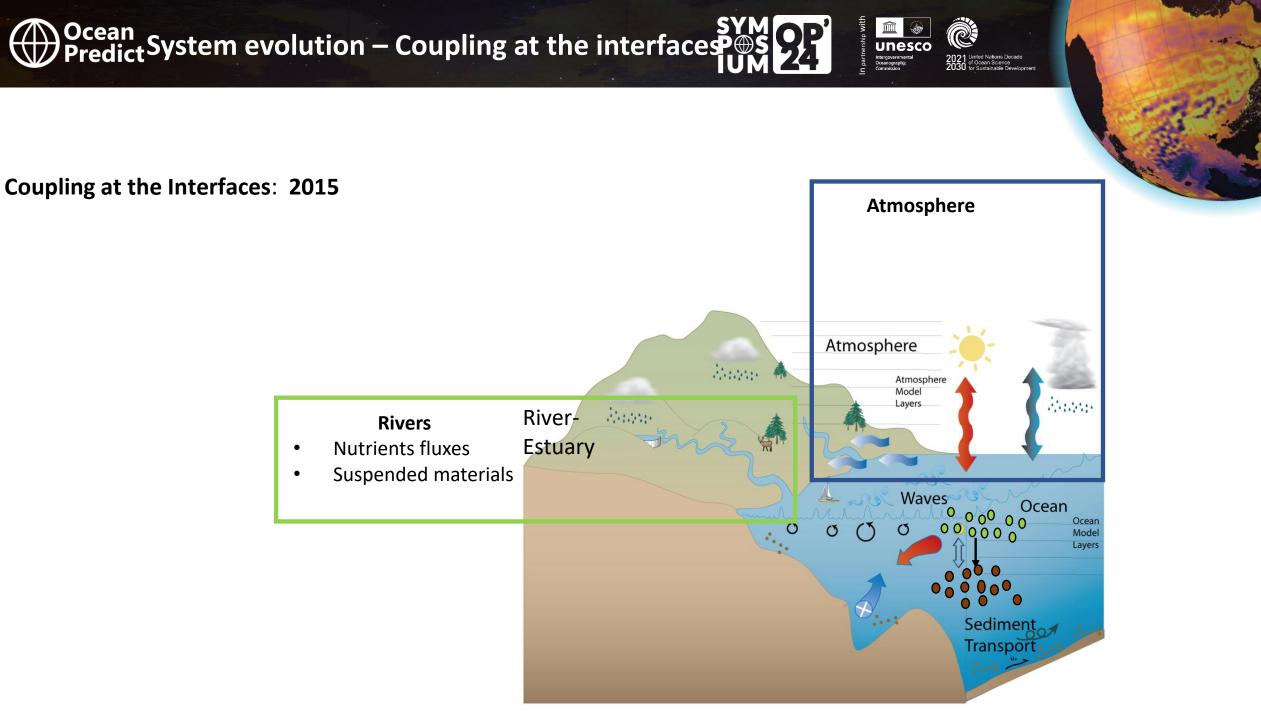
#### **Products Use– Downstream services**





	ARC NRT/MY	BAL NRT 003_007	BAL MY 003_012	BLK NRT 007_010	BLK MY 007_005	GLO NRT 001_028	GLO MY 001_029	GLO MY Nekton 001_033	IBI NRT 005_004	IBI MY 005_003	MED NRT 006_014	MED MY 006_008	NWS NRT 004_002	NWS MY 004_011
Monitoring porpoise in Kattegat Natura 2000 protected area														
Warning system for land-based pollution in the Romanian coastal area														
ForCOAST														
Metocean analysis to support Maritime Spatial Planning in the western Black Sea Basin														
Supporting the MSFD directive in the Black Sea														
Mapping marine biodiversity issues to better plan the deployment of offshore wind farms														
Monitoring coastal waters of the Lisbon Area (Portugal) in support of EU directive implementation														
Marine Data Viewer: Uniting In-Situ Measurements, Models, and Satellites for Essential Ocean Variables														
Modelling Reveals New Insights on Phytoplankton Blooms in NW Iberian Upwelling														
Real-time assessment of MPAs with marine megafauna movements and bio-physical ocean variables														
A model to support sea turtle protection at sea														
COASTSERV: Downscaled CMEMS products for high-resolution coastal models														
The Brazilian Sea Observatory - Coastal Service														
LAMBDA PROJECT – Land-Marine Boundary Development & Analysis														
UMITRON PULSE: high-resolution ocean data map for aquaculture farmers														
EMERGE: Modeling ocean pollution from ship emissions														
Copernicus Marine for Maritime Spatial Planning: The PLASMAR Project														
Predicting the habitat and distribution of giant squid														
Support to exploration activities for Deep Sea Mining														
Modelled prey fields predict predator foraging success														
Tracking whales in the North-Atlantic														
Early warning in the Mediterranean Sea														
CONNECT Tagus – water quality and extreme water levels in the Tagus Estuary														
Offshore aquaculture systems for salmon farming														
Teaching Marine Biogeochemistry at the Shelf Edge														
OCEANA Marine expeditions to fill key gaps in biodiversity data														
Sustainable monitoring of transparent coastal waters by high-resolution satellites														
Enhancing traceability and tracking in Aquaculture and fisheries supply chain through the use of														
blockchain and earth observation														
Map2Fish – A fish stock service for tourism														
JellyX: A Monitoring tool to detect jellyfish swarms														
Web Service Platform for Maltese coastal waters														
Met-Ocean studies and key environmental parameters for floating offshore wind technology														
Northern Adriatic sea water quality for aquaculture and tourism sectors - Cadeau project														
Support to Maritime Spatial Planning European Directive														
OCEan Biological Information Service: OCEBIS														
Eutrophication and acidification in marine ecosystems: North Sea use case														
Marine Assessments in support to MSFD														

Cartography of Copernicus Marine use-cases using BGC MFC systems



Ocean PredictSystem evolution – Coupling at the interfaces

٠



