



Blue-Cloud

Piloting innovative services for Marine Research & the Blue Economy

Test the Blue-Cloud Virtual Labs

**Zoo & Phytoplankton
Essential Ocean
Variables Products**

Sara Pittonet, Trust-IT services

Patricia Cabrera, Flanders Marine Institute (VLIZ)

Julia Uitz, Laboratoire d'Océanographie de Villefranche (LOV), Sorbonne Université (SU) / CNRS

Charles Troupin, University of Liege – GHER

Steven Pint, Flanders Marine Institute (VLIZ)

 Trust-IT Services
communicating to markets



Blue-Cloud has received funding from the European Union's Horizon Programme call BG-07-2019-2020, topic: [A] 2019 - Blue Cloud services, grant Agreement number 862409.

Blue-Cloud: your Open Science platform for collaborative marine research

Blue-Cloud aims to promote the **sharing** of *data, processes and research findings* in the marine domain by delivering a **collaborative web-based environment** that enables *open science*, underpinned by simplified access to **an unprecedented wealth of marine data resources** and **interoperable added-value services and products**”

Funding: H2020: The ‘Future of Seas and Oceans Flagship Initiative’ (BG-07-2019-2020) topic: [A] 2019 - Blue Cloud services
October 2019- September 2022
20 partners + **13 Blue federated Infrastructures**



Blue-Cloud

5 demonstrators to showcase the **Blue Cloud** Services and its potential in promoting the Blue economy

Demo 5



Aquaculture Monitor



Demo 4



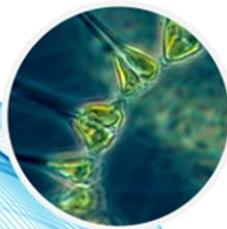
Fish a matter of scales



Demo 1



Zoo & Phytoplankton EOVS products



Demo 2



Plankton Genomics



Demo 3



Marine Environmental Indicators



Agenda

- 11:30 **Blue-Cloud project introduction**, by Sara Pittonet, Blue-Cloud Coordinator
- 11:35 **Demo and VLab Introduction** – Patricia Cabrera, Flanders Marine Institute, VLIZ. Belgium
- 11:45 **Phytoplankton EOVS** – Julia Uitz, Laboratoire d'Océanographie de Villefranche, LOV. France
- 11:55 **Zooplankton EOVS** – Charles Troupin, University of Liège-GHER, Belgium
- 12:05 **Modelling phyto-zooplankton interactions** – Steven Pint, Flanders Marine Institute, VLIZ. Belgium
- 12:15 **Q&A**



DECODE THE OCEAN!

7, 8 and 9 February 2022



Enter the virtual lab

Visit the Support centre

Related articles

Introduction to Zoo and
Phytoplankton EOv Products
- 10 April 2020

Webinar on the Blue-Cloud

The Zoo and Phytoplankton EOv Products Virtual Lab is developed by the [Flanders Marine Institute \(VLIZ\)](#), in collaboration with the Faculty of Science and Engineering at Sorbonne University and GeoHydrodynamics and Environment Research (GHER) at the University of Liège.

This demonstrator aims to provide a methodology to generate:

- **zooplankton products** based on in situ observations of the abundance of different zooplankton species in a region encompassing the North-East Atlantic;
- **global ocean three-dimensional (3D) key phytoplankton products** of chlorophyll-a (Chla) concentration, as a proxy for total phytoplankton biomass and phytoplankton functional types, as a proxy for phytoplankton diversity;
- **a mechanistic model using near real-time data** to quantify the relative contributions of the bottom-up and top-down drivers in phytoplankton dynamics.

The Zoo and Phytoplankton EOv demonstrator provides a description of the current state of the plankton communities and forecasts their evolution, representing valuable information for the modelling, assessment and management of the marine ecosystem. It is useful for a variety of communities:

- **Fisheries advisory organisations** can use these plankton products to study the availability of food resources for fish stocks and assess the effects on fish stocks.
- **Marine policy officers** will have the needed support to address threats such as food insecurity, as foreseen under the EU Biodiversity Strategy for 2030.
- **Fundamental research** (e.g. researchers and consultants from environmental agencies) contributing to the understanding of the environmental conditions and top-down factors at new scales of observations (e.g. regional/global, seasonal and time series).

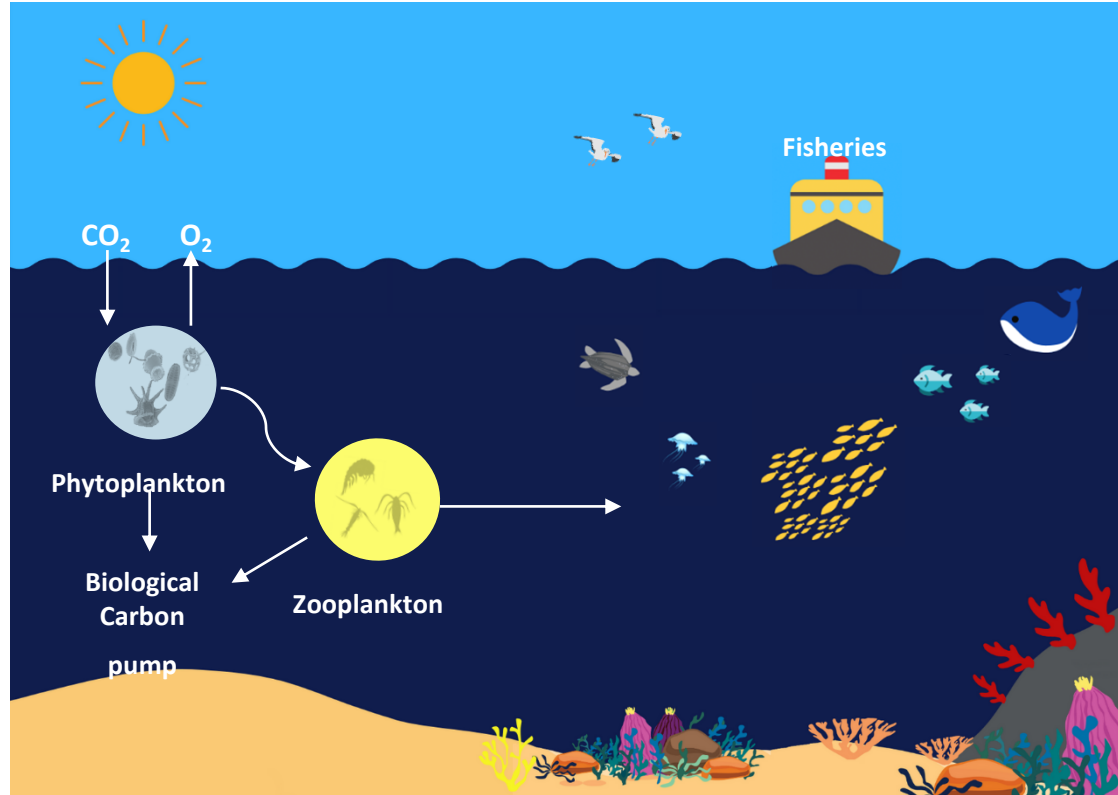
Services

Zooplankton EOvs

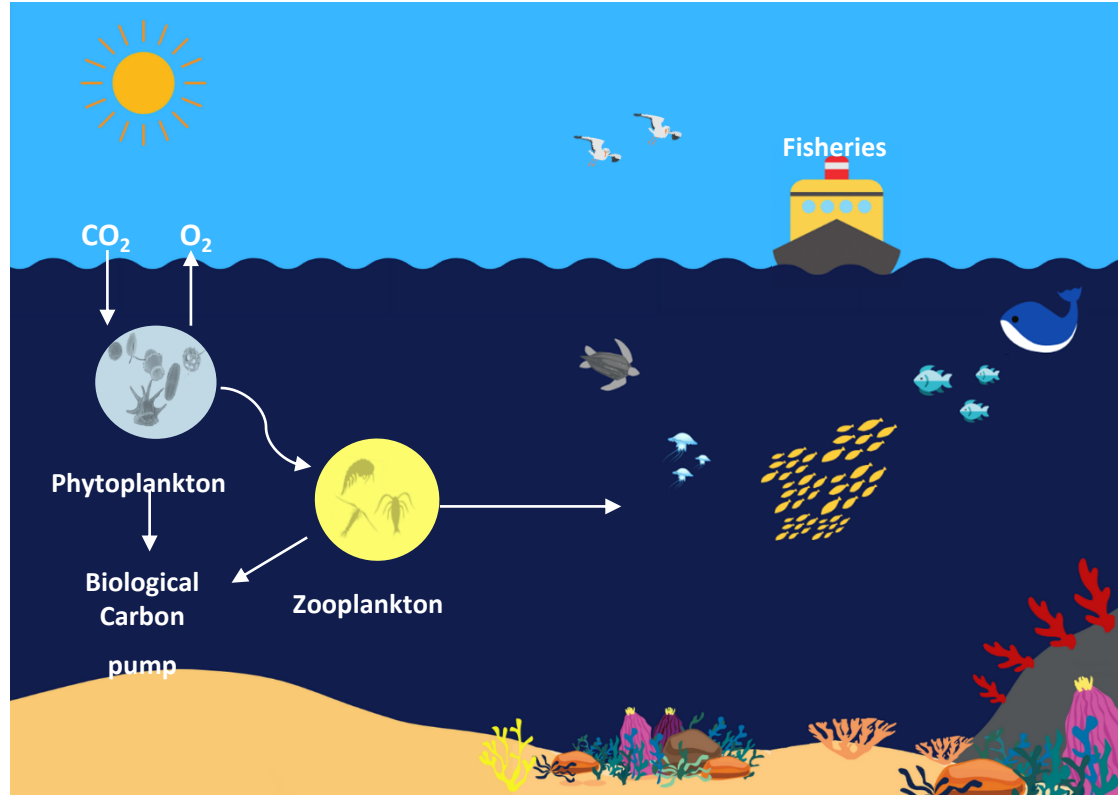
Phytoplankton EOvs

Scientific validation

Why plankton?



Why plankton?



The marine observation landscape



Photo credit: IOC GOOS

The marine observation landscape

EcoTaxa^{2.5}



EMODnet



European Ocean Biodiversity
Information System



European Nucleotide Archive



Blue-Cloud

Piloting innovative services for Marine Research & the Blue Economy



EURO BIOIMAGING
Image life, discover the future



Copernicus
Marine Service



SeaDataNet



SURFACE OCEAN CO₂ ATLAS

ICOS

Integrated
Carbon
Observation
System



Blue-Cloud

How BC helped to develop the demonstrator?

Access Blue-Cloud data

Easier integration of data sources

Heavy computation analyses

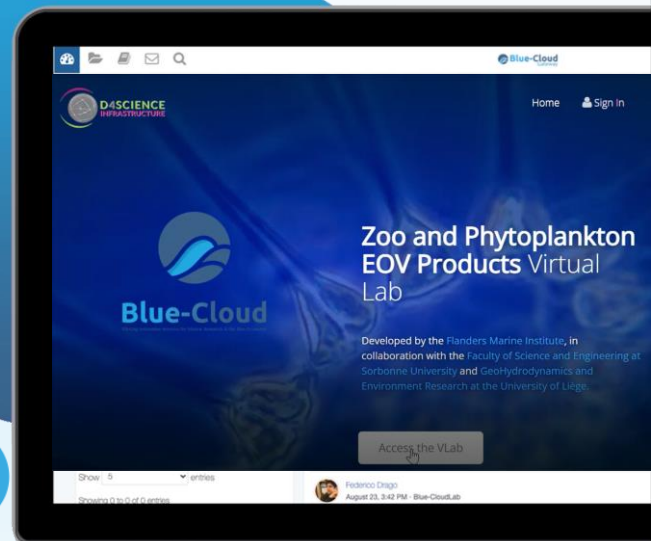
Blue-Cloud VRE

Exploitation of results through dissemination

Access to re-usable methodologies

Blue Data Catalogue

Blue-Cloud Virtual Lab



Phytoplankton EOVS

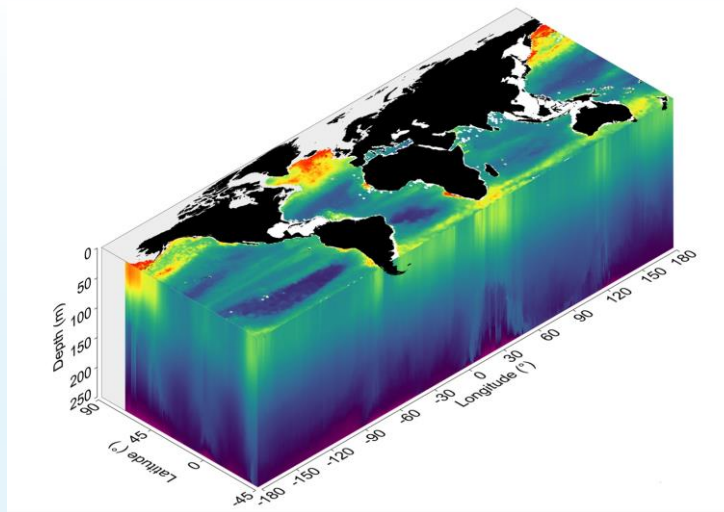


Introduction

- Phytoplankton are key to several **scientific** and **socio-economic** questions. Not only their **biomass** but also their **composition** affect critical processes in the oceans, in particular the capacity of the ocean to **sequester carbon** and the flow of carbon energy through the **marine food webs**
- Developing a **global 3D view of the biomass and composition of phytoplankton assemblages** in the oceans appears critical to: (1) Reduce uncertainties regarding the status of marine ecosystems in the **present ocean**; (2) Gain knowledge to improve our ability to **predict** their **evolution** under **climate change**
- The **BGC-Argo global observation network** has largely expanded in recent years, and now provides the databases required for **training and validating a new generation of algorithms**, which are essential for obtaining global 3D biogeochemical products

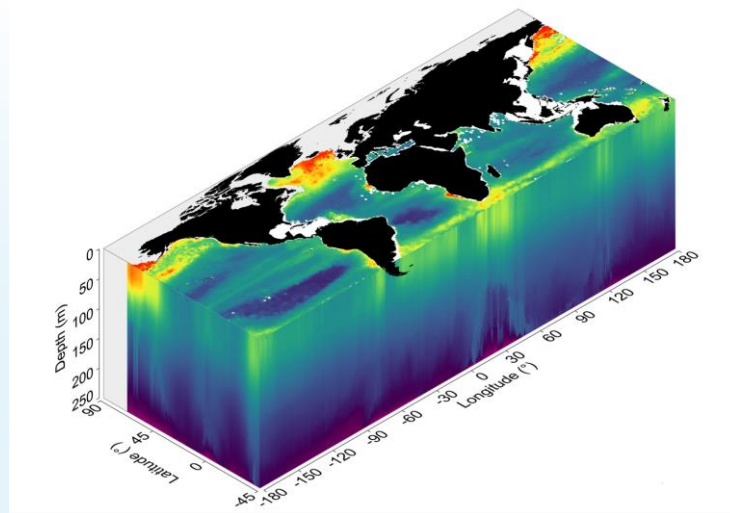
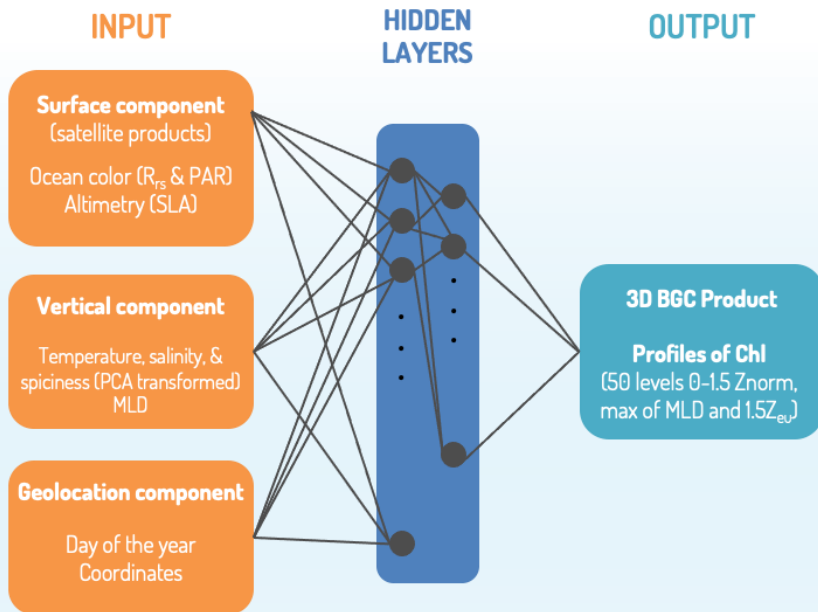
Principle of the SOCA* algorithm

- Our approach relies on the **neural network-based SOCA algorithm** developed by Sauzède et al. (JGR-Oceans 2016)
- The algorithm **merges surface satellite observations** with **depth-resolved hydrological properties** to provide global 3D fields of bbp (POC) as the output product
- The algorithm has been adapted to the retrieval of **global 3D fields of Chla and Phytoplankton Functional Types** (PFT) expressed in terms of Chla associated with 3 main groups (pico-, nano- and microphytoplankton)

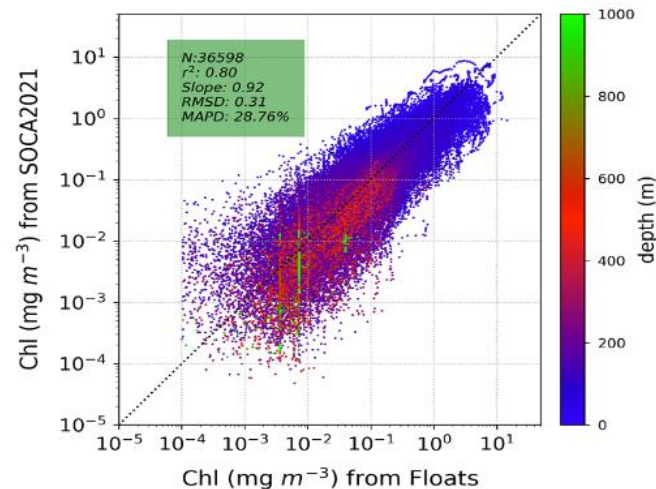
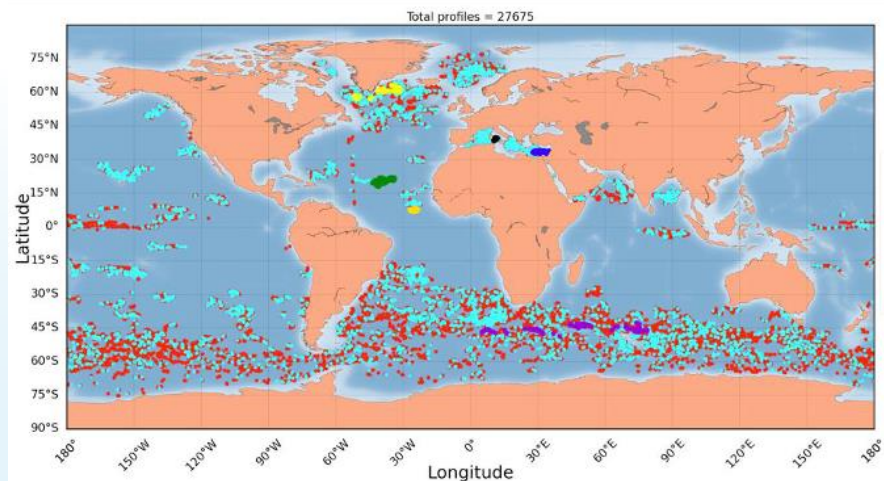


*SOCA: Satellite Ocean Color merged to Argo data

Principle of the SOCA algorithm



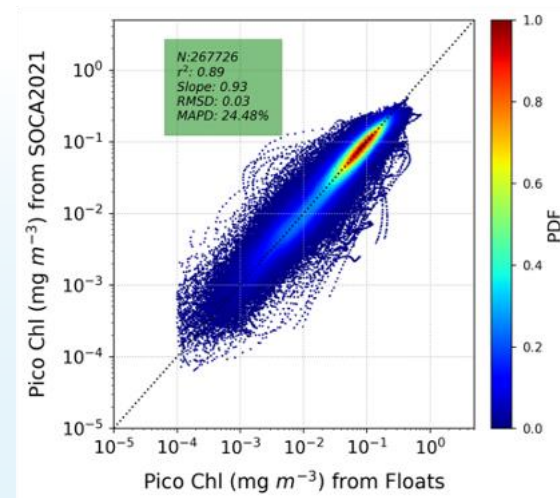
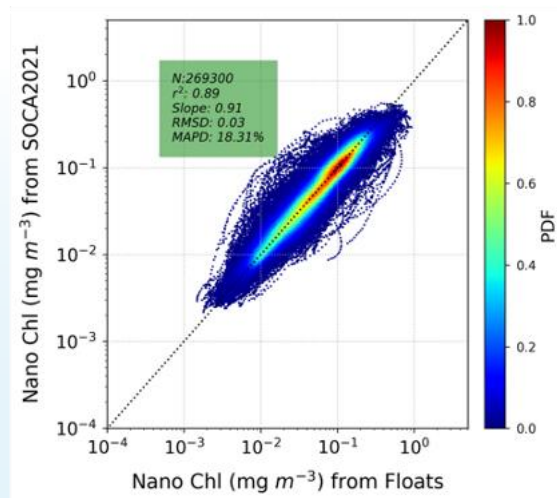
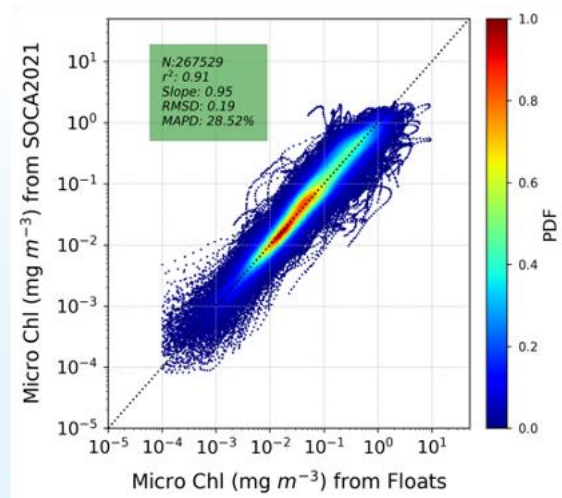
Validation of the SOCA Chla product



- A **database** representative of the **global** open ocean
- ~28,000 **satellite** (Rrs, PAR, SLA) / **BGC-Argo** (Chl, T/S + PFT) **matchups**: 80% for training / 20% for validation

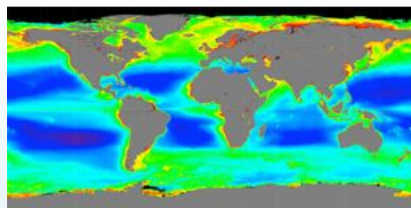
- Global error (MAPD) of 29%
- No systematic bias with depth

Validation of the SOCA PFT product



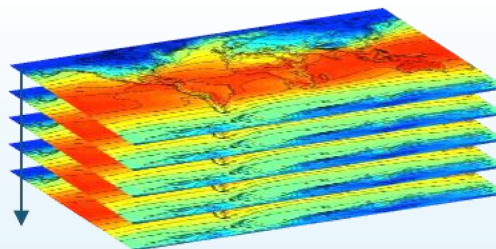
- Relatively low mean error (18-29%)
- Good representation of the group-specific Chla over the biomass gradient

Generating the desired EOV products



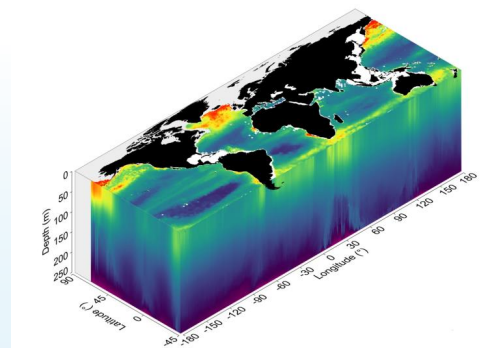
CMEMS satellite fields
(GlobColour & DUACS)

+



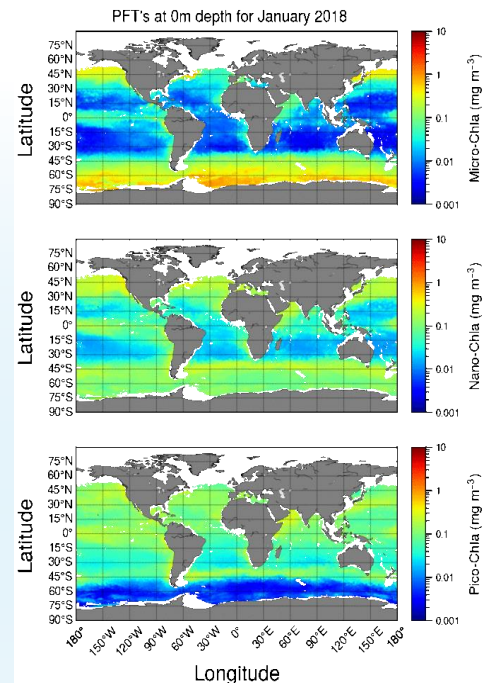
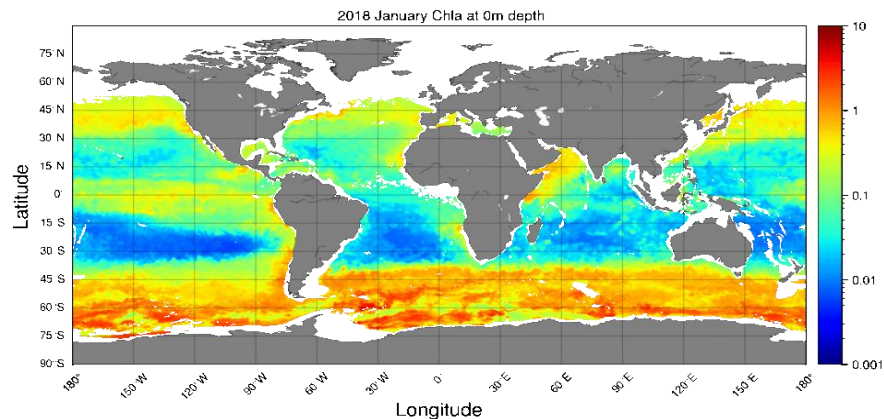
CMEMS ARMOR3D fields

→



Output EOV products of
Chla & PFT

Example results: Global distribution of Chla & PFTs



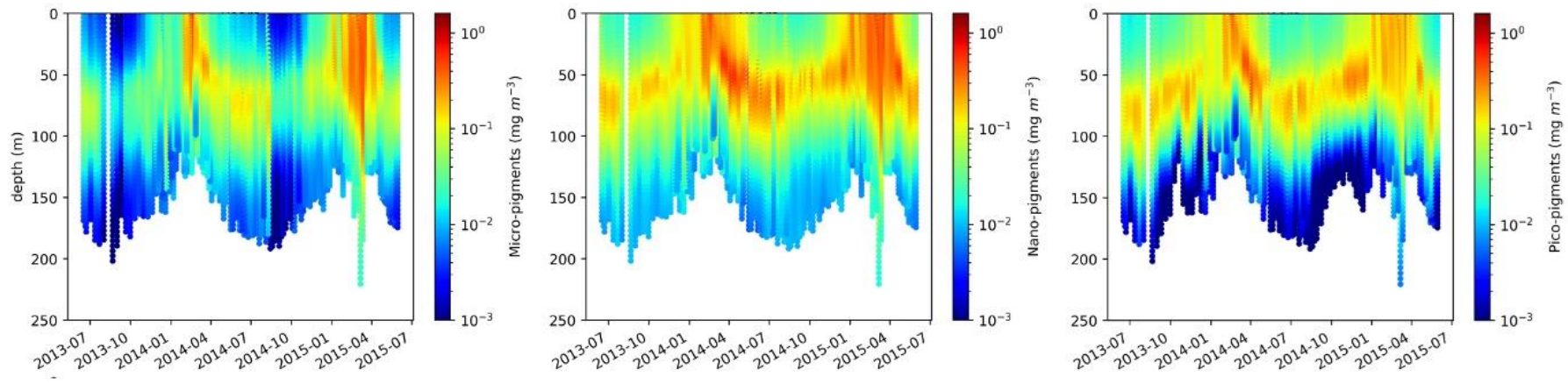


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Phytoplankton EOVS



Example results: Cross section of PFT in the Western Med Sea



Conclusion

- Additional efforts must be made to improve the PFT product, which is currently in its beta version
- The final global 3D Chla and PFT products may find a large range of applications. For example: process studies and biogeochemical budgets; initialization and validation of, or assimilation in, biogeochemical/ecosystem models; QC reference for remote observations

Zooplankton EOVS



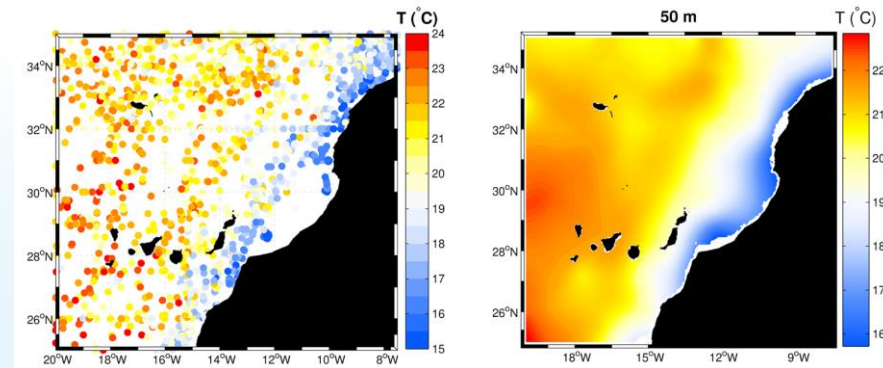
Zooplankton EOVS

Interpolation and data analysis:

Difficulties in oceanography:

- Data distribution/scarcity
- Confidence in measurements
- Representativity error

Possible usage: climatologies, reference state, model validation, assess long term changes

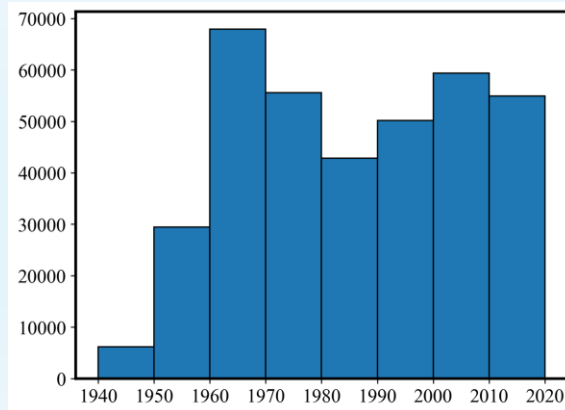
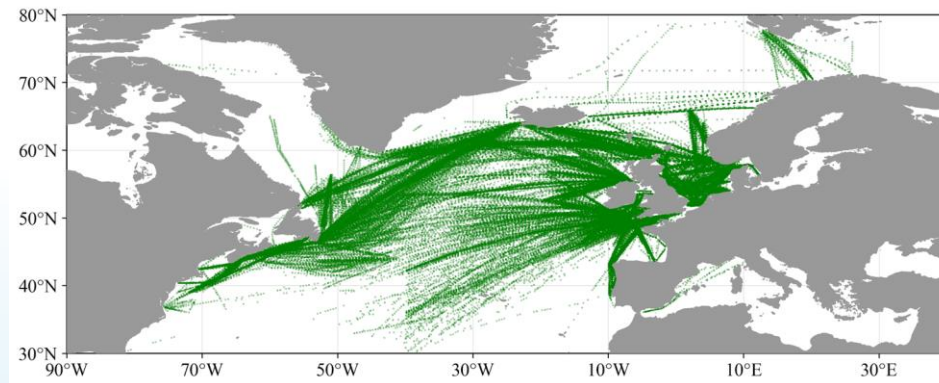




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The dataset

- Data from the continuous plankton recorder operated by the Marine Biological Association, UK
- Heterogeneous distribution
- Data since 1940
- Data | position | number of ind/m³



DIVAnd: Data Interpolating Variational Analysis in n dimensions <https://github.com/gher-ulg/DIVAnd.jl>

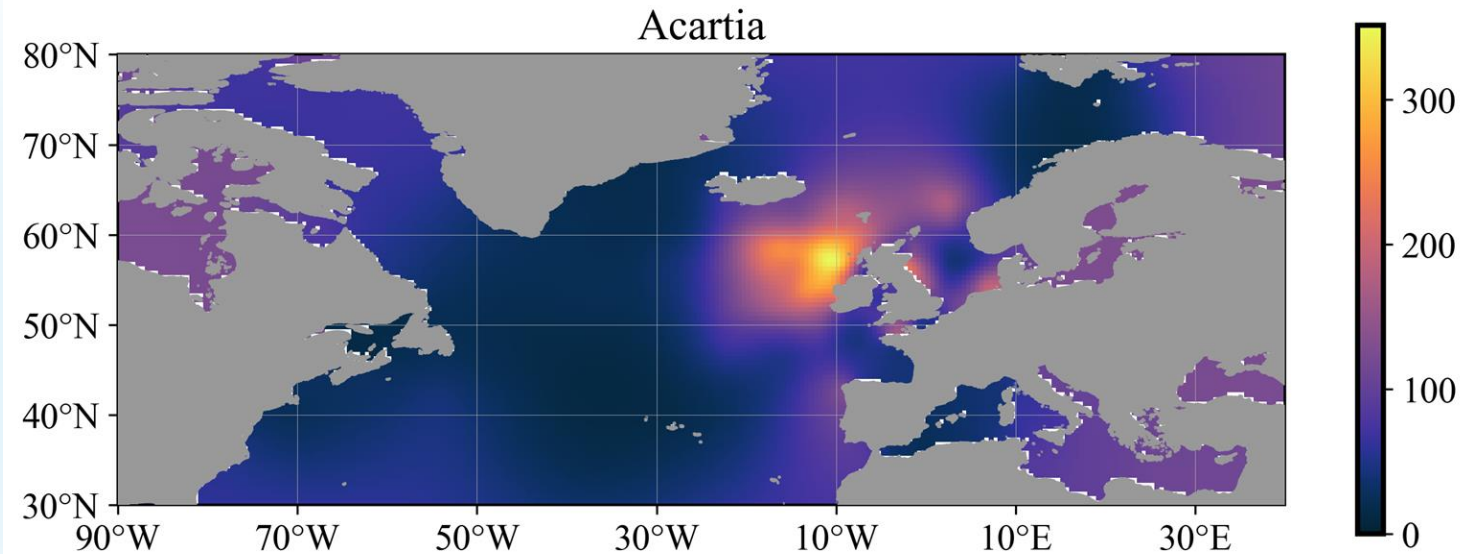
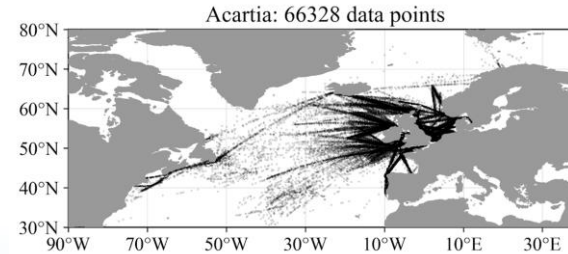
Code written in Julia (<https://julialang.org/>)

DIVAnd

 CI  passing  codecov  80%  docs  stable  docs  latest  DOI  10.5281/zenodo.4400206

DIVAnd (Data-Interpolating Variational Analysis in n dimensions) performs an n-dimensional variational analysis/gridding of arbitrarily located observations. Observations will be interpolated/analyzed on a curvilinear grid in 1, 2, 3 or more dimensions. In this sense it is a generalization of the original two-dimensional DIVA version (still available here <https://github.com/gher-ulg/DIVA> but not further developed anymore).

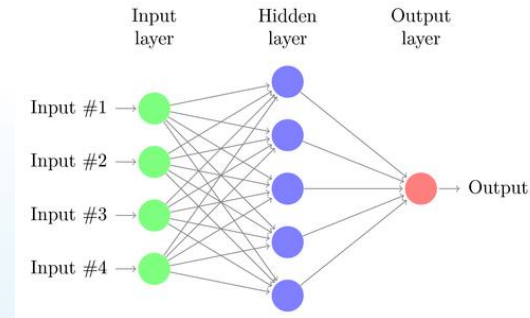
Spatial interpolation



DIVAnd with a Neural Network

$$g(x) = f(v_1, v_2, \dots, v_n) + x'$$

- v_1, v_2, \dots, v_n are environmental variables related to the probability
- $f(v_1, v_2, \dots, v_n)$ is a neural network
- x' is a residue varying of a specified length-scale (DIVAnd)
- Also applicable to occurrence probability with a slightly different formulation



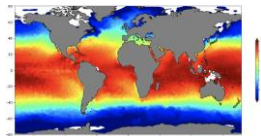
Neural network
(Multilayer
perceptron)

Neural network technique

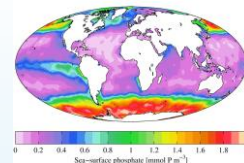
Using other sources of information to improve the interpolation. Used “Co-variables”:

- Sea water temperature (SeaDataCloud)
- Salinity (SeaDataCloud)
- Distance from coast (NASA Goddard Space Flight Center)
- Bathymetry (GEBCO)
- Nitrate, Silicate and Phosphate (World Ocean Atlas 2018)

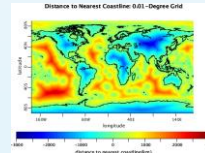
SeaDataCloud
T/S climatology



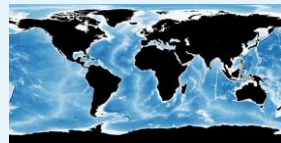
World Ocean Atlas



Distance from coast

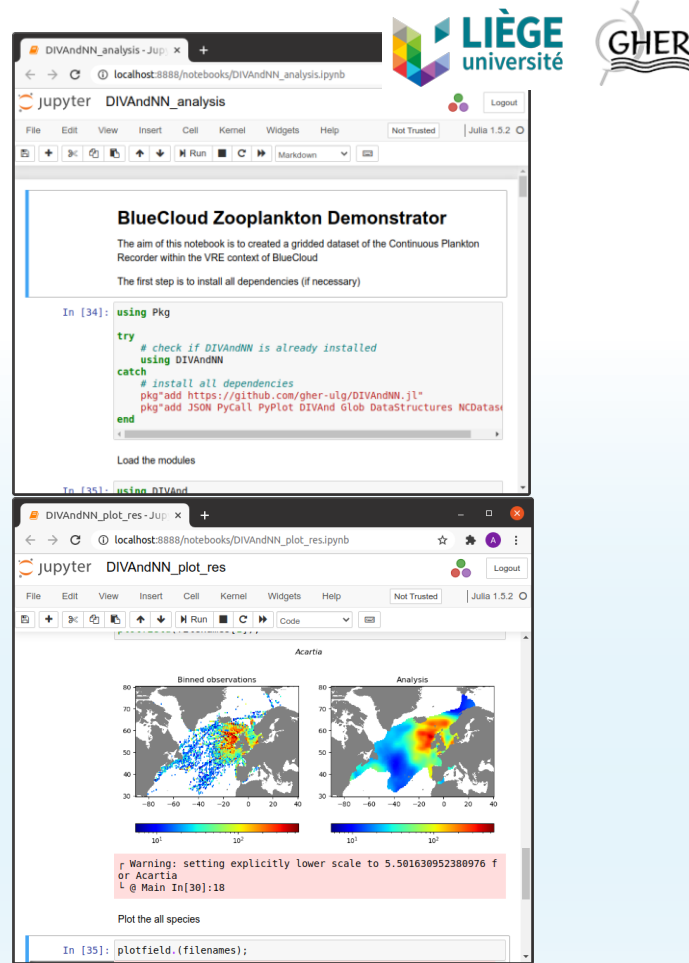


GEBCO Bathymetry



Workflow

- Reproducible approach:
 - **Version control** using GitLab (at ULiege)
 - **Continuous integration** (testing that the code still runs after every pushed commit)
 - Declare all necessary **direct software dependencies**
 - **Full snapshot of the dependency tree** (direct and indirect dependencies)
 - Projects can be easily **instantiated** (i.e. the exact Julia environment can be replicated with a single command)
- Using two jupyter notebooks
 - **Analysis**
 - Preparation of covariables
 - Split data into training and validation dataset
 - DIVAnd + neural network analysis
 - **Visualization of the results**

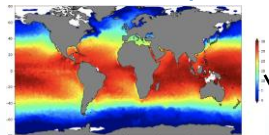




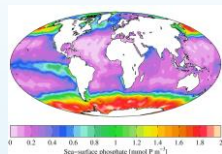
Overview

Blue-Cloud

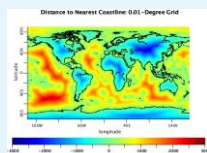
SeaDataCloud T/S climatology



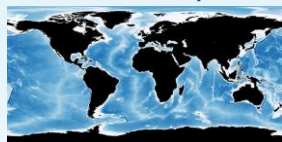
World Ocean Atlas (nutrients)



Distance from coast



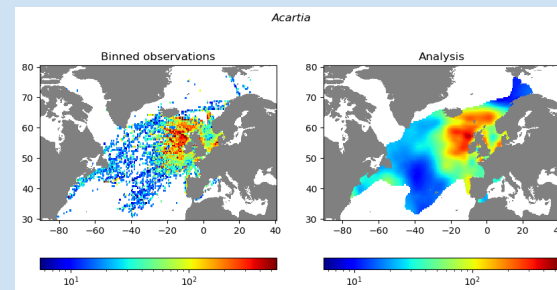
GEBCO Bathymetry



CPR data

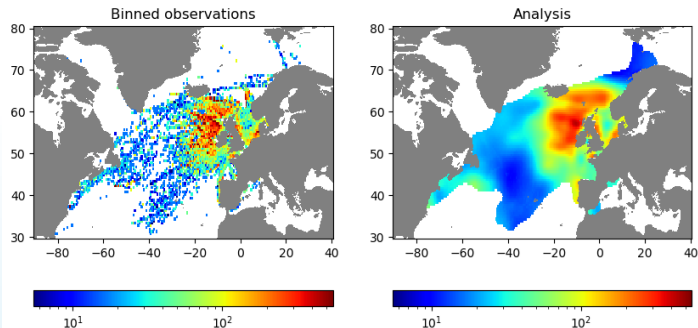


julia DIVAnd + Neural network

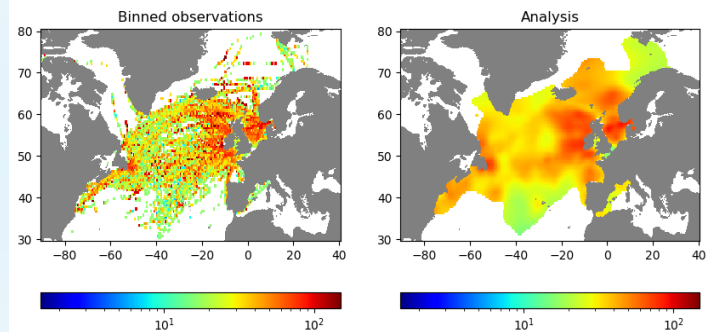


Some example results

Acartia



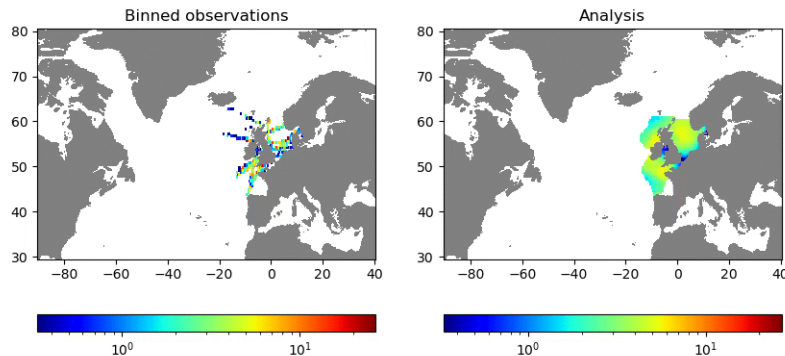
Oithona



- Inhomogeneous sampling -> inhomogeneous error spatially
- A relative error map is derived allowing to mask the value far away from the observations
- Time dimension:
 - All years combined
 - Analysis per year (with a time correlation)

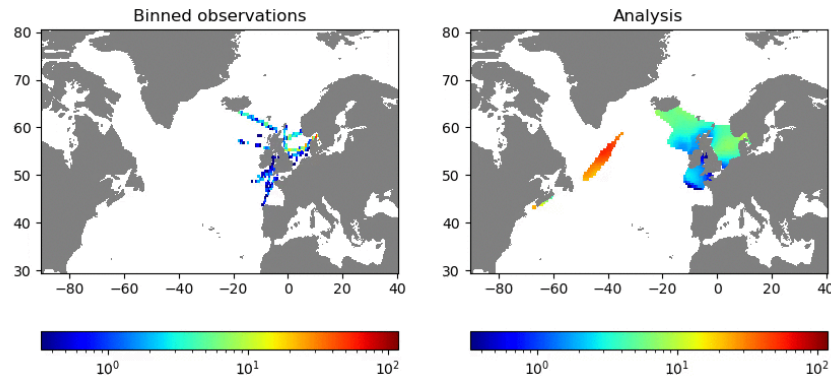
Variation over time

Calanus helgolandicus 1990



- Animation over time for the species distribution
- Difficulty to disentangle the sampling effort from changes of the distribution (at the yearly time scale)
- Per default, only the gridded results are shown where the confidence is high (near the observations) but full fields are available

Calanus finmarchicus 1990





Conclusions

- Collaborative virtual research environments have a large potential to **boost scientific productivity**
- Capture the **relationship** between specie distribution and environment parameters using a **neural network**
- **Spatial (and temporal) coherence**: constraints used in variational inverse methods
- Possibility to use **irregularly sampled observations**
- **Difficulty to disentangle** variability and sampling effort (in particular for yearly results)
- Perspective: explore the potential of **convolutional** neural networks (e.g. DINCAE, Data INterpolating Convolutional Auto-Encoder)

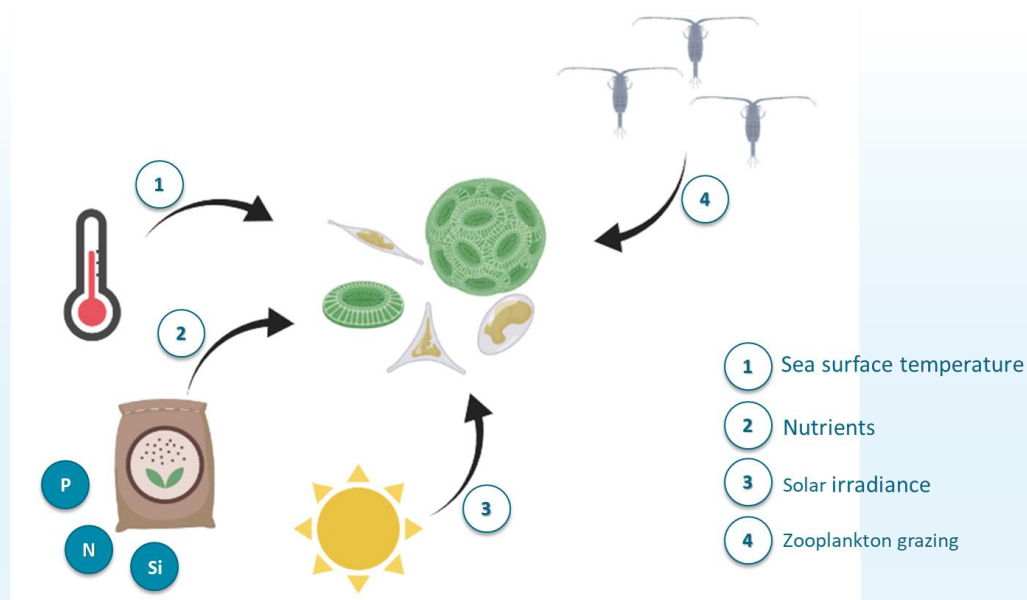
Modelling phyto- & zooplankton Interactions



Modelling phyto- & zooplankton Interactions

Introduction

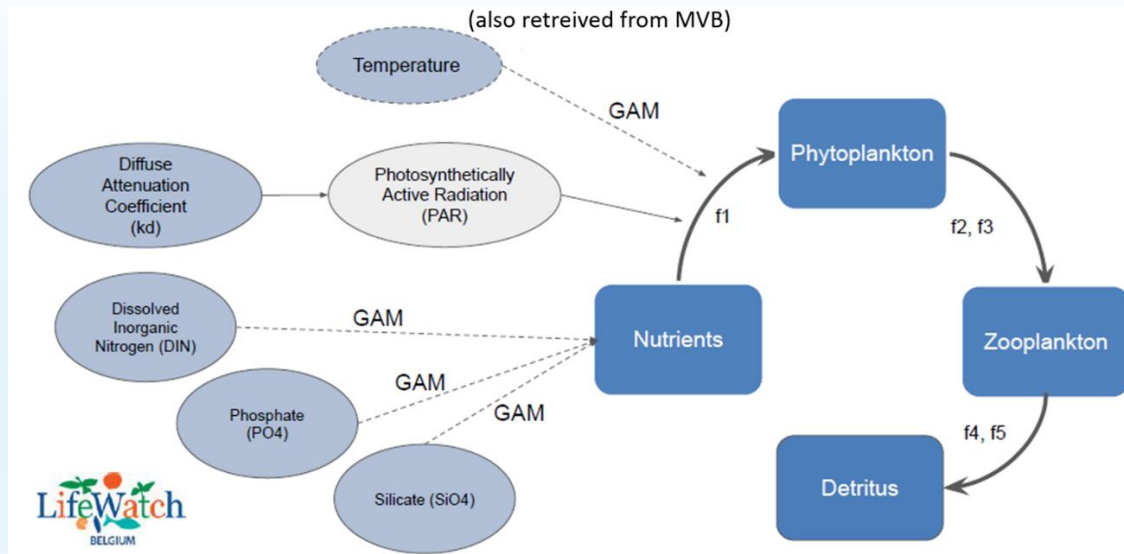
- Changing environmental conditions due to Climate Change
- Predict and mitigate potential effects of Blue Economy activities
- Additional to field observations
- Low-cost and quick method



Modelling phyto- & zooplankton Interactions

Methodology

- GAM to create daily input data
- Nutrient-Phytoplankton-Zooplankton (NPZ) model



Modelling phyto- & zooplankton Interactions

Data sources



Data sources

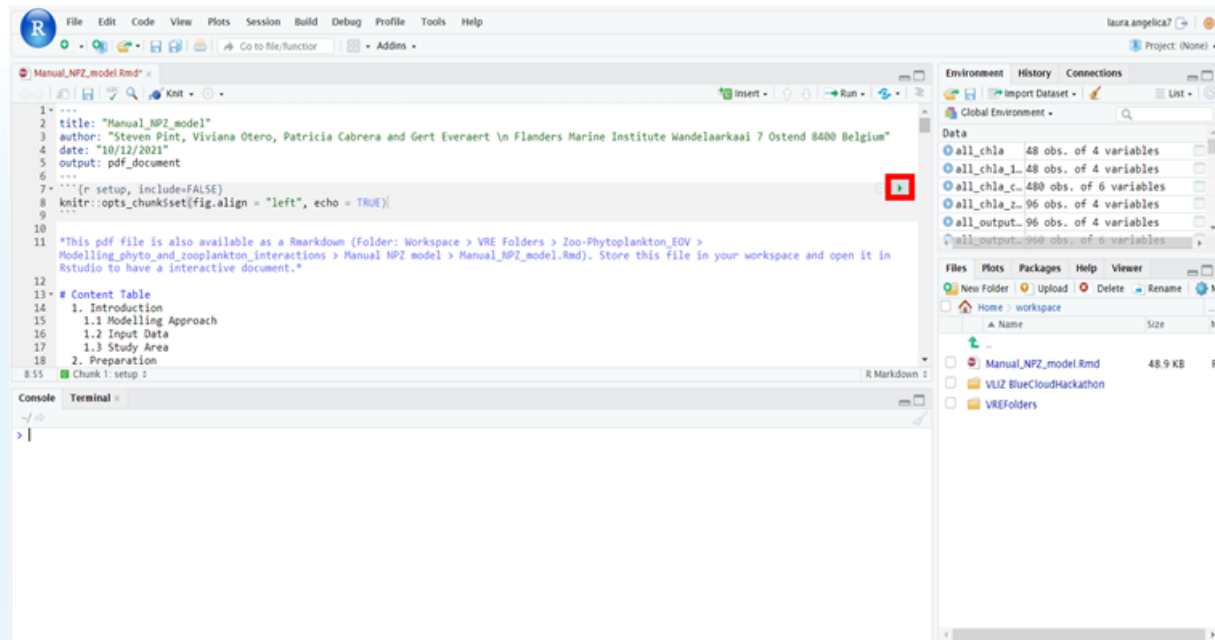
VARIABLES	DATA SOURCES	DATA ACCESS
Phytoplankton abundances (Chla)	https://rshiny.lifewatch.be/station-data/	LifeWatch/Blue-Cloud Vlab*
Zooplankton abundances	http://rshiny.lifewatch.be/zooscan-data/	LifeWatch/Blue-Cloud Vlab*
Nutrients	http://rshiny.lifewatch.be/station-data/	LifeWatch/Blue-Cloud Vlab*
Photosynthetically active radiation (PAR)	https://rshiny.lifewatch.be/ctd-data/	LifeWatch/Blue-Cloud Vlab*
Sea-surface Temperature (SST)	https://rshiny.lifewatch.be/ctd-data/ https://rshiny.lifewatch.be/mvb-data/	LifeWatch/Blue-Cloud Vlab* Meetnet Vlaamse Banken

*Blue-Cloud Vlab= Data also available in the 'VRE Folders' in the Vlab.

Modelling phyto- & zooplankton Interactions

Workflow

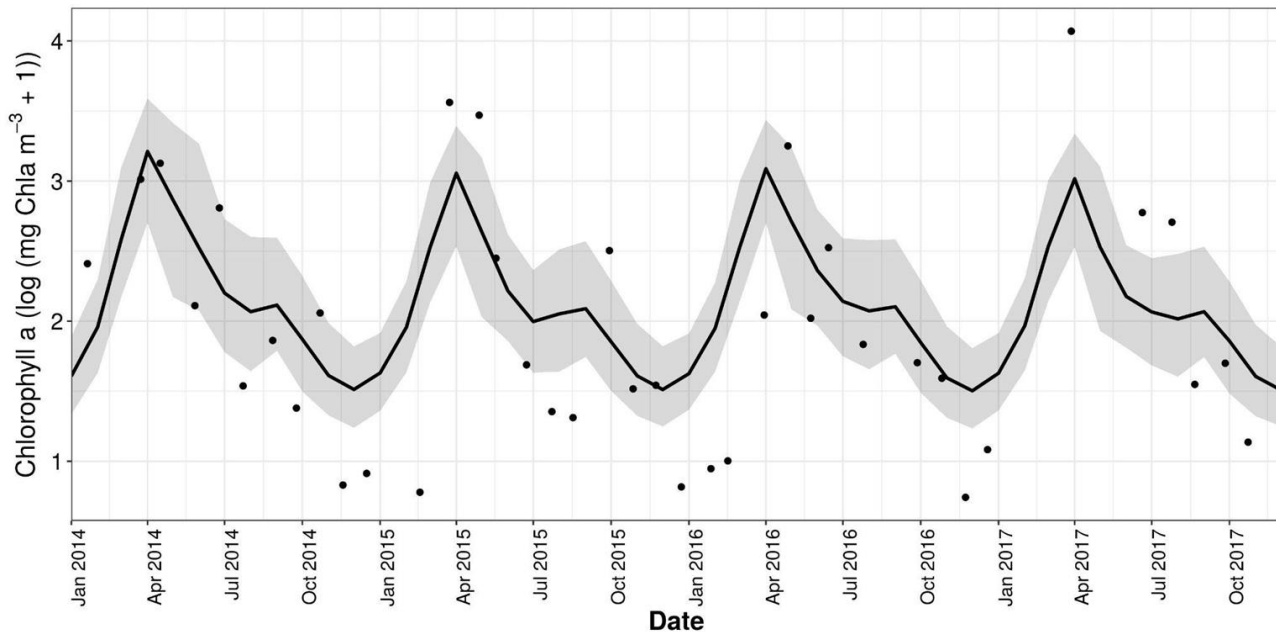
- Rstudio
- Rmarkdown
 - => Step by step guideline
 - Introduction
 - Preparation
 - NPZ model
- Workspace
 - NPZ folder
 - Subfolder (code, results, graphs)



Modelling phyto- & zooplankton Interactions

Results

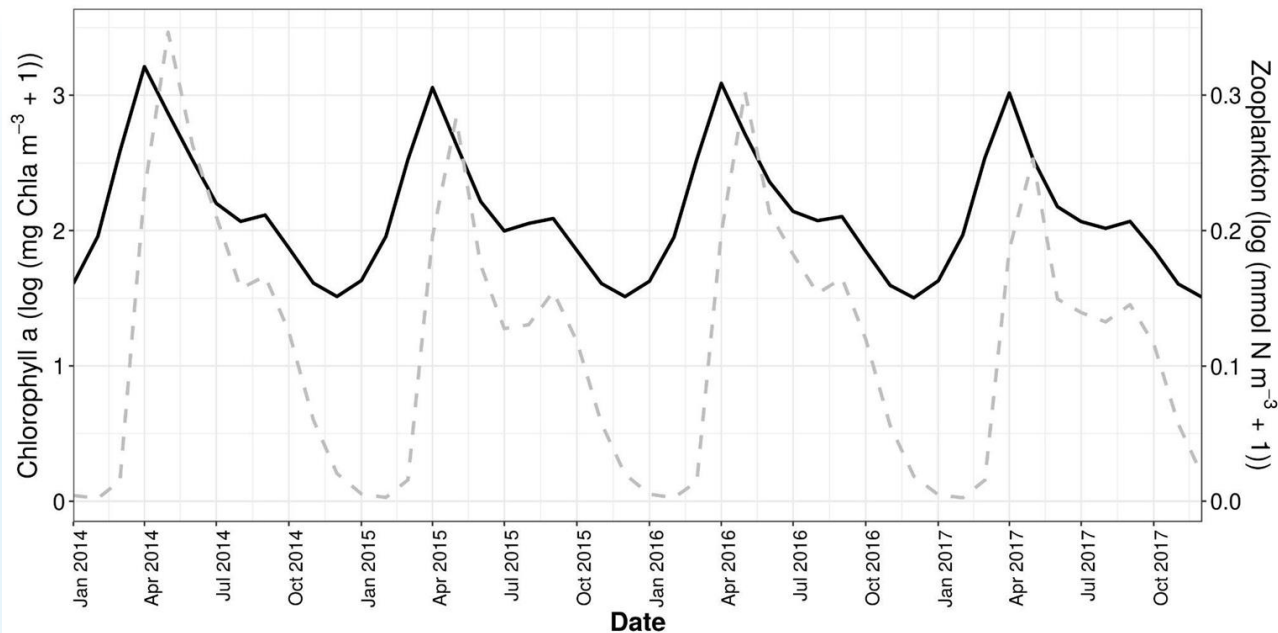
Phytoplankton
biomass dynamics



Modelling phyto- & zooplankton Interactions

Results

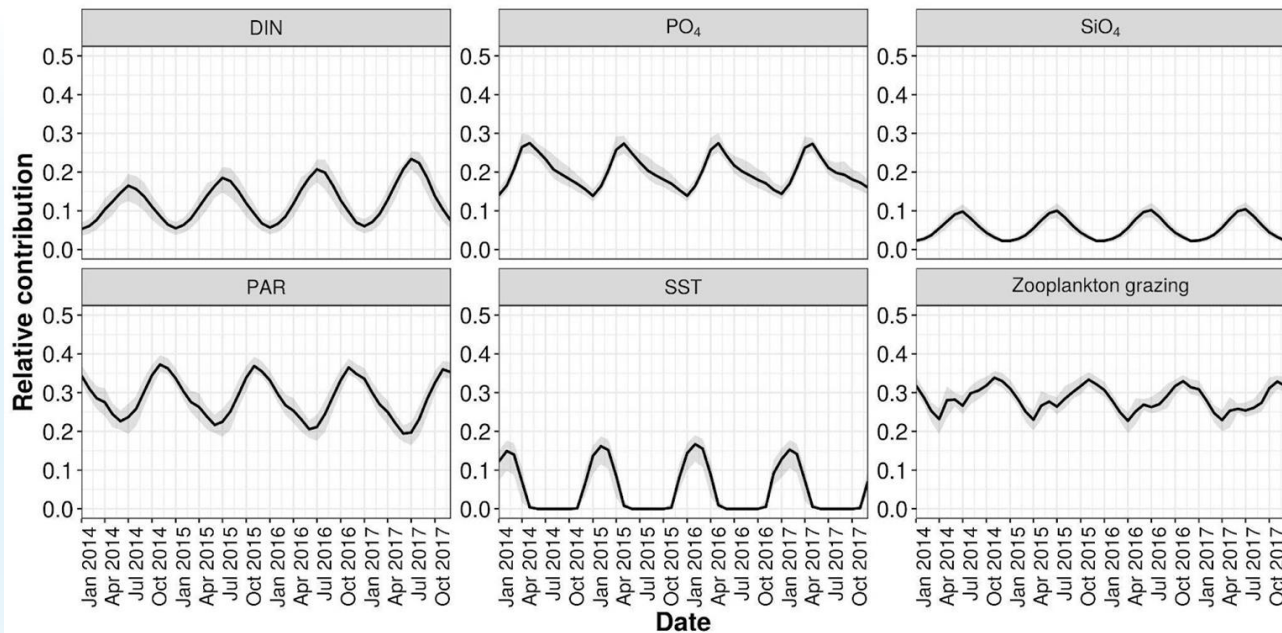
Phyto- and
zooplankton biomass
dynamics



Modelling phyto- & zooplankton Interactions

Results

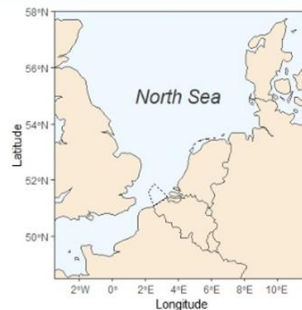
Relative contribution
Per determinant
Per region



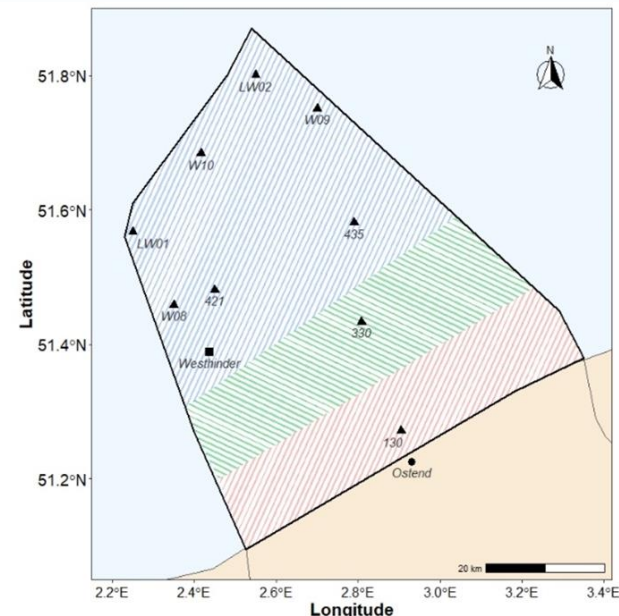
Modelling phyto- & zooplankton Interactions

Case study

- BPNS
- Dynamic coastal area
- 3 regions
 - Nearshore
 - Midshore
 - Offshore



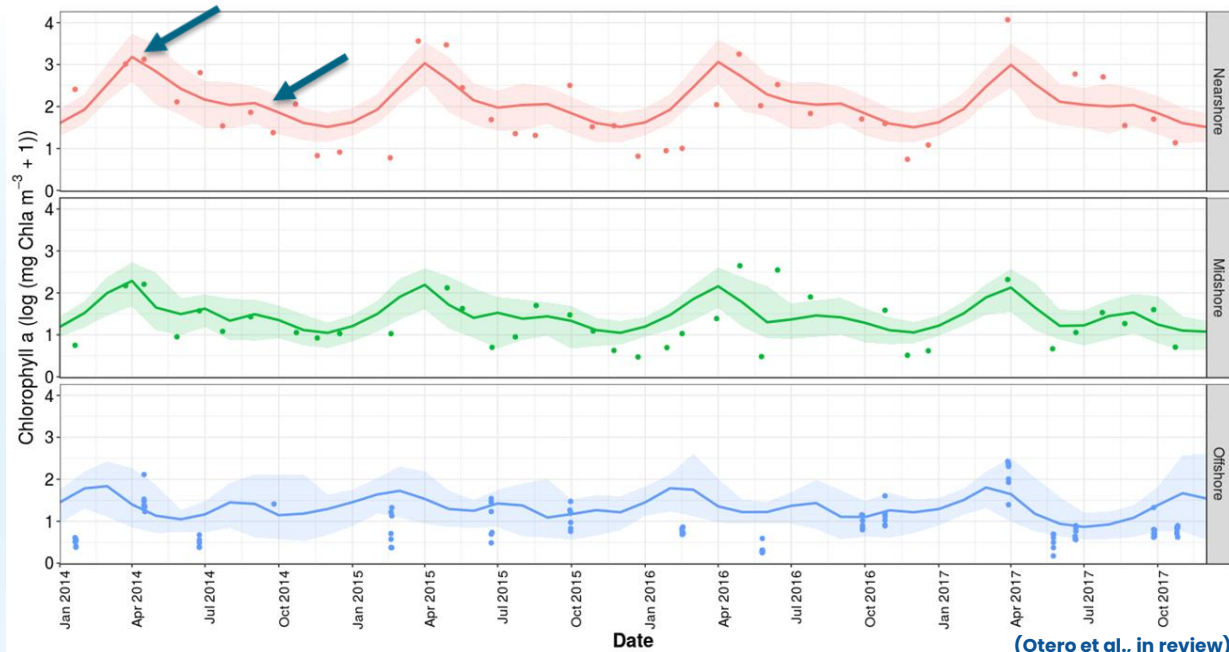
- Nearshore
- Midshore
- Offshore
- Ostend
- ▲ Lifewatch station
- Westhinder



Modelling phyto- & zooplankton Interactions

Case study

Phytoplankton biomass
dynamics
Per region



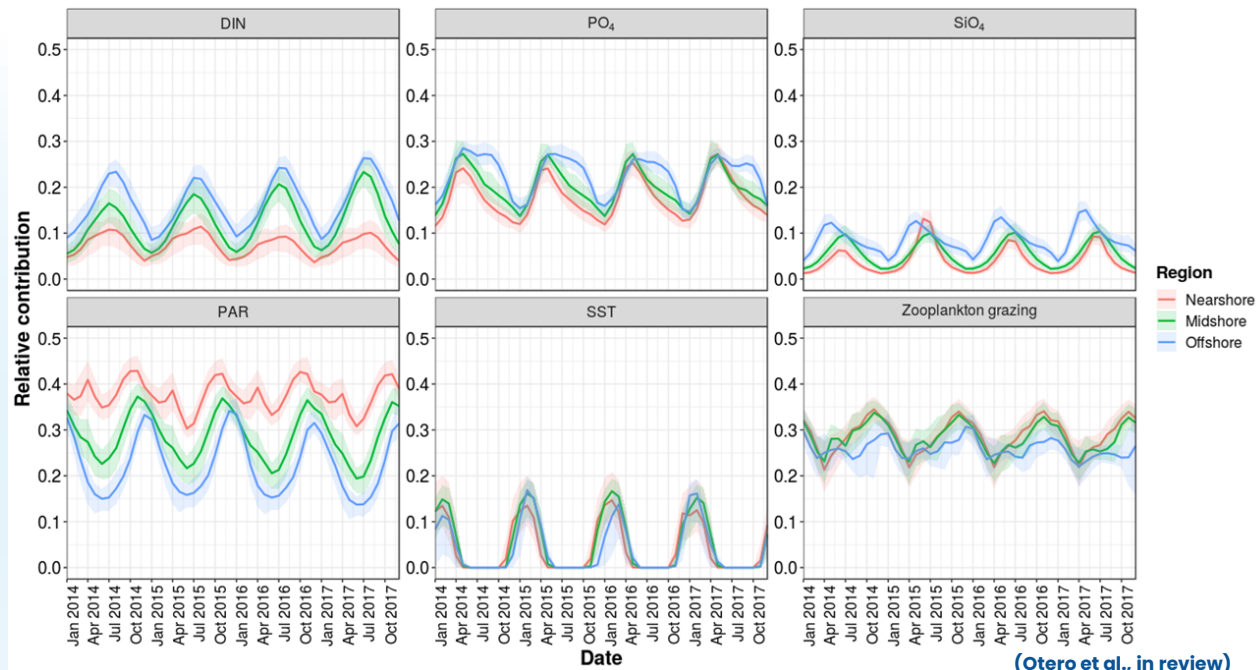
(Otero et al., in review)

Modelling phyto- & zooplankton Interactions

Case study

Relative contribution
Per determinant
Per region

=> Spatiotemporal variability



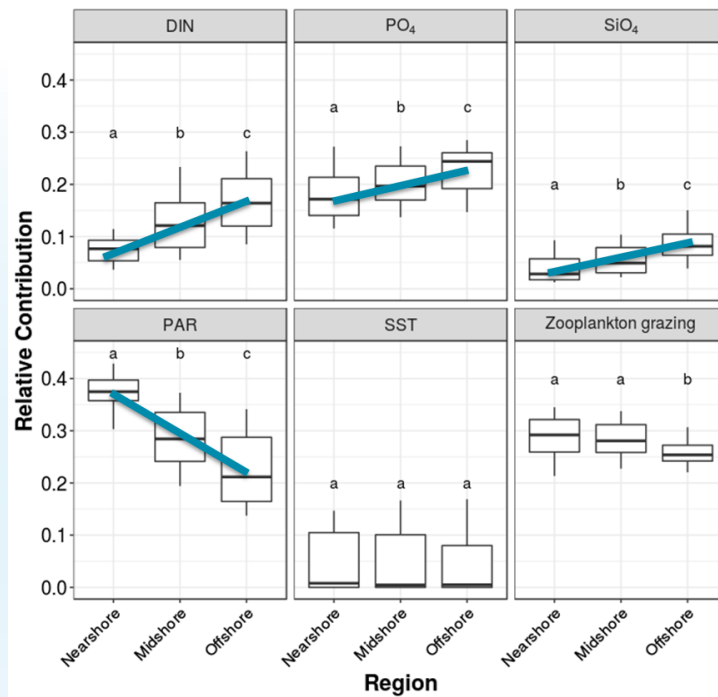
(Otero et al., in review)

Modelling phyto- & zooplankton Interactions

Case study

Relative contribution
Per determinant
Per region

=> Spatial variability



(Otero et al., in review)

Modelling phyto- & zooplankton Interactions

Conclusions

- Contribute to a better mechanistic understanding of the spatiotemporal dynamics of phytoplankton biomass
- Predict whether the ecosystem will change under future climate scenarios and/or Blue Economy activities
- Additional to field observations in monitoring programs
- Powerful tool that has great scientific potential

Useful materials for users

- To explore the demo register at https://blue-cloud.d4science.org/web/zoo-phytoplankton_eov
- “Users’ Handbook”: Guidelines for each Virtual Lab: <https://data.d4science.net/NyS7>
- Video tutorials in Blue-Cloud youtube channel: www.youtube.com/c/BlueCloudorg
- News & articles: www.blue-cloud.org/vlabs/zoo-and-phytoplankton-eov-products



@BlueCloudEU



Blue-Cloud

Behind the demonstrator:

Thank you!



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