

# Numerical modelling of the benthic-pelagic coupling (BPC) in coastal marine ecosystems at contrasting sites

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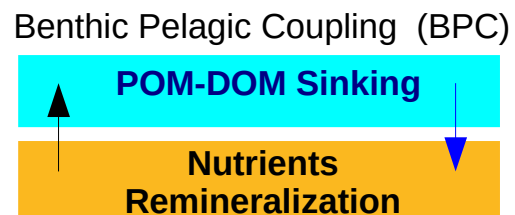
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<sup>3</sup> Department of Physics and Astronomy, Alma Mater Studiorum, Università di Bologna

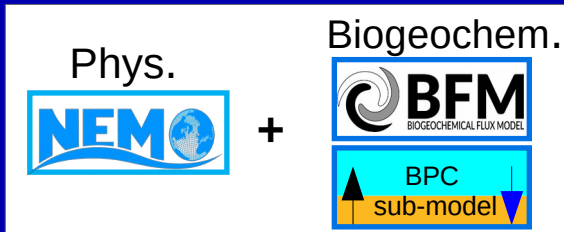
## 1. Scientific Goals

The Benthic and Pelagic fluxes play a crucial role in governing coastal waters dynamics.



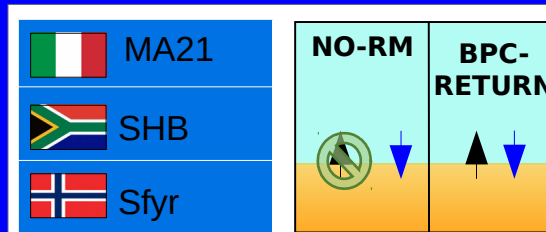
## 2. Model setup

NEMO - BFM 1D Configuration + embedded BPC submodel



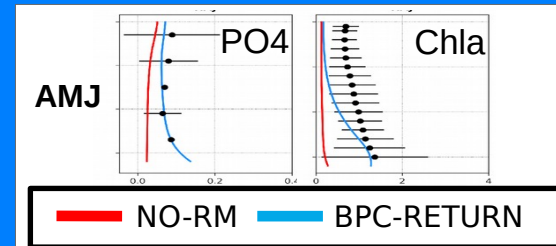
## 3. Implementation sites Experiments design

N. 3 implemented sites  
N. 2 Experiments (Comparison)



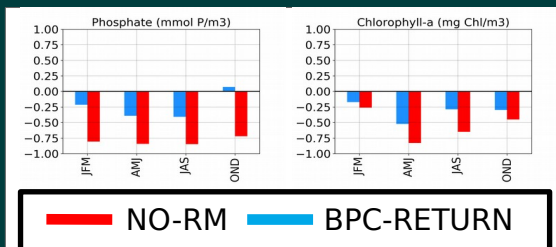
## 4. Gulf of Trieste (MA21)

Simulated Inorganic Nutrients affect Chl-a dynamic (mainly at depth, 78m).



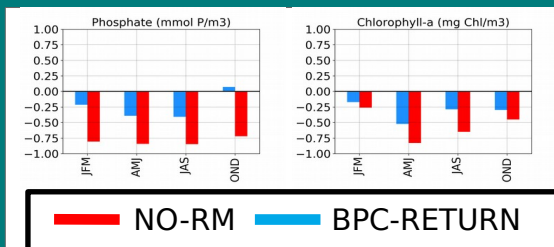
## 5. St.Helena Bay (SHB)

Inorganic Nutrients seasonal improvements positively affect Chl-a dynamic (Normalized Mean Seas. Bias)



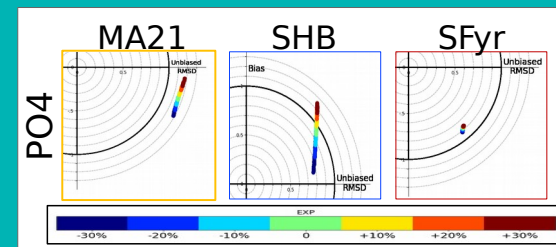
## 6. Svinøy Fyr (SFyr)

Chlorophyll dynamic is related to nutrients dynamic and light limitation (JFM). (Normalized Mean Seas. Bias)



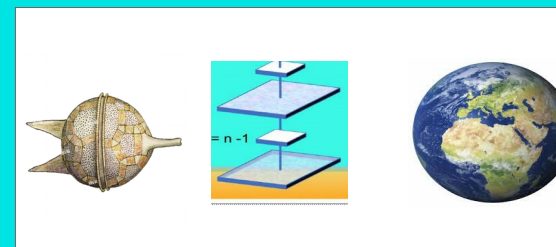
## 7. Sensitivity Analysis

Different degree of sensibility to the B-C fluxes (RMSE spread) and to site-specific characteristics.



## 8. Conclusions

- Model improvements in reproducing B-P fluxes;
- Different sedimentation-remuneralization scenarios



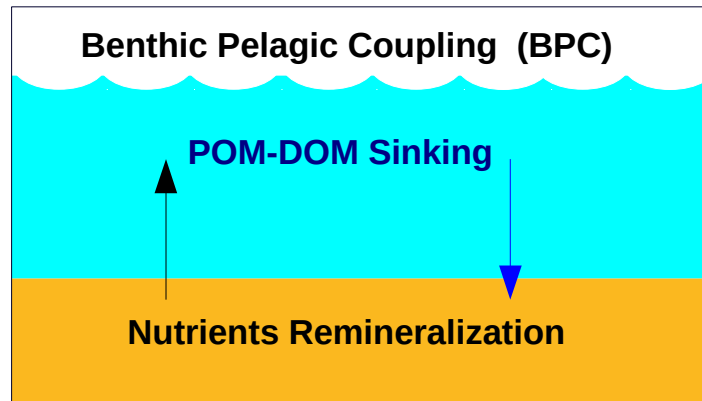
# Scientific Framework

Coastal waters host the world's most productive ecosystems, providing:

- 30% of the global primary production;
- 80% of the organic matter burial;
- ~30% of atmospheric CO<sub>2</sub> sink (6% -11% anthropogenic CO<sub>2</sub> sink).

(Borges et al., 2011, Hardison et al., 2017)

Benthic activity play an important role in determining the pelagic biogeochemical characteristics of coastal waters (Soetaert et al., 2000, Griffiths et al., 2017).



The physically mediated exchanges structuring the BPC are constituted by the sinking and resuspension fluxes of particulate organic matter and by the diffusion of inorganic nutrients

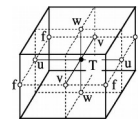
# State of the art

- Limited knowledge about the exchange rates between the two habitats (Griffiths et al., 2017)
- Availability of data (Soetaert et al., 2000, Griffiths et al., 2017)
- Benthic-pelagic fluxes neglected or approximated to a simple closure term (Soetaert et al., 2000)

# Scientific Goals



To implement and test a numerical model addressing benthic dynamics and BPC processes



To assess the skills of one-dimensional coupled physical-biogeochemical models in simulating the BPC



Evaluate ecosystem dynamics in three marine areas with different climatic and ecological characteristics



# Methodological approach

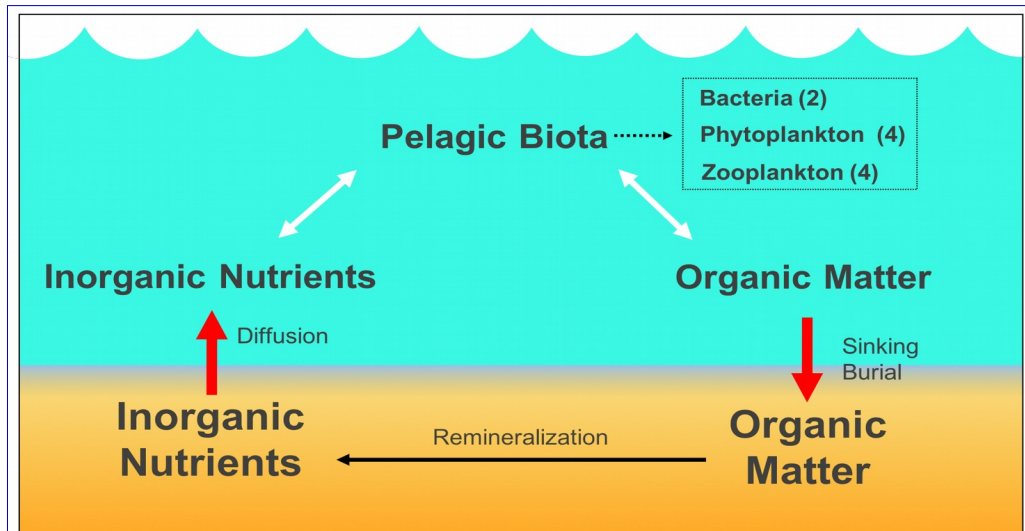
## 1-D configuration



$$\frac{\partial A}{\partial t} = \frac{\partial A}{\partial t} \Big|_{phys} + \frac{\partial A}{\partial t} \Big|_{bio}$$

A = generic state variable

## Benthic-Pelagic Sub-model




$$\frac{dQ_j^{(1,6)}}{dt} \Big|_{P_j^{(1,4)}, R_j^{(1,6)}}^{sed} = -\omega_{bur} \left[ R_j^{(1,6)} + (\xi_j, 1 - \xi_j) \sum_{i=1,4} P_{(j)} \right]_{z=z_b}$$


$$\frac{dQ_j^{(1,6)}}{dt} \Big|^{rmn/diff} = \mu_{Q_j^{(1,6)}} Q_j^{(1,6)} \Big|_{z=z_b}$$

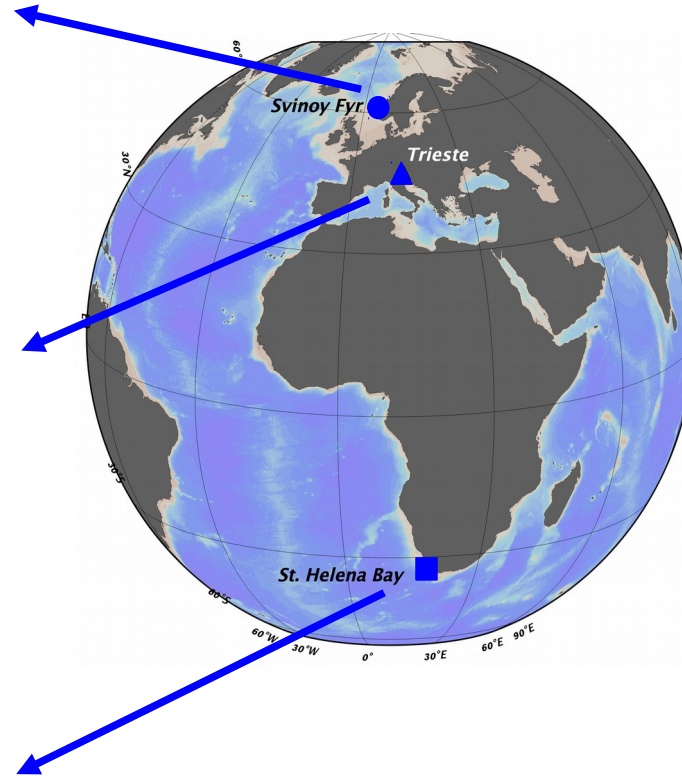
$\omega, \mu$	Burial and remineralization parameters	
$\xi_j$	Partitioning coefficient	
$R_j^{(1)}$	Pelagic dissolved organic matter	where $j = C, N, P$
$R_j^{(6)}$	Pelagic particulate organic matter	where $j = C, N, P, S$
$P_j$	Phytoplankton	where $j = \text{Diatoms, Large phytoplankton}$
$Q_j^{(1)}$	Benthic dissolved matter	where $j = C, N, P$

# Implementation site

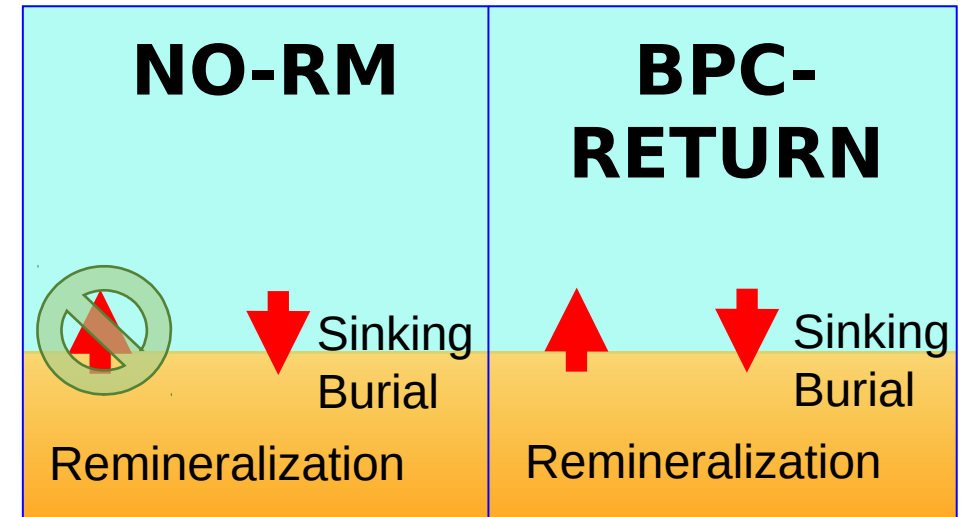
Site:		<b>SFyr</b>
Maximum Depth [m ]		150
Atmospheric Forcing		ERA5
Observations		PO4; NO3; Chl-a; SiO4;

Site:		<b>MA21</b>
Maximum Depth [m ]		16
Atmospheric Forcing		ERA-Interim
Observations		PO4; NO3; Chl-a; NH4; O2

Site		<b>SHB</b>
Maximum Depth [m ]		78
Atmospheric Forcing		WRF model
Observations		PO4; NO3; Chl-a; SiO4; O2;



# Experiments design

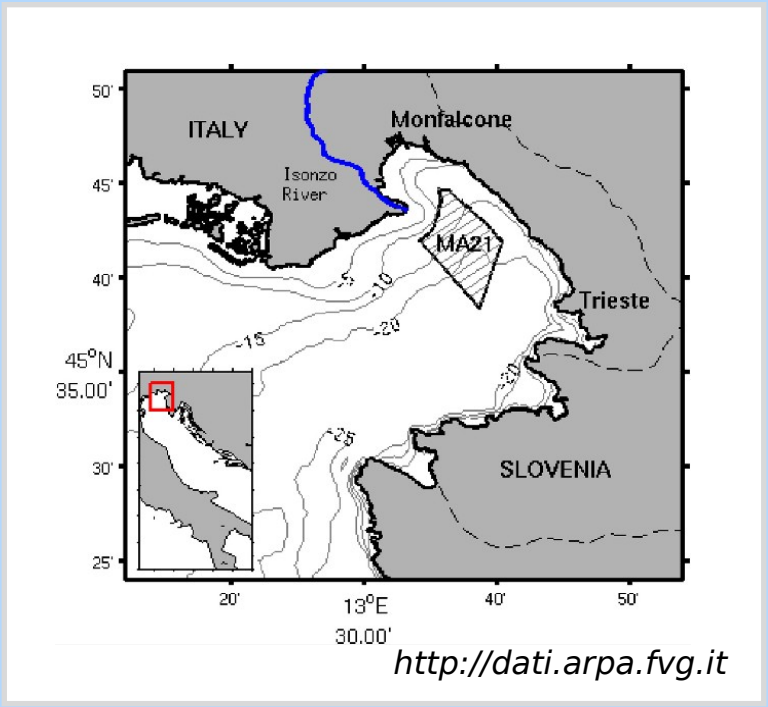


**NO\_RM:** Remineralization flux nullified

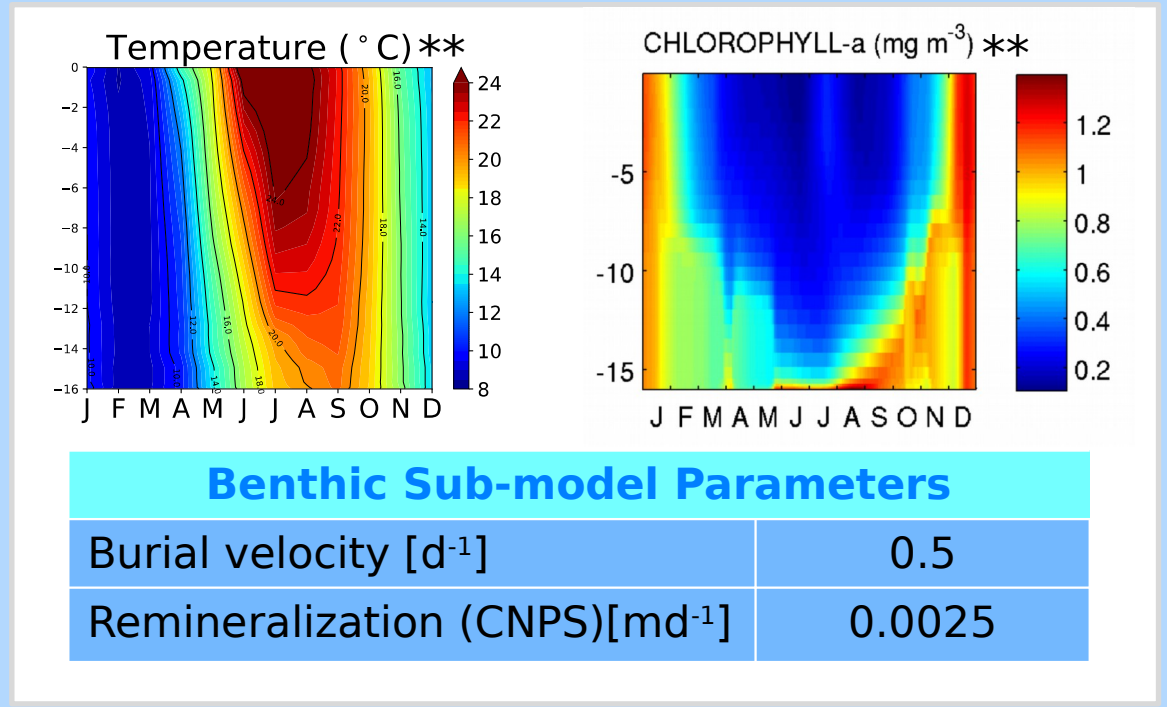
**BPC\_RETURN:** Both Sinking-Burial and Remineralization fluxes were considered



## Study Area



## Physical and Biogeochemical dynamic



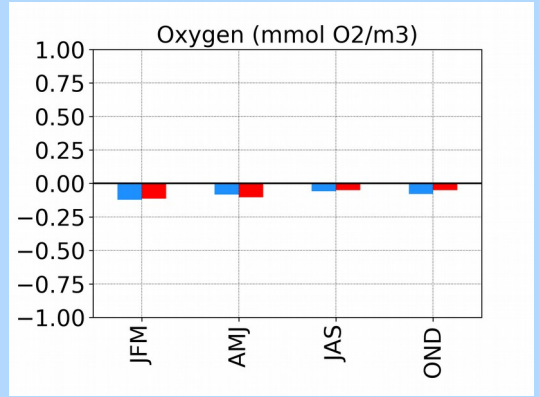
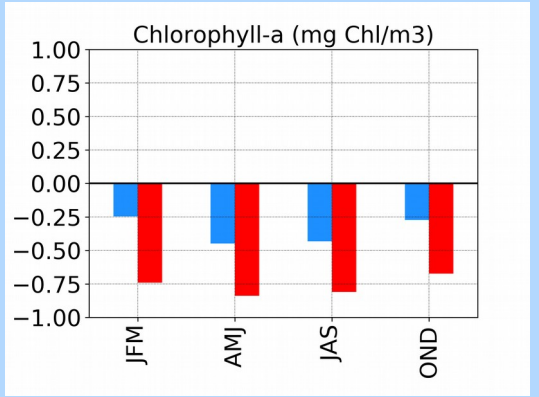
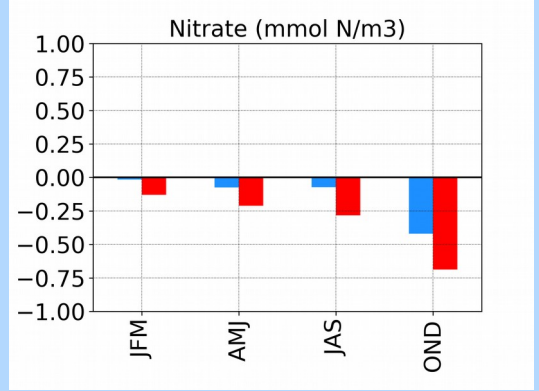
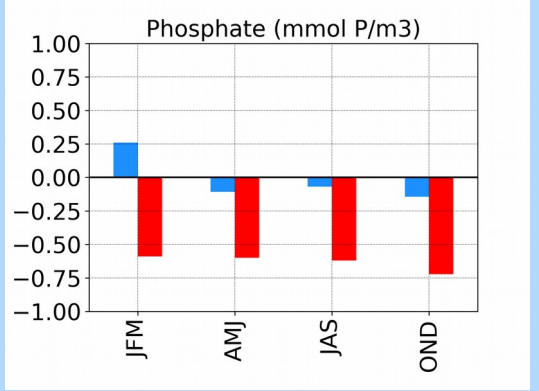
- **Well-mixed conditions** during winter and vertical thermal **stratification** in summer
- **Homogeneous** primary production condition in winter and **deep phytoplankton production** in summer

\*\* Study Area figure and Chlorophyll Hovmöller from Mussap et al., 2016. Temperature monthly data from ARPA-FVG,OGS (2000-2011,2013)

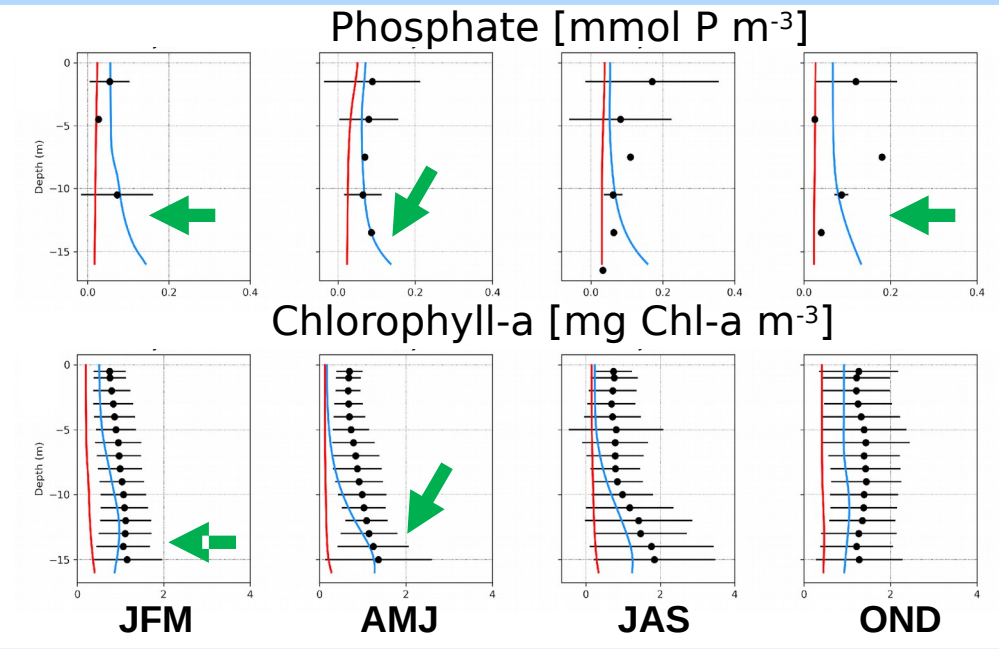




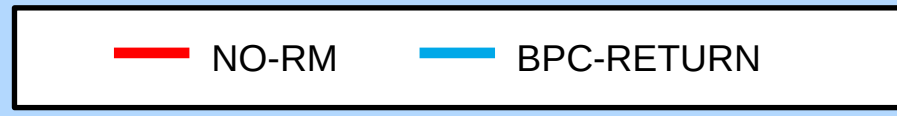
## Seasonal Normalized (in z) Mean Bias



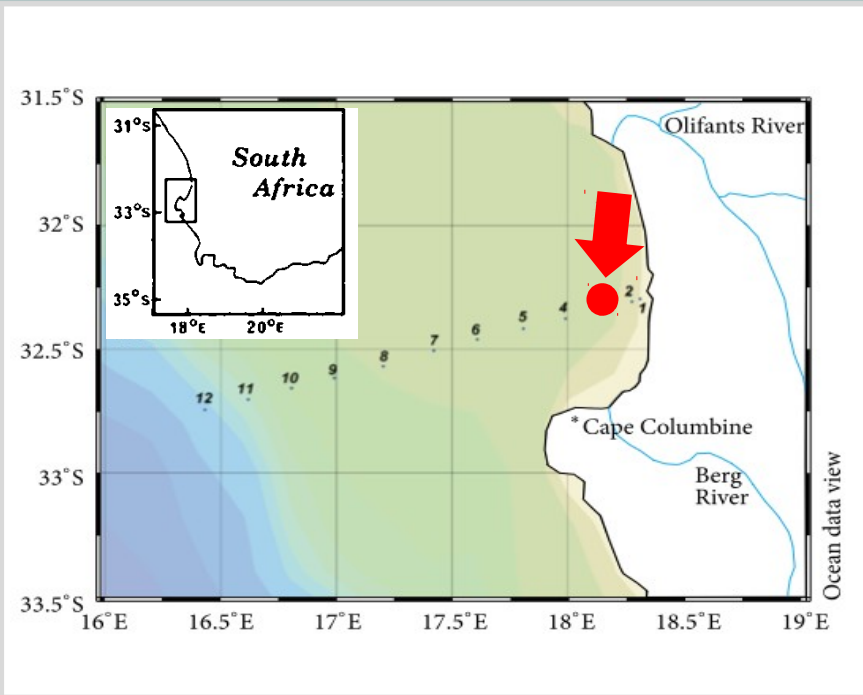
## Mean Seasonal Vertical Profiles



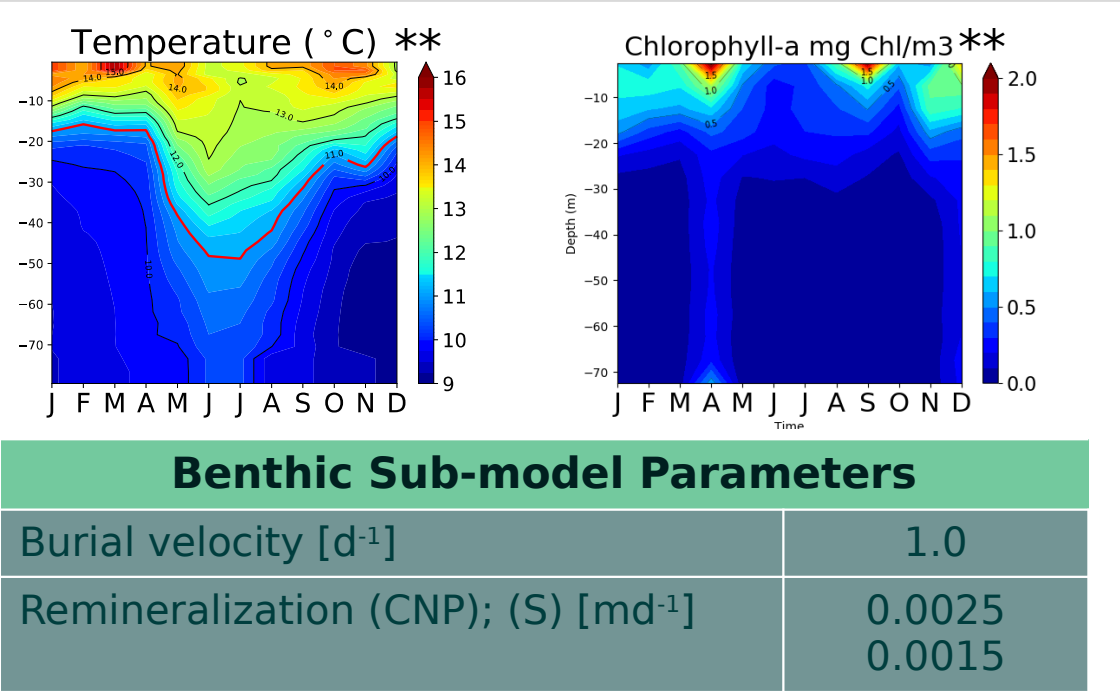
- **NMB in NO-RM > NMB in BPC- RETURN** (exception of O<sub>2</sub>)
- **BPC-RETURN: Inorganic nutrients** (at depth) **improvements** lead **amelioration of the simulated Chl-a dynamic** (green arrows).



## Study Area



## Physical and Biogeochemical dynamic

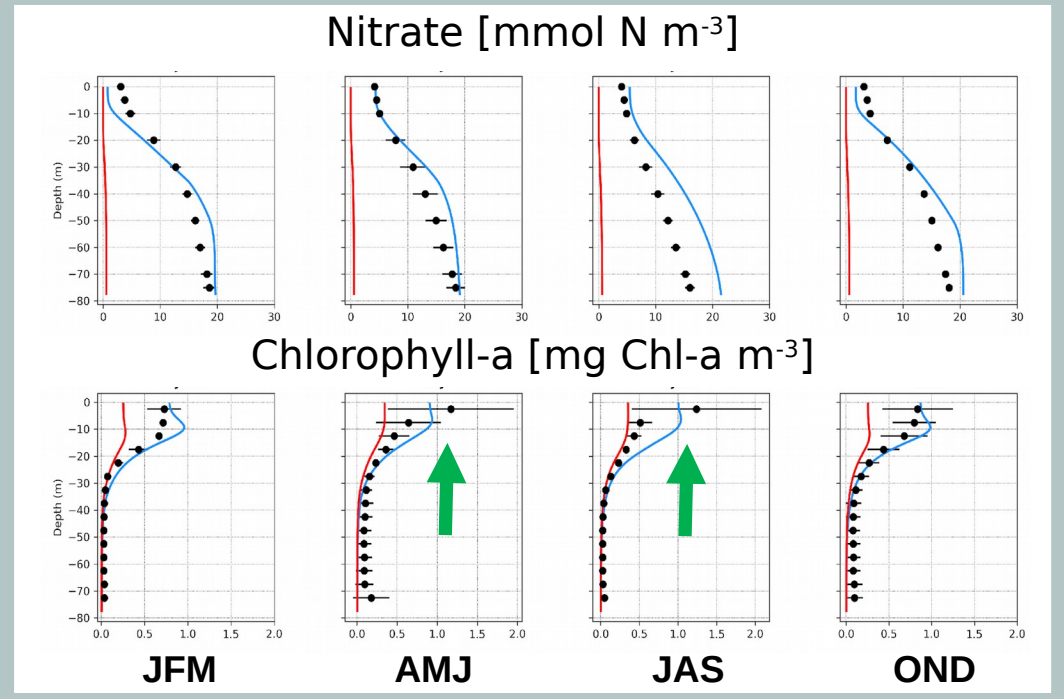
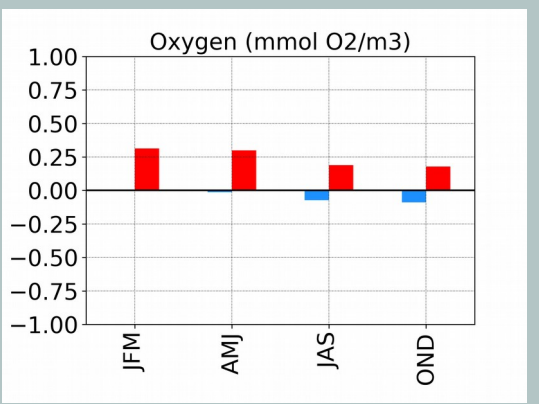
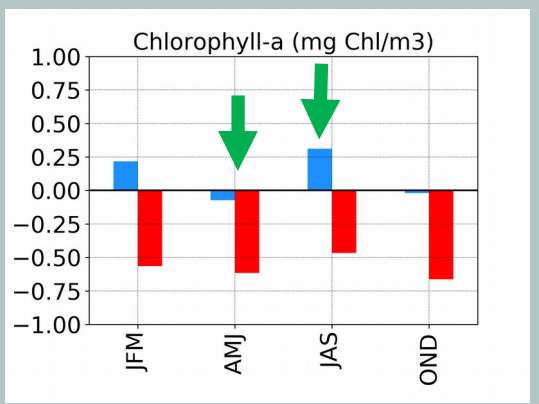
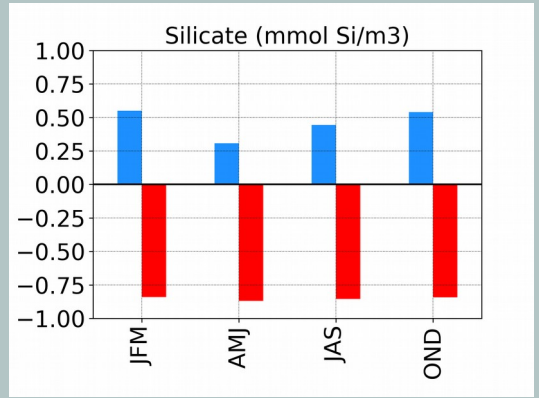
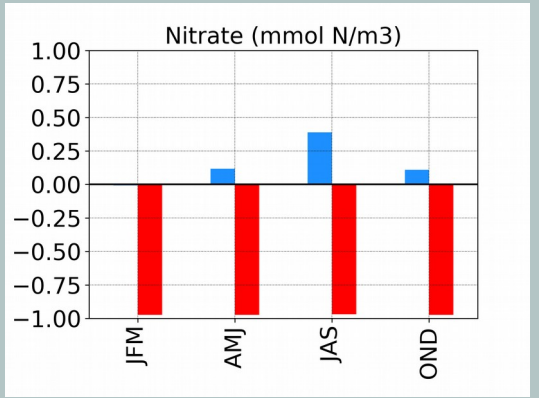


- Embedded in the Benguela Current Large Marine Ecosystem
- South-easterly trade winds driven **upwelling between Sep.t-Apr.** (Vertical diffusivity [m<sup>2</sup>s<sup>-1</sup>] = 5.0e-5)
- Peaks of primary production occurring during the upwelling period (maxima in April and September)  
*Shannon et al., 1996.*

\*\* Monthly data (2000-2017) from BENEFIT (Benguela Environment and Fisheries Interactions and Training) program of the Department of Environmental Affairs of South Africa

### Seasonal Normalized (in z) Mean Bias

### Mean Seasonal Vertical Profiles



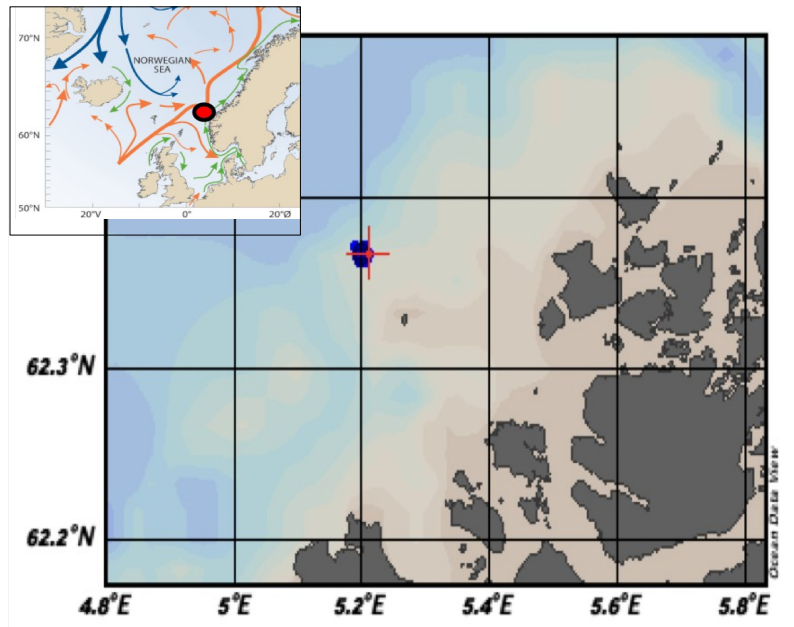
- Bias NO-RM > BPC- RETURN
- Inorganic **Nutrients** seasonal **improvements** **positively affect Chl-a** dynamic seasonality (AMJ-JAS)



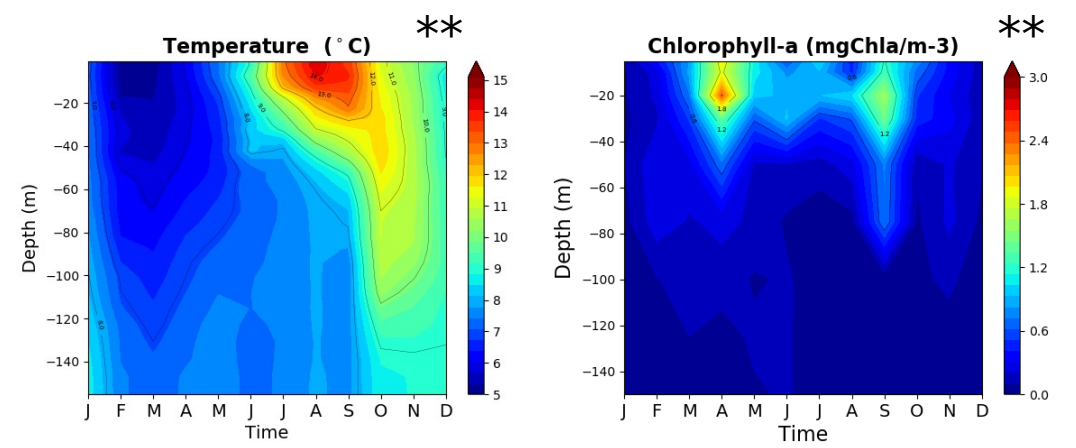




## Study Area



## Physical and Biogeochemical dynamic



### Benthic Sub-model Parameters

Burial velocity [d <sup>-1</sup> ]	1.0
Remineralization (CNP); (S) [md <sup>-1</sup> ]	0.0050

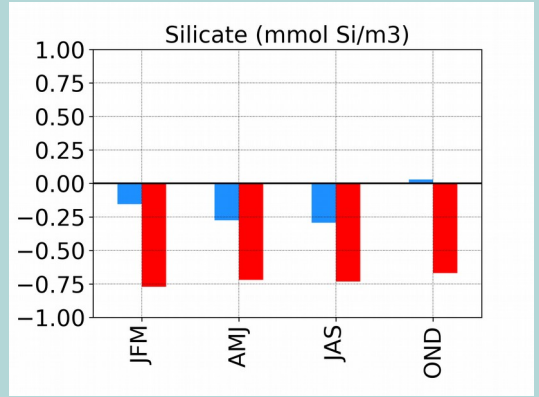
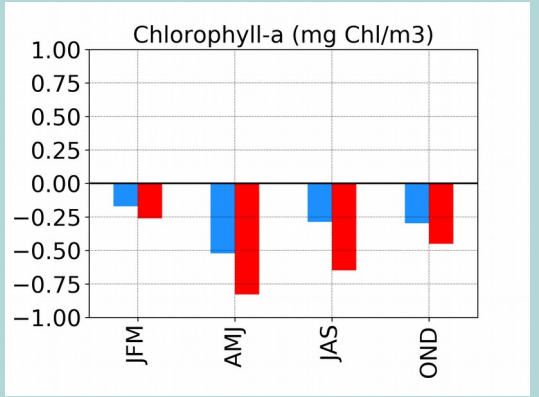
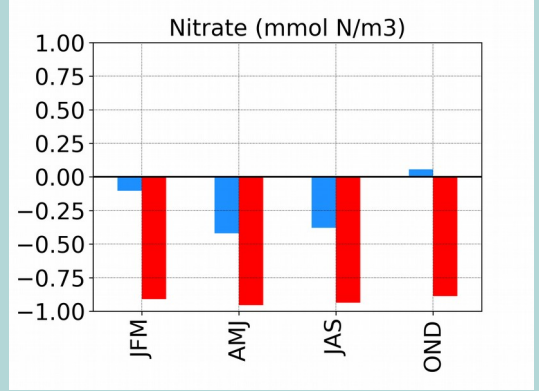
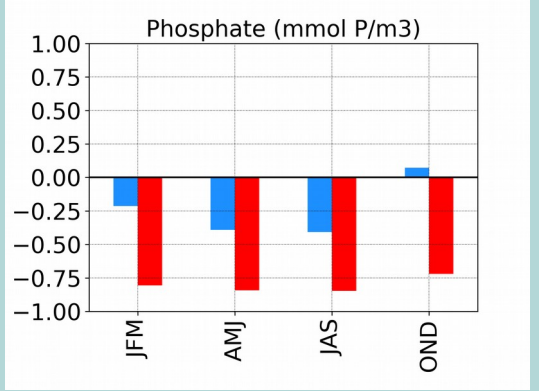
- Cold and deep mixed dynamic
- No Sea Ice formation (Norwegian Coastal Current)
- Phytoplankton peaks in no light limited seasons.

*Ibrahim et al., 2014*

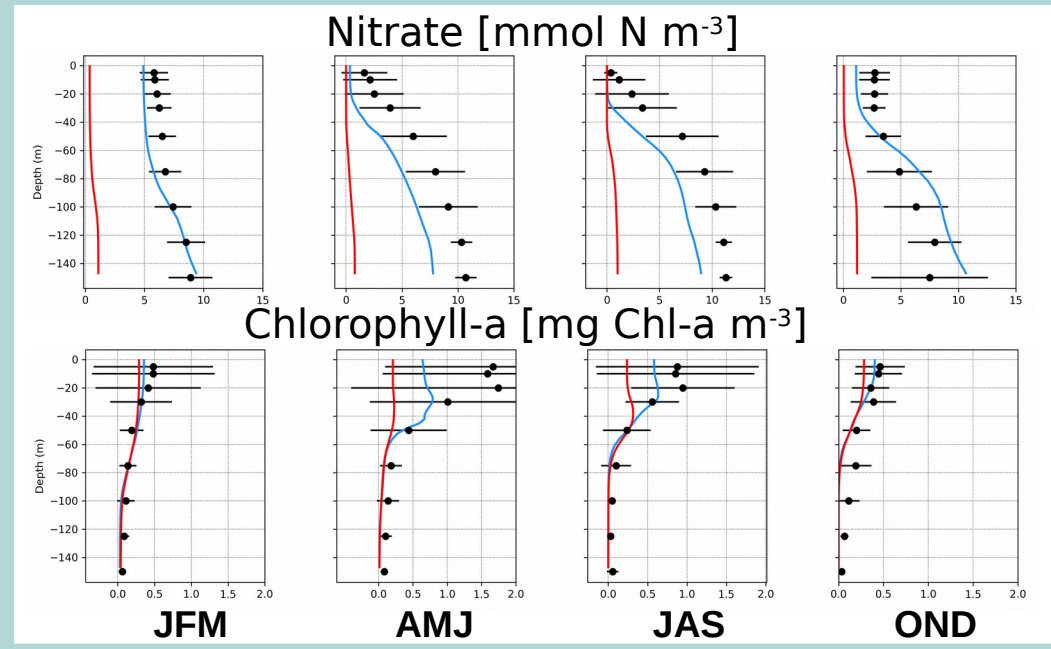
\*\* Monthly data from the Institute of Marine Research - Norwegian Marine Data Centre (INR- NMD) (1995-2015)



## Seasonal Normalized (in z) Mean Bias



## Mean Seasonal Vertical Profiles



- Bias **NO-RM > BPC-RETURN**
- **No sensible Chl-a growth in winter** (light limited primary production)
- Spring-summer **nutrients consumption** attributable to **Phytoplankton** dynamic



## Overall goals

1. Find the 'best' setup of BPC parameterizations among a range of site specific values
2. Evaluate the role of BPC in determining the pelagic biogeochemical cycling

## Analysis Procedure

**Explore Remin and Burial ranges to find minimum error metric for  $PO_4$ ,  $NO_3$ , Chla**

(Annual mean vertical profile)

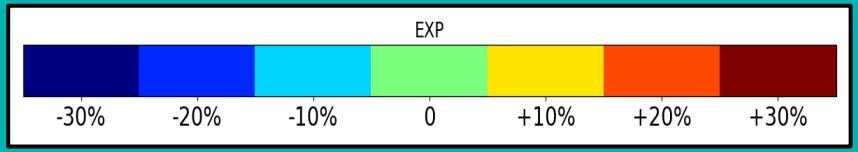
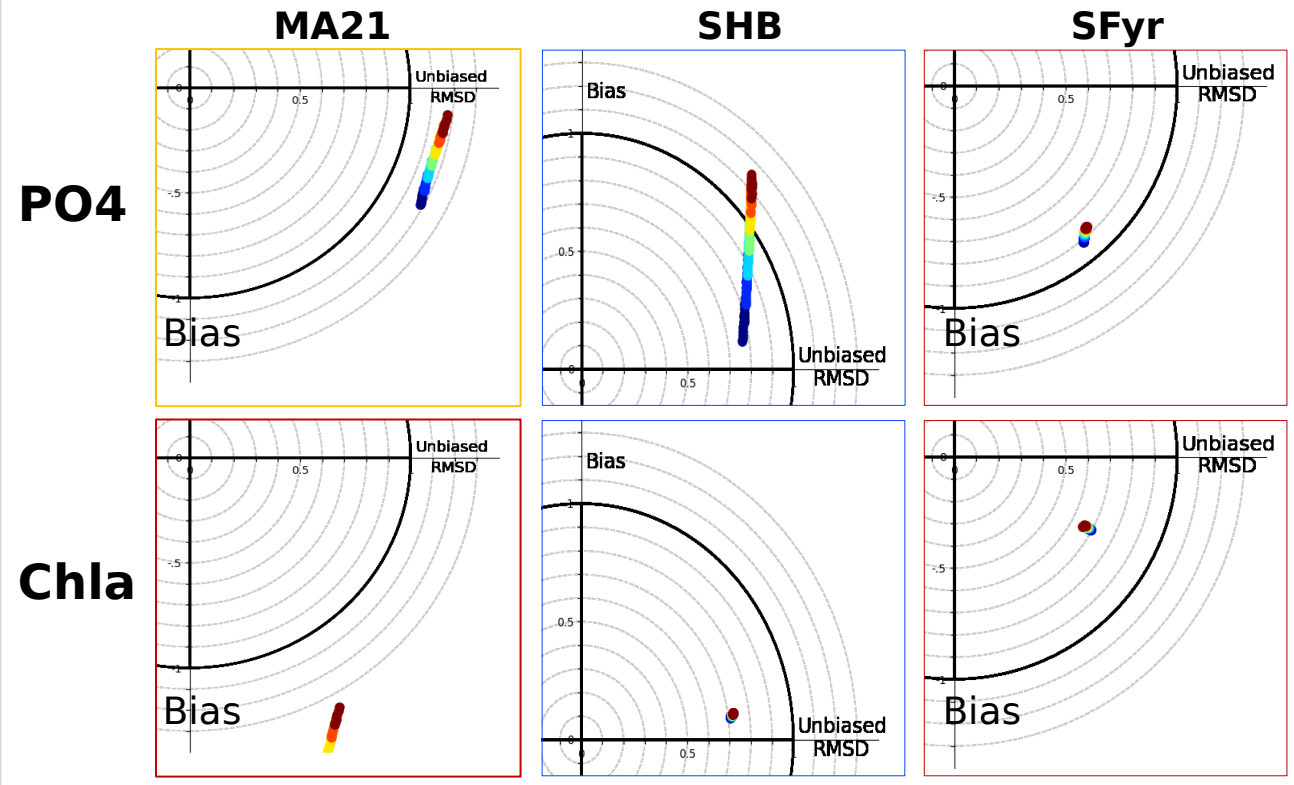
Summary Diagrams  
 (Taylor et al., 2001, Joliff et al., 2009)

Normalized Root Mean Square Error  
 (Mentaschi et al., 2013)

Site	Burial [ $m d^{-1}$ ]	Remineralization [ $d^{-1}$ ]
<b>MA21</b>	ref = 0.5 (0.35 - 0.65)	ref=0.0025 (0.00175-0.00325)
<b>SHB</b>	ref=1.0 (0.60 - 1.20)	ref=(0.0025) (0.00175-0.00325)
<b>SFyr</b>	ref=1.0 (0.10 - 1.50)	ref= (0.0050) 0.00350-0.00800

## Summary Diagrams

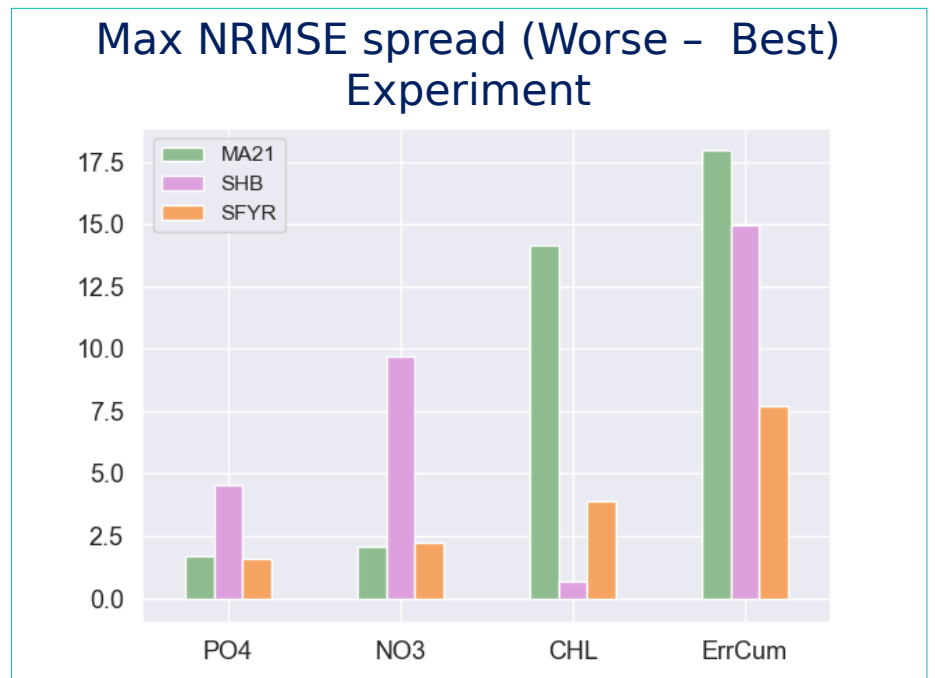
- Identification of best model setup from FG



Remineralization-grouped

## NRMSE

- Effect of BPC processes on pelagic dynamics



- MA21 and SFyr: small variations of inorganic nutrients affect primary production
- SHB: Nutrients variation does not affect primary production dynamic

## Final setup of BPC parameters

Site	Depth [m]	Bur [m d <sup>-1</sup> ]	Remin [d <sup>-1</sup> ]
MA21	16	0.35	0.00 325
SHB	78	<b>0.60</b>	0.00 175
SFyr	150	0.10	<b>0.00 800</b>

## Estimate of benthic-pelagic fluxes

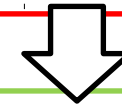
Site	Depth [m]	POC-Burial [mg C m <sup>-2</sup> d <sup>-1</sup> ]	N-Remin [mmol N m <sup>-3</sup> d <sup>-1</sup> ]	P-Remin [mmol p m <sup>-3</sup> d <sup>-1</sup> ]
MA21	16	<b>-0.1344</b>	<b>0.910</b>	<b>0.050</b>
SHB	78	-0.0021	<b>1.027</b>	<b>0.068</b>
SFyr	150	<b>-0.0636</b>	0.336	0.016

- **Dependency** between station **depth** and BP **fluxes** intensity

[Suess et al., 1980]

## Qualitative analysis NRMSE based

### Initial setup of BPC parameters (First Guess)



### Final setup of BPC parameters (Best Exp.)

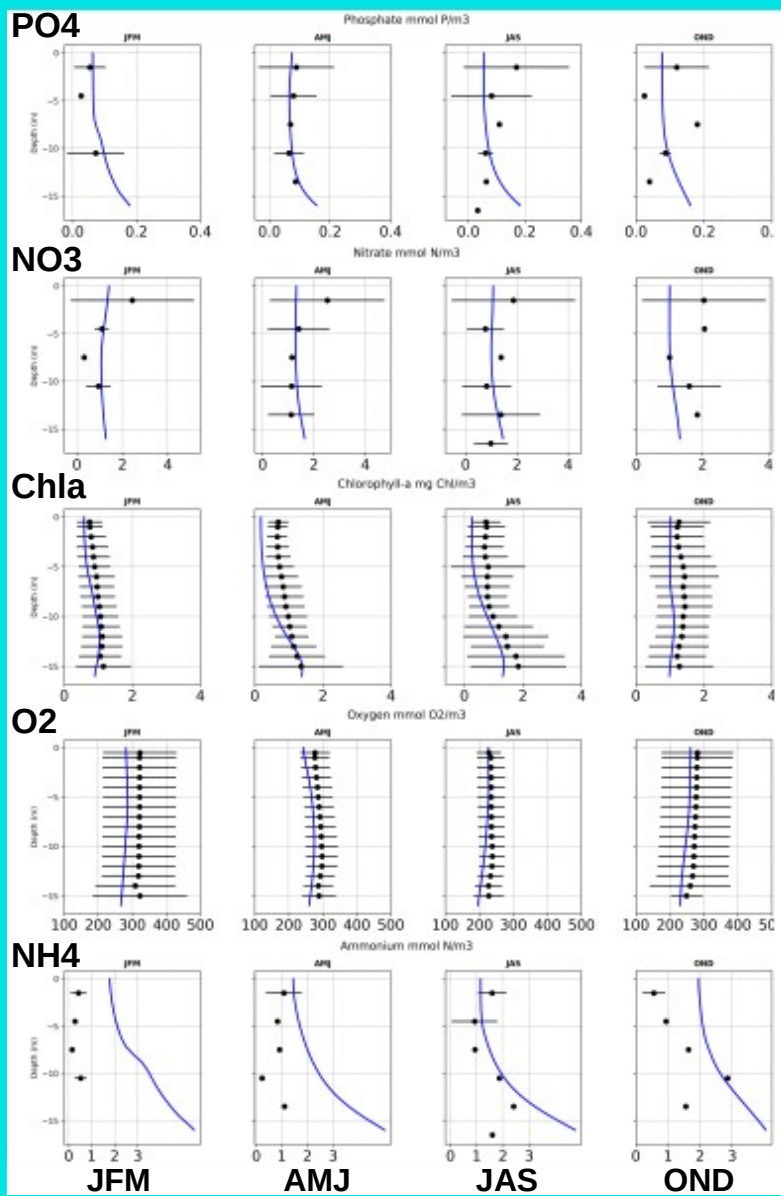
Site	PO4	NO3	CHL-a	O2	SIL	NH4
MA21	-	+	+	+		+
SHB	+	+	+	+	+	
SFyr	+	+	+		+	

- SHB, SFyr widespread improvements
- MA21 improvements with exception of PO4

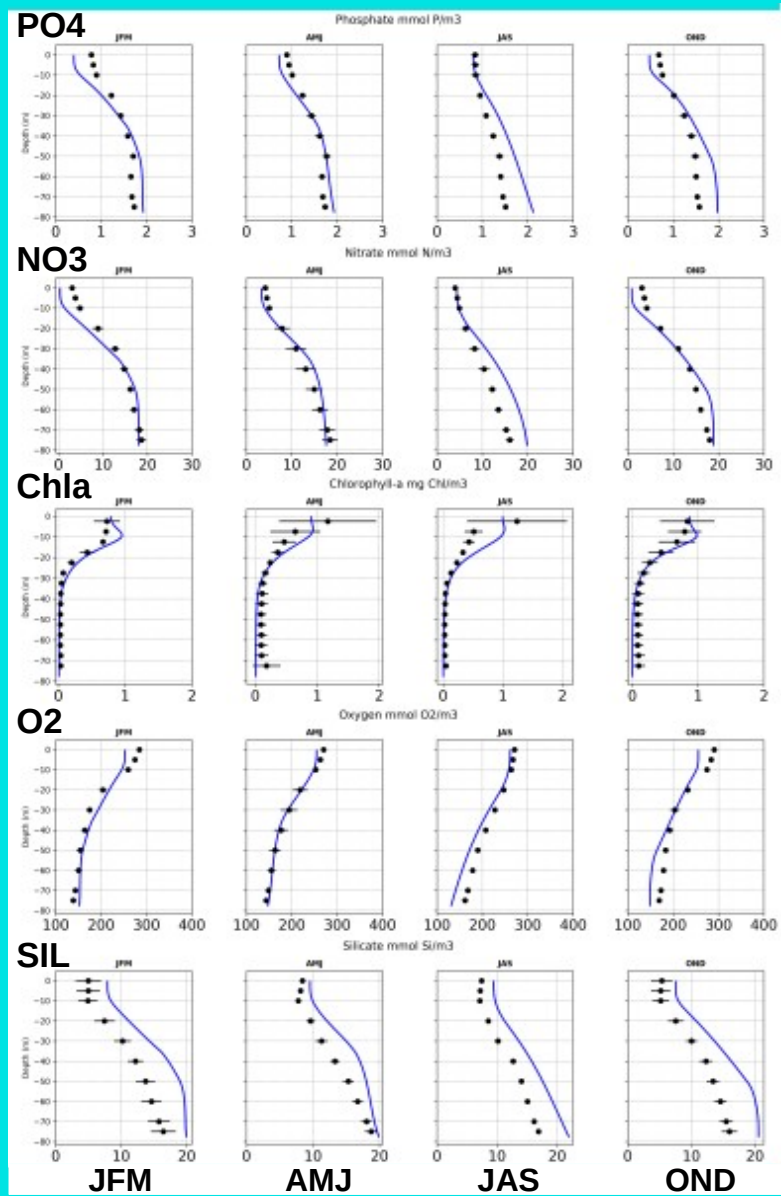




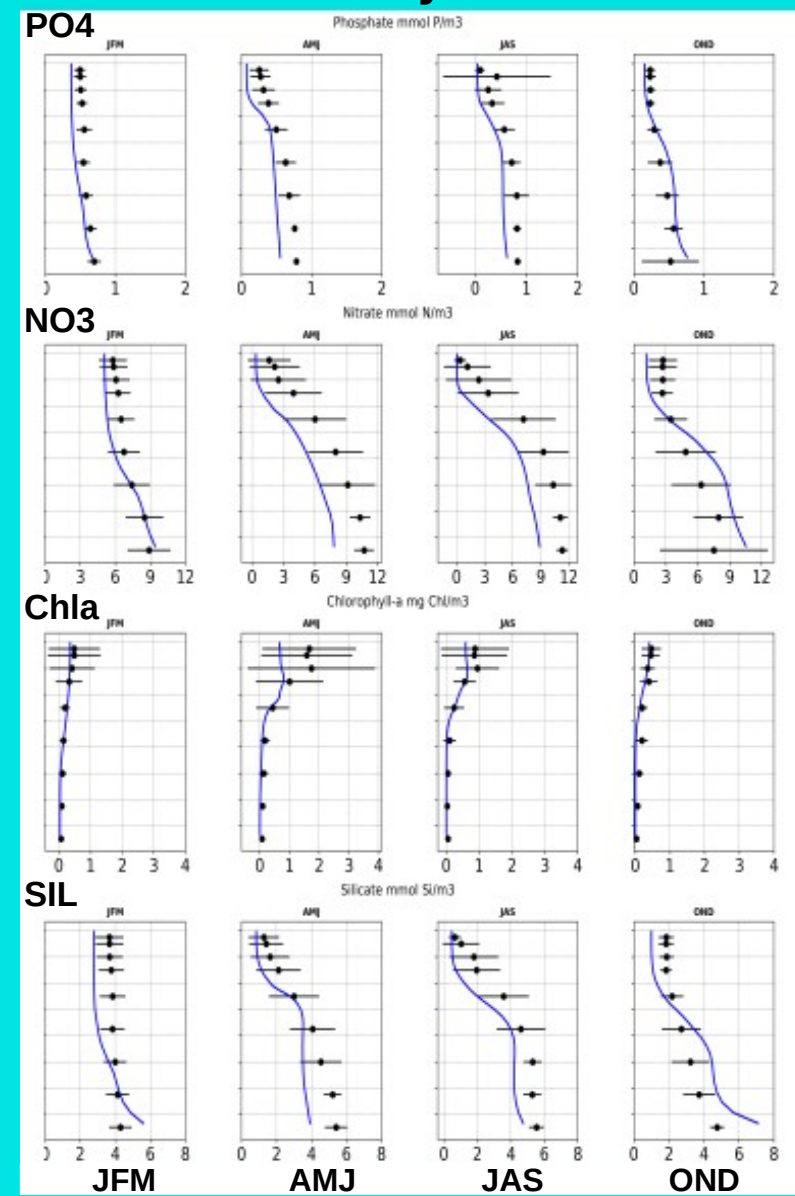
## MA21



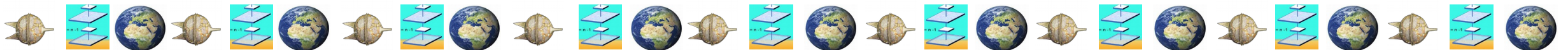
## SHB



## SFyr



- The **benthic-pelagic dynamic** processes were **successfully implemented** for the three different sites;
- The intercomparison between the **BPC-RETURN** and the **NO-RM** experiment allowed to assess the model **improvements in reproducing B-P fluxes**;
- The extensive **sensitivity analysis** showed different sedimentation-remineralization scenarios where the **shallower sites were more sensitive to the BPC parameterization**.
- MA21 and SHB areas were characterized by a more active benthic nutrients regeneration while SFyr and MA21 were characterized by the highest rates of deposition.
- The **agreement** between the used **pattern statistics successfully** allowed to individuate the **Best Experiments (Final setup)**.





# Numerical modelling of the benthic-pelagic coupling (BPC) in coastal marine ecosystems at contrasting sites



Università  
Ca' Foscari  
Venezia



Centro Euro-Mediterraneo  
sui Cambiamenti Climatici



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<sup>3</sup> Department of Physics and Astronomy, Alma Mater  
Studiorum, Università di Bologna

# Thank you

## Citations

- [1] Borges, A. V. (2011). Present day carbon dioxide fluxes in the coastal ocean and possible feedbacks under global change. In *Oceans and the atmospheric carbon content* (pp. 47-77). Springer, Dordrecht.
- [2] Hardison, A. K., McTigue, N. D., Gardner, W. S., & Dunton, K. H. (2017). Arctic shelves as platforms for biogeochemical activity: Nitrogen and carbon transformations in the Chukchi Sea, Alaska. *Deep Sea Research Part II: Topical Studies in Oceanography*, 144, 78-91.
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- [4] Griffiths, J. R., Kadin, M., Nascimento, F. J., Tamelander, T., Törnroos, A., Bonaglia, S., Kotta, J. (2017). The importance of benthic-pelagic coupling for marine ecosystem functioning in a changing world. *Global change biology*, 23(6), 2179-2196.
- [5] Mussap, G., Zavatarelli, M., Pinardi, N., & Celio, M. (2016). A management oriented 1-D ecosystem model: Implementation in the Gulf of Trieste (Adriatic Sea). *Regional Studies in Marine Science*, 6, 109-123.
- [6] Shannon, L. V., & Nelson, G. (1996). The Benguela: large scale features and processes and system variability. In *The south atlantic* (pp. 163-210). Springer, Berlin, Heidelberg.
- [7] Ibrahim, A., Olsen, A., Lauvset, S., & Rey, F. (2014). Seasonal variations of the surface nutrients and hydrography in the Norwegian Sea. *International Journal of Environmental Science and Development*, 5(5), 496.
- [8] Mentaschi, L., Besio, G., Cassola, F., & Mazzino, A. (2013). Problems in RMSE-based wave model validations. *Ocean Modelling*, 72, 53-58.
- [9] Taylor, K. E. (2001). Summarizing multiple aspects of model performance in a single diagram. *Journal of Geophysical Research: Atmospheres*, 106(D7), 7183-7192.
- [10] Jolliff, J. K., Kindle, J. C., Shulman, I., Penta, B., Friedrichs, M. A., Helber, R., & Arnone, R. A. (2009). Summary diagrams for coupled hydrodynamic-ecosystem model skill assessment. *Journal of Marine Systems*, 76(1-2), 64-82.
- [11] Gregg, W. W., Friedrichs, M. A., Robinson, A. R., Rose, K. A., Schlitzer, R., Thompson, K. R., & Doney, S. C. (2009). Skill assessment in ocean biological data assimilation. *Journal of Marine Systems*, 76(1-2), 16-33.
- [12] Suess E. "Particulate organic carbon flux in the oceans: Surface and oxygen utilization". In: Nature (Jan. 1980).

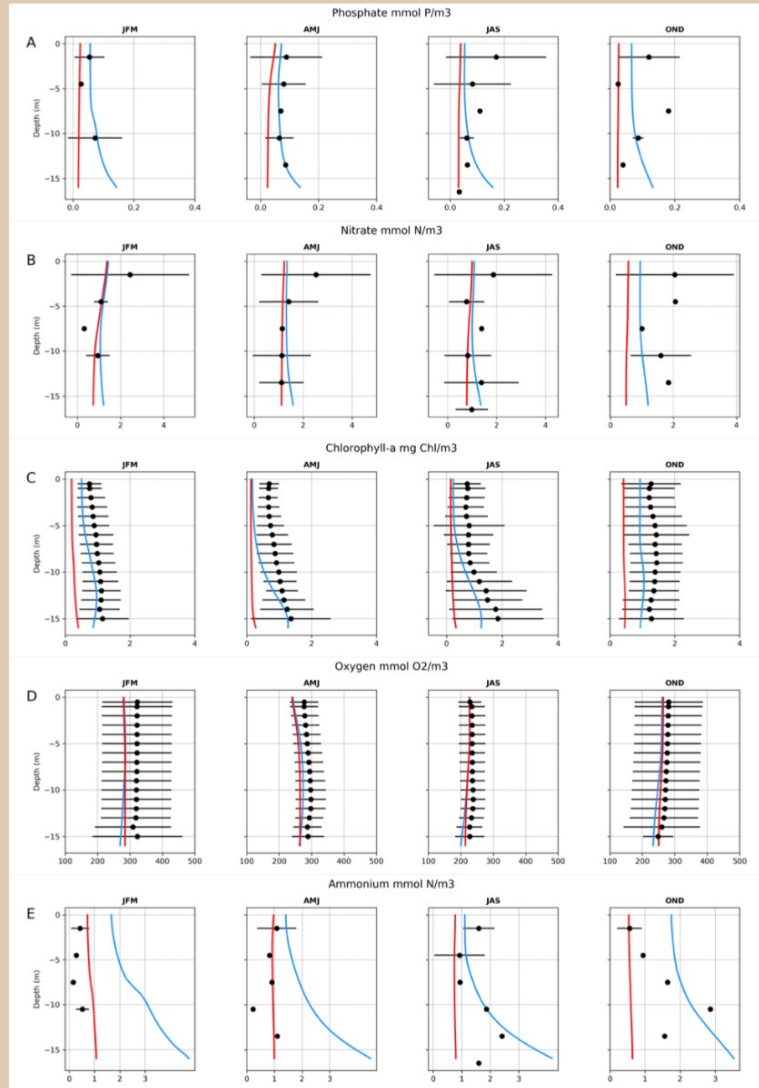


# Supplementary slides

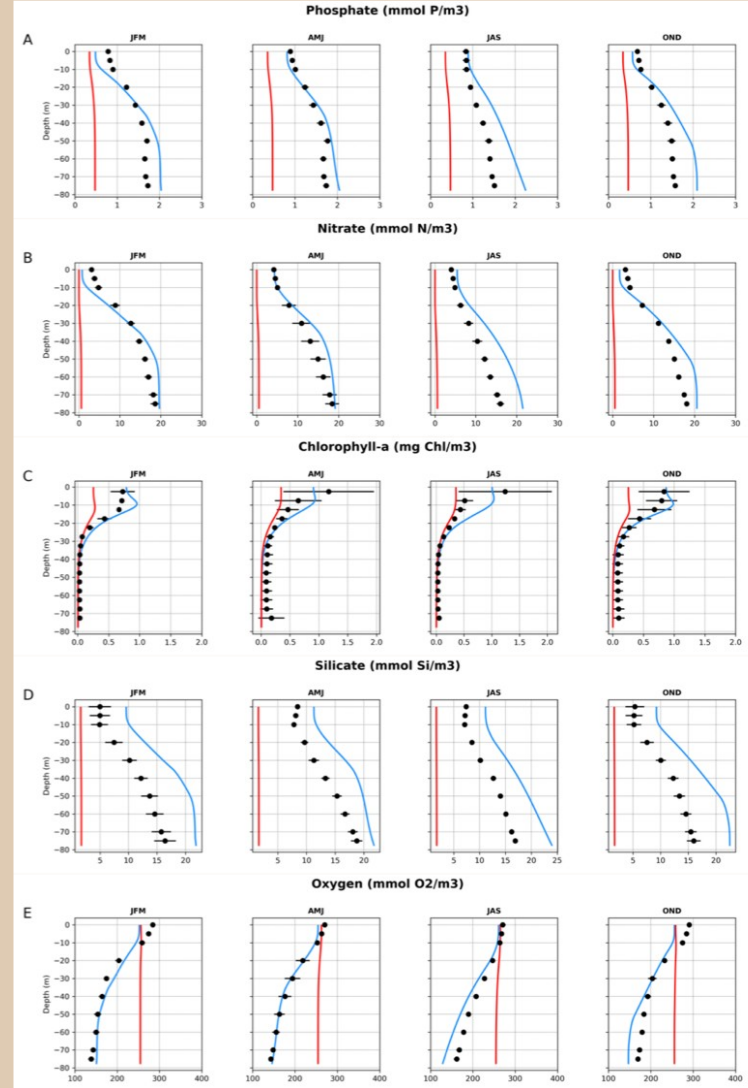
# BPC Implementation (NO-RM vs BPC\_RETURN exps)



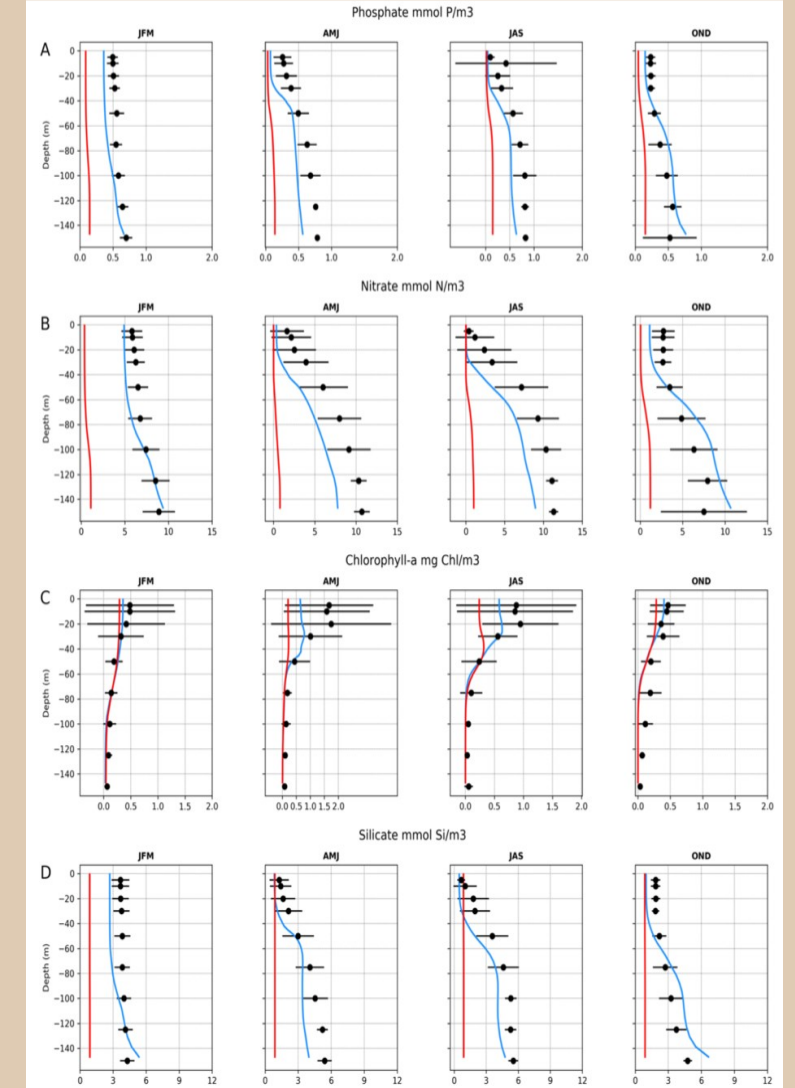
# NO-RM vs BPC\_RETURN Results



**MA21**



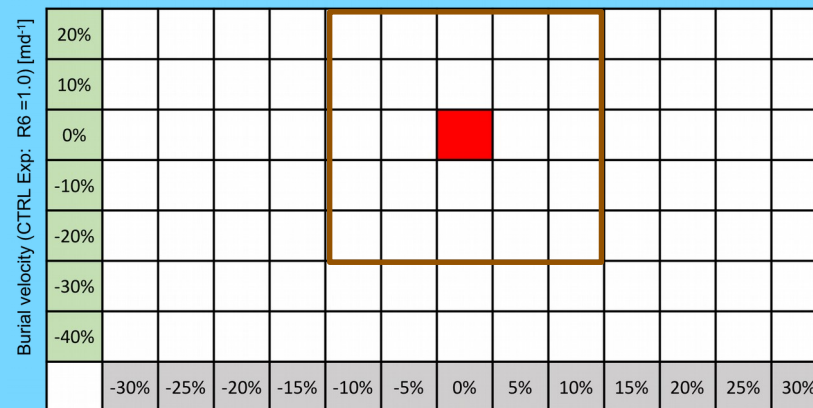
**SHB**



**SFyr**

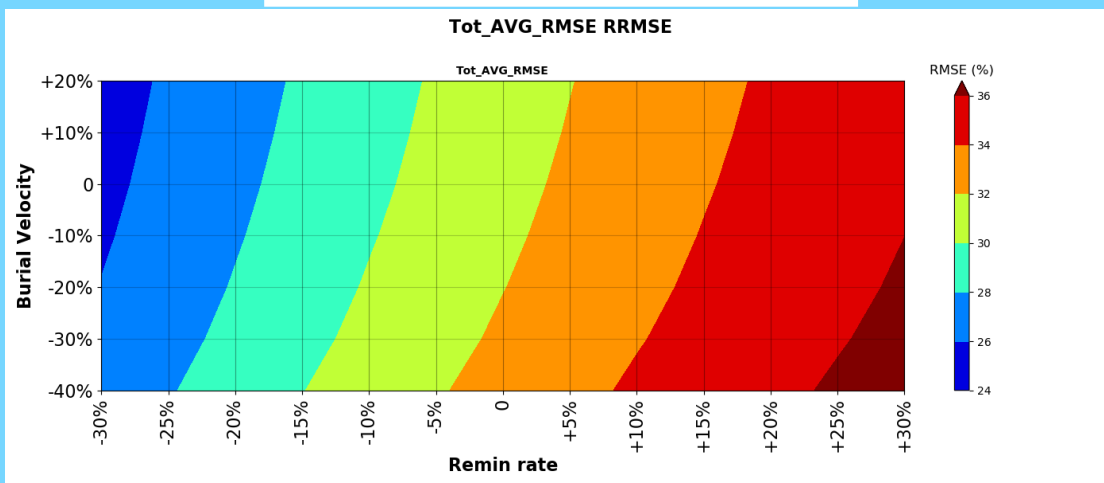
# Sensitivity Analysis Scheme

# Sensitivity Experiment Matrix

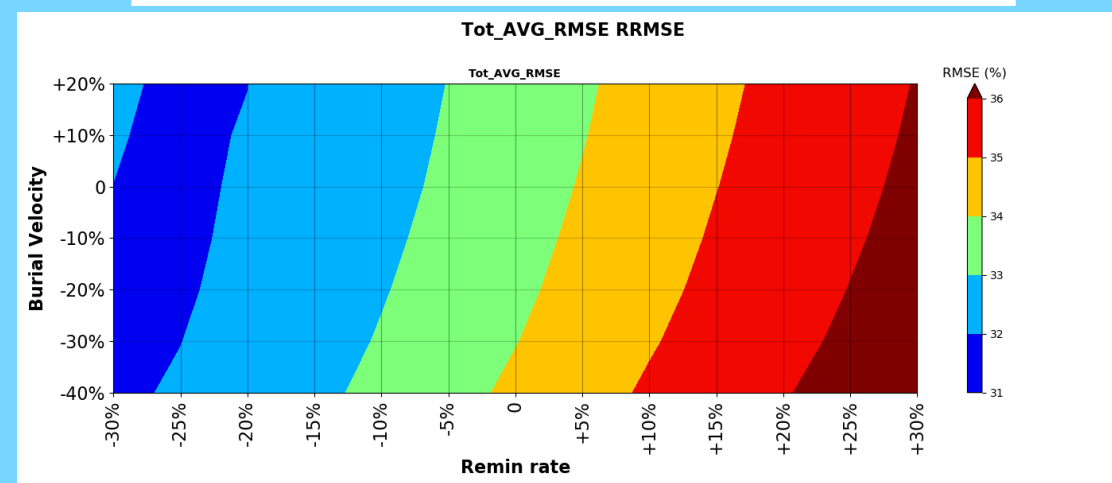


Remineralization rates (CTRL Exp: rmn Q6\* = 0.0025, rmn Q6s = 0.0015 [d<sup>-1</sup>])

Mean NRMSE (all variables)



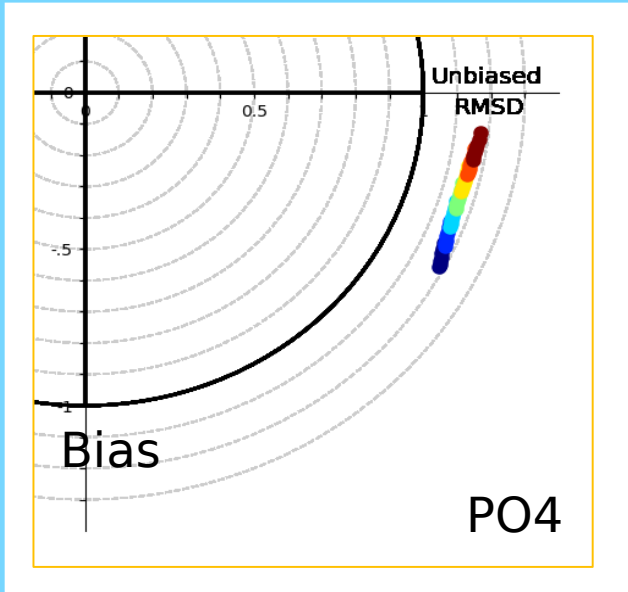
Mean NRMSE (Sensitivity analysis variables)



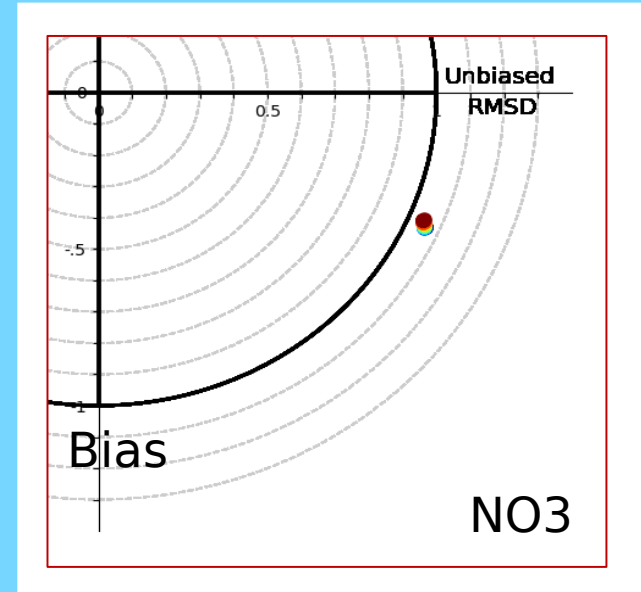
# Sensitivity Analysis Best Exp Identification

# MA21: Identification of "Best Experiment"

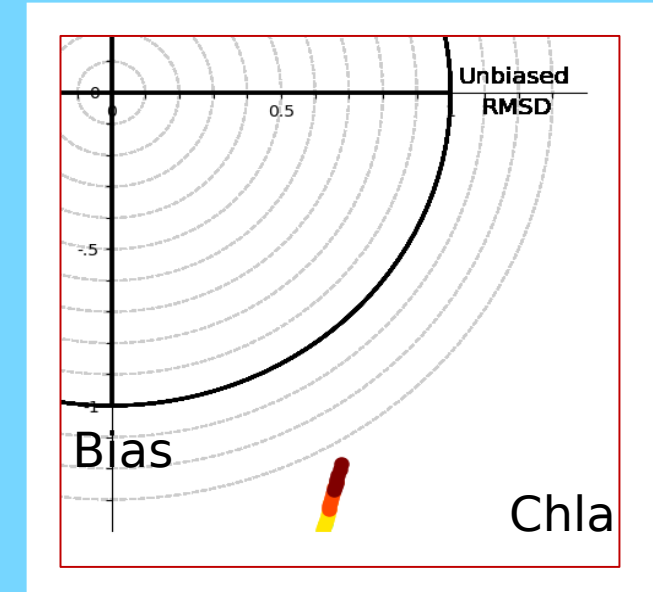
## Clouds of experiments grouped by Remineralization sets



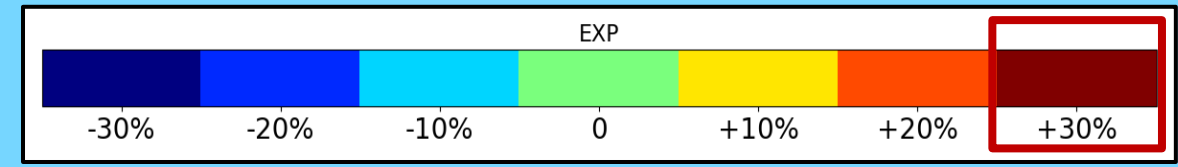
**Best Exp: Remin +10%**



**Best Exp: Remin +30%**



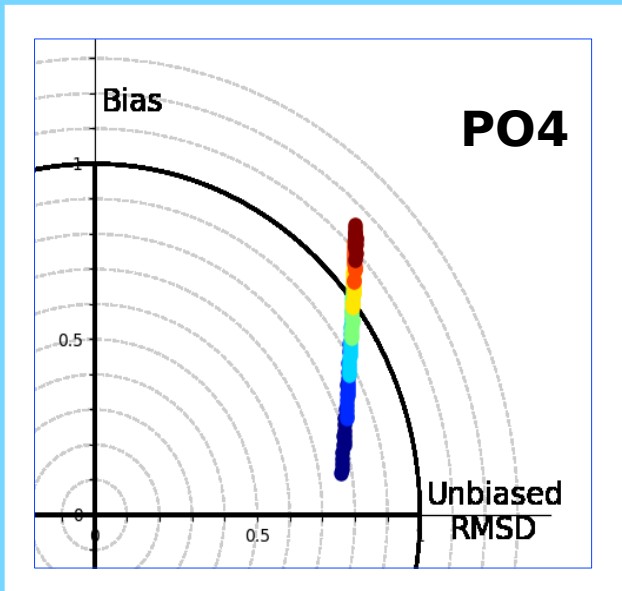
**Best Exp: Remin +30%**



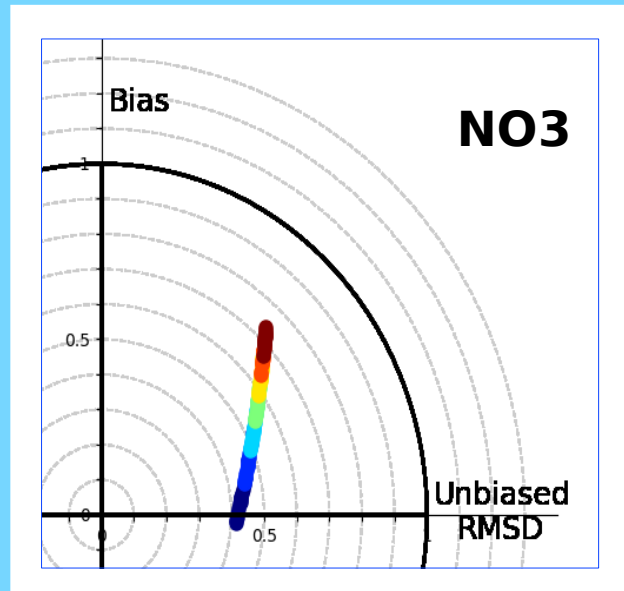


# SHB Identification of “Best Experiment”

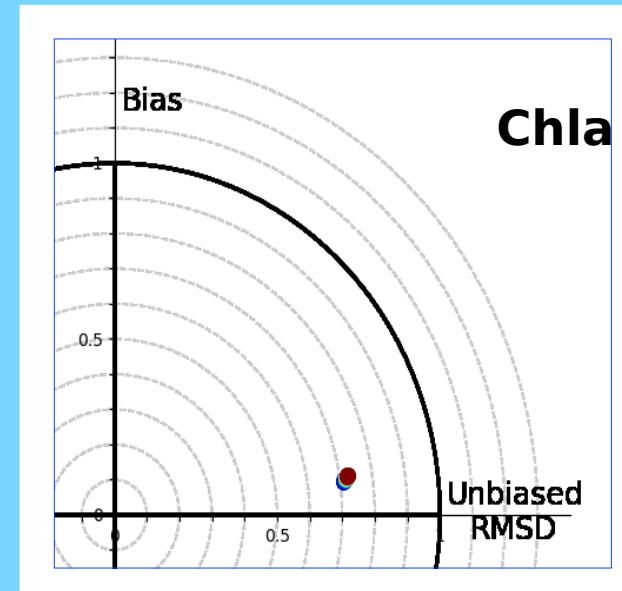
## Clouds of experiments grouped by Remineralization sets



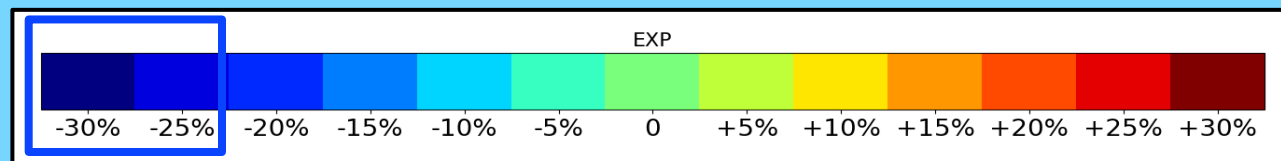
**Best Exp: Remin - 30%**



**Best Exp: Remin -25/-30%**



**Best Exp: Remin - 30%**



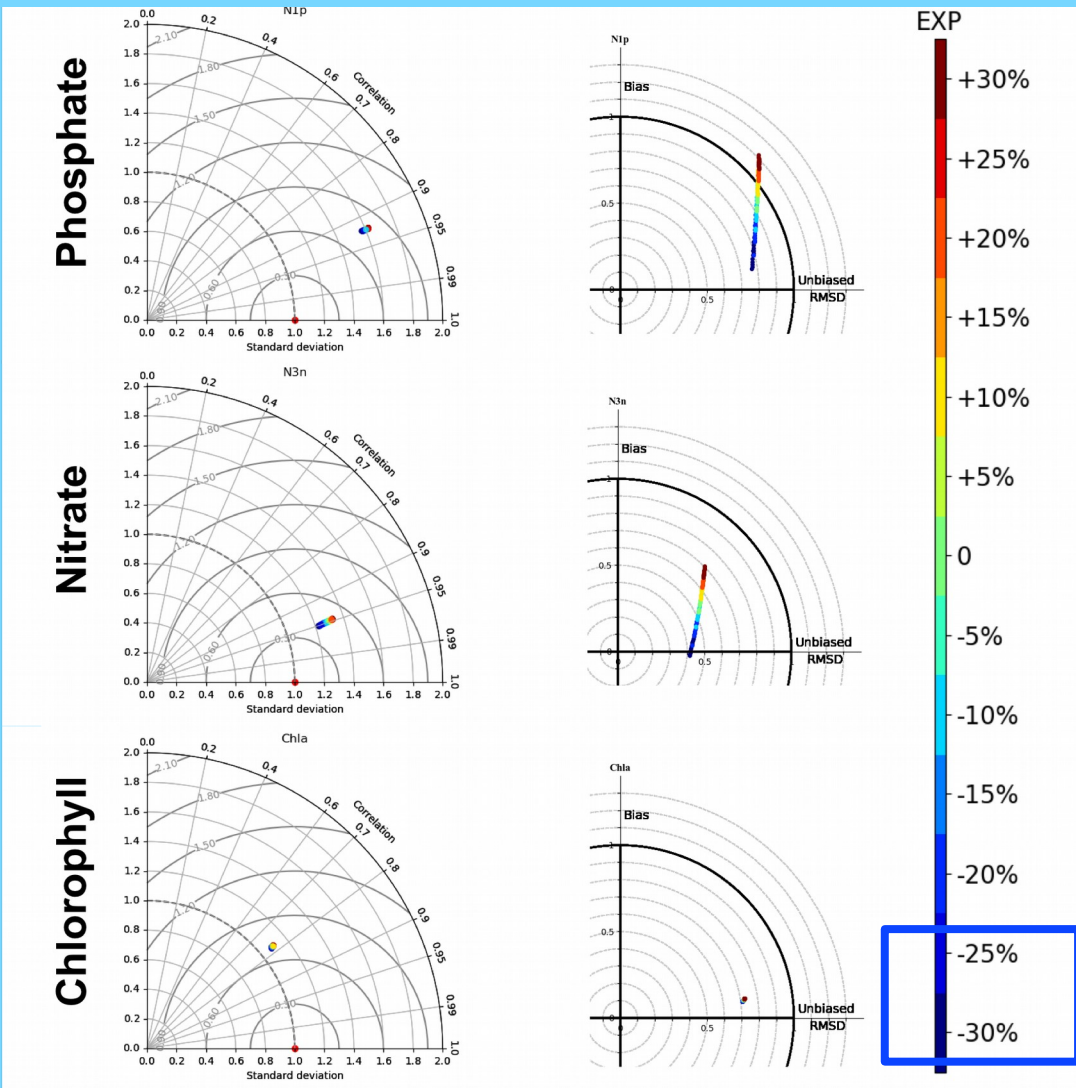


# SHB Identification of “Best Experiment”

**Best Exp: Remin - 30%**

**Best Exp: Remin - 30%**

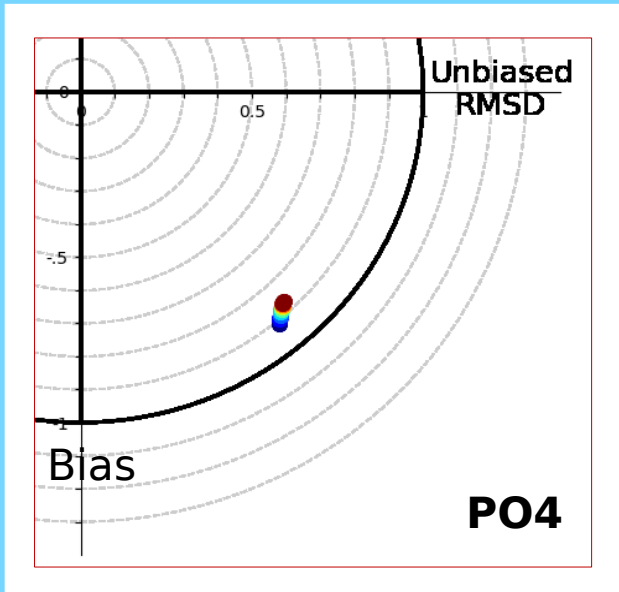
**Best Exp: Remin -25/-30%**



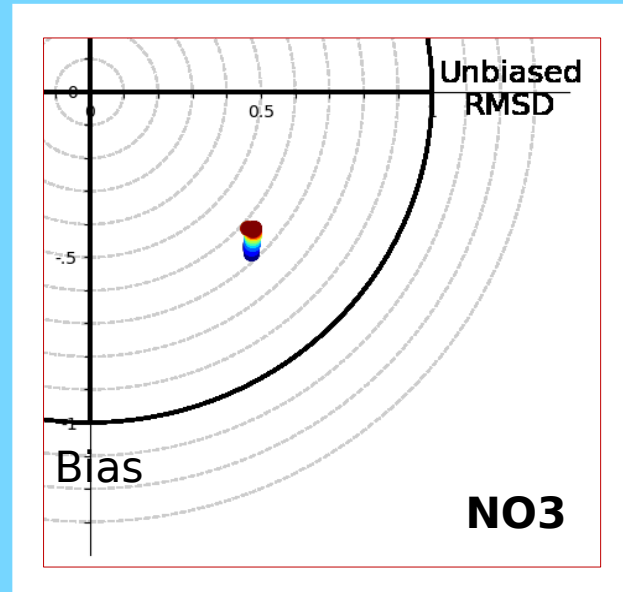
**Clouds of experiments grouped by:  
Remineralization sets**

# SFyr Identification of “Best Experiment”

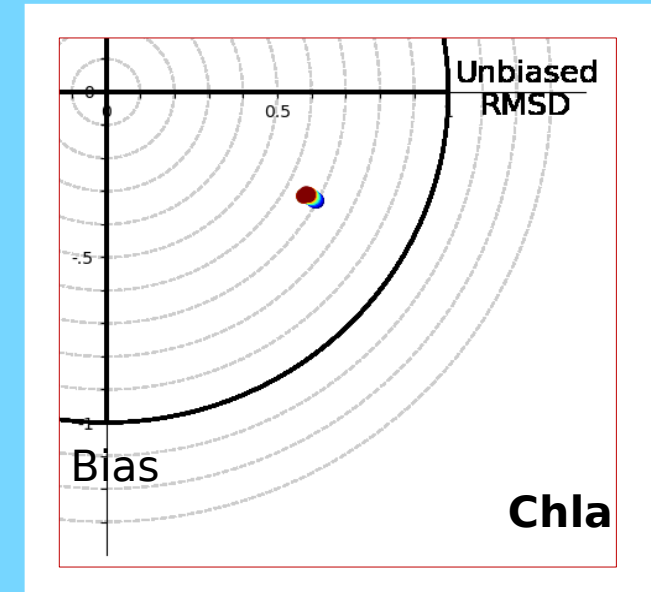
## Clouds of experiments grouped by Remineralization sets



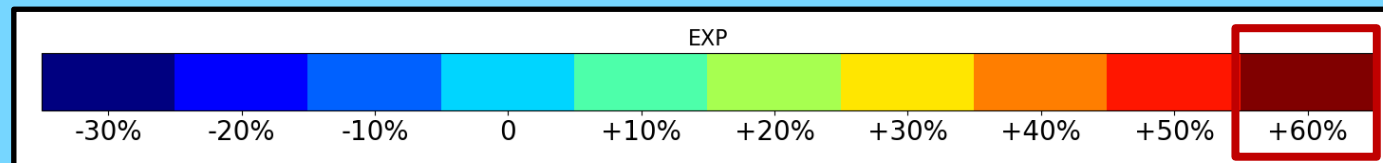
**Best Exp: Remin  
+60%**



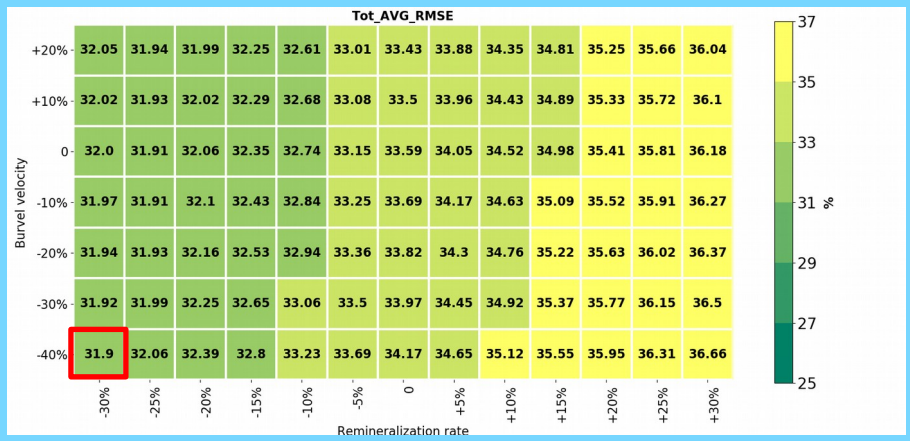
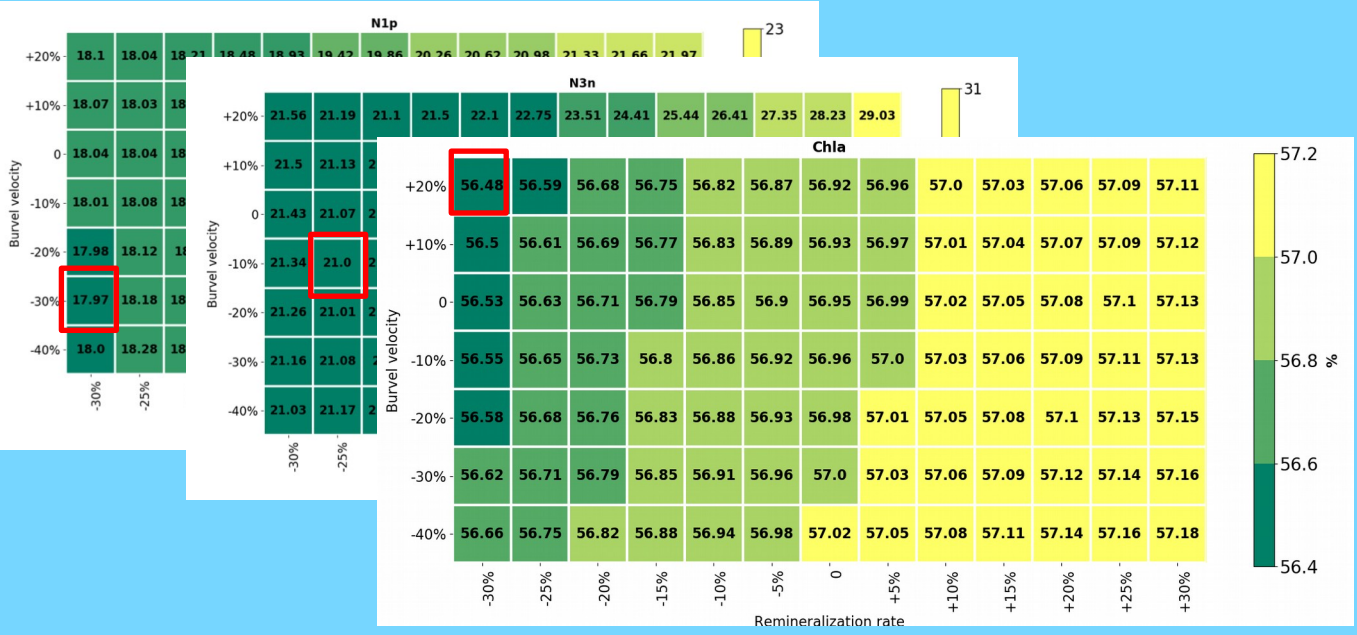
**Best Exp: Remin  
+60%**



**Best Exp: Remin  
+60%**



# Agreement between used *pattern statistics*



SHB			
Variable	RMSD	Taylor diagram	Target diagram
Phosphate	B -30% R -30%	R -30%	R -30%
Nitrate	B -10% R -25%	R -30%	R -30% / R -25%
Chlorophyll	B +20% R -30%	R -30%	R -30%
Avg RMSD	B -40% R -30%	—	—
SFyr			
Variable	RMSD	Taylor diagram	Target diagram
Phosphate	B -90% R +60%	not clear	R +60%
Nitrate	B -90% R +60%	not clear	R +60%
Chlorophyll	B -90% R +60%	R +60%	R +60%
Avg RMSD	B -90% R +60%	—	—
MA21			
Variable	NRMSD	Taylor diagram	Target diagram
Phosphate	B -30% R -10%	R -30%	R -10%
Nitrate	B -30% R +30%	R +30%	R +30%
Chlorophyll	B -30% R +30%	R -30%/R -20%	R +30%
Avg RMSD	B -30% R +30%	—	—

# Sensitivity Analysis Best Exp Vertical Profiles

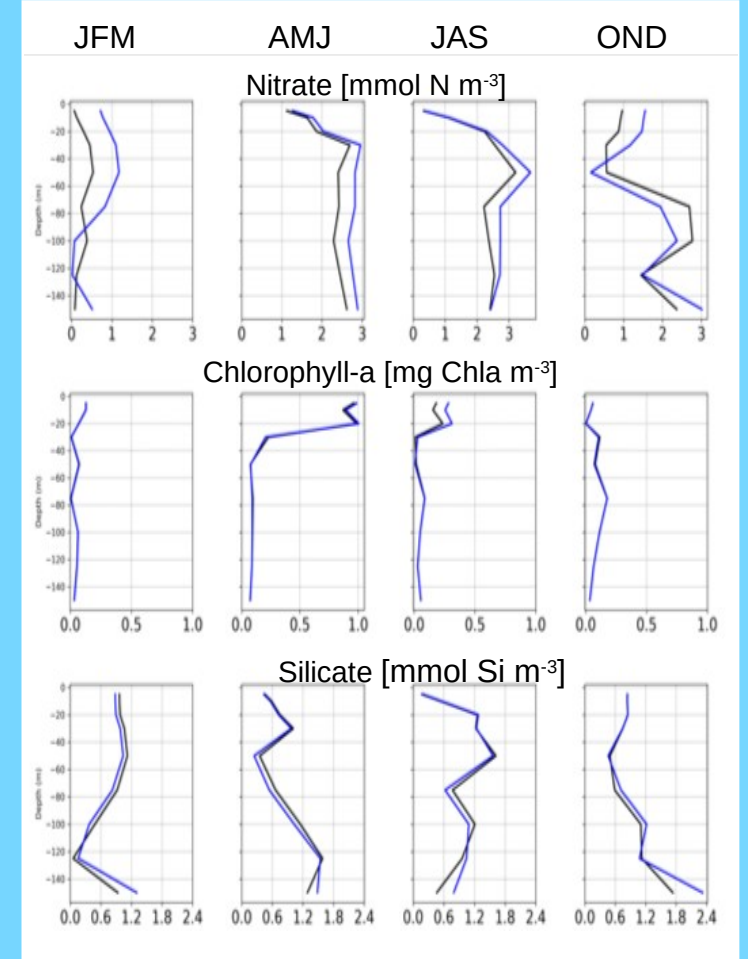
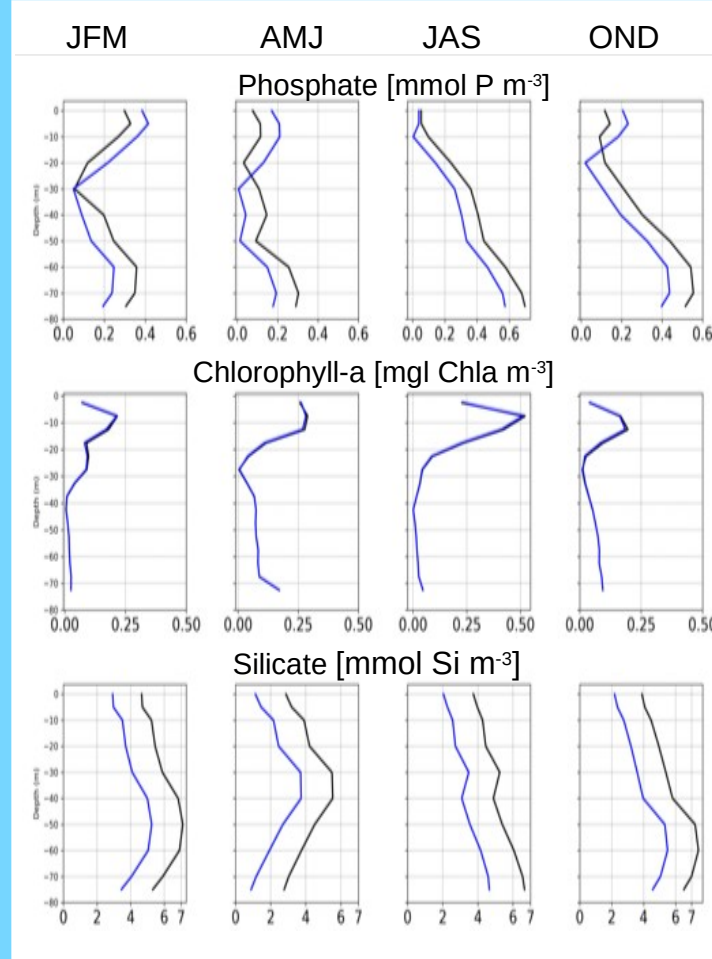
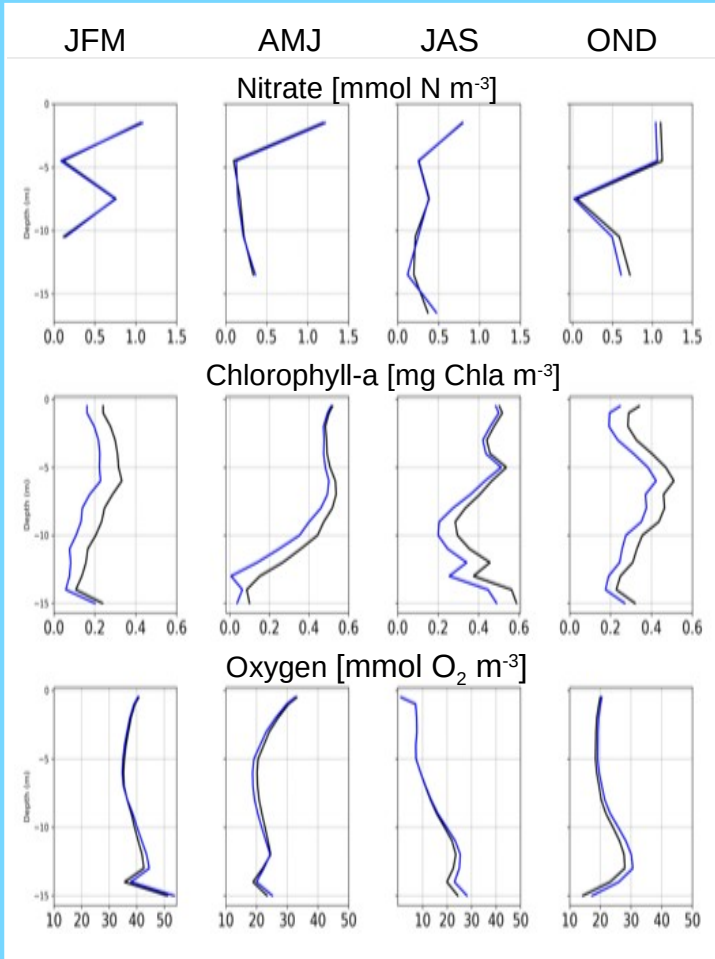
# Mean Absolute Error (MAE)

## Best Guess-Obs vs First Guess-Obs

### MA21

### SHB

### SFyr



— First Guess    — Best Guess

