

# Examples of biogeochemical studies using ROMS/CROCO-PISCES

Vincent Echevin and colleagues



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# Examples of biogeochemical studies using ROMS/CROCO-PISCES

3 examples from the Peru upwelling system:

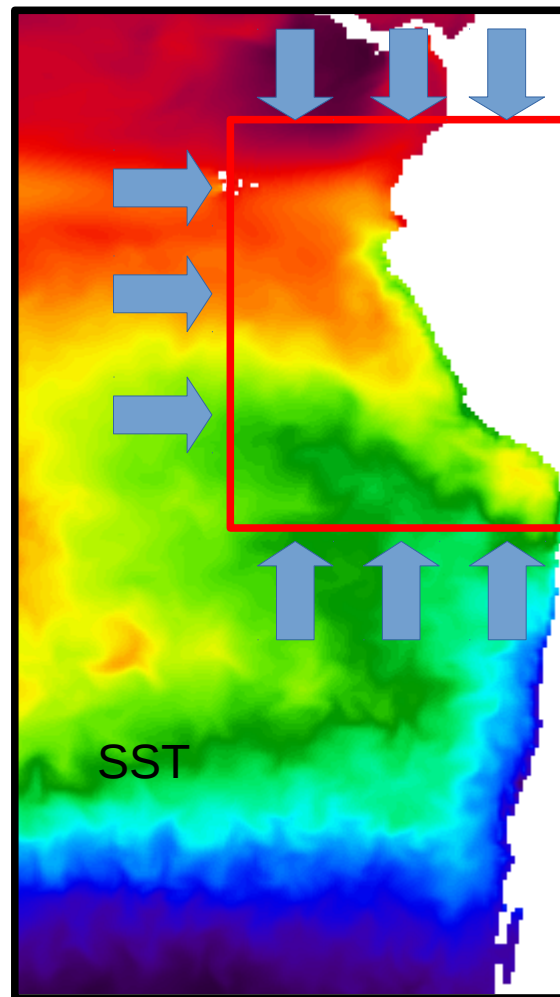
- Long-term trends (1973-2008) in the oxygen minimum zone
- Impacts of climate change under RCP8.5 “worst-case” scenario
- Submesoscale dynamics

# CROCO model configurations: the example of the Peru upwelling system

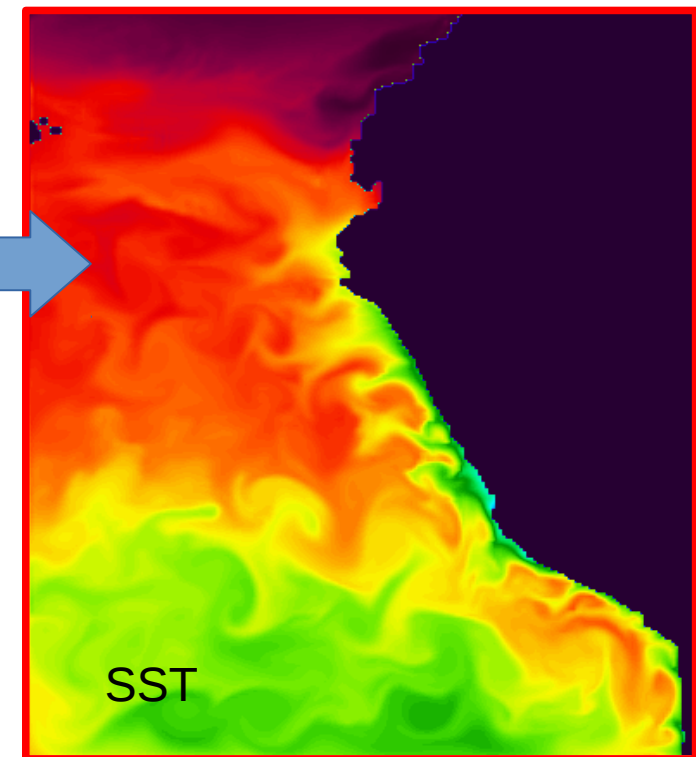
Open Boundary Conditions

Physics : global models  
( $1/12^\circ$ ,  $1/4^\circ$ ,  $2^\circ$ )

Biogeochemistry :  
climatologies  
(CARS, WOA, GLODAP,  
Fe from ORCA-PISCES )



CROCO-PISCES ( $1/9^\circ \sim 12$  km)



# First step for each BGC study: model evaluation of the physics

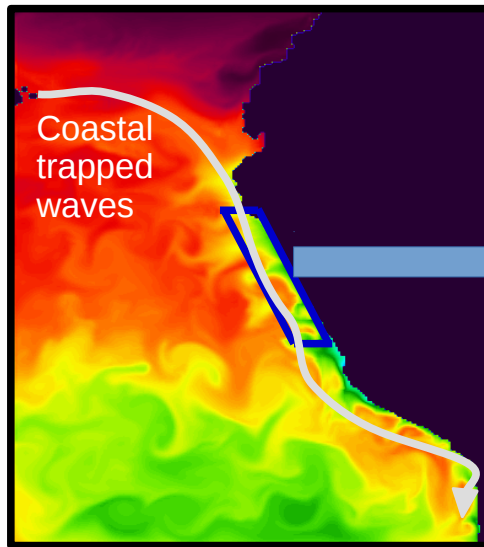
Evaluation of the physics (sea level, temperature, currents, mixed layer depth,...)

=> very important step : realism of biogeochemical fields depend strongly  
on realism of the physics

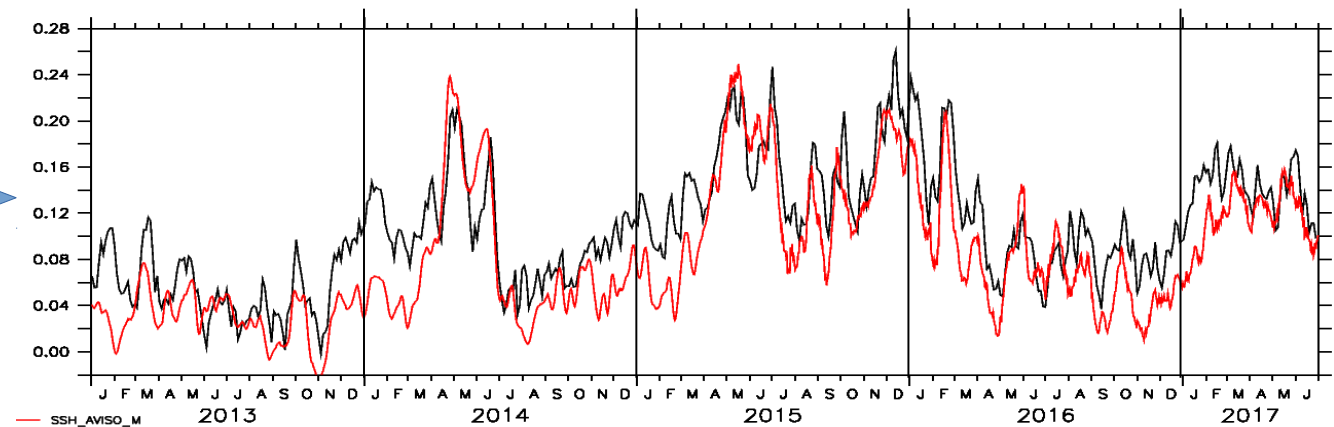
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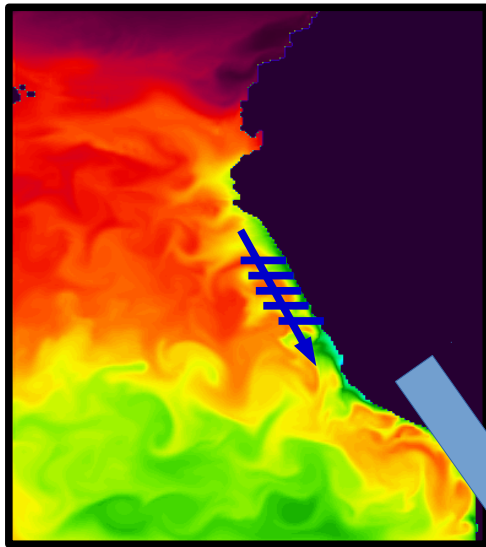
SSH in coastal band of 24 km between 6°S and 12°S (ROMS, AVISO obs)



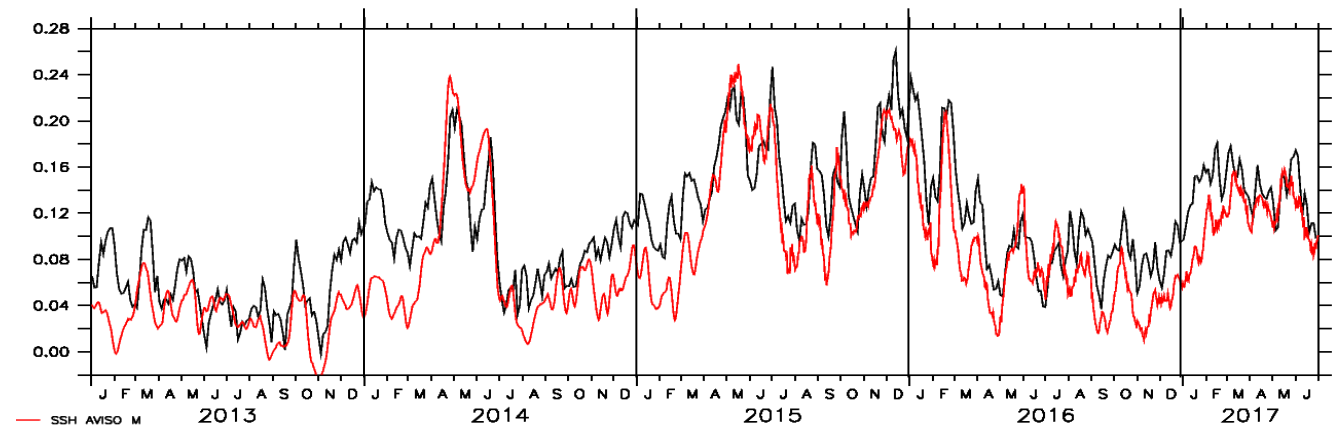
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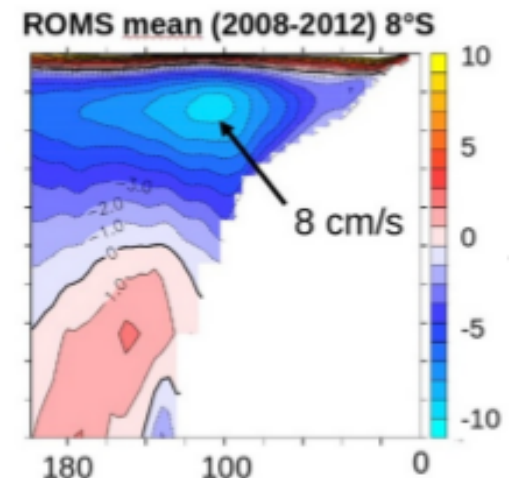
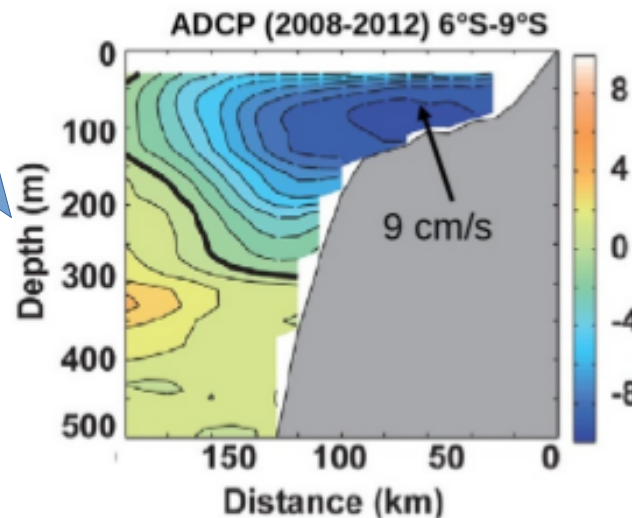
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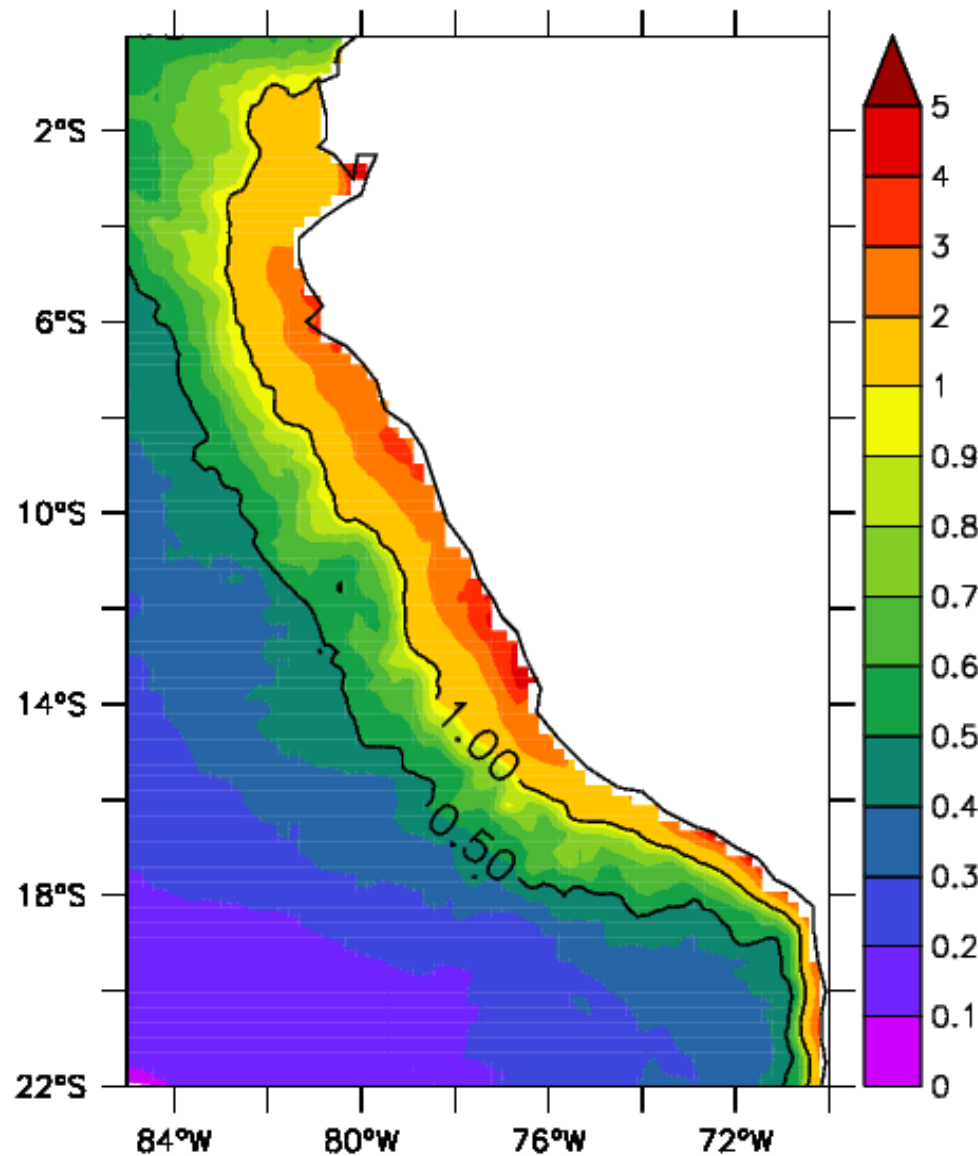


Alongshore  
poleward  
current

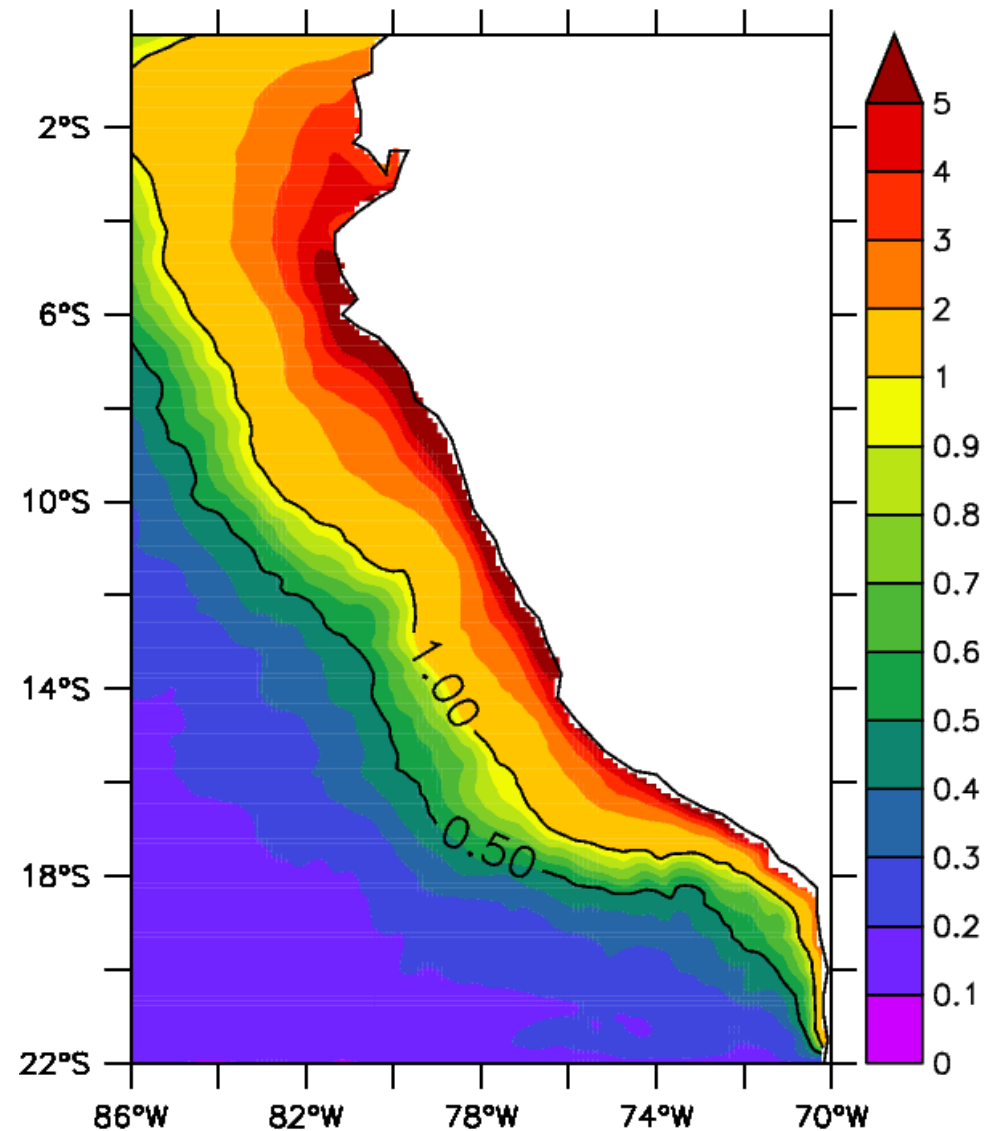


# model evaluation of the BGC: surface chlorophyll

MODIS (sat) chl (2013-2016)

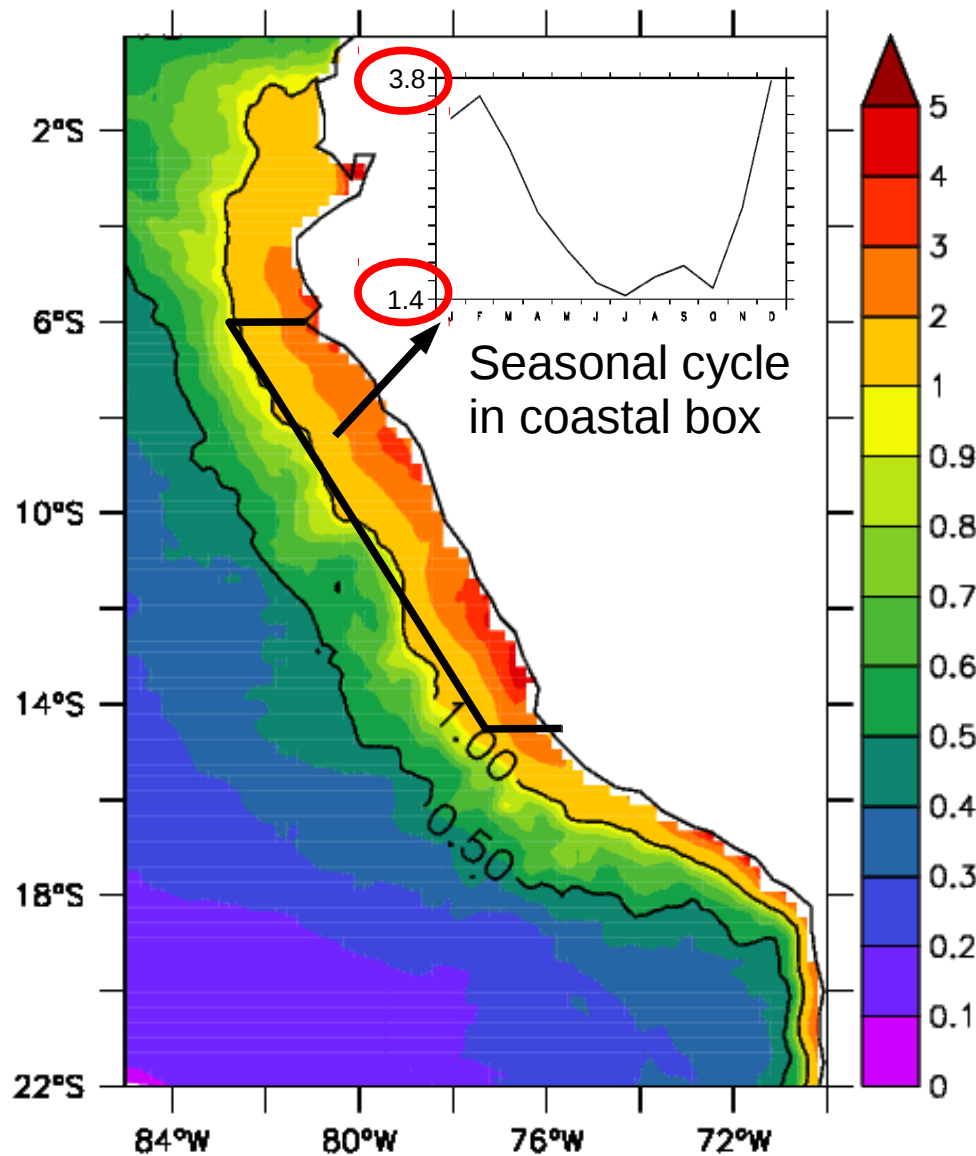


Model chl (2013-2016)

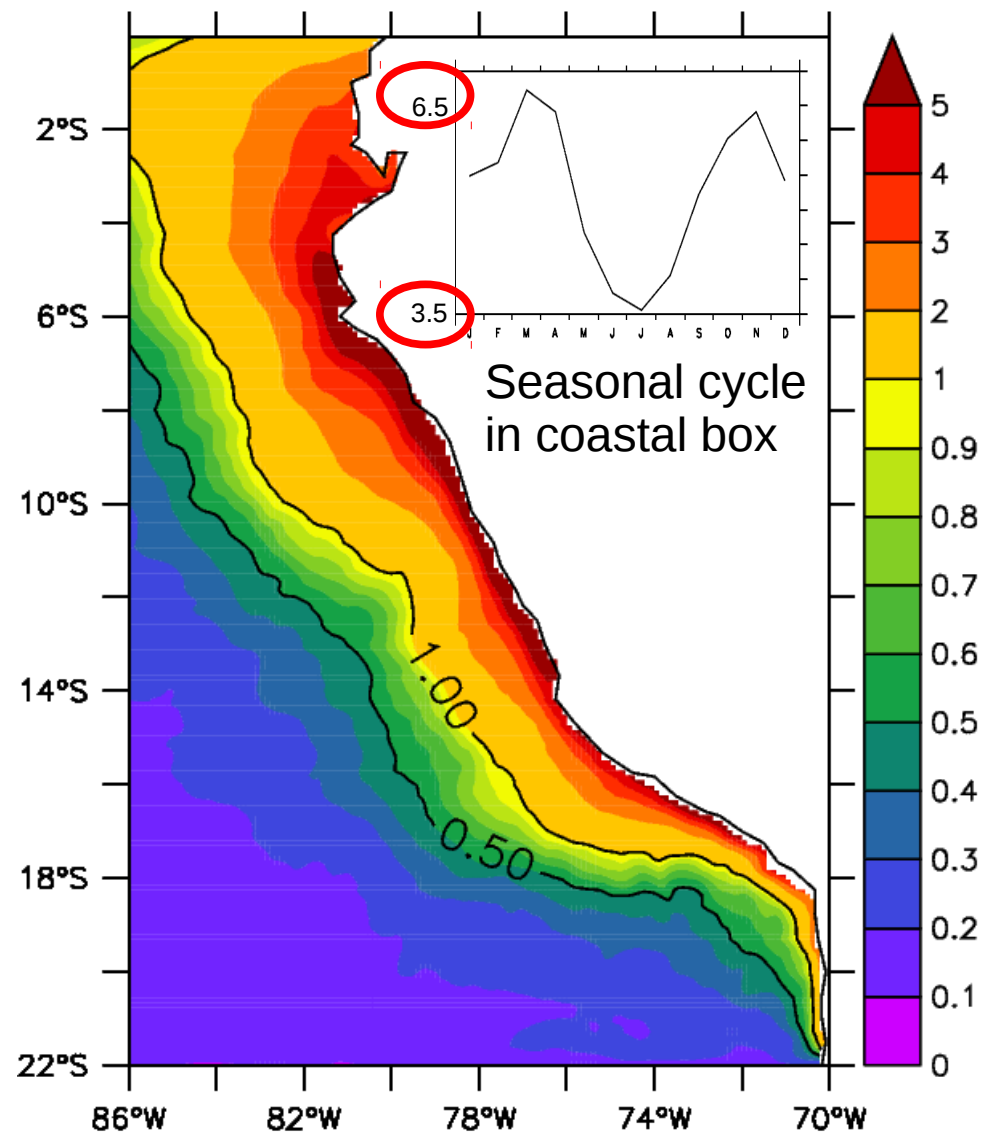


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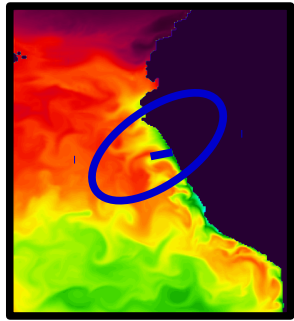
Model chl (2013-2016)



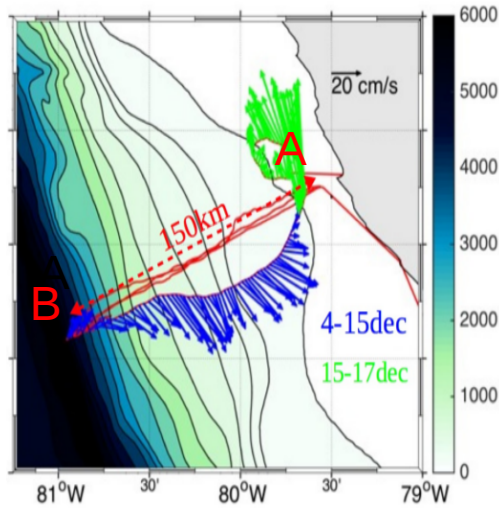


# model evaluation using glider data

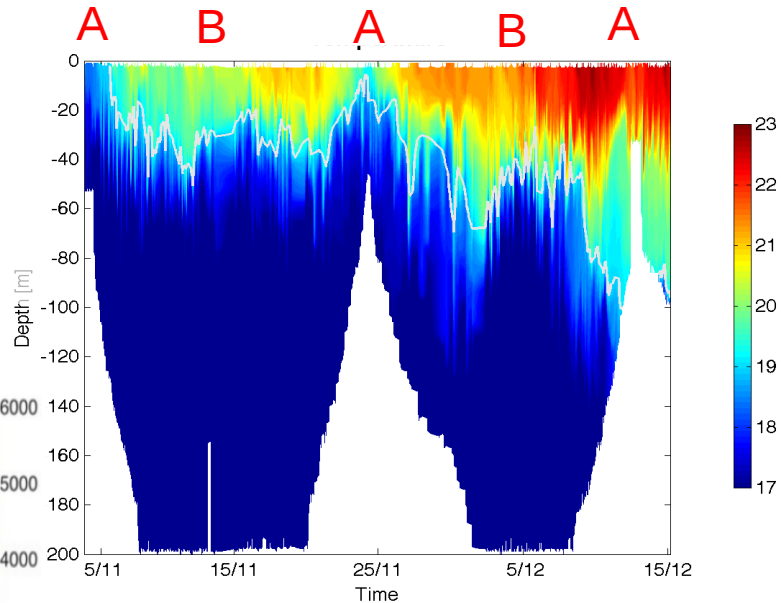
Comparison with a glider section north of Peru in November-December 2015



Temperature

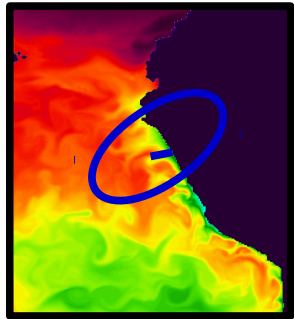


Observations

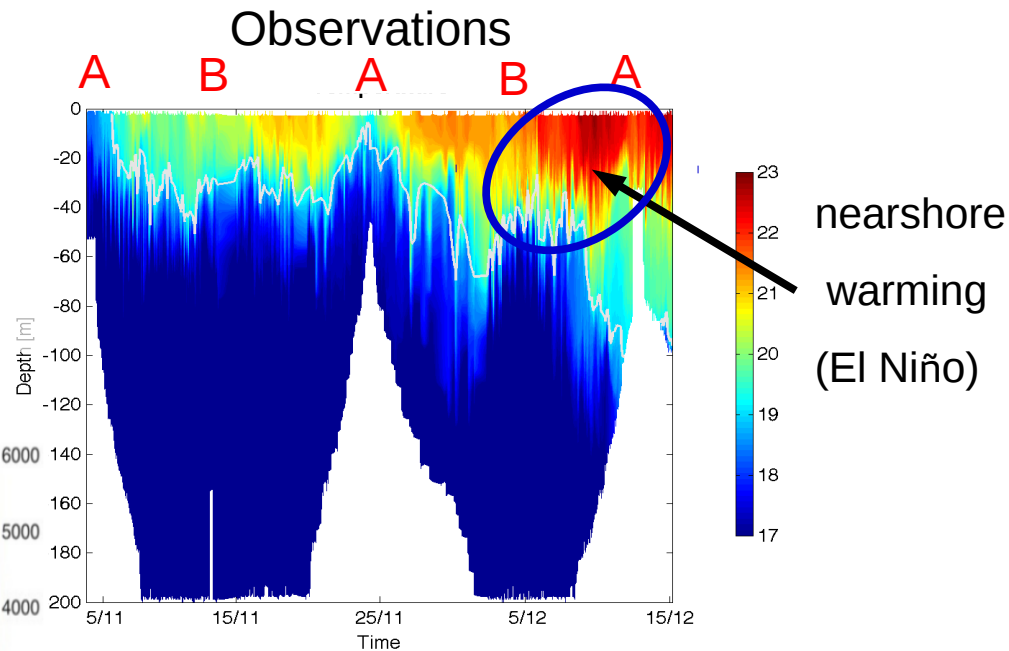
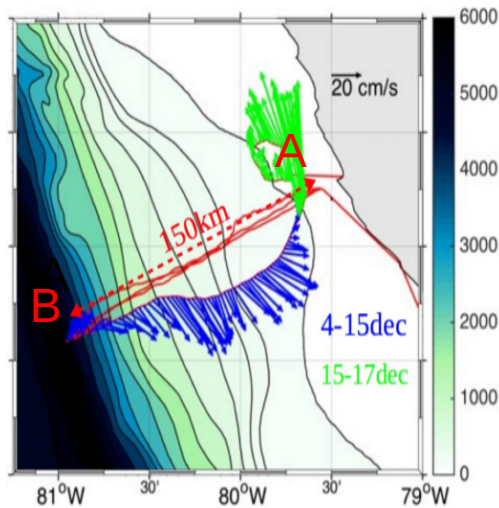


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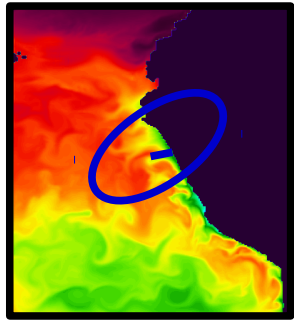


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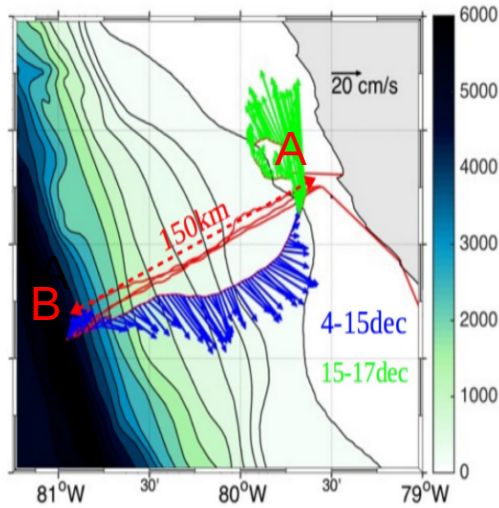


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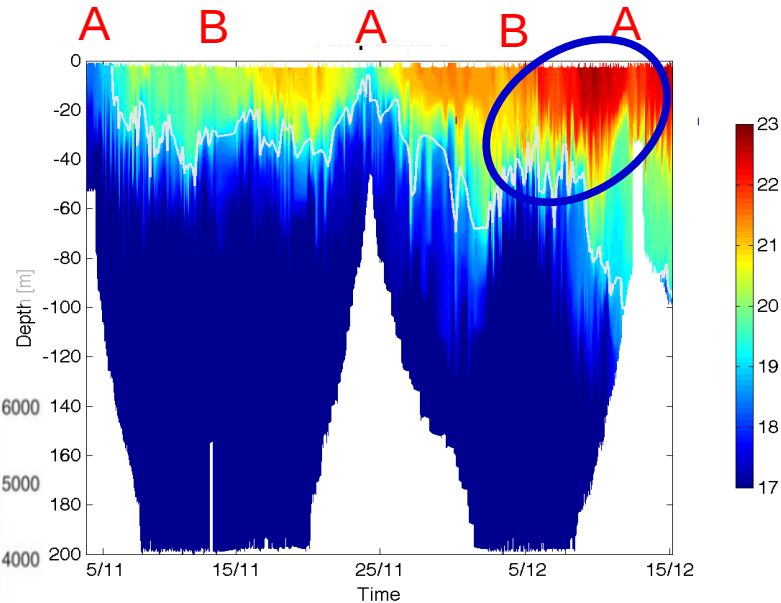
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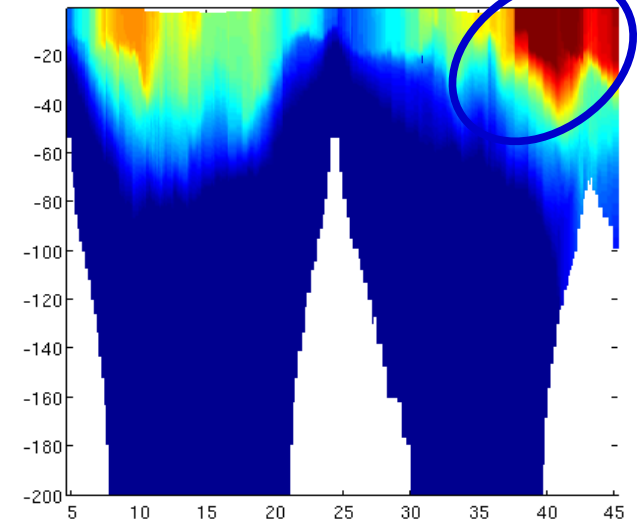
Temperature



Observations

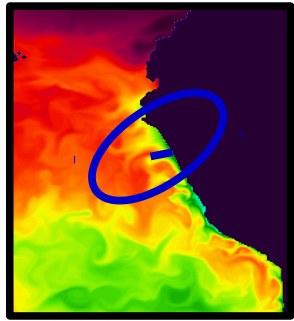


Model (4 km res.)

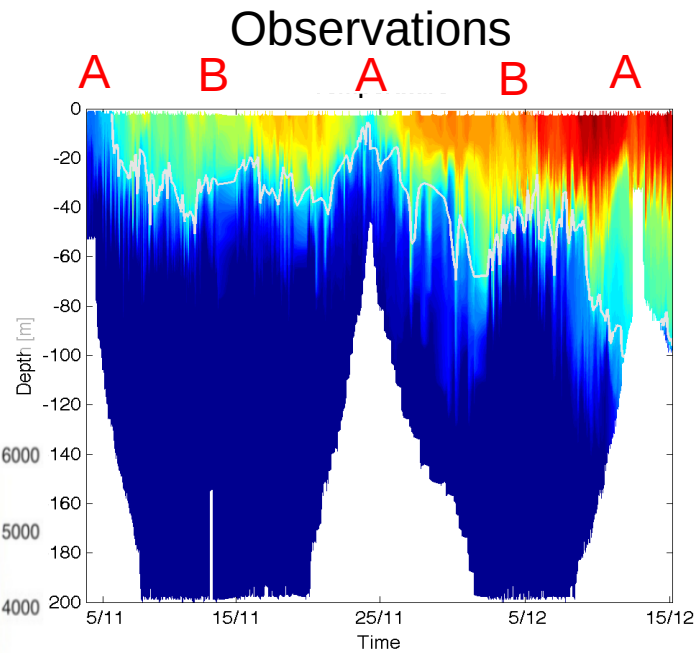


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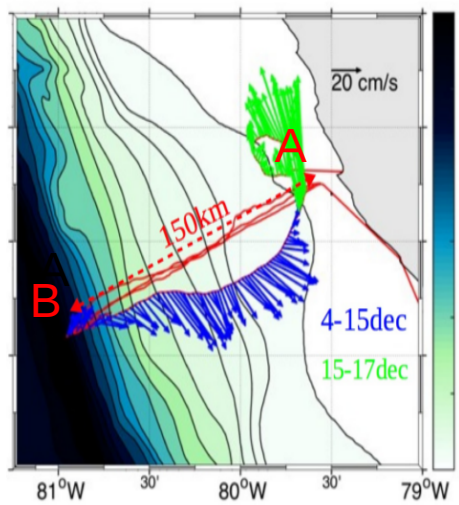
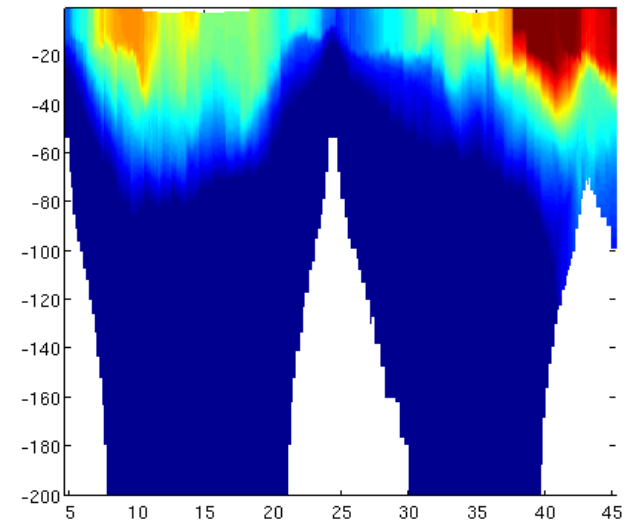
Comparison with a glider section north of Peru in November-December 2015



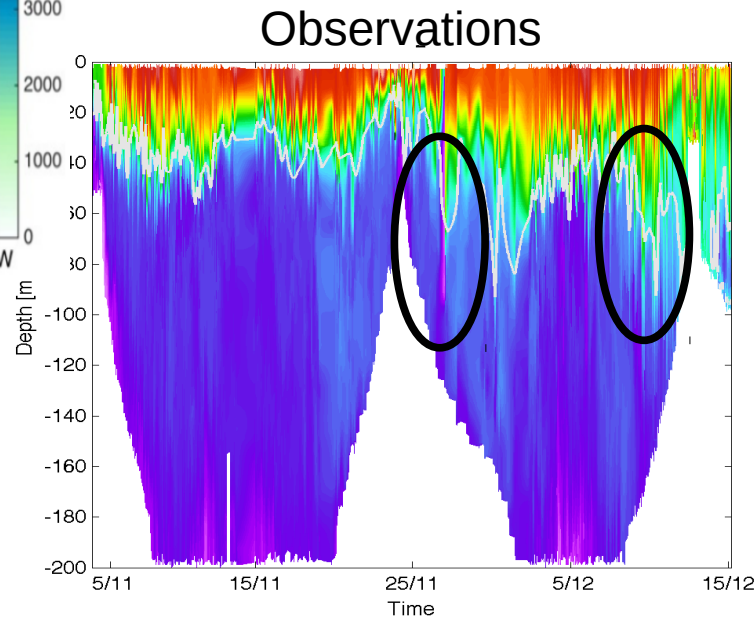
Temperature



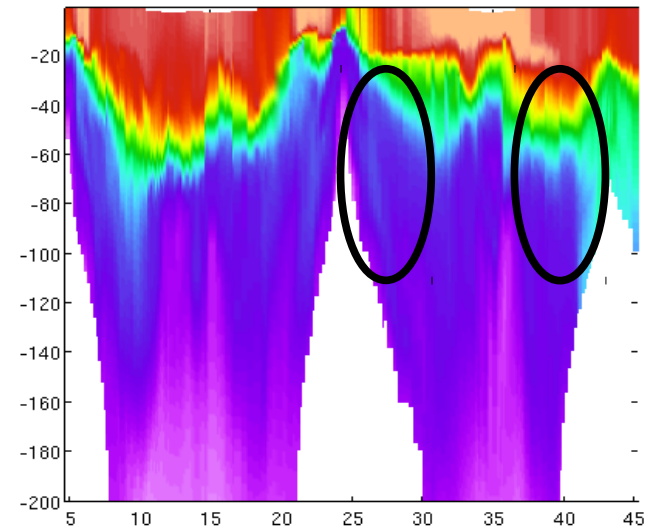
Model (4 km res.)



Oxygen



Model (4 km res.)



# Oxygen long term trends in the Peru OMZ

- What drives oxygen variations in the Peru upwelling systems?

*El Nino/La Nina: Espinoza-Morriberon et al, (2019), Frontiers in Marine Sciences*

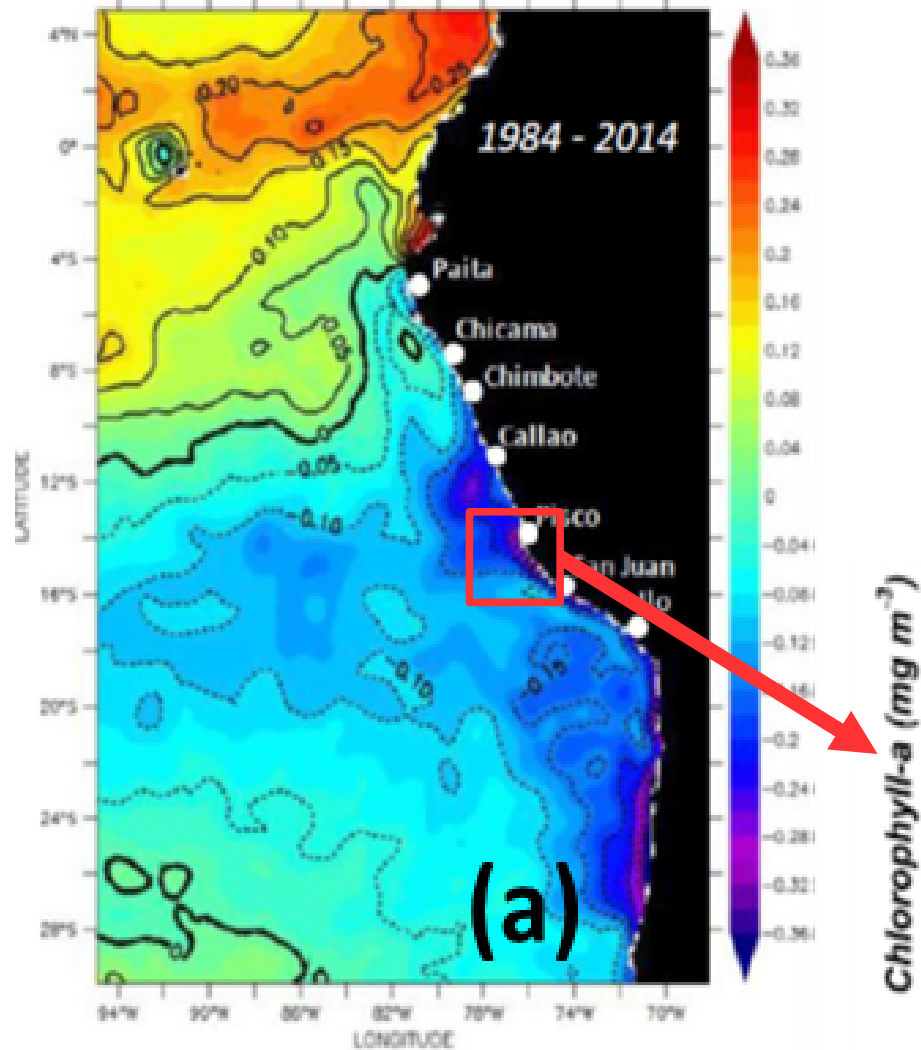
*Long-term trends: Espinoza-Morriberon et al.(2021), Scientific Reports*

## **Model configuration of this study:**

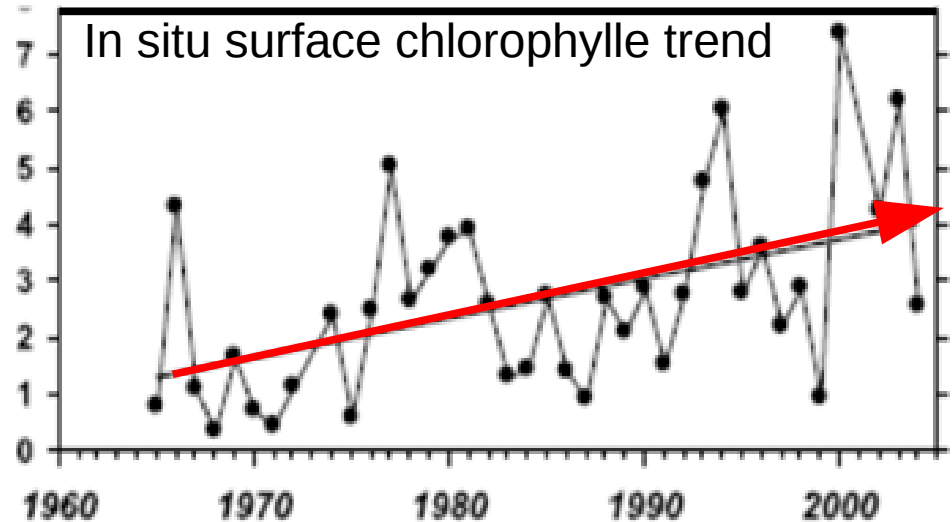
- ROMS-PISCES model (1/6°~ 20 km), 1958-2008 period
- SODA global model for physical open boundaries
- CARS climatology O<sub>2</sub> + nutrients for bgc open boundaries
- atmospheric forcings: NCEP, CFSR,...

# Trends in the Peru-Chile region

AVHRR SST trend (1984-2014)  
surface cooling



Chlorophyll-a ( $\text{mg m}^{-3}$ )

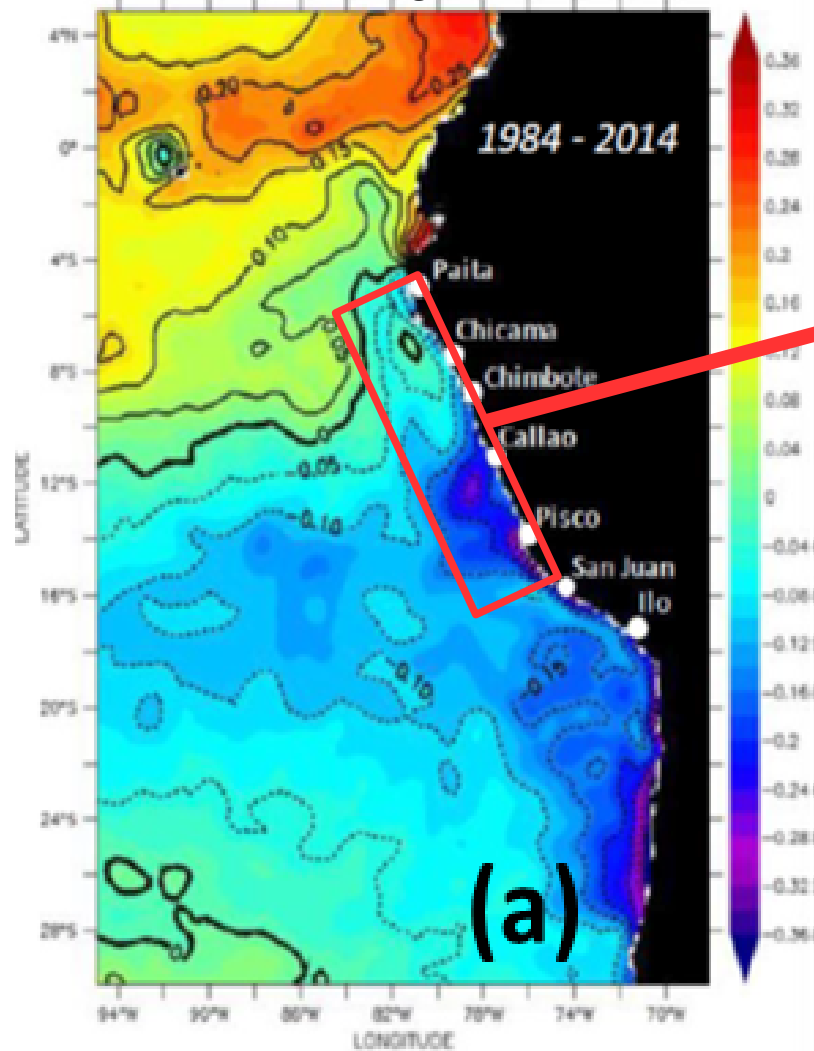


Gutierrez et al. (2011)

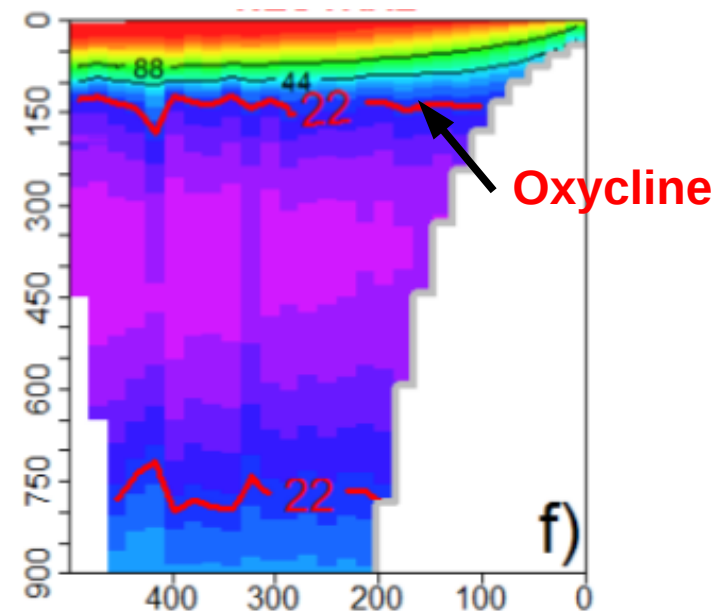
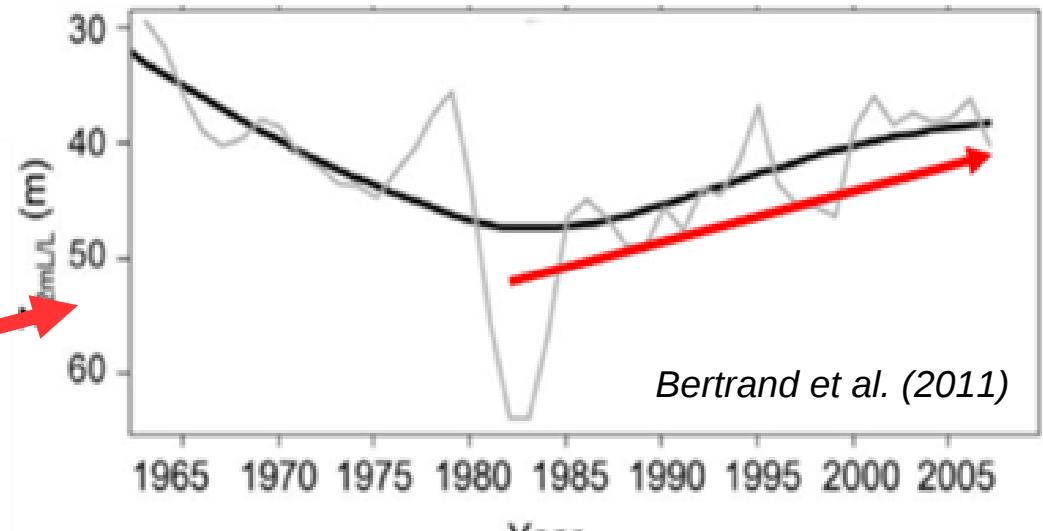


# Trends in the Peru-Chile region

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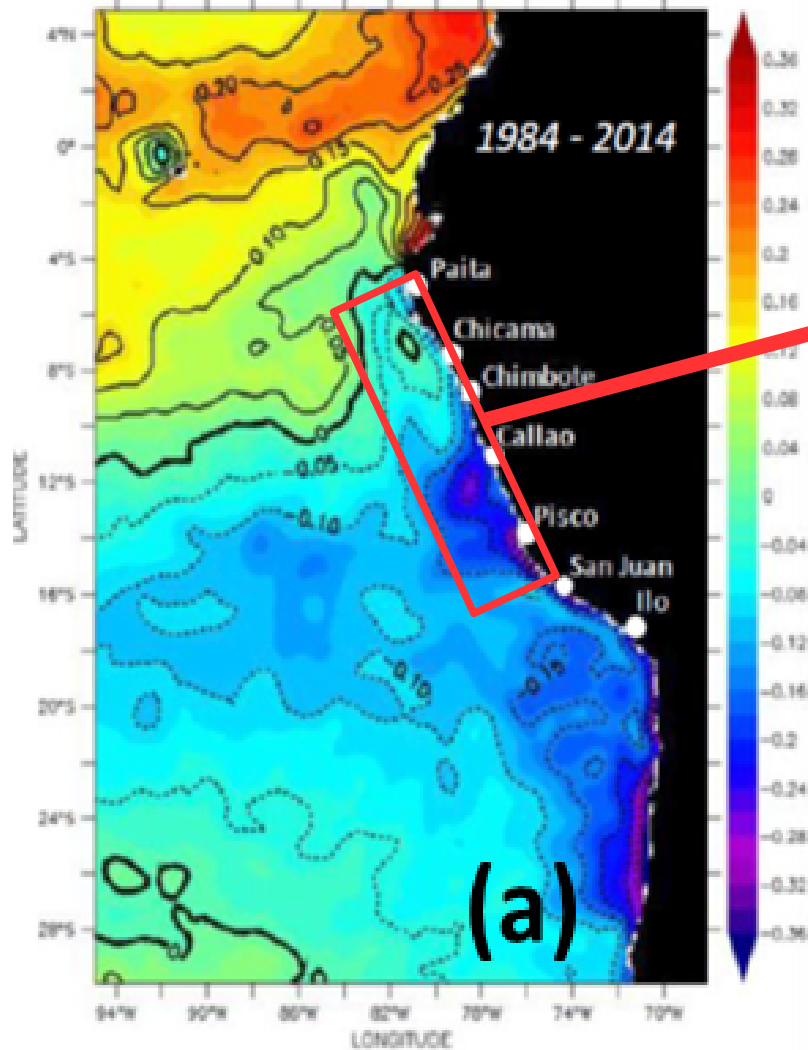


Oxycline ( $\sim 90 \mu\text{mol.l}^{-1}$ ) shoaling in 1980-2008



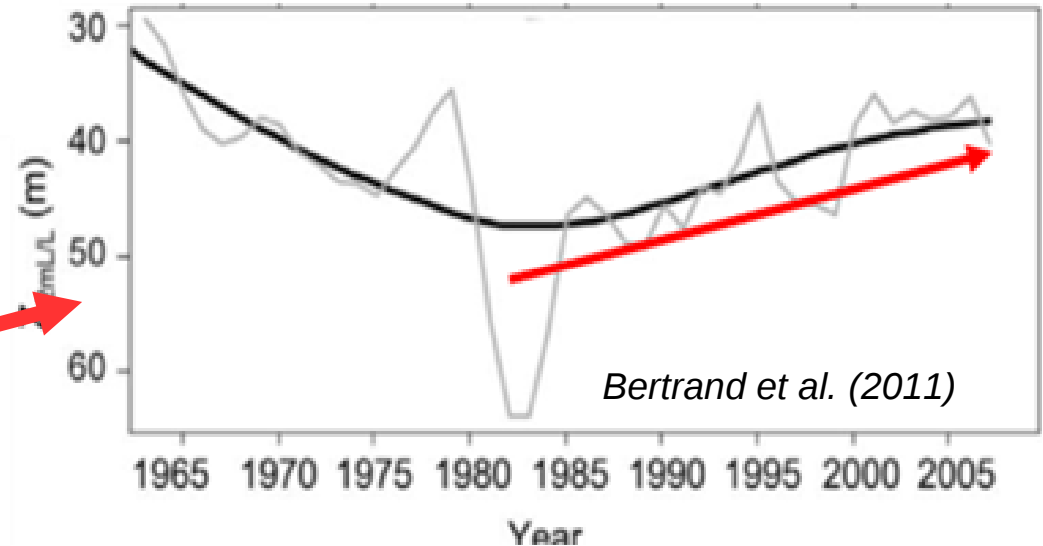
# Recent observed trends in the Peru-Chile region

AVHRR SST trend (1984-2014)  
surface cooling



*Gutierrez et al. (2011)*

Oxycline ( $\sim 90 \mu\text{mol.l}^{-1}$ ) shoaling in 1980-2008

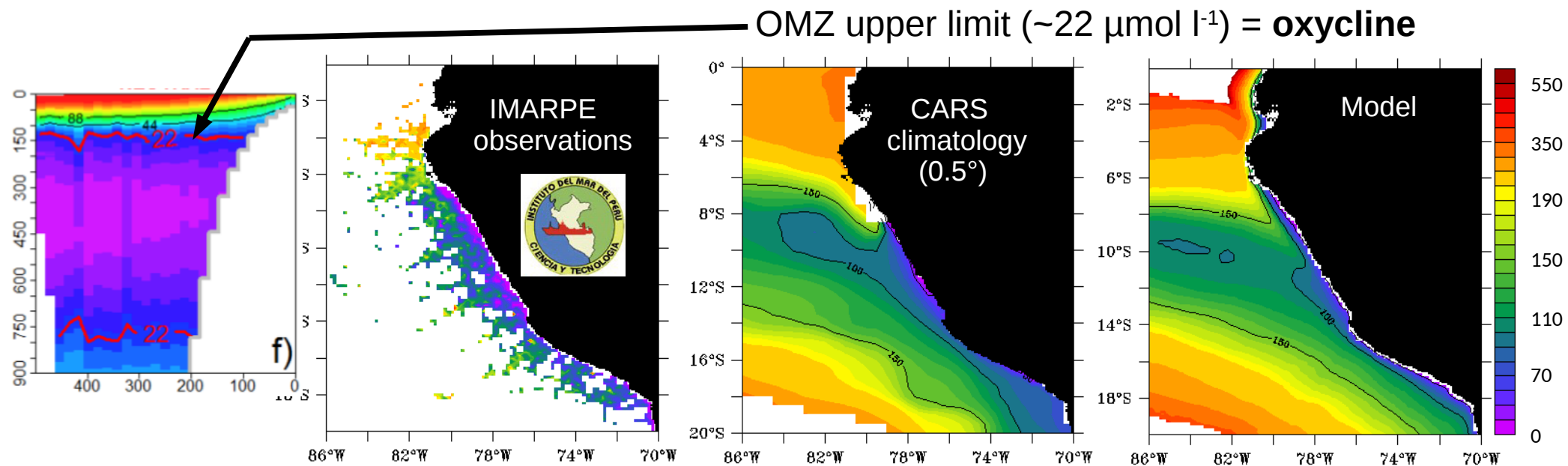


Consistent trends in SST, oxycline and Chl :

=> What is the forcing of these trends ?

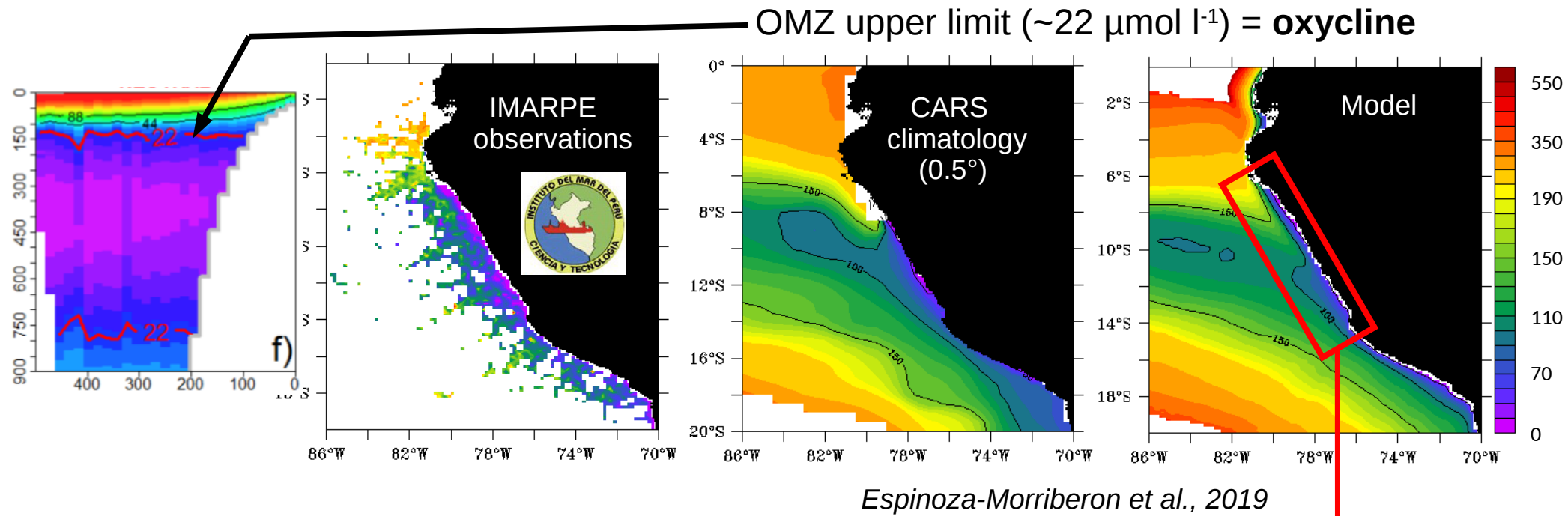


# Evaluation of Interannual variability of the OMZ

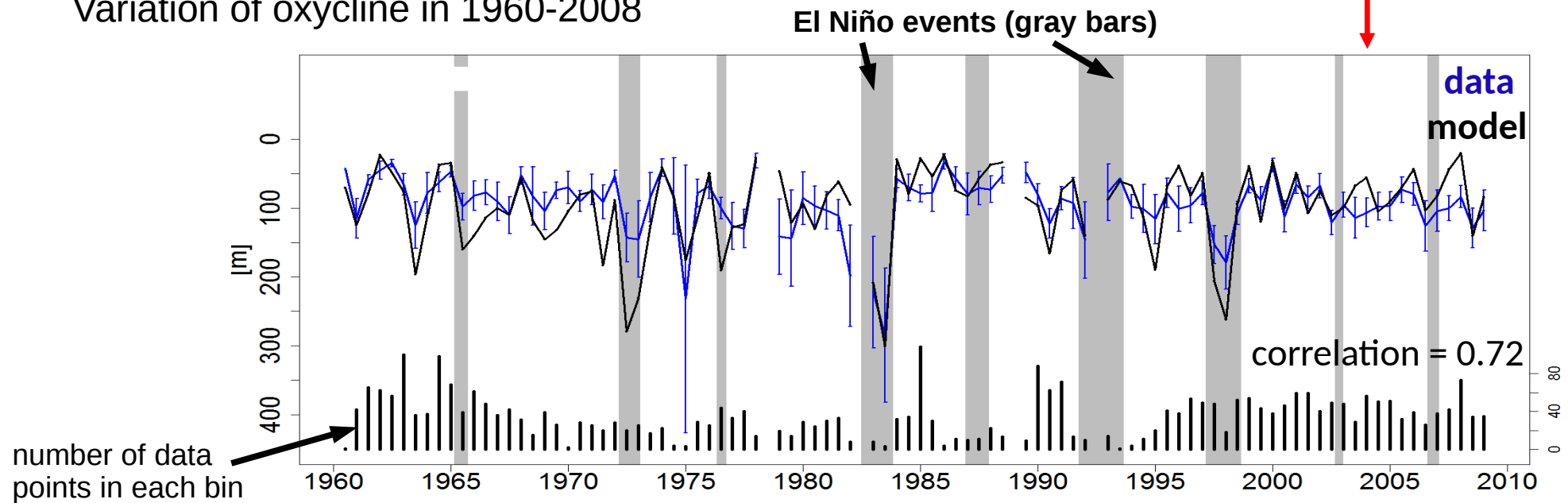


*Espinoza-Morriberon et al., 2019*

# Evaluation of Interannual variability of the OMZ

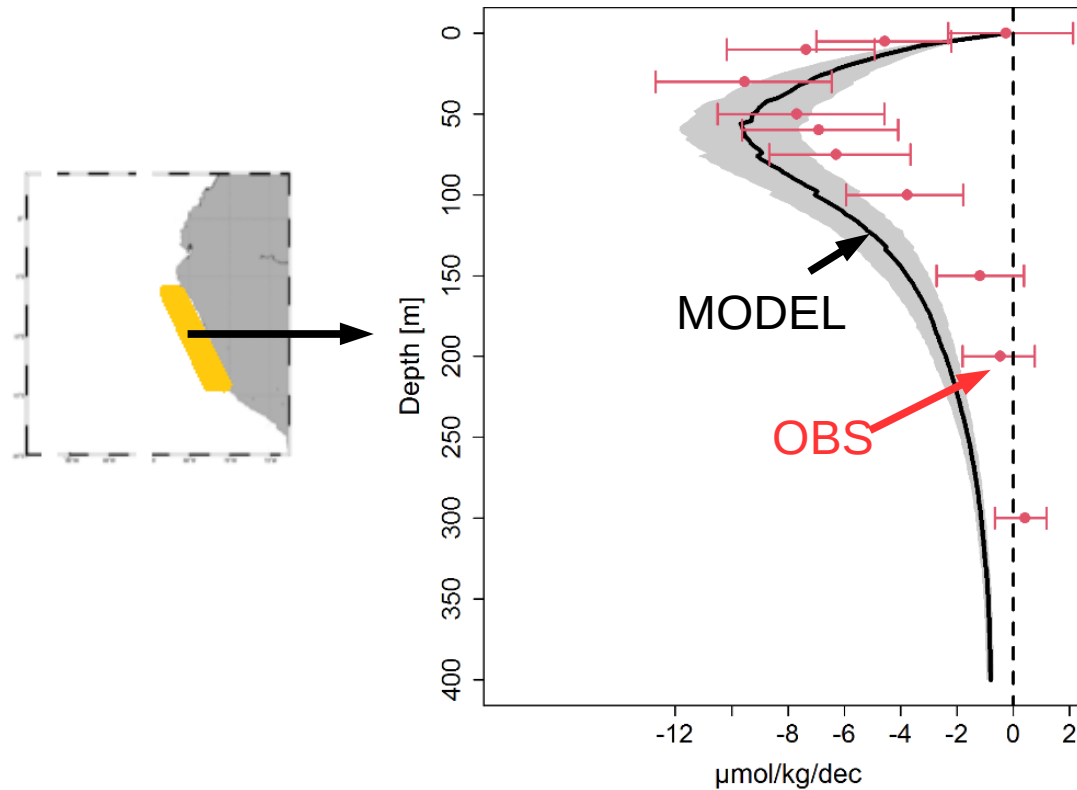


Variation of oxycline in 1960-2008



# Long-term variability of the OMZ

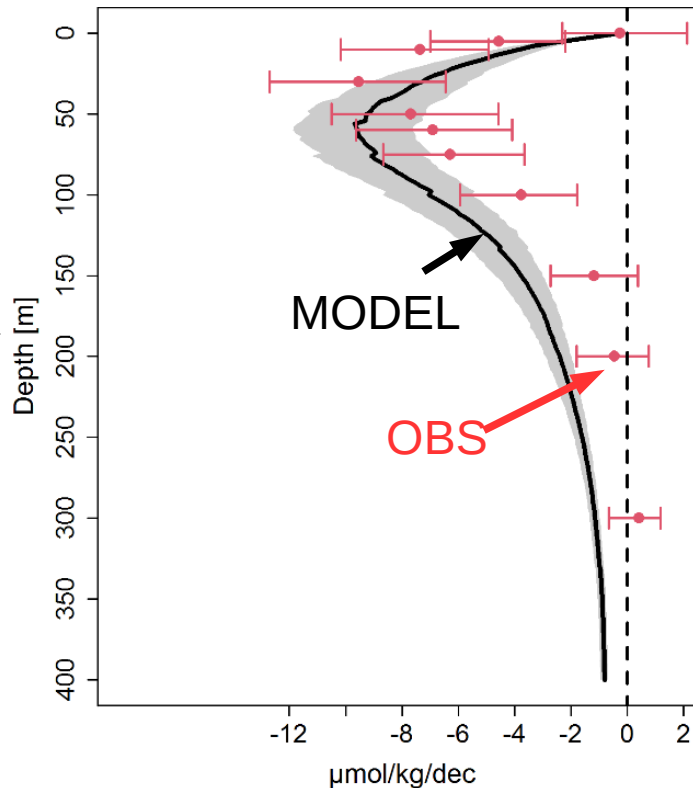
Oxygen trends 1979-2008  
(spatial average)



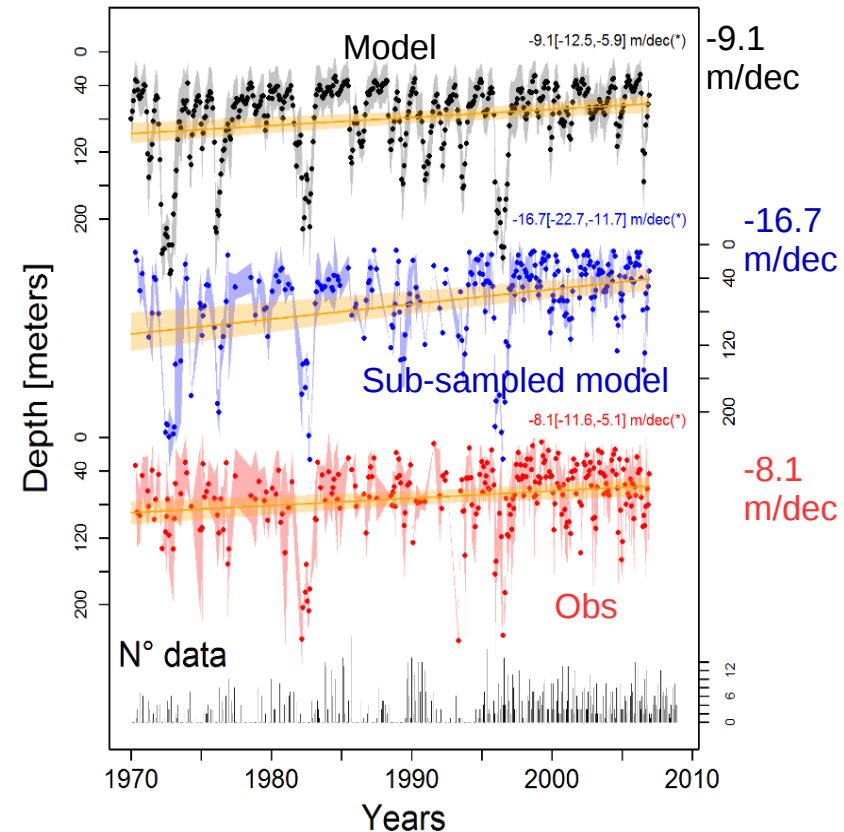
- decreasing oxygen trends between 10 m and 150 m depth in observations and model

# Long-term variability of the OMZ

Oxygen trends 1979-2008  
(spatial average)



Oxycline trend 1979-2008  
(10S-13S, spatial average)



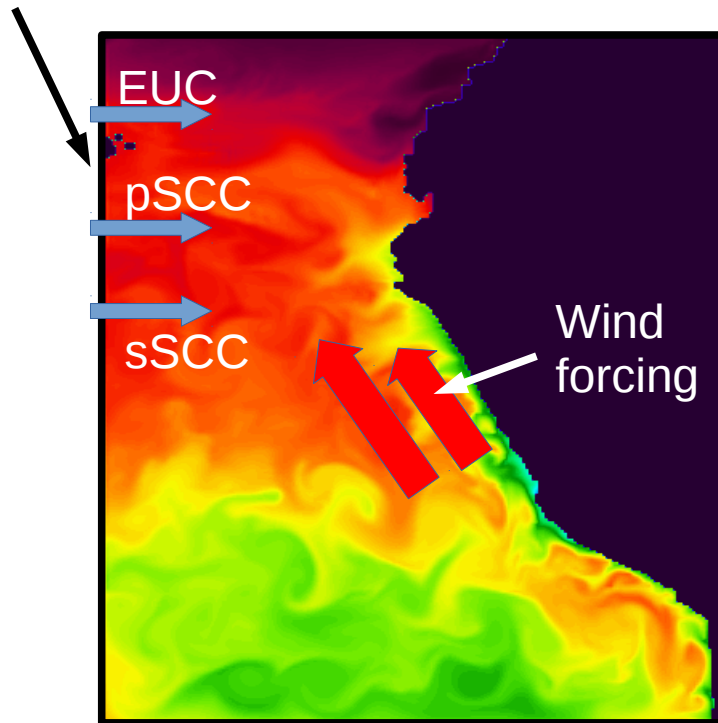
- decreasing oxygen trends between 10 m and 150 m depth in observations and model
- model reproduces oxycline shoaling trend ( $\sim -10$  m/decade)
- subsampling the model results leads to overestimation of trend

=> observed trend could be weaker than the real trend !

# Investigating the forcing of the OMZ long-term variability

Source of variability : equatorial currents and/or local wind stress ?

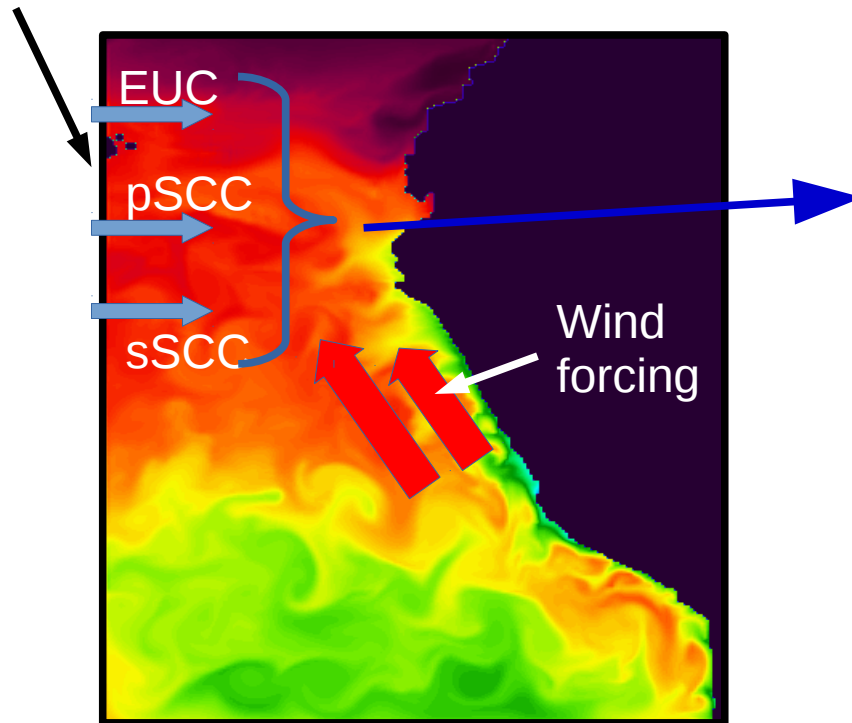
Open boundary forcing  
(mainly near the equator)



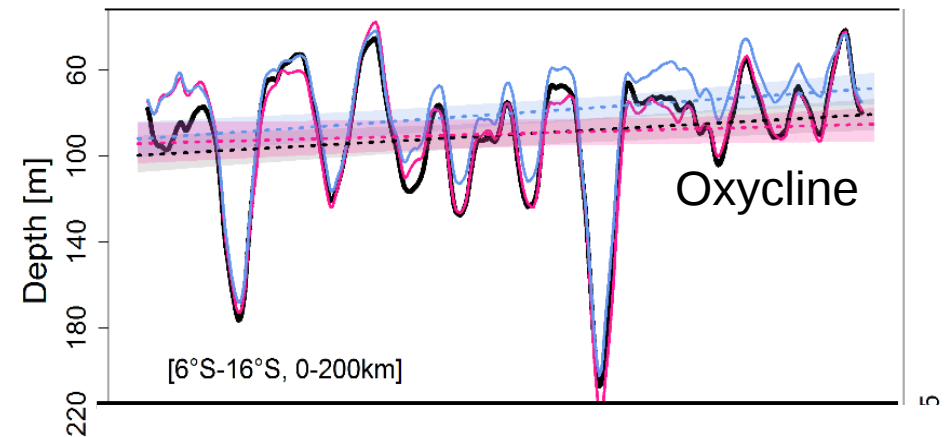
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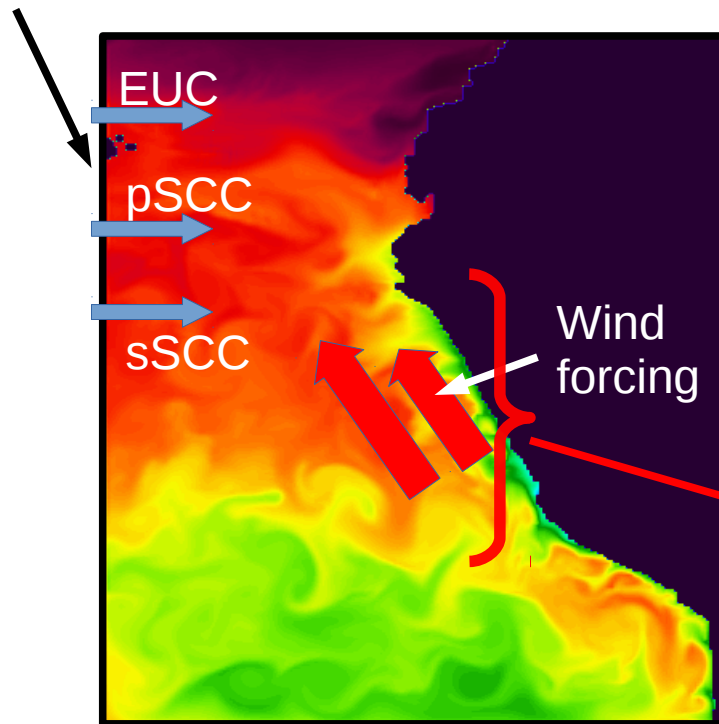
Different **climatological** wind forcing  
+ **interannual boundary conditions**



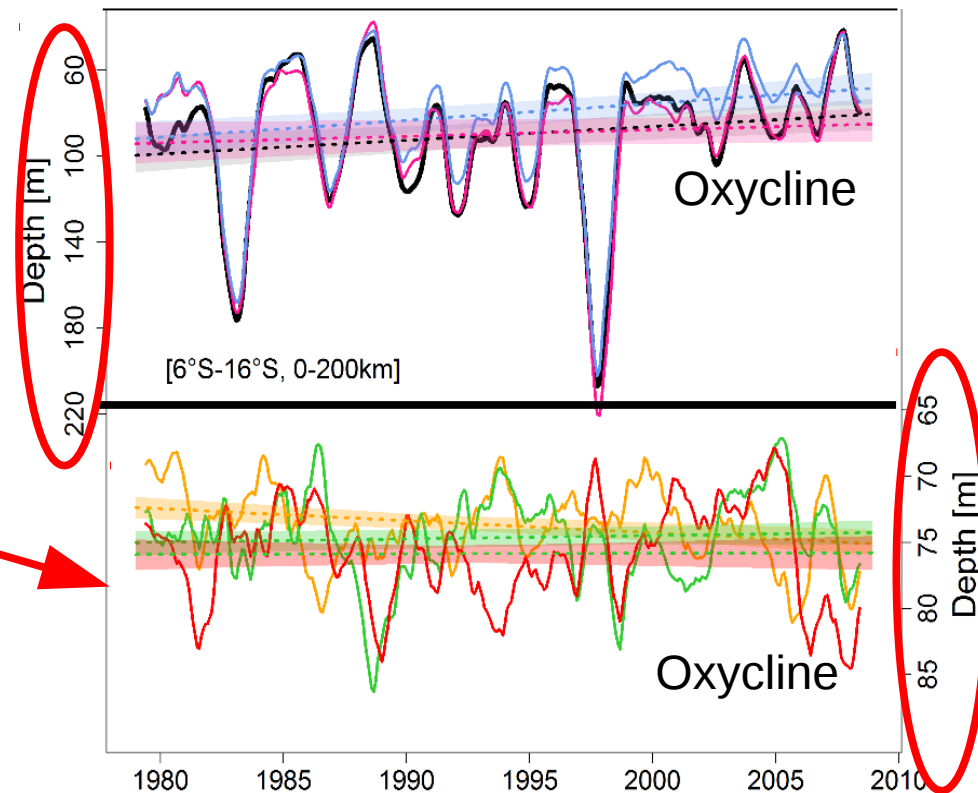
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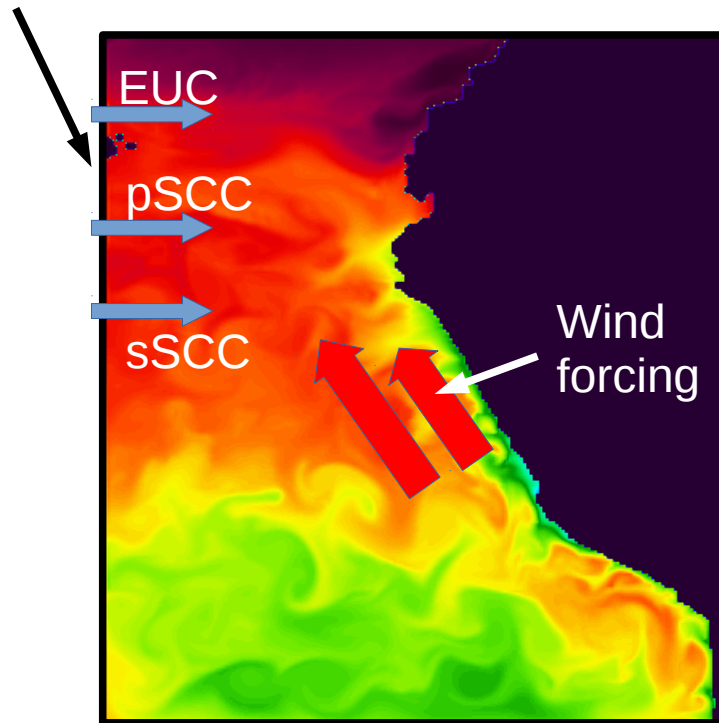


Different **interannual** wind forcing  
+ **climatological** boundary conditions

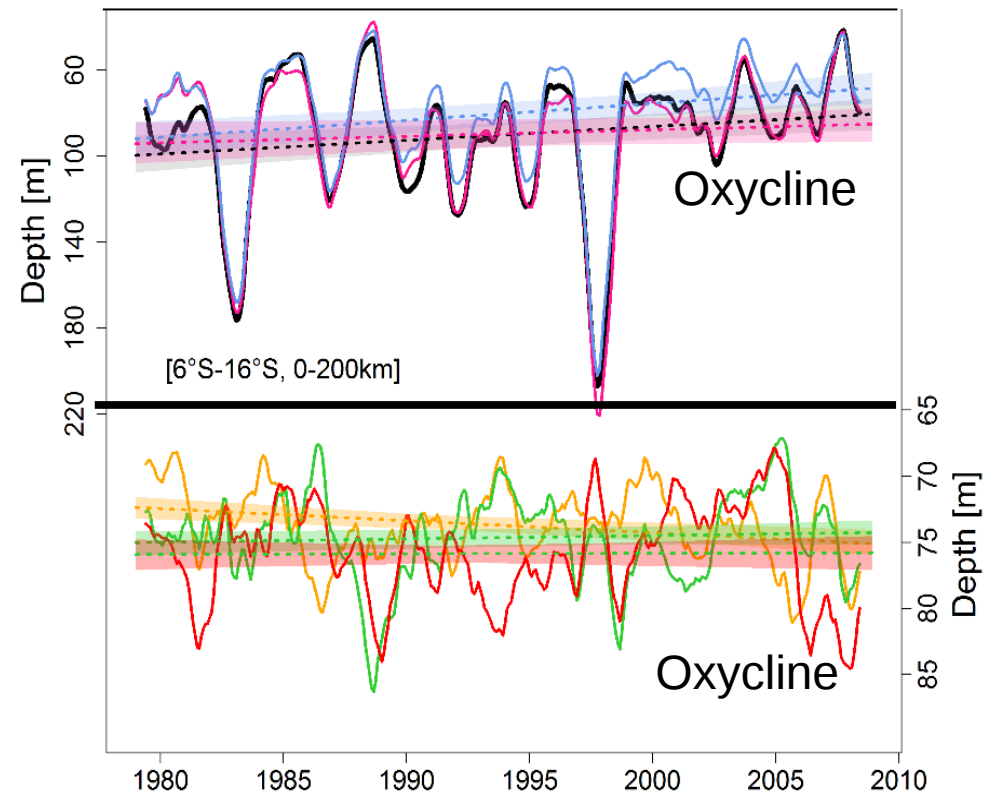
# Investigating the forcing of the long-term variability

Source of variability : equatorial currents and/or local wind stress ?

Open boundary forcing  
(mainly near the equator)



Different **climatological** wind forcing  
+ **interannual** boundary conditions



=> Reducing oxygen flux by equatorial currents (ventilation)  
drives deoxygenation in 1970-2008 period

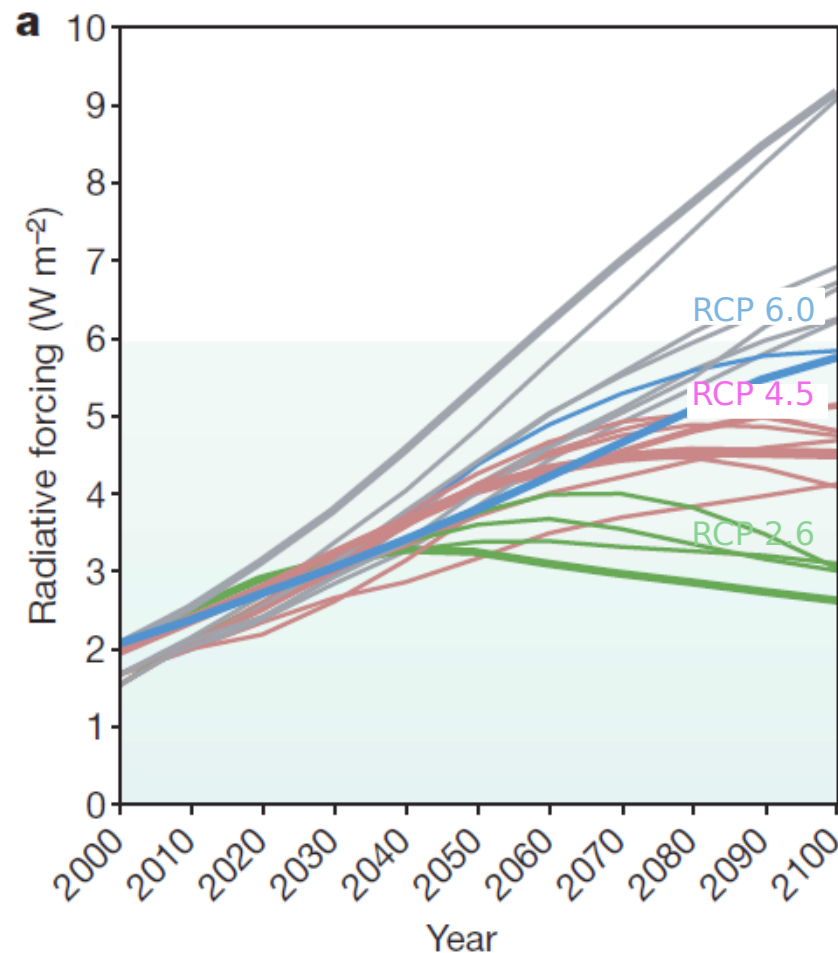


# Investigating the forcing of the long-term variability: climate change

Impact of climate change on the Peruvian Upwelling system :

*Echevin et al., Biogeochem. Discuss., 2020*

CMIP5 climate  
scenarios



RCP8.5

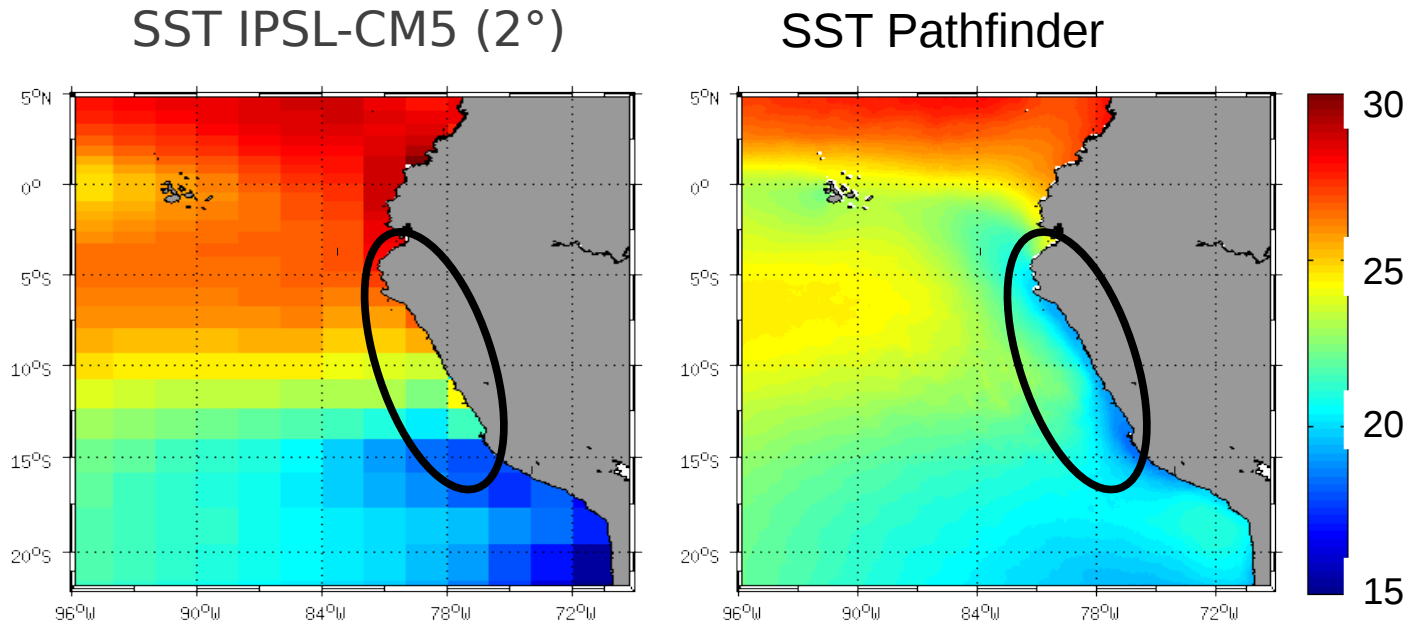
global, large scale  
ocean-atmosphere-BGC  
Models

(Earth System Models=ESM)

**What is the impact in  
the Peruvian upwelling  
system BGC ?**

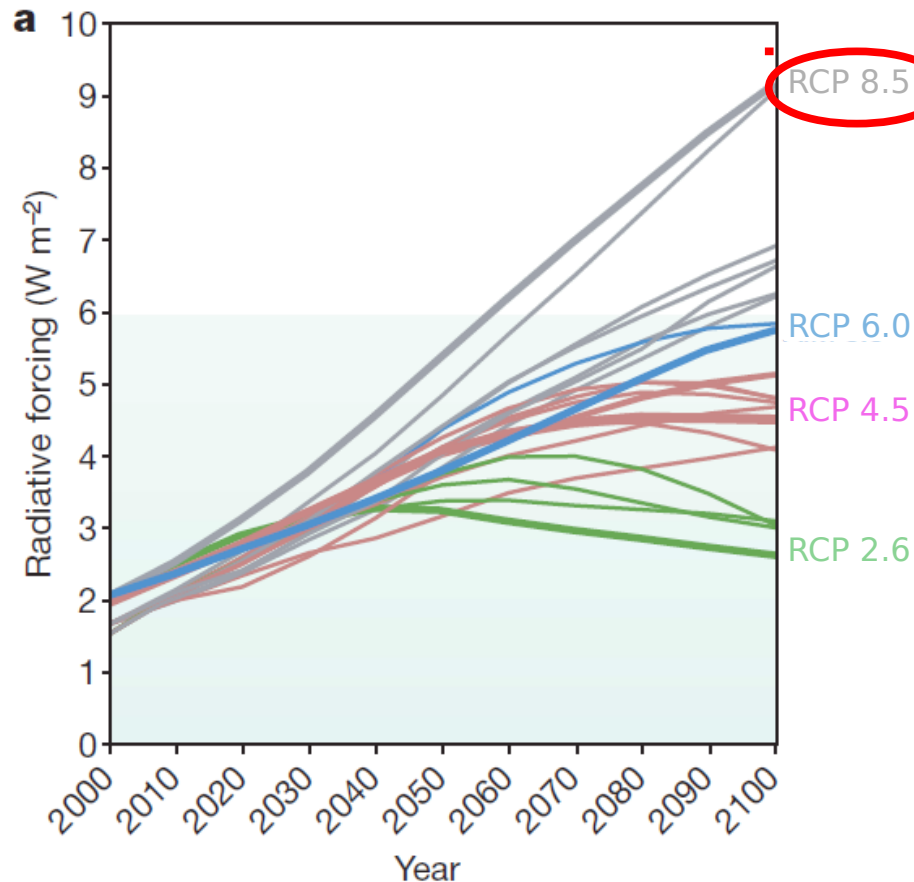
# Investigating the forcing of the long-term variability: climate change

- strong model bias in CMIP5 ESM



- no/weak coastal upwelling in ESM => necessary to use regional models  
to downscale climate and BGC signals

# Investigating the forcing of the long-term variability: climate change



**RCP8.5 = worst case scenario**

Downscaling of 3 ESM models (Phy & BGC)

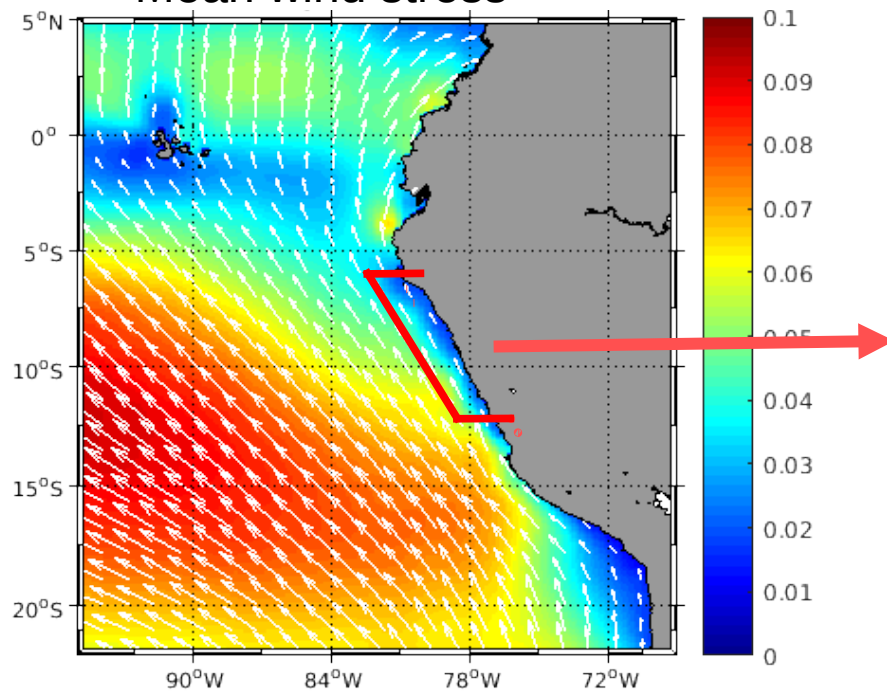
CNRM-CM5, GFDL-ESM2M, IPSL-CM5A-MR

ROMS - PISCES ( $dx = 1/9^\circ \sim 10 \text{ km}$ )

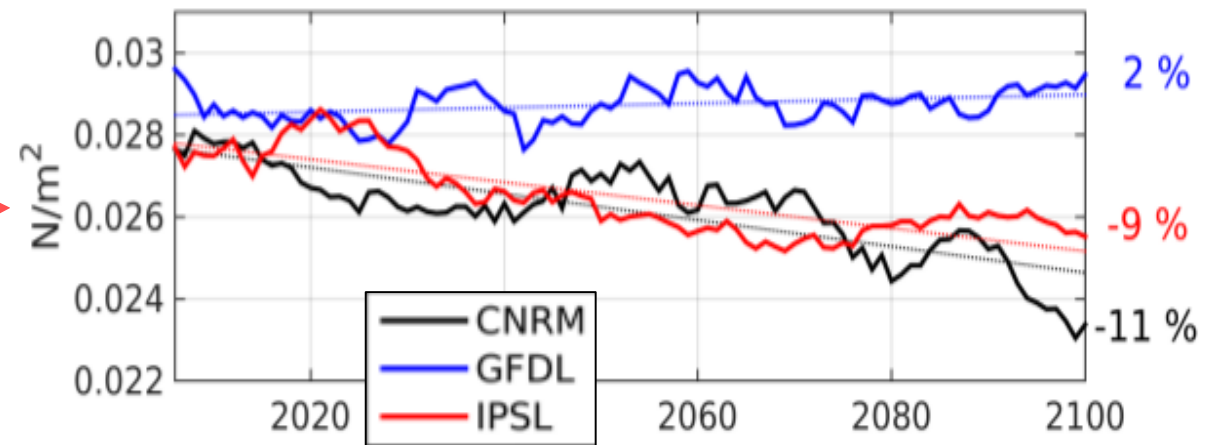
*Moss et al., 2010*

# Investigating the forcing of the long-term variability: climate change

Mean wind stress



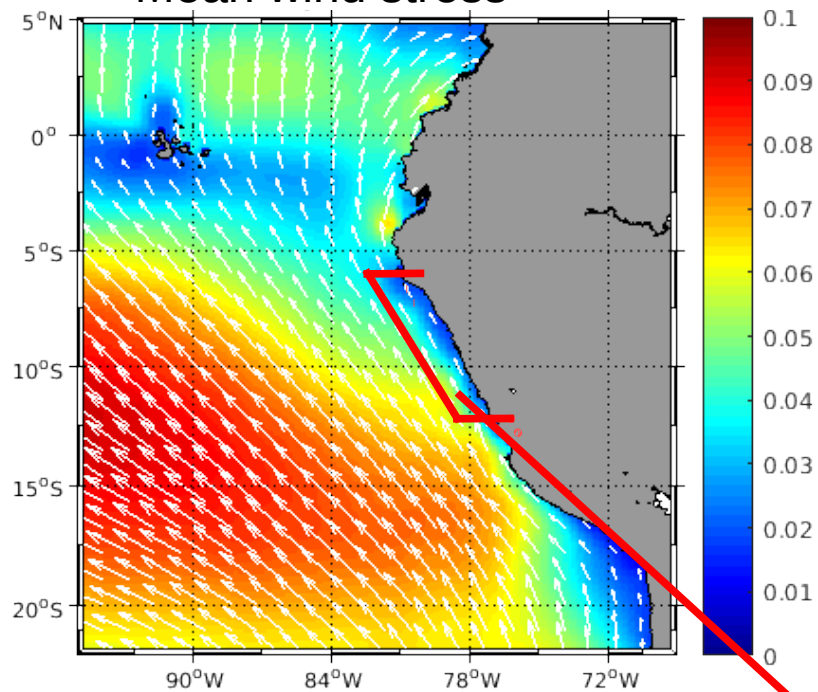
Alongshore wind stress in coastal box



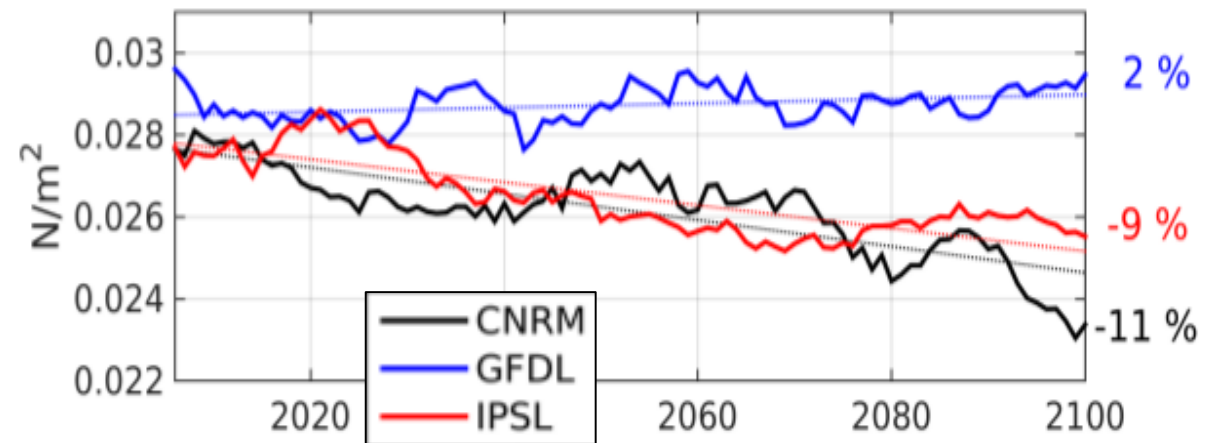
Dotted lines = linear trends

# Investigating the forcing of the long-term variability: climate change

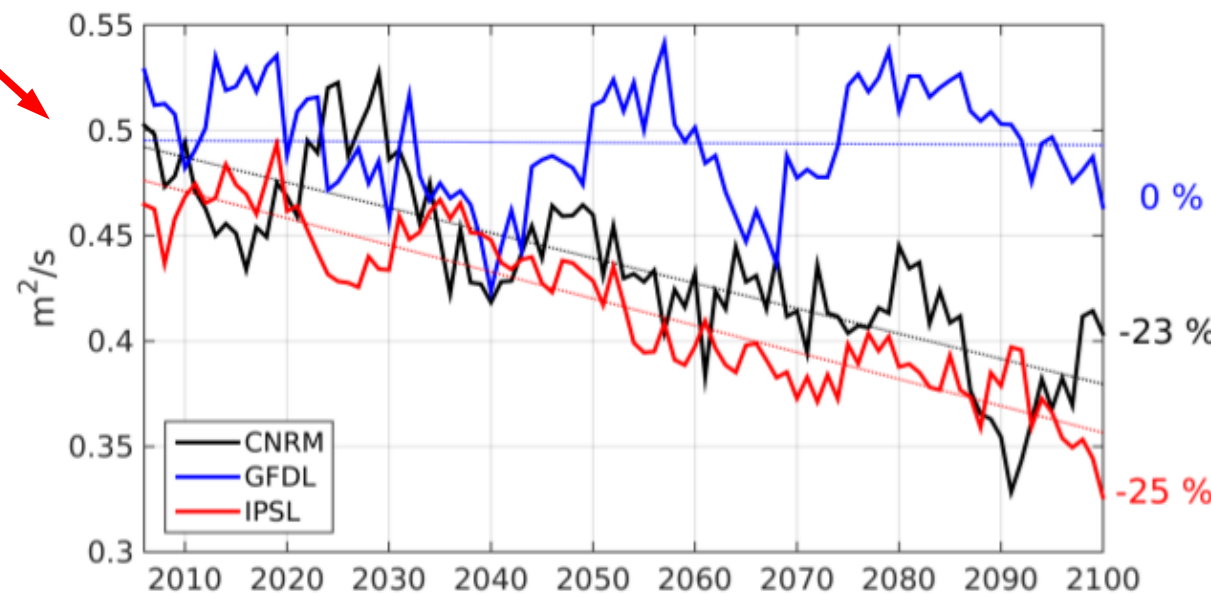
Mean wind stress



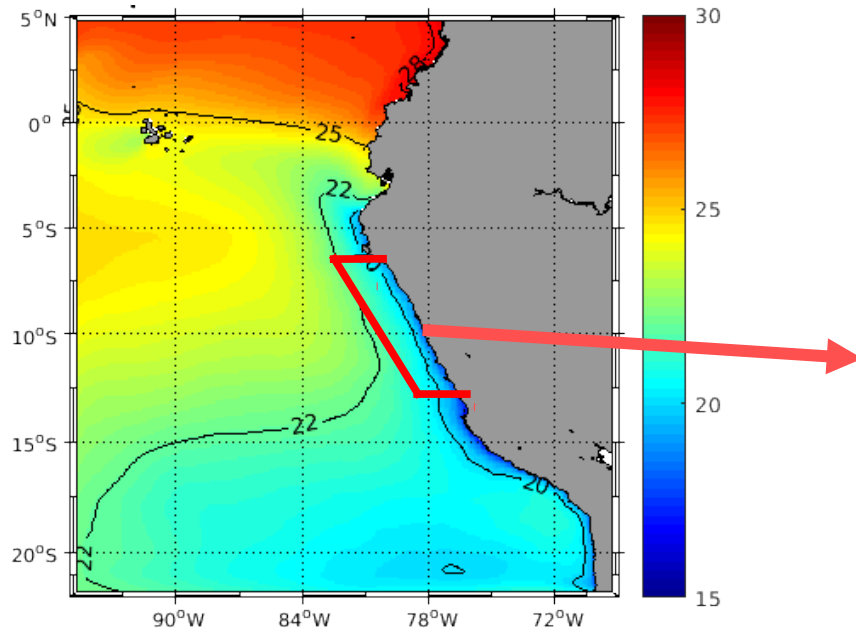
Alongshore wind stress in coastal box



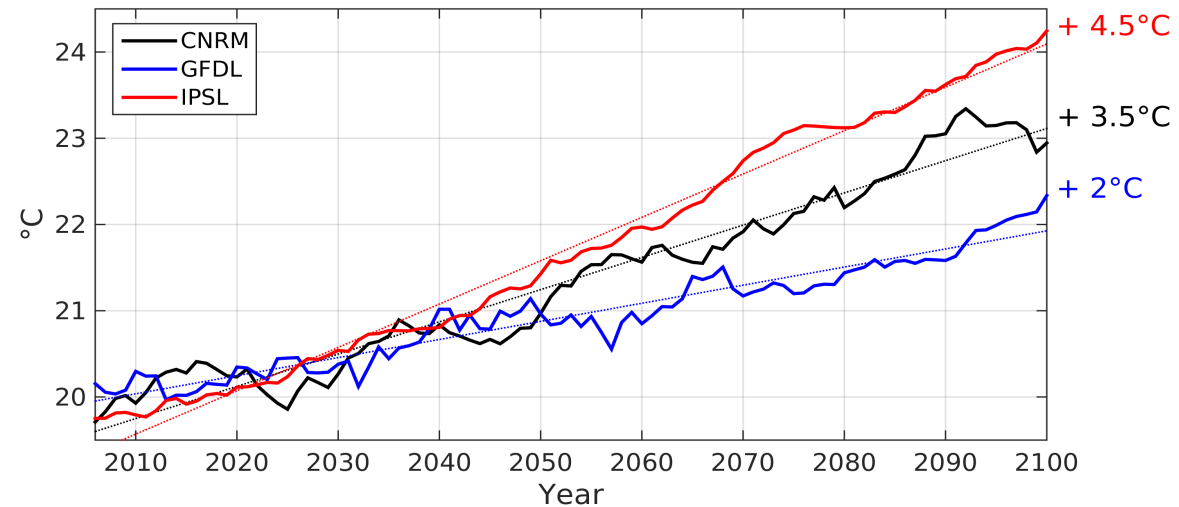
upwelling in coastal box



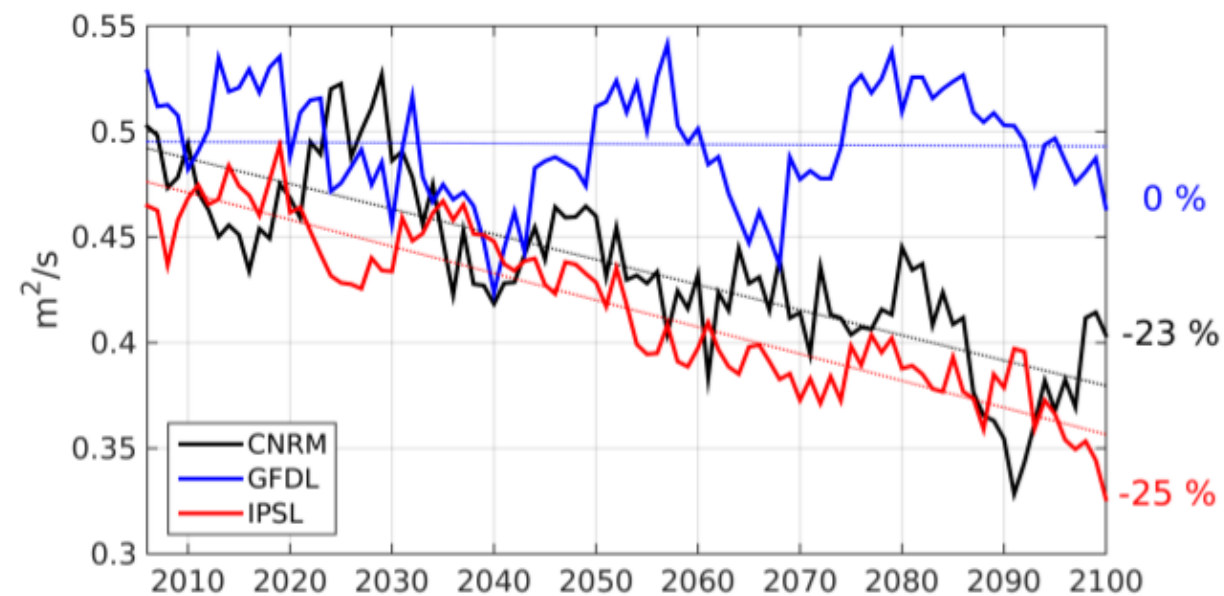
# Investigating the forcing of the long-term variability: climate change



SST in coastal box

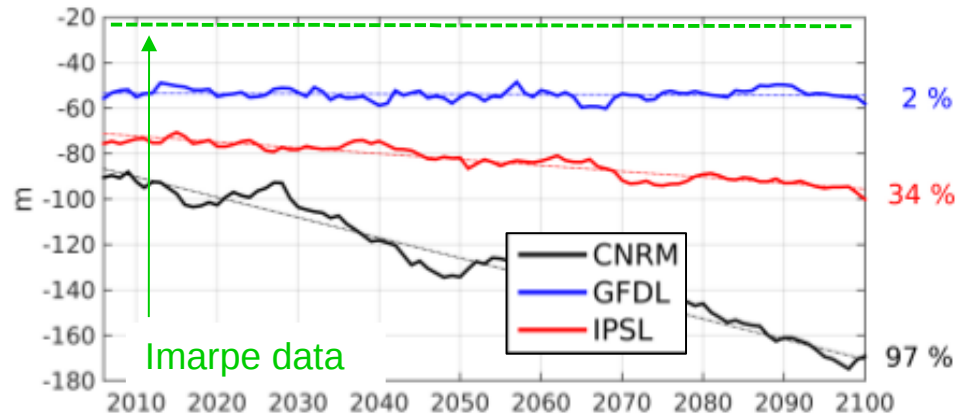


upwelling in coastal box



# Investigating the forcing of the long-term variability: climate change

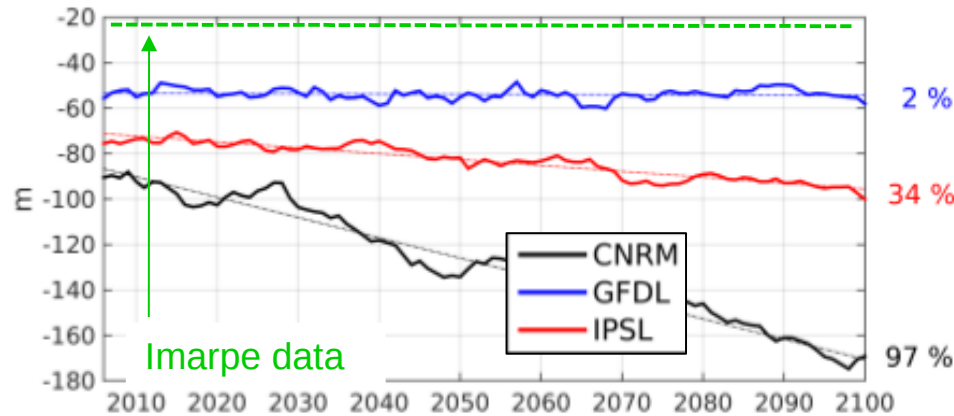
## Nitracline depth in ESM models



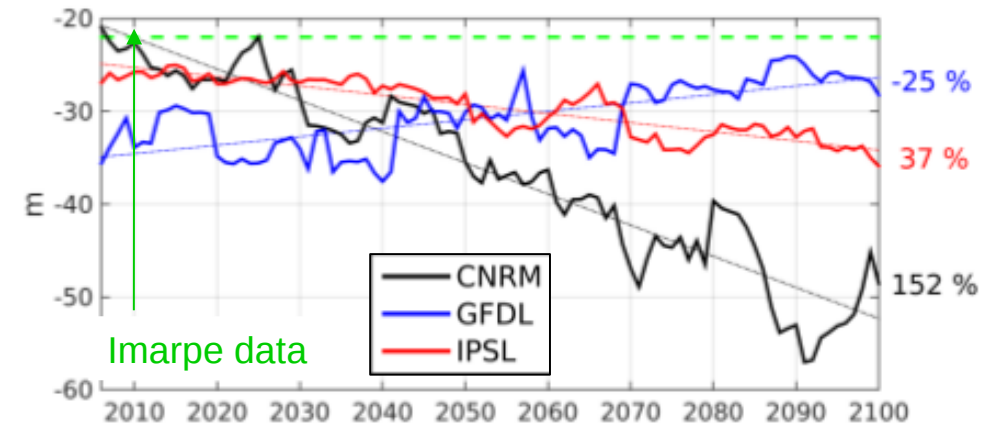
- strong bias in nitracline depth in ESM

# Investigating the forcing of the long-term variability: climate change

Nitracline depth in ESM models



Nearshore nitracline depth in ROMS-PISCES

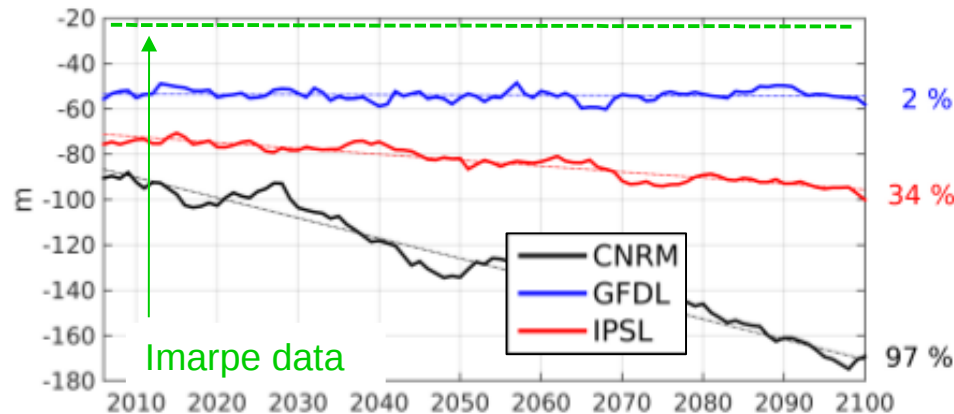


- strong bias in nitracline depth in ESM
- regional downscaling corrects part of the bias

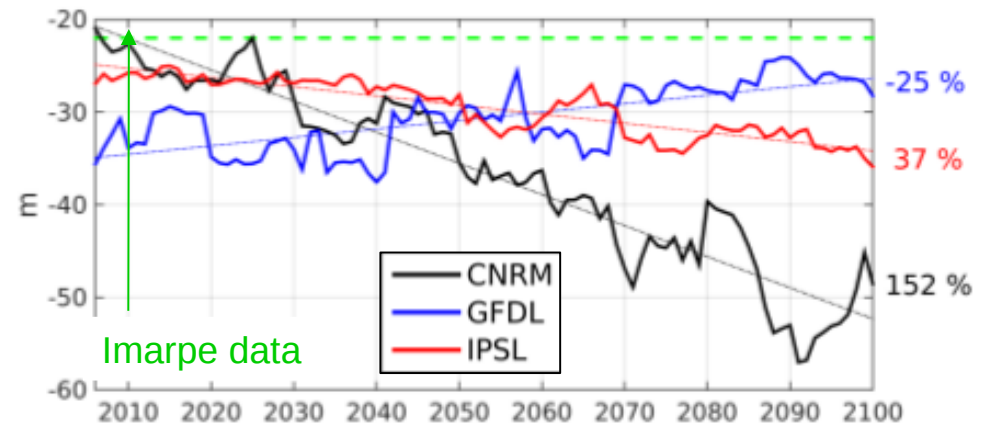


# Investigating the forcing of the long-term variability: climate change

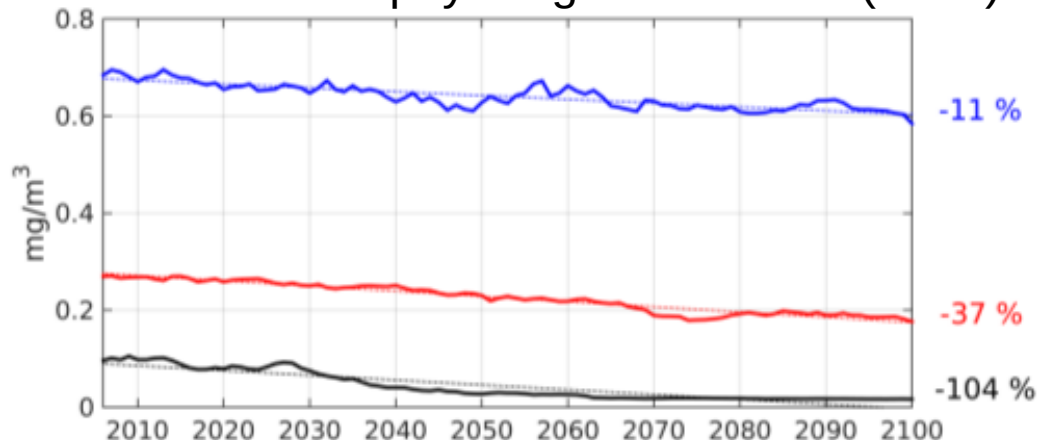
Nitracline depth in ESM models



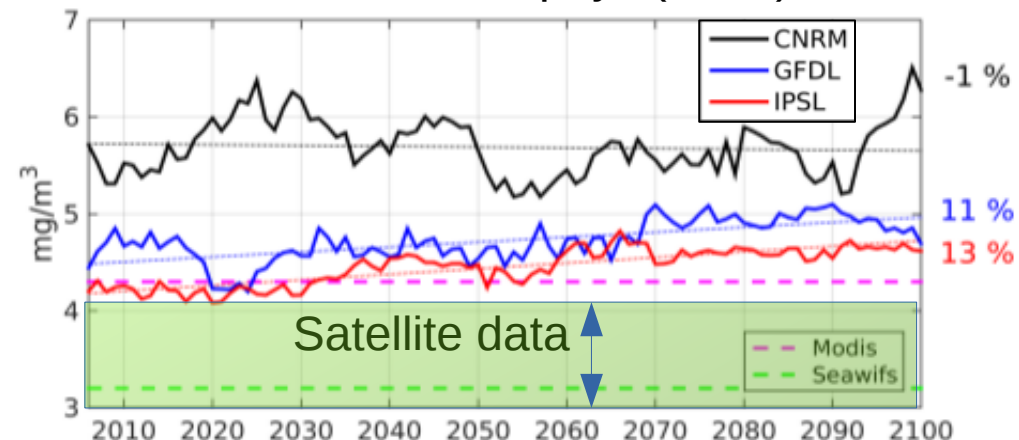
Nearshore nitracline depth in ROMS-PISCES



Surface chlorophyll in global models (0-5m)



Surface Chlorophyll (0-5m)



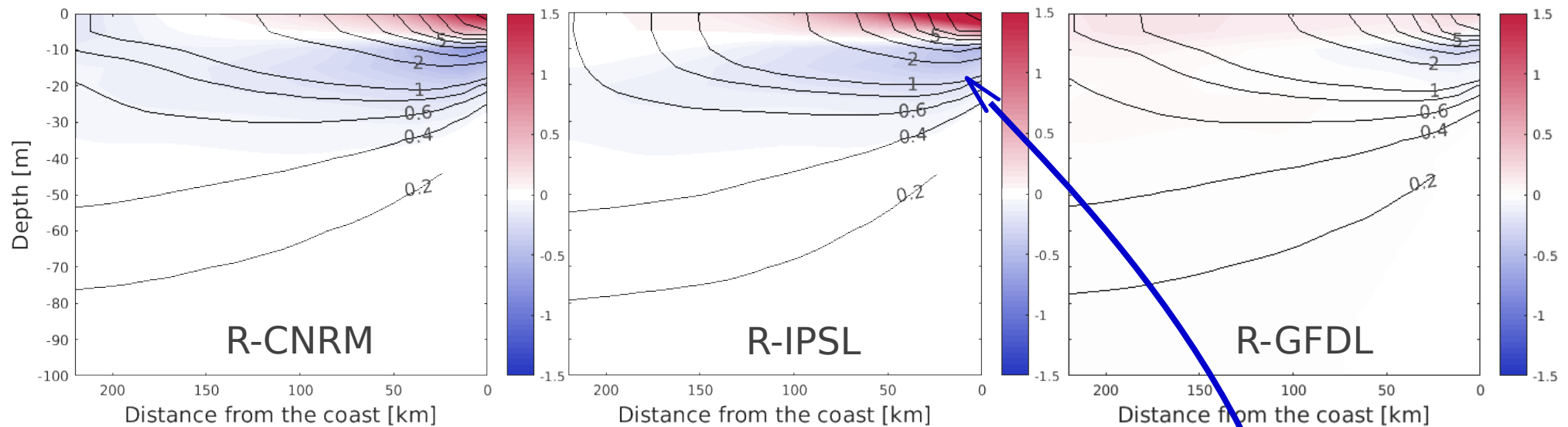
=> ROMS-PISCES surface chlorophyll range is correct  $\neq$  global models

=> surface chl trends are very different from those in the global models

=> weak surface chl trends in ROMS-PISCES in spite of nitracline deepening

# Investigating the forcing of the long-term variability: climate change

Chlorophyll trend vertical structure



Less nutrients in subsurface layers but :

- less upwelling => less offshore transport

=> more retention near the coast

- more stratification & shallower mixed layer

=> stable phytoplankton concentration at

surface and reduction below

# CROCO-PISCES: tool to understand mechanisms

- What is the impact of small scale (submesoscale) dynamics in the Peru upwelling system?

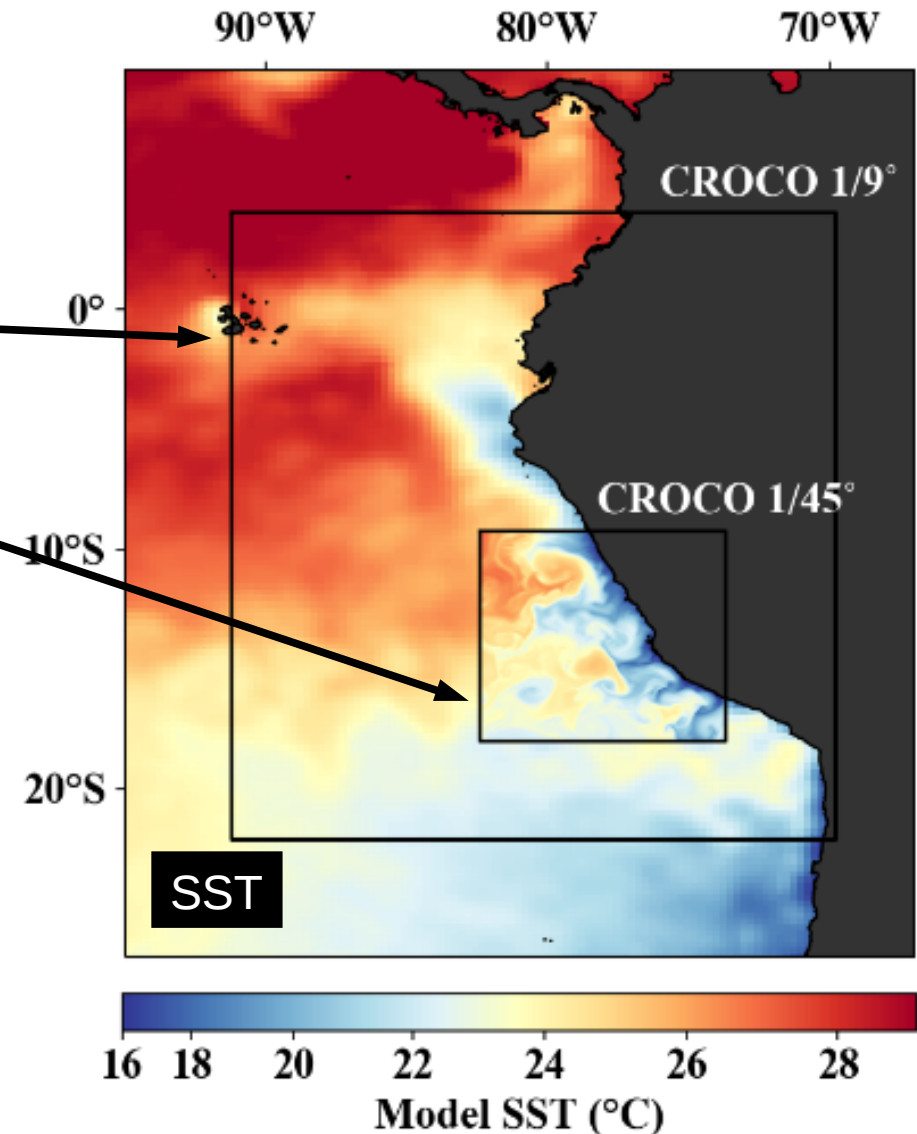
*Thomsen et al. (2016), Geophysical Res. Let.*

*Hauschildt et al.,(2021), Biogeochemical cycles.*

Model configuration

CROCO-PISCES model ( $1/9^\circ \sim 13$  km)

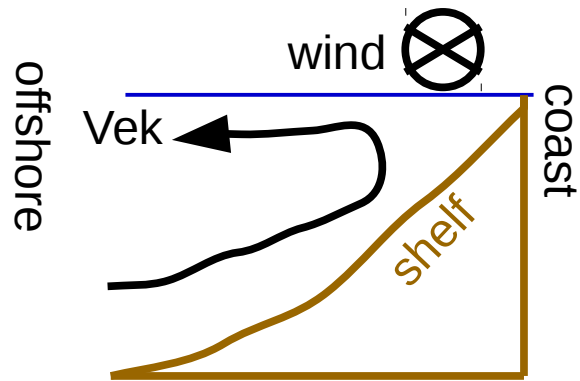
+ offline zoom ( $1/45^\circ \sim 2.6$  km)



# Impact of submesoscale dynamics in the Peru upwelling system

- there is a lot of subduction in upwelling systems!

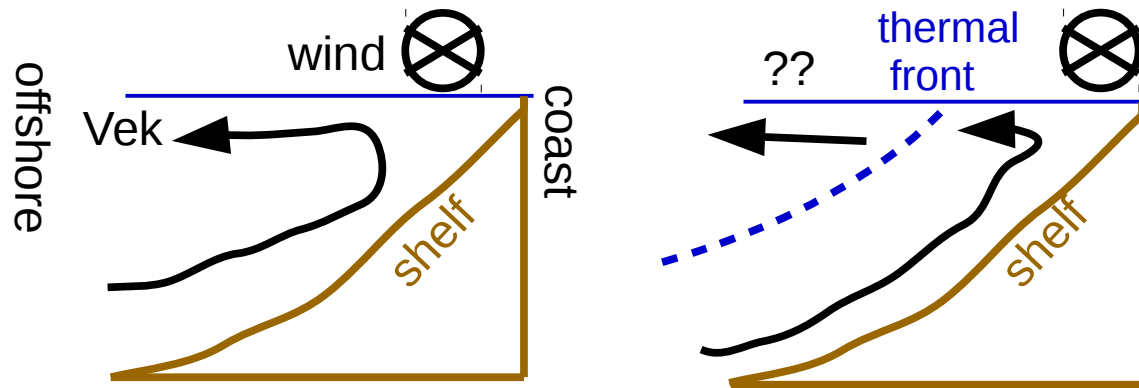
« classical view »



# Impact of submesoscale dynamics in the Peru upwelling system

- there is a lot of subduction in upwelling systems!

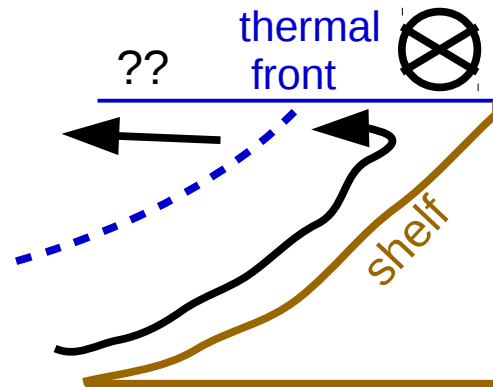
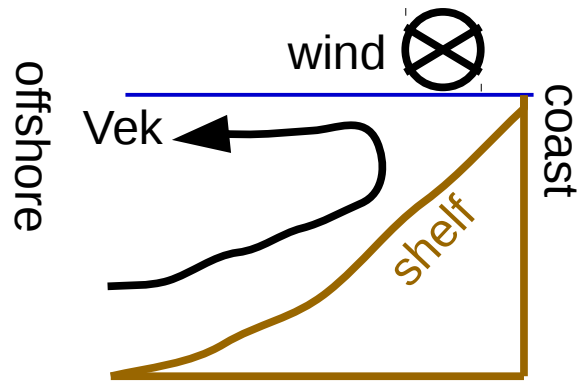
« classical view »



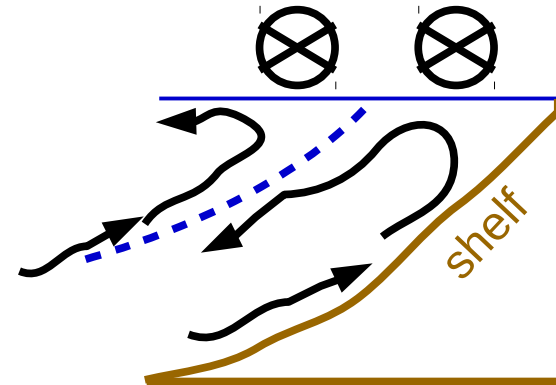
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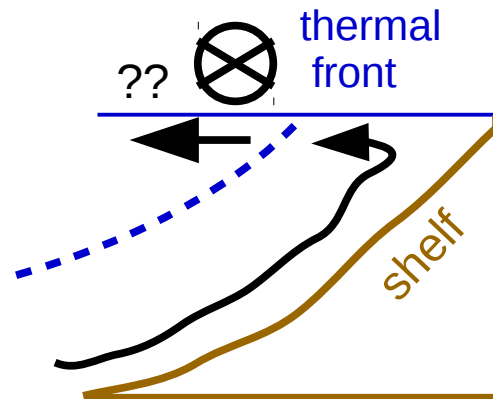
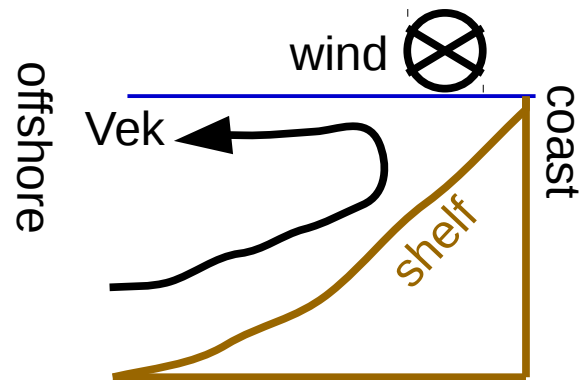
Subduction (downwelling)  
on the cold side of the front,  
upwelling on the warm side



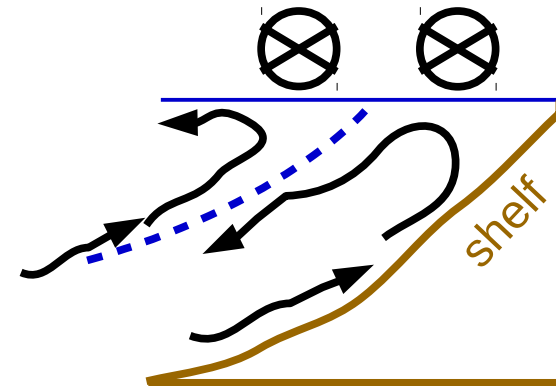
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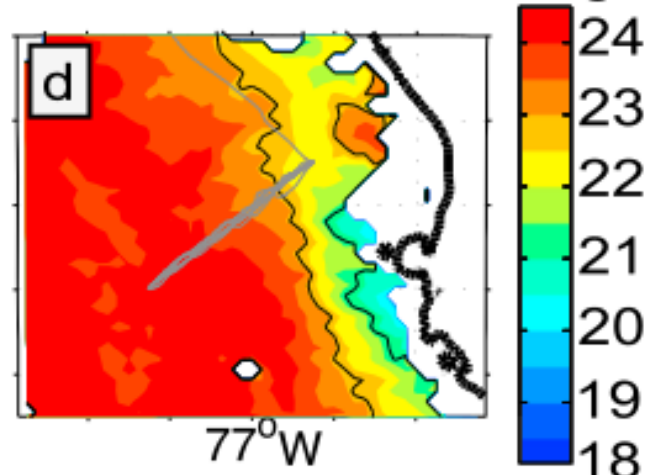
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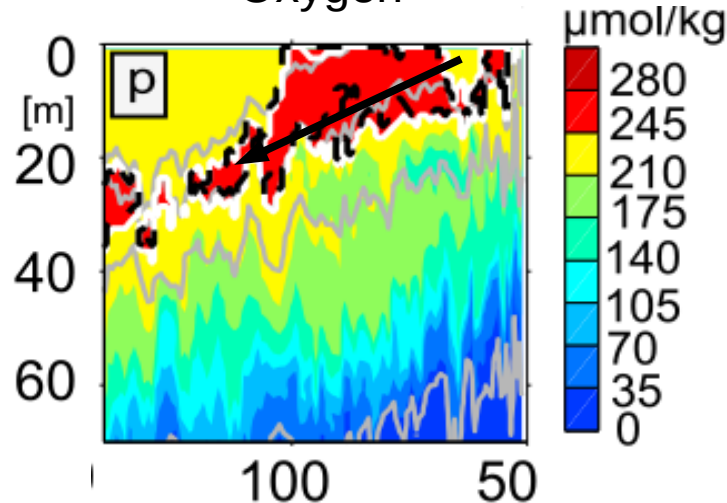
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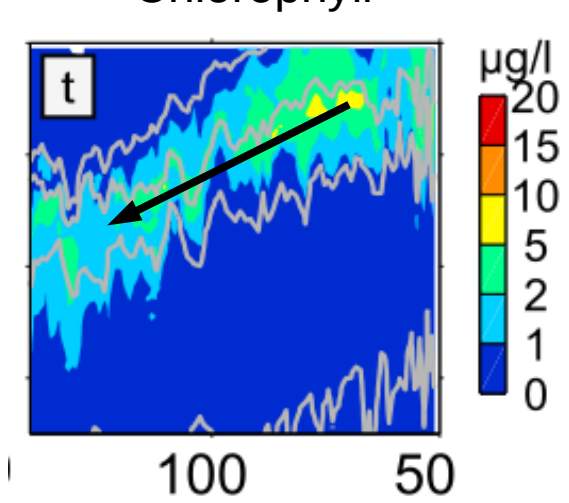
SST Feb. 9 2013



Oxygen



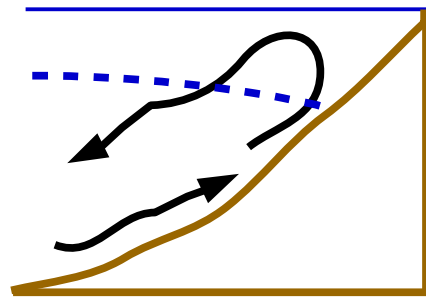
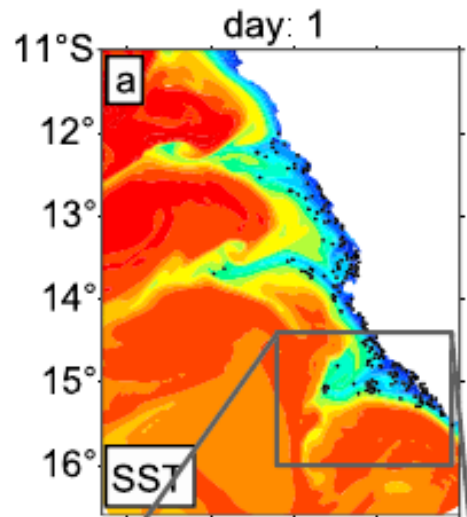
Chlorophyll



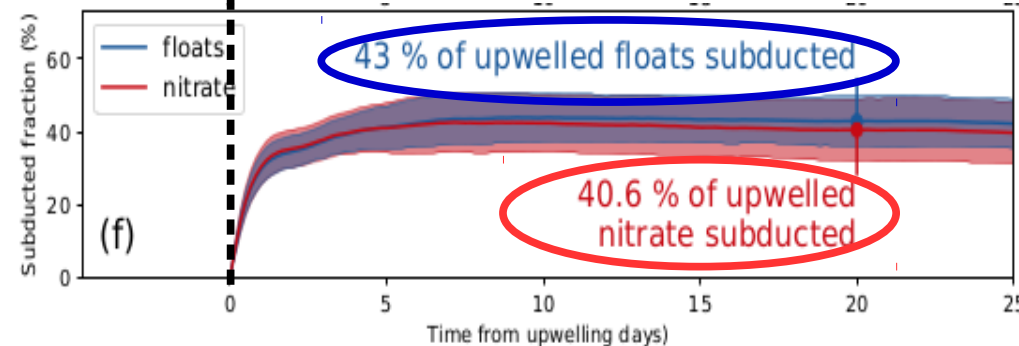
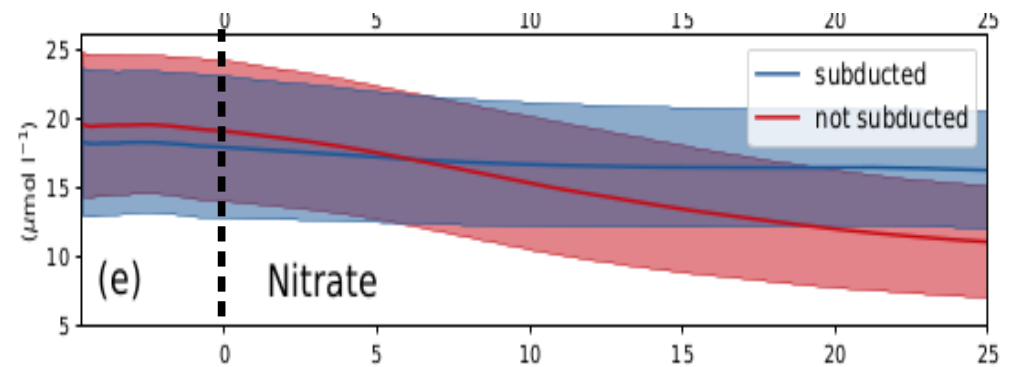
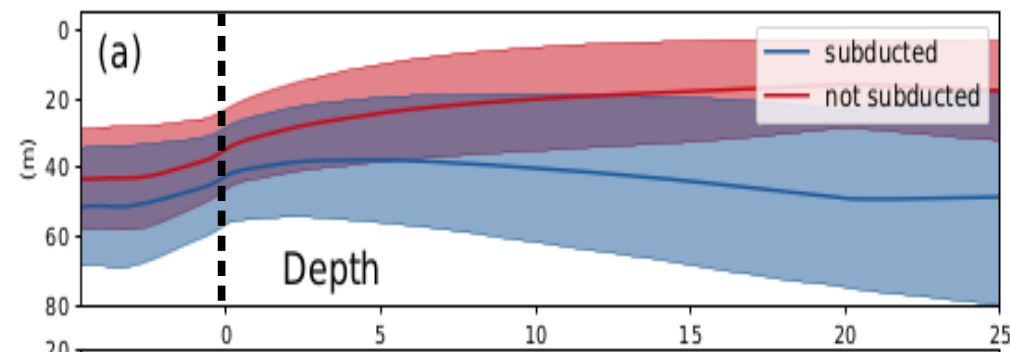
Thomsen et al., 2016

# Impact of submesoscale dynamics in the Peru upwelling system

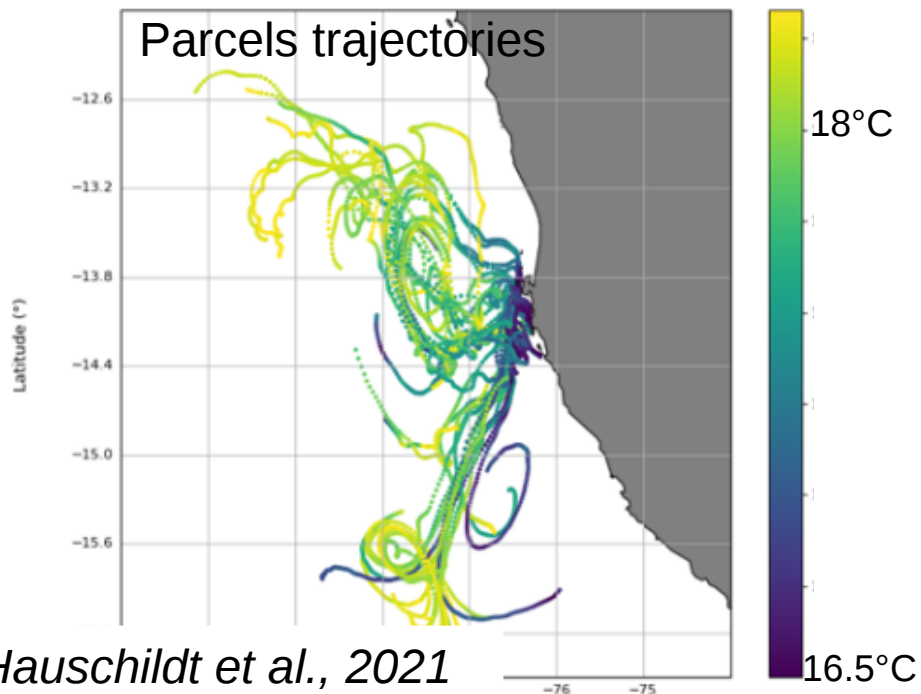
Lagrangian approach (ROMS offline) : what are the characteristics of upwelled water parcels ?



**Subducted parcels** = upwelled into the mixed layer and then leave the mixed layer



Parcels trajectories





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# Modelling the dissolved oxygen cycle on the Senegalese shelf: physical and biogeochemical processes, and Lagrangian analyses

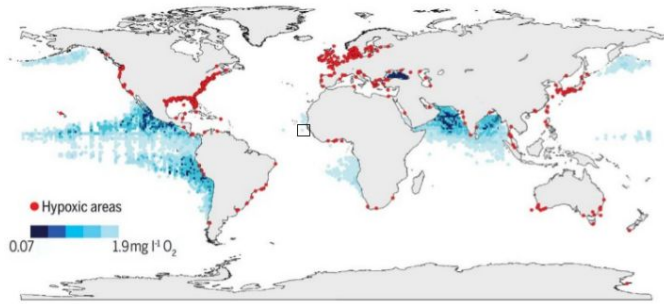
— Abdoul Wahab Tall, Vincent Echevin, —  
Eric Machu and Xavier Capet

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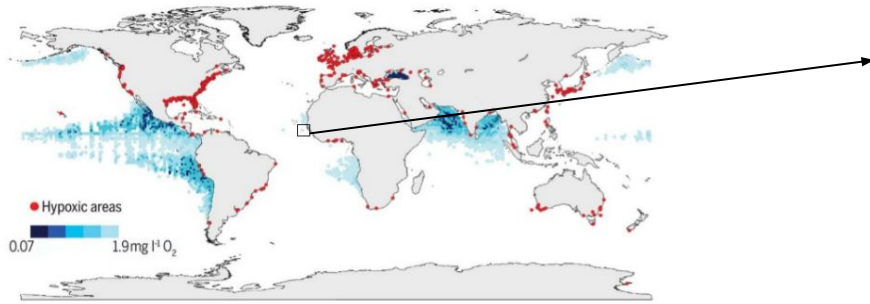
# Why study dissolved oxygen (DO) in the Senegalese shelf ?

Deoxygenation trends  
(Breitburg et al., 2018)

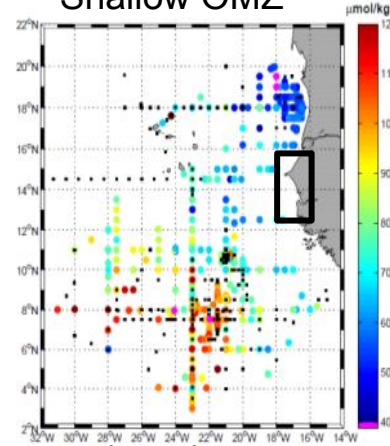


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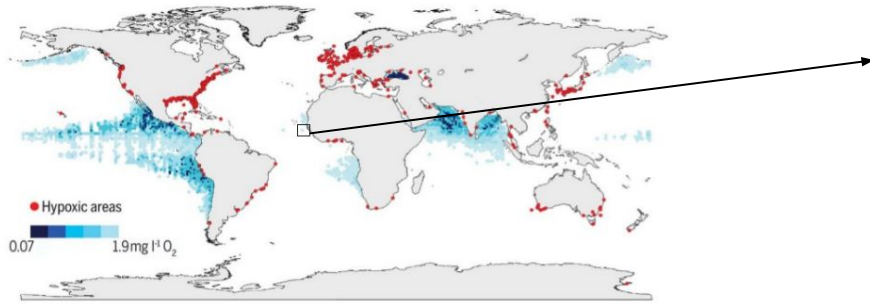
Shallow OMZ



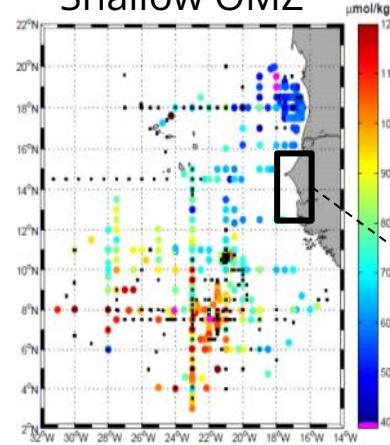
Brandt et al. (2015)

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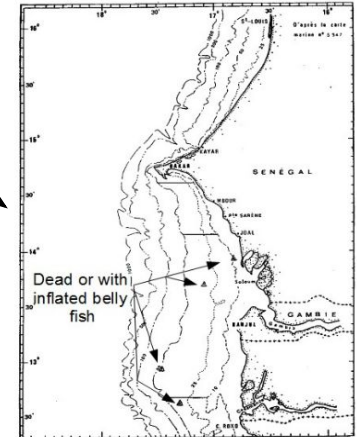
Shallow OMZ



Brandt et al. (2015)

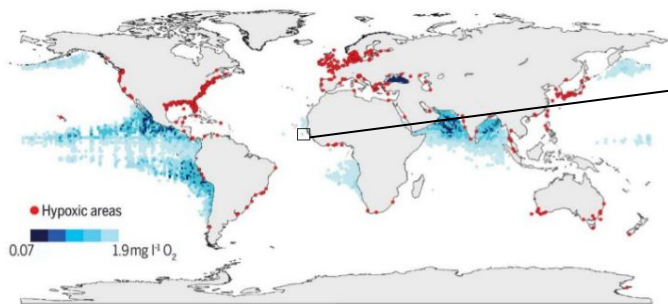
Serranidae (fish) mortality  
attributed to low oxygen  
concentrations

(Caverivière & Touré, 1990)

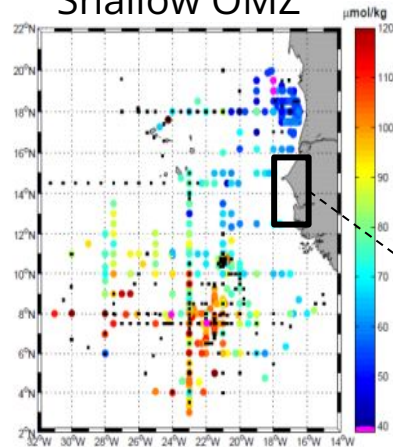


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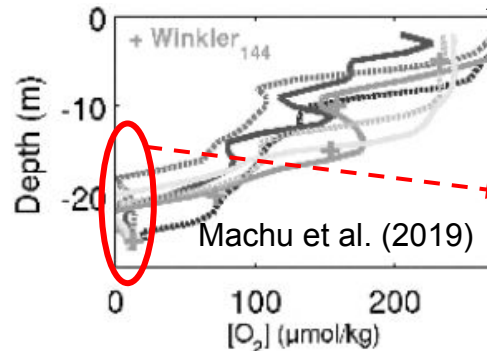
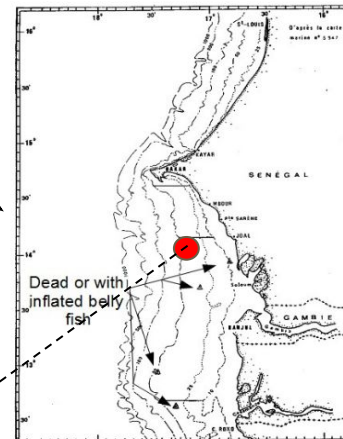
Shallow OMZ



Brandt et al. (2015)

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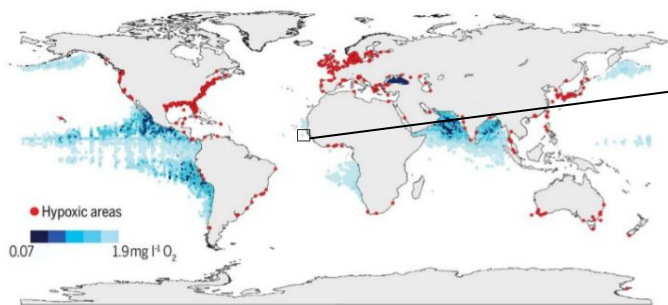
(Caverivière & Touré, 1990)



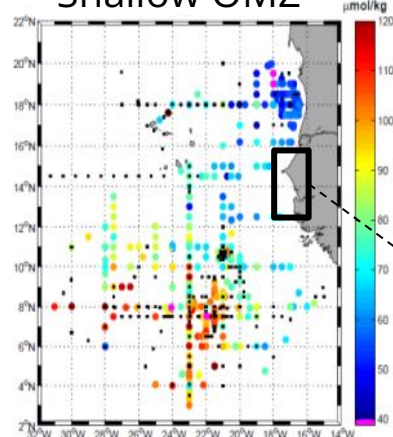
First measurement of anoxia over the Senegalese shelf during upwelling season (March 2012)

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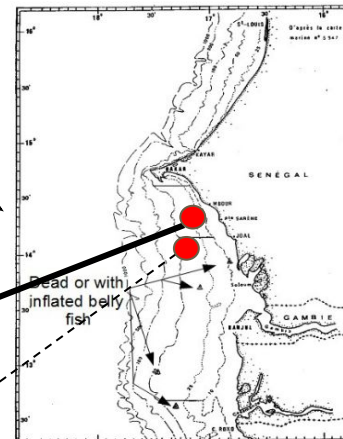
Shallow OMZ



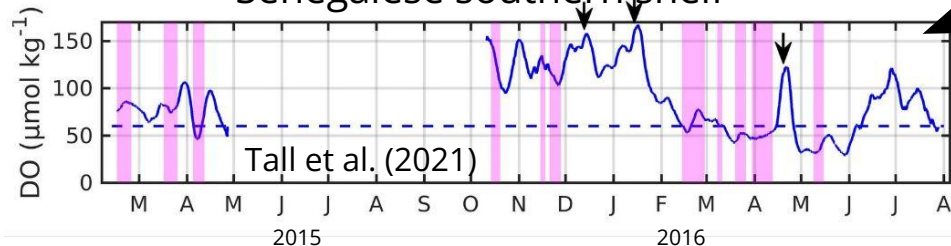
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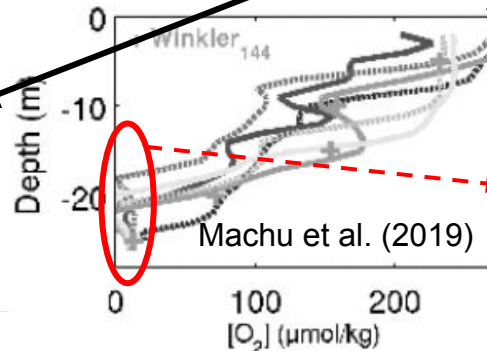
(Caverivière & Touré, 1990)



DO times series at the bottom layer over  
Senegalese southern shelf



Tall et al. (2021)

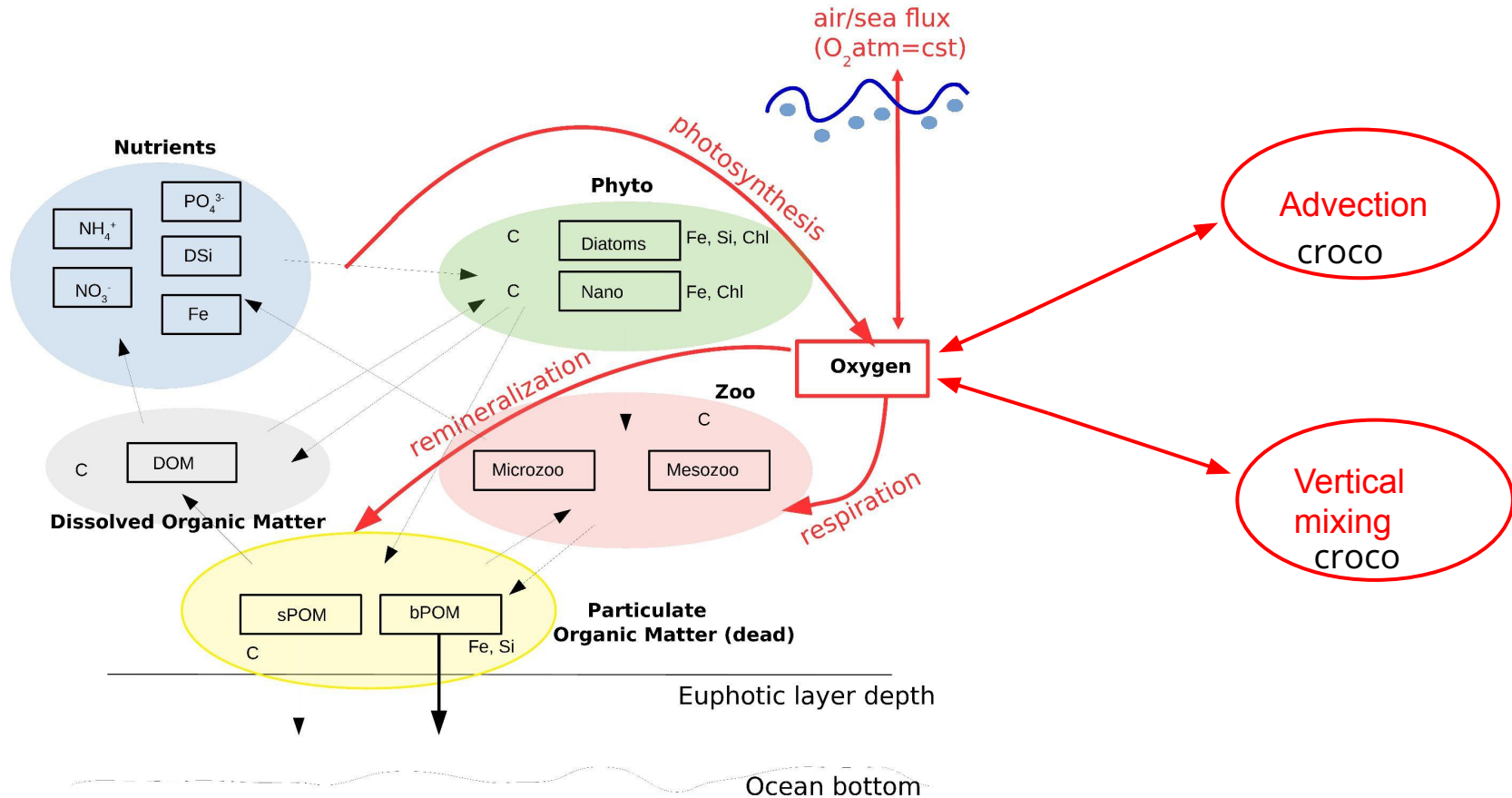


First measurement of  
anoxia over the  
Senegalese shelf  
during upwelling  
season (March 2012)

Study bottom DO variability during the upwelling season  
over the Senegalese shelf using a regional model:

- Understand the role of the physical and biogeochemical processes  
controlling the DO budget
- Study the characteristics of the upwelled source waters  
using a Lagrangian approach

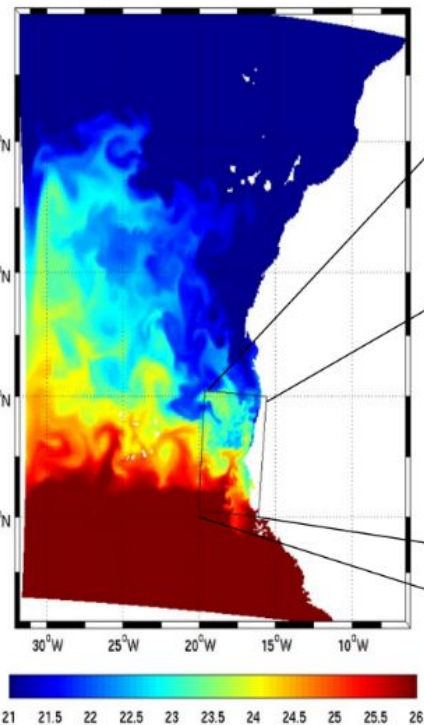
# Modelling the DO cycle : CROCO-PISCES model architecture





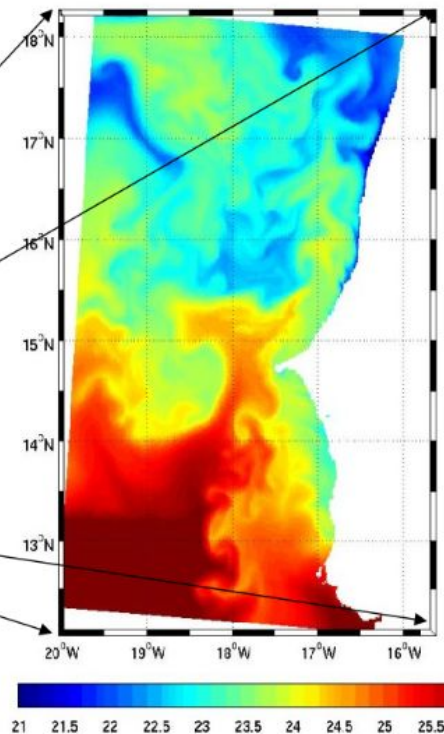
# modelling the DO cycle : CROCO-PISCES model characteristics

CAN 10



10 km, 50 vertical levels,  
225x290 grid points

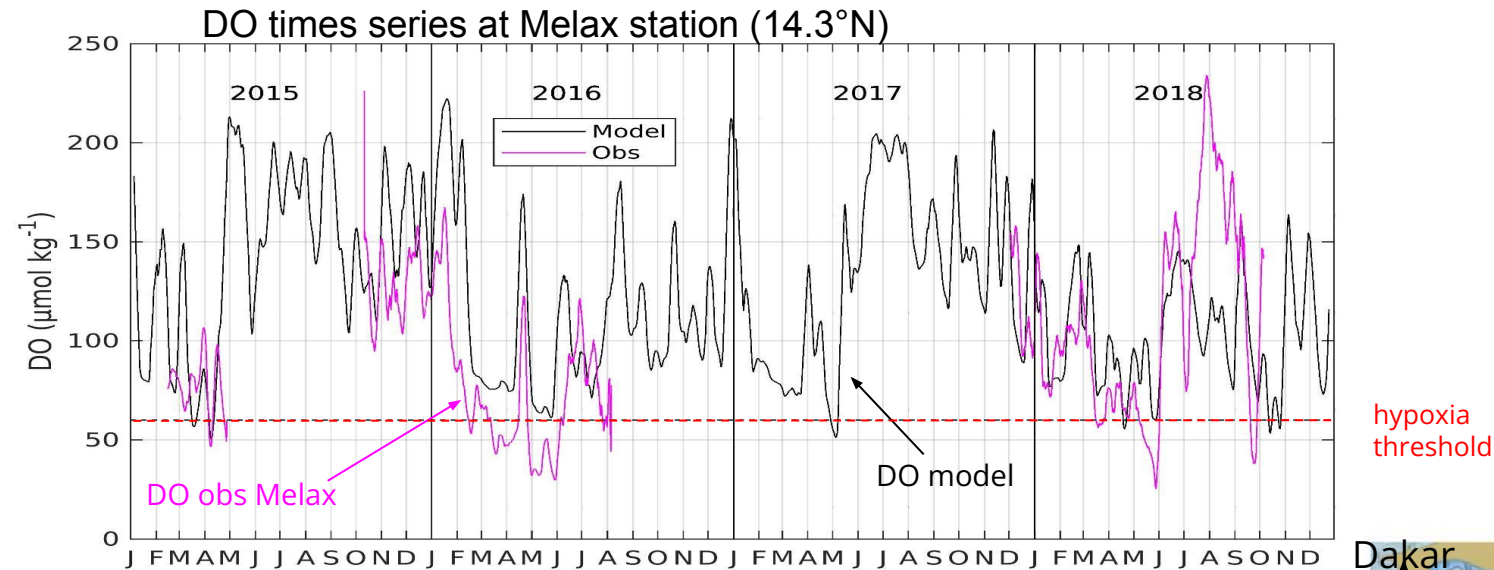
SEN 2



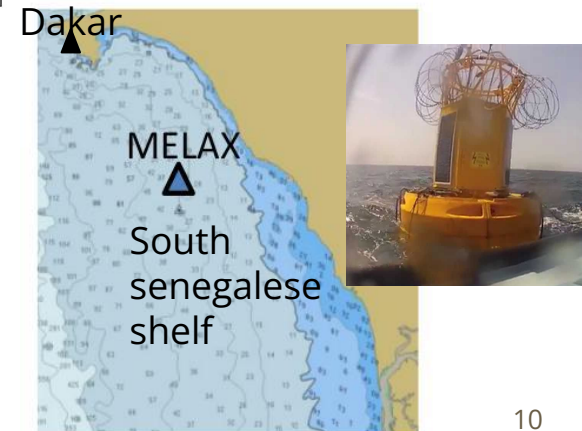
2 km, 50 vertical levels,  
201x302 grid points

- Forcings:
  - ASCAT wind stress (daily, 2014-19)
  - Climatological heat/freshwater fluxes (COADS)
  - PISCES: dust deposition (Iron) climato
- Initial/Boundary Conditions :
  - Mercator (1/12°)
  - PISCES: WOA, GLODAP
- BGC model PISCES:
  - Oxygen budget
  - BGC diagnostics (Primary production, export,...)

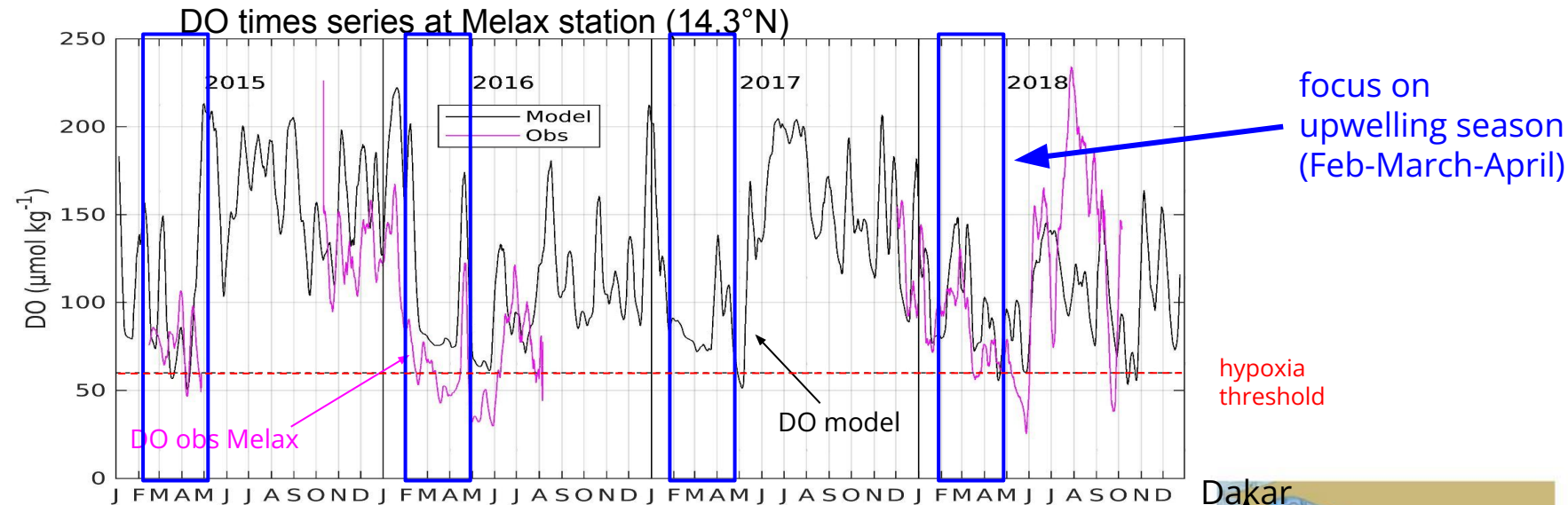
# DO Budget : CROCO-PISCES model validation



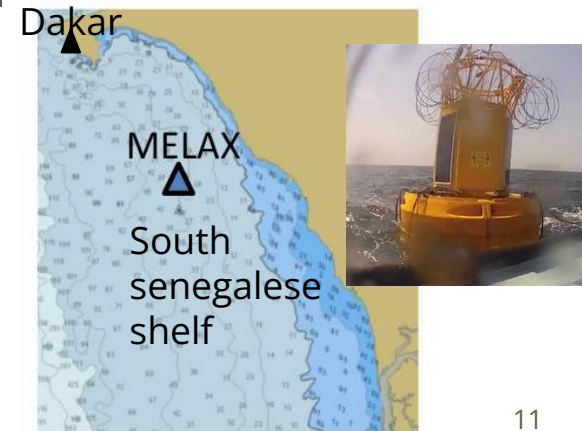
- Seasonal variability with low DO during upwelling season
- Strong intra-seasonal fluctuations related to synoptic wind events
- DO occasionally below hypoxic threshold
- Good match between modelled and observed DO



# DO Budget : CROCO-PISCES model validation



- Seasonal variability with low DO during upwelling season
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# DO Budget : Physical and biogeochemical processes

Average over upwelling season (Feb-Mar-Apr=FMA)

$$\frac{\partial O_2}{\partial t} =$$

Biological sources and sinks

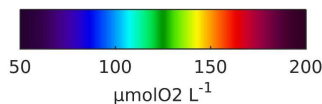
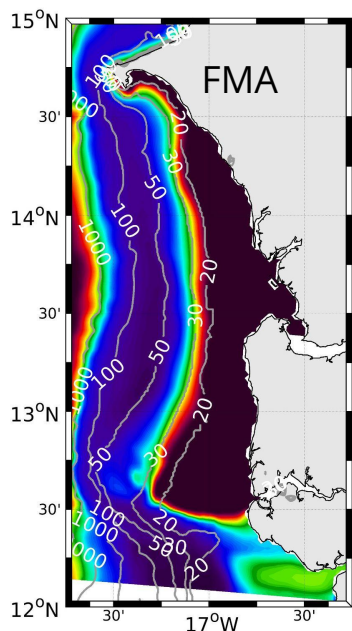
$$\left( \frac{\partial O_2}{\partial t} \right)_{Bio}$$

Dynamical transport

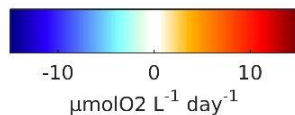
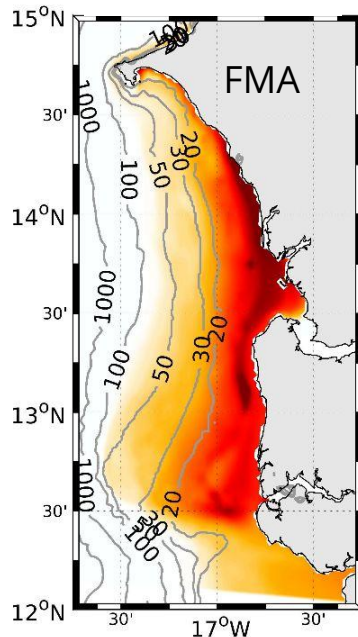
$$\left( \frac{\partial O_2}{\partial t} \right)_{Dyn}$$

+

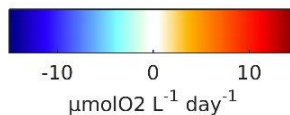
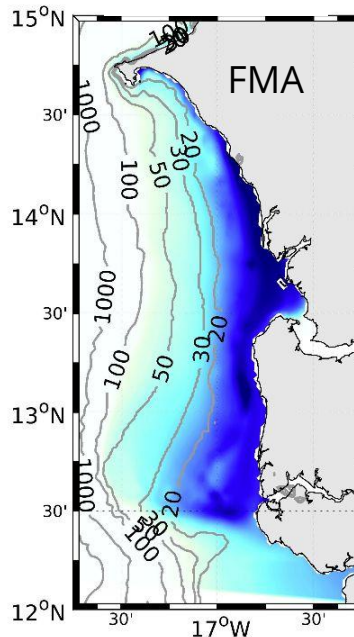
Bottom DO



Dynamical



Biological



Biological sources and sinks

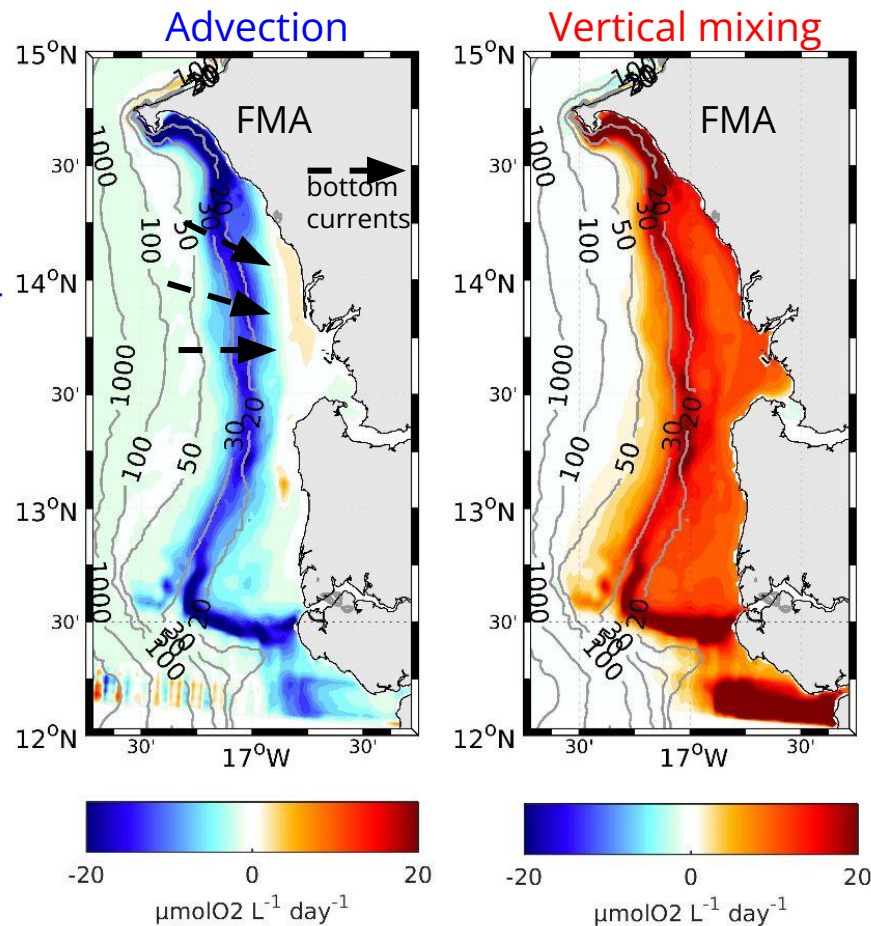
Dynamical transport

- DO: strong cross-shelf gradient
- Dynamical = source of DO
- BGC = sink of DO

# Oxygen Budget : focus on physical processes

$$\left(\frac{\partial O_2}{\partial t}\right)_{Dyn} = \underbrace{-u_H \nabla_H O_2}_{\text{Horiz. advection}} + \underbrace{-w \nabla_z O_2}_{\text{Vert. advection}} + \underbrace{\frac{\partial K_z \partial O_2}{\partial z^2}}_{\text{Vert. mixing}}$$

- Transport of poorly oxygenated water by the onshore currents on the shelf
- Maximum advection due to strong DO gradient near 20-30 m isobaths
- Ventilation of the bottom layer by vertical mixing of surface oxygenated water and low DO bottom water



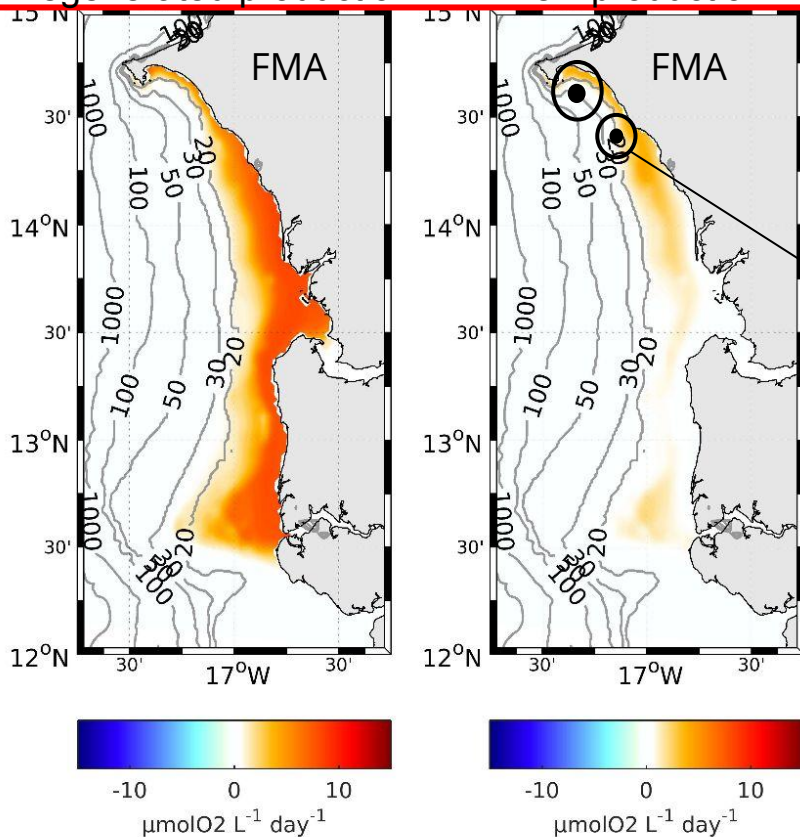


# Oxygen Budget : focus on biogeochemical processes

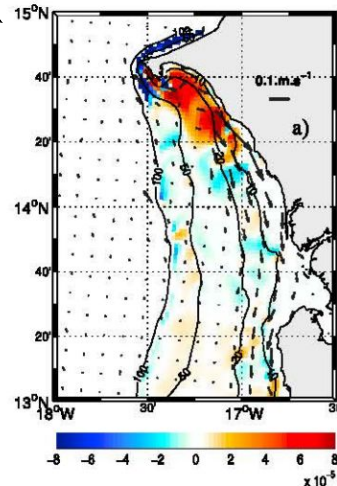
Photosynthesis  $\Rightarrow$  sources

Regenerated production

New production



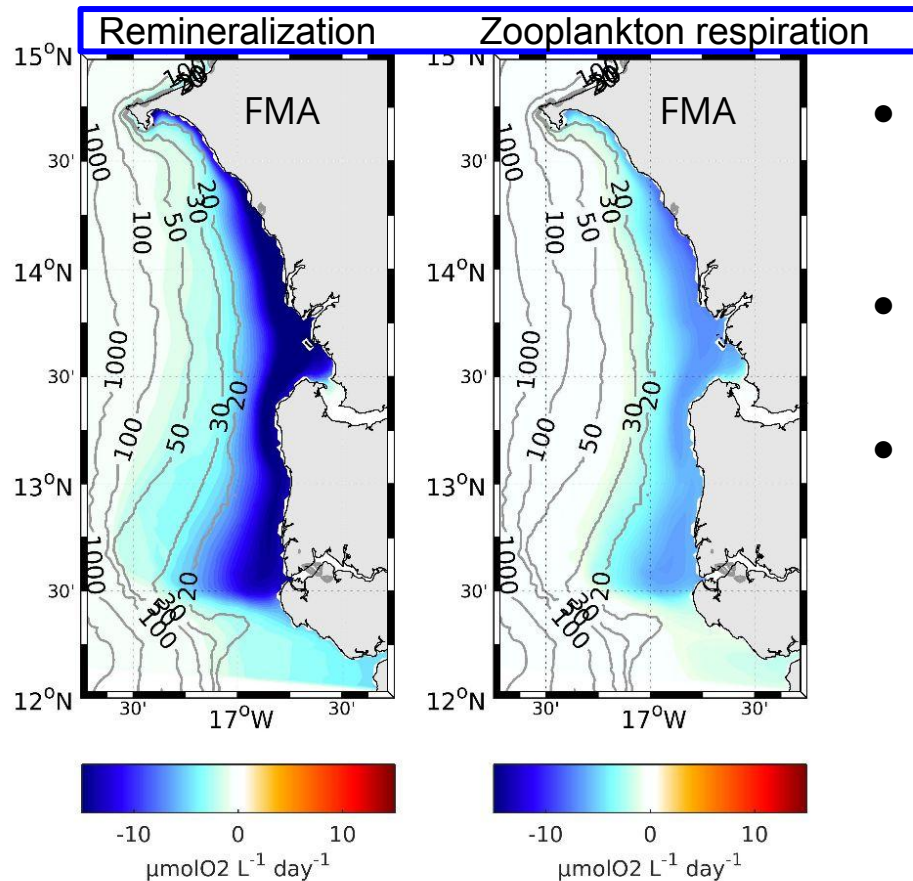
- Regenerated production significantly higher than new production over entire shelf
- New production strong in the north where the upwelling of subsurface nitrate is located



Near-bottom vertical velocity during upwelling season (Ndoye et al., 2017 using the same model)

# Oxygen Budget : focus on biogeochemical processes

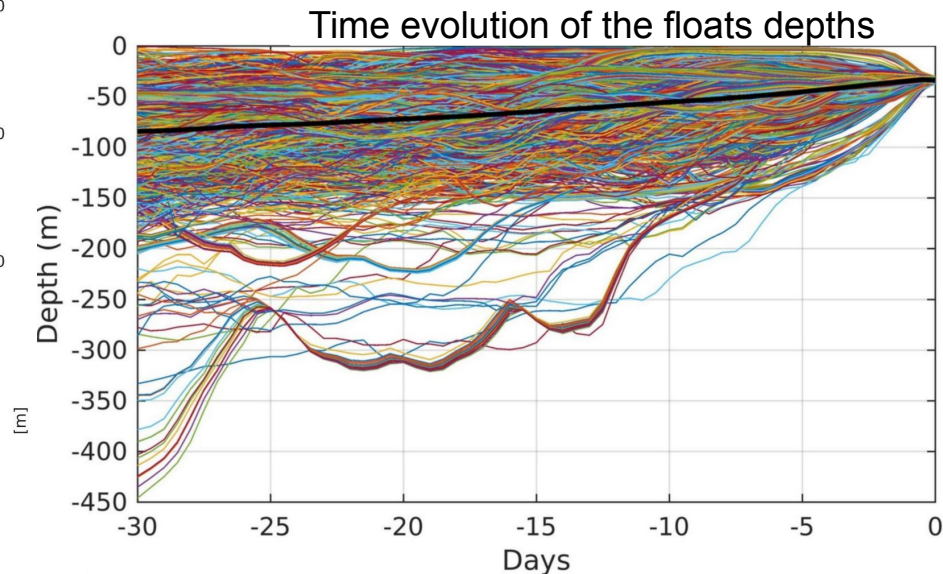
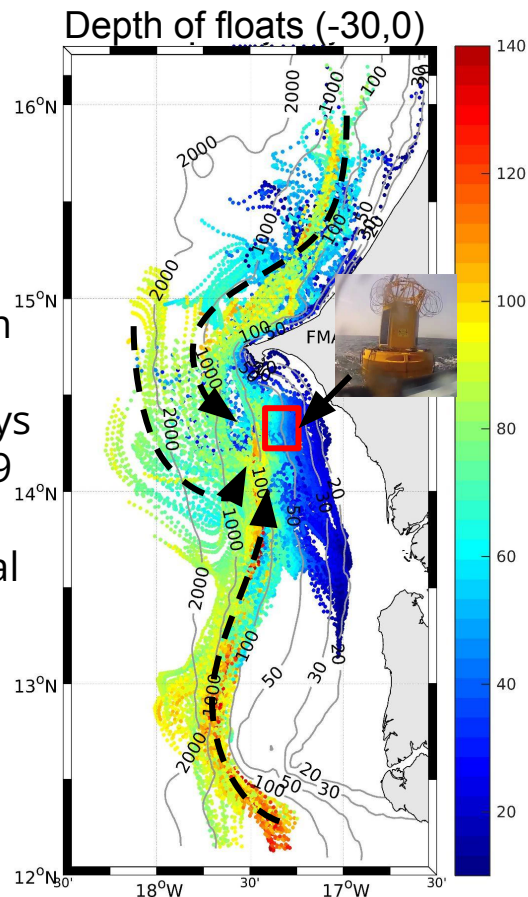
## Sinks



- DO BGC consumption = OM remineralization, which largely compensates production by photosynthesis
- Zooplankton (microzoo + mesozoo) respiration levels lower than OM remineralization
- Mesozooplankton respiration dominates microzooplankton respiration.

# Analysis of the water masses reaching the shelf : methodology

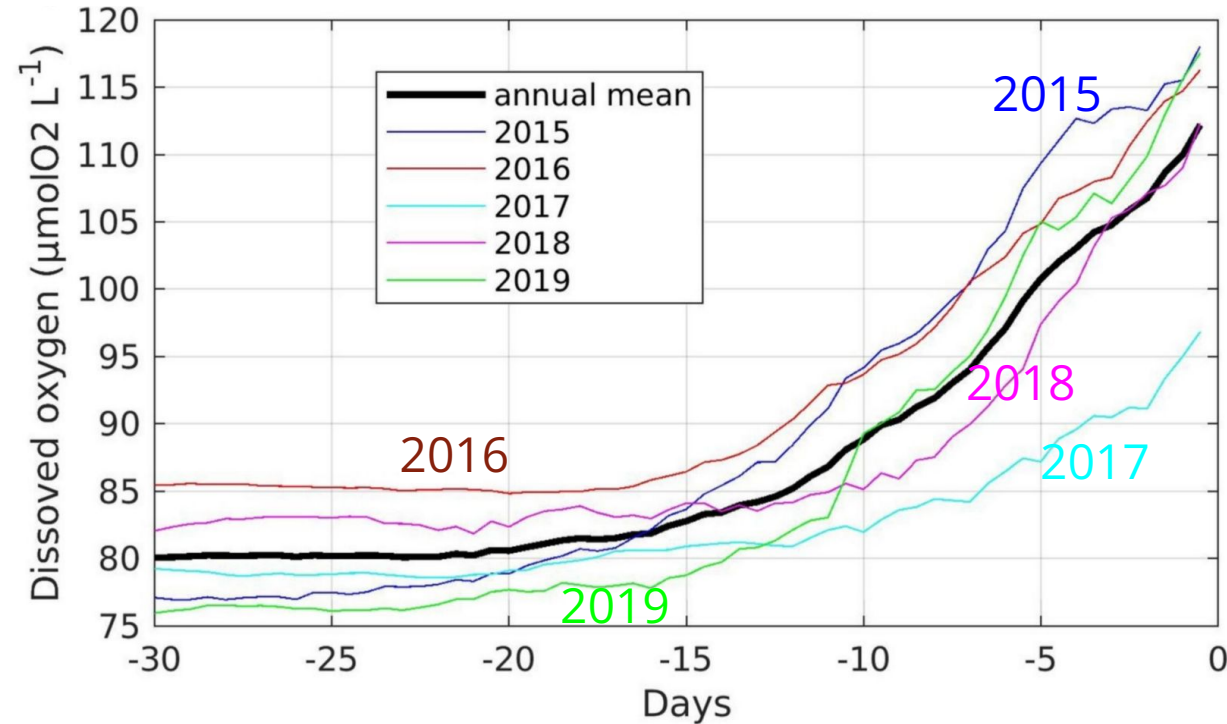
- floats transported backwards in time for 30 days
- 500 floats released between 30 & 40 m around Melax station, every 5 days (Feb-April), 2015-19
- 45000 floats in total
- DO, depth, vertical mixing, BGC terms registered along each trajectory





# Lagrangian analysis : interannual variability

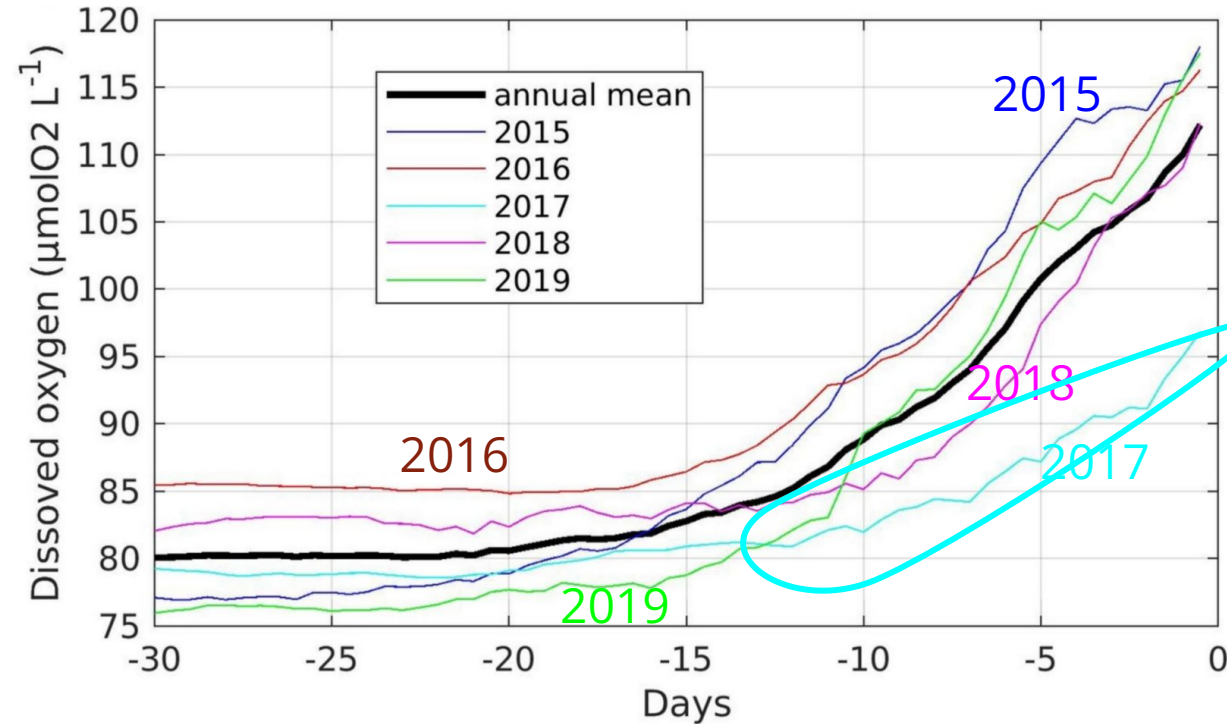
Interannual variability of DO along the pathway



- Increase of DO during one month
- weak change during the first 15 days
- Strong change during the last 15 days

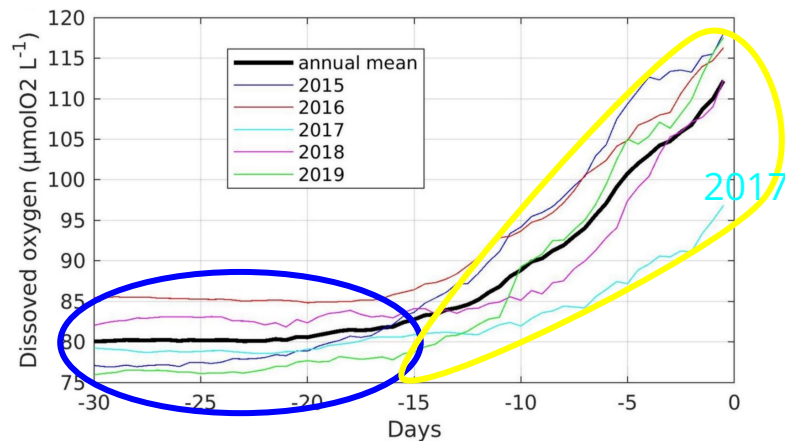
# Lagrangian analysis : interannual variability

Interannual variability of DO along the pathway

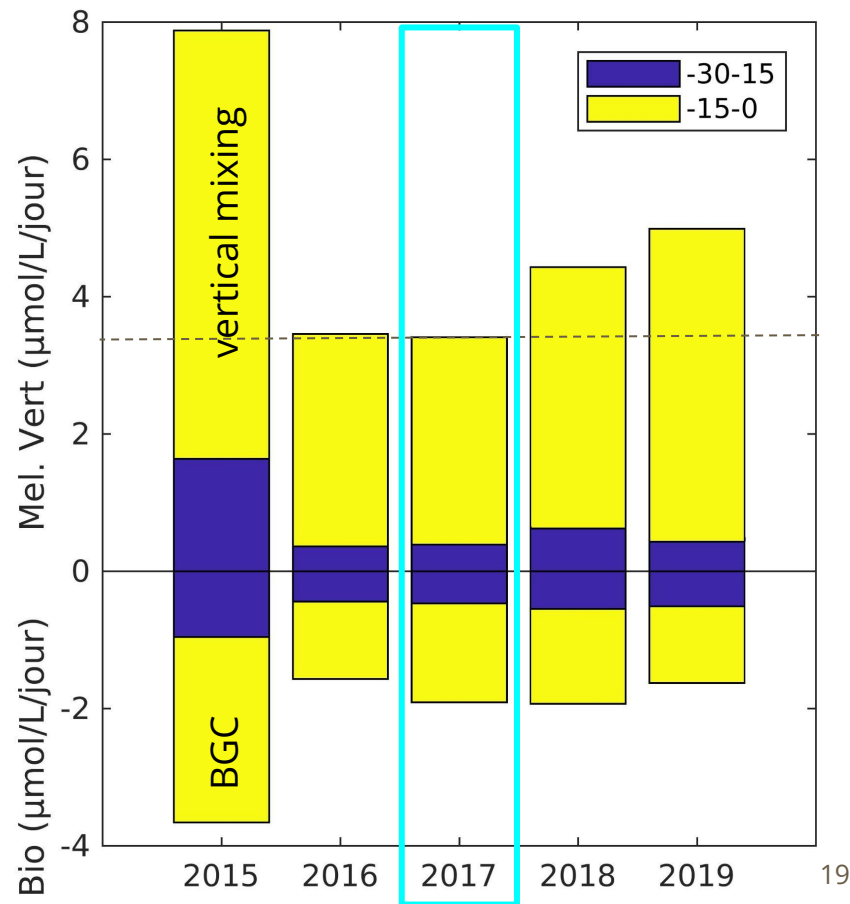


- Strong interannual variability
- Lower DO in 2017 in last 15 days
- Why ?

# Langrangian analysis : why 2017 is more deoxygenated ?



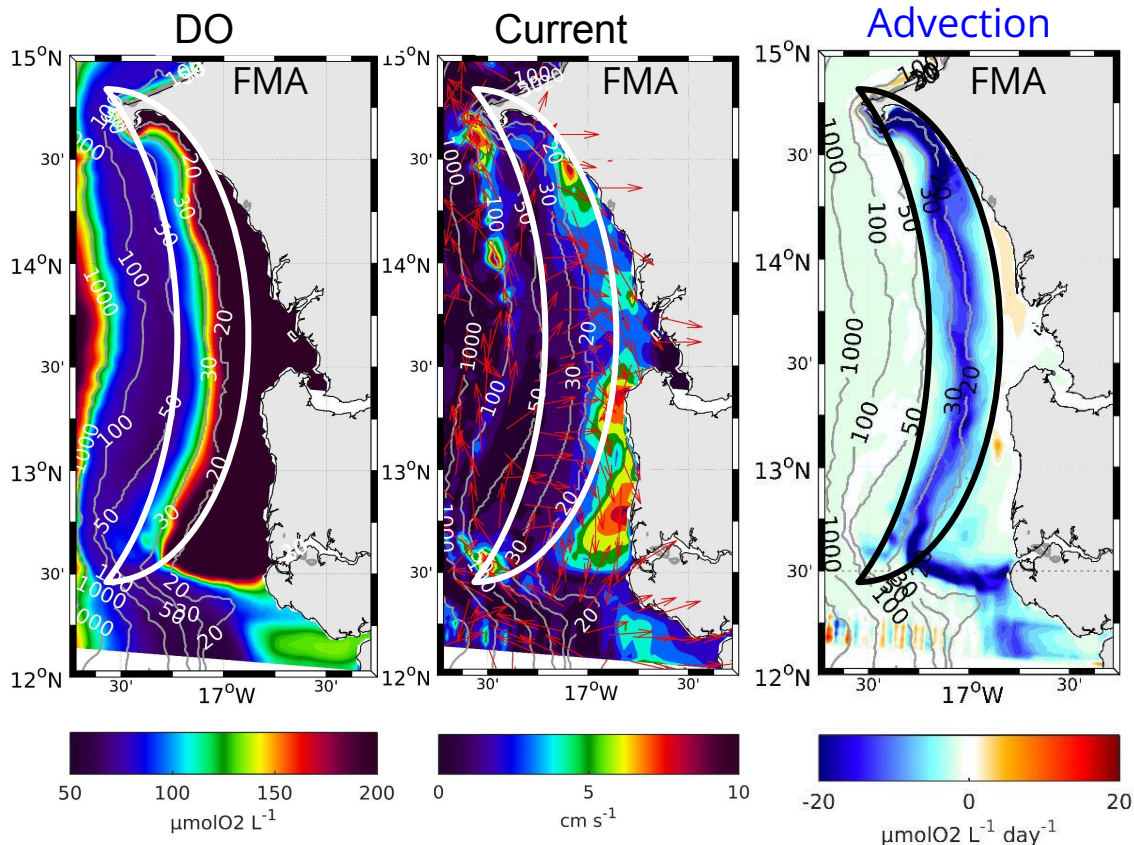
- Low DO supply by vertical mixing in 2017 and 2016
- Low DO consumption by BGC in 2016
- Very strong mixing and consumption in 2015 because of shallow source waters



## Conclusions

- Physics brings DO and biology consumes DO in the bottom layer on the continental shelf during the upwelling season
- Advection decreases DO by transporting low DO subsurface water onto the shelf
- Vertical mixing ventilates the bottom layer
- Consumption of DO by remineralization of organic matter strongly compensates production of DO by photosynthesis in the bottom layer
- The source waters show high interannual variability, with the lowest oxygen levels encountered in 2017 associated with reduced vertical mixing

# Oxygen Budget : focus on physical processes (total advection)

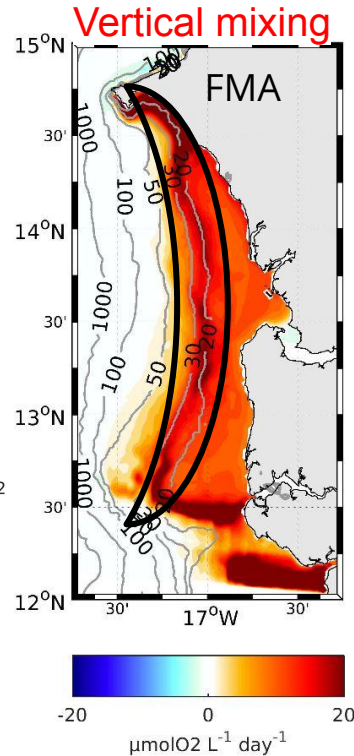
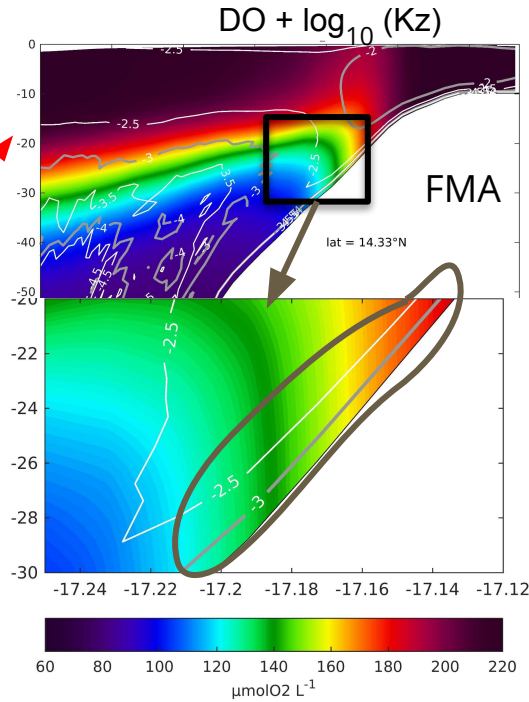
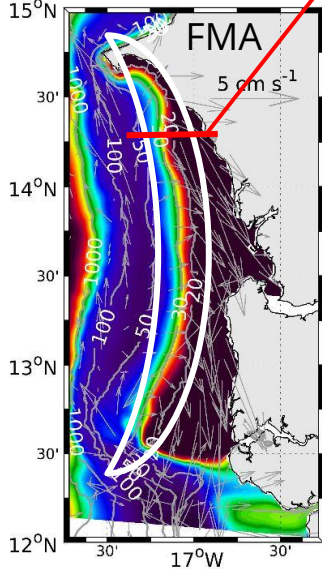


- Currents flow towards the coast
- Low DO deep waters transported on the shelf
- Strong horizontal DO gradient between 20-30 m isobaths
- Maximum advection near 20-30 m isobaths

# Oxygen Budget : focus on physical processes (vertical mixing)

$$\frac{\partial K_z \partial O_2}{\partial z^2}$$

vertical mixing  
DO + current



- Strong vertical  $K_z$  gradient between 20-30 m isobaths
- The greater vertical mixing between 20-30 m isobaths is due to a DO influx from the oxygenated layers above by friction on the bottom combined with the strong vertical gradient.



# characteristics of the source waters one month before reaching shelf

