

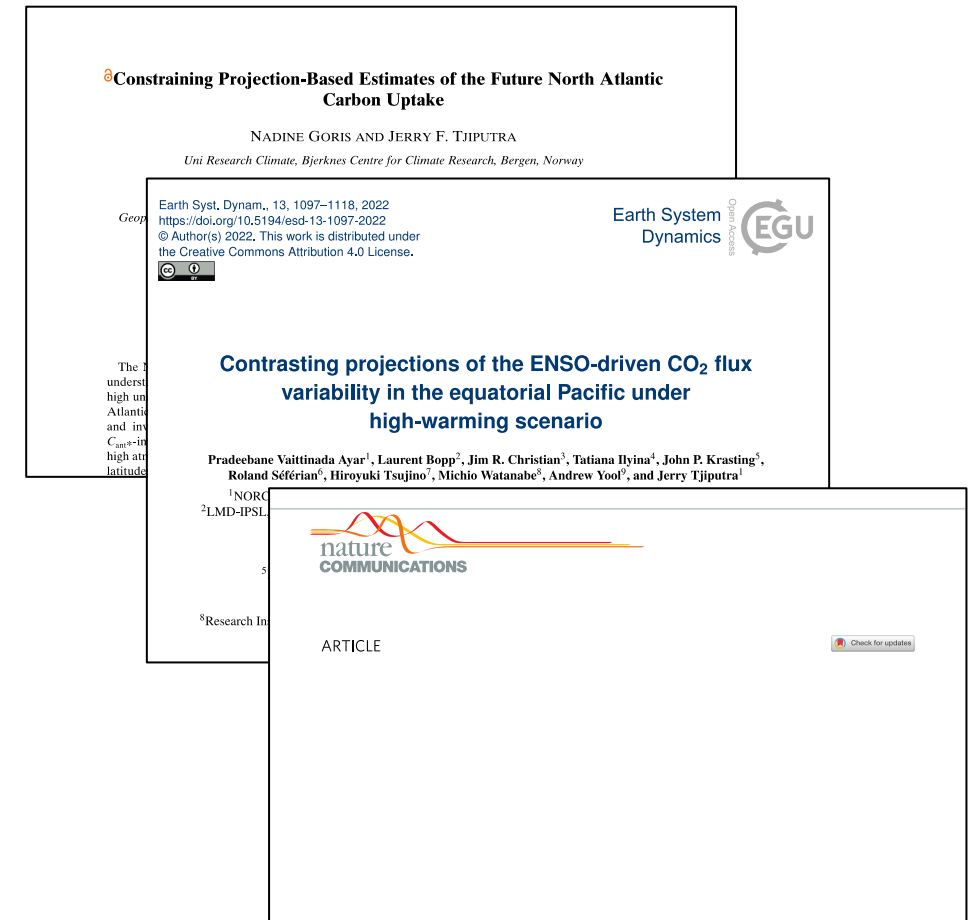


# Constraining the large spread future ocean carbon sinks in ESMs

**Jerry Tjiputra**, Timothee Bourgeois, Nadine Goris, Jörg Schwinger, Pradeebane Vaithinada Ayar

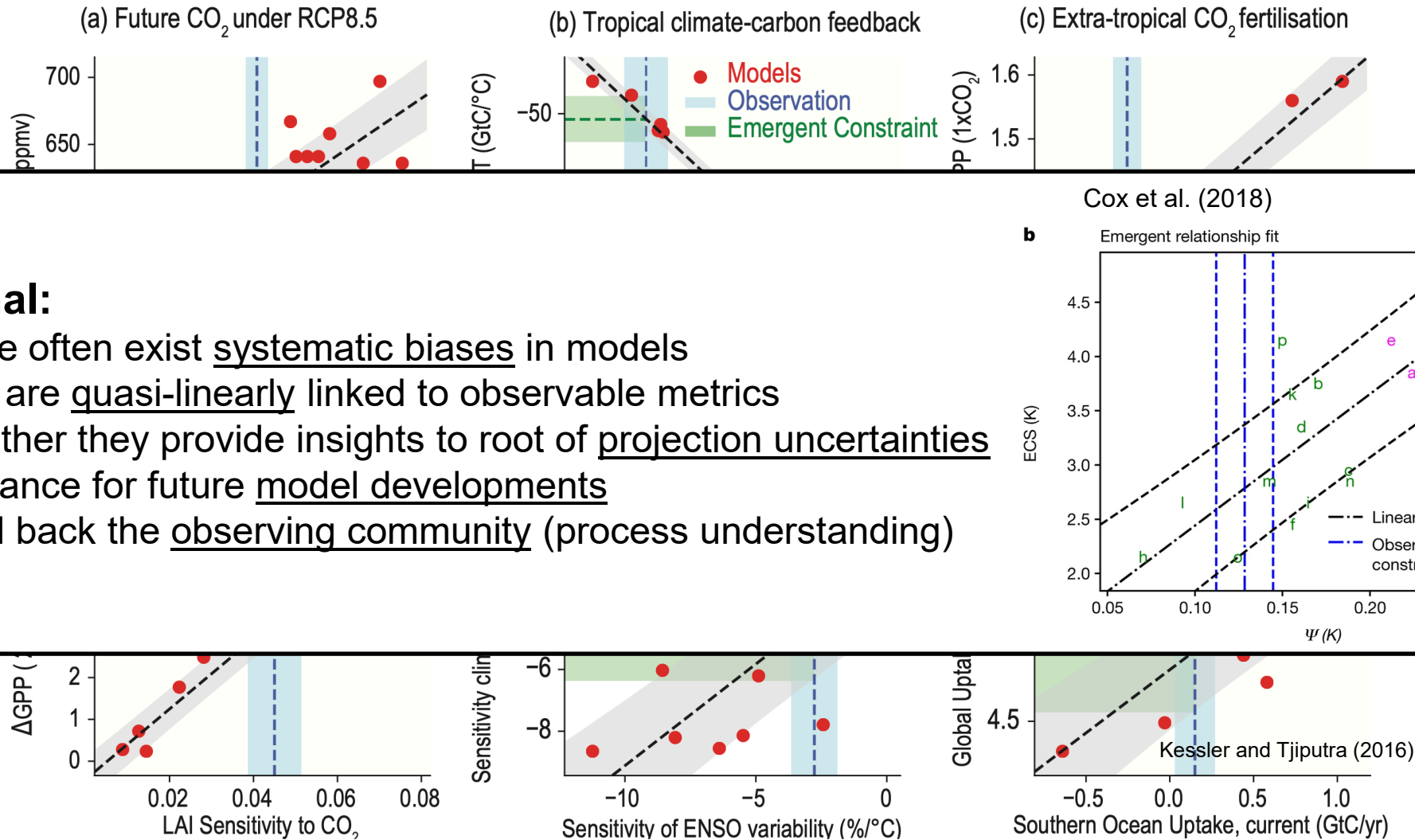
NORCE Norwegian Research Centre, Bjerknes Centre for Climate Research, Bergen, Norway

ECMWF 6<sup>th</sup> WGNE workshop on systematic errors in weather and climate models, Reading, UK





# Emergent Constraint



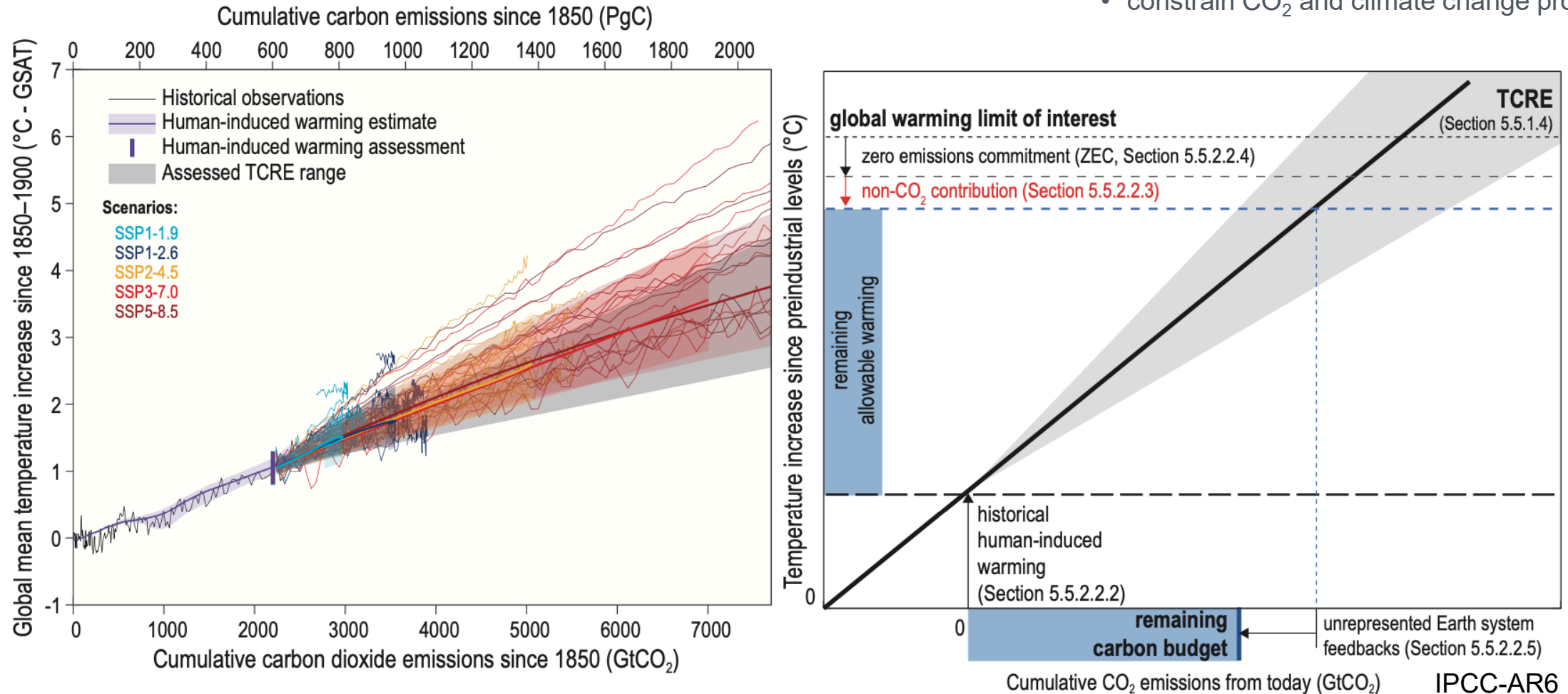
## Rational:

- There often exist systematic biases in models
- That are quasi-linearly linked to observable metrics
- Together they provide insights to root of projection uncertainties
- Guidance for future model developments
- Feed back the observing community (process understanding)

IPCC-AR6



- › Understanding and limiting the spread of ocean carbon sink projections are crucial to
  - effectively guide the development of climate mitigation policies,
    - determine an accurate future carbon budget,
    - constrain CO<sub>2</sub> and climate change projections.





## Fate of anthropogenic CO<sub>2</sub> emissions (2011–2020)



### Sources = Sinks

34.8 GtCO<sub>2</sub>/yr

89%



11%

4.1 GtCO<sub>2</sub>/yr

### Budget Imbalance:

(the difference between estimated sources & sinks)

3%

-1.0 GtCO<sub>2</sub>/yr

18.6 GtCO<sub>2</sub>/yr

48%



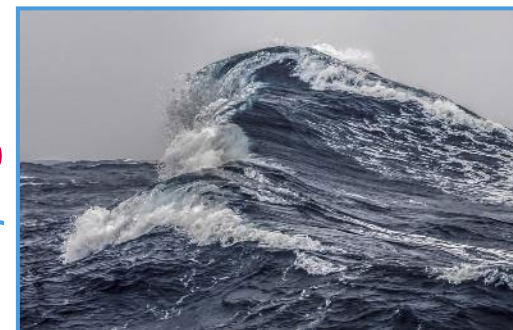
29%

11.2 GtCO<sub>2</sub>/yr



26%

10.2 GtCO<sub>2</sub>/yr



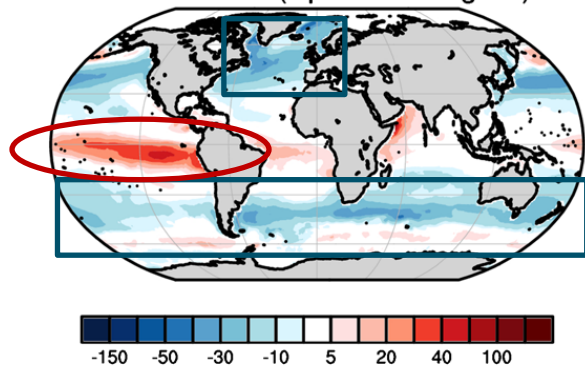
Source: [Friedlingstein et al 2021](#); [Global Carbon Project 2021](#)



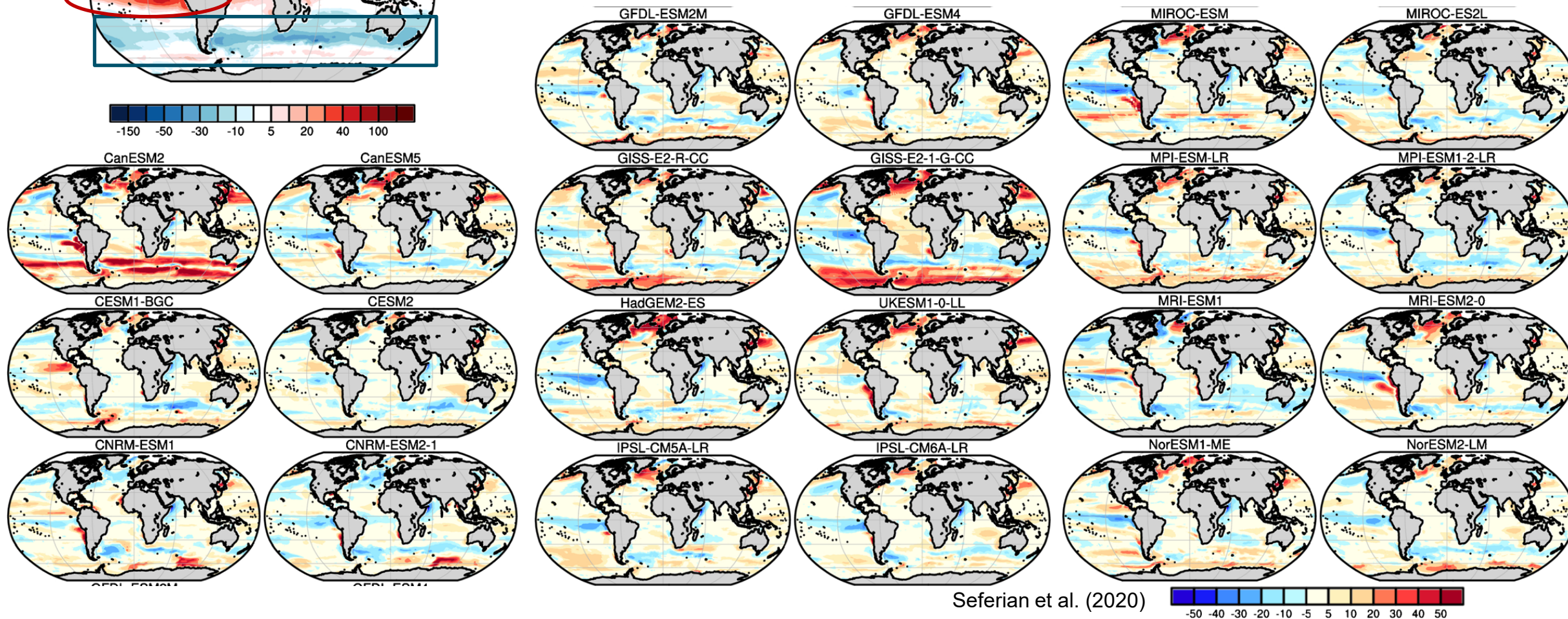


Observations (Open Ocean fgco2)

a

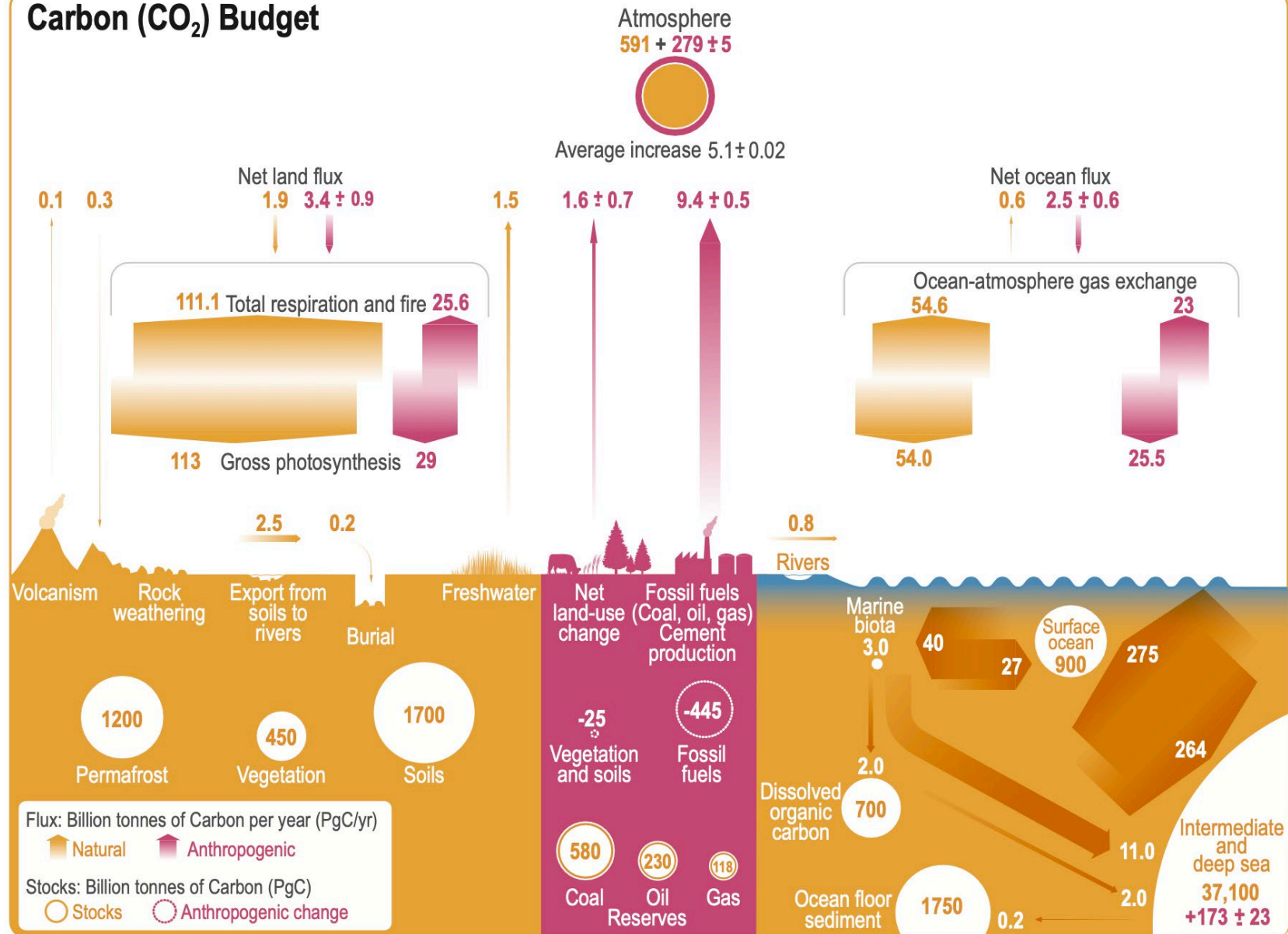


CMIP5/6 Simulated climatology sea-air CO<sub>2</sub> fluxes





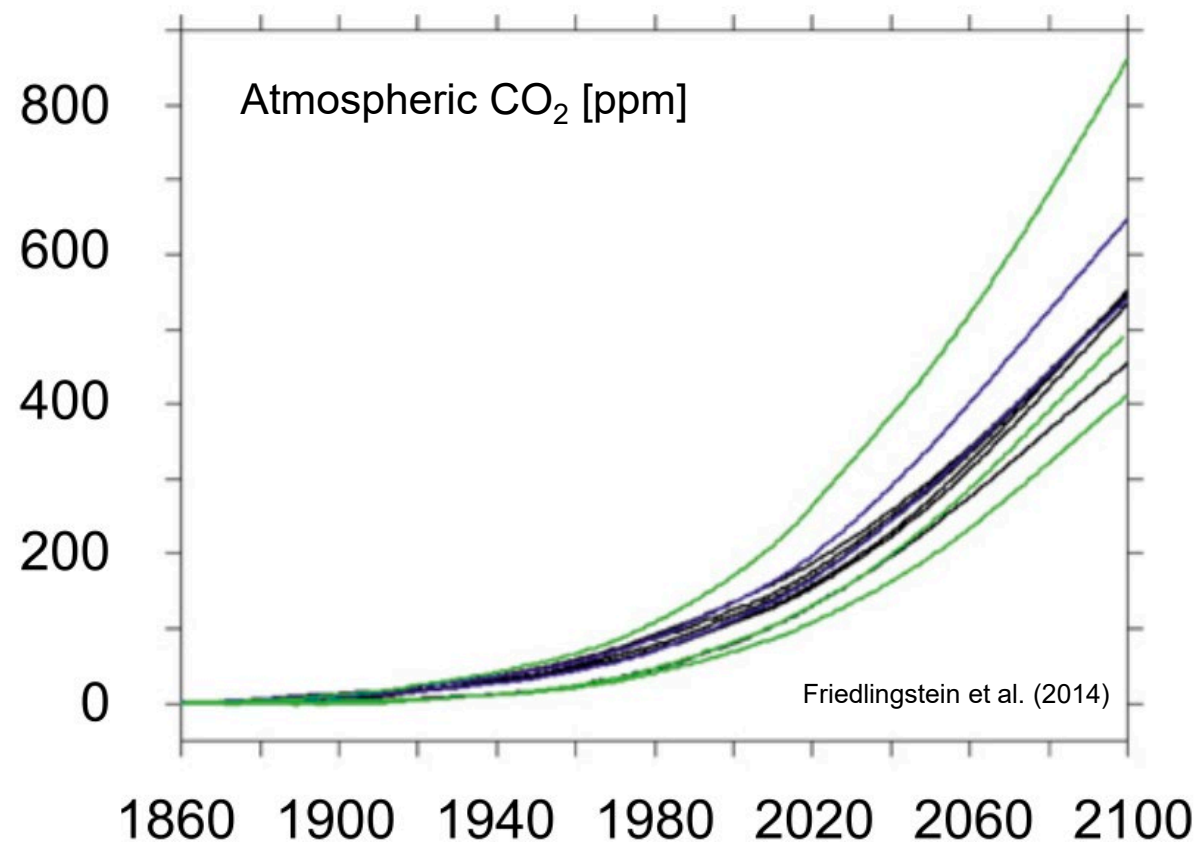
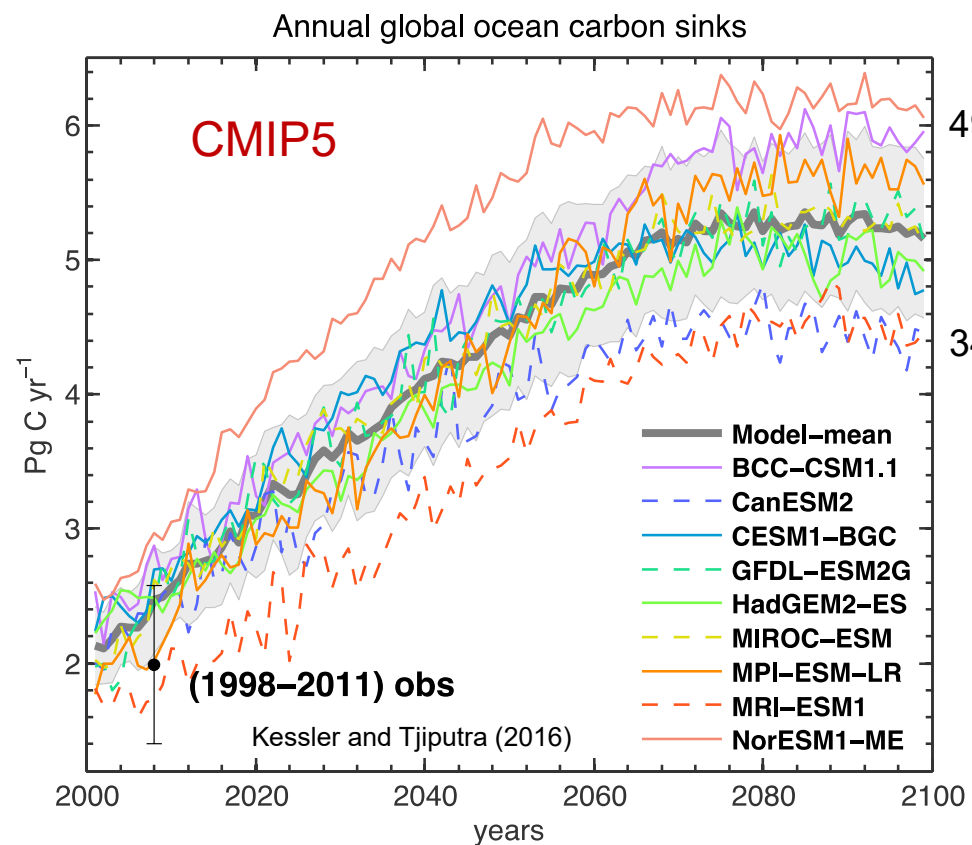
## Carbon (CO<sub>2</sub>) Budget



IPCC-AR6

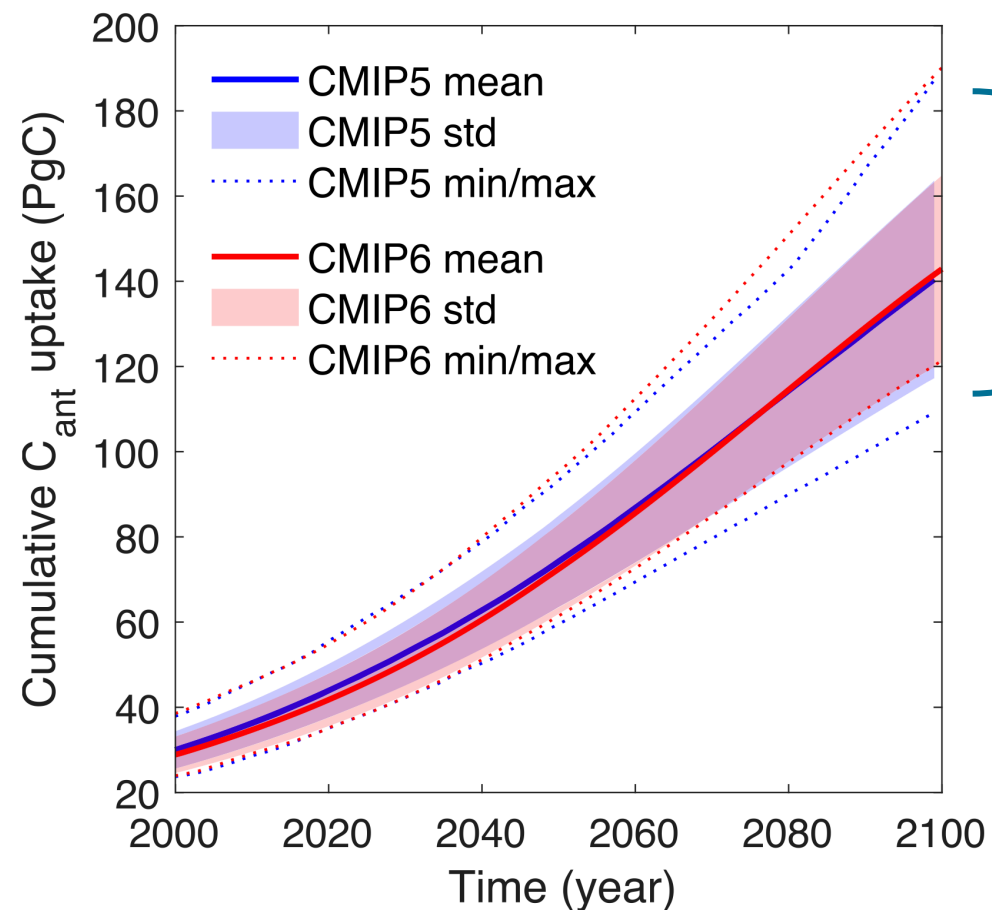


## Projection uncertainty

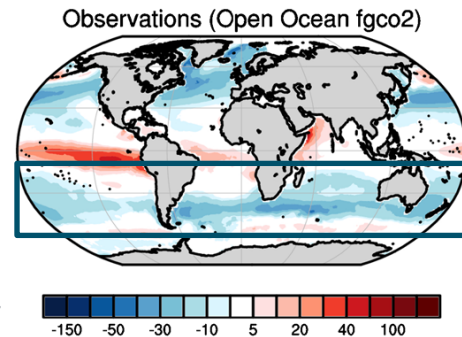




## Southern Ocean

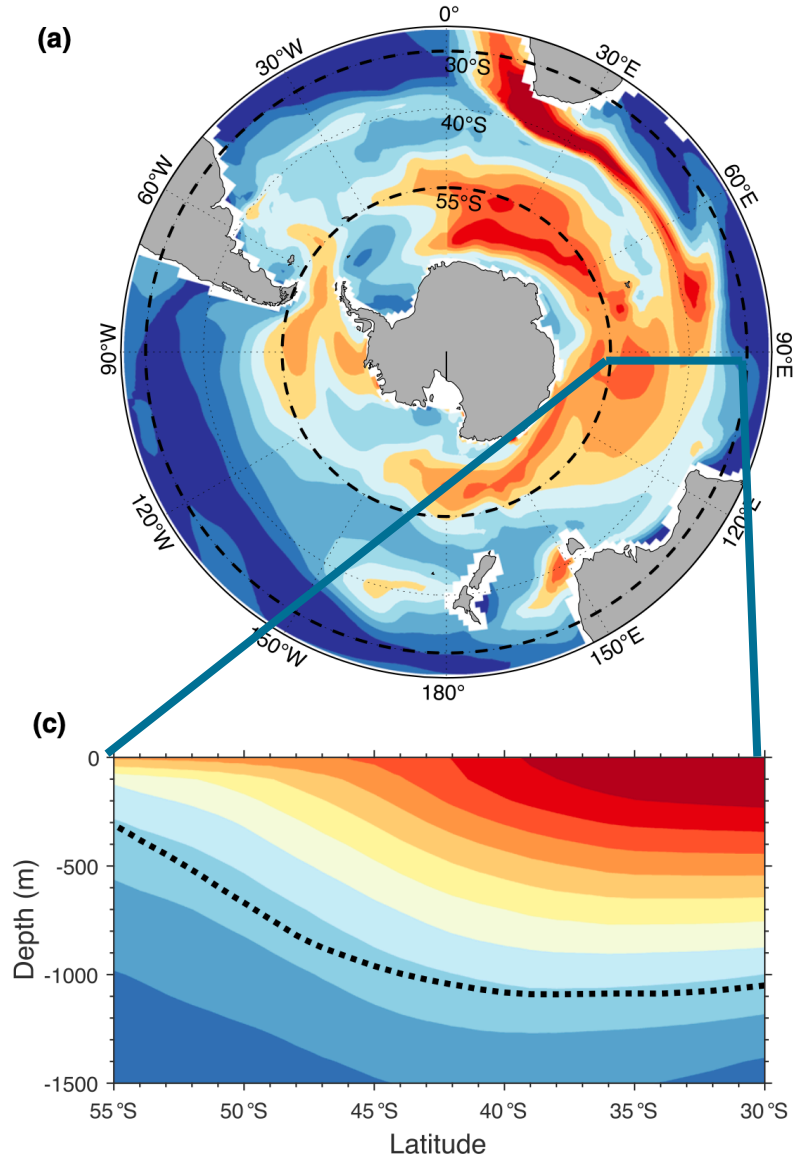


Uncertainty => quadruple by end of the century

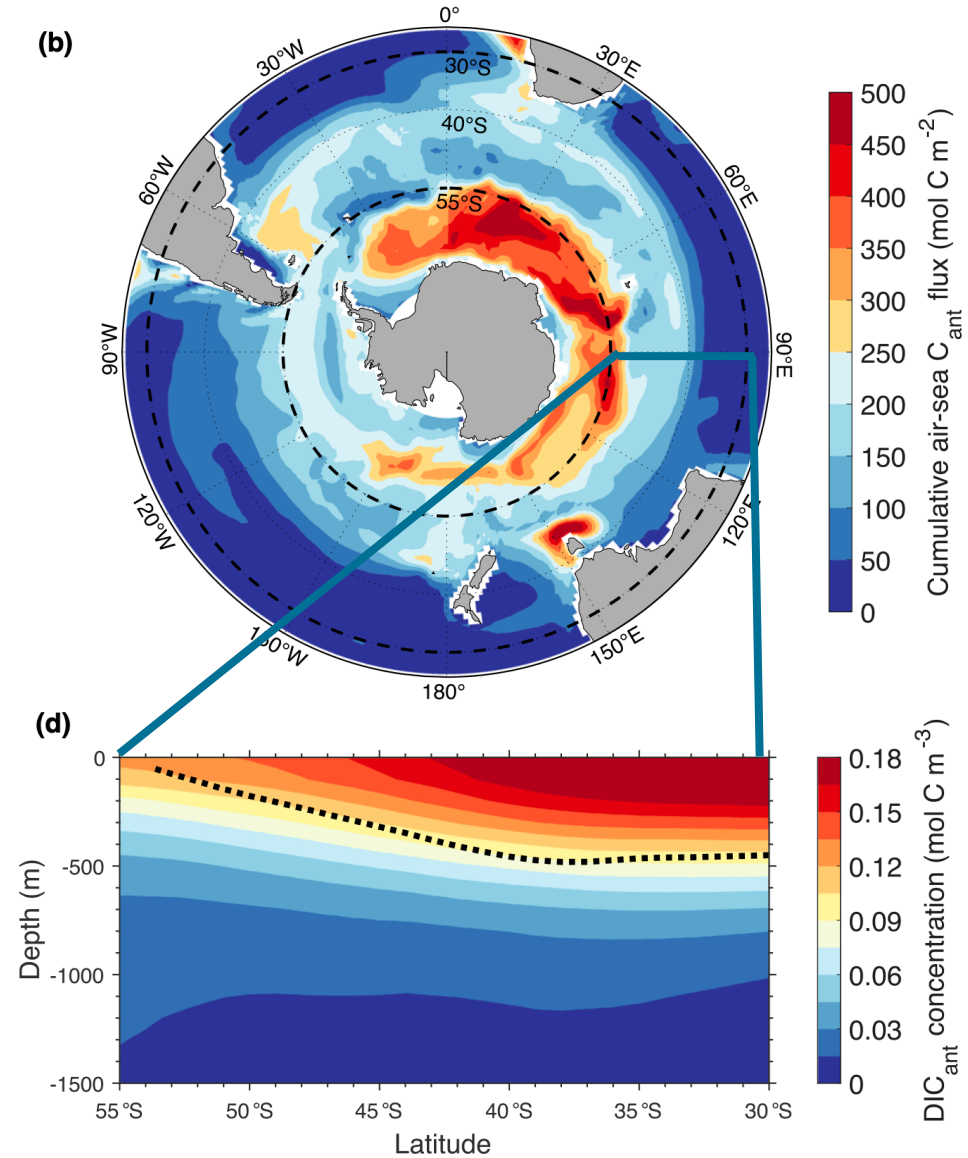




## High-uptake models



## Low-uptake models

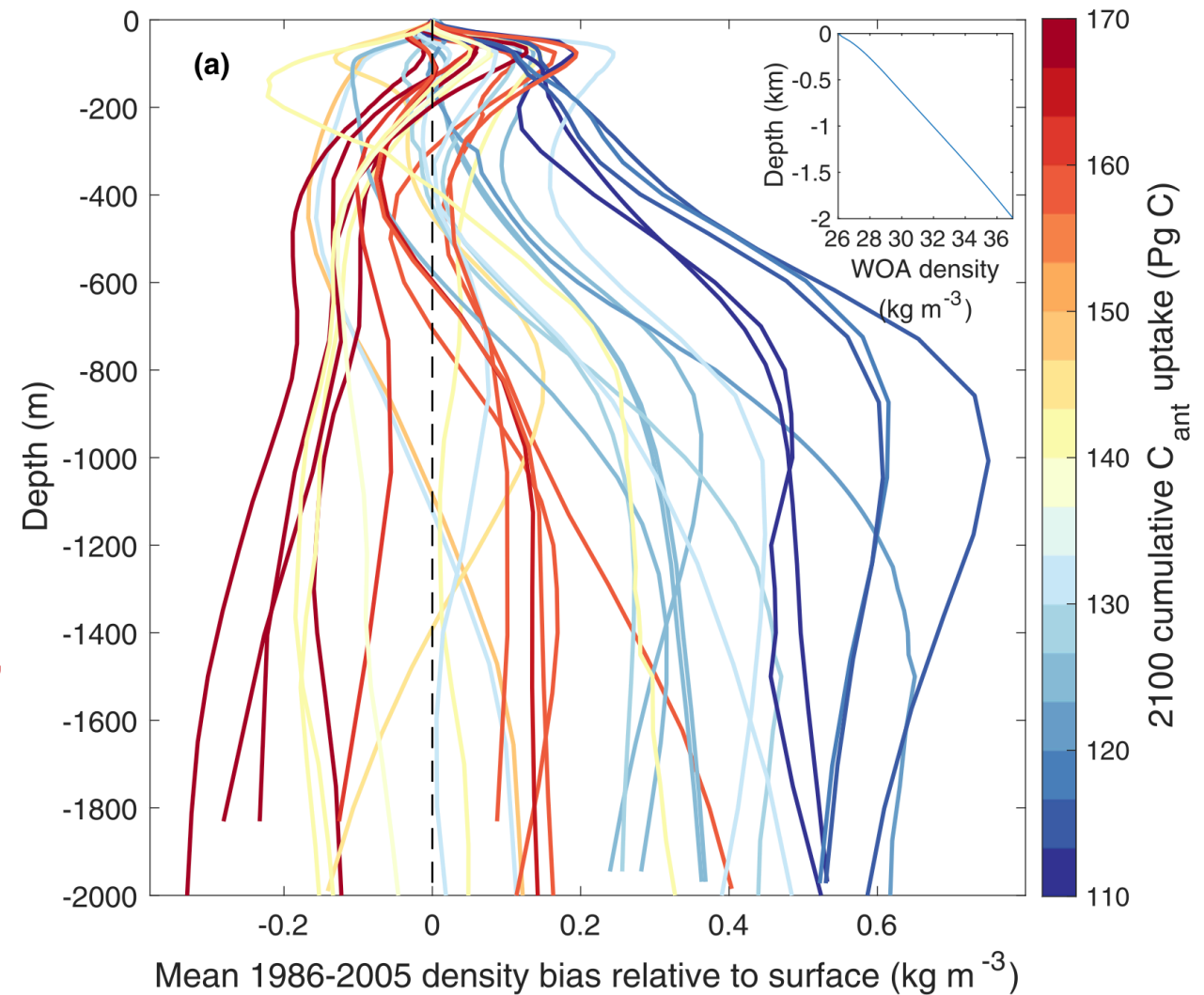


.....  
AAIW depths: density  
isolines crossing the  
depth of the salinity  
minimum at 30°S

Bourgeois et al. (2022)



High-uptake models  Low-uptake models



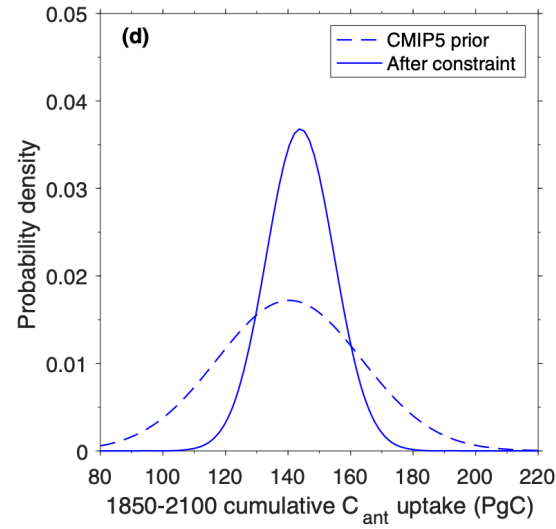
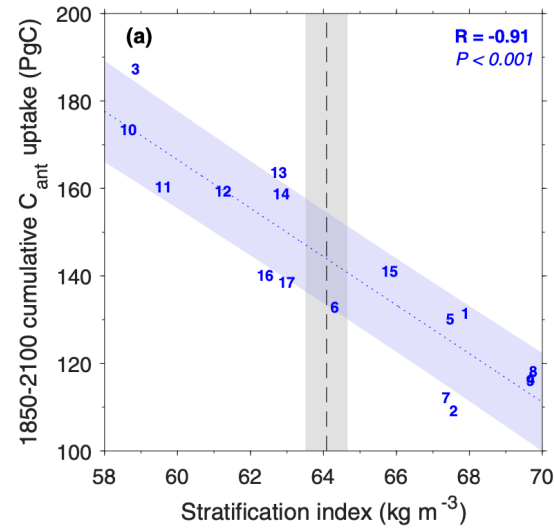
Bias-low at depth,  
less stratified

Bias-high at depth,  
more stratified

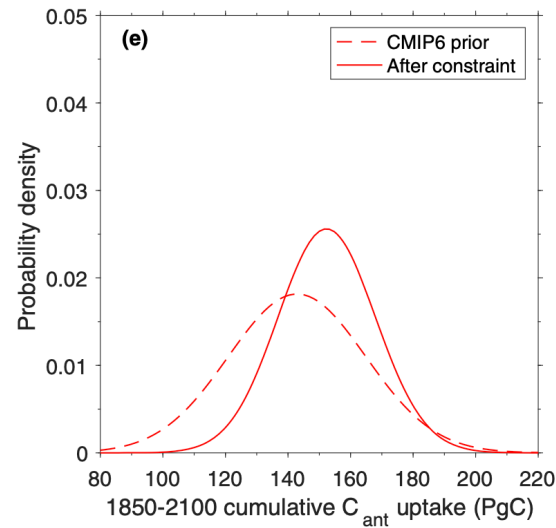
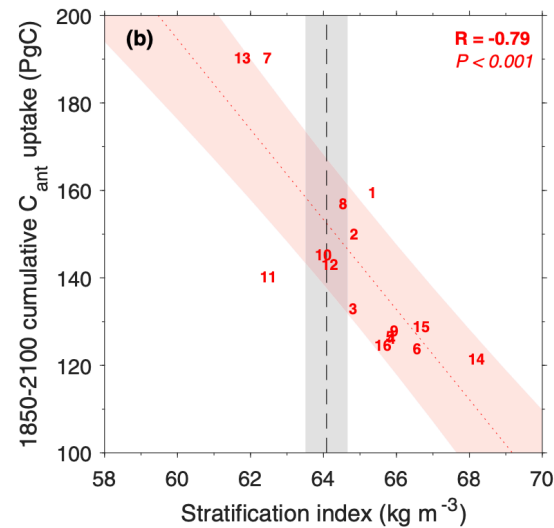
Bourgeois et al. (2022)



# Constrained future CO<sub>2</sub> sink in the Southern Ocean



— WOA 2013	Obs. std.
Combined 68% pred. int.	CMIP5 68% pred. int.
CMIP6 68% pred. int.	1 CanESM2
1 ACCESS-ESM1-5	2 CESM1-BGC
2 CanESM5	3 CMCC-CESM
3 CanESM5-CanOE	4 GFDL-ESM2G
4 CESM2	5 GFDL-ESM2M
5 CESM2-WACCM	6 GISS-E2-R-CC
6 CNRM-ESM2-1	7 GISS-E2-H-CC
7 GFDL-CM4	8 HadGEM2-CC
8 GFDL-ESM4	9 HadGEM2-ES
9 IPSL-CM6A-LR	10 IPSL-CM5A-LR
10 MIROC-ES2L	11 IPSL-CM5A-MR
11 MPI-ESM1-2-HR	12 IPSL-CM5B-LR
12 MPI-ESM1-2-LR	13 MIROC-ESM
13 MRI-ESM2-0	14 MIROC-ESM-CHEM
14 NorESM2-LM	15 NorESM1-ME
15 NorESM2-MM	16 MPI-ESM-LR
16 UKESM1-0-LL	17 MPI-ESM-MR



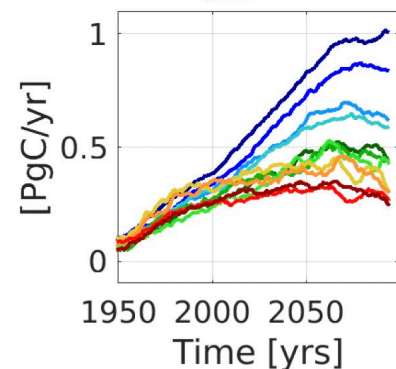
[Pg C]	Ensemble	Prior-constraint	Post-constraint	Uncertainty change
$\Sigma C_{ant}$	CMIP5	140±23	144±11	-53%
$\Sigma C_{ant}$	CMIP6	143±22	152±15	-32%

Bourgeois et al. (2022)



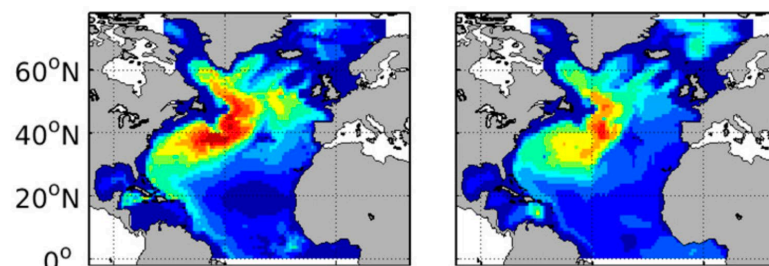
## North Atlantic

a) Y:  $C_{ant^*}$ -uptake



- NorESM1-ME
- GFDL-ESM2M
- GFDL-ESM2G
- CESM1-BGC
- MPI-ESM-LR
- IPSL-CM5A-MR
- IPSL-CM5A-LR
- HadGEM2-CC
- HadGEM2-ES
- MIROC-ESM-CHEM
- MIROC-ESM

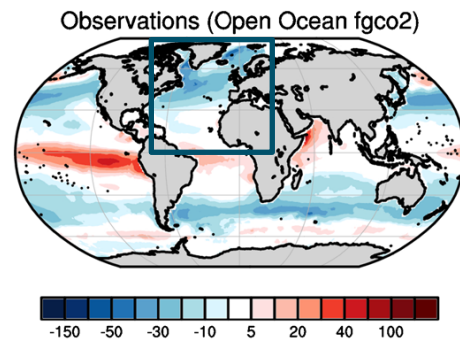
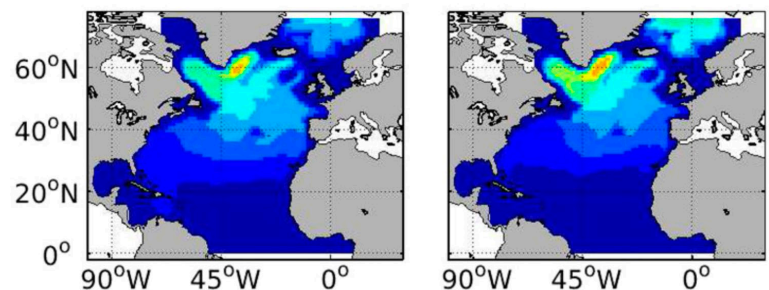
Percentage of Cant below 1000 m



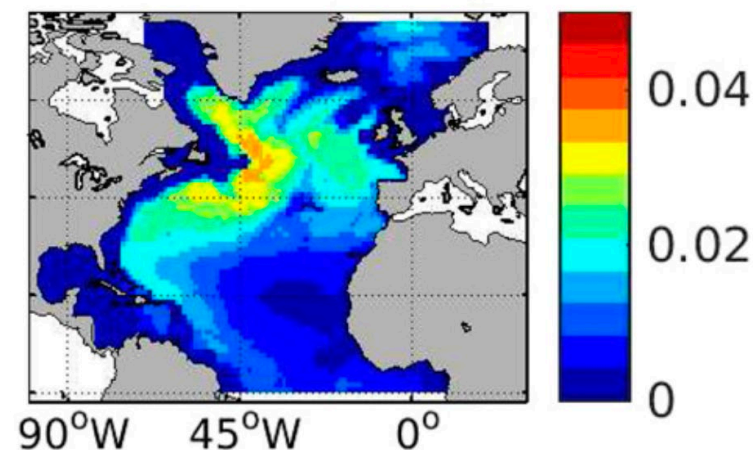
High-uptake models

VS

Low-uptake models



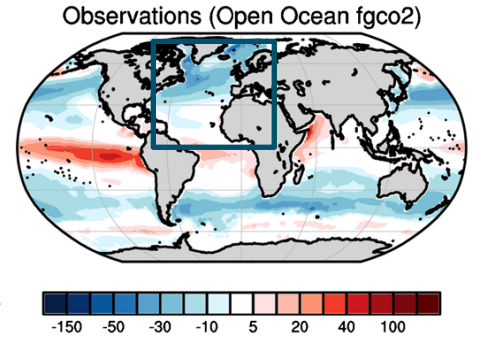
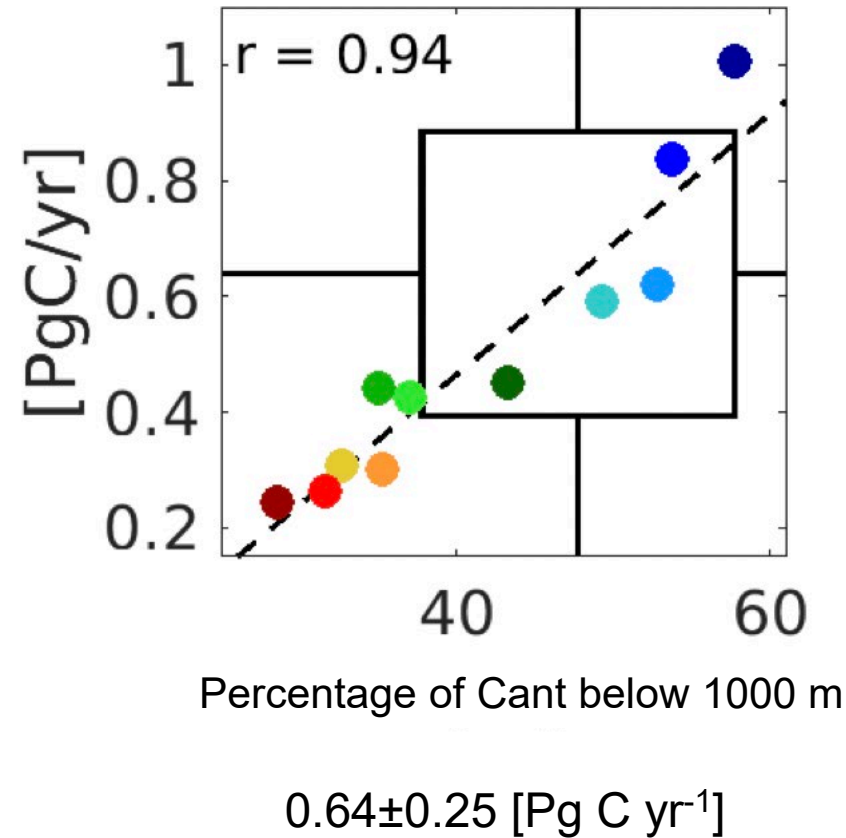
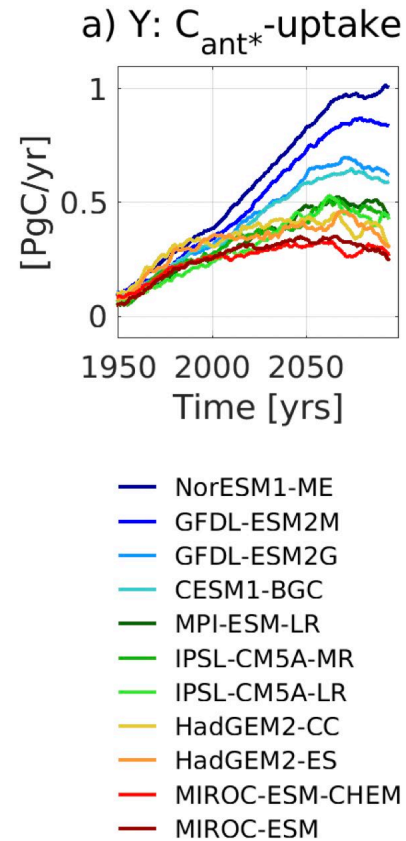
GLODAPv2 (observations)



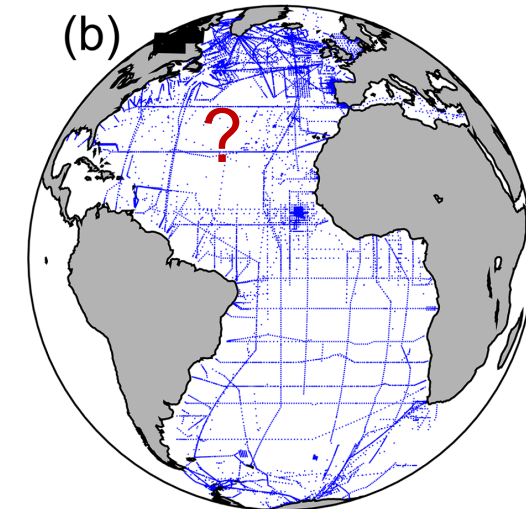
Goris et al. (2018; in revision)



## North Atlantic



- More observations needed to better constrained future spread
- Measuring deep carbon system in the North Atlantic is challenging and costly
- Can we optimize the domain that requires observations the most?



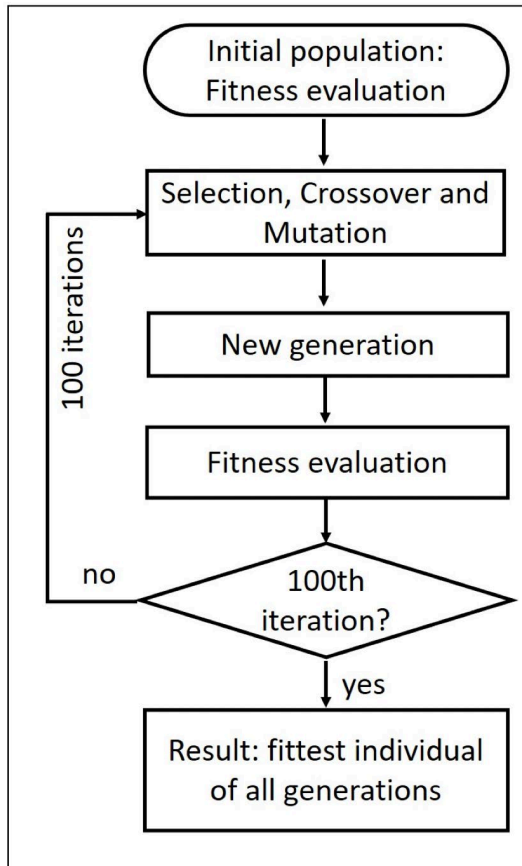
Goris et al. (2018; in revision), Lauvset et al. (2021)



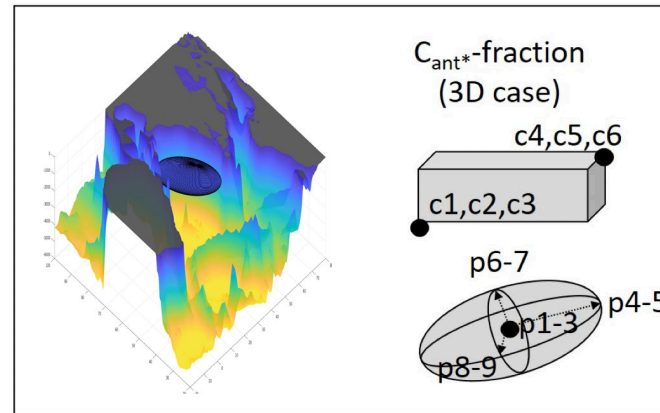


# Application of genetic algorithm to optimize EC

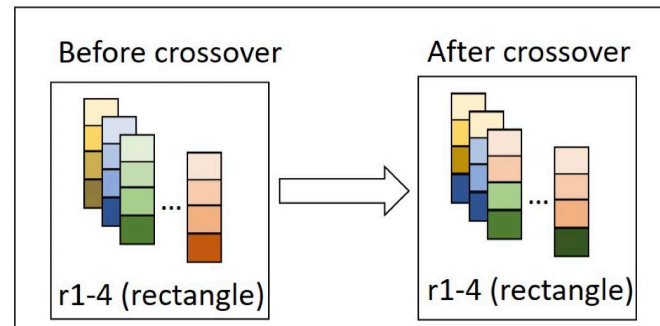
a) Schematic of the genetic Algorithm



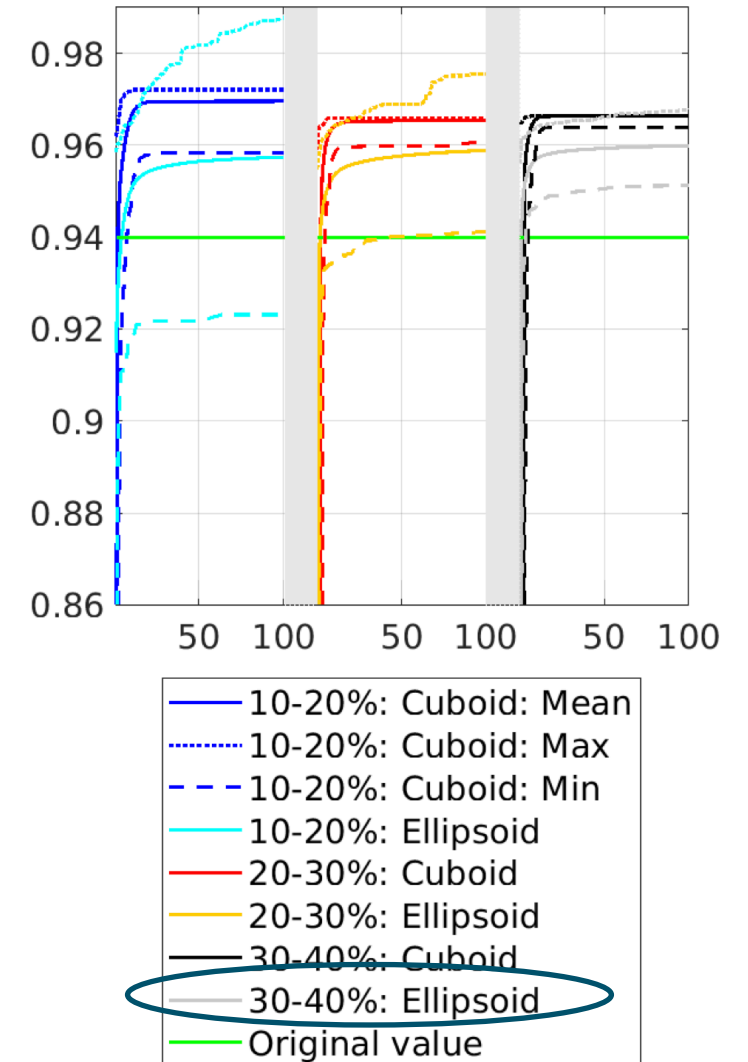
b) Illustration of genes for different shapes



c) Illustration of Crossover



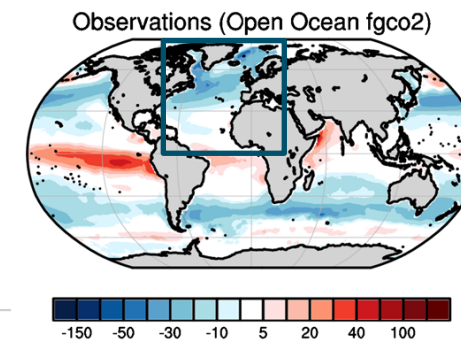
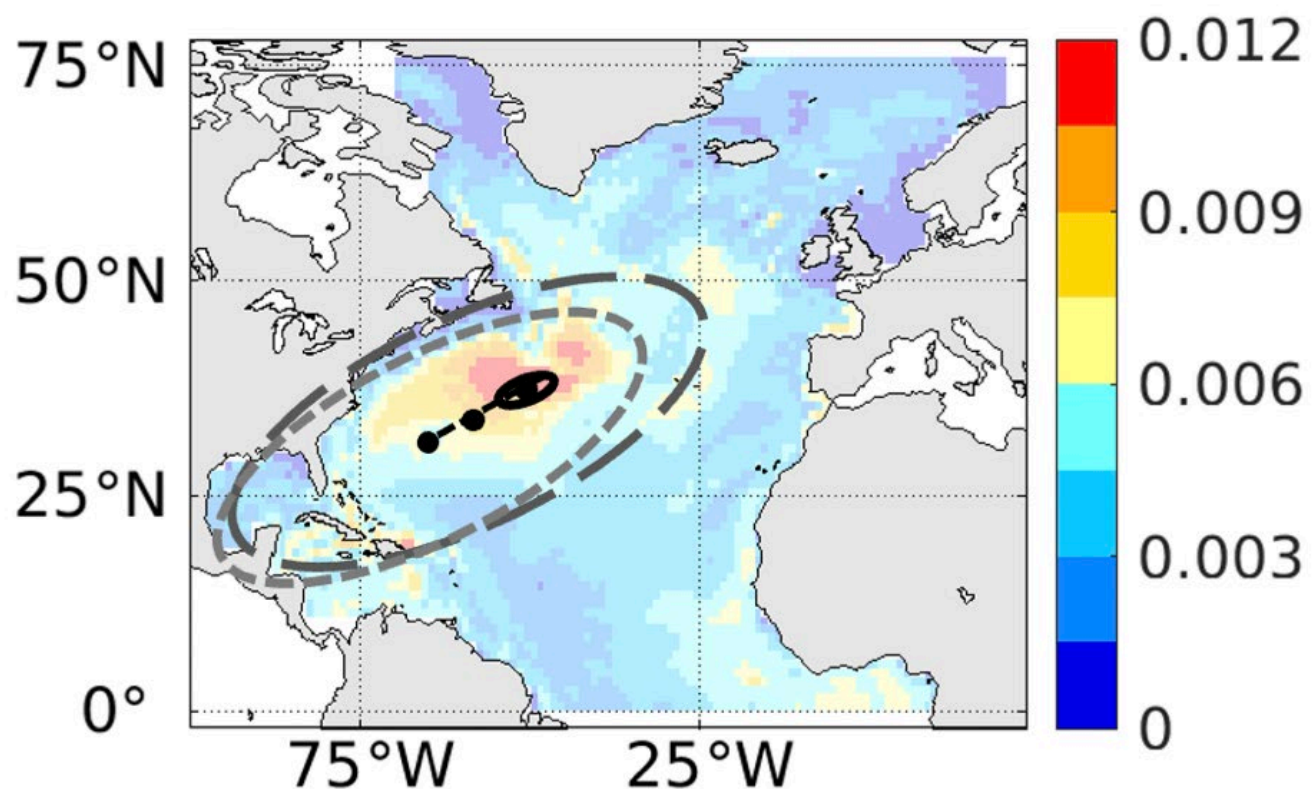
b) Iteration vs Correlation, 3D case



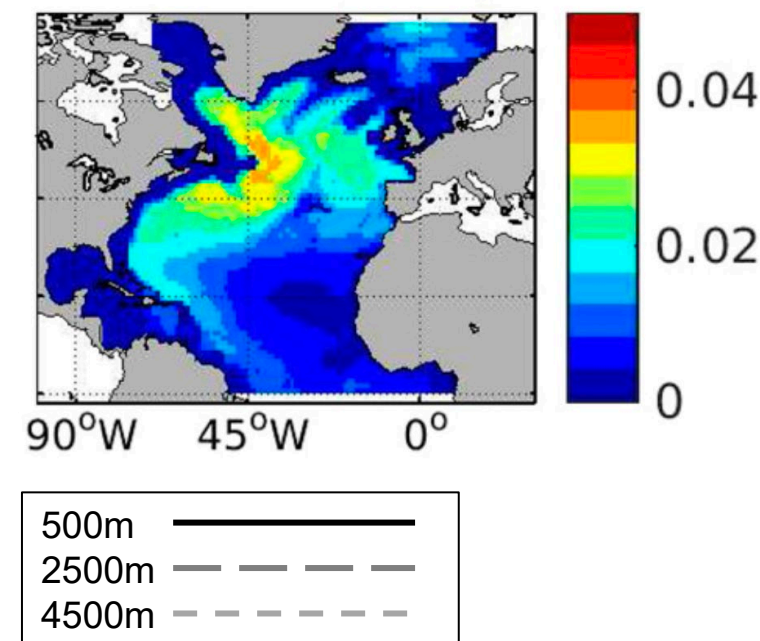
Goris et al. (in revision)



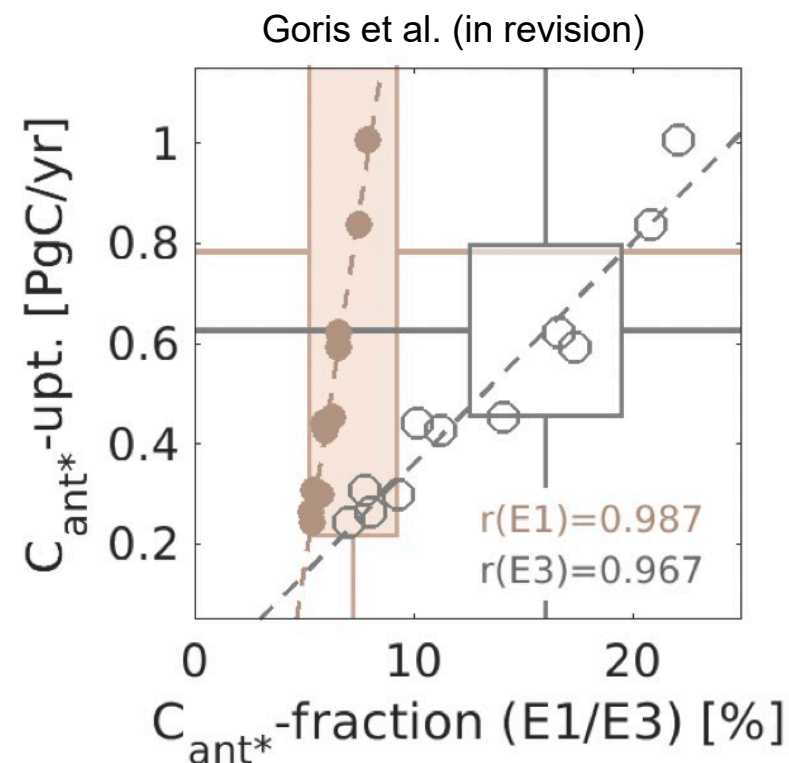
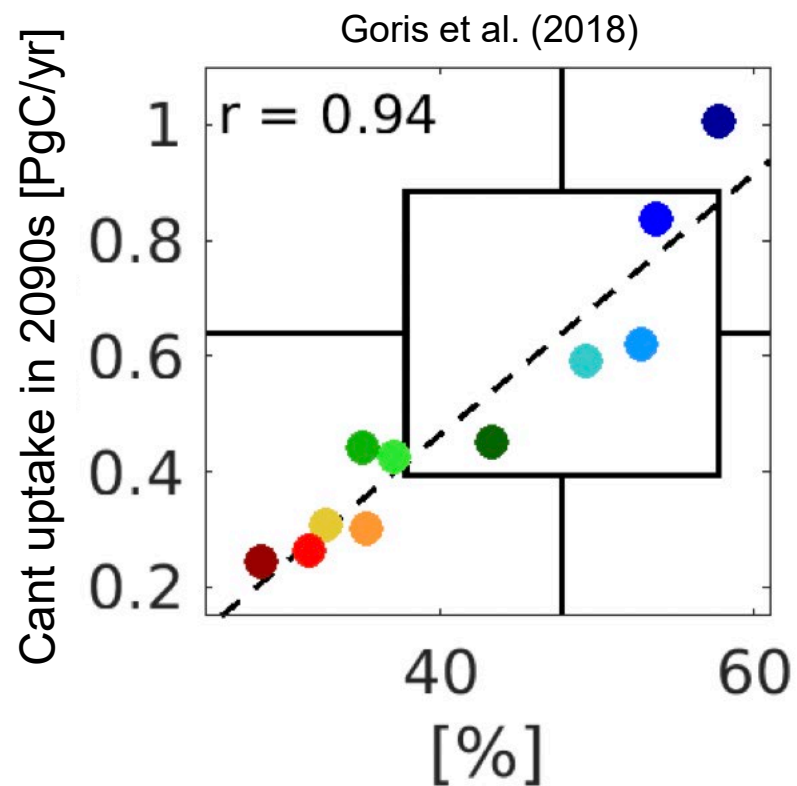
## Gulf Stream domain



GLODAPv2 (observations)



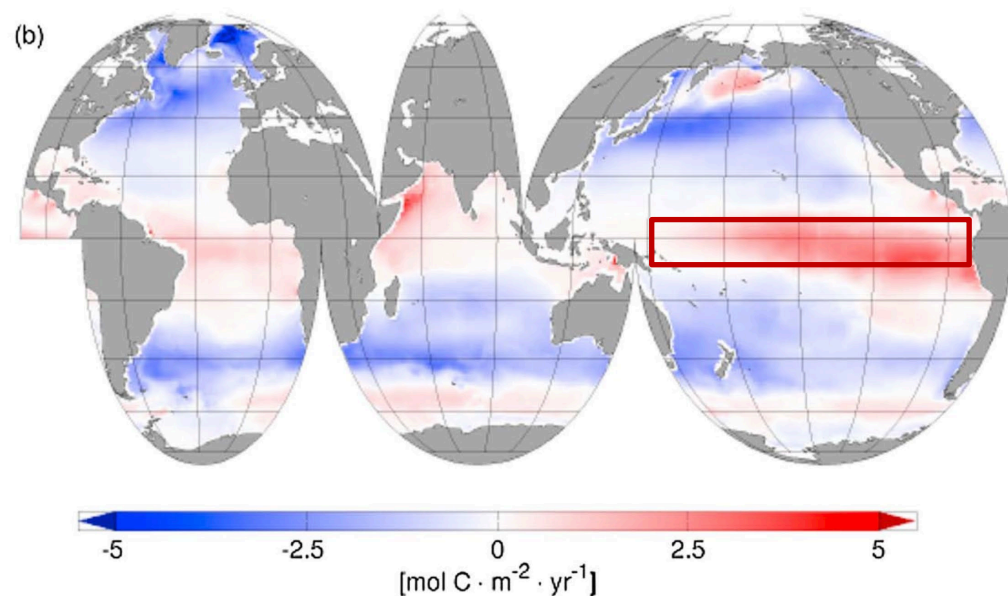
## Optimized (tighter) constraint of North Atlantic C uptake



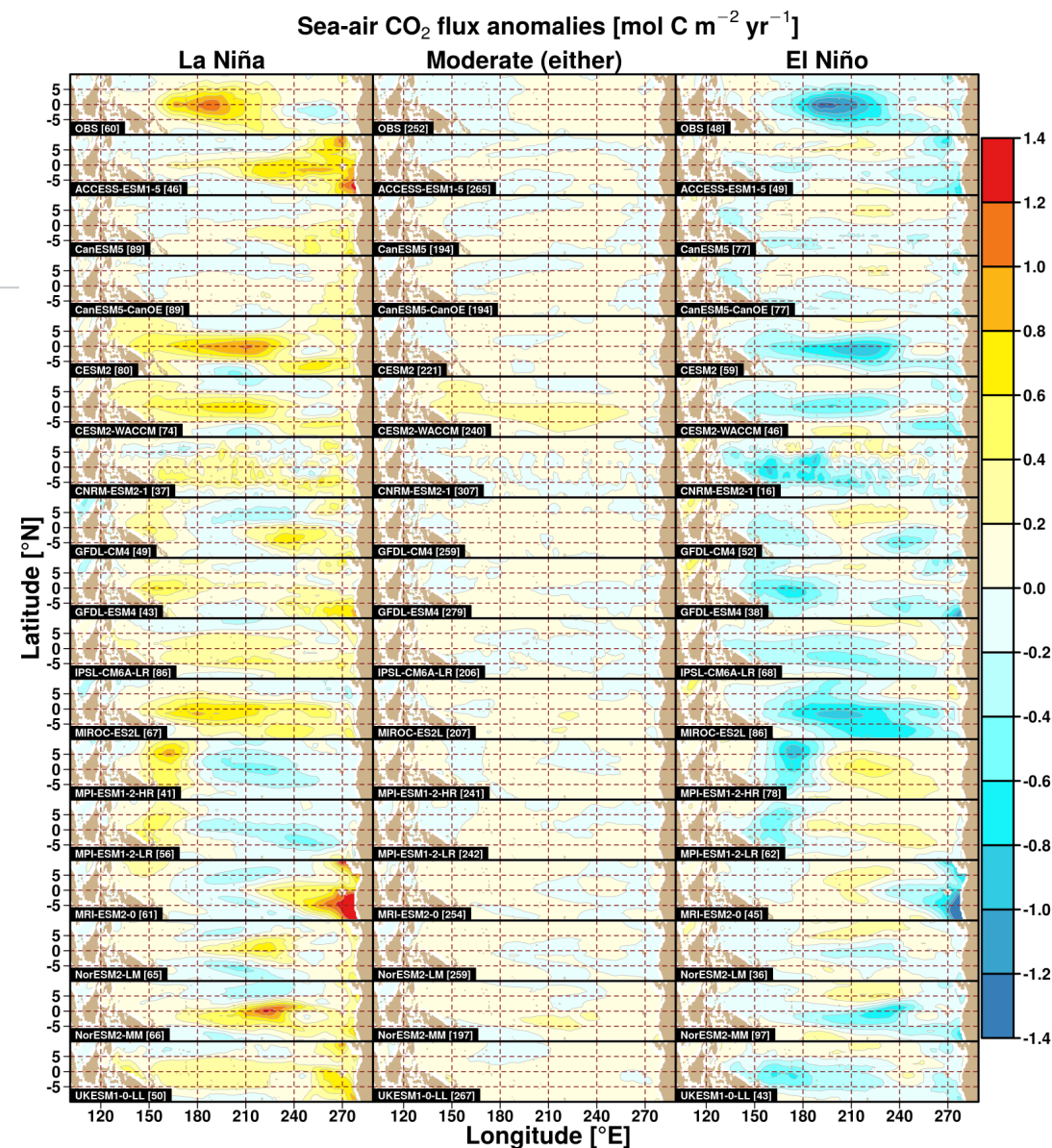
$0.50 \pm 0.25$  [Pg C yr<sup>-1</sup>]  $\longrightarrow$   $0.64 \pm 0.25$  [Pg C yr<sup>-1</sup>]  $\longrightarrow$   $0.63 \pm 0.17$  [Pg C yr<sup>-1</sup>]

# Constraining the CO<sub>2</sub> fluxes in the equatorial Pacific

## Observed contemporary CO<sub>2</sub> fluxes



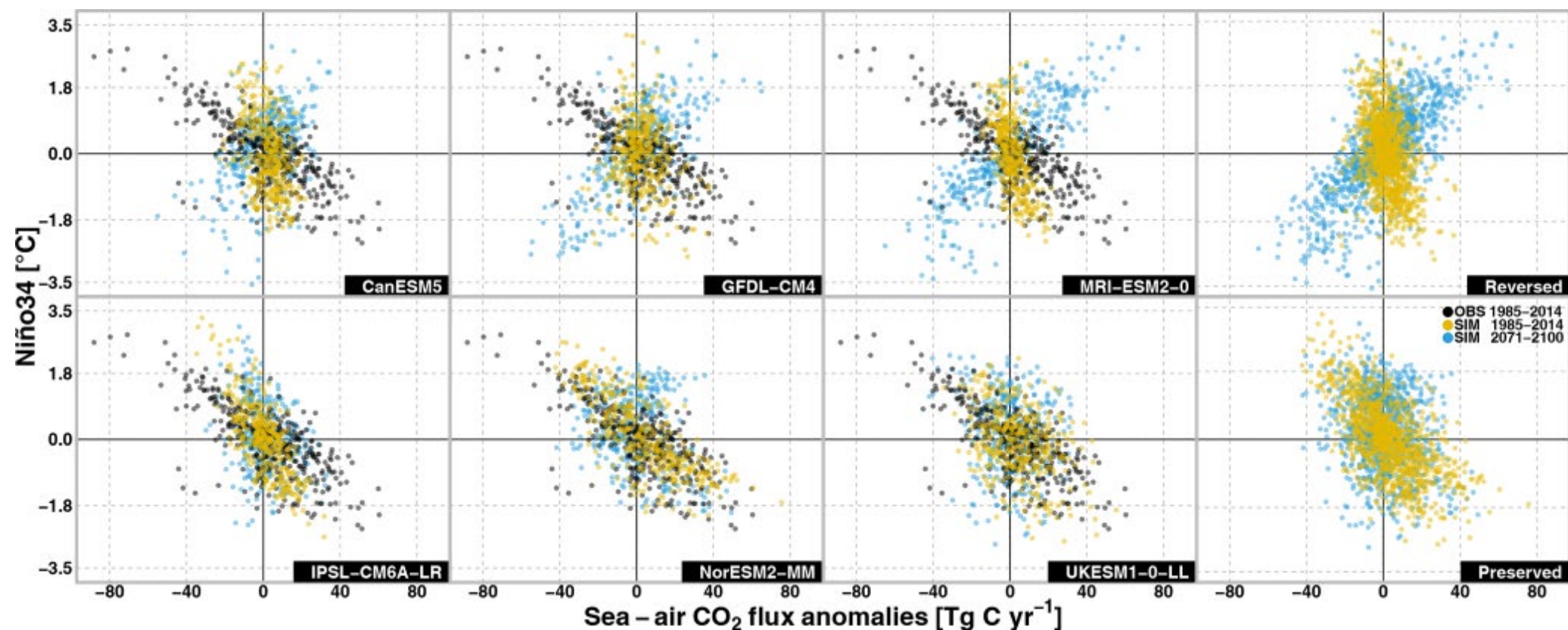
Landschutzer et al. (2014)



Vaithinada Ayar et al. (2022)



## Constraining the CO<sub>2</sub> fluxes in the equatorial Pacific

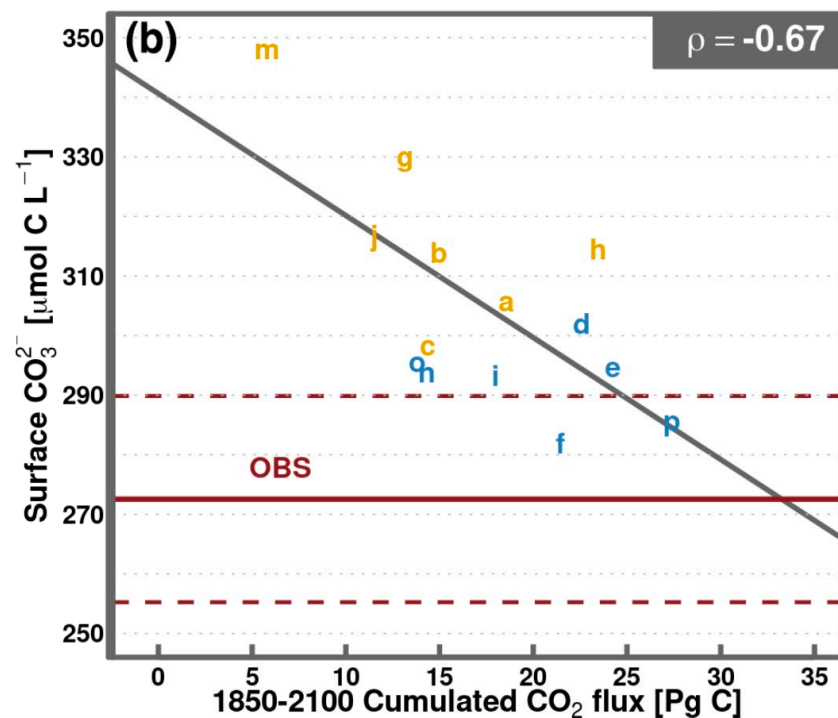


Vaithinada Ayar et al. (2022)

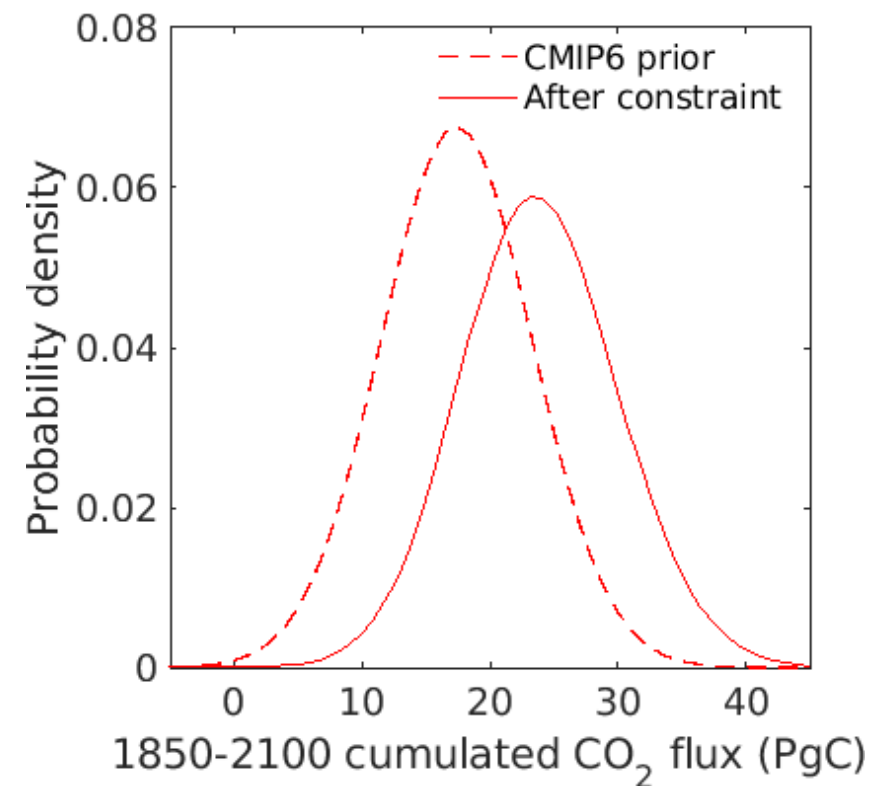


## Constraining the CO<sub>2</sub> fluxes in the equatorial Pacific

a:ACCESS-ESM1-5 b:CanESM5 c:CanESM5-CanOE d:CESM2 e:CESM2-WACCM f:CNRM-ESM2-1 g:GFDL-CM4 h:GFDL-ESM4 i:IPSL-CM6A-LR j:MIROC-ES2L m:MRI-ESM2-0 n:NorESM2-LM o:NorESM2-MM p:UKESM1-0-LL reversed preserved



$$17.4 \pm 5.9 \Rightarrow 24.6 \pm 5.9 \text{ Pg C}$$



Vaithinada Ayar et al. (2022)





## Summary

- › Constraining the growing spread of ocean carbon sink projections are crucial to constrain future climate change and ultimately guide the development of climate mitigation policies.
- › We apply an emergent constraint approach to reduce the projections CO<sub>2</sub> uptakes.
- › The efficiency of surface-to-deep transport of anthropogenic carbon is commonly identified as the key mechanisms driving the systematic inter-model spread, both in the Southern Ocean and North Atlantic.
- › For the North Atlantic region, a genetic algorithm was used to further optimize our identified emergent constraint by isolating the Gulf Stream region as a key regional constraint.
- › In the tropical Pacific, bias in the interior biogeochemistry explains the projection spread.
- › Our study consolidates the importance of improving representations ventilation mechanisms in models and sustaining carbon chemistry and watermass monitoring network to improve the fidelity of future model projections.

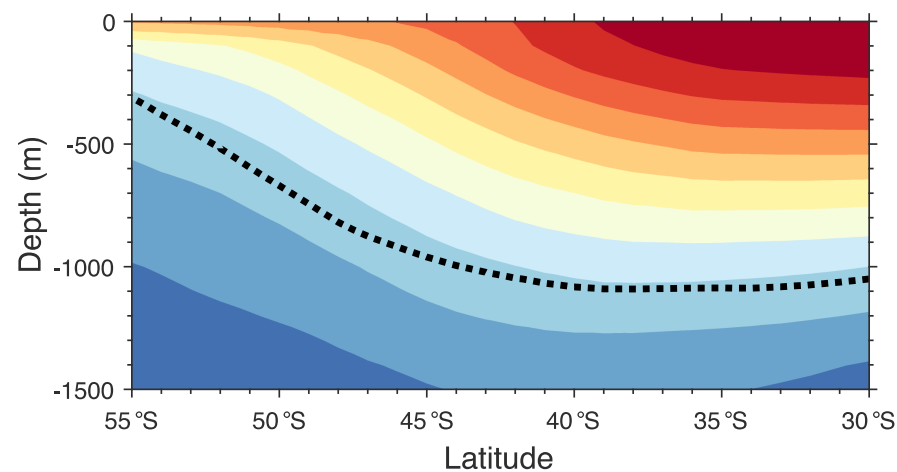


This study has received funding from the European Union's Horizon 2020 research and innovation programme under grant agreement No 820989 (project COMFORT). The work reflects only the author's/authors' view; the European Commission and their executive agency are not responsible for any use that may be made of the information the work contains.

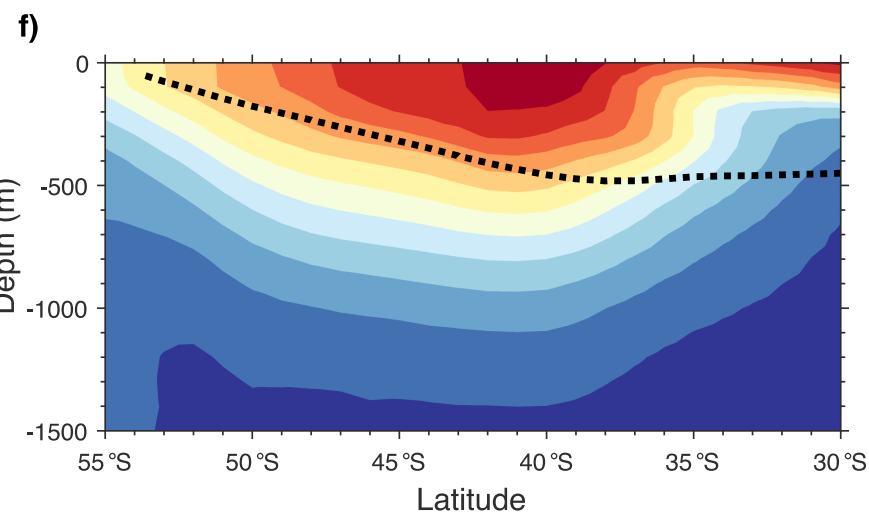
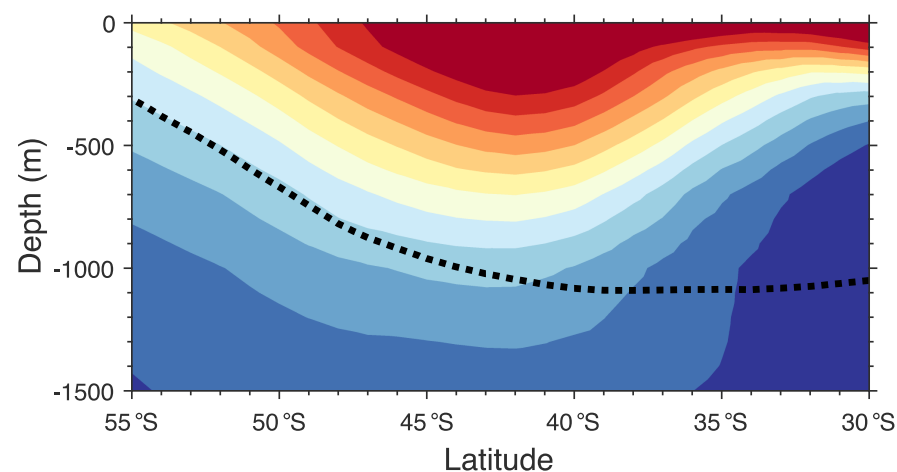
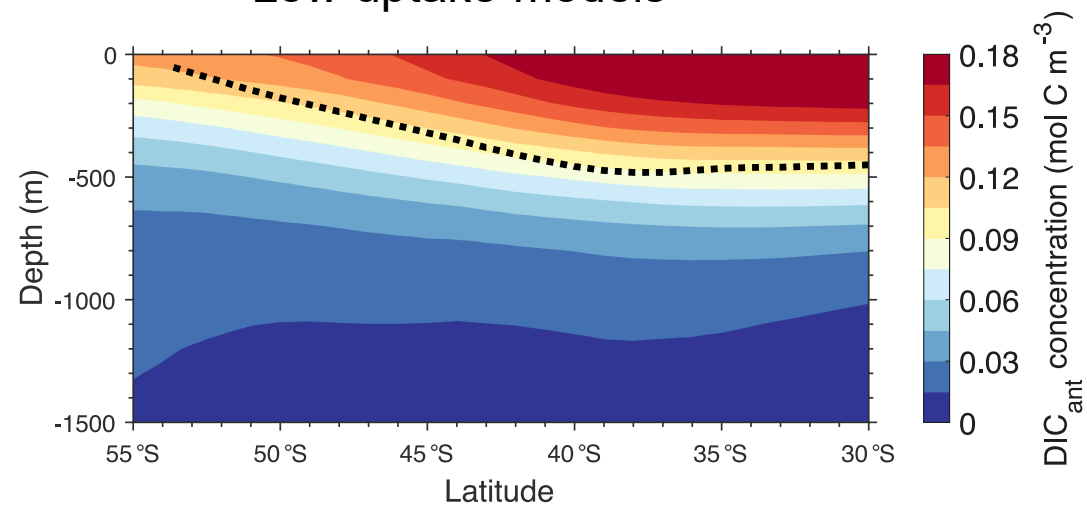


# As it turns out, similar systematic bias is simulated for ocean heat uptakes

## High-uptake models



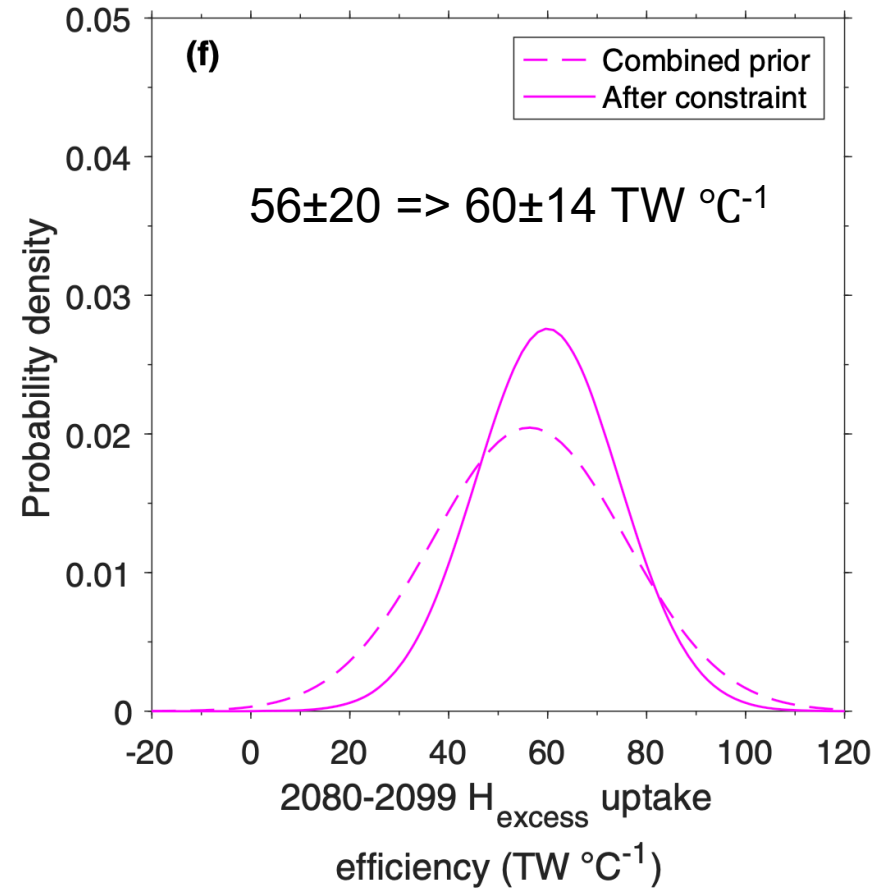
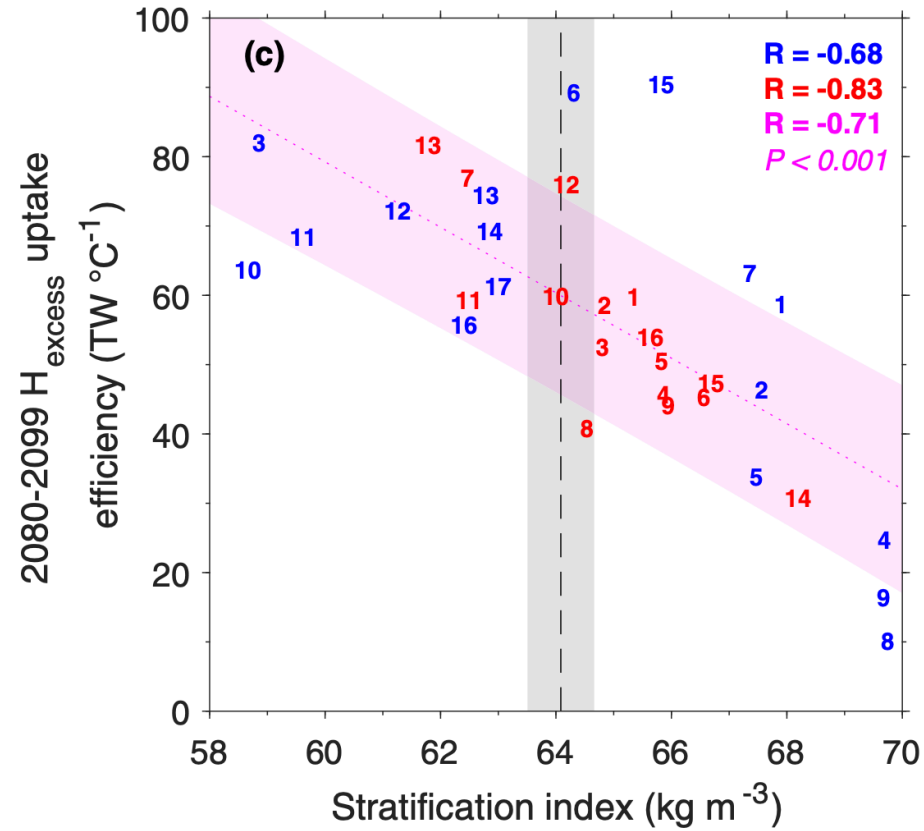
## Low-uptake models



Bourgeois et al. (2022)



# Constrained future excess heat uptake in the Southern Ocean



Bourgeois et al. (2022)