

# Carbon uptake and feedbacks in CMIP

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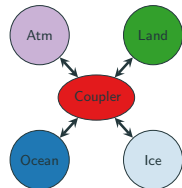
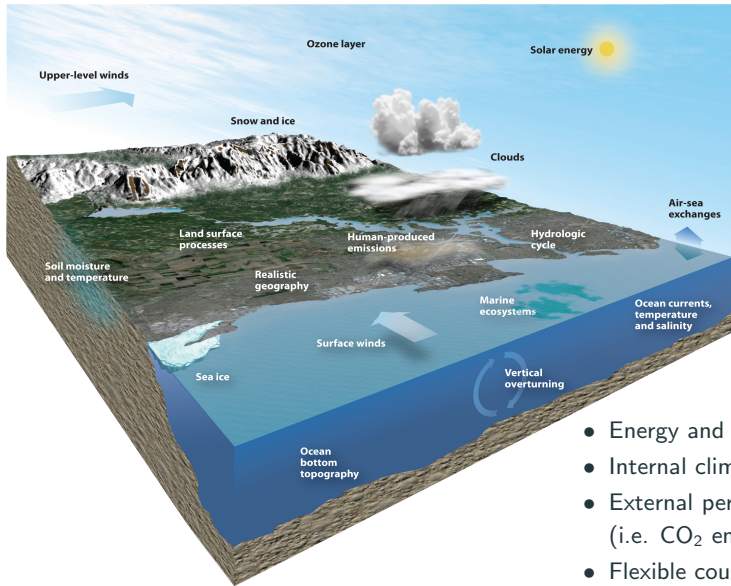
July 2016

OCB Summer Workshop



- Characterize CMIP5 simulations of the carbon cycle:
  - carbon-concentration ( $\beta$ ) and carbon-climate ( $\gamma$ ) feedbacks;
  - separation of impacts on natural and anthropogenic CO<sub>2</sub>;
  - prolonged timescale of ocean response to warming.
- How robust are the CMIP simulations?
  - Anthropogenic CO<sub>2</sub>: circulation biases;
  - Natural CO<sub>2</sub>: representing the biological pump.
- Emerging opportunities:
  - Decadal prediction experiments.

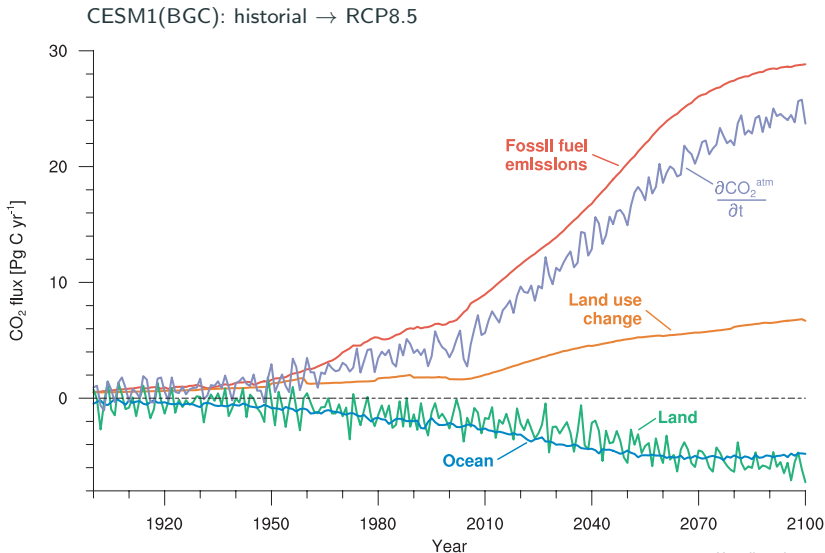
# The Earth system modeling framework



- Energy and mass conserving;
- Internal climate variability;
- External perturbations (i.e. CO<sub>2</sub> emissions);
- Flexible coupling infrastructure.

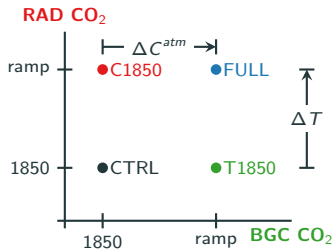
# Earth System Models simulate a fully-coupled global carbon cycle

## Emissions-forced prognostic carbon budget



## Linear decomposition of cumulative ocean carbon inventory

$$\begin{aligned}\Delta C^{ocn} &= \int \phi_{as} dt = \int_V (C_t^{ocn} - C_0^{ocn}) dV \\ &= \beta \Delta C^{atm} + \gamma \Delta T \\ &= \Delta C^\beta + \Delta C^\gamma\end{aligned}$$

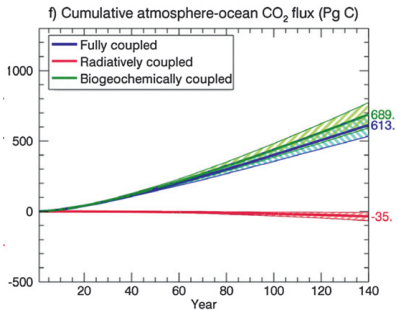
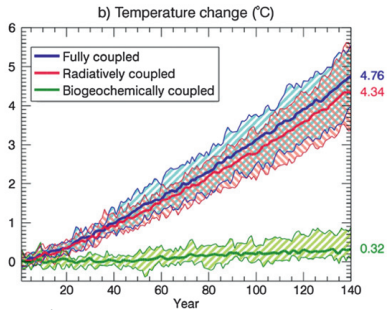
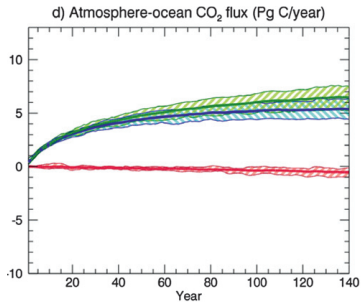
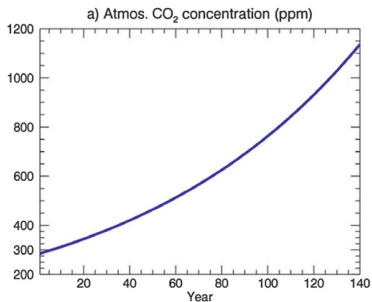


$$\Delta C^{ocn}_{[FULL - CTRL]} = \Delta C^\beta_{[T1850 - CTRL]} + \Delta C^\gamma_{[C1850 - CTRL]} + \Delta C^\gamma_{ant} \text{ (residual)}$$

$\beta$ : carbon-carbon feedback  
(PgC/ppm)

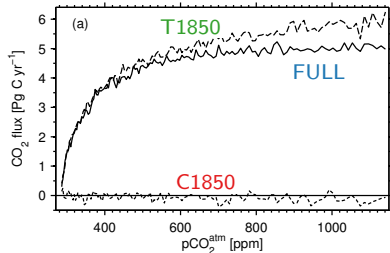
$\gamma$ : carbon-climate feedback  
(PgC/K)

# CMIP5 Idealized simulations



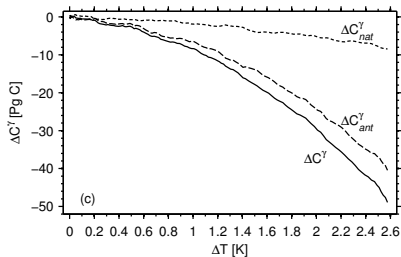
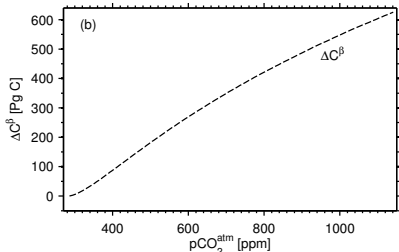
# Ocean uptake under $1\% \text{ y}^{-1}$ ramping $\text{CO}_2$

## Air-to-sea flux: anomaly timeseries

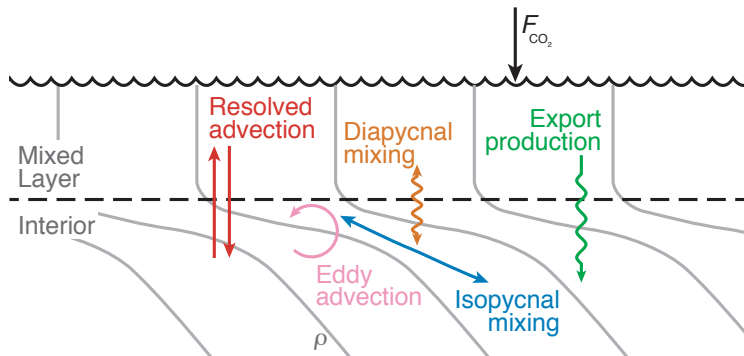


$$\Delta C^{ocn} = \Delta C^{\beta} + \Delta C_{nat}^{\gamma} + \Delta C_{ant}^{\gamma}$$

## Carbon inventory changes



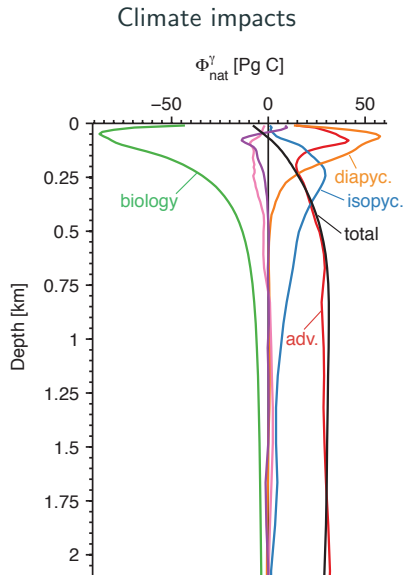
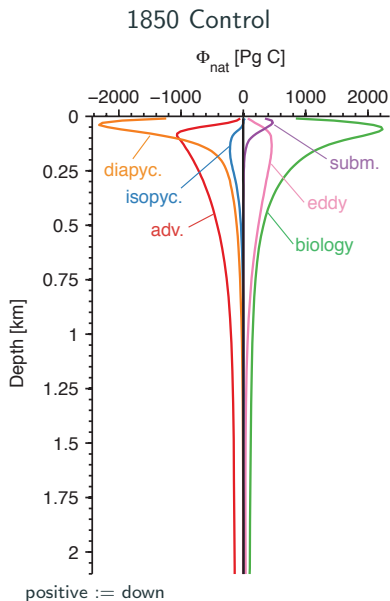
# Processes controlling CO<sub>2</sub> uptake



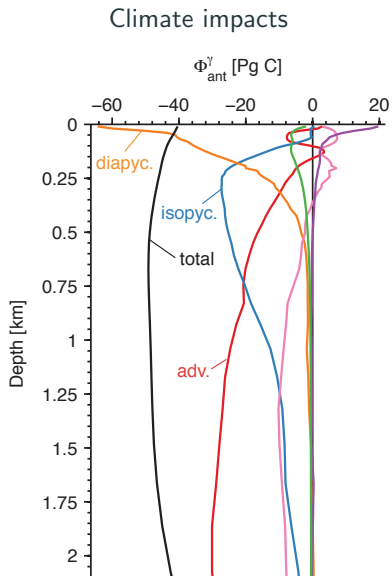
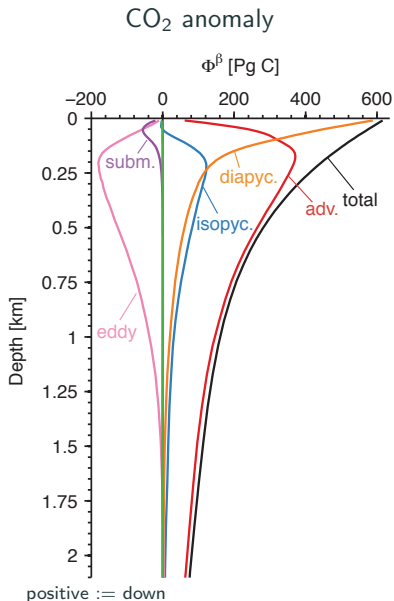
$$\frac{\partial C}{\partial t} + (\mathbf{u} + \mathbf{u}^*) \cdot \nabla C - \nabla \cdot (K \nabla C) = J_C$$



# Globally-integrated vertical carbon fluxes: natural CO<sub>2</sub>

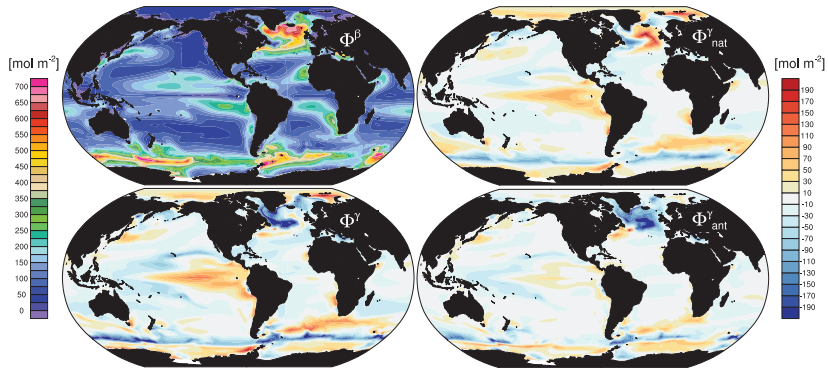


# Globally-integrated vertical carbon fluxes: anthropogenic CO<sub>2</sub>



# Spatially variable feedbacks

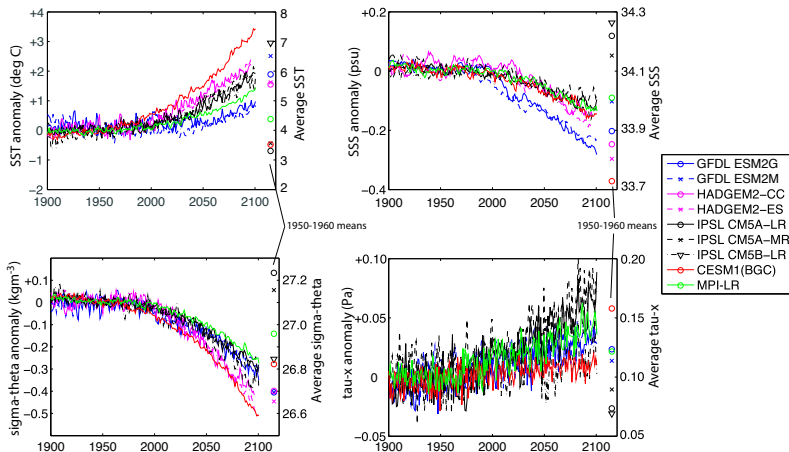
## Time-integrated air-to-sea CO<sub>2</sub> flux components



positive := down

# Changes in forcing under RCP8.5

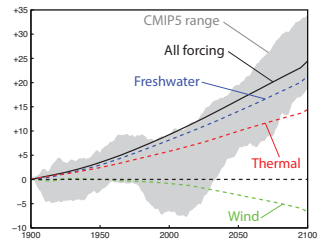
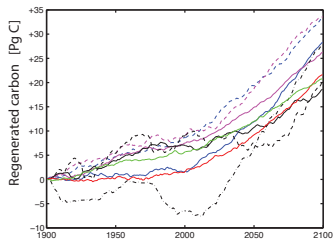
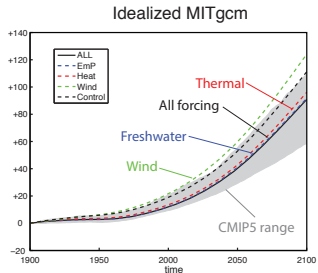
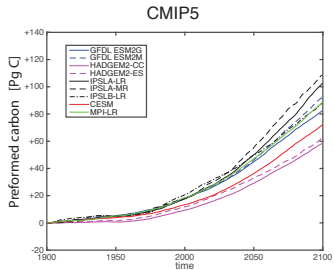
## CMIP5 models: area-weighted surface properties SH extratropics (40-60°S)



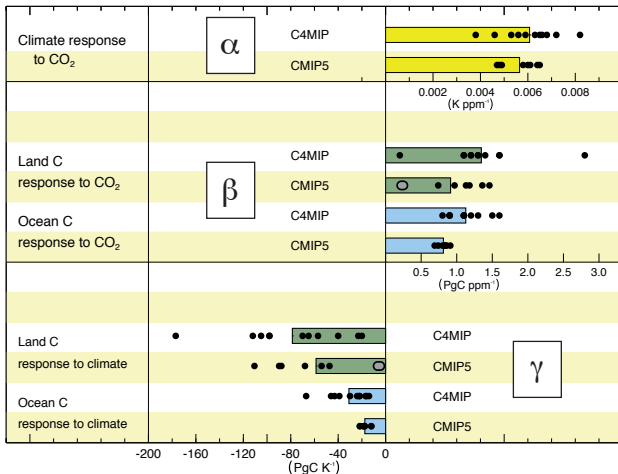
Ito et al. 2015, GRL

# Complex response to transient forcing

## Southern Ocean carbon inventory under RCP8.5 and idealized forcing

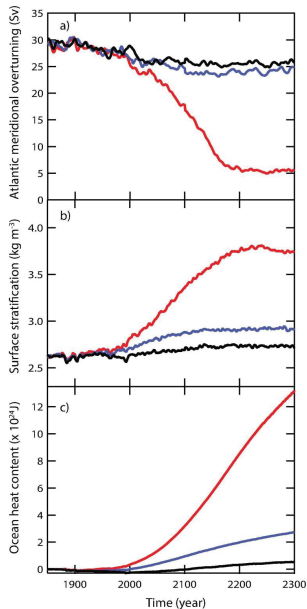
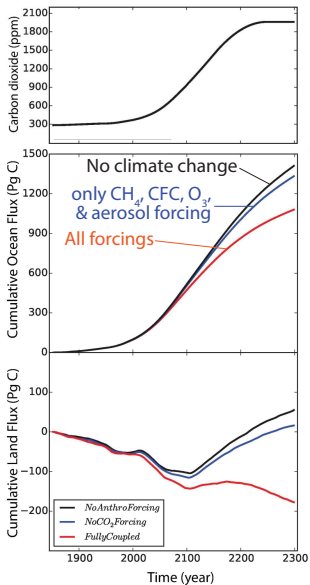


# Feedback parameters: CMIP5 versus C4MIP

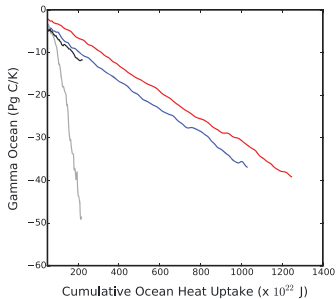
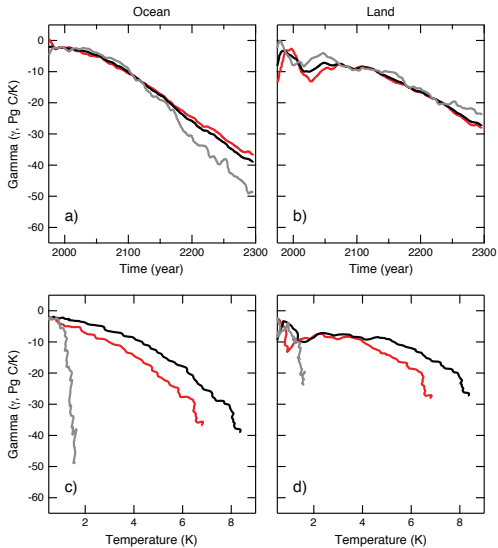


$$\left. \begin{array}{l} \text{C4MIP: } \sim 0.5\% \text{ yr}^{-1} \\ \text{CMIP5: } 1\% \text{ yr}^{-1} \end{array} \right\} \rightarrow \beta^{\text{CMIP5}} < \beta^{\text{C4MIP}}$$

# Feedbacks grow as warming continues: extended RCP8.5 simulations



# Feedbacks grow as warming continues

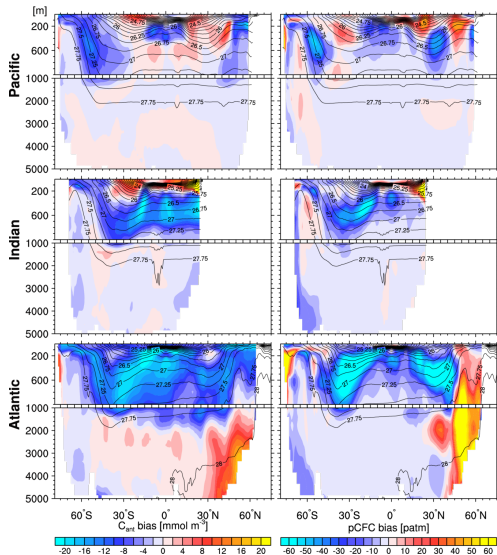


Randerson et al. 2015

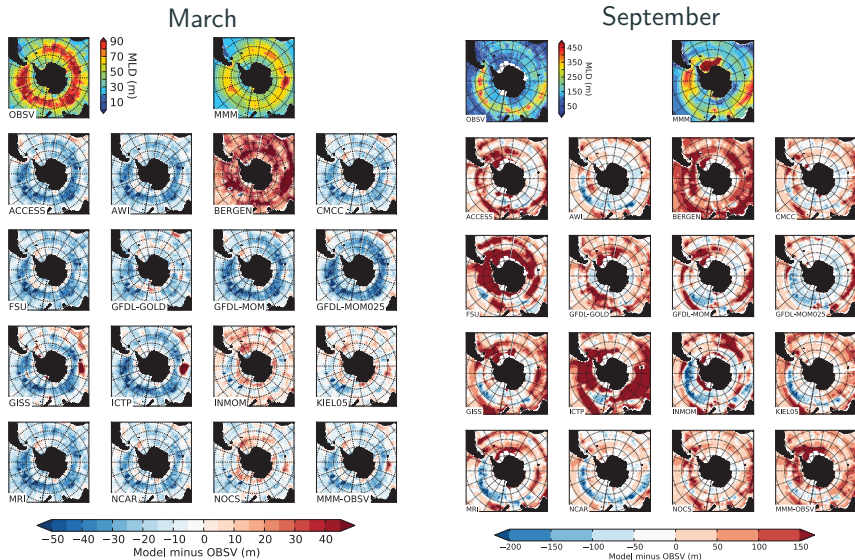


# Weak transient tracer uptake: $C_{ant}$ and CFC

## Biases relative to GLODAP



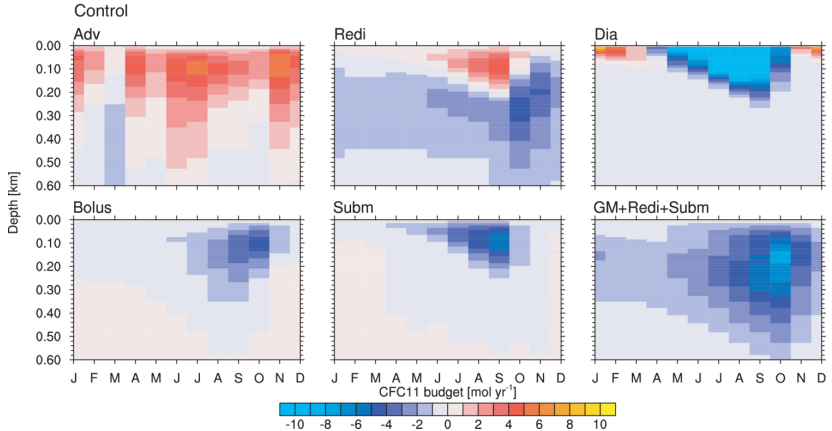
# Mixed layers depth biases in hindcast runs: Missing physics?



Downes et al. 2015

# Seasonal handoff: boundary layer to isopycnal mixing

## Vertical fluxes in ACC



# CMIP5 model skill metrics

## Seasonal cycle (phase & amplitude)

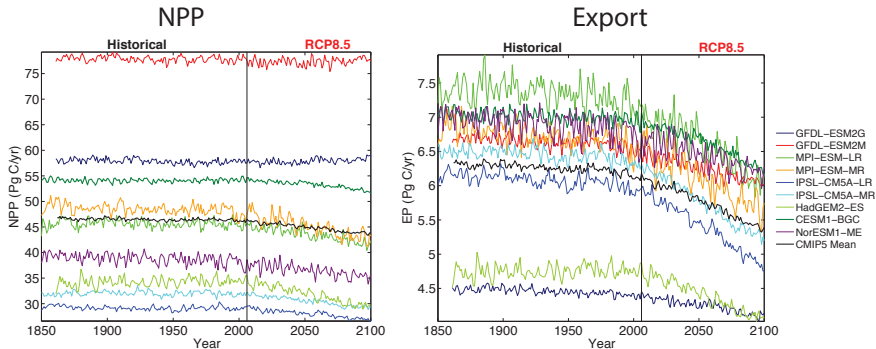


## Interannual variability (PDF overlap)



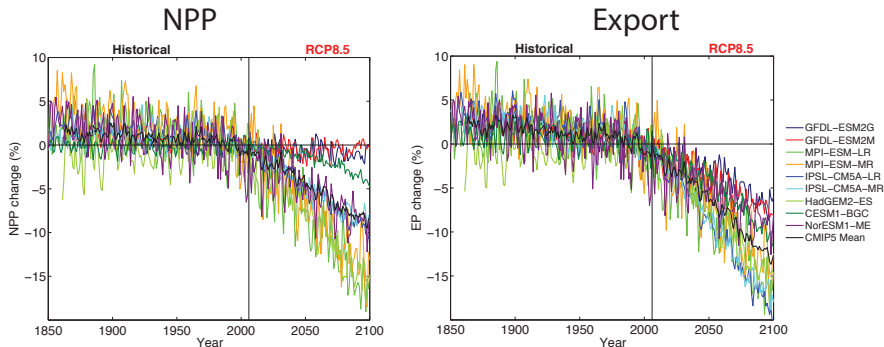
BCC-CSM1  
 BCC-CSM1-M  
 BNU-ESM  
 CanESM2  
 CESM1-BGC  
 GFDL-ESM2G  
 GFDL-ESM2M  
 HadGEM2-CC  
 HadGEM2-ES  
 INMCM4  
 IPSL-CM5A-LR  
 IPSL-CM5A-MR  
 IPSL-CM5B-LR  
 MIROC-EMS-CHEM  
 MIROC-ESM  
 MPI-ESM-LR  
 MPI-ESM-MR  
 NorESM1-ME

# CMIP5: Changes in NPP and export production



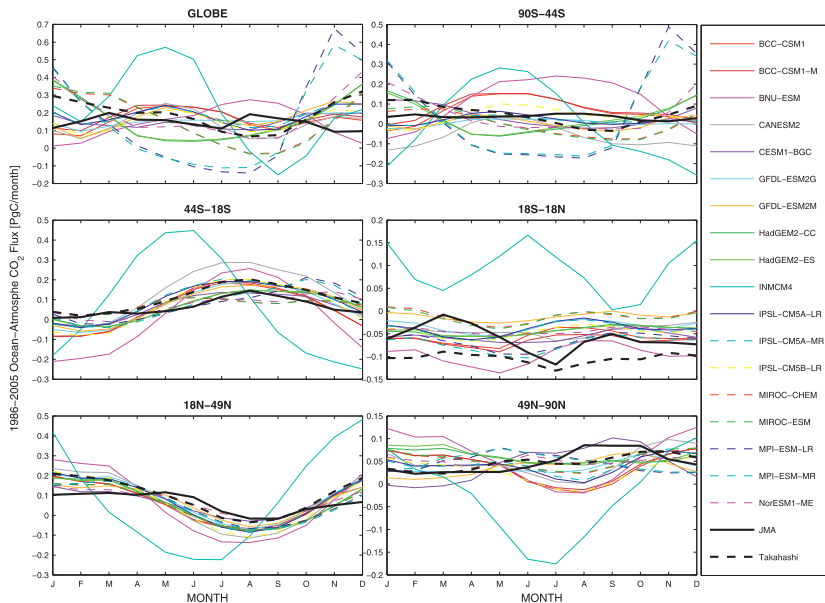
- Large spread in simulated NPP.

# CMIP5: Changes in NPP and export production



- Less NPP decline in models (CESM, GFDL) simulating changes in phytoplankton community (diatoms→small phytoplankton);
- Changes in export production somewhat more robust: constrained by physically-mediate nutrient supply.

# CMIP5 model skill metrics: Seasonal cycle in air-sea CO<sub>2</sub> flux



# FeMIP: Large intermodel differences in iron cycling

**Table 2.** A Summary of the Magnitude of the Fe Sources, the Total and Average Fe Inventories, and the Residence Time of Fe Across the FeMIP Models

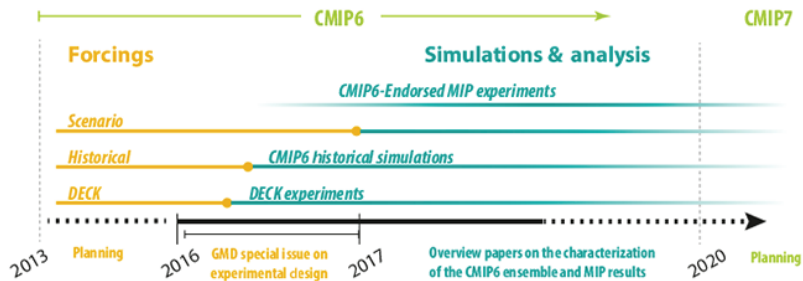
| Model   | Fe Sources ( $\text{Gmol yr}^{-1}$ ) |          |              |                    |       | Fe Inventory ( $\times 10^{11}$ mol) | Average Fe ( $\text{nmol L}^{-1}$ ) | Residence Time (years) |
|---------|--------------------------------------|----------|--------------|--------------------|-------|--------------------------------------|-------------------------------------|------------------------|
|         | Dust                                 | Sediment | Hydrothermal | Rivers             | Total |                                      |                                     |                        |
| BEC     | 21.9                                 | 84.6     | 17.7         | 0.34               | 124.5 | 10.1                                 | 0.74                                | 8.1                    |
| BFM     | 1.4                                  | 0        | 0            | 0.06               | 1.4   | 8.8                                  | 0.65                                | 626.3                  |
| BLING   | 3.3                                  | 9.1      | 0            | 0                  | 12.4  | 5.3                                  | 0.37                                | 42.4                   |
| COBALT  | 32.5                                 | 155      | 0            | 0                  | 182.5 | 6.8                                  | 0.50                                | 3.7                    |
| GENIE   | 1.8                                  | 0        | 0            | 0                  | 1.8   | 10.1                                 | 0.48                                | 560.0                  |
| MEDUSA1 | 2.7                                  | 0        | 0            | 0                  | 2.7   | 6.3                                  | 0.46                                | 232.0                  |
| MEDUSA2 | 3.4                                  | 2.9      | 0            | 0                  | 6.8   | 4.8                                  | 0.35                                | 69.9                   |
| MITecco | 3.5                                  | 104      | 0            | 0                  | 107.5 | 8.8                                  | 0.65                                | 8.2                    |
| MITigsm | 1.4                                  | 194      | 0            | 0                  | 195.4 | 9.0                                  | 0.66                                | 4.6                    |
| PISCES1 | 32.7                                 | 26.6     | 11.3         | 2.5                | 71.0  | 8.1                                  | 0.59                                | 11.5                   |
| PISCES2 | 32.7                                 | 26.6     | 11.3         | 2.5                | 71.0  | 11.2                                 | 0.81                                | 15.7                   |
| REcoM   | 3.7                                  | 0.6      | 0            | 0                  | 4.3   | 12.5                                 | 0.73                                | 291.6                  |
| TOPAZ   | 13.8                                 | 74.8     | 0            | 0                  | 88.6  | 6.8                                  | 0.50                                | 7.6                    |
|         |                                      |          |              | Mean               | 66.9  | 8.3                                  | 0.58                                | 144.7                  |
|         |                                      |          |              | Standard deviation | 67.1  | 2.2                                  | 0.14                                | 175.8                  |

- Total Fe inputs vary widely;
- Mean oceanic Fe concentrations are similar;
- Scavenging compensates: Fe residence time varies widely.



- CMIP5 simulations show:
  - $C_{ant}$  transfer into the ocean interior is dominated by resolved advection (mid-latitudes) and diapycnal mixing (high-latitudes); warming-induced stratification weakens these fluxes.
  - Stratification limits  $C_{nat}$  outgassing, but also curtails surface nutrient supply, thereby weakening the biological pump (reduced efficiency) and yielding net release of natural carbon.
  - Southern Ocean shows particularly intricate behavior.
- How robust are the CMIP simulations?
  - Southern Ocean mixed layer depths and overturning circulation remain problematic.
  - Wide divergence in model representations of the biological pump.
- Emerging opportunities:
  - Initialized prediction experiments represent interesting framework for model-observation fusion.

# CMIP6 Timeline



Eyring et al. 2016

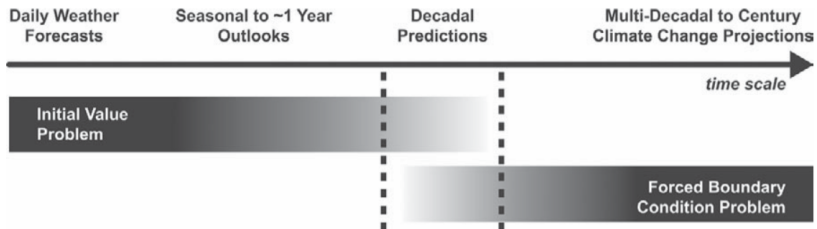


Questions?

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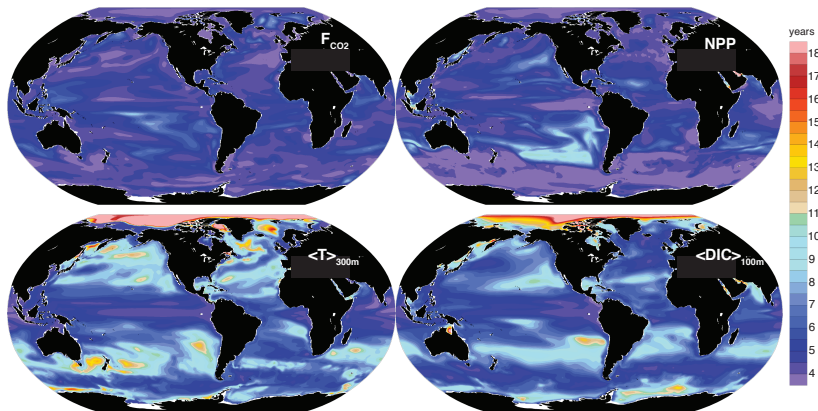
# Decadal timescale: initial value + boundary value problem



Meehl et al. 2009

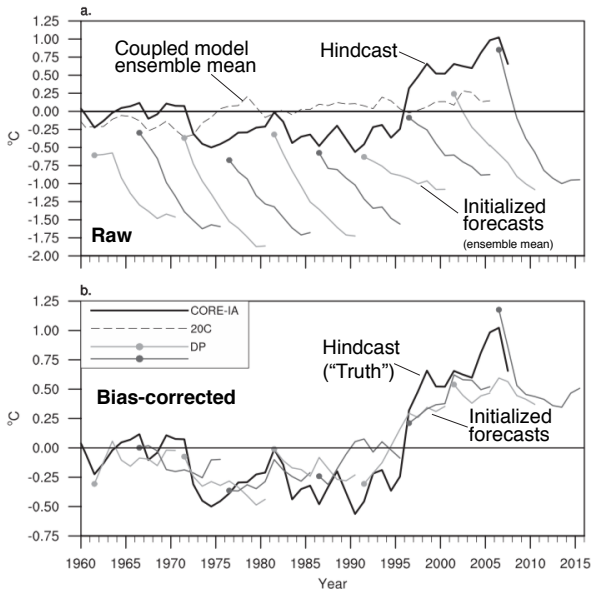
# Dominant timescales of intrinsic variability

## Variance-weighted mean frequency (period)

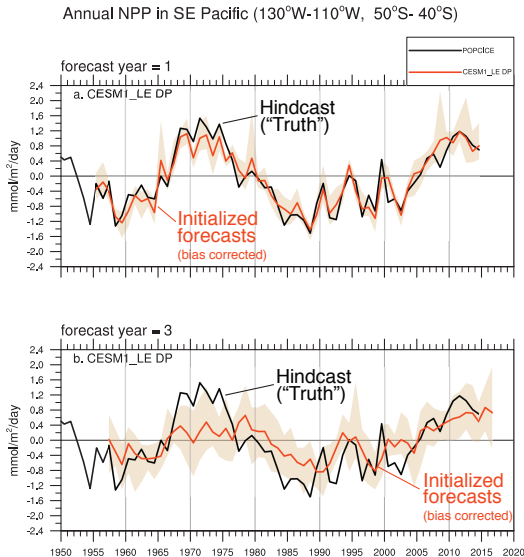


$$T_x = \frac{\sum_k V(f_k, x)}{\sum_k f_k V(f_k, x)}$$

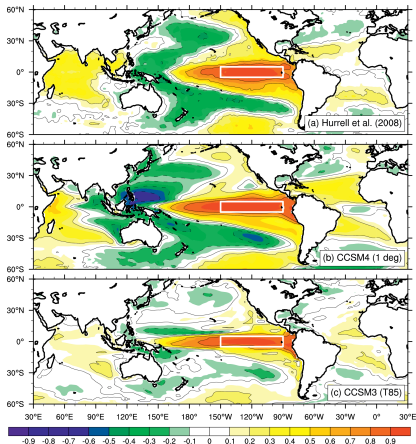
## Heat content anomaly, N. Atlantic Subpolar gyre ( $z > -275$ m)



# Biogeochemical predictions on multi-annual timescales: possible?

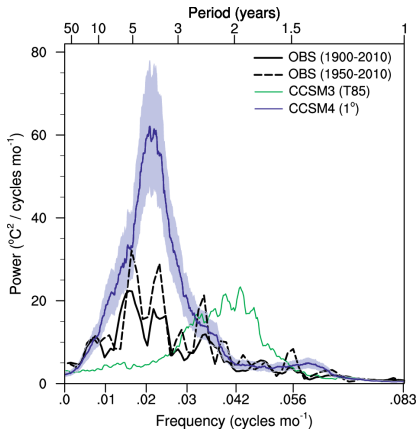


## El Niño-Southern Oscillation



Correlation of SST with Niño3.4 index

*Gent et al. 2011*



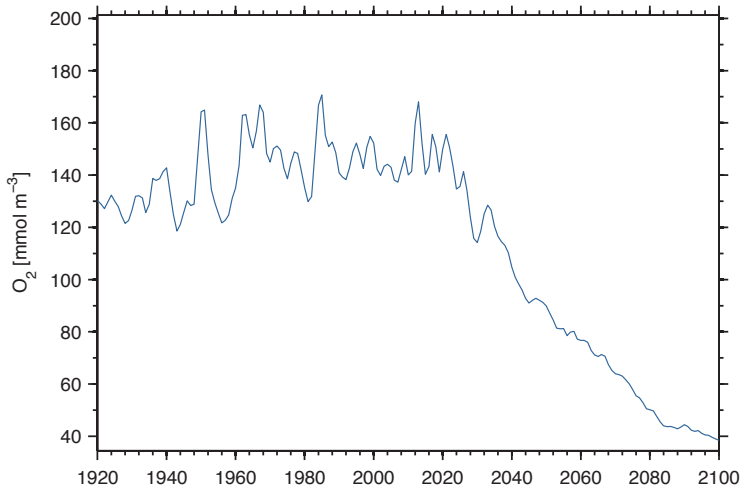
Power spectrum of the Niño3.4 index

*Deser et al. 2012*



# Natural variability can reinforce or oppose trends

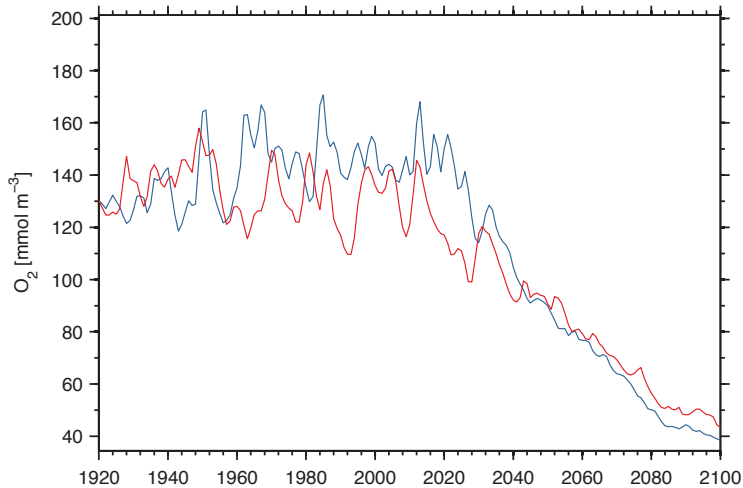
## CESM simulation of dissolved oxygen at Station P ( $\sigma_\theta = 26.5$ )



Long et al. 2016

# Natural variability can reinforce or oppose trends

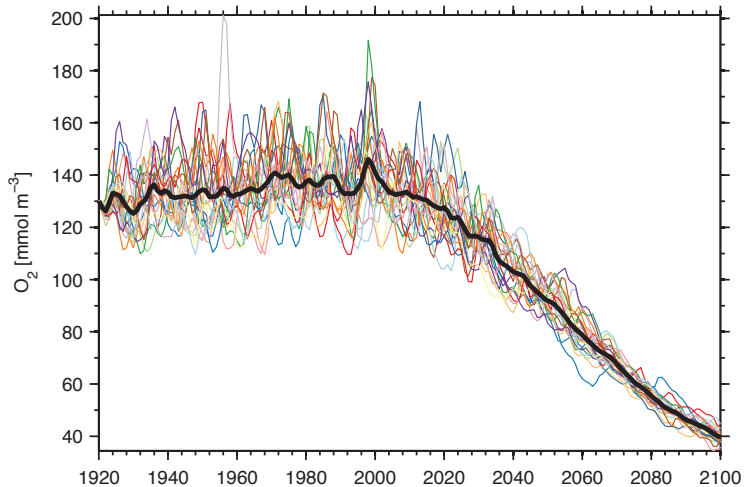
## CESM simulation of dissolved oxygen at Station P ( $\sigma_\theta = 26.5$ )



Long et al. 2016

# Natural variability can reinforce or oppose trends

## CESM simulation of dissolved oxygen at Station P ( $\sigma_\theta = 26.5$ )



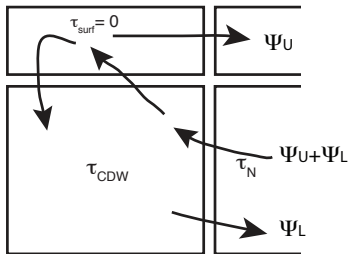
Long et al. 2016

# Mechanisms driving changes in carbon storage

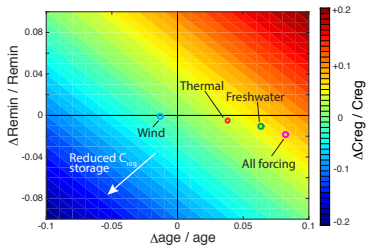
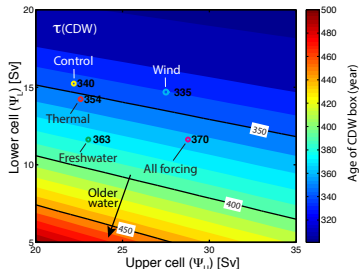
## Southern Ocean box model

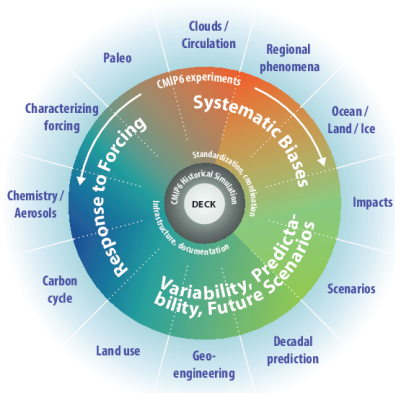
80°S

APF



- Weaker lower cell ( $\Psi_L$ ): ventilation age ( $\tau$ ) increases; stronger upper cell ( $\Psi_U$ ) partially compensates.
- Increased age ( $\tau$ ): greater  $C_{reg}$  storage; decrease in respiration rates ( $R$ ) weakly opposes.





DECK := Diagnostic, Evaluation and Characterization of Klima

*Eyring et al. 2016*

## Continuous and distributed organization

- Common experiments:
  - DECK
    1. AMIP historical (1979–2014)
    2. Pre-industrial control
    3. 1%/yr CO<sub>2</sub> increase
    4. Abrupt 4×CO<sub>2</sub>
  - CMIP6 historical simulation
    5. 1850–2014 under CMIP6 forcings
- CMIP-Endorsed modeling intercomparison projects

# CMIP6 Endorsed MIPs

|    |             |   |
|----|-------------|---|
| 1  | AerChemMIP  | Aerosols and Chemistry Model Intercomparison Project            |
| 2  | C4MIP       | Coupled Climate Carbon Cycle Model Intercomparison Project      |
| 3  | CFMIP       | Cloud Feedback Model Intercomparison Project                    |
| 4  | DAMIP       | Detection and Attribution Model Intercomparison Project         |
| 5  | DCPP        | Decadal Climate Prediction Project                              |
| 6  | FAFMIP      | Flux-Anomaly-Forced Model Intercomparison Project               |
| 7  | GeoMIP      | Geoengineering Model Intercomparison Project                    |
| 8  | GMMIP       | Global Monsoons Model Intercomparison Project                   |
| 9  | HighResMIP  | High Resolution Model Intercomparison Project                   |
| 10 | ISMIP6      | Ice Sheet Model Intercomparison Project for CMIP6               |
| 11 | LS3MIP      | Land Surface, Snow and Soil Moisture                            |
| 12 | LUMIP       | Land-Use Model Intercomparison Project                          |
| 13 | OMIP        | Ocean Model Intercomparison Project                             |
| 14 | PMIP        | Palaeoclimate Modelling Intercomparison Project                 |
| 15 | RFMIP       | Radiative Forcing Model Intercomparison Project                 |
| 16 | ScenarioMIP | Scenario Model Intercomparison Project                          |
| 17 | VolMIP      | Volcanic Forcings Model Intercomparison Project                 |
| 18 | CORDEX*     | Coordinated Regional Climate Downscaling Experiment             |
| 19 | DynVar*     | Dynamics and Variability of the Stratosphere-Troposphere System |
| 20 | SIMIP*      | Sea-Ice Model Intercomparison Project                           |
| 21 | VIACS AB*   | VIACS Advisory Board for CMIP6                                  |

\* "Diagnostic MIPs"