

# Ocean biogeochemistry

## CESM Tutorial

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Matthew C. Long

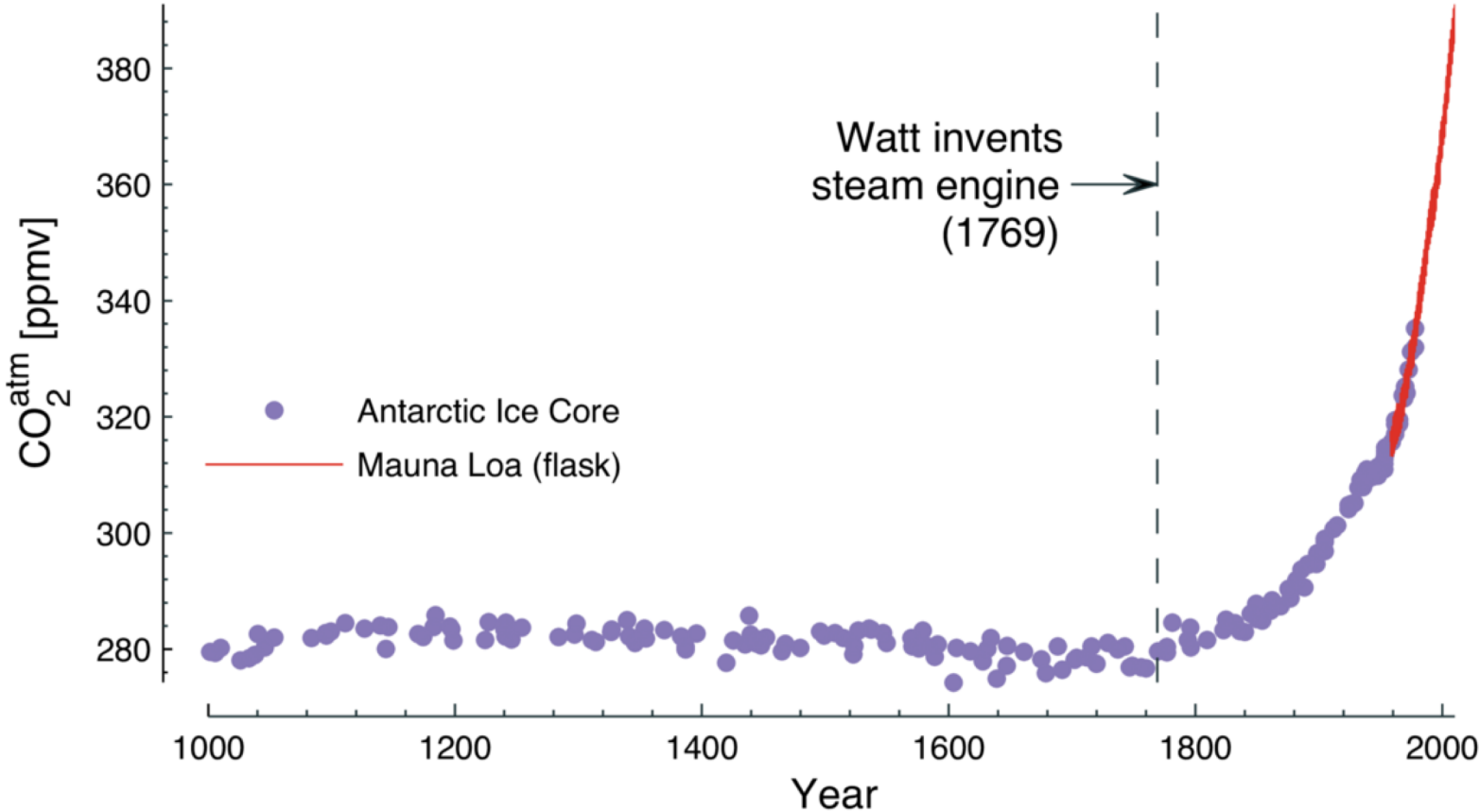
Climate and Global Dynamics Laboratory  
National Center for Atmospheric Research

August 2018



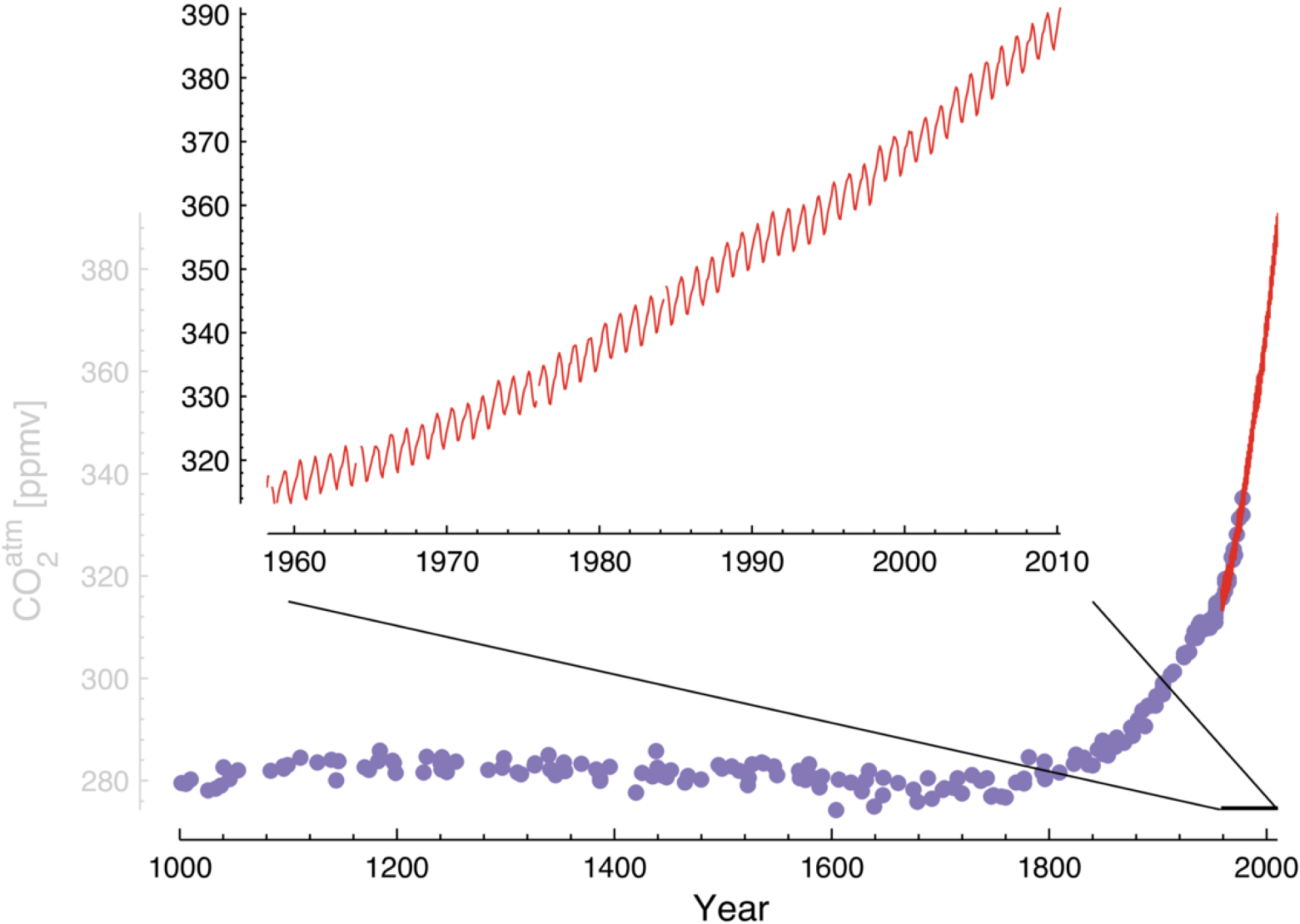
# Global carbon cycle

## Atmospheric CO<sub>2</sub>



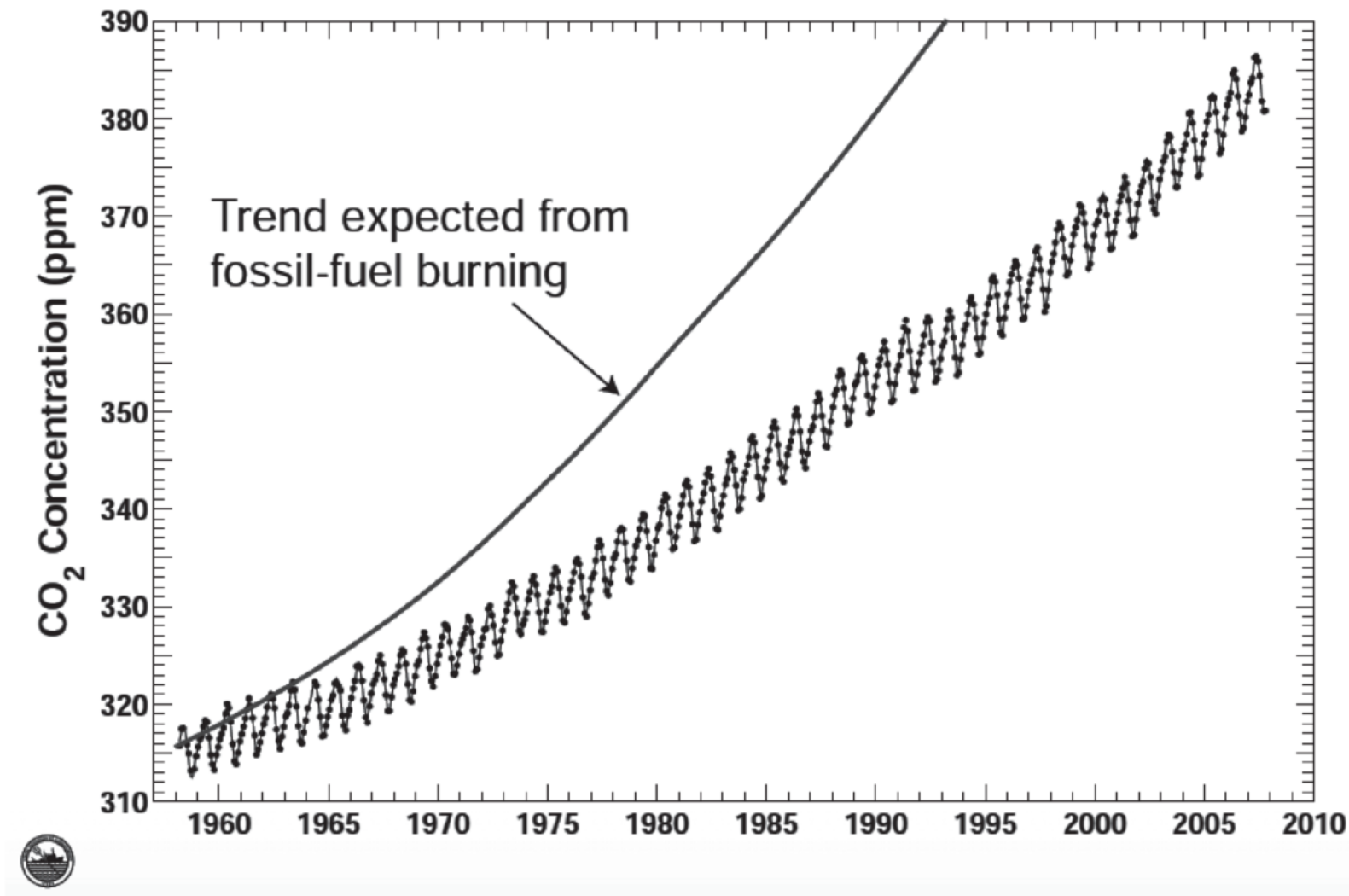
# Global carbon cycle

## Atmospheric CO<sub>2</sub>

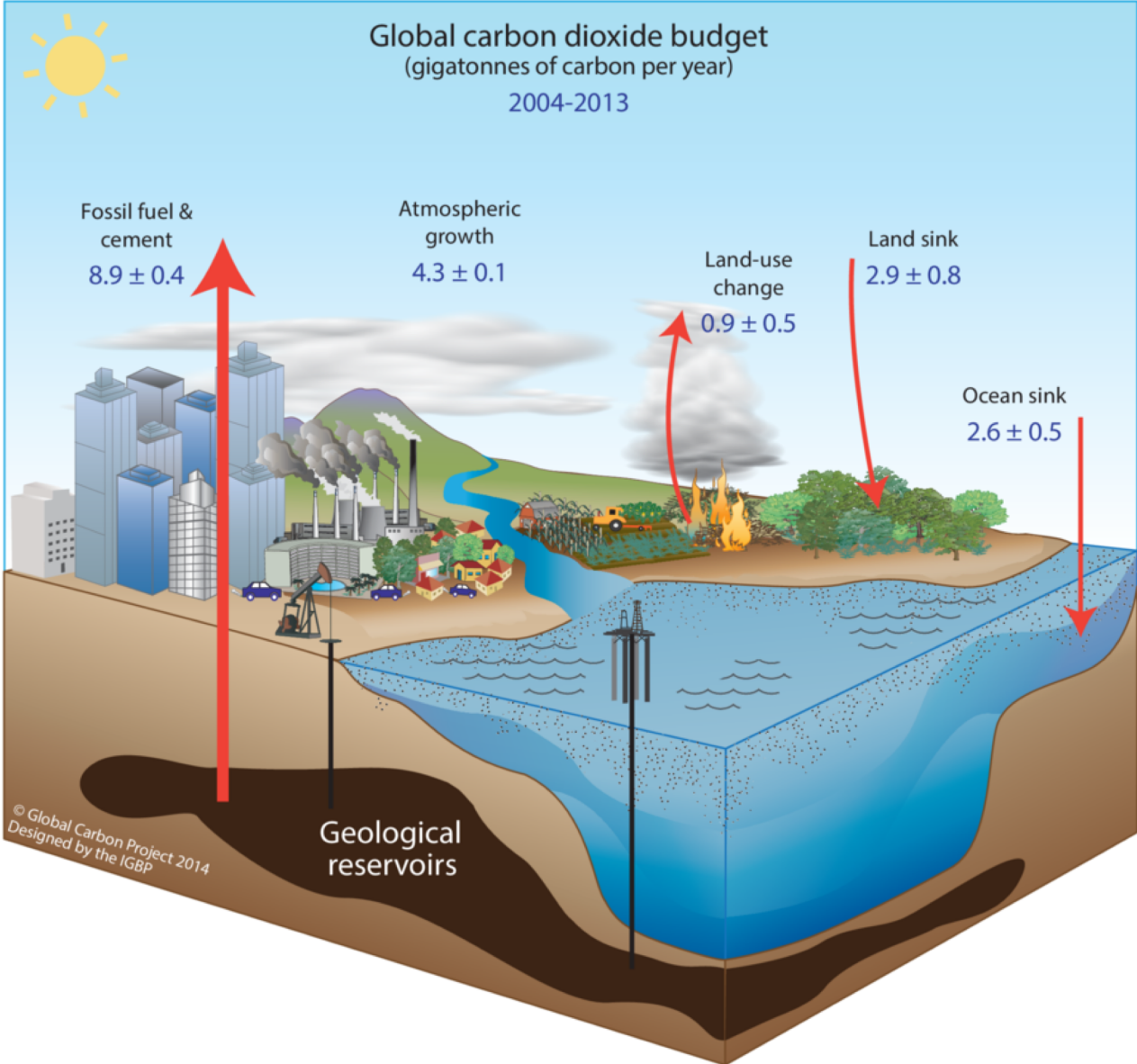


# CO<sub>2</sub> accumulation in the atmosphere mitigated by natural sinks

## Mauna Loa CO<sub>2</sub> Record



# Fate of anthropogenic CO<sub>2</sub>



## Ingredients for an ocean biogeochemistry model

1. Inorganic carbonate chemistry
  - Total  $\text{CO}_2$  in seawater depends on acid-base equilibria
2. Marine ecosystem dynamics (the 'biological pump')
  - Carbon and nutrient cycles are coupled via organic matter production
  - Sinking organic matter transfers carbon to the deep ocean

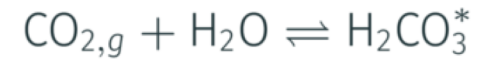
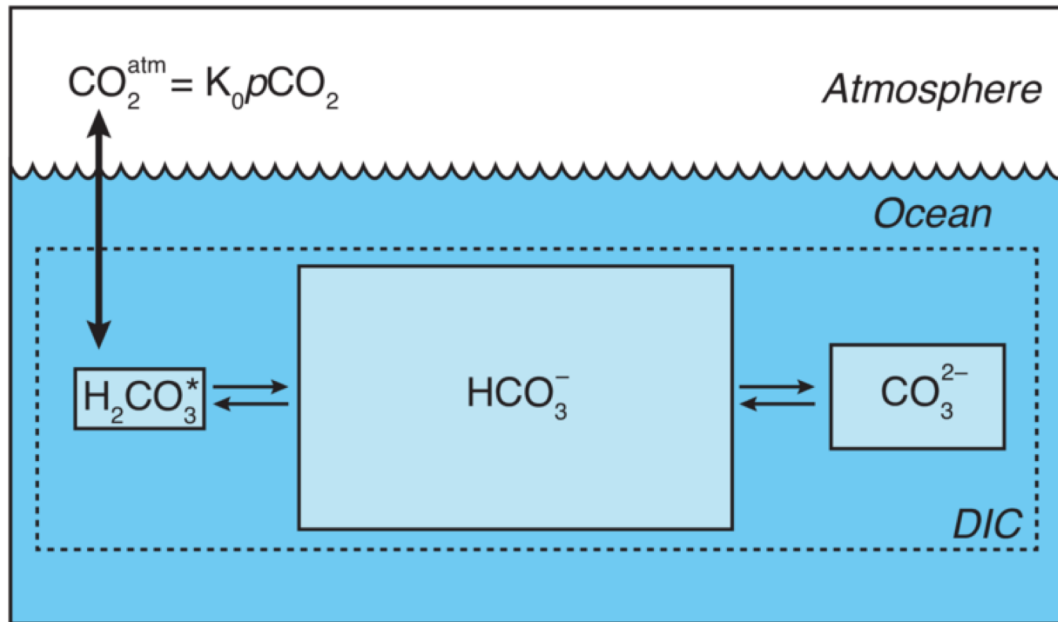
## Applications and validation

3. Flow-dependent biases in transient tracer uptake and mean state
4. Coupled carbon-climate feedbacks
5. Atmospheric  $\text{CO}_2$  distributions

# Air-sea gas exchange: CO<sub>2</sub>

## Dissolved inorganic carbon

$$DIC = \underbrace{[H_2CO_3^*]}_{\sim 0.5\%} + \underbrace{[HCO_3^-]}_{\sim 88.6\%} + \underbrace{[CO_3^{2-}]}_{\sim 10.9\%}$$

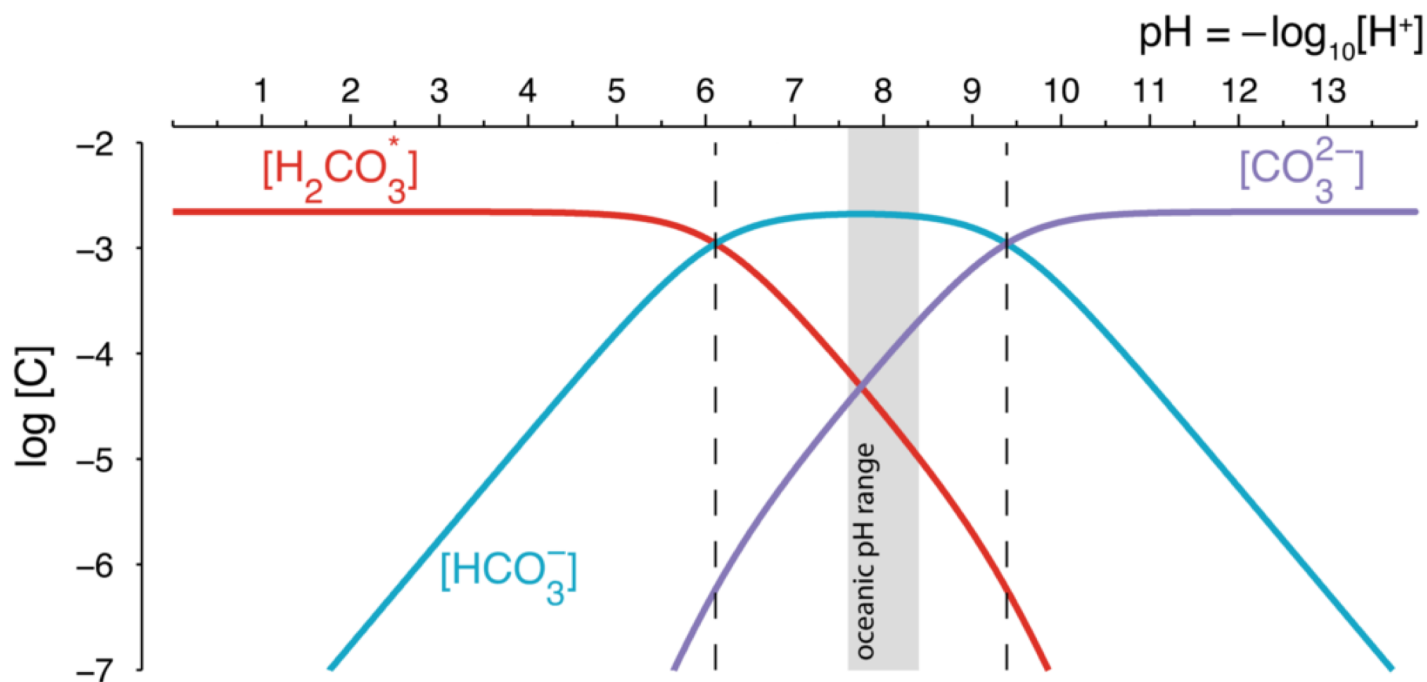


# Inorganic carbon chemistry: carbonate equilibria

Equilibrium relationships (empirically determined)

$$K_0 = \frac{[\text{H}_2\text{CO}_3^*]}{p\text{CO}_2}, \quad K_1 = \frac{[\text{H}^+][\text{HCO}_3^-]}{[\text{H}_2\text{CO}_3^*]}, \quad K_2 = \frac{[\text{H}^+][\text{CO}_3^{2-}]}{[\text{HCO}_3^-]}$$

Carbonate speciation





# Inorganic carbon chemistry: acid-base balance of seawater

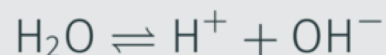
## Dissolved inorganic carbon (“total CO<sub>2</sub>”)

$$DIC = [\text{H}_2\text{CO}_3^*] + [\text{HCO}_3^-] + [\text{CO}_3^{2-}]$$

## Alkalinity (“buffer capacity”)

$$Alk = [\text{HCO}_3^-] + 2[\text{CO}_3^{2-}] + [\text{OH}^-] - [\text{H}^+] + [\text{B}(\text{OH})_4^-] + \text{minor bases}$$

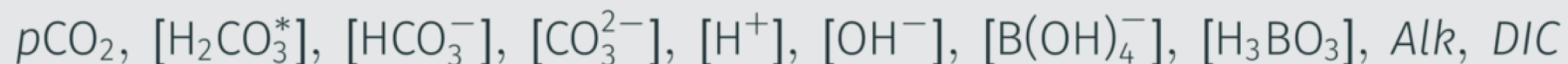
## Additional reactions affecting pH



$$K_w = [\text{H}^+][\text{OH}^-], \quad K_B = \frac{[\text{H}^+][\text{B}(\text{OH})_4^-]}{[\text{H}_3\text{BO}_3]}$$

# Inorganic carbon chemistry: system of equations

## Unknowns



## Equations

Along with the definitions of *Alk* and *DIC*, we have

$$K_0 = \frac{[\text{H}_2\text{CO}_3^*]}{p\text{CO}_2}, K_1 = \frac{[\text{H}^+][\text{HCO}_3^-]}{[\text{H}_2\text{CO}_3^*]}, K_2 = \frac{[\text{H}^+][\text{CO}_3^{2-}]}{[\text{HCO}_3^-]},$$

$$K_w = [\text{H}^+][\text{OH}^-], K_B = \frac{[\text{H}^+][\text{B}(\text{OH})_4^-]}{[\text{H}_3\text{BO}_3]},$$

and total boron conservation, described by constant proportionality to salinity

$$B_T = [\text{B}(\text{OH})_4^-] + [\text{H}_3\text{BO}_3] = c \cdot S$$

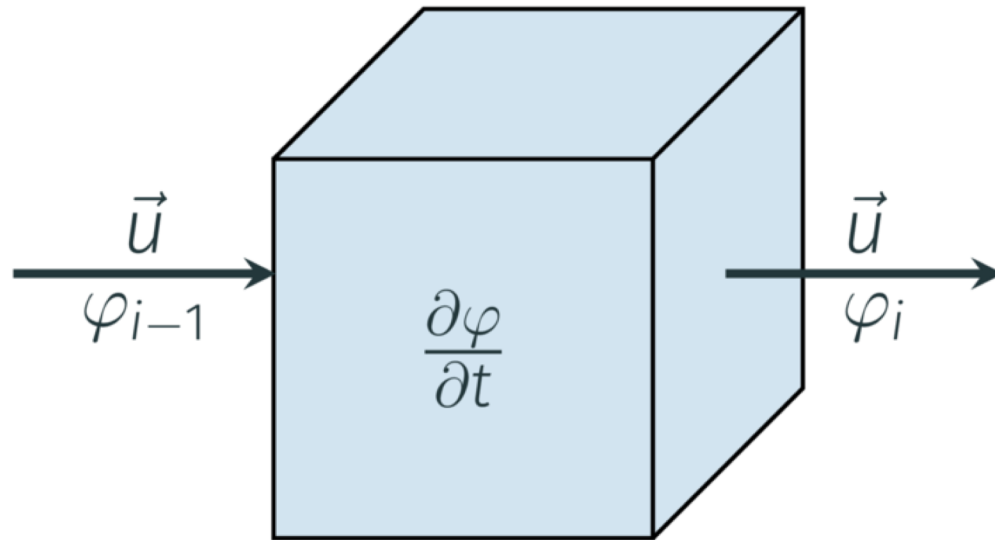
- 8 equations; 10 unknowns: need to specify 2 unknowns.

# Modeling ocean carbon: prognostic tracers $DIC$ and $Alk$

Prognostic variables ( $\varphi = DIC, Alk$ )

$$\frac{\partial \varphi}{\partial t} + \nabla \cdot (\vec{u} \varphi) - \nabla \cdot (K \nabla \varphi) = J(\varphi)$$

where  $J(\varphi) =$  source/sink terms (biology!).



## Prognostic variables ( $\varphi = DIC, Alk$ )

$$\frac{\partial \varphi}{\partial t} + \nabla \cdot (\vec{u}\varphi) - \nabla \cdot (K\nabla\varphi) = J(\varphi)$$

where  $J(\varphi)$  = source/sink terms (biology!).

## Diagnostic variables

1. Rearrange expression for *Alk*, solve for  $[H^+]$  numerically (Newton-Raphson)

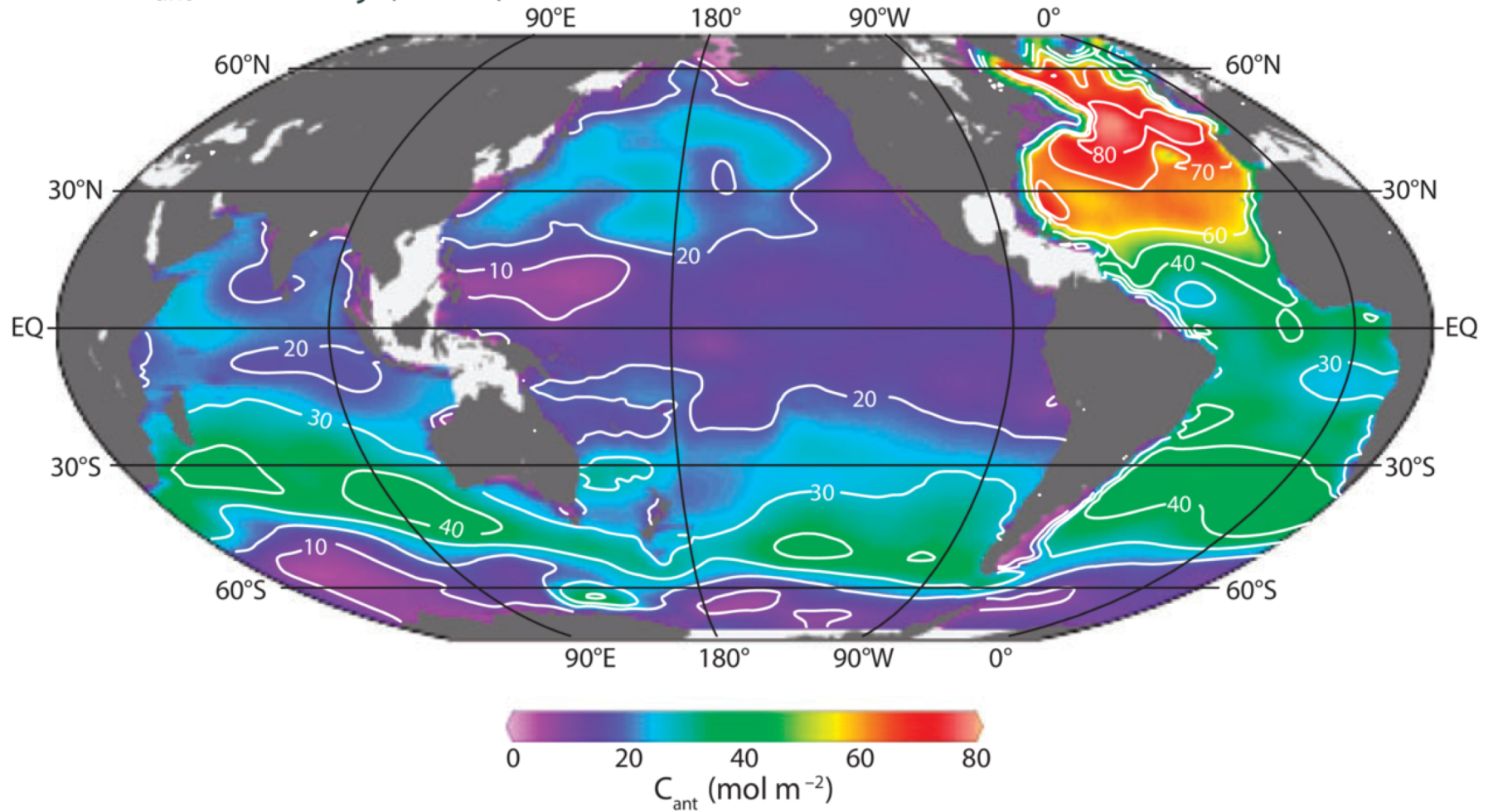
$$2. [HCO_3^-] = \frac{(DIC)K_1[H^+]}{[H^+]^2 + K_1[H^+] + K_1K_2}, [CO_3^{2-}] = \frac{(DIC)K_1K_2}{[H^+]^2 + K_1[H^+] + K_1K_2}$$

$$3. [H_2CO_3^*] = \frac{[H^+][HCO_3^-]}{K_1}$$

$$4. pCO_2 = \frac{[H_2CO_3^*]}{K_0} \rightarrow \text{sea-to-air flux: } F_{CO_2} = (1 - f_{ice})X_{kw}K_0(pCO_2^{ocn} - pCO_2^{atm})$$

# Anthropogenic CO<sub>2</sub> uptake is mediated by circulation

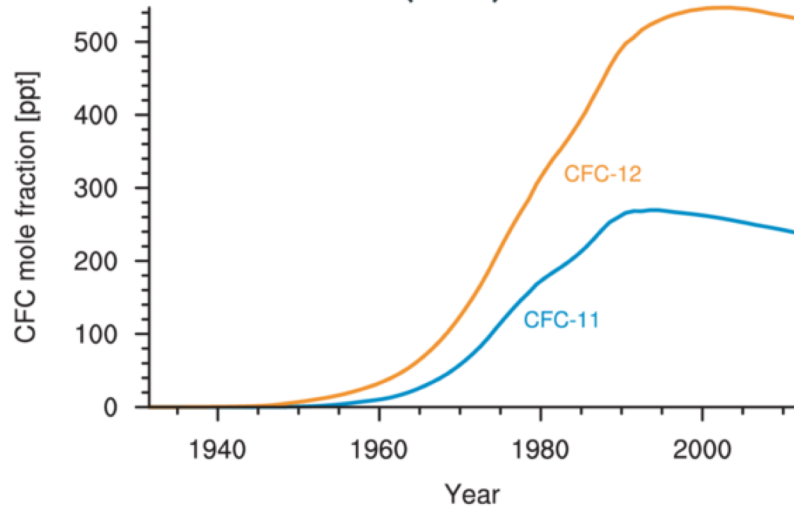
## Ocean C<sub>ant</sub> inventory (1990s)



Sabine et al. (2004) via  
Sabine & Tanhua (2010)

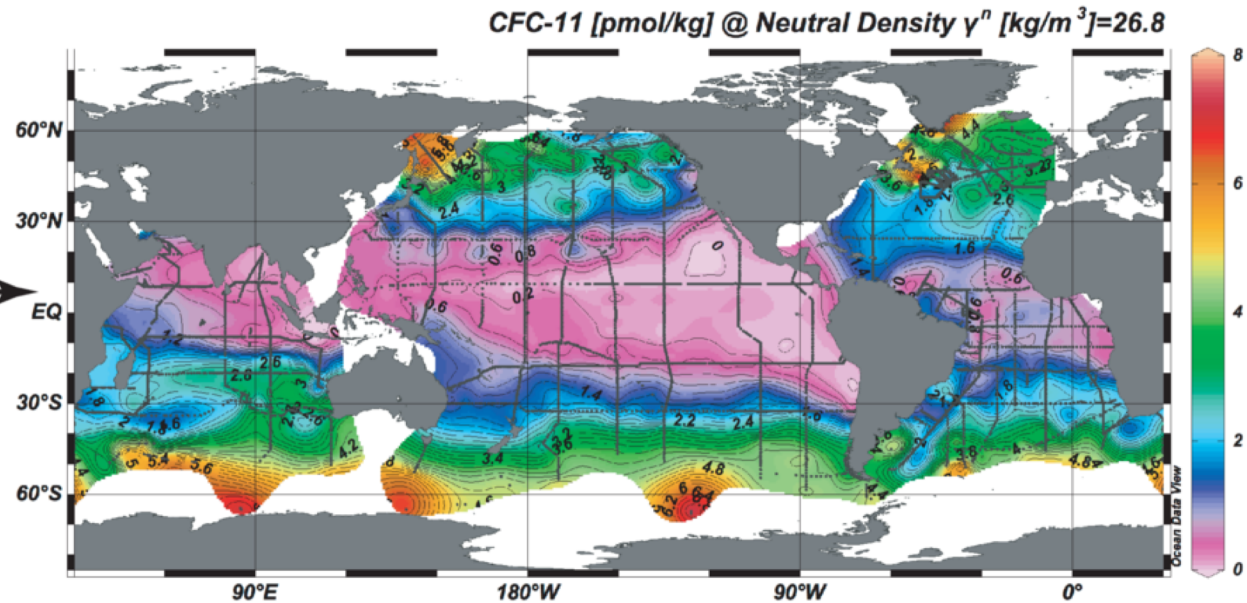
# Observational constraints on ventilation processes

## Chlorofluorocarbons (CFC)



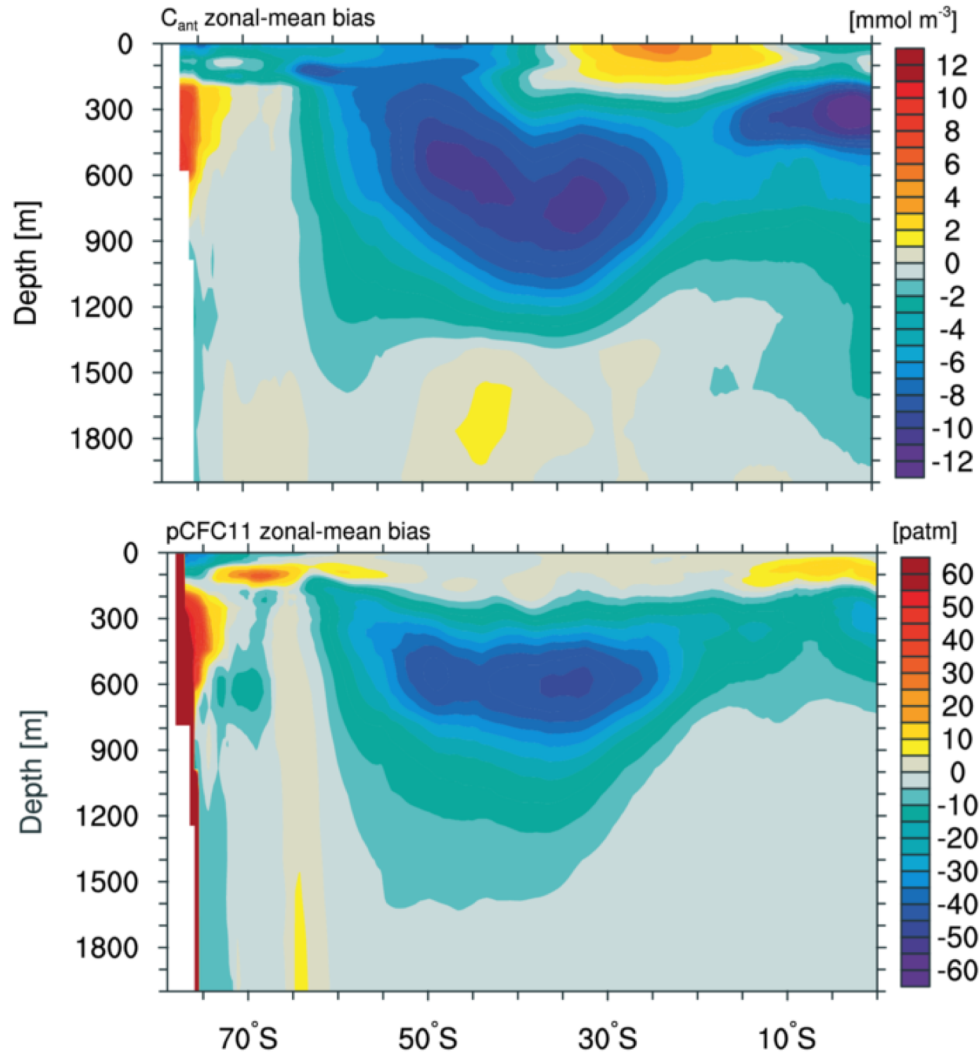
← Atmospheric history

Ocean observations →



# Importance of realistic physics: Weak mode & intermediate water formation

## CESM1: $C_{ant}$ and pCFC biases



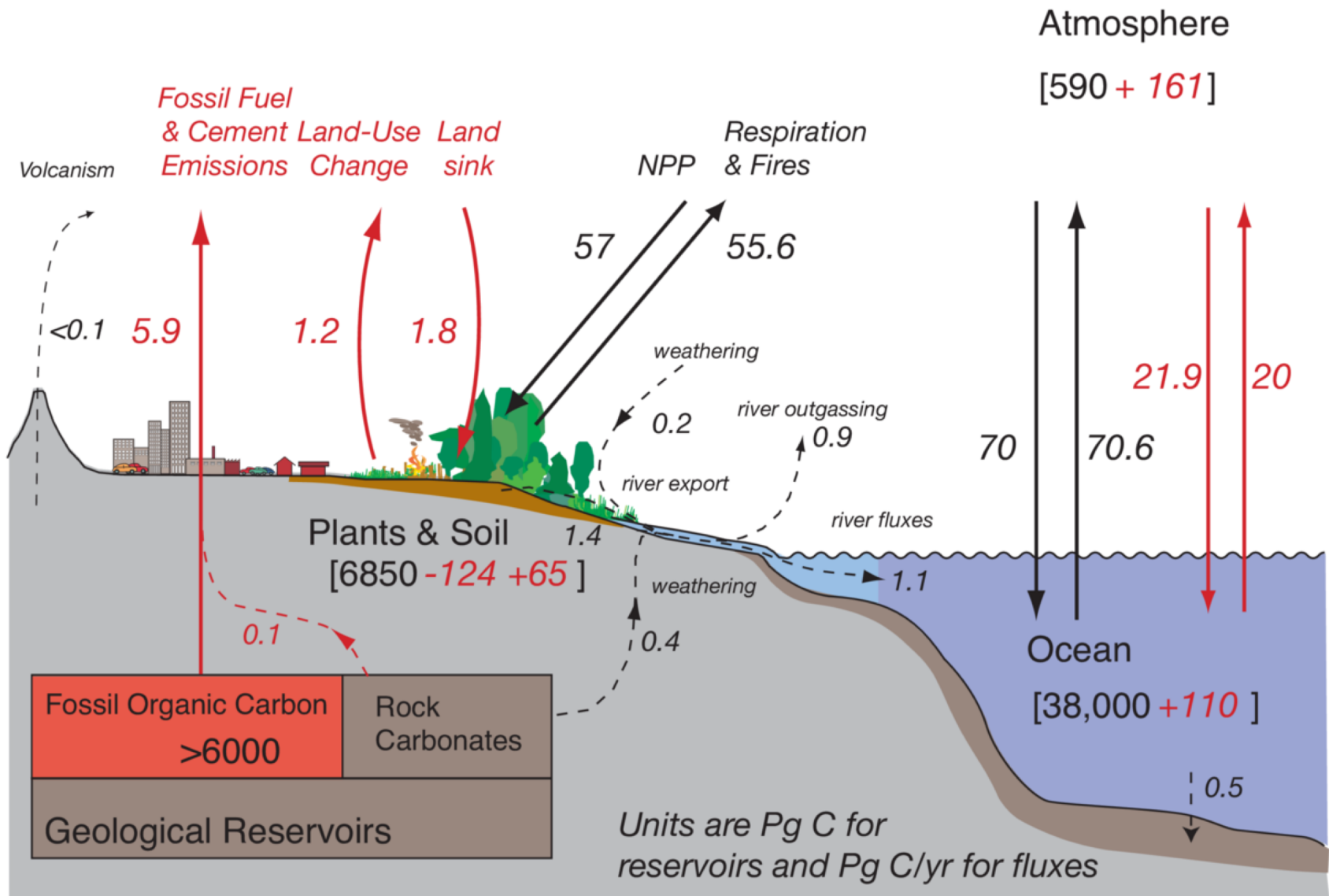
### Hypotheses

- Mesoscale flow features;
- Vertical mixing;
- Missing physics: waves (i.e., Langmuir turbulence)?

after Long et al., 2013

# The ocean contains a vast natural C reservoir

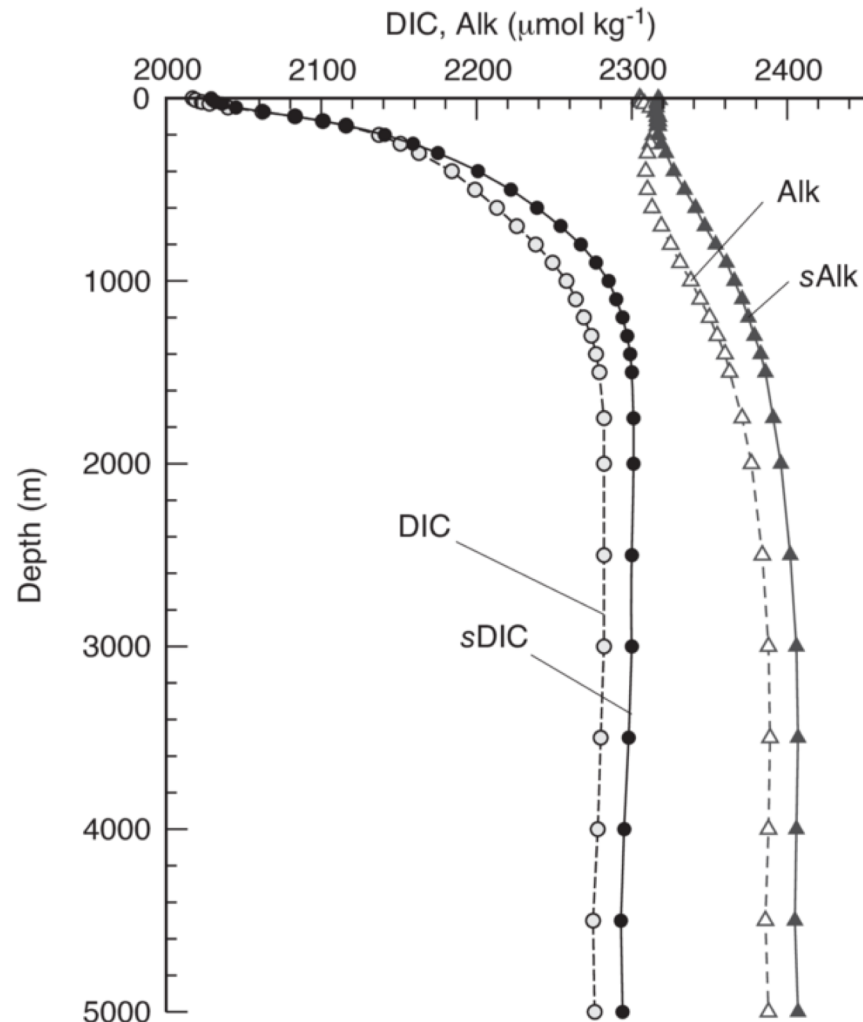
## The global carbon budget (c. 1990s)



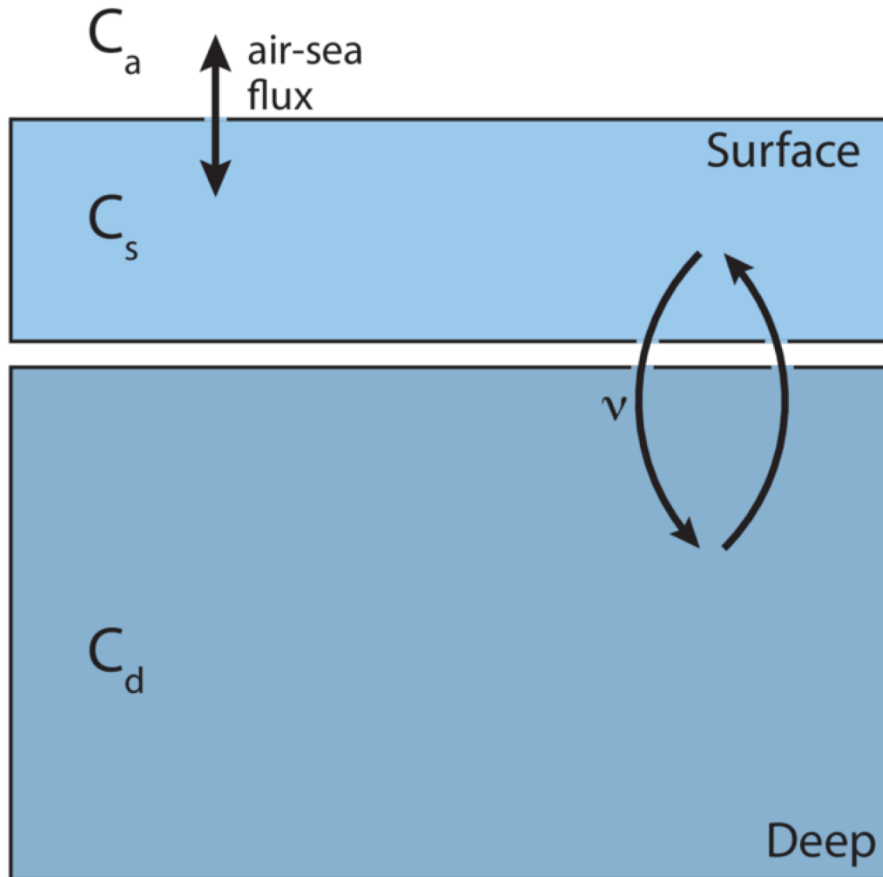


# Variation of DIC with depth

Observed global-mean profile



# Circulation homogenizes the ocean



Mass balance (deep box)

$$V_d \frac{dC_d}{dt} = \nu (C_s - C_d)$$

where

$V_d$  = Volume of the deep box,

$\nu$  = Volume exchange rate,

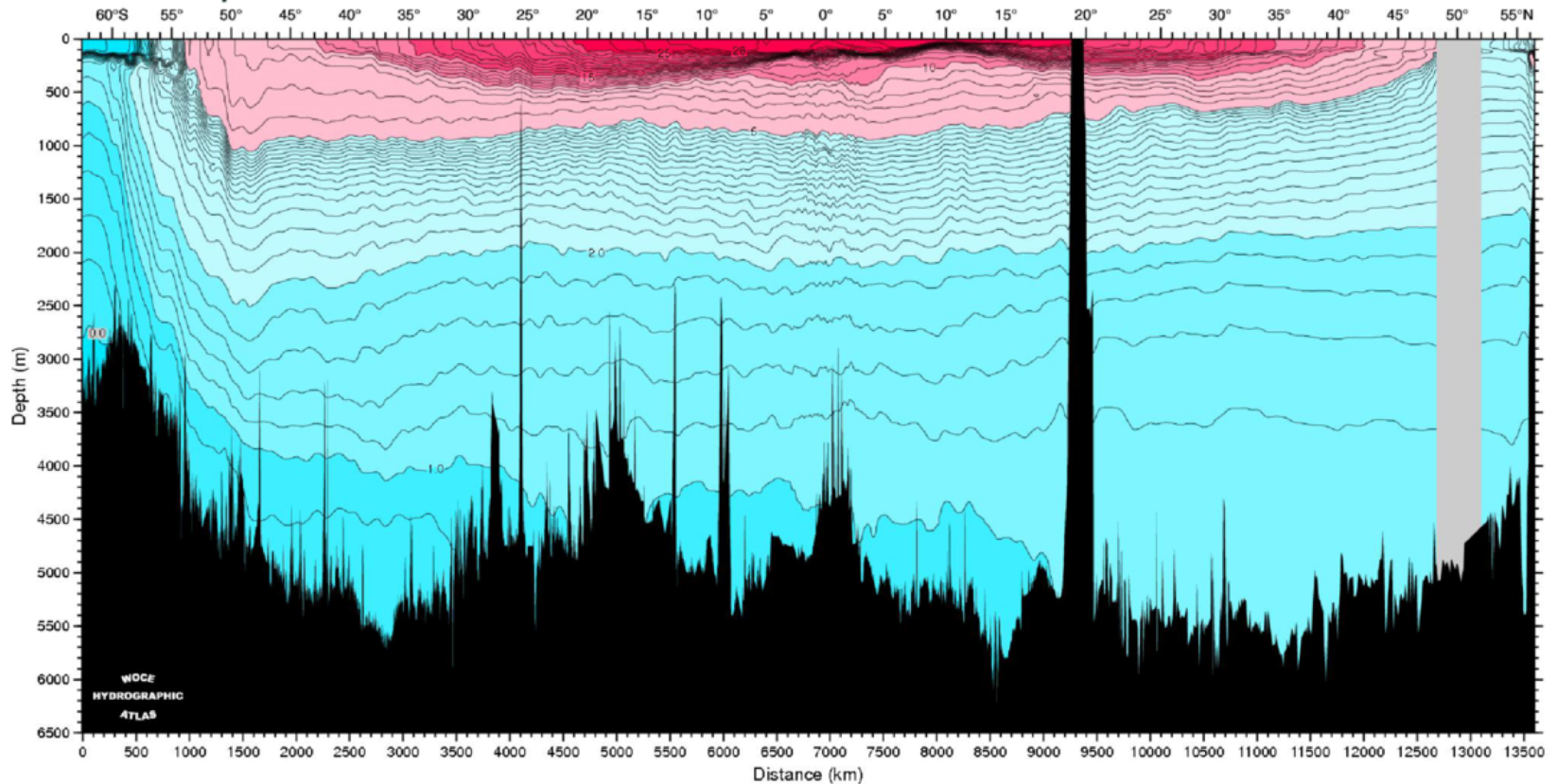
$C_{s,d}$  = Concentrations in surface (s)  
and deep (d) boxes.

Steady-state

$$C_d = C_s$$

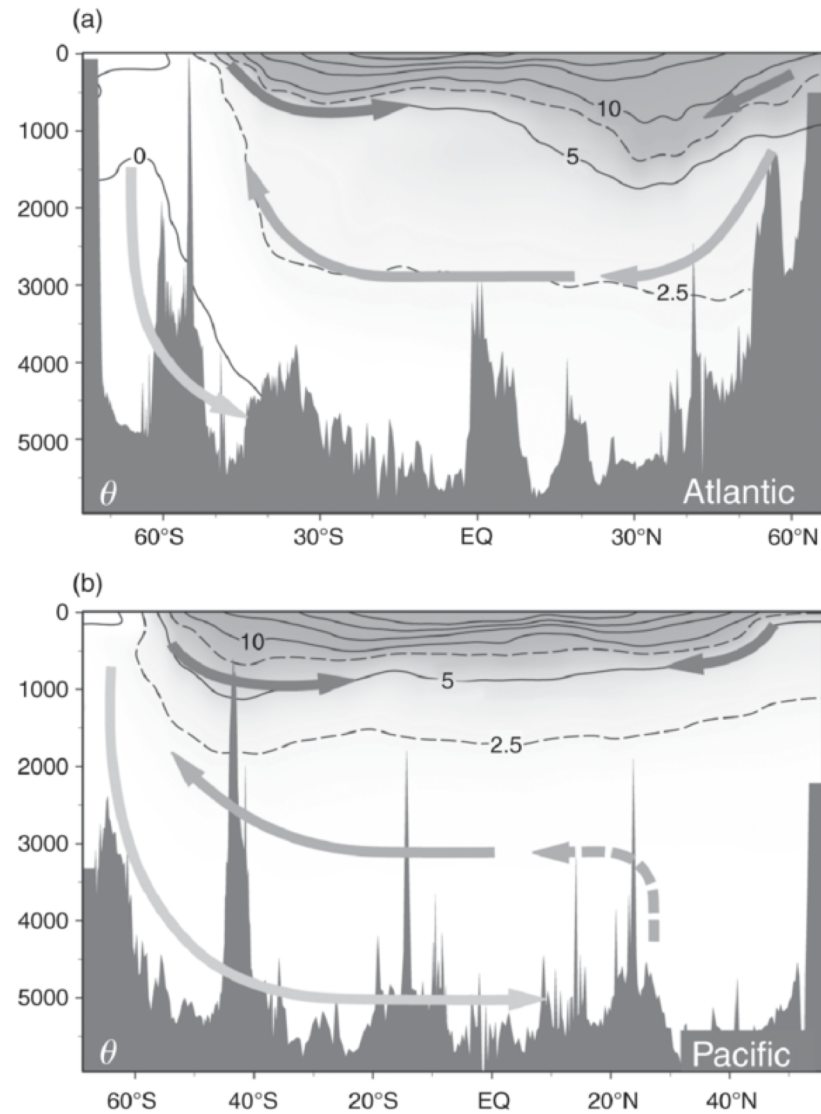
# Properties along P16: Potential temperature

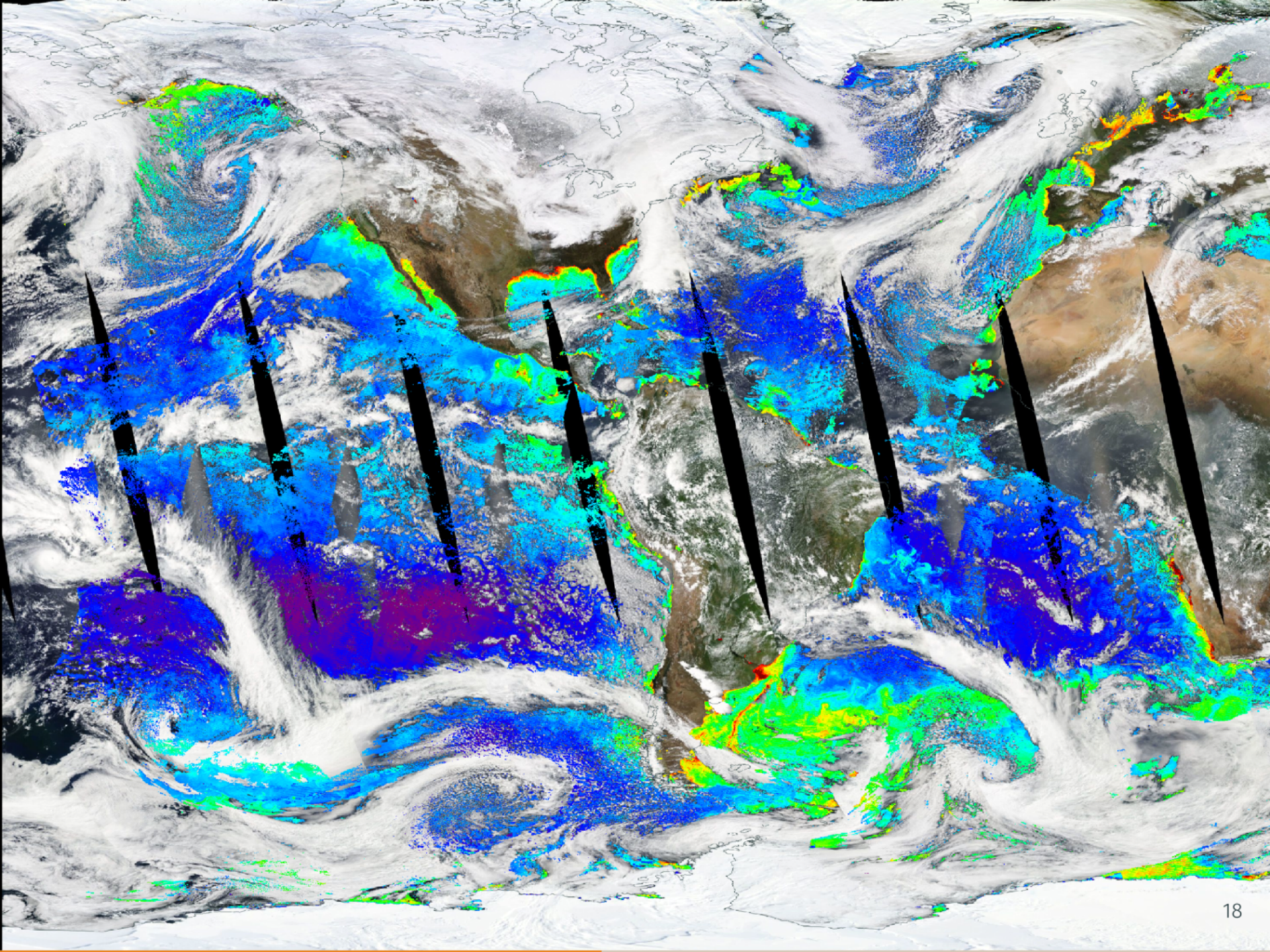
## Potential temperature



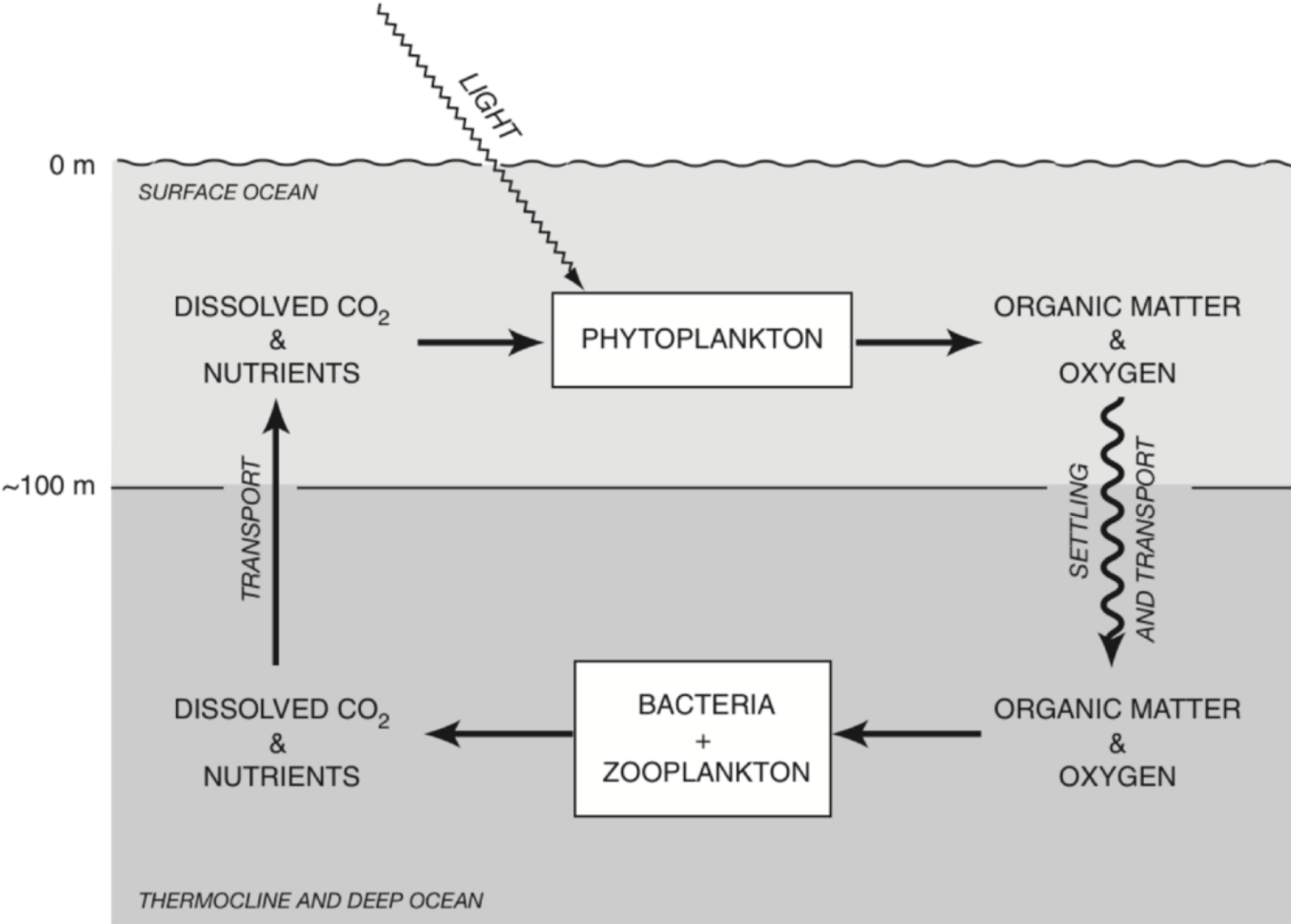
Potential temperature := the temperature if at the surface, i.e. accounting for pressure

# More realistic (cartoon of) ocean circulation





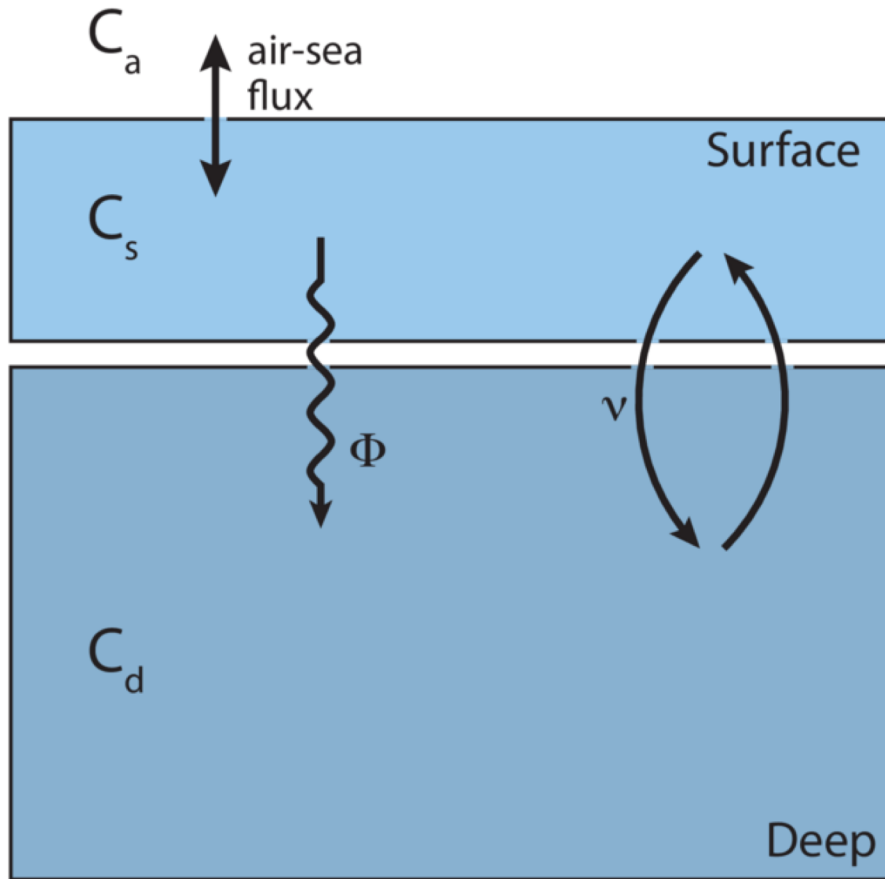
# Marine carbon cycle summary



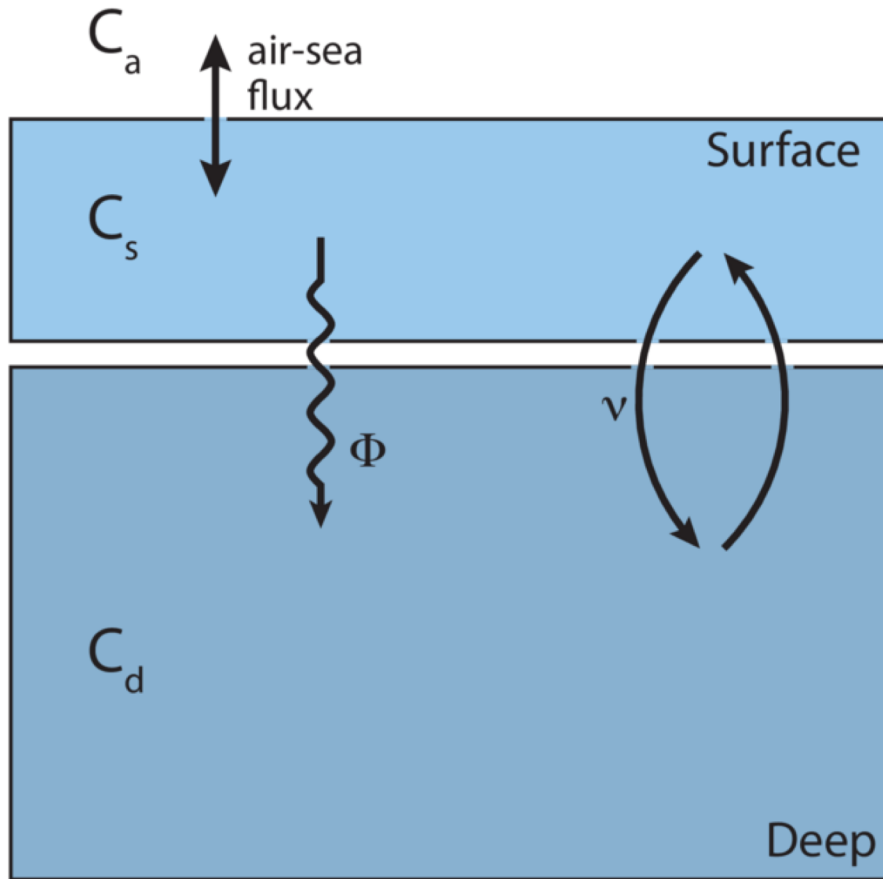
# The vertical DIC gradient is enhanced by the biological pump

Mass balance (deep box)

$$V_d \frac{dC_d}{dt} = \Phi + \nu (C_s - C_d)$$



# The vertical DIC gradient is enhanced by the biological pump



Mass balance (deep box)

$$V_d \frac{dC_d}{dt} = \Phi + \nu (C_s - C_d)$$

Steady-state

$$\Phi = \nu (C_d - C_s)$$

The vertical gradient

$$\frac{\Phi}{\nu} = (C_d - C_s)$$

where

$V_d$  = Volume of the deep box,

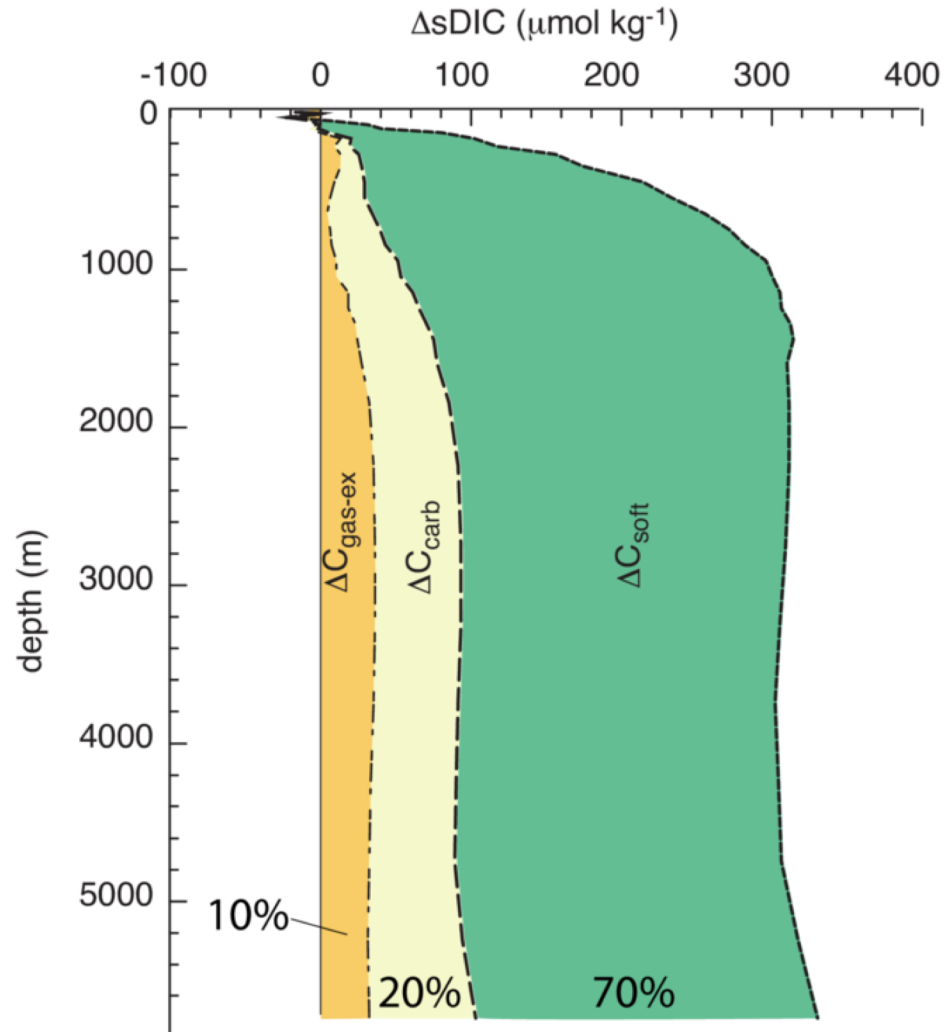
$\nu$  = Volume exchange rate,

$\Phi$  = Remineralization of sinking organic matter, and

$C_{s,d}$  = Concentrations in surface (s) and deep (d) boxes.



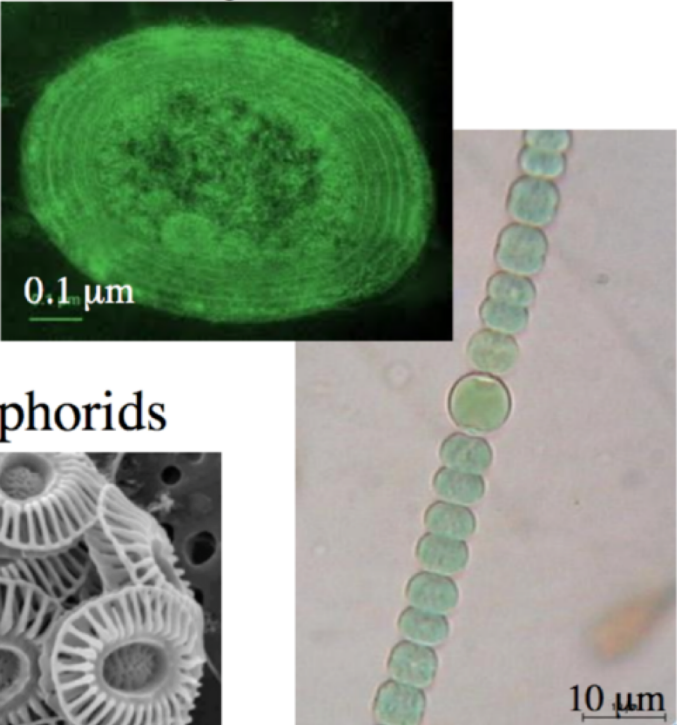
# Contribution of carbon pumps to interior DIC



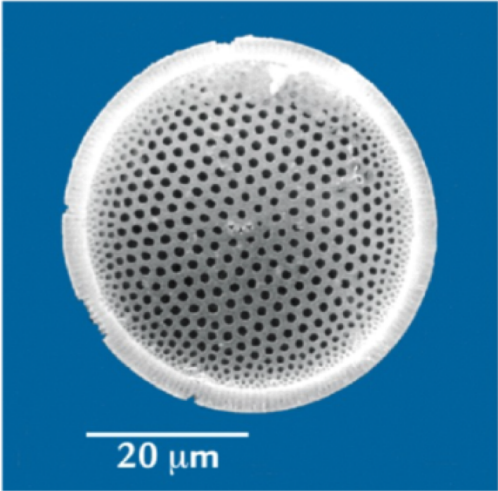
Sarmiento and Gruber 2006

# Major oceanic primary producers

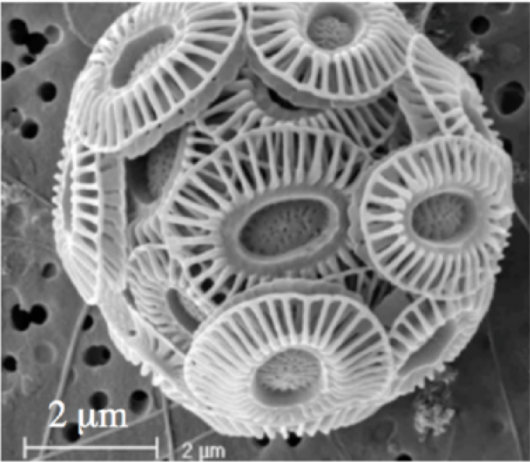
### Cyanobacteria



### Diatoms



### Coccolithophorids



### Dinoflagellates



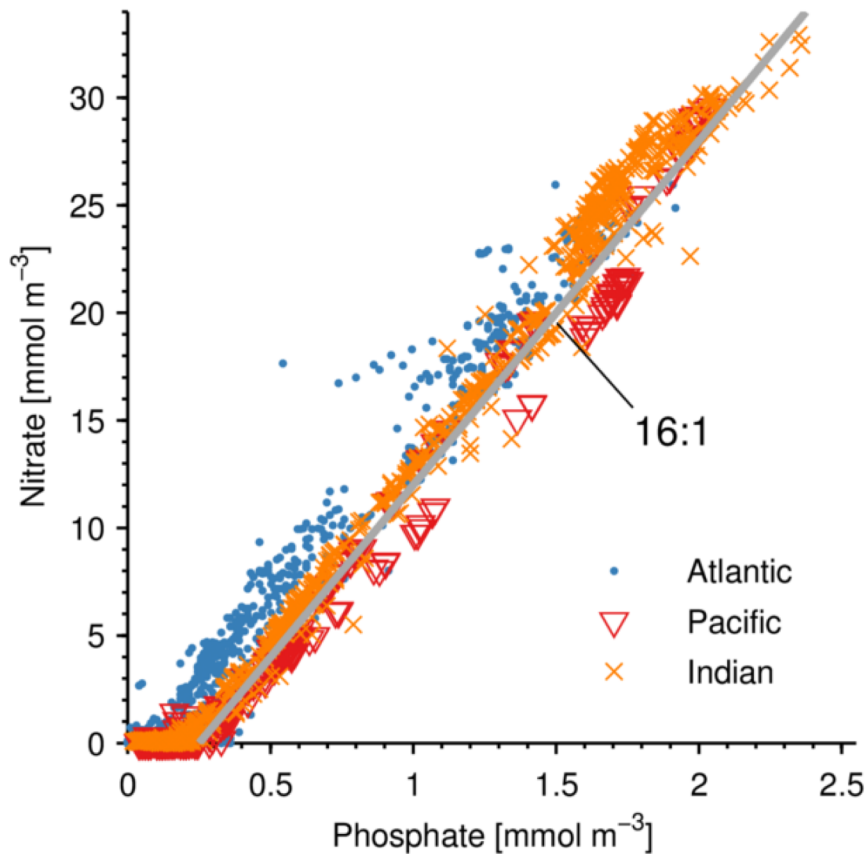
Figure Sources: Ruddiman 3-17, VIMS

# Organic matter production: carbon and nutrient cycles are coupled

## Organic matter production



## Relationship between $\text{NO}_3^-$ and $\text{PO}_4^{3-}$



## Nutrient utilization ratios

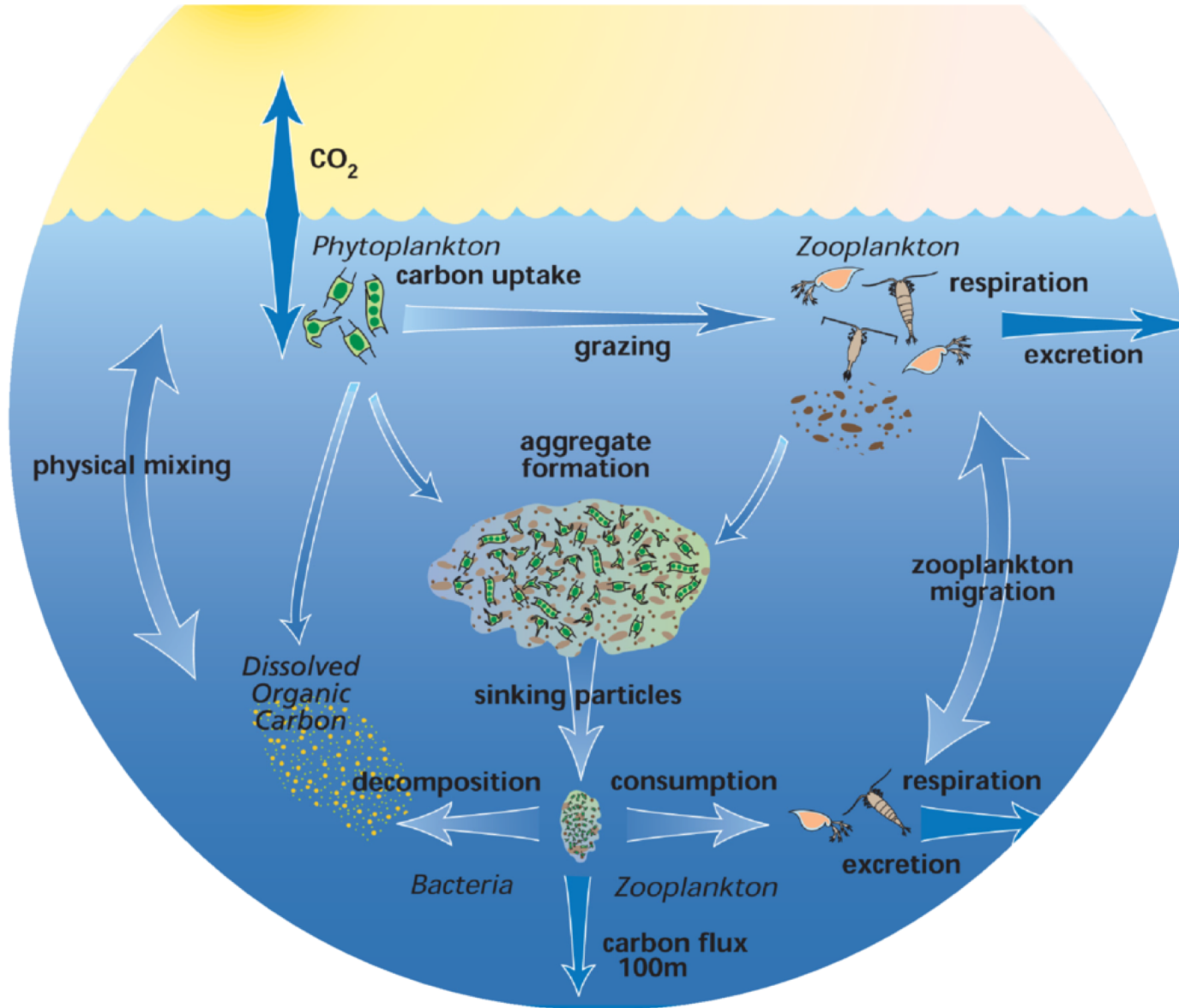
C:N:P:O<sub>2</sub> = 117:16:1:−170

Anderson & Sarmiento (1994)

P reservoir ( $\int P dV$ ): geologically controlled slow turnover ( $\sim 50$  ky).

N reservoir ( $\int N dV$ ): biologically controlled fast turnover ( $\sim 2$  ky).

# The biological pump is a product of ecosystem function



## Phytoplankton

$$\frac{dP}{dt} = \mu_0 \left( \frac{N}{K_N + N} \right) \left( 1 - e^{\alpha E / \mu_0} \right) P - g \left( \frac{P}{K_P + P} \right) Z - m_P P$$

Nutrient limitation      Light limitation      Grazing      Mortality

## Zooplankton

$$\frac{dZ}{dt} = \gamma g \left( \frac{P}{K_P + P} \right) Z - m_Z Z$$

## Nutrient

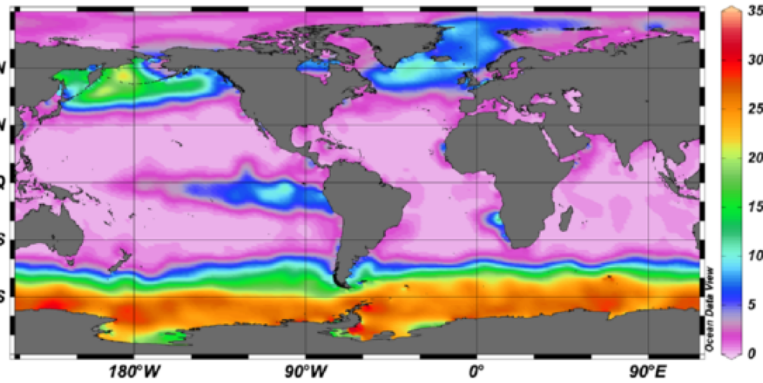
$$\frac{dN}{dt} = -\mu_0 \left( \frac{N}{K_N + N} \right) \left( 1 - e^{\alpha E / \mu_0} \right) P + (1 - \gamma) g \left( \frac{P}{K_P + P} \right) Z + m_P P + m_Z Z$$

- Three coupled, ordinary differential equations
- Mass conserving
- 3 state variables (NPZ), 8 parameters ( $\mu_0, K_N, \alpha, g, K_P, m_P, m_Z, \gamma$ )

# Plankton functional types (PFTs)

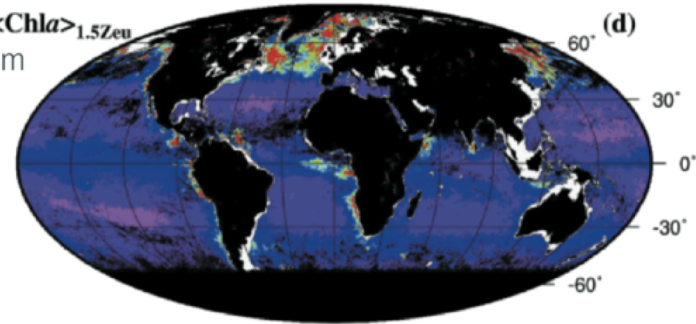
## Environmental variability

Nitrate [ $\mu\text{mol/l}$ ] @ Depth [m]=0

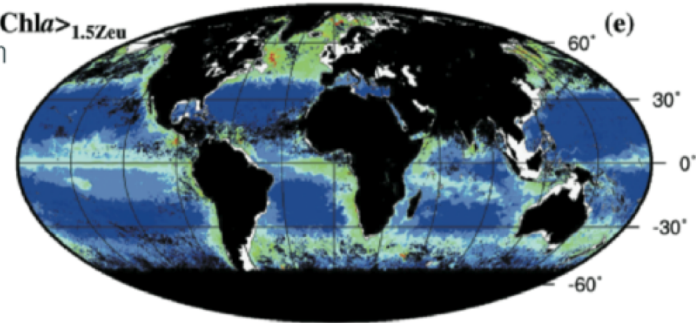


## Biogeography

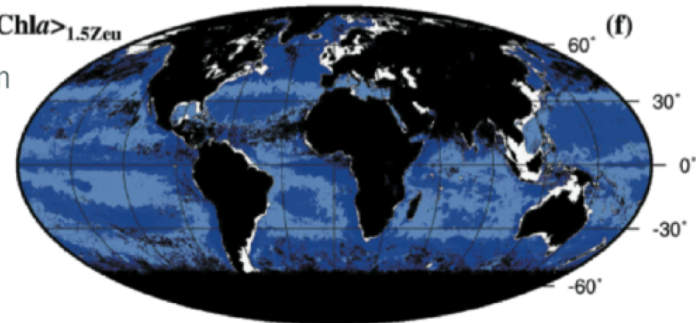
micro- $\langle\text{Chla}\rangle_{1.5Z_{eu}}$   
20–200  $\mu\text{m}$



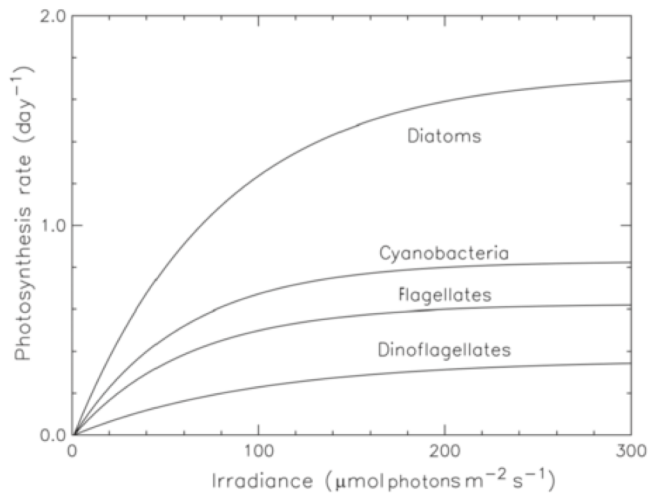
nano- $\langle\text{Chla}\rangle_{1.5Z_{eu}}$   
2–20  $\mu\text{m}$



pico- $\langle\text{Chla}\rangle_{1.5Z_{eu}}$   
0.2–2  $\mu\text{m}$



## Physiological specialization



Uitz et al. 2006

# Plankton functional types (PFTs)

## Definition

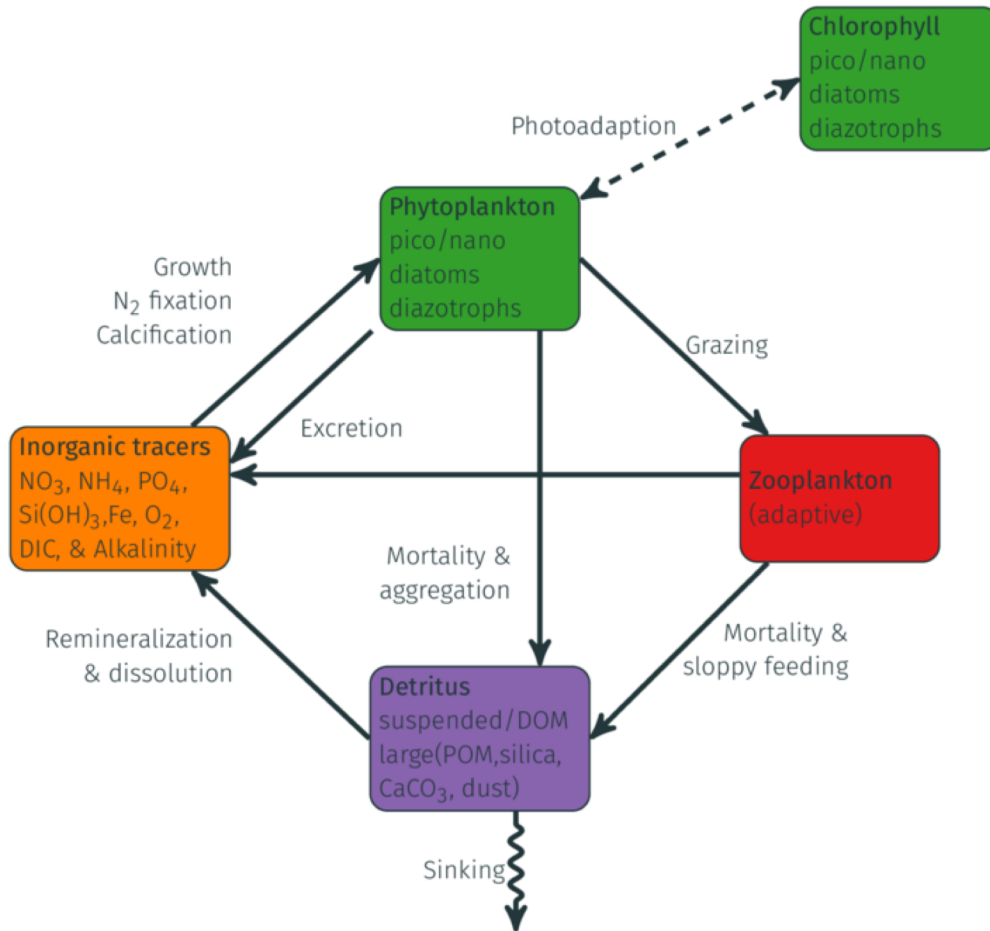
Conceptual grouping of phytoplankton species by ecological or biogeochemical function.

## Examples

- Nitrogen fixers (e.g., *Trichodesmium*)
- Calcifiers (e.g., coccolithophores)
- Silicifiers (e.g., diatoms)
- Dimethyl sulfide (DMS) producers (e.g., *Phaeocystis*)

Robust prediction requires representation of key processes; e.g., export production may change with climate due to ecosystem shifts.

# CESM Biogeochemical Element Model (BEC)



- 4 Plankton functional types
  - 3 autotrophs, 1 grazer
  - implicit calcifiers
  - explicit N fixers
- Nutrients: N, P, Si, Fe
- Fixed C:N stoichiometry
- Variable P:C, Fe:C, Si:C, & Chl:C
- Implicit treatment of sinking detritus
- Dynamic Fe cycle with prognostic Fe-binding ligand

## References:

Moore et al., *Deep Sea Res.*, 2002.

Moore, Doney, & Lindsay, *GBC*, 2004.

Moore & Braucher, *Biogeosciences*, 2008.

Moore et al., *J. Climate*, 2013.

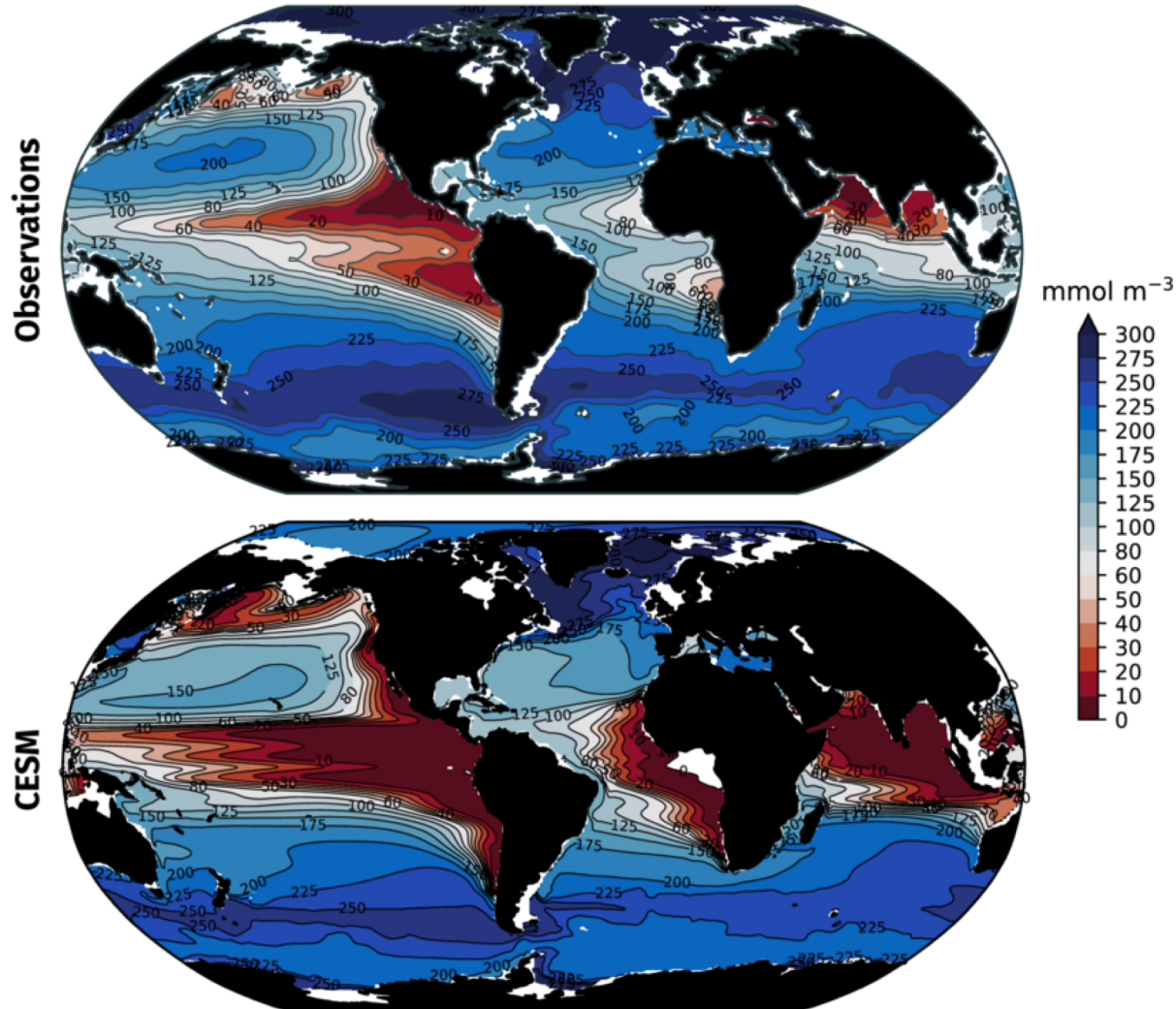


## Known gaps in CESM ocean biogeochemistry

- Calcification & open ocean  $\text{CaCO}_3$  dissolution rates are independent of saturation state ( $\Omega$ );
- Riverine inputs of BGC tracers are prescribed;
- C, N, P, Si,  $\text{CaCO}_3$  buried in sediments are lost from the system;
- No treatment of BGC in sea-ice;
- No explicit particulate organic matter pool;
- No explicit heterotrophic bacteria;
- Focus on lower trophic levels; limited diversity.

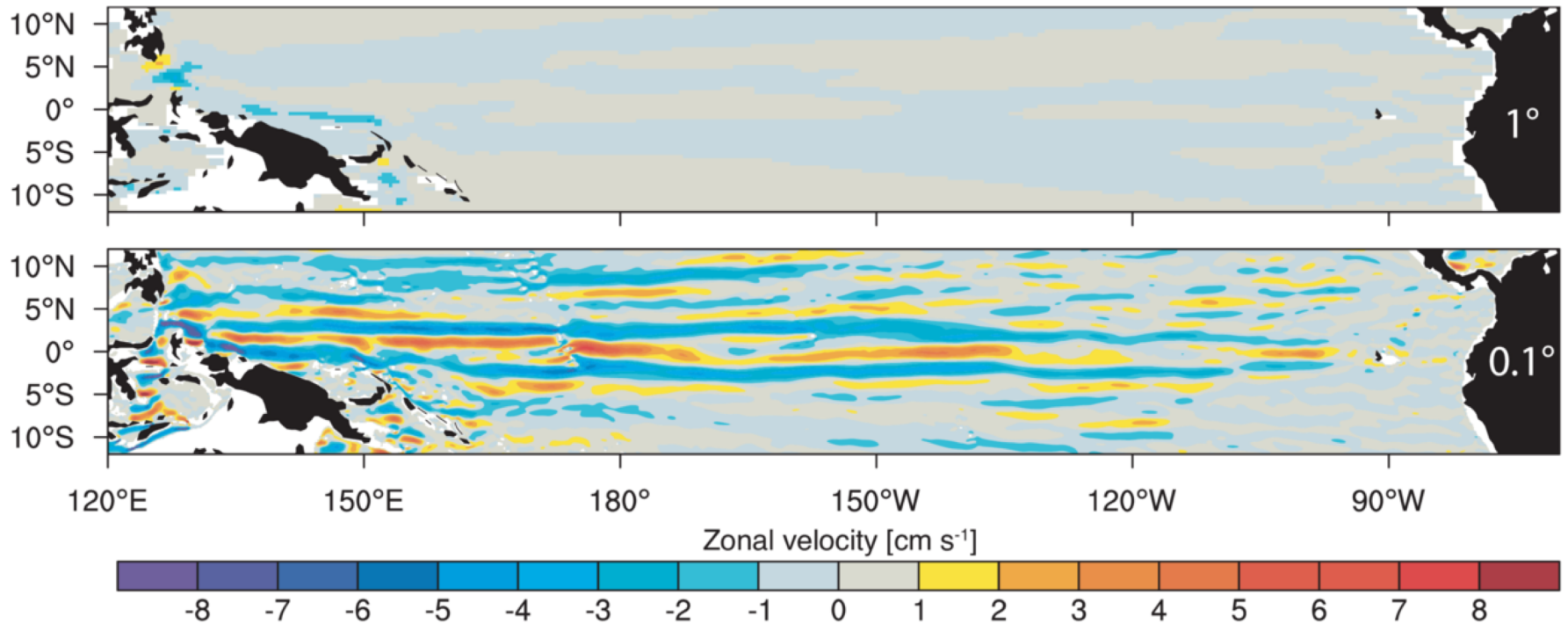
# A persistent bias in Earth system models: Extensive OMZs

World Ocean Atlas Comparison: Thermocline (400–600 m) dissolved oxygen



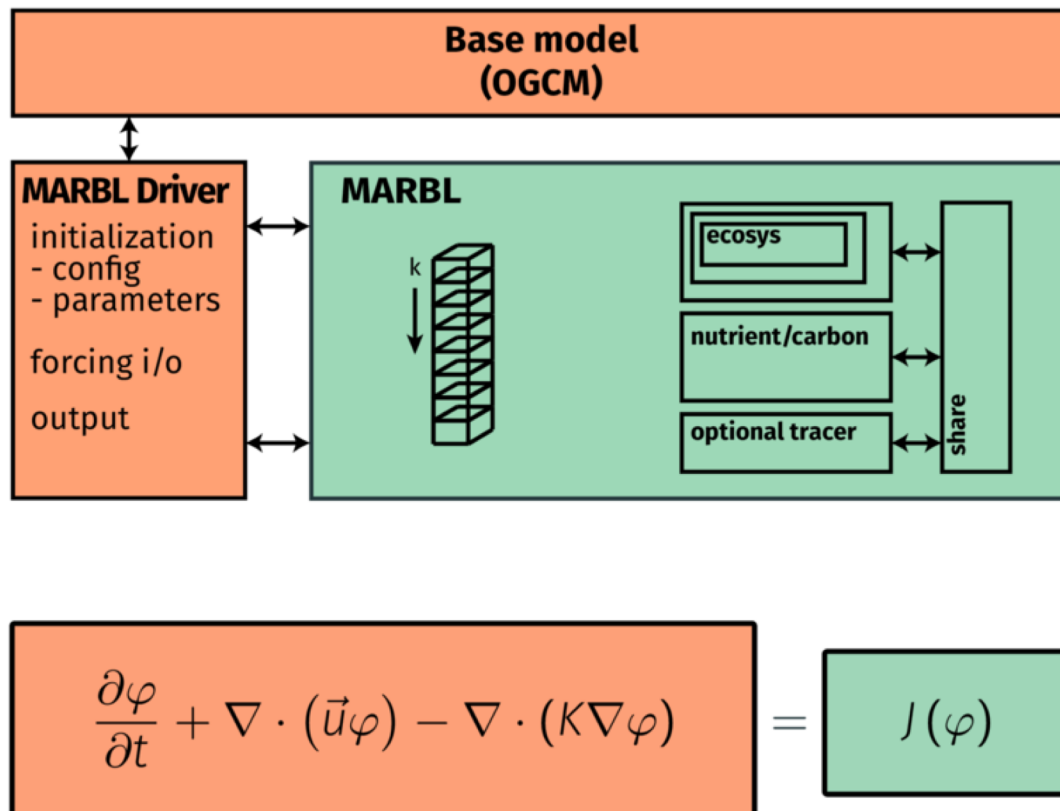
# Model resolution determines ventilation dynamics

Simulated zonal velocity at 1000 m



# CESM ocean biogeochemistry implementation: MARBL

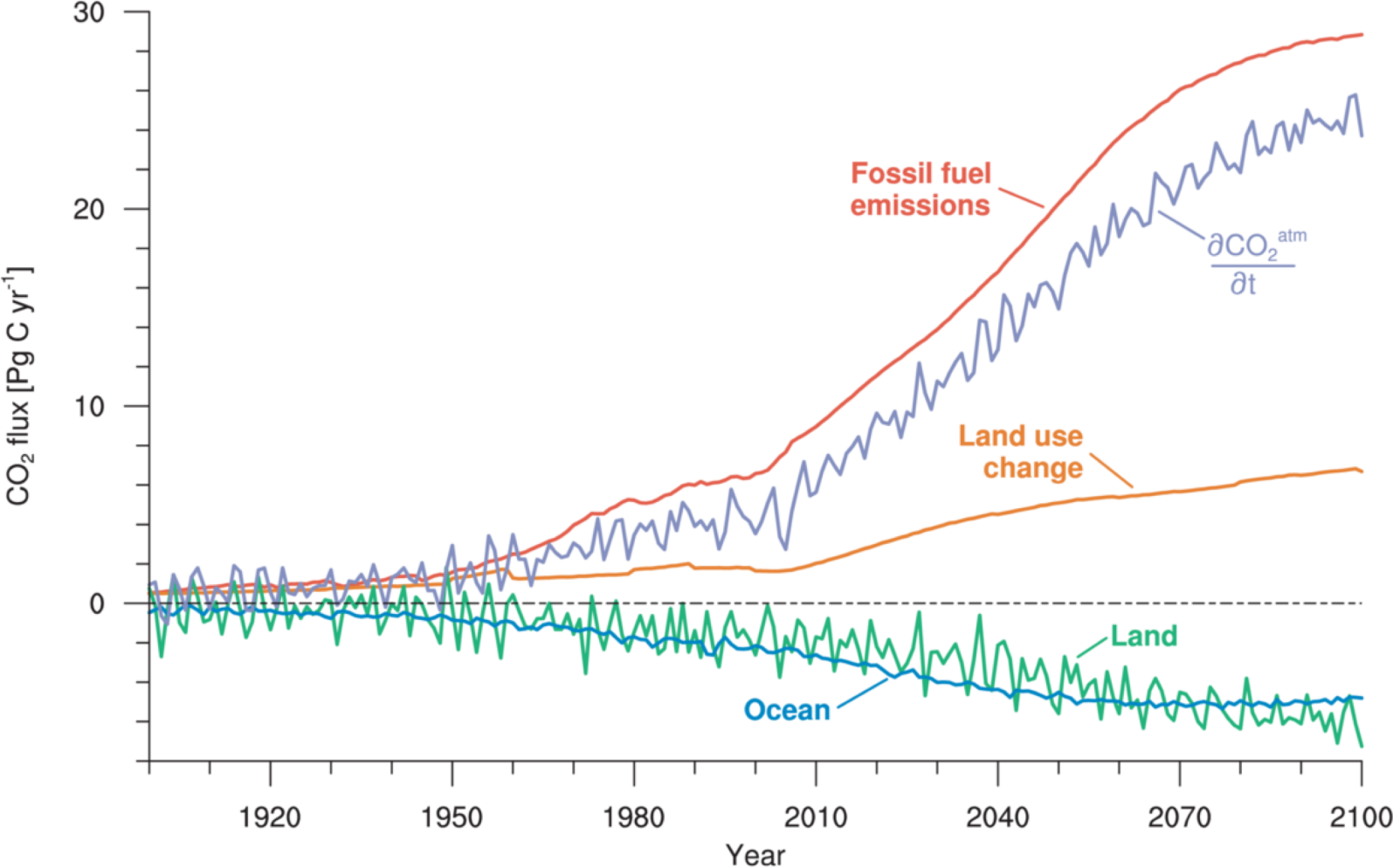
The Marine Biogeochemistry Library ([github.com/marbl-ecosys/MARBL](https://github.com/marbl-ecosys/MARBL))



- MARBL is a GCM-independent implementation of ocean biogeochemistry;
- Ecosystem configuration is flexible; includes optional tracer packages (i.e.,  $^{13}\text{C}$ );
- Matlab and Python interface (under development).

# Coupled carbon: Emissions-forced prognostic budget

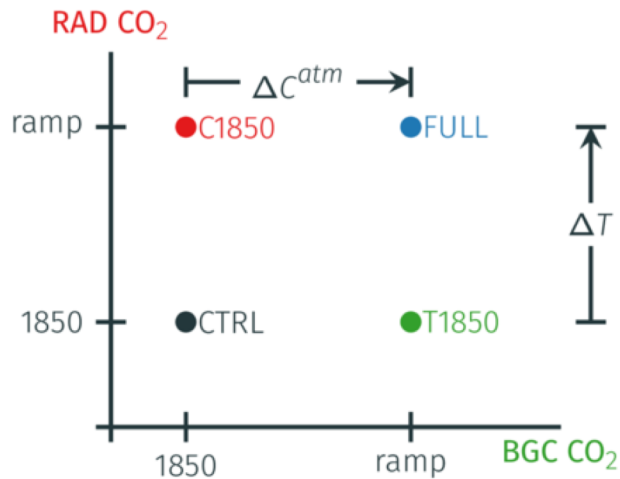
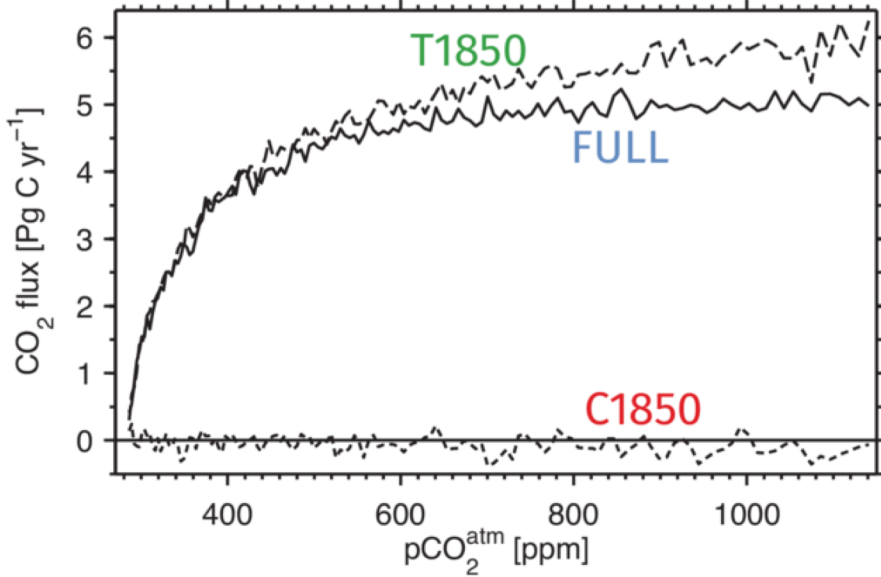
CESM1(BGC): historial → RCP8.5



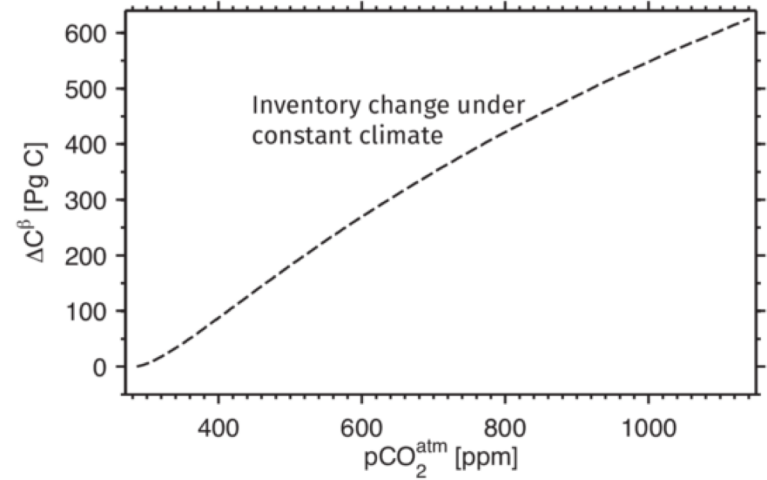
Hurrell et al. 2013

# CESM1 results: Carbon-climate feedbacks under 1% yr<sup>-1</sup> ramping CO<sub>2</sub>

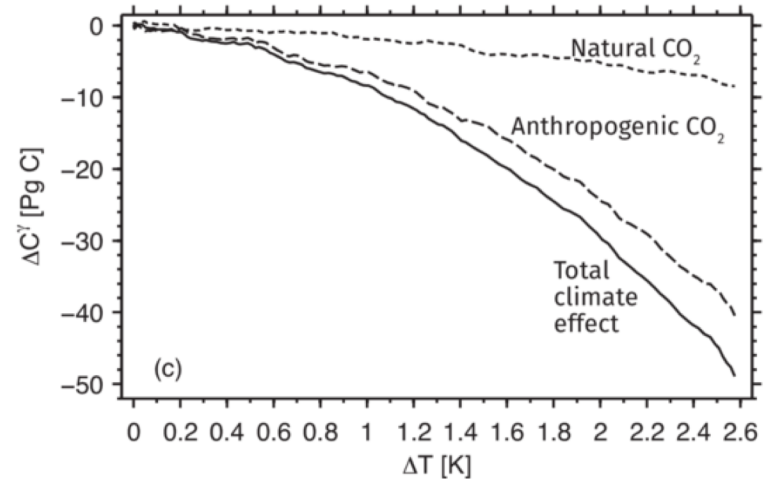
## Air-to-sea flux: anomaly timeseries



## Ocean uptake under rising CO<sub>2</sub> (T1850)

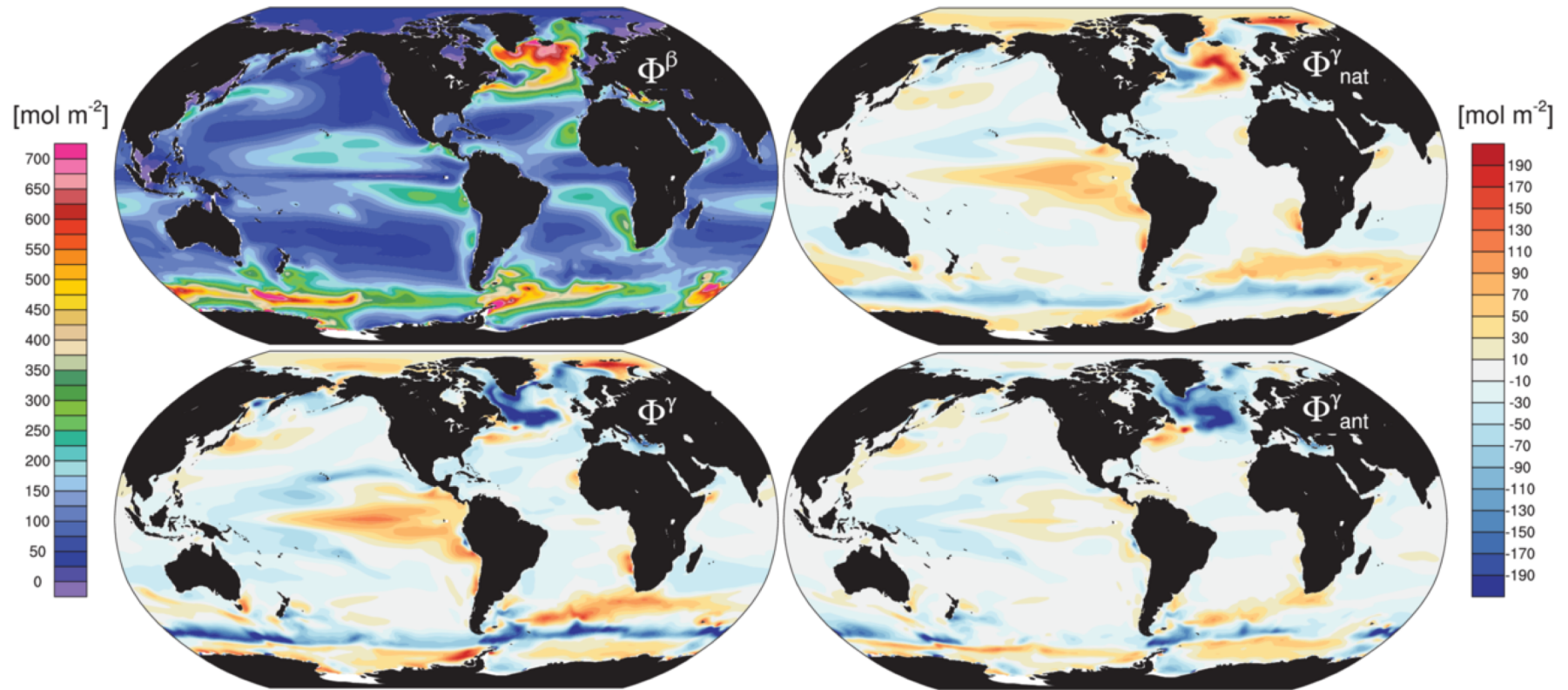


## Climate-driven reductions in CO<sub>2</sub> uptake



# Spatially variable feedbacks

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



positive := down

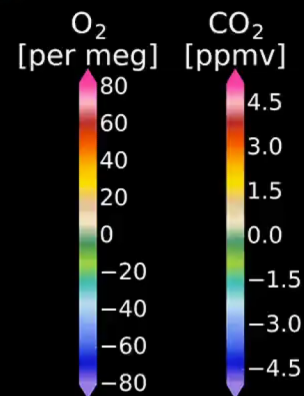
# Simulated O<sub>2</sub> and CO<sub>2</sub> distributions

2014-01-01

O<sub>2</sub> Anomaly

CO<sub>2</sub> Anomaly

**CESM simulation**  
Ocean impact on  
atmospheric O<sub>2</sub> and CO<sub>2</sub>

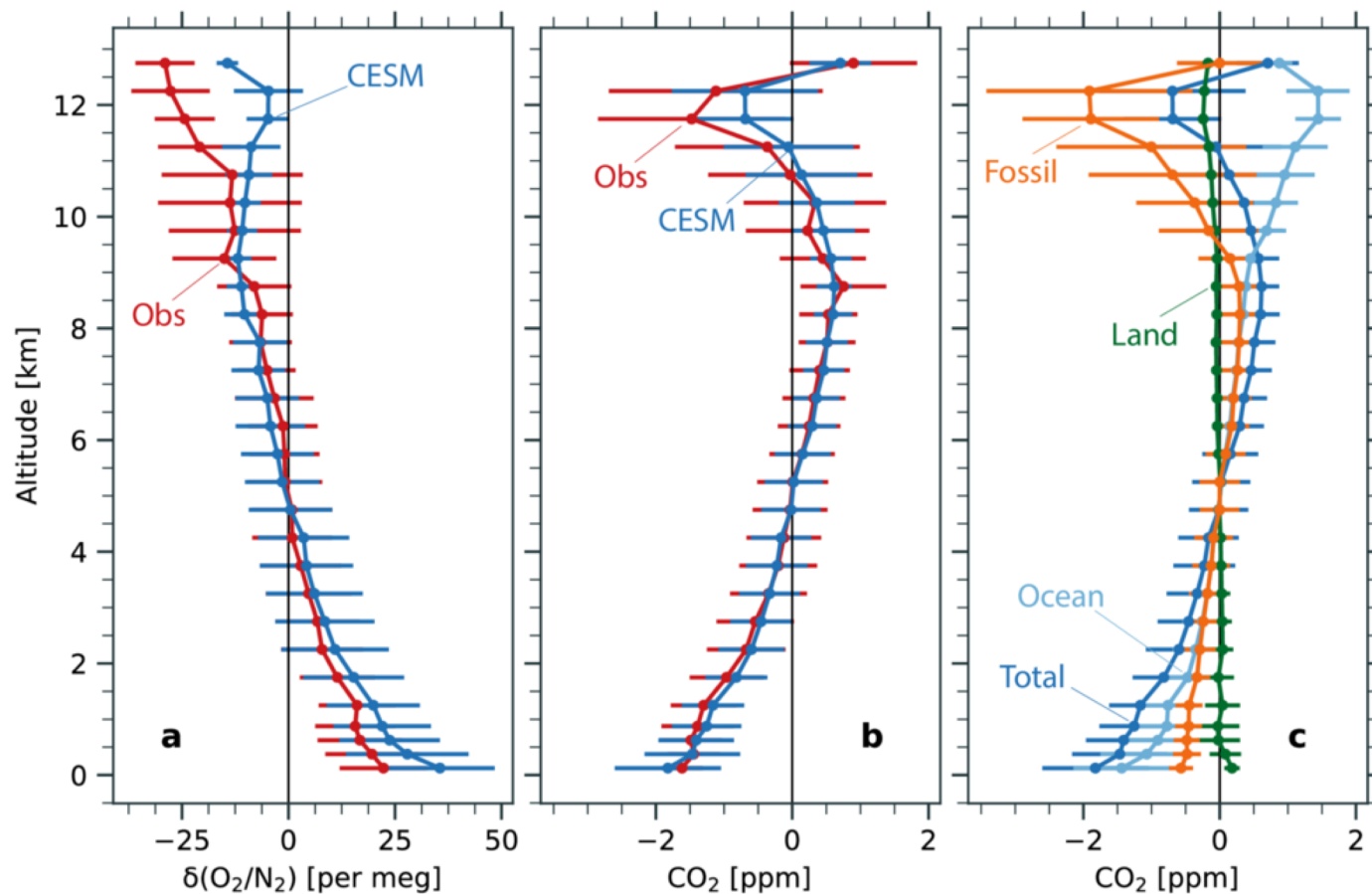


**ORCAS**  
2018 O<sub>2</sub>/N<sub>2</sub> Ratio and CO<sub>2</sub> Airborne  
Southern Ocean Study



# Comparison to aircraft observations over the Southern Ocean

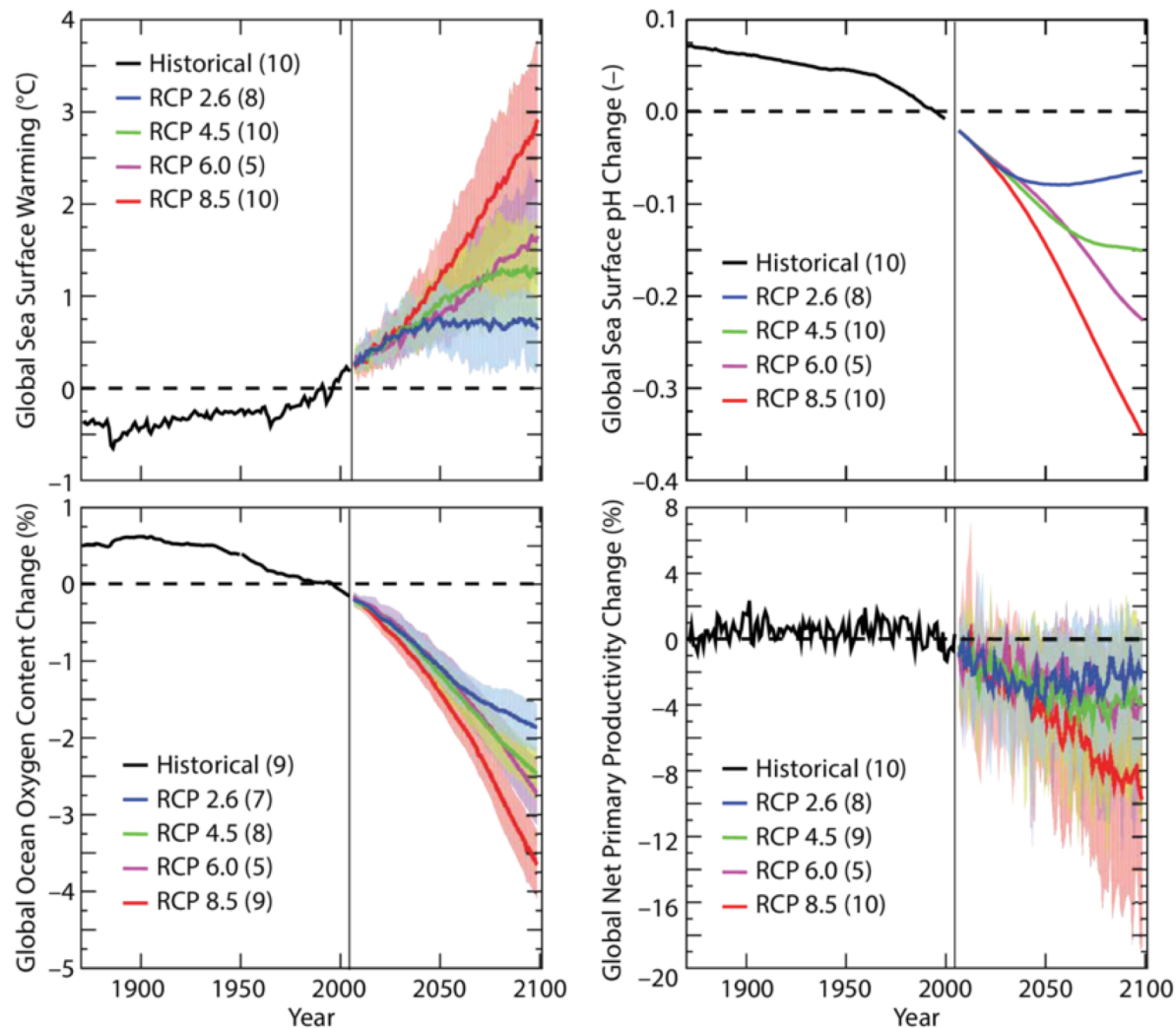
Altitude-bin-averaged vertical profiles, normalized to  $>12$  km



- Model overestimates  $\text{O}_2$  gradient: implies wrong balance of forcing mechanisms.

# The future ocean: Warming up, turning sour, losing breath\*

## CMIP5 multi-model global-mean projections: multiple stressors



# Summary

CO<sub>2</sub> in seawater enters a series of acid-base equilibria reactions, increasing the total dissolved inorganic carbon (*DIC*) concentration above that of CO<sub>2, aq</sub>.

The ocean absorbs anthropogenic CO<sub>2</sub> at a rate governed by ocean ventilation timescales. (The ocean's ability to continue to absorb CO<sub>2</sub> decreases as concentrations increase.)

The biological pump transfers carbon to depth, increasing the total carbon storage of the ocean and coupling carbon and nutrient cycles; it is a product of ecosystem function.

Anthropogenic CO<sub>2</sub> and warming are likely to severely impact marine ecosystems and biogeochemistry:

- Reduction in net primary productivity;
- Deoxygenation & warming;
- Reduced carbon uptake, pH decline.

Questions?

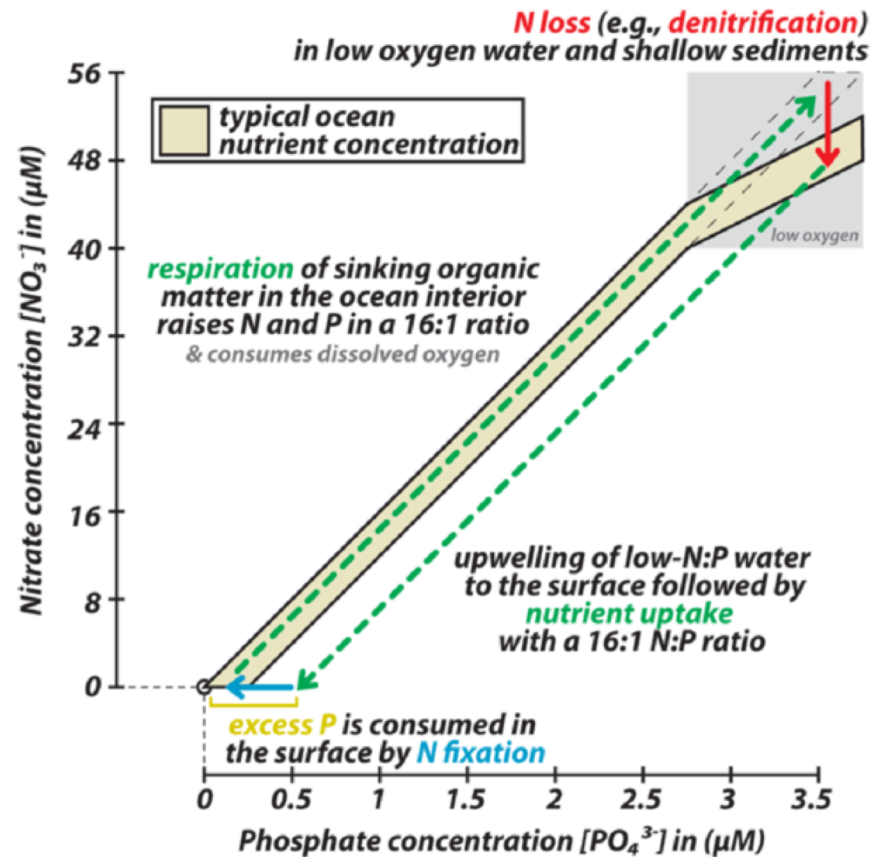
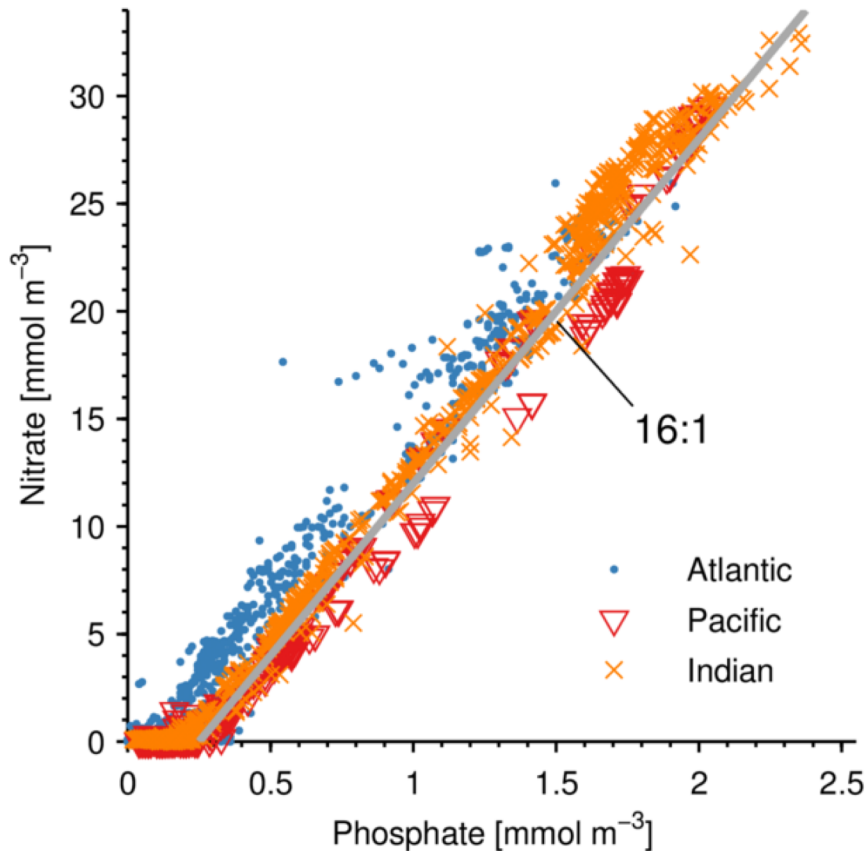
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# Organic matter production

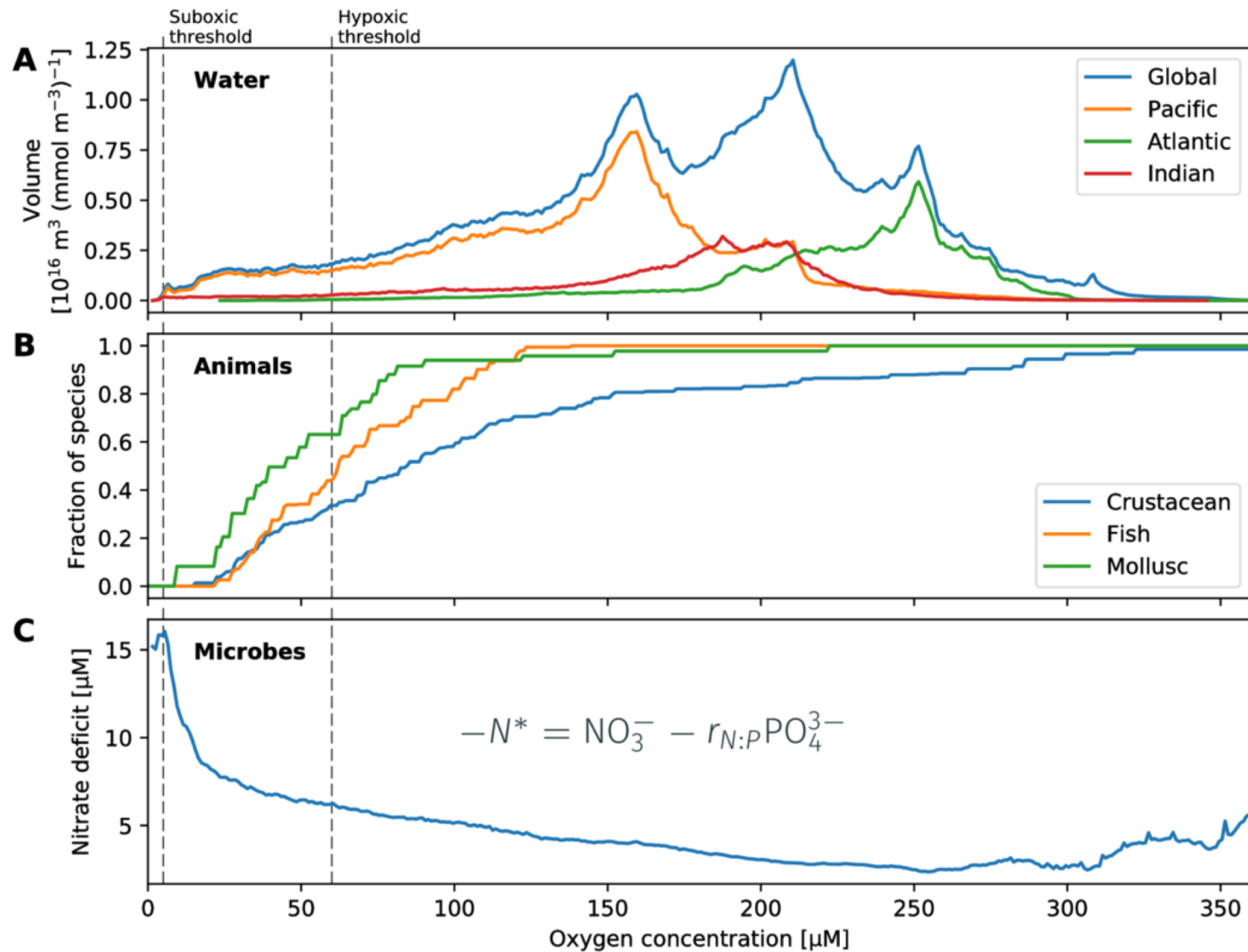
## Organic matter production



## Relationship between $\text{NO}_3^-$ and $\text{PO}_4^{3-}$

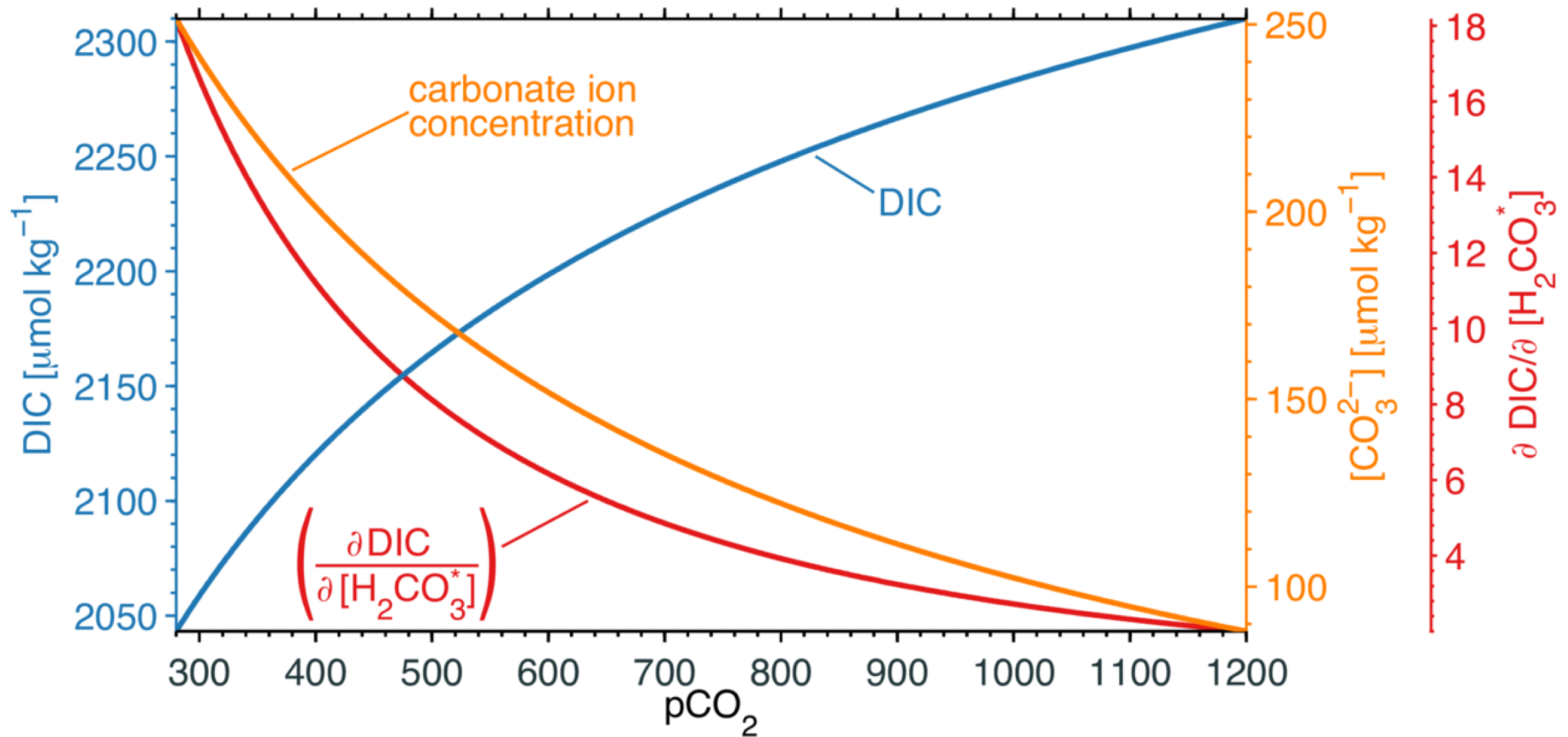


# Oxygen is a fundamental environmental constraint



# CO<sub>2</sub> uptake

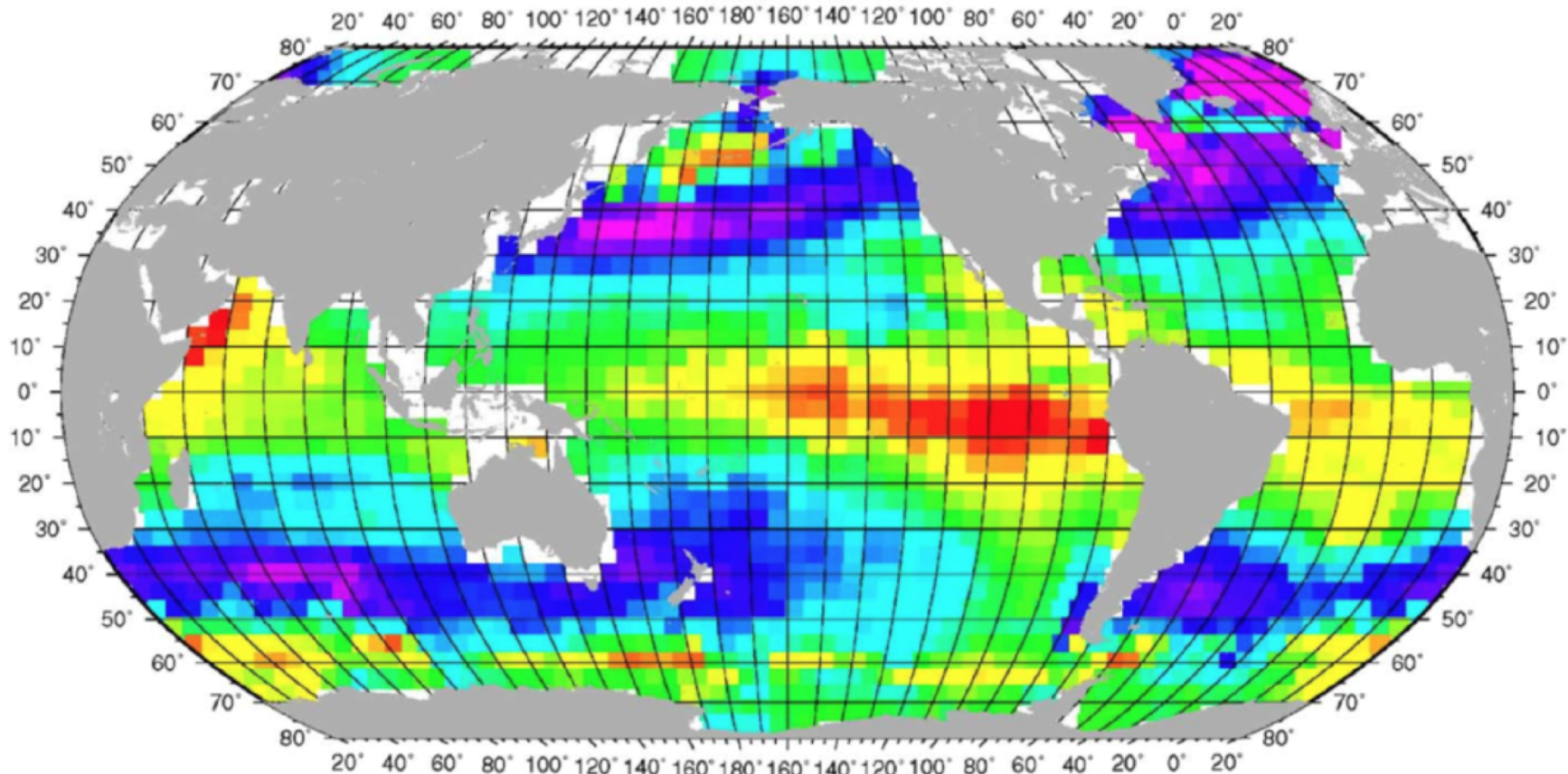
One-box ocean model: Equilibration to rising  $p\text{CO}_2^{atm}$



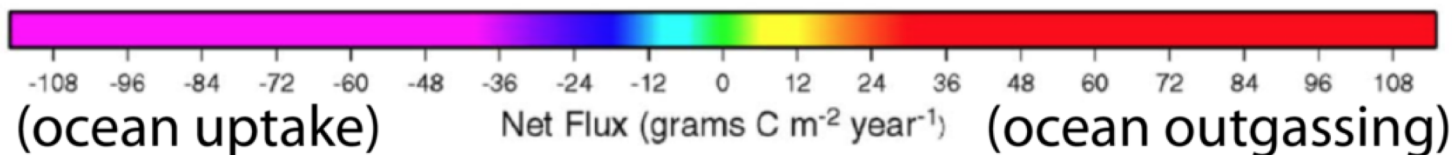
$T = 20^\circ\text{C}; S = 35; \text{Alk} = 2400 \mu\text{eq kg}^{-1}$

# Air-sea CO<sub>2</sub> gas flux

## Mean annual air-sea flux

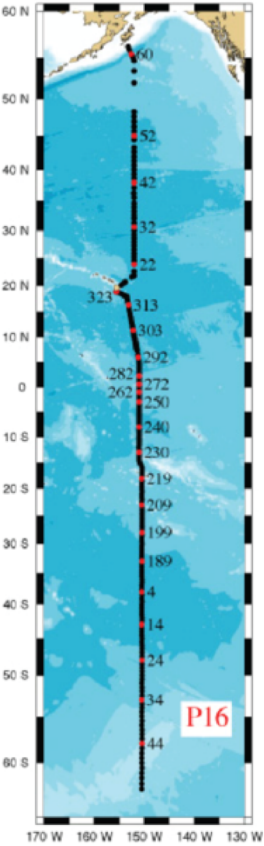
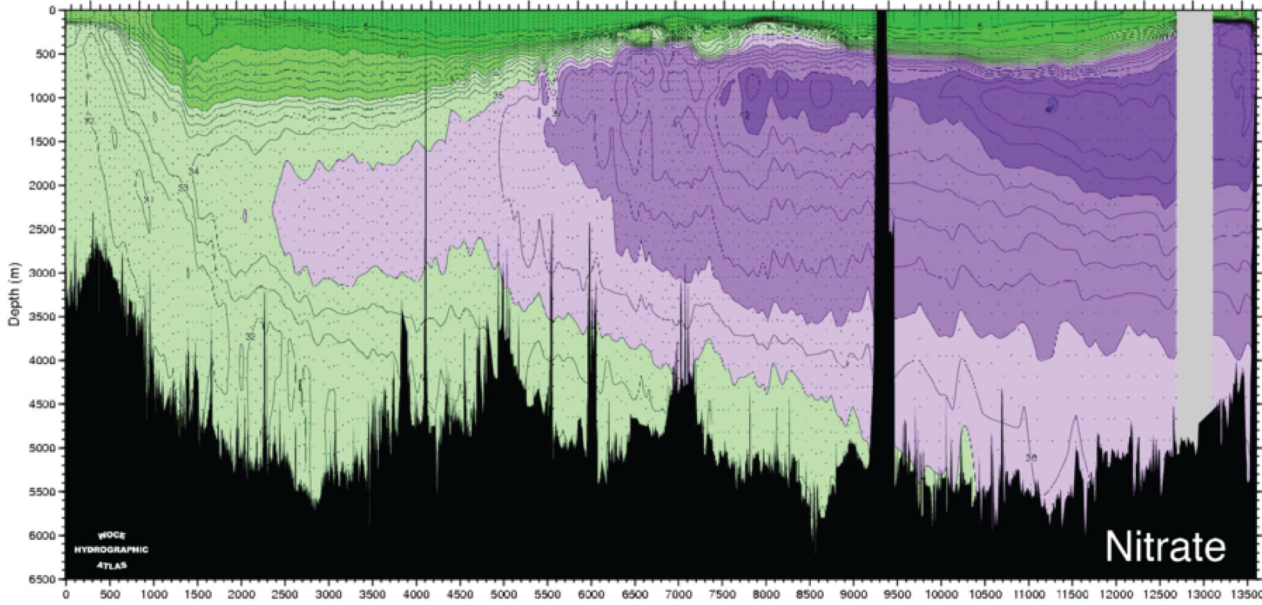
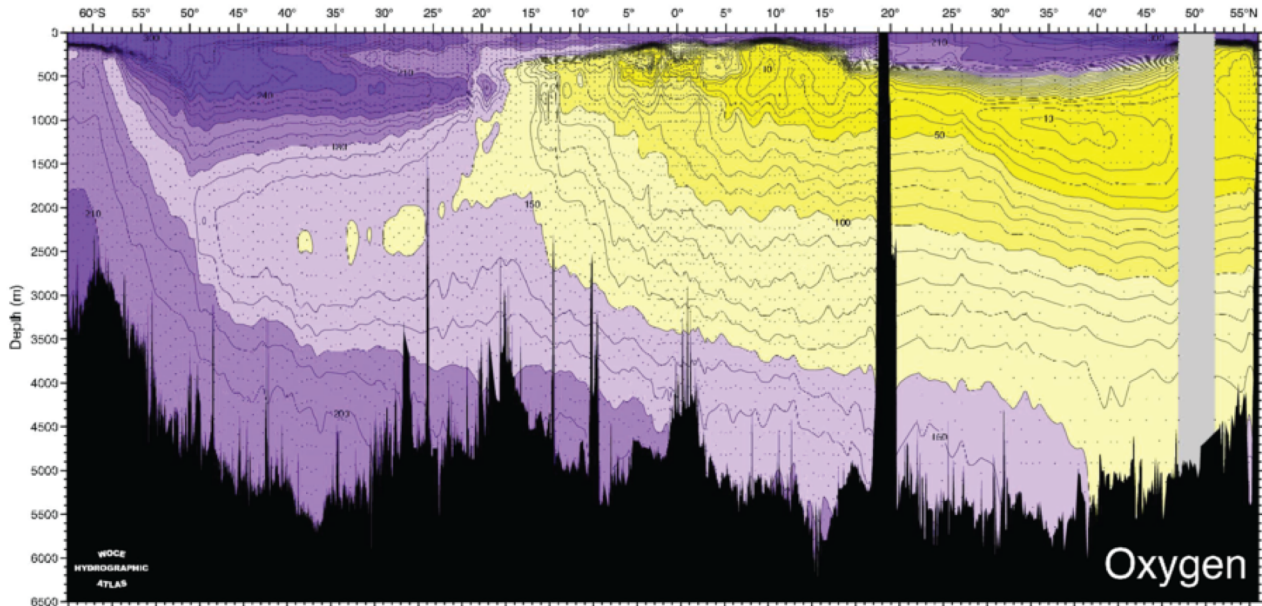


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# Properties along P16: dissolved oxygen and nitrate



# Properties along P16: Dissolved inorganic carbon (DIC)

