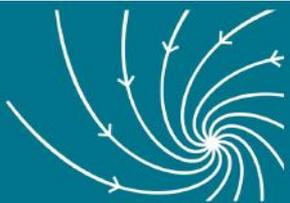




Global Predictions of Primary Productivity

towards ecosystem applications

Filippa Fransner
Geophysical Institute, Bergen University
Bjerknes Centre for Climate Research



My background



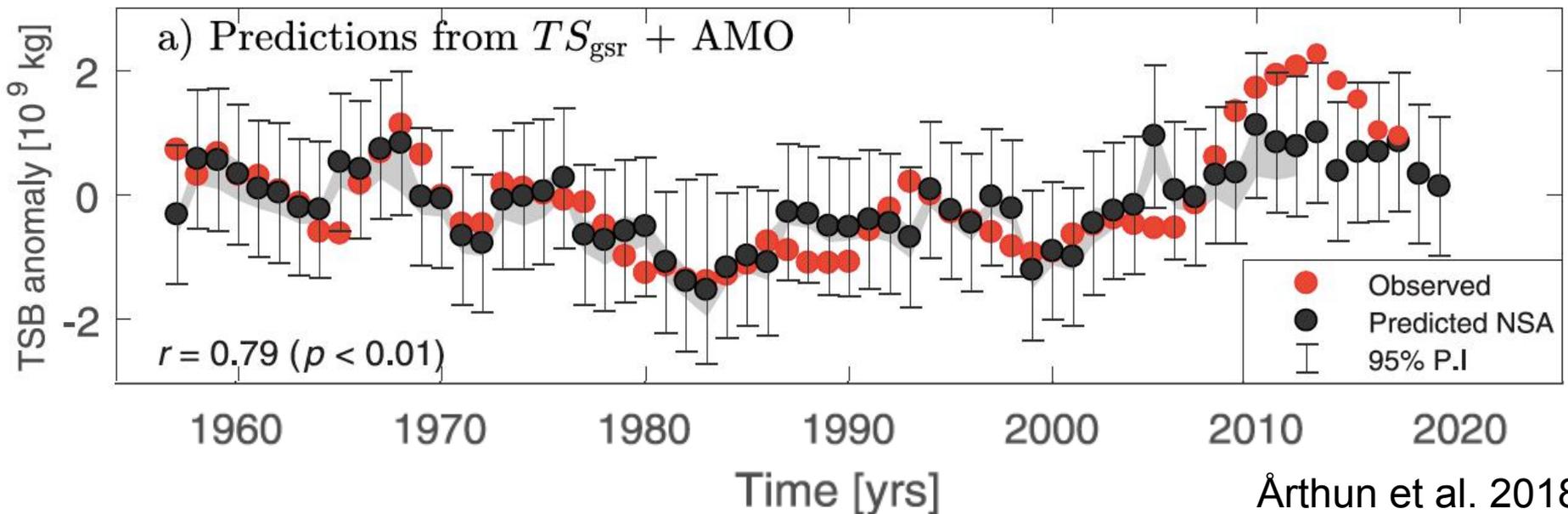
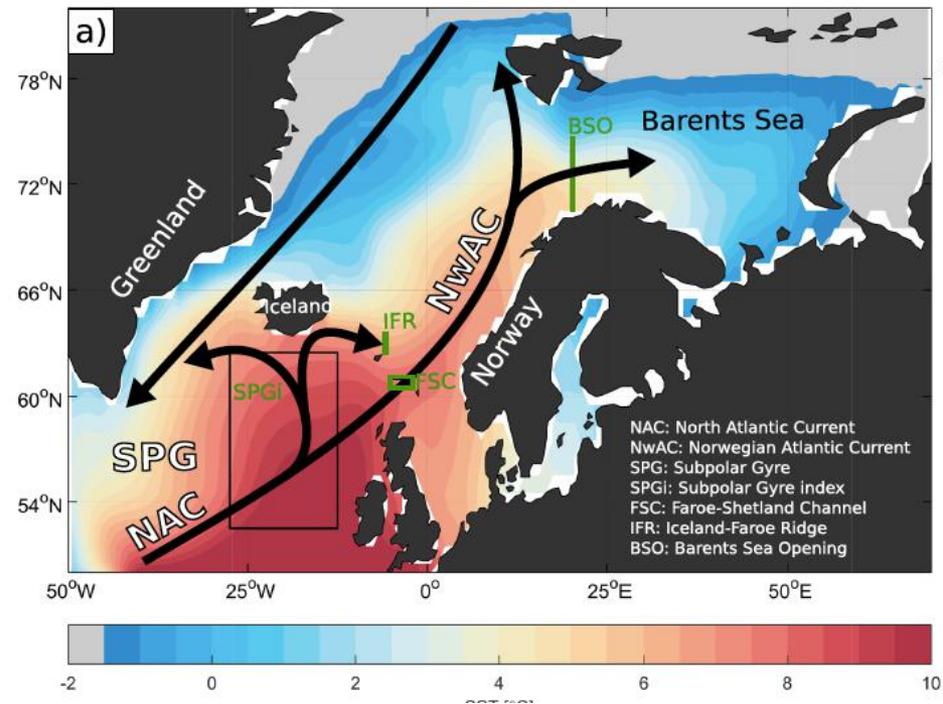
- **Göteborg:** Physical oceanography
- **Grenoble:** Environmental Fluid Dynamics - *3D ocean modelling*
- **Stockholm:** Baltic Sea carbon cycle
3D physical – biogeochemical modelling
- **Bergen:** Biogeochemical predictions of the Barents Sea
- Climate prediction modelling

the
Nansen
LEGACY



Teaser

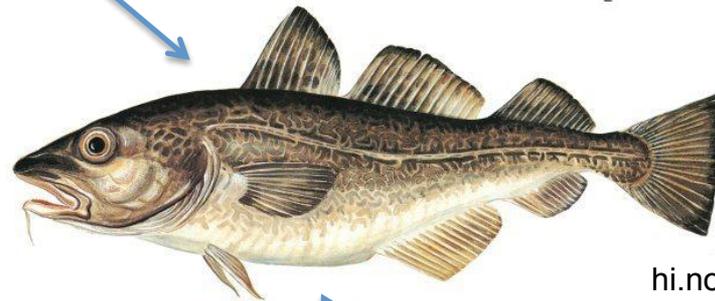
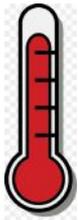
Årthun et al. showed that the cod-stock of the Barents Sea can be predicted up to 7 years in advance by using downstream temperature and salinity anomalies.



Teaser

Physical environment:

- temperature
- sea ice extent
- ...

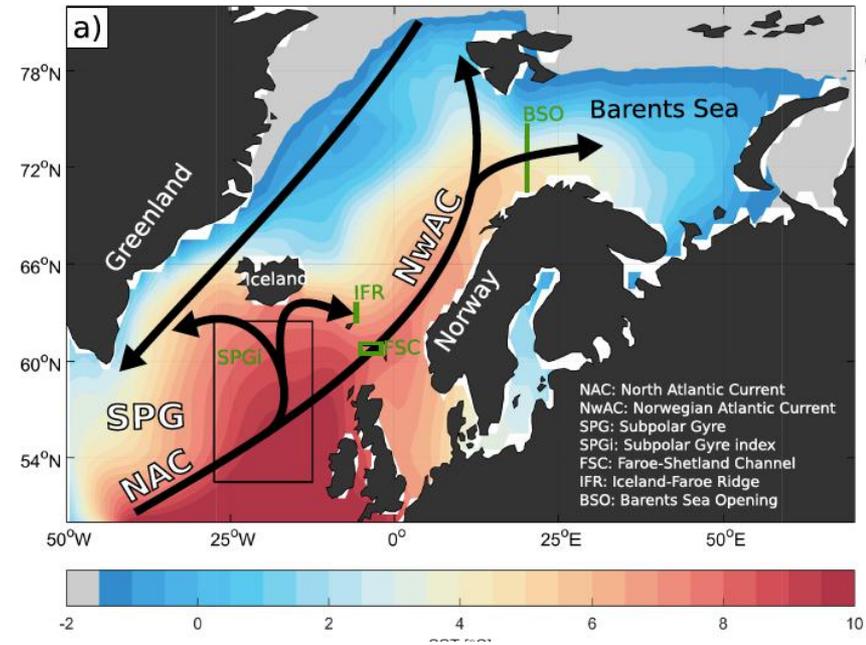
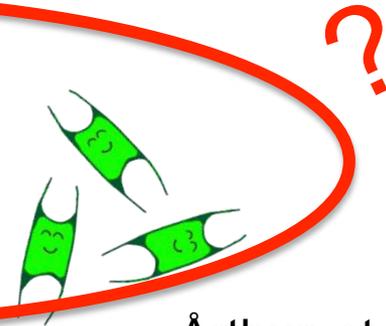


hi.no

direct impact

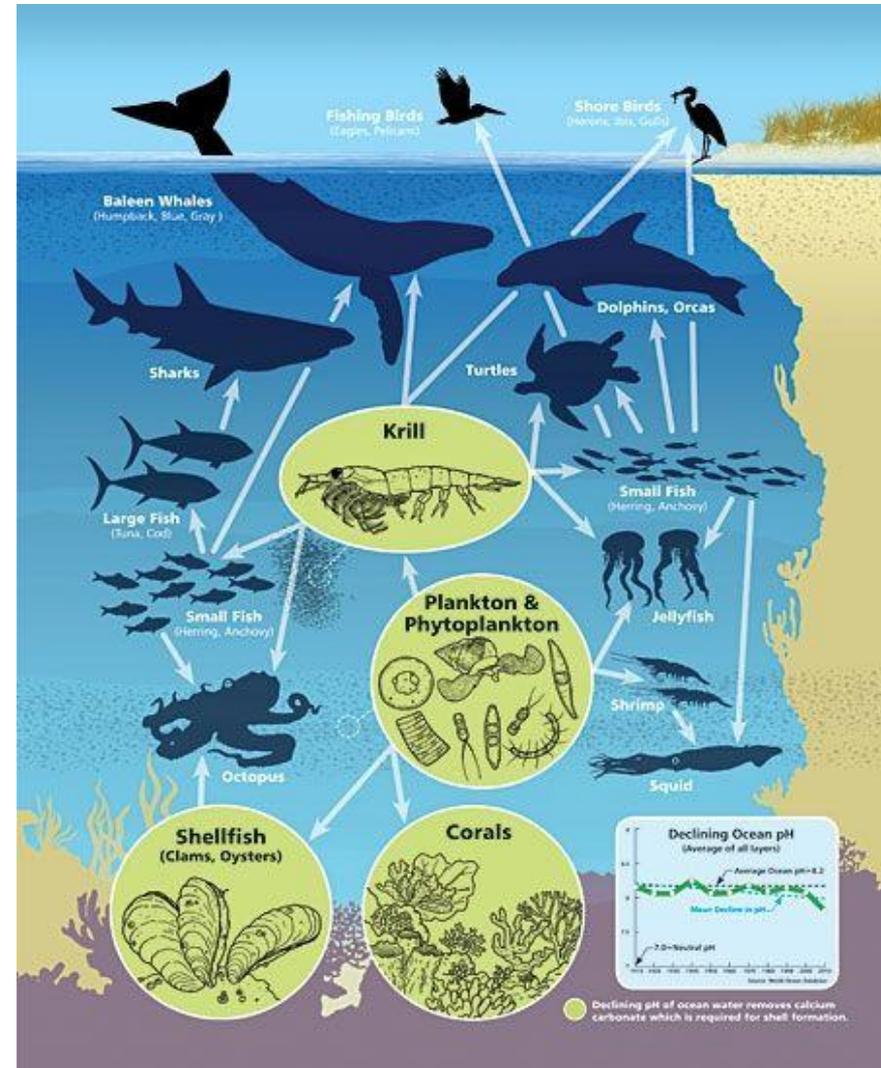
indirect impact

Bio environment (bottom-up):
- primary production and
how it translates to higher
tropical levels



Can changes in marine ecosystems be predicted?

- There are several examples of predictability of the ocean physical state.
- Ocean physics has a large impact on living organisms.
- Could predictability in ocean physics also lead to predictability of marine ecosystems?
- Is marine primary productivity predictable?



Outline

- Ocean primary production (biogeochemistry)
 - introduction/definitions
 - controlling factors
 - ?
 - ?
 - ...
- Ocean biogeochemical models
 - what's a biogeochemical model?
 - coupling to ocean physical models
 - examples of biogeochemical models in CMIP
- Biogeochemical Predictions
 - ongoing research

Outline

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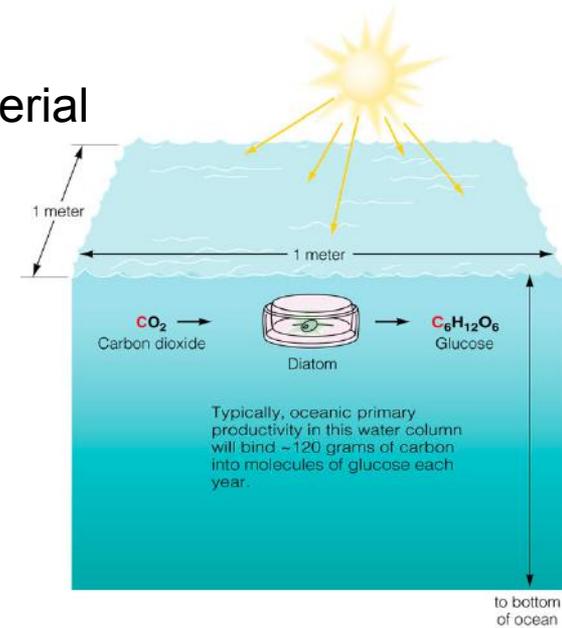
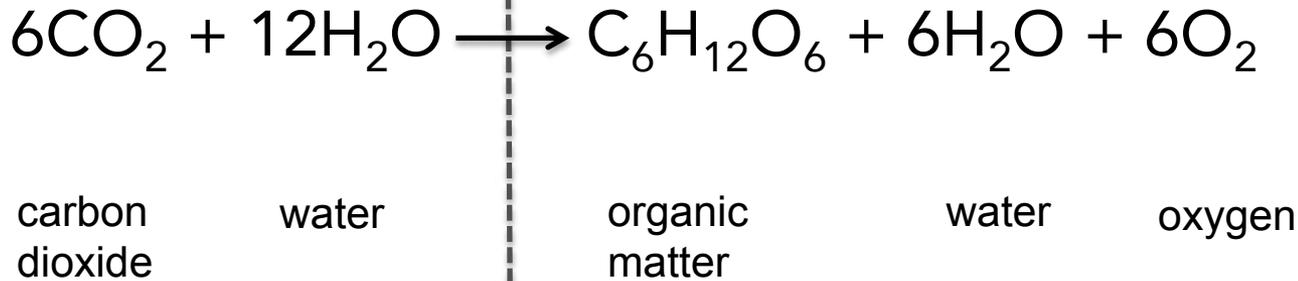
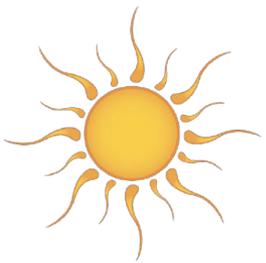
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Ocean primary production

Primary production: production (synthesis) of organic material from energy and inorganic material

Photosynthesis



© 2005 Brooks/Cole - Thomson

Ocean primary production

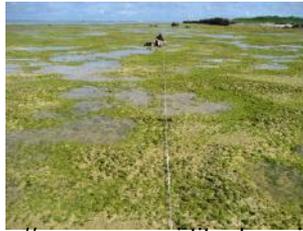
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2

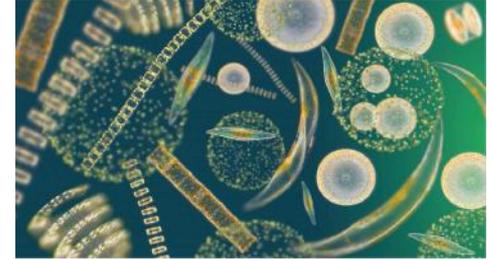


3



<http://www.wv.mei.titech.ac.jp/nadalab/photo/2007-8-shiraho2/2007-8-shiraho2.html>

4



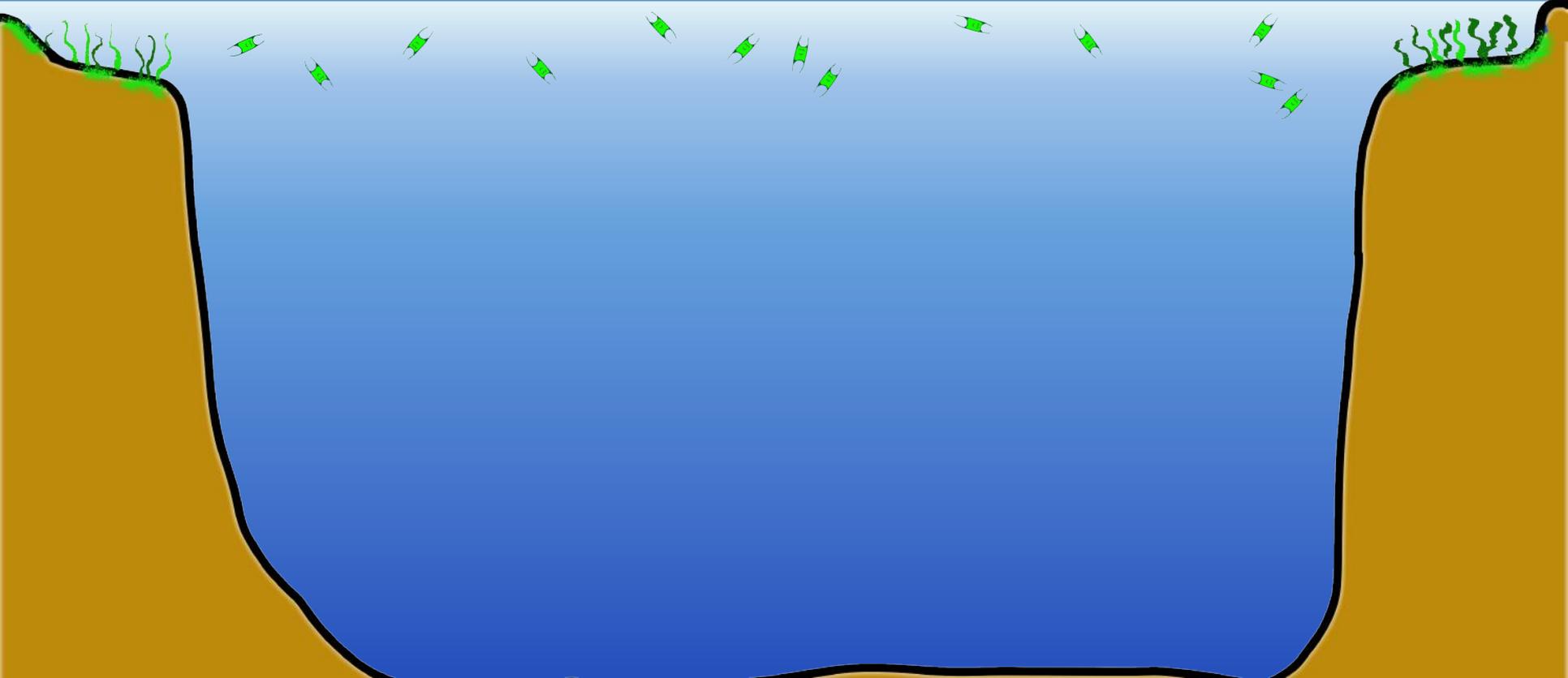
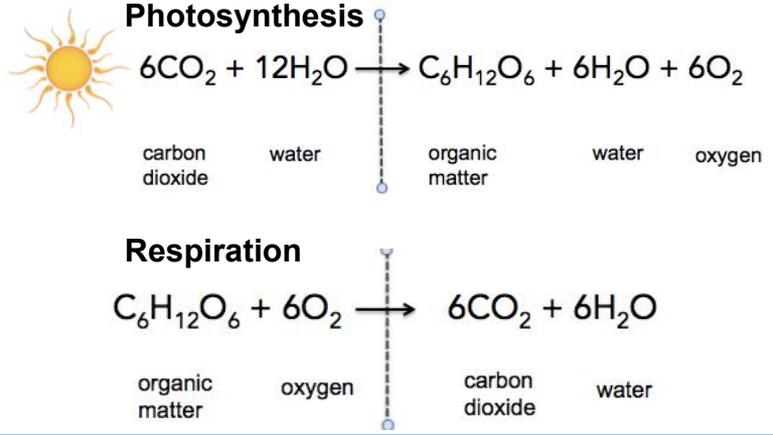
Oceanic photosynthesizers

- 1, Seaweed
- 2, Macro algae
- Micro algae (unicellular)
 - 3, Benthic
 - 4, Planktonic (90 % of oceanic primary production)

Ocean primary production

Gross Primary Production (GPP):
Fixation of CO₂ into organic material

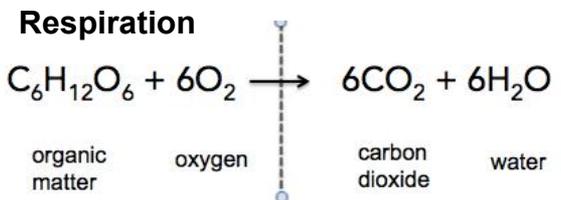
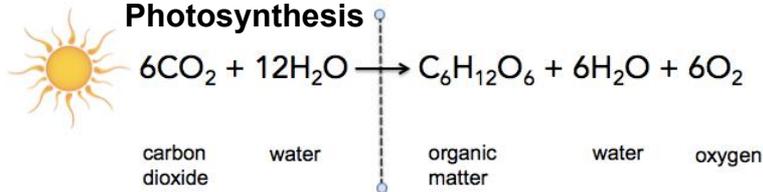
Net Primary Production (NPP):
NPP = GPP – respiration



Ocean primary production

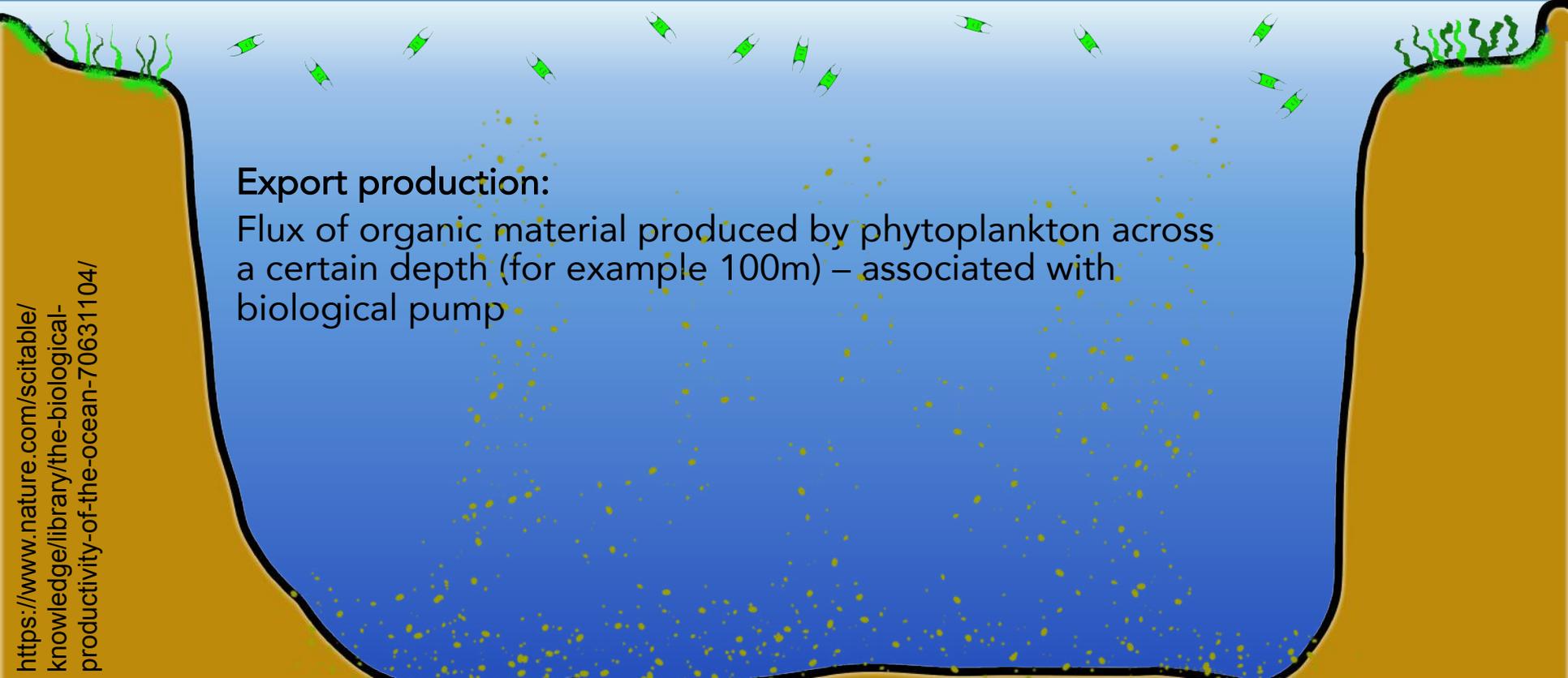
Gross Primary Production (GPP):
Fixation of CO₂ into organic material

Net Primary Production (NPP):
NPP = GPP – respiration



Export production:
Flux of organic material produced by phytoplankton across a certain depth (for example 100m) – associated with biological pump

<https://www.nature.com/scitable/knowledge/library/the-biological-productivity-of-the-ocean-70631104/>

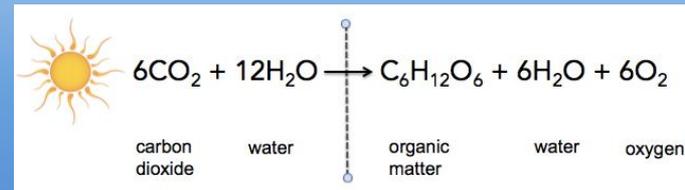


Outline

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Ocean primary production -controlling factors

- Sunlight
- Nutrients (organic material does not only consist of carbon)
- (*temperature?*)



Ocean primary production -controlling factors: light



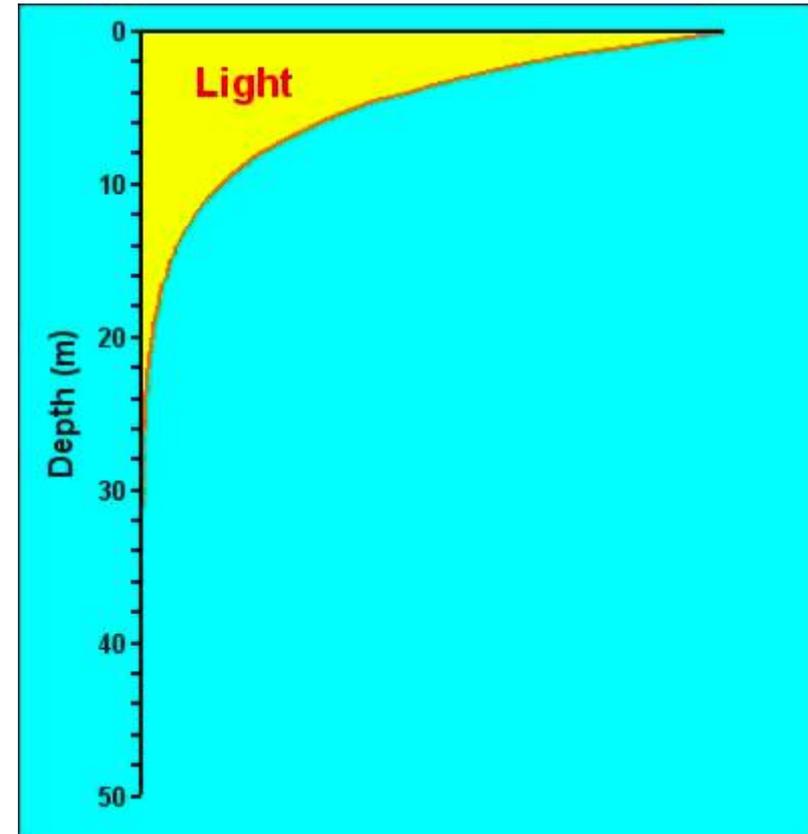
Light intensity decreases as an exponential function of depth:

$$I(z) = I_0 e^{-kz}$$

$I(z)$ = light intensity at depth z

I_0 = light intensity at surface

k = light attenuation coefficient



Ocean primary production -controlling factors: light



Light intensity decreases as an exponential function of depth:

$$I(z) = I_0 e^{-kz}$$

$I(z)$ = light intensity at depth z

I_0 = light intensity at surface

k = light attenuation coefficient

The light attenuation coefficient depends on the turbidity of seawater, which is influenced by:

- Phytoplankton concentration
- Concentration of dissolved and particulate organic material

It can vary between 0.04 m^{-1} in clear water up to 0.1 in turbid coastal waters

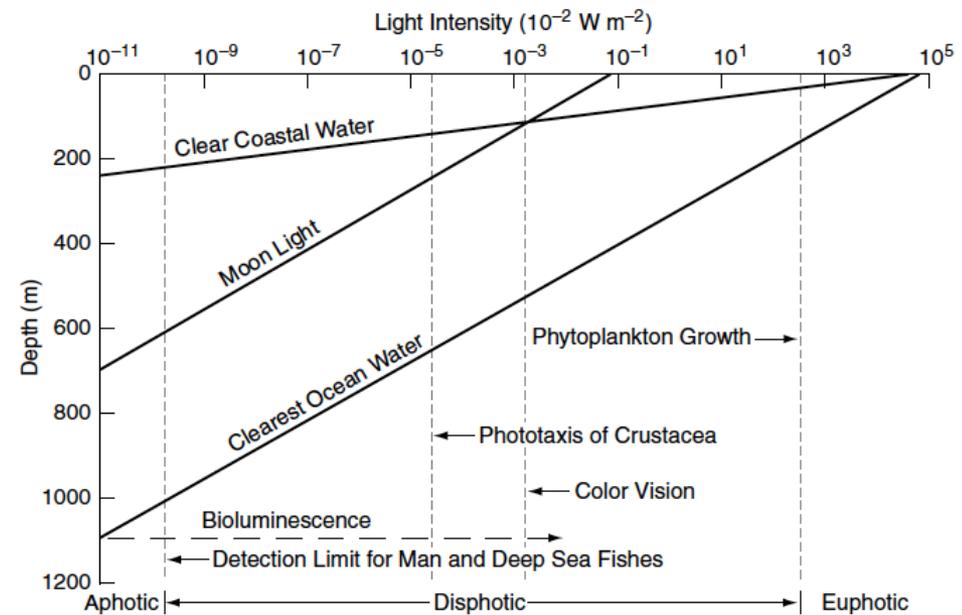
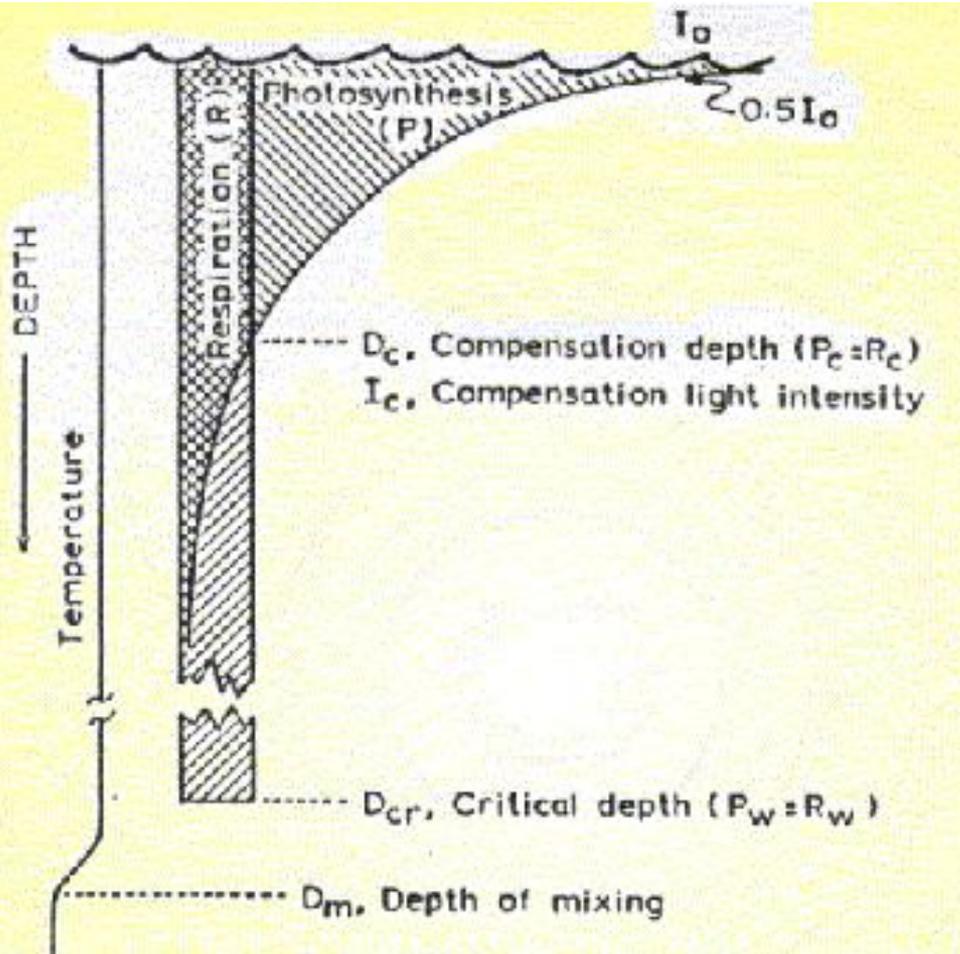


FIGURE 4.2.7: The sloping lines depict the light intensity versus depth for clear coastal and clearest open ocean waters, as well as for moonlight. Note that the horizontal scale is logarithmic. Also shown on the diagram are vertical lines depicting the light intensity cutoff for various biological processes. Taken from *Parsons et al.* [1984].

Critical Depth Hypothesis

by Harald Sverdrup



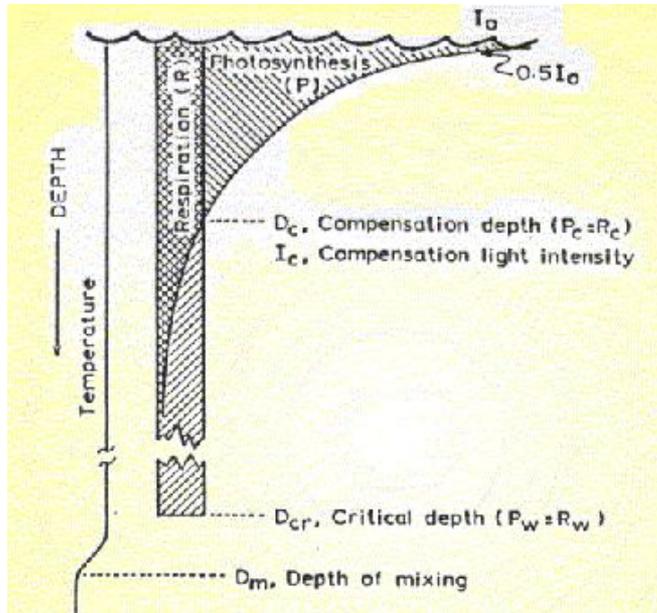
Compensation depth: respiration=photosynthesis in each phytoplankton

Critical depth: Respiration= primary production (integrated from the critical depth to the surface)

Sverdrup H. 1953. On conditions for the vernal blooming of phytoplankton. *Journal du Conseil/ Conseil Permanent International pour l'Exploration de la Mer* 18: 287–295.

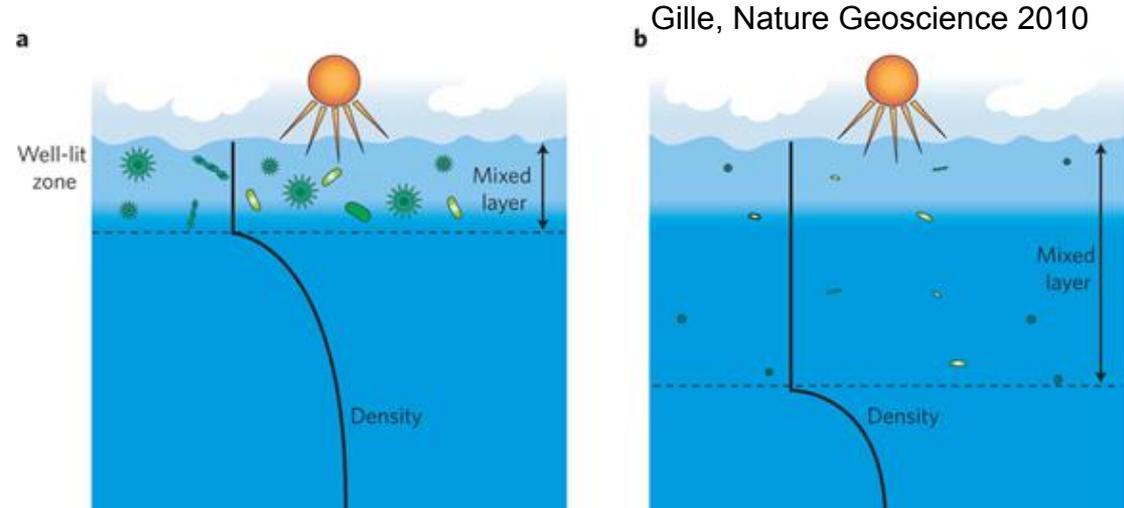
Critical Depth Hypothesis

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Compensation depth:
respiration=photosynthesis in each
phytoplankton

Critical depth: Respiration= primary
production (integrated from the
critical depth to the surface)



If the mixed layer is shallower than the
critical depth, you can have a net growth
of phytoplankton and increase in
biomass.

Sverdrup H. 1953. On conditions for the vernal
blooming of phytoplankton. Journal du Conseil/
Conseil Permanent International pour
l'Exploration de la Mer 18: 287–295.



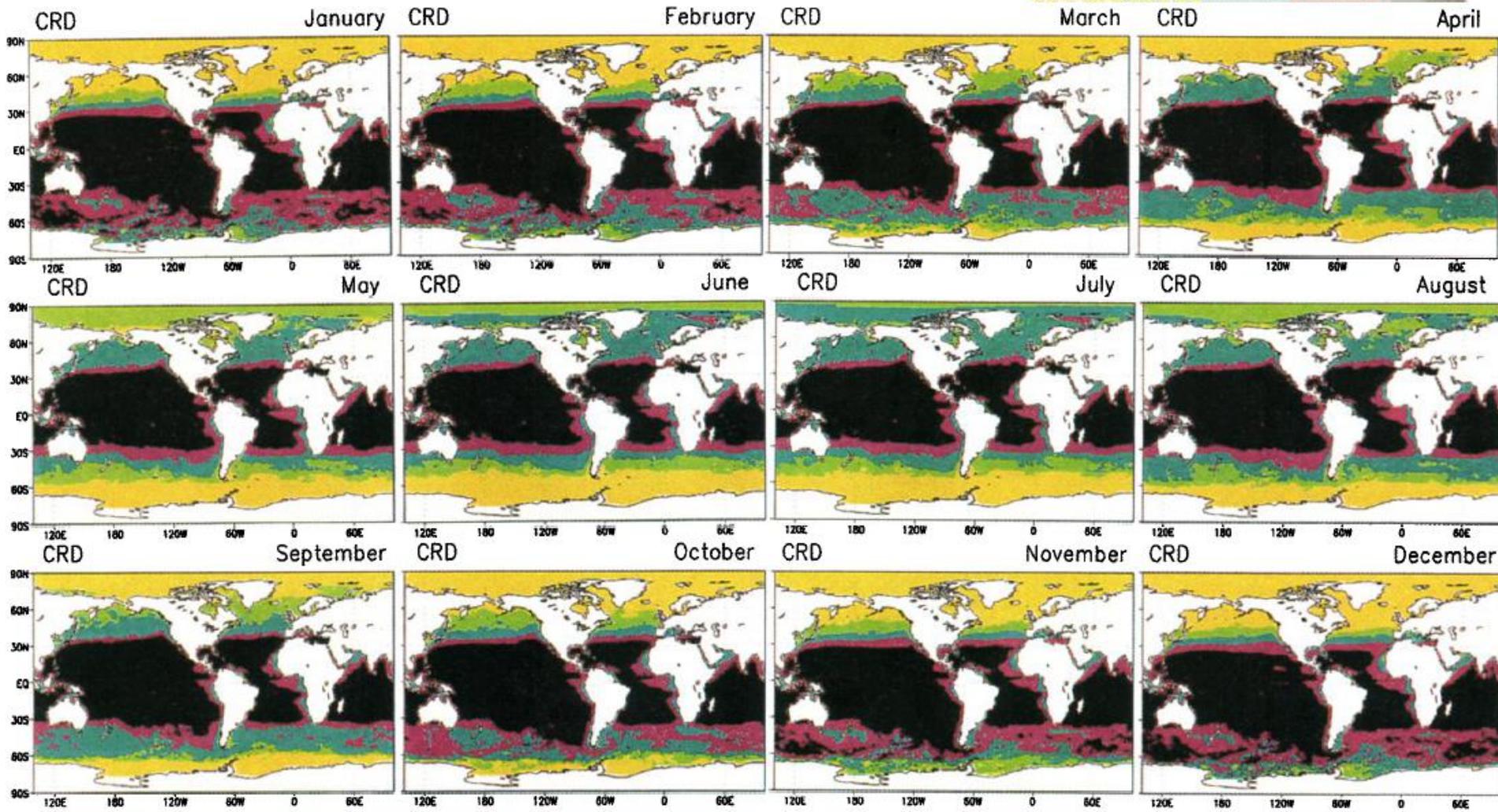
Critical Depth Hypothesis

by Harald Sverdrup

Obata et al., 1996

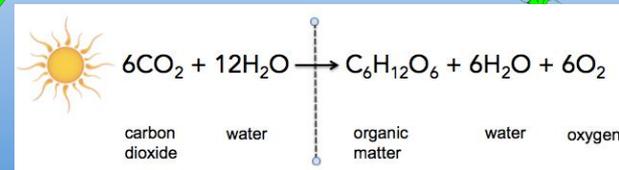


Sverdrup's Critical Depth



Ocean primary production -controlling factors

- Sunlight
- Nutrients (organic material does not only consist of carbon)
- (*temperature*)



Ocean primary production -controlling factors

- Sunlight
- Nutrients (organic material does not only consist of carbon)
- (*temperature*)

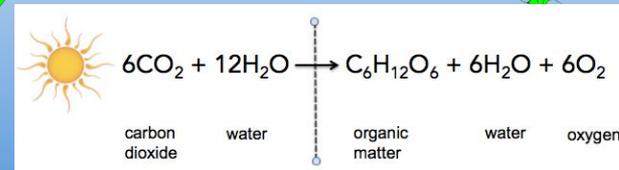


TABLE 4.2.2

Mean composition of primary components of marine phytoplankton.

From Anderson [1995]. Proteins and lipids were taken by him from the study of Laws [1991], carbohydrates from Strickland [1965], and nucleic acid from Adams et al. [1986]. Shown in parentheses are the mean compositions used by Hedges et al. [2002] in their study. Their carbohydrate composition was identical to Anderson [1995] and they did not include nucleic acid in their analysis.

Organic Matter Component	Composition	H/C _{org} ratio	C _{org} /O ratio
Carbohydrate	C ₆ H ₁₀ O ₅	1.67	1.2
Lipid	C ₄₀ H ₇₄ O ₅ (C ₁₈ H ₃₄ O ₂)	1.85	8.0
Protein	C _{3.83} H _{6.05} O _{1.25} N (C ₁₀₆ H ₁₆₈ O ₃₄ N ₂₈ S)	1.58	3.1
Nucleic acid	C _{9.625} H ₁₂ O _{6.5} N _{3.75} P	1.25	1.5

Sarmiento and Gruber, Ocean Biogeochemical Dynamics 2006

Ocean primary production

-controlling factors: nutrients

Macronutrients: (Needed in larger quantities, often limiting the growth of phytoplankton)

- Nitrogen (N)
- Phosphorus (P)
- Silicon (Si), *only diatoms*

Micronutrients: (Essential but only in small quantities)

- Iron (Fe)
- Copper (Cu)
- Zinc (Zn)
- ...

Periodic Table of the Elements

1																	18
1	2											13	14	15	16	17	18
H Hydrogen 1.008	He Helium 4.003											B Boron 10.811	C Carbon 12.011	N Nitrogen 14.007	O Oxygen 15.999	F Fluorine 18.998	Ne Neon 20.180
3	4											13	14	15	16	17	18
Li Lithium 6.941	Be Beryllium 9.012											Al Aluminum 26.982	Si Silicon 28.086	P Phosphorus 30.974	S Sulfur 32.066	Cl Chlorine 35.453	Ar Argon 39.948
11	12	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18
Na Sodium 22.990	Mg Magnesium 24.305	Sc Scandium 44.956	Ti Titanium 47.867	V Vanadium 50.942	Cr Chromium 51.996	Mn Manganese 54.938	Fe Iron 55.845	Co Cobalt 58.933	Ni Nickel 58.693	Cu Copper 63.546	Zn Zinc 65.38	Ga Gallium 69.723	Ge Germanium 72.631	As Arsenic 74.922	Se Selenium 78.971	Br Bromine 79.904	Kr Krypton 84.798
19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36
K Potassium 39.098	Ca Calcium 40.078	Sc Scandium 44.956	Ti Titanium 47.867	V Vanadium 50.942	Cr Chromium 51.996	Mn Manganese 54.938	Fe Iron 55.845	Co Cobalt 58.933	Ni Nickel 58.693	Cu Copper 63.546	Zn Zinc 65.38	Ga Gallium 69.723	Ge Germanium 72.631	As Arsenic 74.922	Se Selenium 78.971	Br Bromine 79.904	Kr Krypton 84.798
37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54
Rb Rubidium 84.468	Sr Strontium 87.62	Y Yttrium 88.906	Zr Zirconium 91.224	Nb Niobium 92.906	Mo Molybdenum 95.95	Tc Technetium 98.907	Ru Ruthenium 101.07	Rh Rhodium 102.906	Pd Palladium 106.42	Ag Silver 107.868	Cd Cadmium 112.414	In Indium 114.818	Sn Tin 118.711	Sb Antimony 121.760	Te Tellurium 127.6	I Iodine 126.904	Xe Xenon 131.294
55	56	57-71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86
Cs Cesium 132.905	Ba Barium 137.328	Lanthanides	Hf Hafnium 178.49	Ta Tantalum 180.948	W Tungsten 183.84	Re Rhenium 186.207	Os Osmium 190.23	Ir Iridium 192.217	Pt Platinum 195.085	Au Gold 196.967	Hg Mercury 200.592	Tl Thallium 204.383	Pb Lead 207.2	Bi Bismuth 208.980	Po Polonium [208.982]	At Astatine 209.987	Rn Radon 222.018
87	88	89-103	104	105	106	107	108	109	110	111	112	113	114	115	116	117	118
Fr Francium 223.020	Ra Radium 226.025	Actinides	Rf Rutherfordium [261]	Db Dubnium [262]	Sg Seaborgium [266]	Bh Bohrium [264]	Hs Hassium [269]	Mt Meitnerium [268]	Ds Darmstadtium [269]	Rg Roentgenium [272]	Cn Copernicium [277]	Uut Ununtrium unknown	Ff Flerovium [289]	Uup Ununpentium unknown	Lv Livermorium [298]	Uus Ununseptium unknown	Uuo Ununoctium unknown

Lanthanide Series	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71
	La Lanthanum 138.905	Ce Cerium 140.116	Pr Praseodymium 140.908	Nd Neodymium 144.243	Pm Promethium 144.913	Sm Samarium 150.36	Eu Europium 151.964	Gd Gadolinium 157.25	Tb Terbium 158.925	Dy Dysprosium 162.500	Ho Holmium 164.930	Er Erbium 167.259	Tm Thulium 168.934	Yb Ytterbium 173.055	Lu Lutetium 174.967
Actinide Series	89	90	91	92	93	94	95	96	97	98	99	100	101	102	103
	Ac Actinium 227.028	Th Thorium 232.038	Pa Protactinium 231.036	U Uranium 238.029	Np Neptunium 237.048	Pu Plutonium 244.064	Am Americium 243.061	Cm Curium 247.070	Bk Berkelium 247.070	Cf Californium 251.080	Es Einsteinium [254]	Fm Fermium 257.095	Md Mendelevium 258.1	No Nobelium 259.101	Lr Lawrencium [262]

Alkali Metal	Alkaline Earth	Transition Metal	Basic Metal	Semimetal	Nonmetal	Halogen	Noble Gas	Lanthanide	Actinide
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Ocean primary production

-controlling factors: nutrients

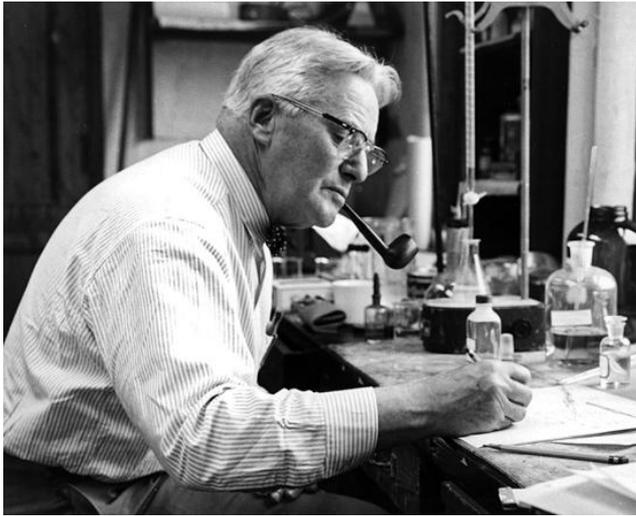
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Micronutrients: (Essential but only in small quantities)

- Iron (Fe)
- Copper (Cu)
- Zink (Zn)
- ...

Element	Dissolved forms in seawater	Chemical formula	Commonly referred to
Nitrogen (N)	Nitrate	NO_3^-	Dissolved Inorganic Nitrogen (DIN)
	Nitrite	NO_2^-	
	Ammonium	NH_4^+	
Phosphorus (P)	Phosphate	PO_4^{3-}	Dissolved Inorganic Phosphorus (DIP)
Silicon (Si)	Silicate	SiO_4^{-4}	

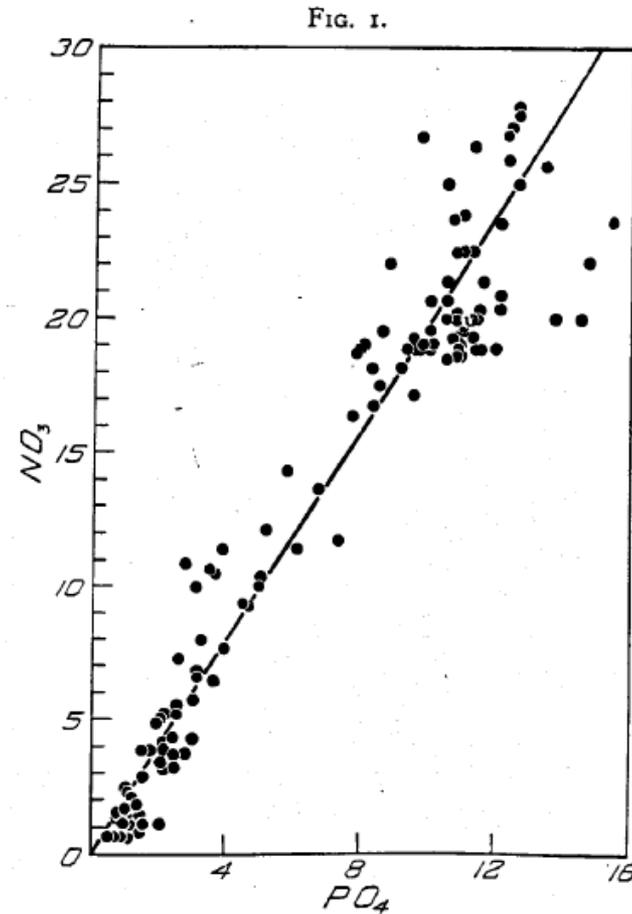


Alfred Redfield

“Life in the sea cannot be understood without understanding the sea itself.”

Found that the proportions of nitrogen and phosphorus are strikingly similar in phytoplankton and in seawater.

Chicken and egg problem: Does phytoplankton reflect the composition of seawater, or is it the phytoplankton that affect the composition of seawater?



Correlation between concentrations of nitrate and phosphate in the waters of western Atlantic Ocean. Ordinate, concentration of nitrate, units 10^{-3} millimols per liter; abscissa, concentration of phosphate, units 10^{-4} millimols per liter. The line represents a ratio of $\Delta N : \Delta P = 20 : 1$ milligram atoms.

Ocean primary production

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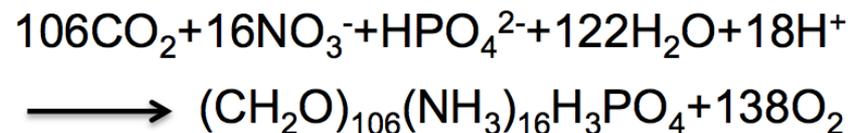
Redfield ratio

Phytoplankton carbon:
nitrogen: phosphorus ratio

C:N:P \approx 106:16:1

(in number of atoms)

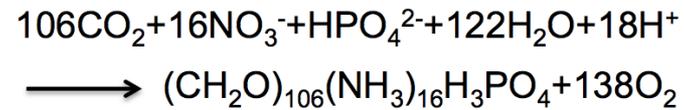
Formula summarizing the production of organic matter:



Ocean primary production

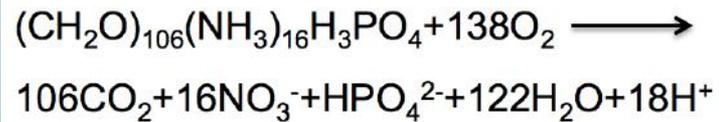
-controlling factors: nutrients

Mixed layer: nutrients are consumed by primary producers



Deep ocean: nutrients are reintroduced in the water when the organic matter is remineralized.

At the same time oxygen is consumed.



Ocean primary production

-controlling factors: nutrients

Mixed layer: nutrients are consumed by primary producers

Deep ocean: nutrients are reintroduced in the water when the organic matter is remineralized.

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Introduction to Oceanography by Paul Webb

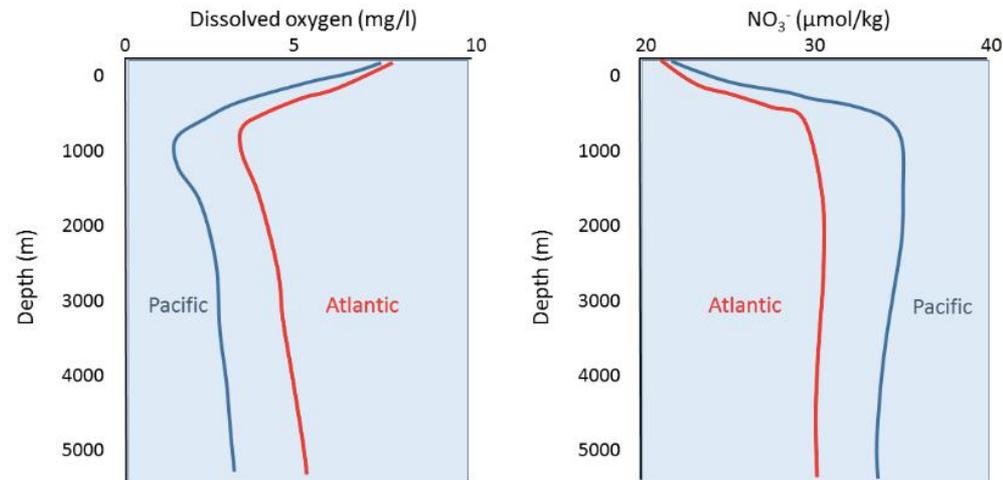
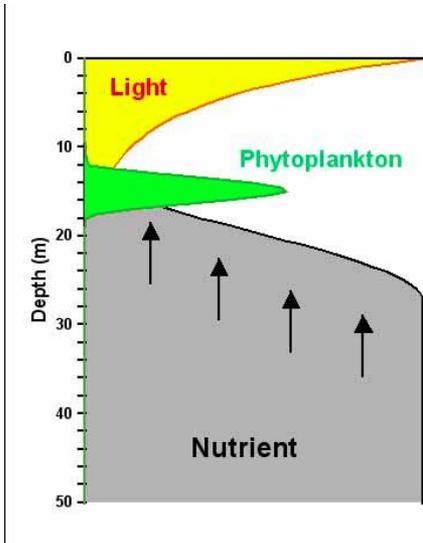


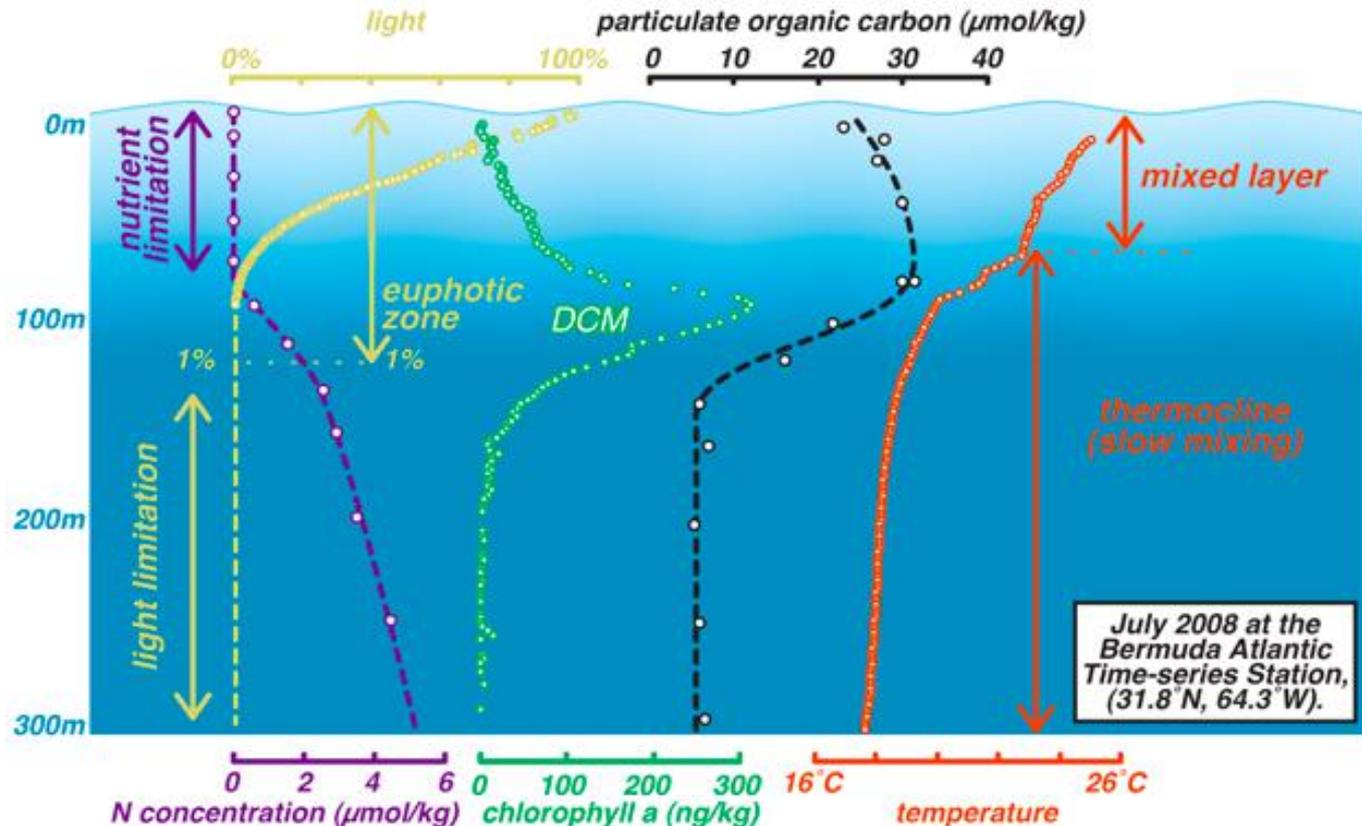
Figure 5.6.3 Dissolved oxygen (left) and nutrient (right) profiles for the Pacific and Atlantic Oceans. As water circulates from the Atlantic to the Pacific, oxygen is consumed while nutrients accumulate (PW).

Ocean primary production

-controlling factors: nutrients



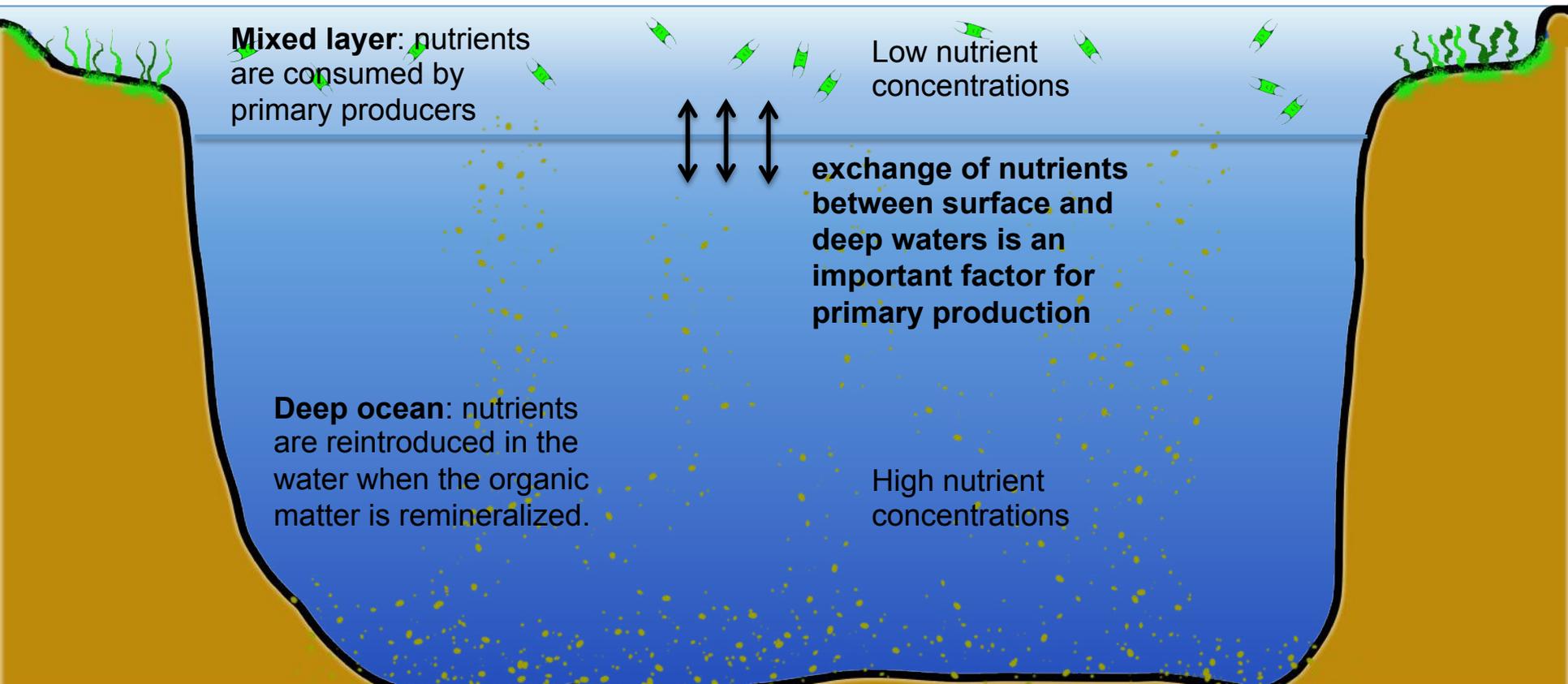
Opposing vertical gradients in light and nutrients can result in accumulation of phytoplankton at the base of the mixed layer.



Sigman, D. M. & Hain, M. P. (2012) The Biological Productivity of the Ocean. *Nature Education Knowledge* 3(10):21

Ocean primary production

-controlling factors: nutrients

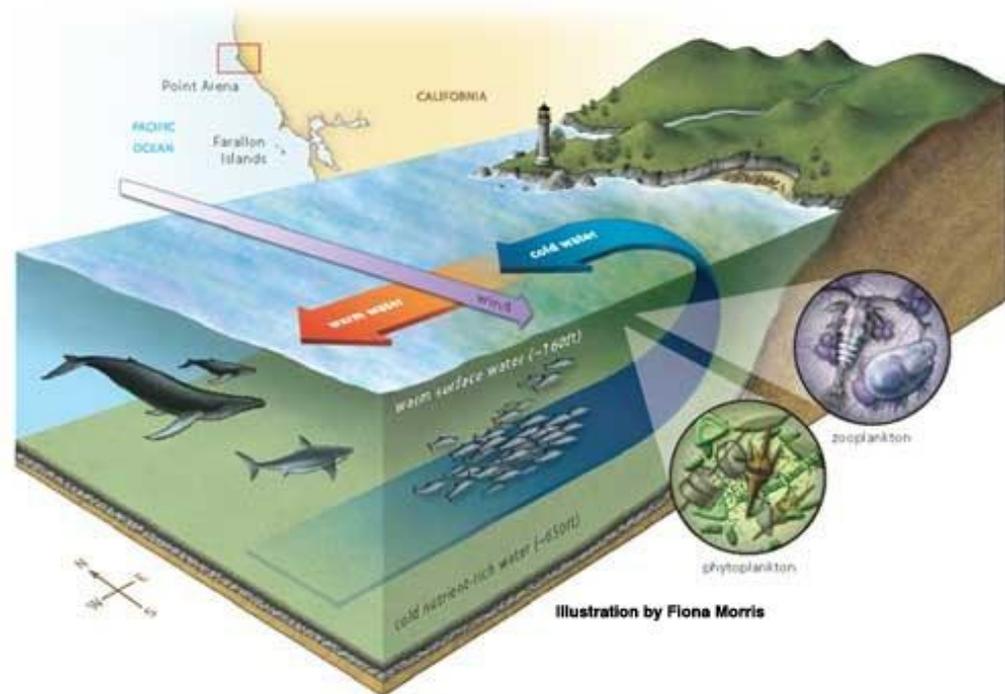
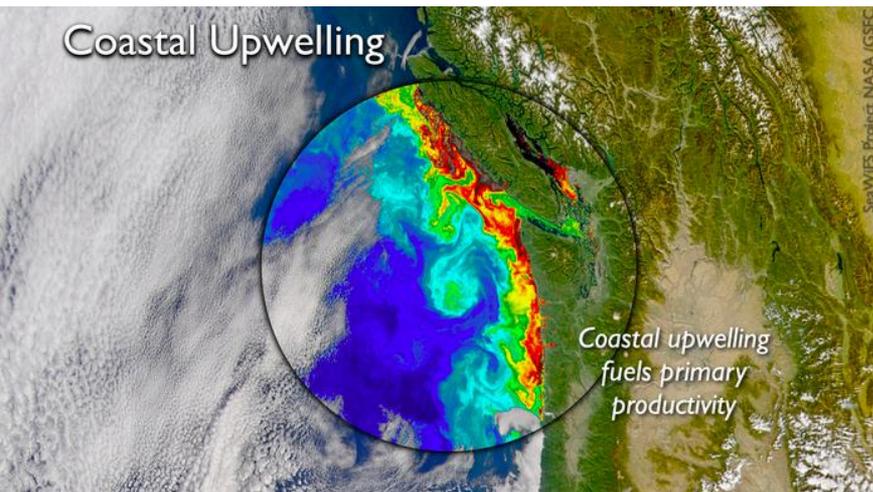


Ocean primary production

-controlling factors: nutrients

Examples of processes influencing vertical exchange

- Coastal upwelling
- Equatorial upwelling
- Convective overturning/ Winter convection (seasonally stratified oceans)
- Rossby waves

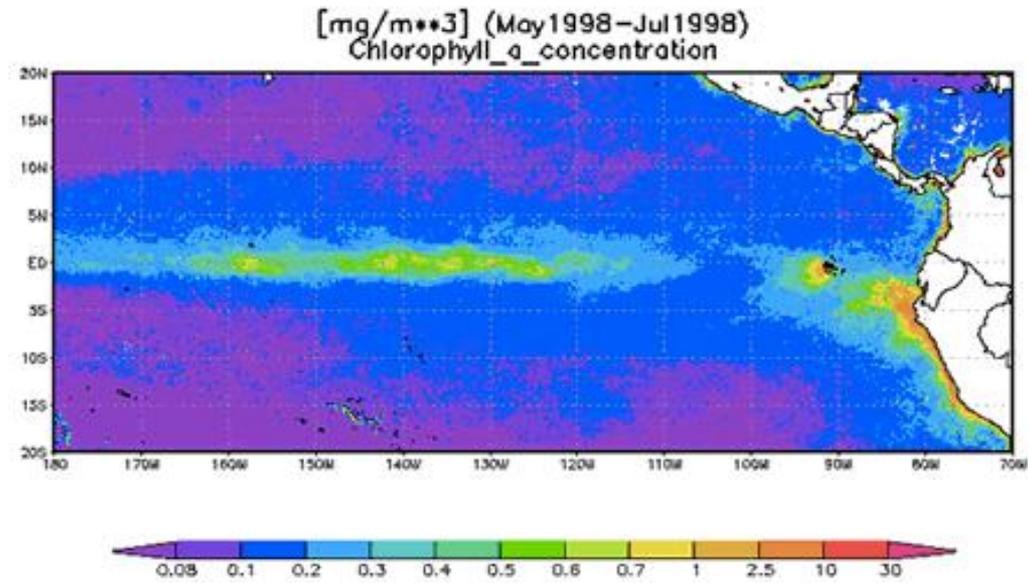
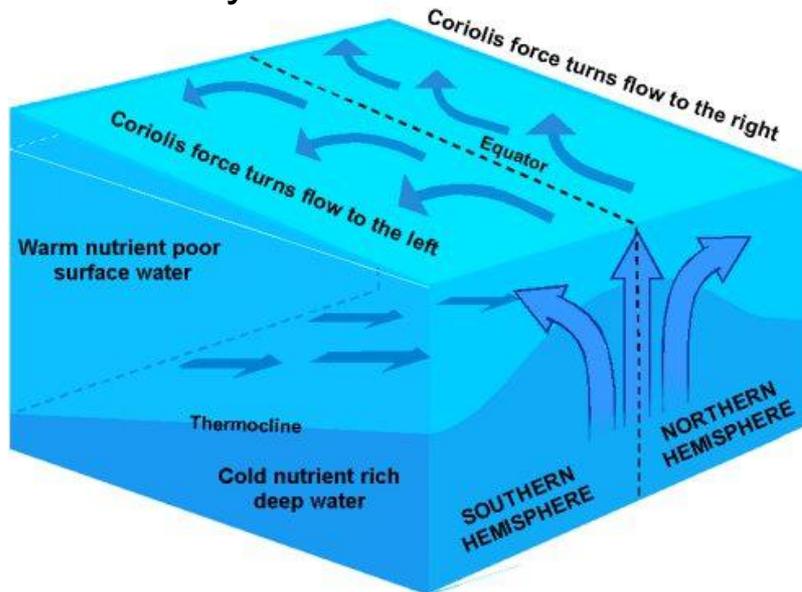


Ocean primary production

-controlling factors: nutrients

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- **Equatorial upwelling**
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Ocean primary production

-controlling factors: nutrients

Examples of processes influencing vertical exchange

- Coastal upwelling
- Equatorial upwelling
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- Rossby waves

Example from the Southern Ocean

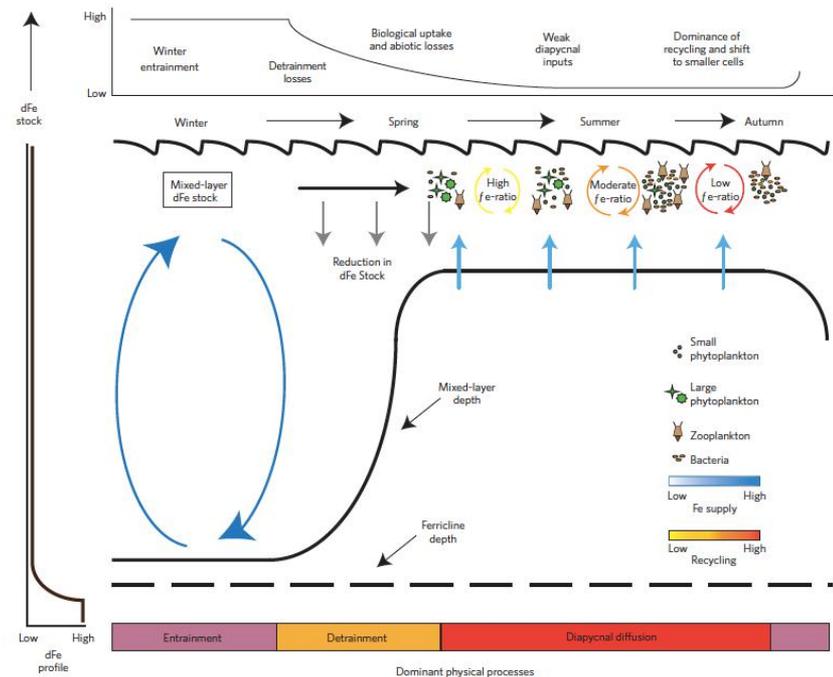


Figure 4 | A schematic representation of the seasonal variability in Southern Ocean Fe cycling. We emphasize seasonal changes in the physical supply of Fe (blue arrows), mixed-layer depth and the mixed-layer DFe inventory, as well as the magnitude of recycling (yellow, orange and red arrows) and pelagic community composition. The dominant physical mixed processes over the season is conceptualized at the bottom of the figure. We note that some recycling probably occurs below the mixed layer and can be entrained the following winter.

Ocean primary production

-controlling factors: nutrients

Examples of processes influencing vertical exchange

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- Equatorial upwelling
- Convective overturning/ Winter convection
(seasonally stratified oceans)
- Rossby waves

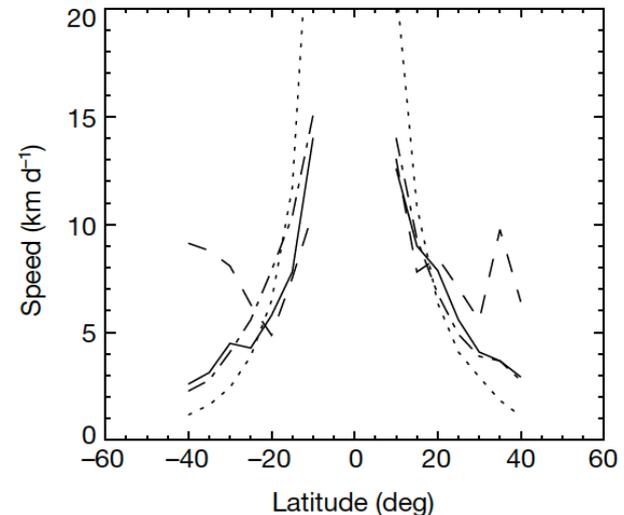
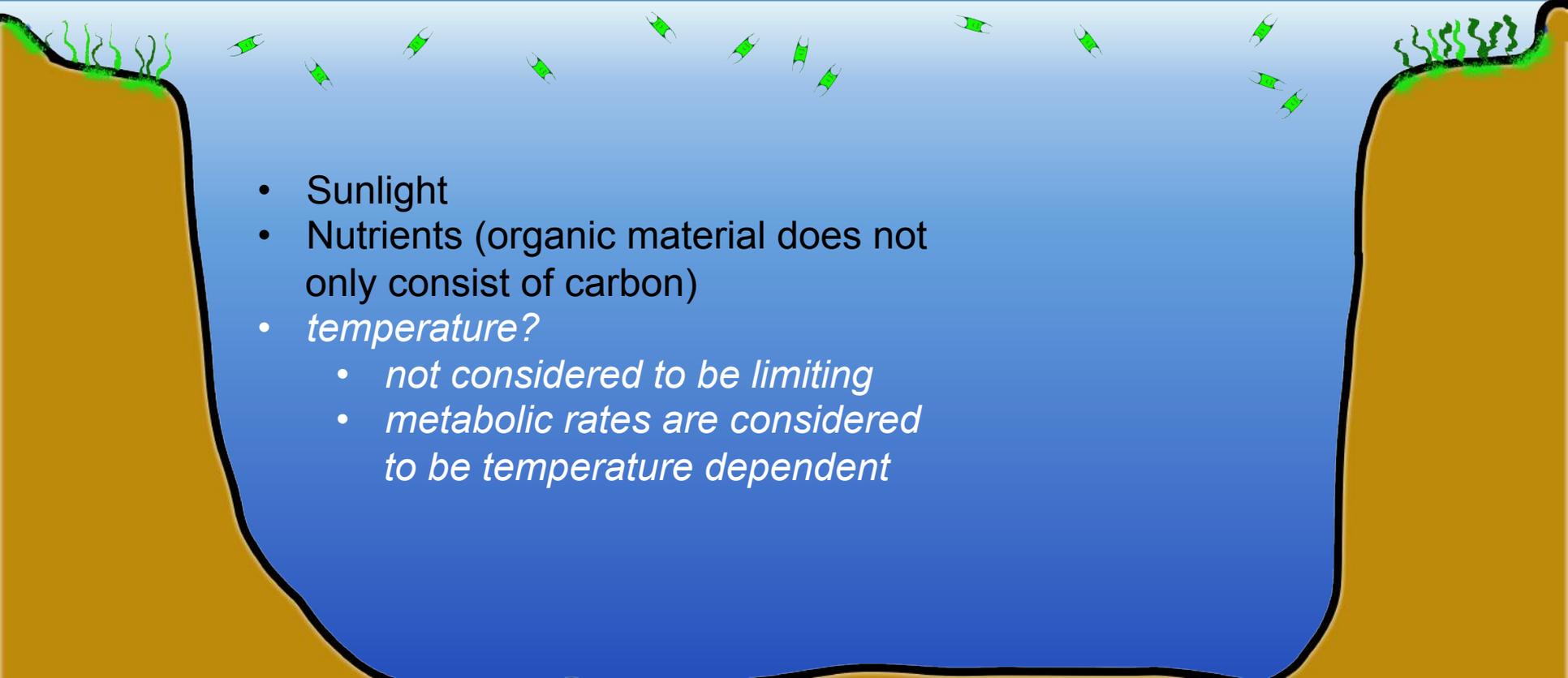


Figure 3 Propagation speeds of Chl and SSH anomalies. The figure shows that propagation speeds of chlorophyll anomalies associated with baroclinic features vary with latitude in nearly the same way as do the theoretical phase speeds of Rossby waves (dotted lines). The propagation speeds are estimated from the wavenumber spectra of chlorophyll (dash-dot line), sea surface height (SSH; dashed line) and chlorophyll–SSH coherence (solid lines) in the Pacific Ocean. The theoretical speeds are based on baroclinic radii of deformation from ref. 15.

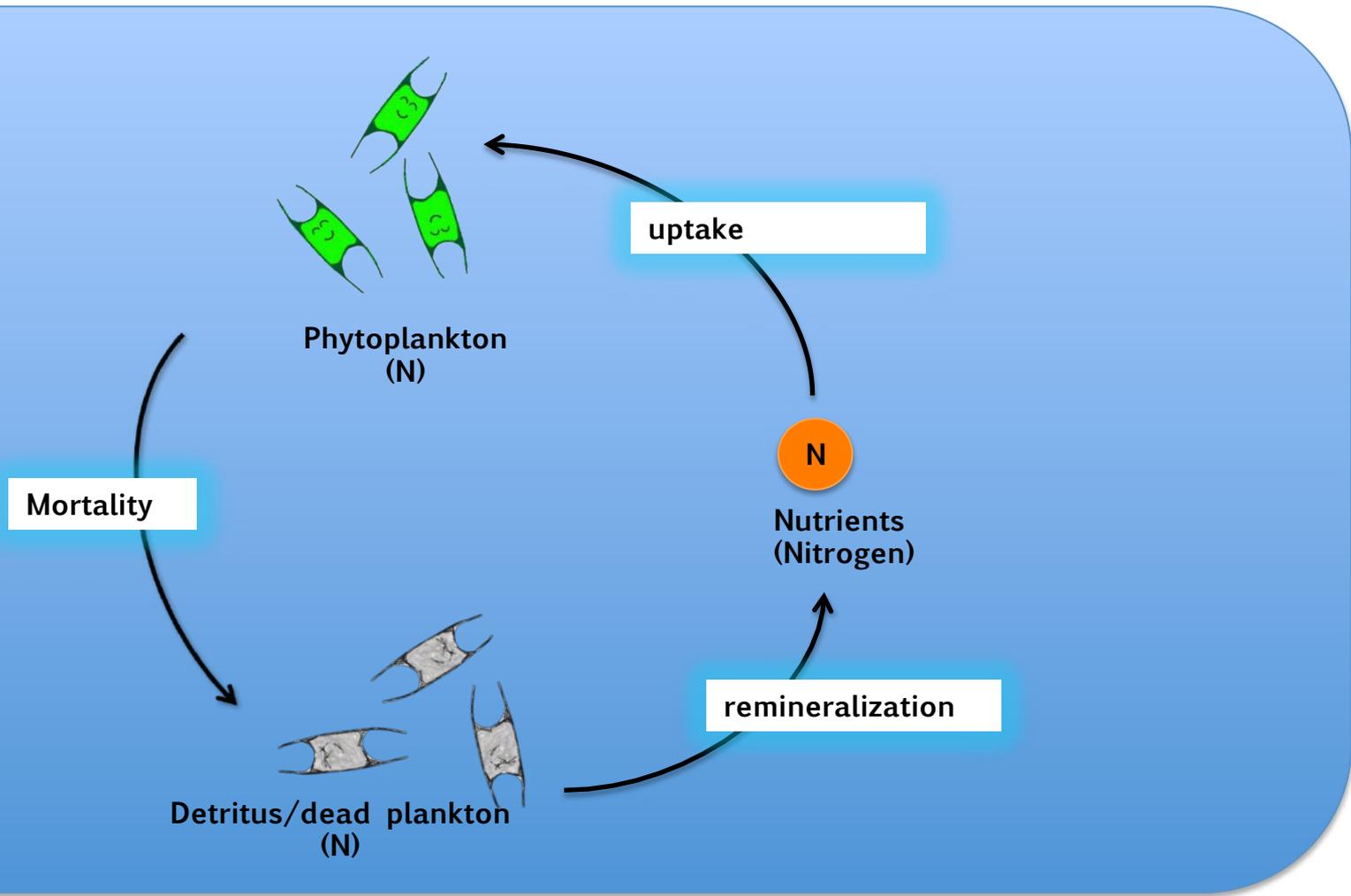
Ocean primary production -controlling factors

- 
- A cross-sectional diagram of an ocean basin. The water is blue, and the seabed is brown. Green wavy lines at the surface represent phytoplankton. Small green oval shapes with tails are scattered throughout the water column, representing zooplankton. A list of controlling factors is overlaid on the water column.
- Sunlight
 - Nutrients (organic material does not only consist of carbon)
 - *temperature?*
 - *not considered to be limiting*
 - *metabolic rates are considered to be temperature dependent*

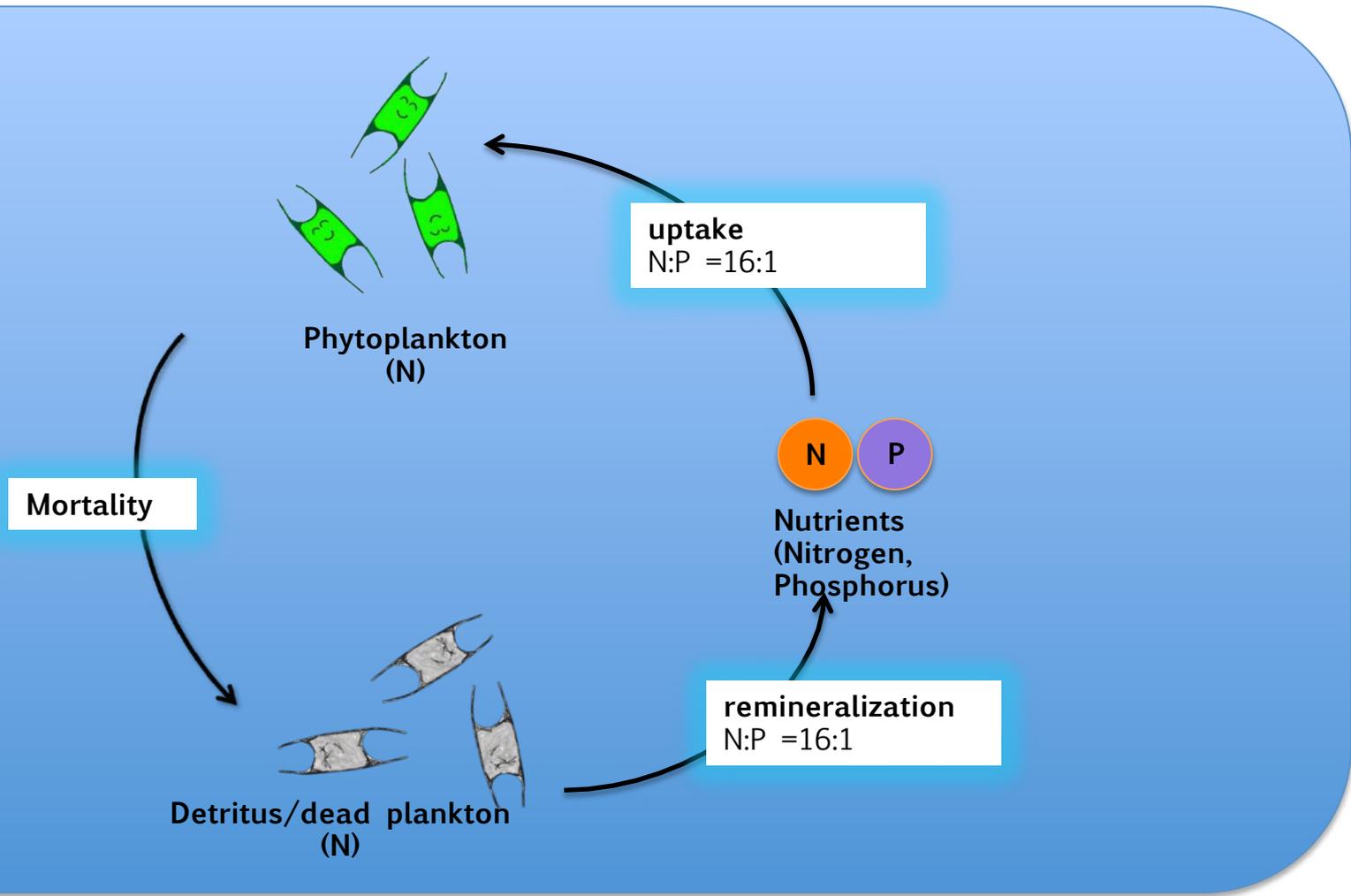
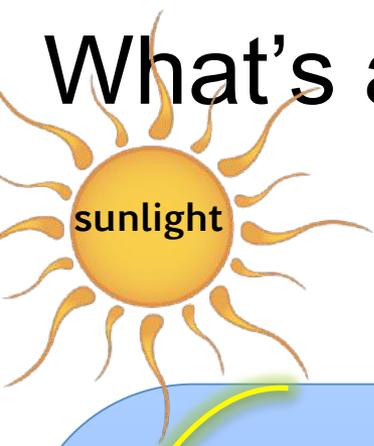
Outline

- Ocean primary production (biogeochemistry)
 - introduction/definitions
 - controlling factors
 - light
 - nutrients
 - (temperature?)
- Ocean biogeochemical models
 - what's a biogeochemical model?
 - coupling to ocean physical models
 - examples of biogeochemical models in CMIP
- Biogeochemical Predictions
 - ongoing research

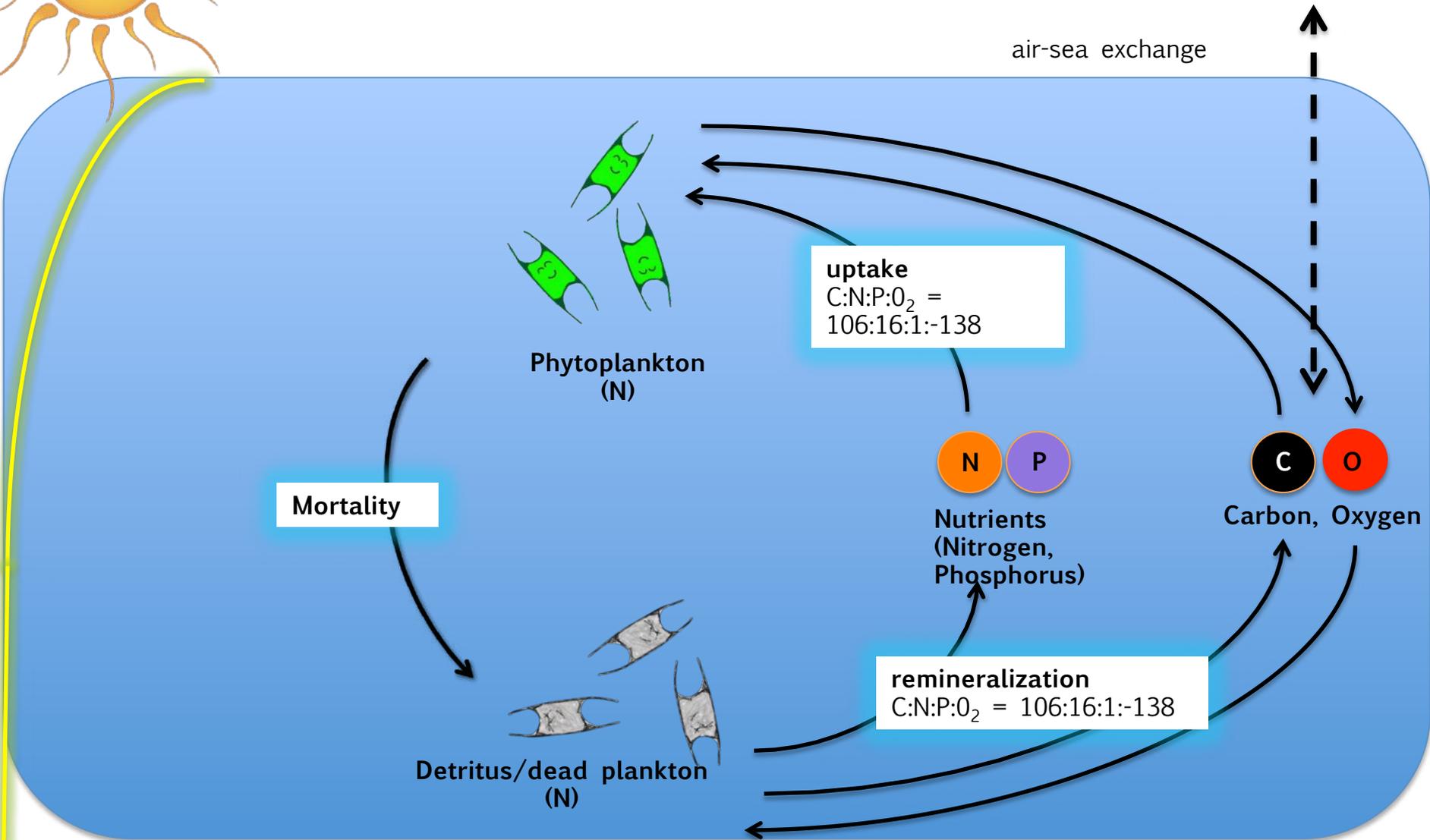
What's a biogeochemical model?



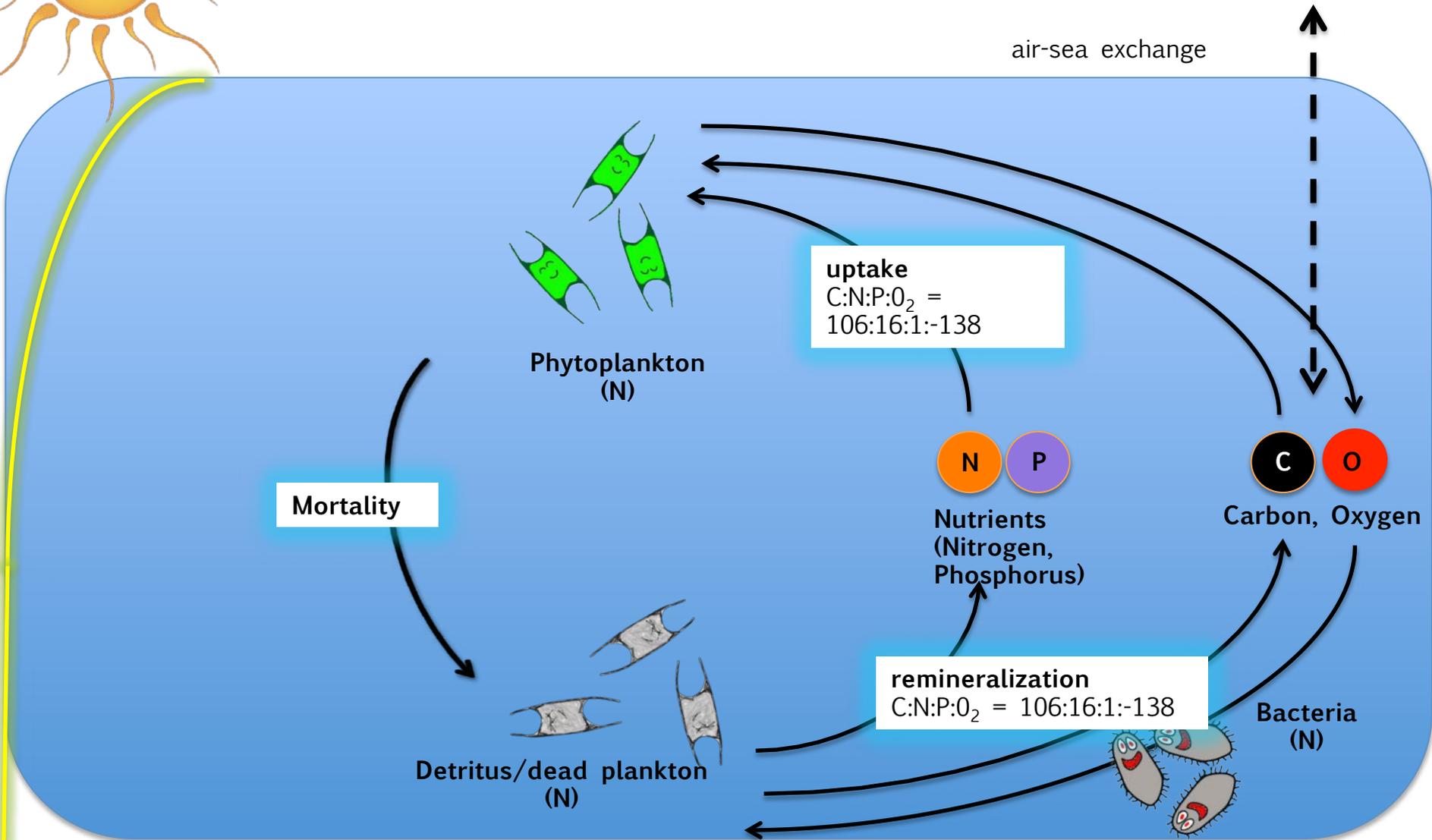
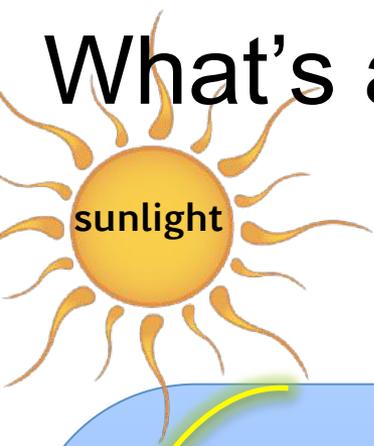
What's a biogeochemical model?



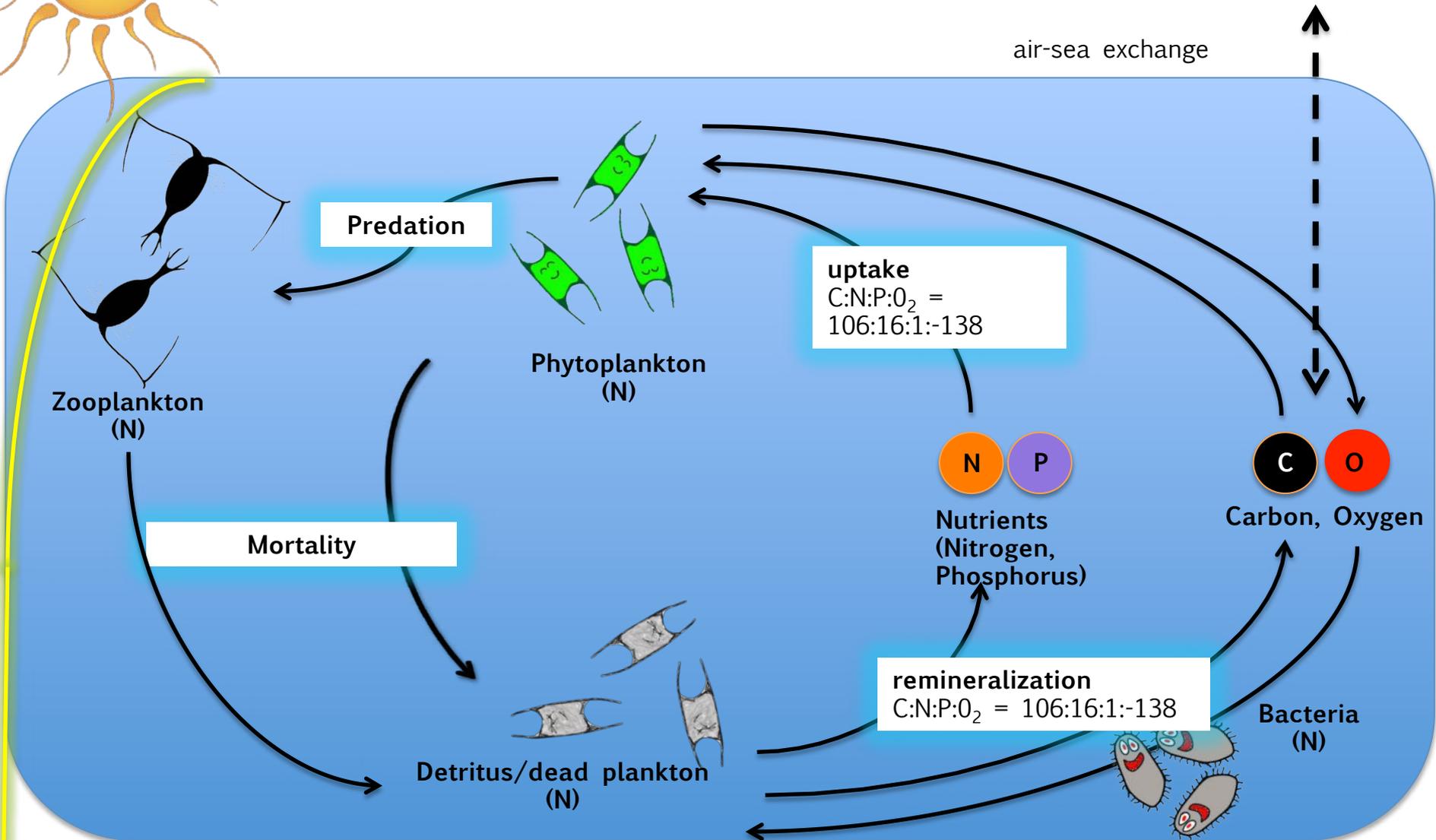
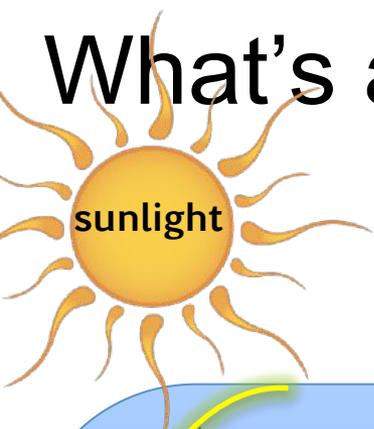
What's a biogeochemical model?



What's a biogeochemical model?



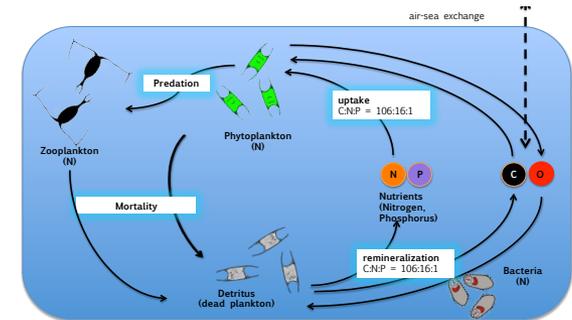
What's a biogeochemical model?



Biogeochemical modelling

Biogeochemical models

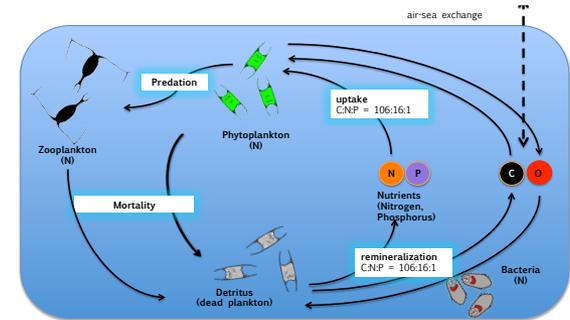
- model the cycling of material between organic and inorganic forms
- contain from 1 to up to more than 100 state variables that all have their own sources/sinks (**F**)
- Sources/sinks (**F**):
 - Internal (material stays in the system): mortality, predation, remineralization, uptake, primary production
 - External (material leaves/enters the system): sedimentation/burial, terrestrial input, air-sea exchange



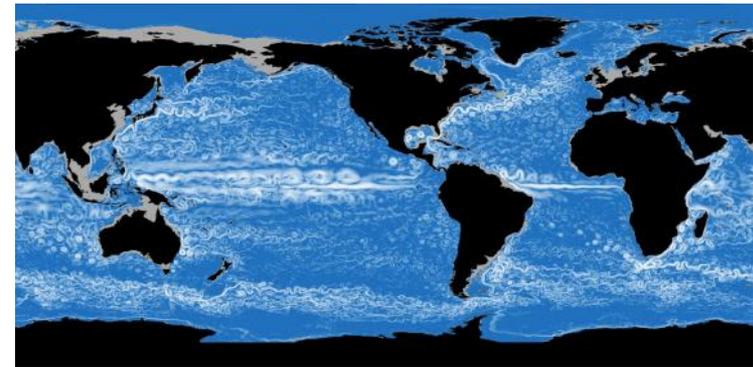
Biogeochemical modelling

- Biogeochemical models can be coupled to ocean circulation models.
- State variables are treated as tracers (C):

$$\frac{\partial C}{\partial t} = -\mathbf{u} \cdot \nabla C + \nabla_h(K_h \nabla_h)C + \frac{\partial}{\partial z} \left(K_z \frac{\partial C}{\partial z} \right) + F$$

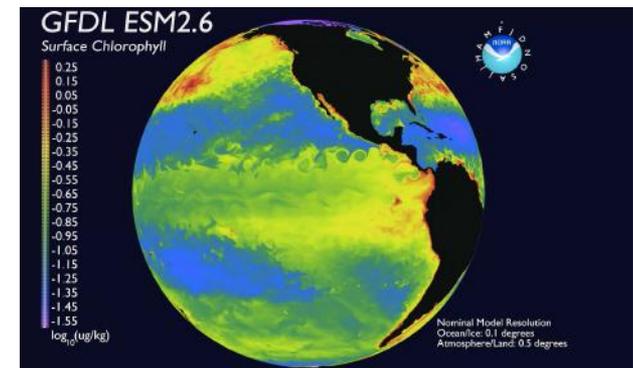


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nemo-ocean.eu

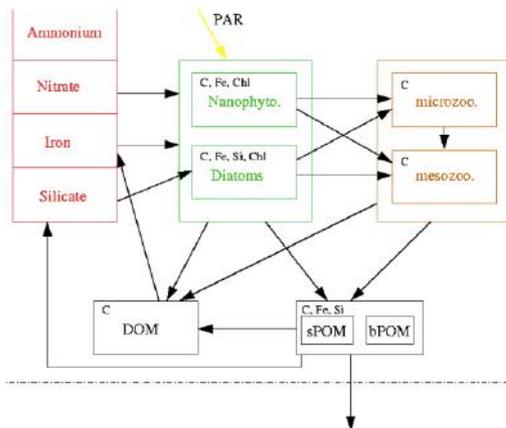
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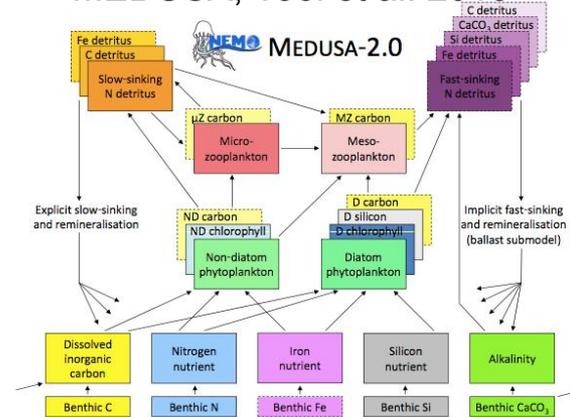
Biogeochemical modelling

Examples of biogeochemical models in CMIP

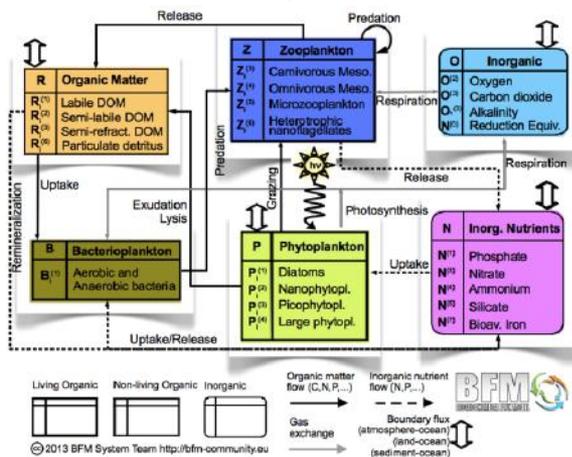
PISCES, Aumont et al. 2015



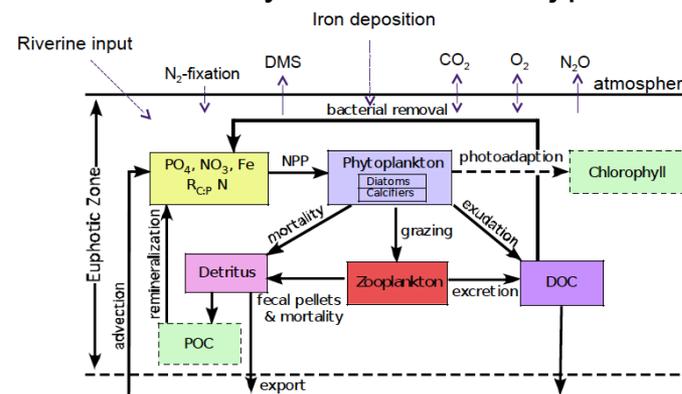
MEDUSA, Yool et al. 2013



BFM/PELAGOS, Vichi et al. 2015

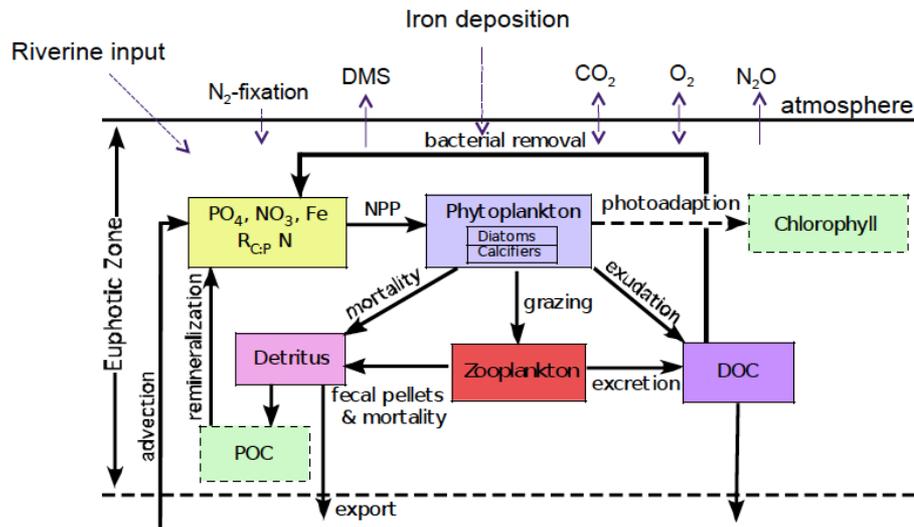


HAMOCC, Ilyina et al 2013, Tjiputra et al. 2013

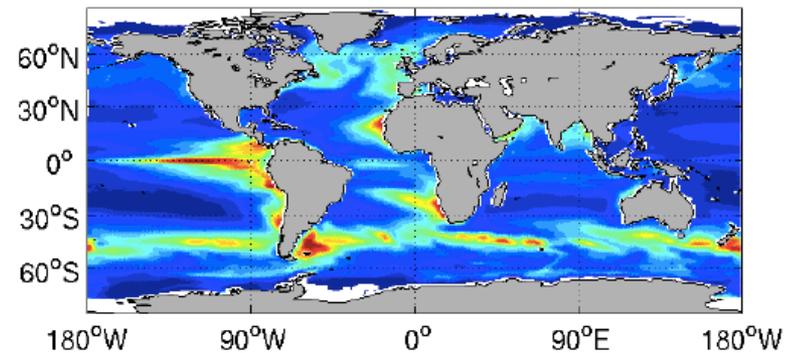


Biogeochemical modelling

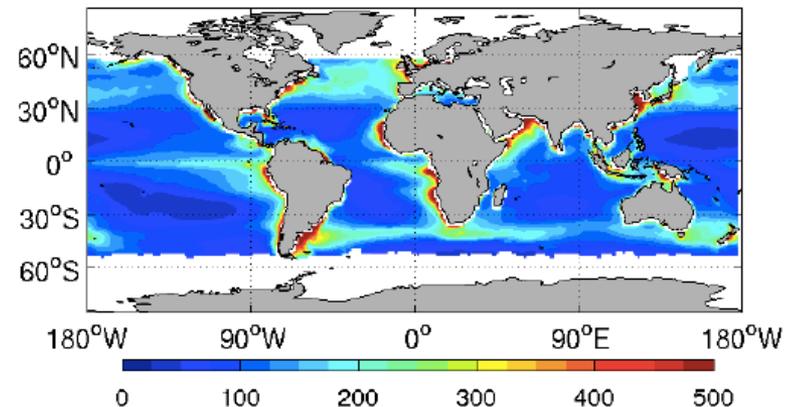
HAMOCC in NorESM (Tjiputra et al. 2013)



Model mean NPP



Observational estimate of NPP



Outline

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 - ongoing research

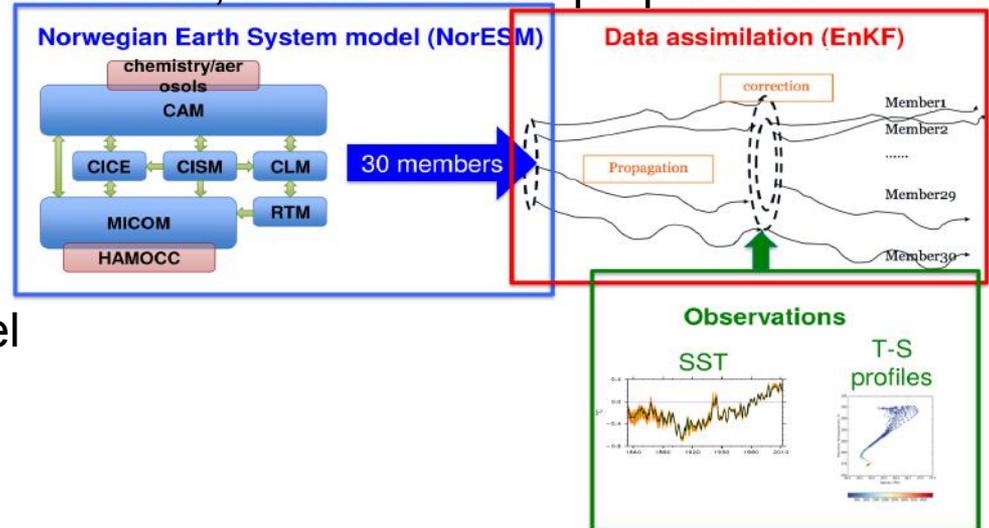
Biogeochemical predictions

What is a climate prediction model?

Climate prediction models

- Earth system model
 - Dynamic atmosphere
 - Land model
 - Sea ice model
 - Ocean circulation model
 - Ocean biogeochemical model
- Possibility to assimilate observational data

NorCPM, Bethke et al. in preparation



Biogeochemical predictions

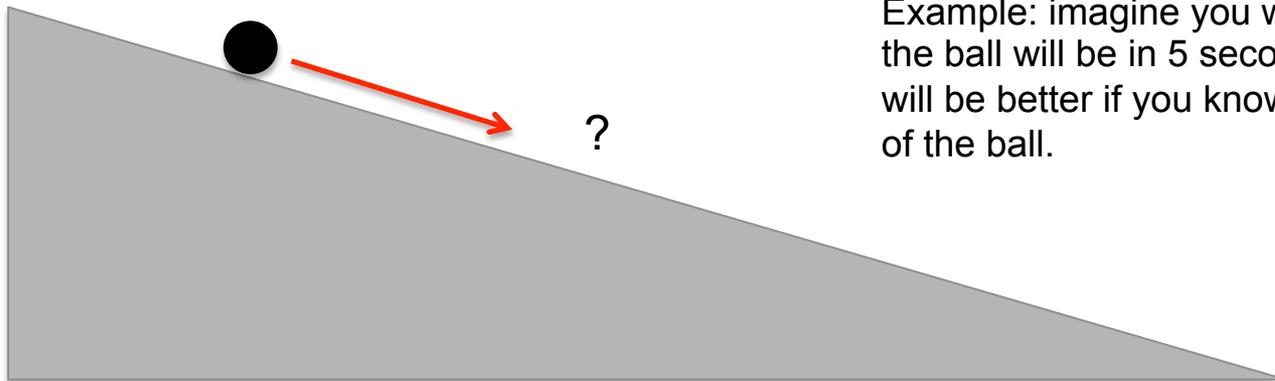
Predictions involves two types of simulations:

- Assimilation runs (Reanalyses): observational data is assimilated into the model to nudge the climate/ocean state as close to the “truth” as possible. These are later used as initial conditions for predictions.

Biogeochemical predictions

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Example: imagine you want to predict where the ball will be in 5 seconds. The prediction will be better if you know the initial position of the ball.

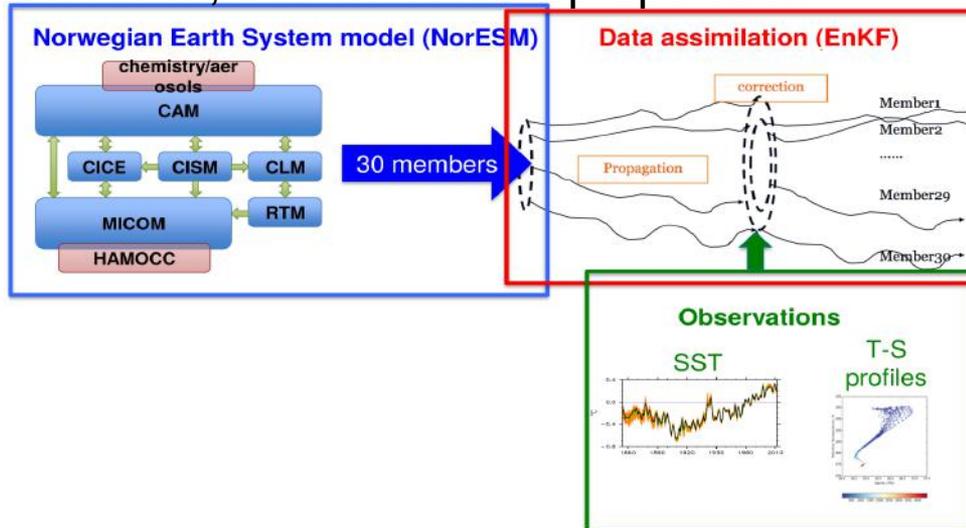
Biogeochemical predictions

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Commonly assimilated variables include SST and temperature and salinity profiles.

NorCPM, Bethke et al. in preparation

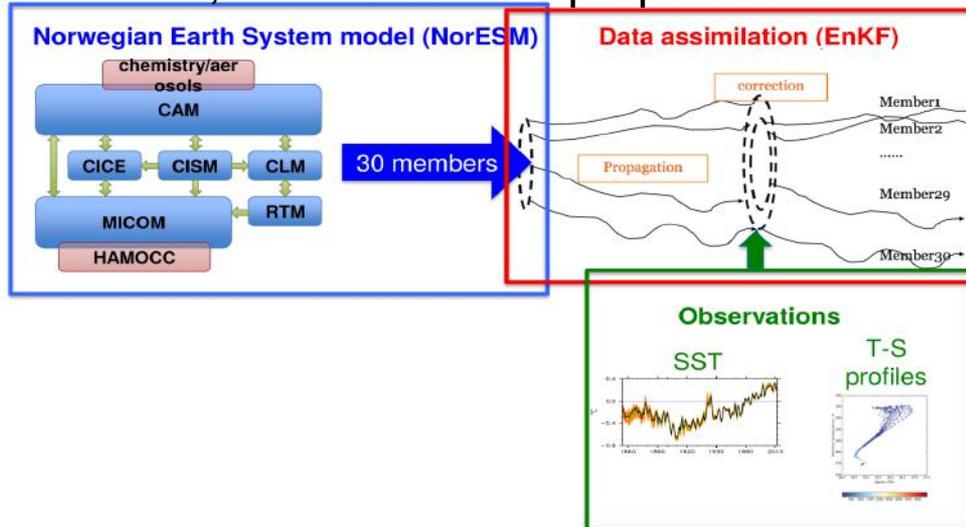


Biogeochemical predictions

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NorCPM, Bethke et al. in preparation



Commonly assimilated variables include SST and temperature and salinity profiles.

Until now no climate prediction model includes assimilation of biogeochemical tracers. Does this matter?

Biogeochemical predictions

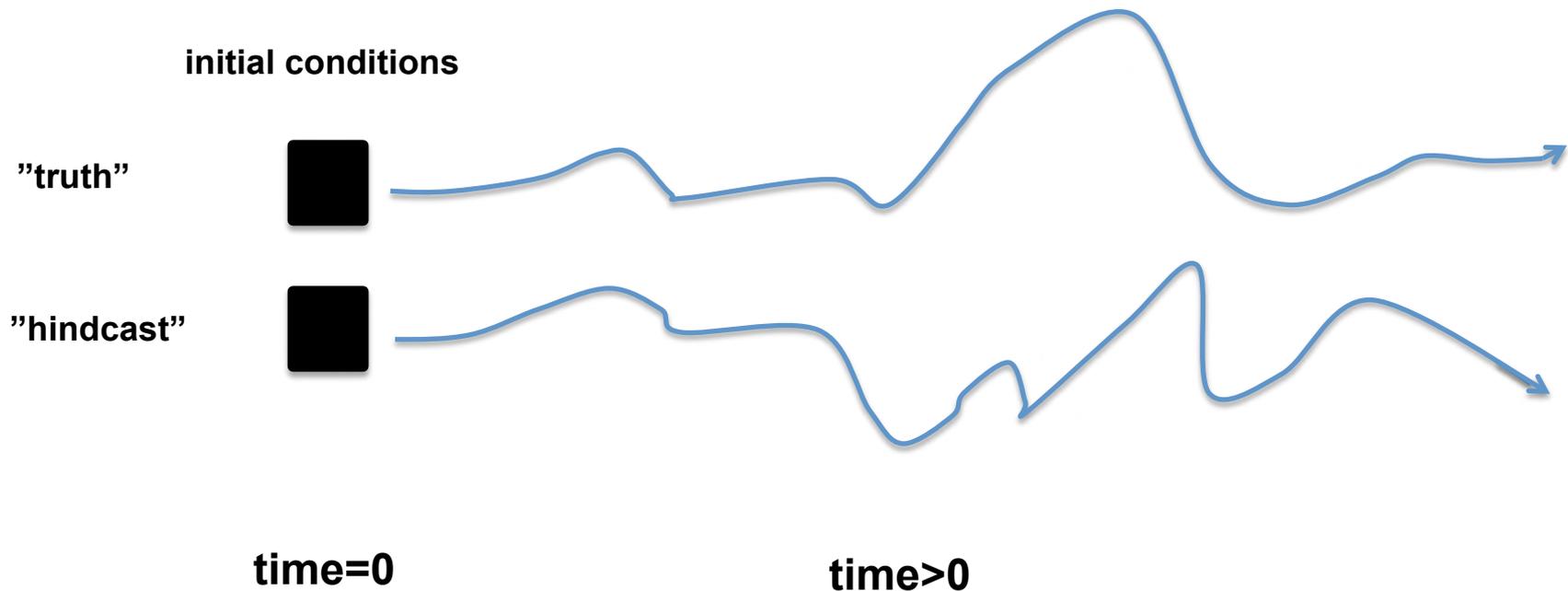
Do the BGC initial conditions matter?

Biogeochemical predictions

Do the BGC initial conditions matter?

Experiment in a perfect model framework

- how well can the model predict itself?

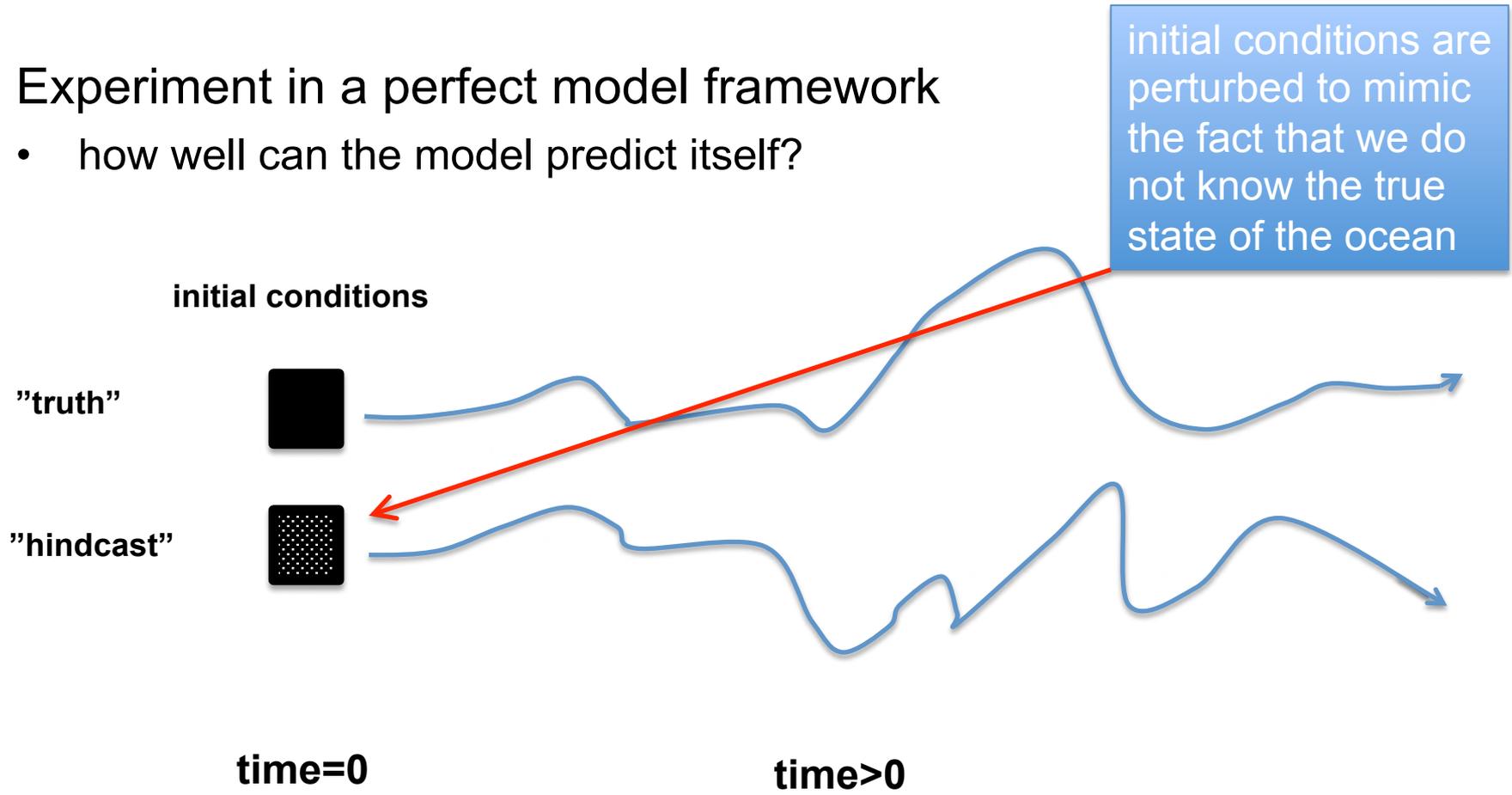


Biogeochemical predictions

Do the BGC initial conditions matter?

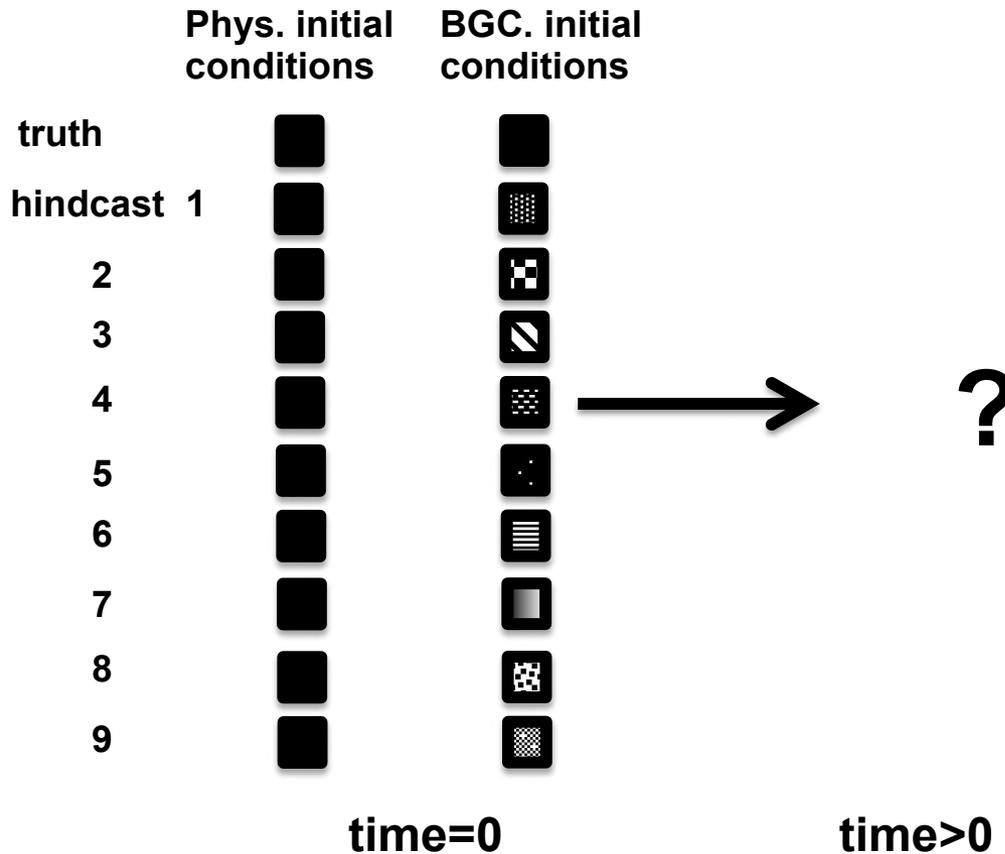
Experiment in a perfect model framework

- how well can the model predict itself?



Biogeochemical predictions

Do the BGC initial conditions matter?



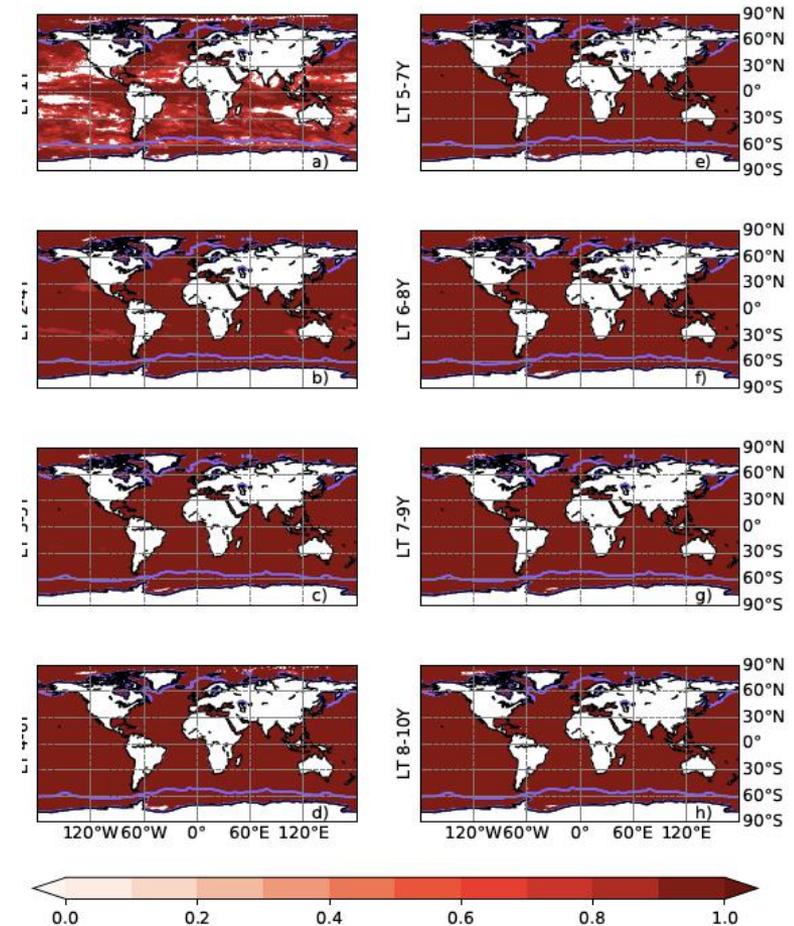
Perfect model experiment:

- An ensemble with 10 members
- Member 1=truth
- Members 2-10 = hindcasts
- Identical physical initial conditions
- BGC initial conditions with perturbations

Biogeochemical predictions

Do the BGC initial conditions matter?

- Biogeochemical initial conditions are only important for the first lead year.
- A good knowledge of the initial state of the ocean physics is sufficient for skillfull BGC predictions (assimilation of BGC observations not needed)



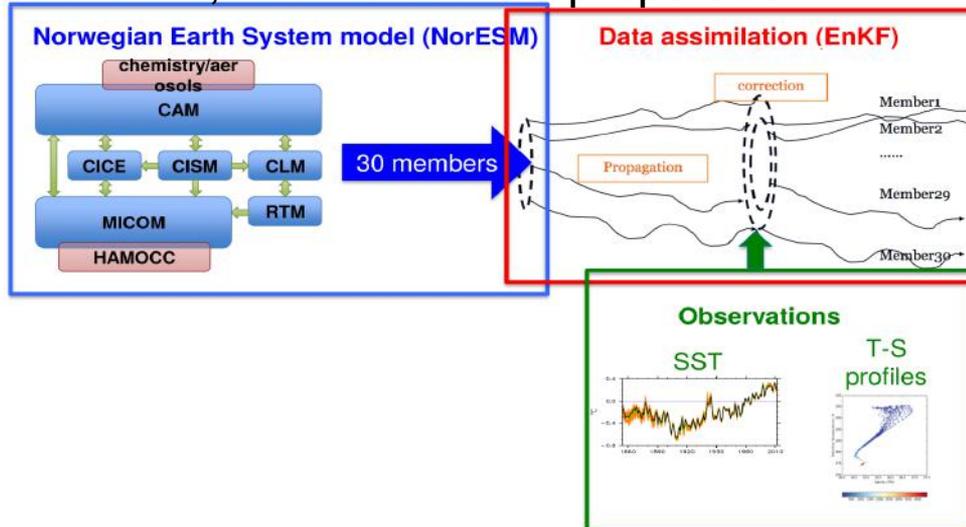
Fransner et al., in revision

Biogeochemical predictions

Predictions involves two types of simulations:

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NorCPM, Bethke et al. in preparation



Commonly assimilated variables include SST and temperature and salinity profiles.

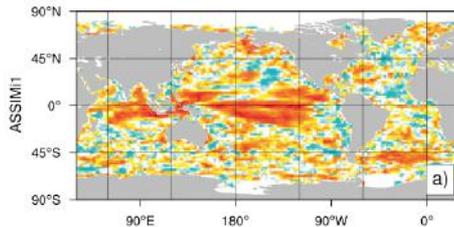
Until now no climate prediction model includes assimilation of biogeochemical tracers. Does this matter? - Not for interannual to decadal predictions.

Biogeochemical predictions

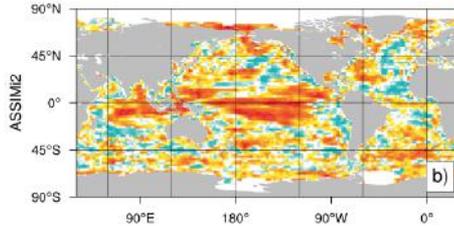
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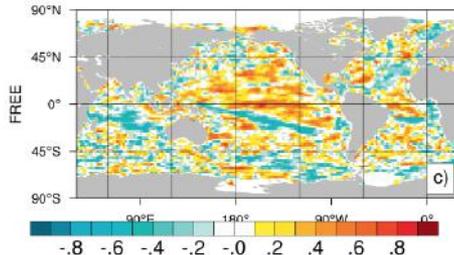
2003-2018



Assimilation run 1



Assimilation run 2



FREE (historical) run
- no data assimilation

Anomaly correlation between modelled NPP and observed NPP (annual means).

In NorCPM, assimilation of SST and T & S profiles improves the representation of annual mean primary production especially in the tropical Pacific and Indian Oceans.

Biogeochemical predictions

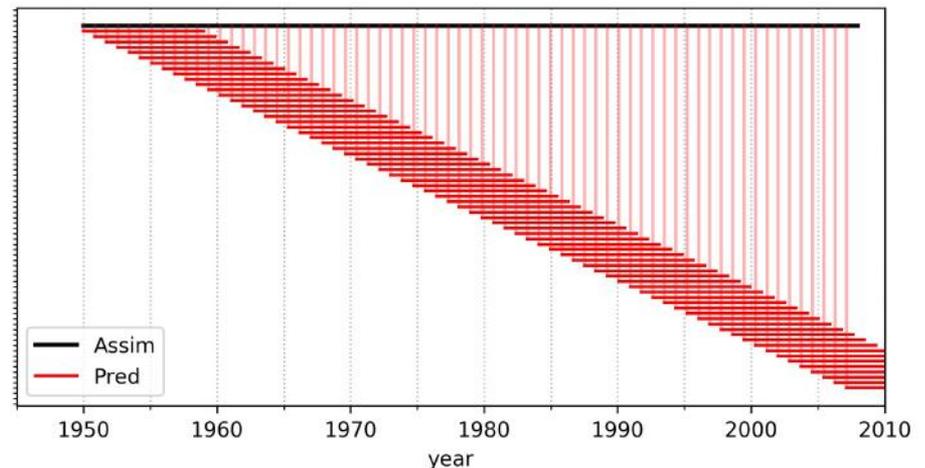
Predictions involves two types of simulations:

- Assimilation runs (Reanalyses)
- Prediction runs: The model is launched, using output from the assimilation run as initial conditions, and runs freely with only external forcing (i.e. anthropogenic and volcanic).

Biogeochemical predictions

Predictions involves two types of simulations:

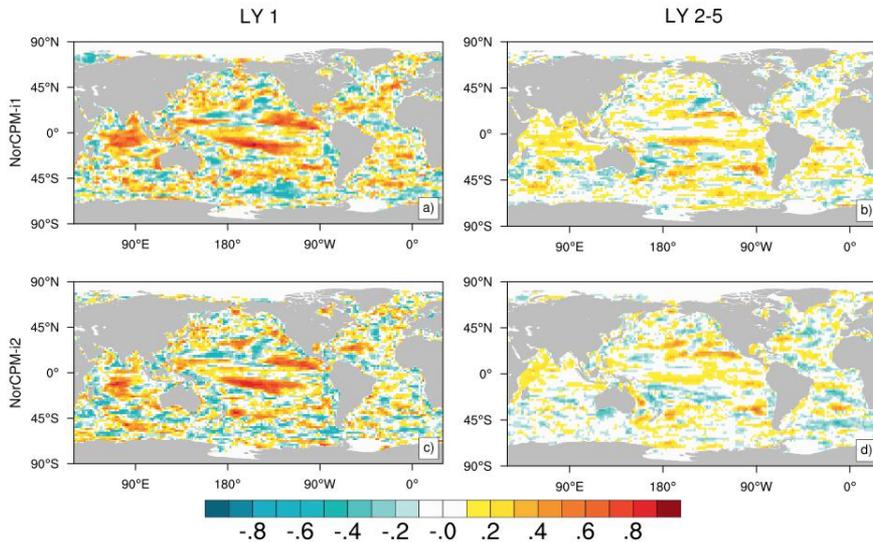
- Assimilation runs (Reanalyses)
- Prediction runs: The model is launched, using output from the assimilation run as initial conditions, and runs freely with only external forcing (i.e. anthropogenic and volcanic).
 - Seasonal predictions – 1 year long runs, starting every 3rd month
 - Decadal predictions – 10 year long runs, starting every year



Biogeochemical predictions

Predictability of NPP

Bethke et al. in preparation



Decadal predictions/hindcasts:
NorCPM shows predictive skill of primary production one year after the initialization of the hindcasts in the tropical Pacific and Indian Oceans.

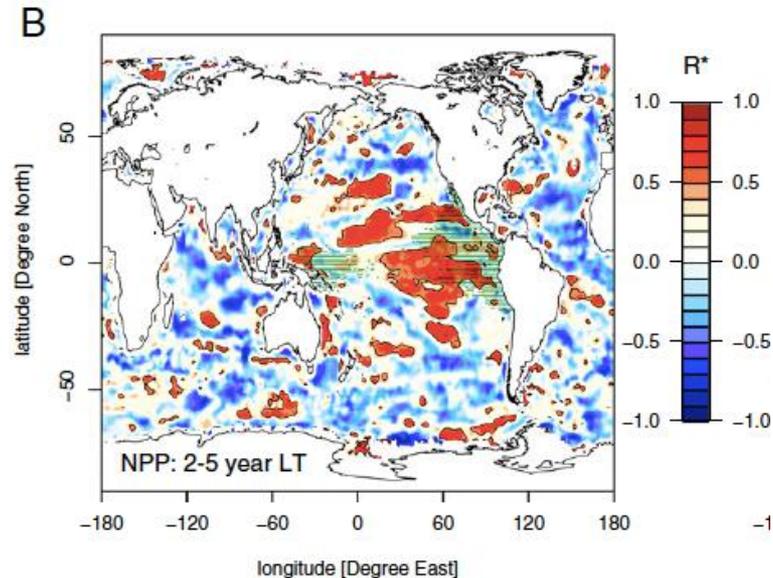
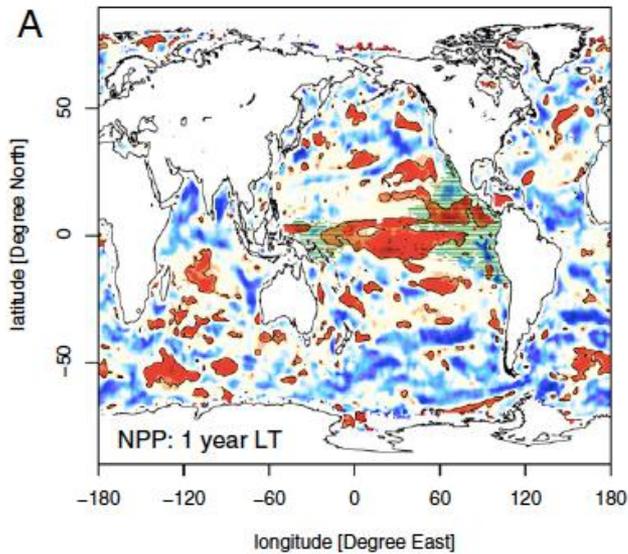
Anomaly correlation between modelled NPP and observed NPP (annual means).

Biogeochemical predictions

Predictability of NPP

Predictability of NPP in the tropical Pacific Ocean was also found by Seferian et al. 2014.

- Initial conditions from reanalyzes with assimilated SST
- Comparison with NPP calculated based on satellite chlorophyll data
- Predictive skill of net primary production of up to 2-5 years



Biogeochemical predictions

Can they be extended into ecosystems?

Biogeochemical predictions

Can they be extended into ecosystems?

RESEARCH

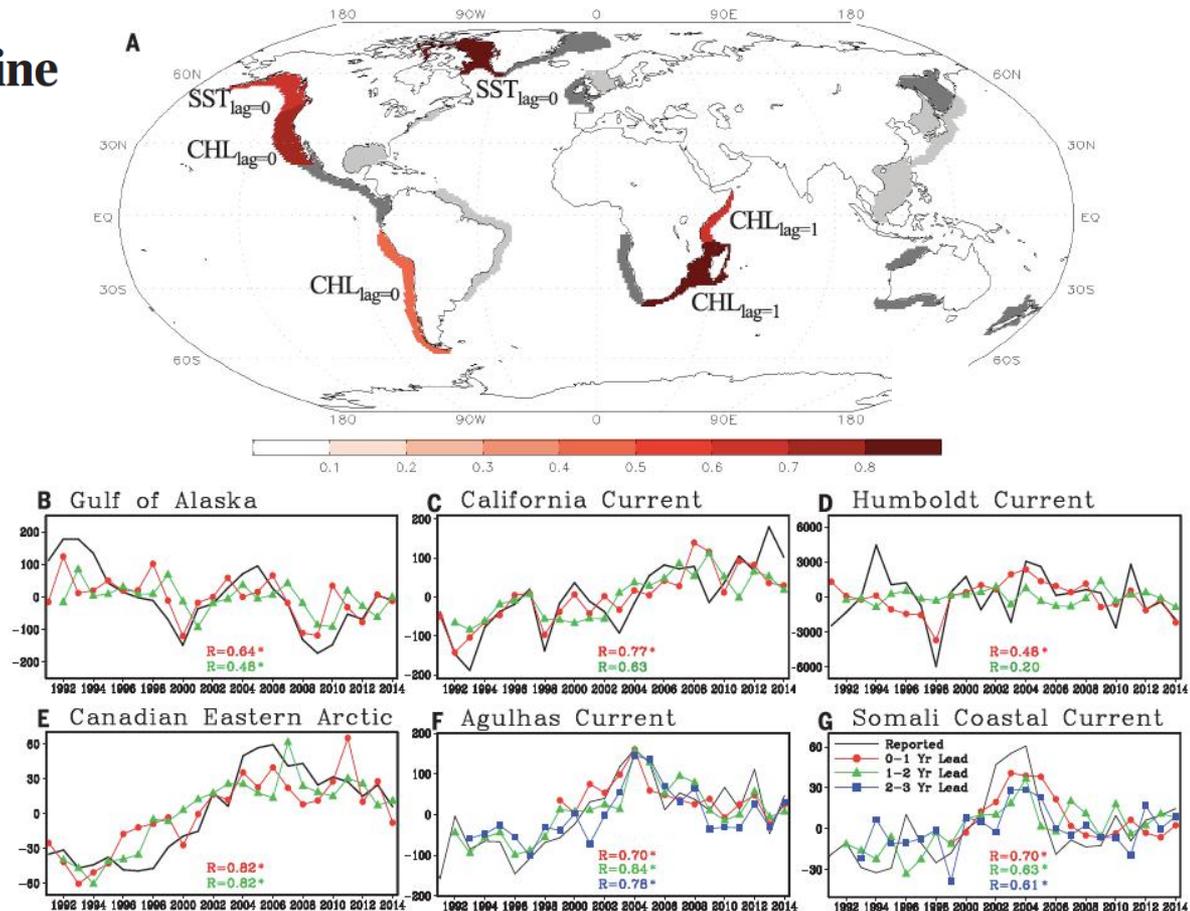
Park et al. 2019

MARINE MANAGEMENT

Seasonal to multiannual marine ecosystem prediction with a global Earth system model

Jong-Yeon Park^{1,2,3*,†}, Charles A. Stock^{2†}, John P. Dunne², Xiaosong Yang², Anthony Rosati²

Skillfull prediction of fish catches 2-5 years ahead by using SST and chlorophyll output from decadal prediction runs.



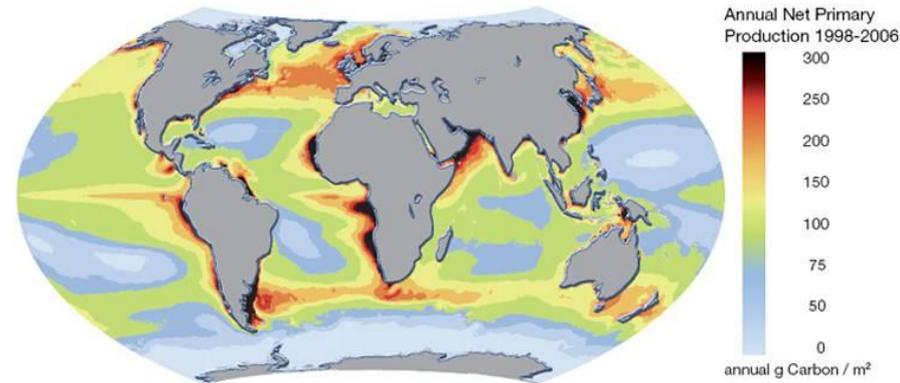
Thank you!

Ocean primary production

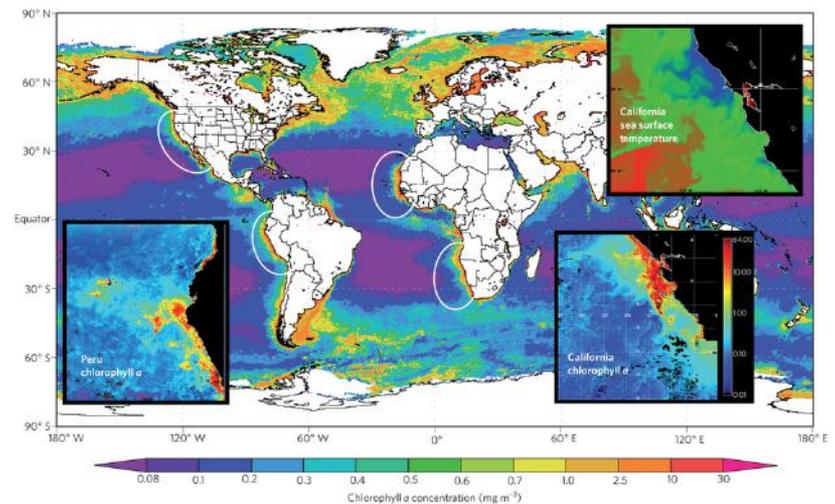
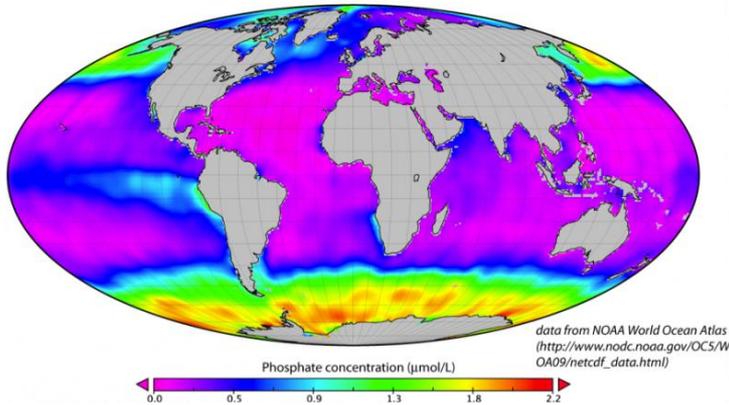
-controlling factors: nutrients

Examples of processes influencing vertical exchange

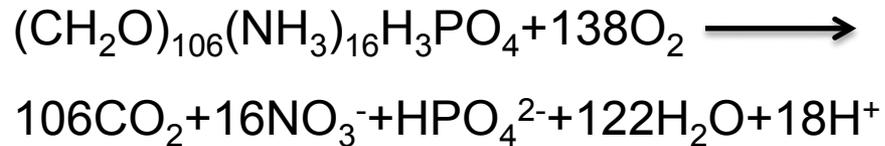
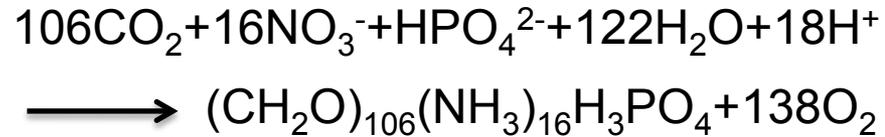
- Coastal upwelling
- Equatorial upwelling
- Convective overturning/ Winter convection (seasonally stratified oceans)
- Rossby waves

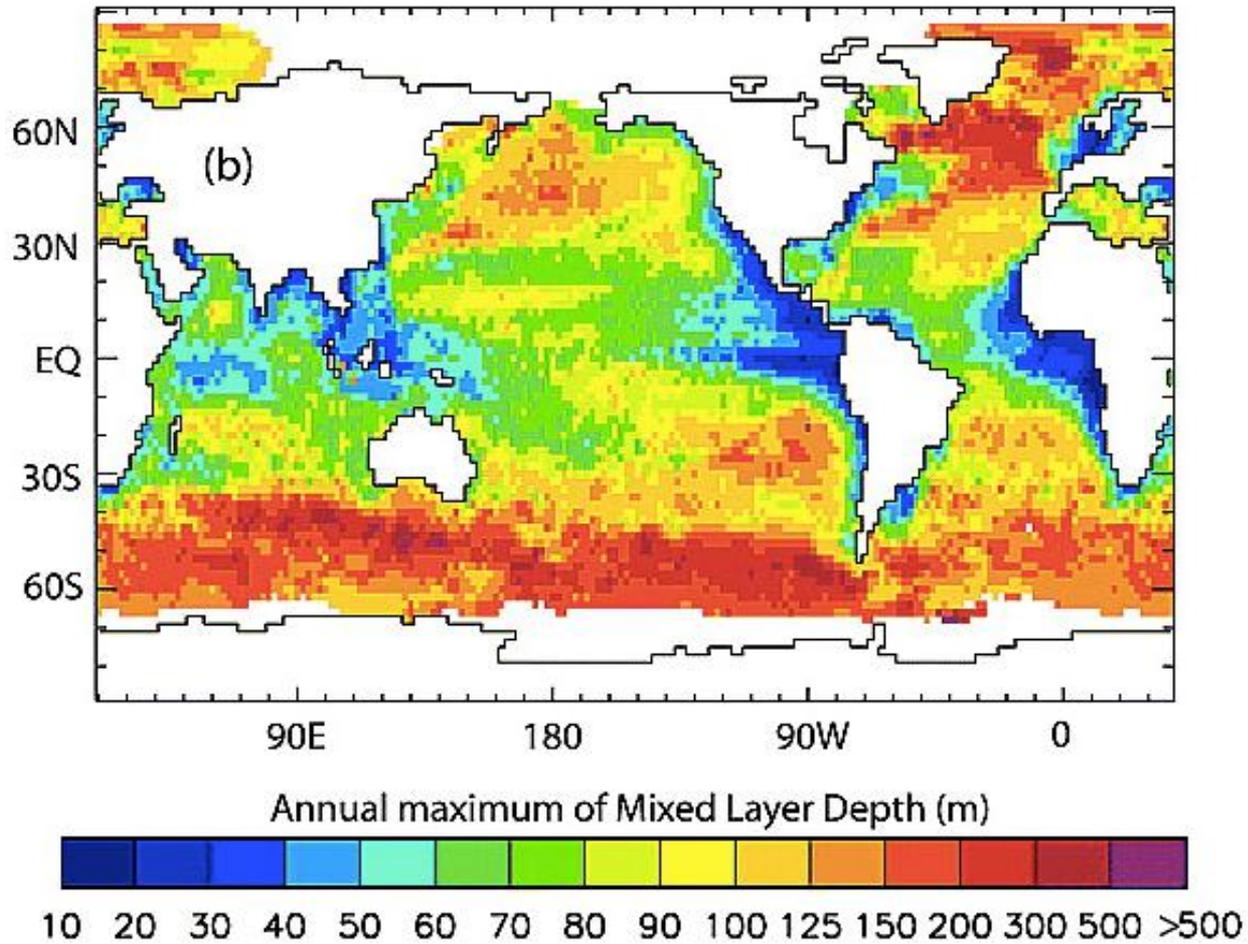


Ocean Phosphate Concentration



Extra slides





de Boyer Montégut et al 2004

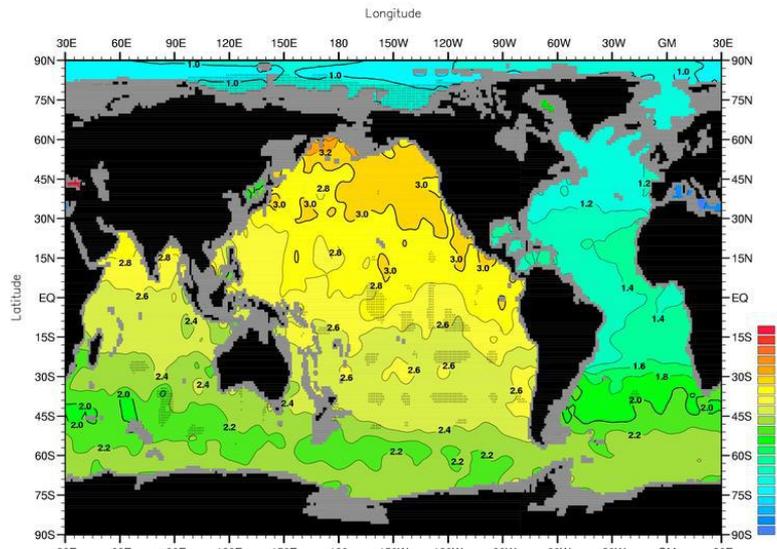


Fig. A2-26. Annual mean phosphate (μM) at 2000 m. depth.
 Minimum Value= 0.11 Maximum Value= 4.50
 Contour Interval: 0.20

World Ocean Atlas 2001
 Ocean Climate Laboratory/NODC

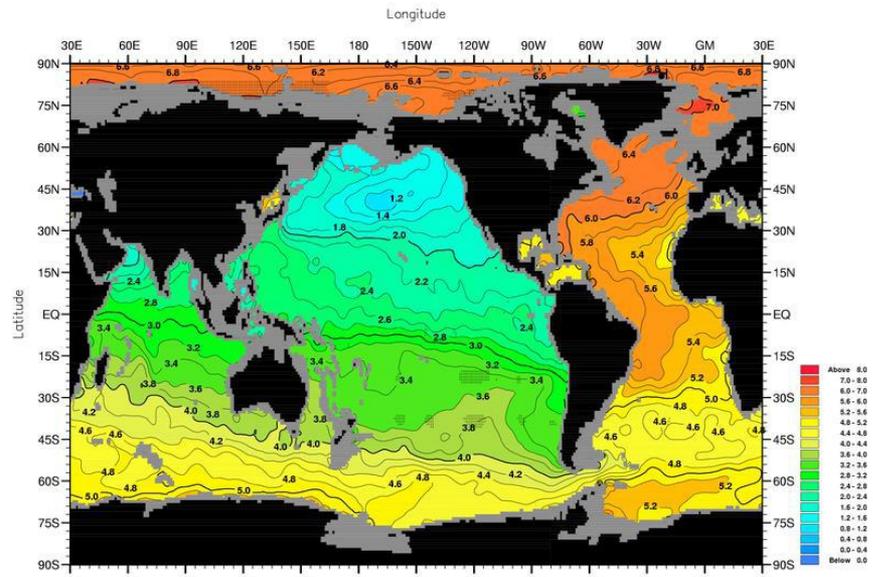
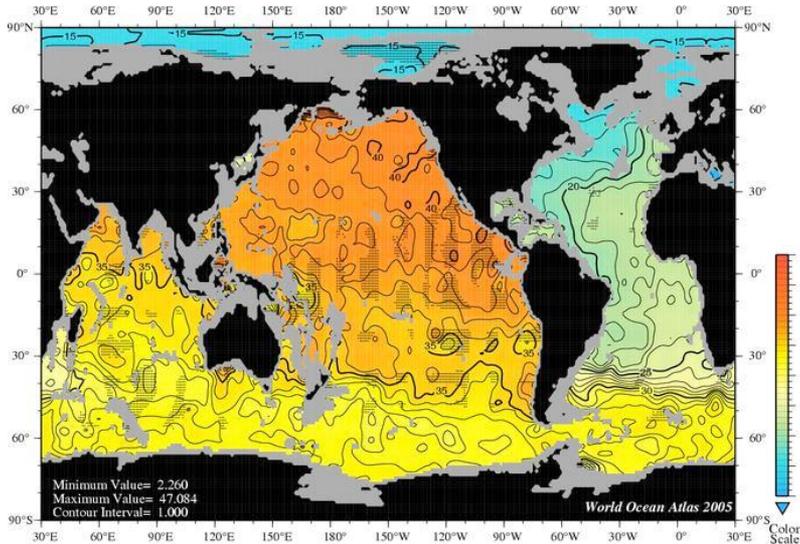


Fig. A2-26. Annual mean oxygen (ml/l) at 2000 m. depth.
 Minimum Value= 0.00 Maximum Value= 7.16
 Contour Interval: 0.20

World Ocean Atlas 2001
 Ocean Climate Laboratory/NODC

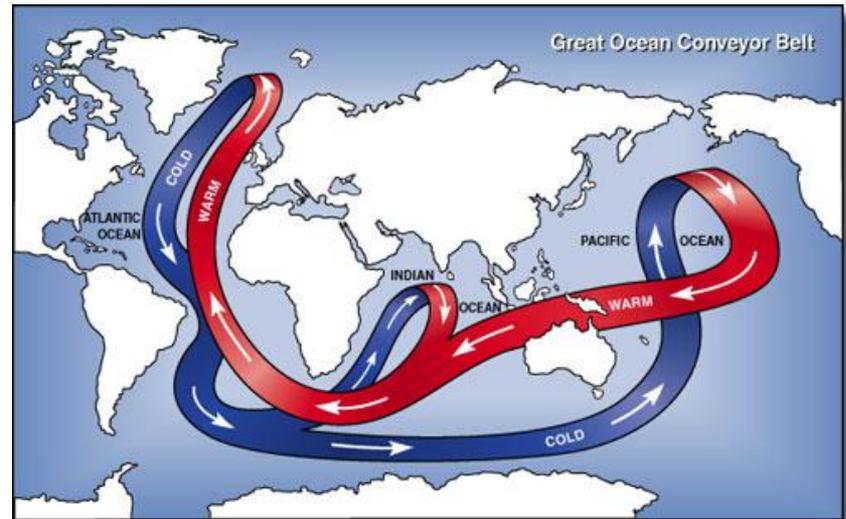
Annual nitrate [$\mu\text{mol/l}$] at 3000 m. depth.



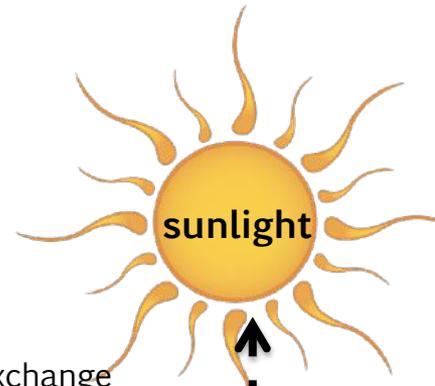
Minimum Value= 2.260
 Maximum Value= 47.084
 Contour Interval= 1.000

World Ocean Atlas 2005

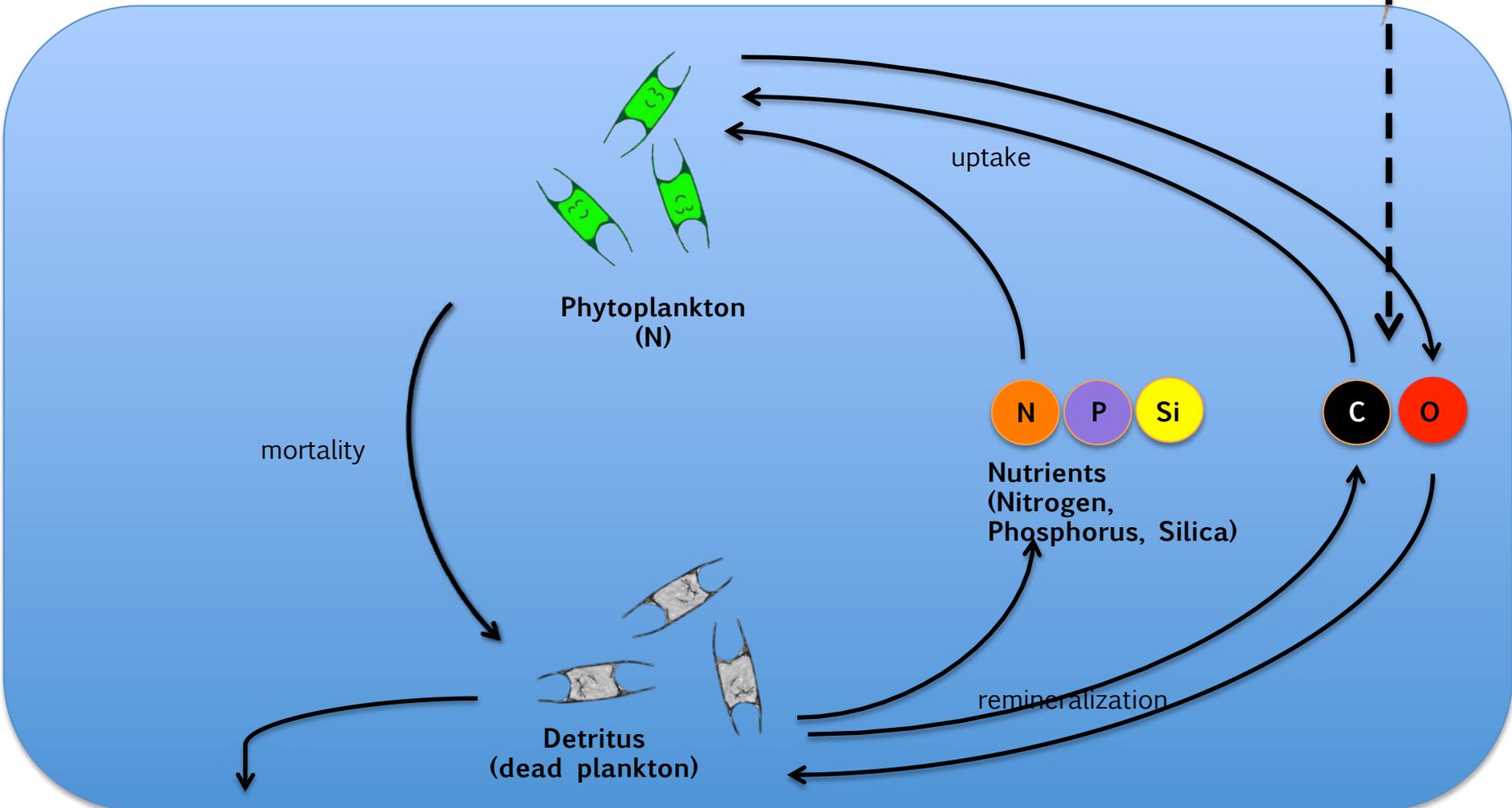
Color Scale



What's a biogeochemical model?



air-sea exchange



Ocean primary production

-controlling factors: nutrients

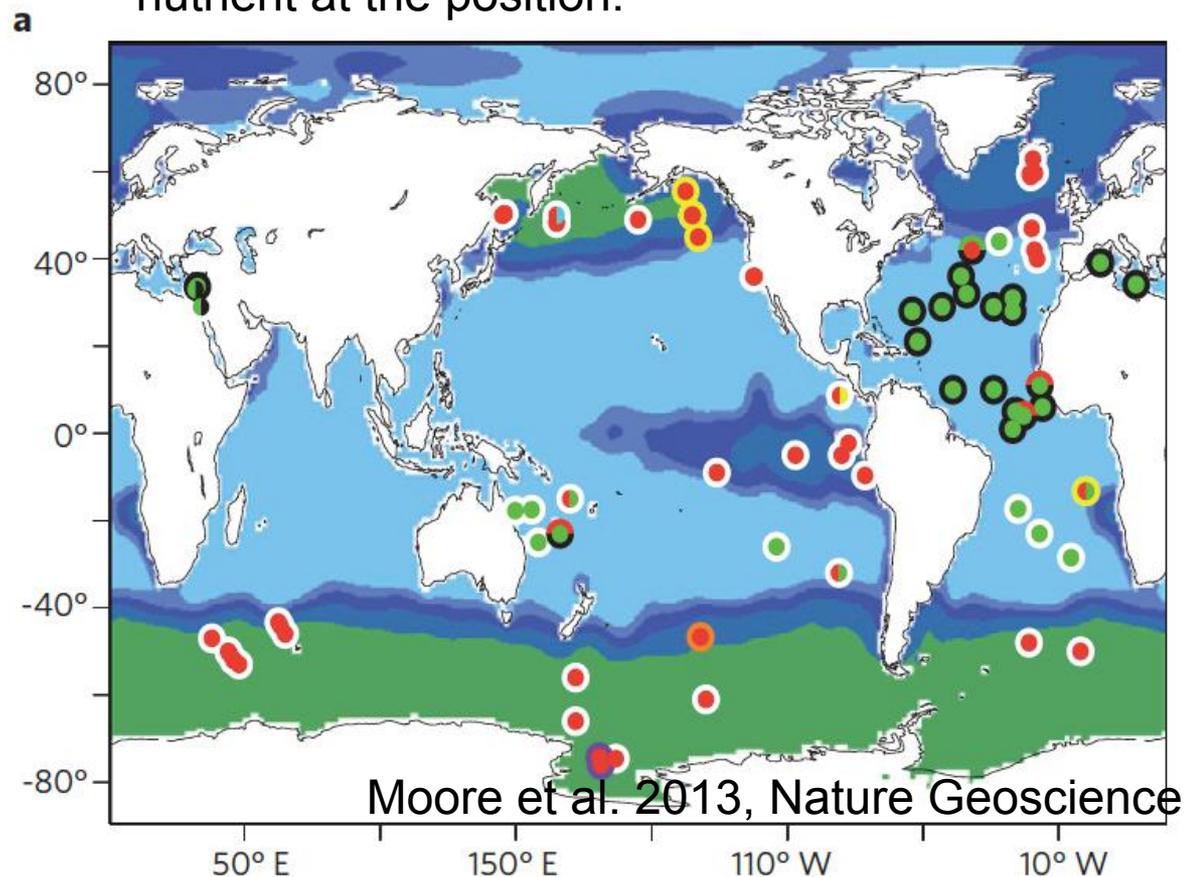
Macronutrients: (Needed in larger quantities, often limiting the growth of phytoplankton)

- Nitrogen (N) ●
- Phosphorus (P) ●
- Silicon (Si) ●

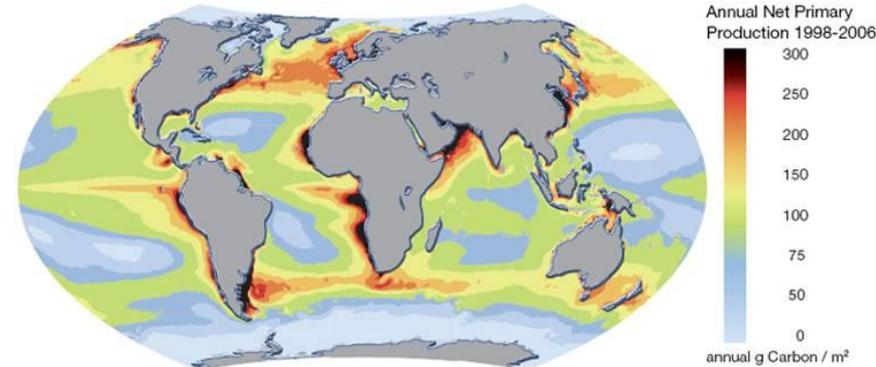
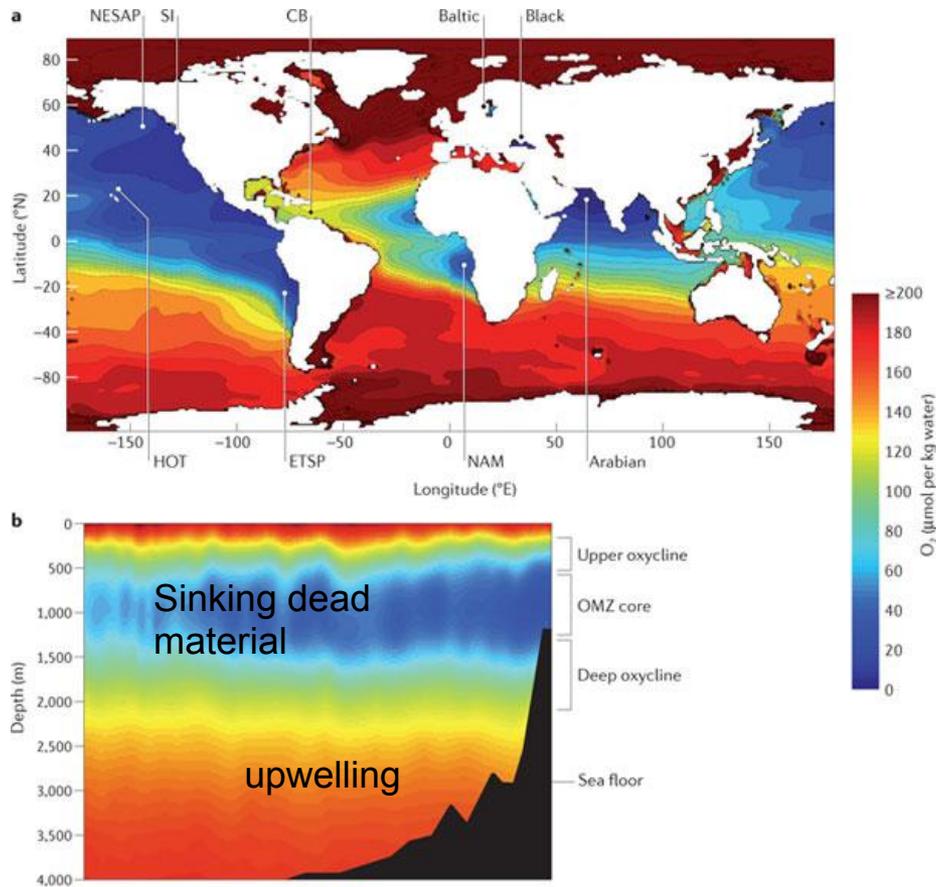
Micronutrients: (Essential but only in small quantities)

- Iron (Fe) ●
- Copper (Cu) ●
- Zink (Zn) ●
- ...

Colors of filled circles show the major limiting nutrient at the position.



Oxygen minimum zones



Nature Reviews | Microbiology

Jody J. Wright, Kishori M. Konwar & Steven J. Hallam, Nature Reviews Microbiology 10, 381-394 (June 2012)

Ocean primary production

-controlling factors: temperature?

- Temperature is generally not considered to be a limiting factor for primary production (there are for example phytoplankton blooms under sea ice).
- Metabolic rates (for example primary production and respiration) are considered to be temperature-dependent, with higher rates related to higher temperatures.

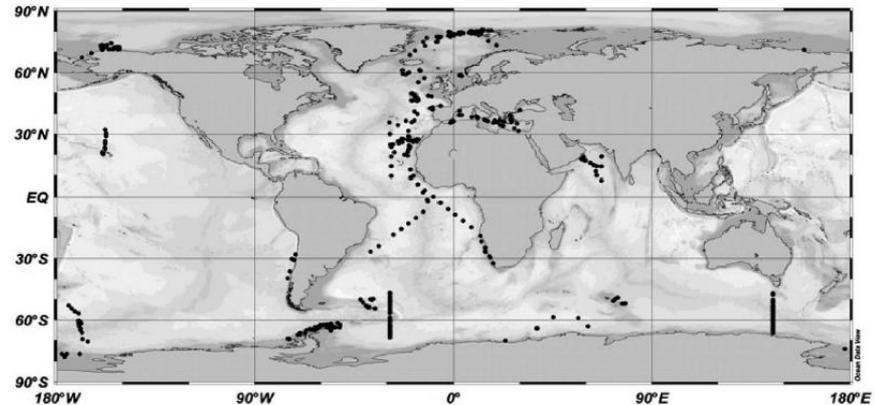


Figure 1. Map showing the locations in the data set (Table 1) containing records of plankton metabolic rates, water temperature and chlorophyll a concentration (Table 1).

