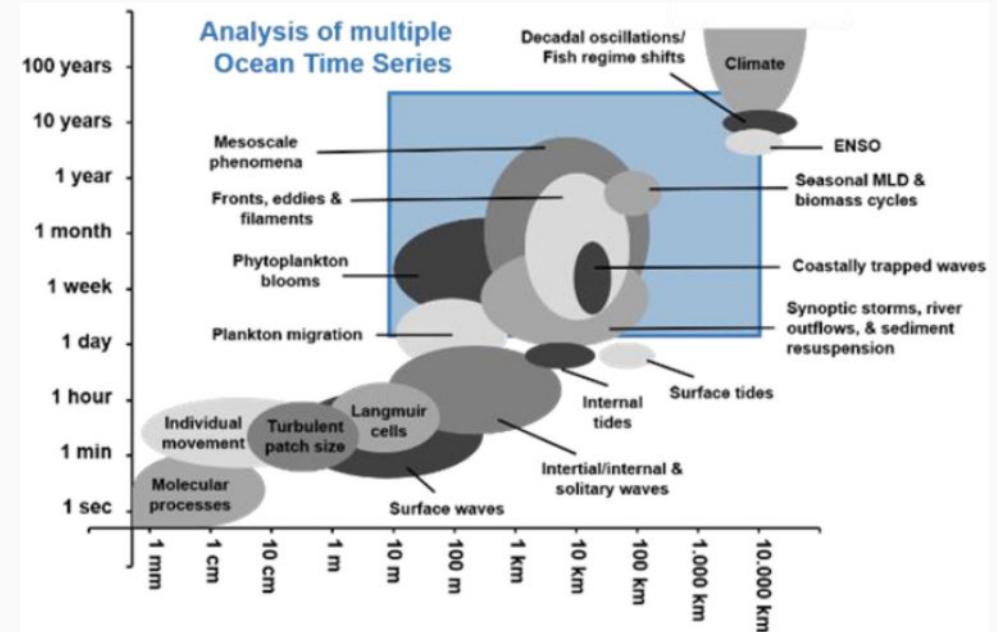


Experimental Design and Analysis

Scales in oceanic ecosystems

Daniel Vaultot

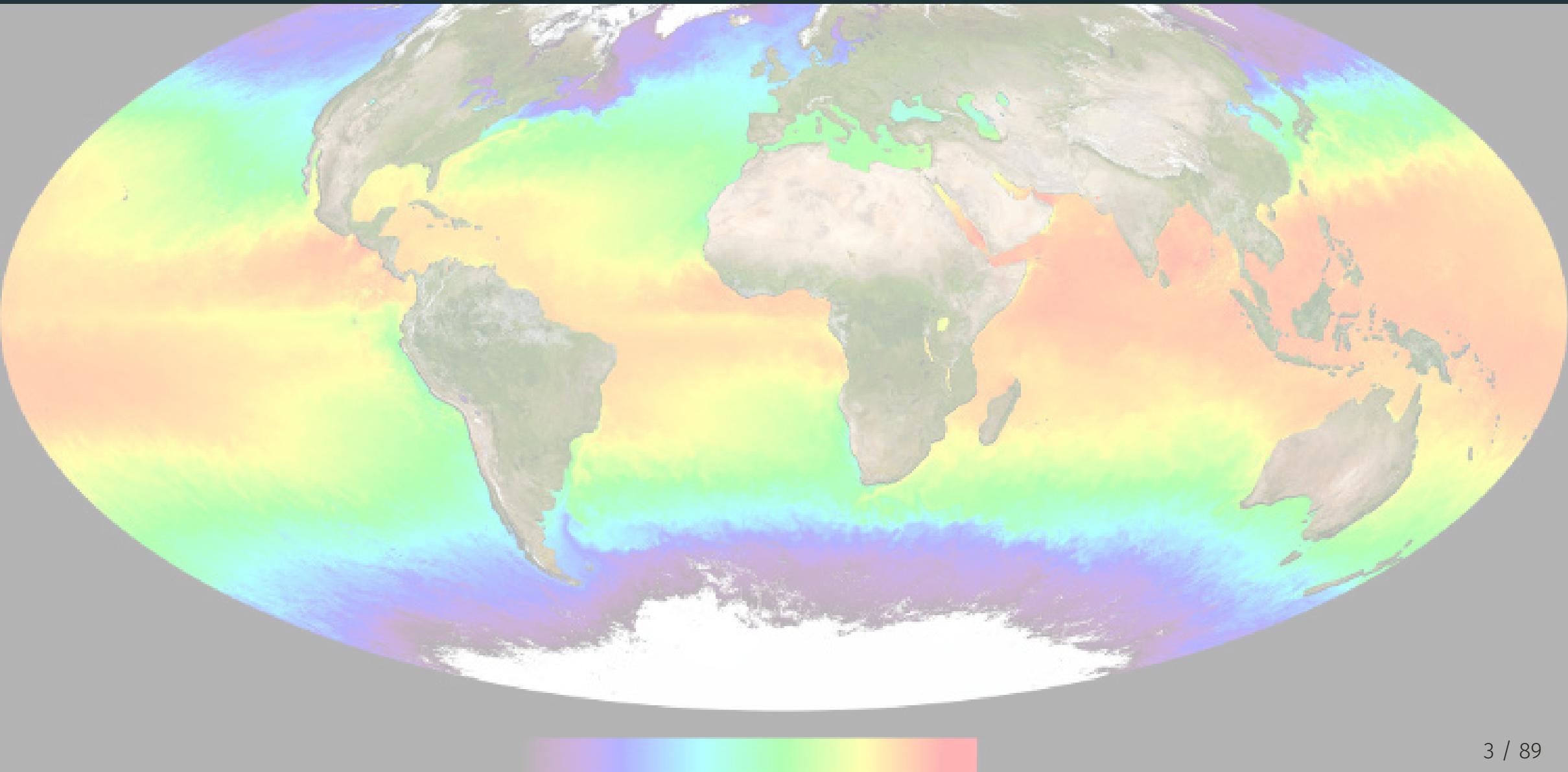
2020-02-19



Outline

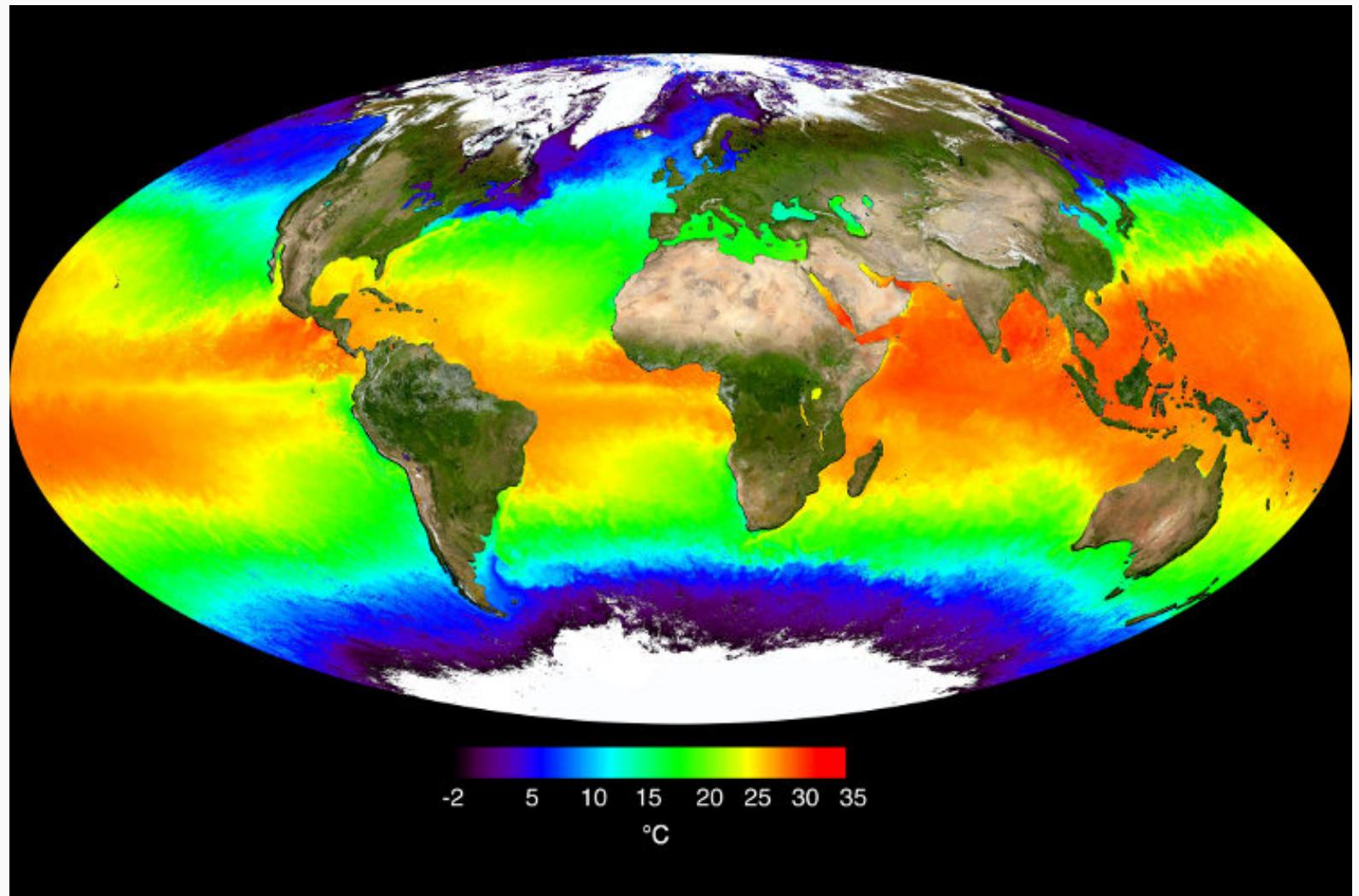
- The marine Environment
- Marine Phytoplankton
- Spatial Scales
- Temporal Scales
- Time Series

The Marine Environment



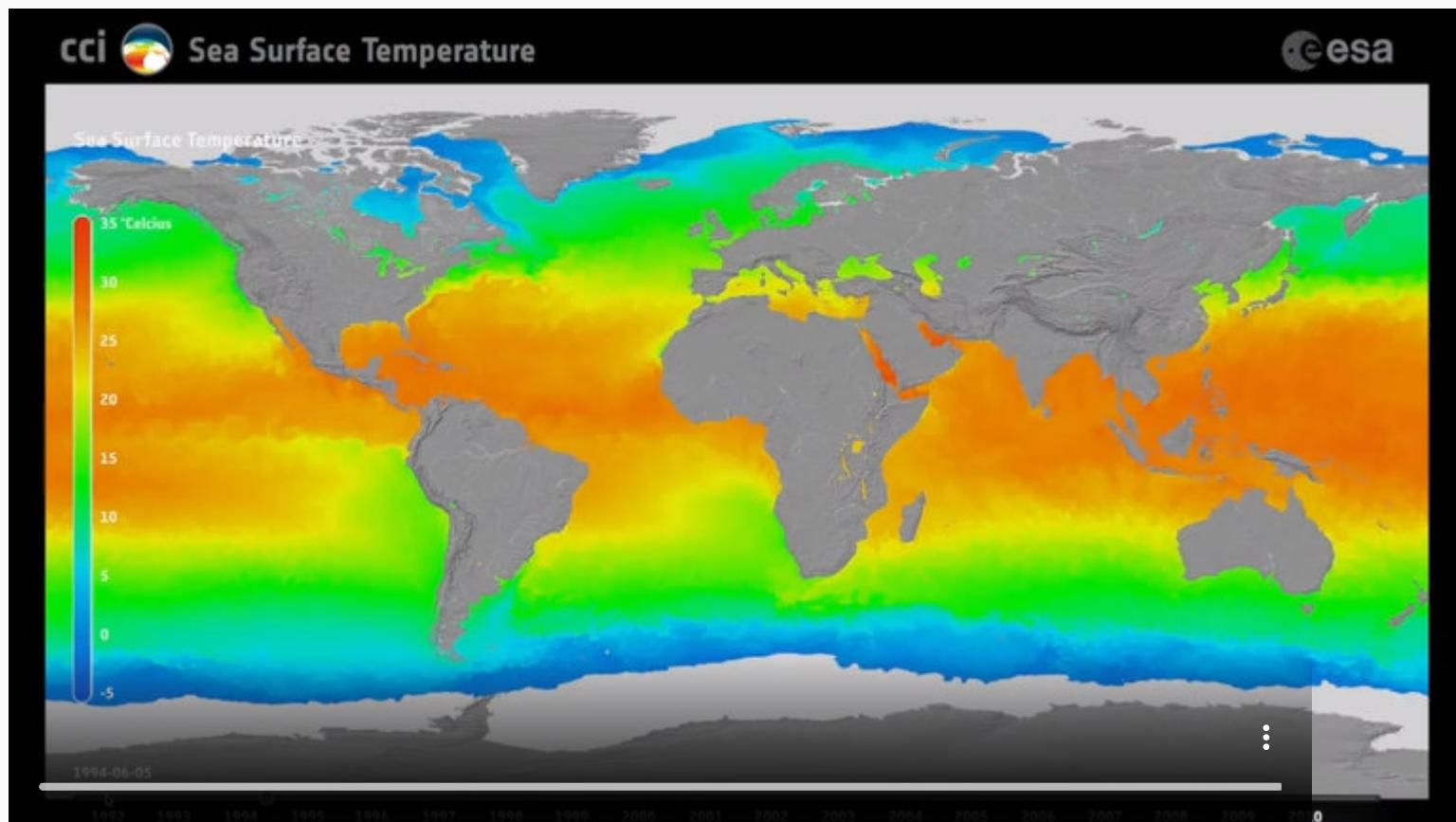
The Marine Environment

Temperature



The Marine Environment

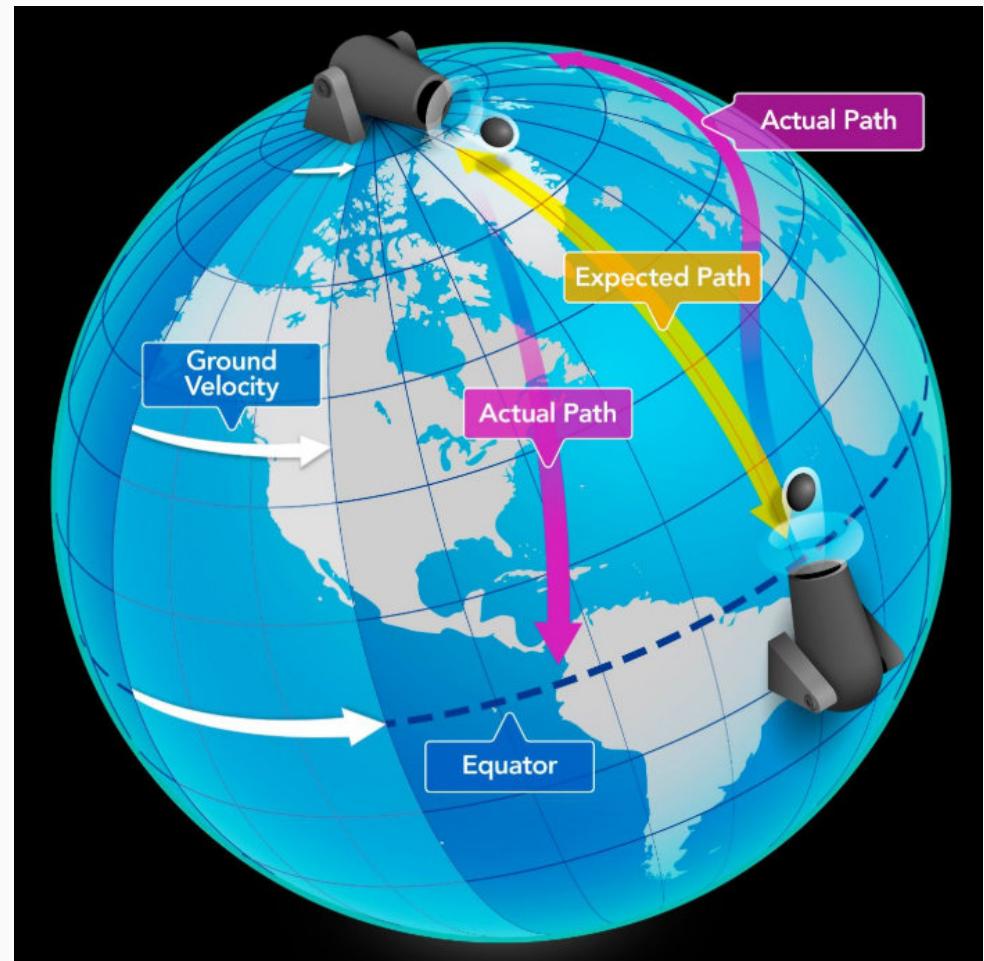
Marine Environment is highly dynamic



The Marine Environment

Currents

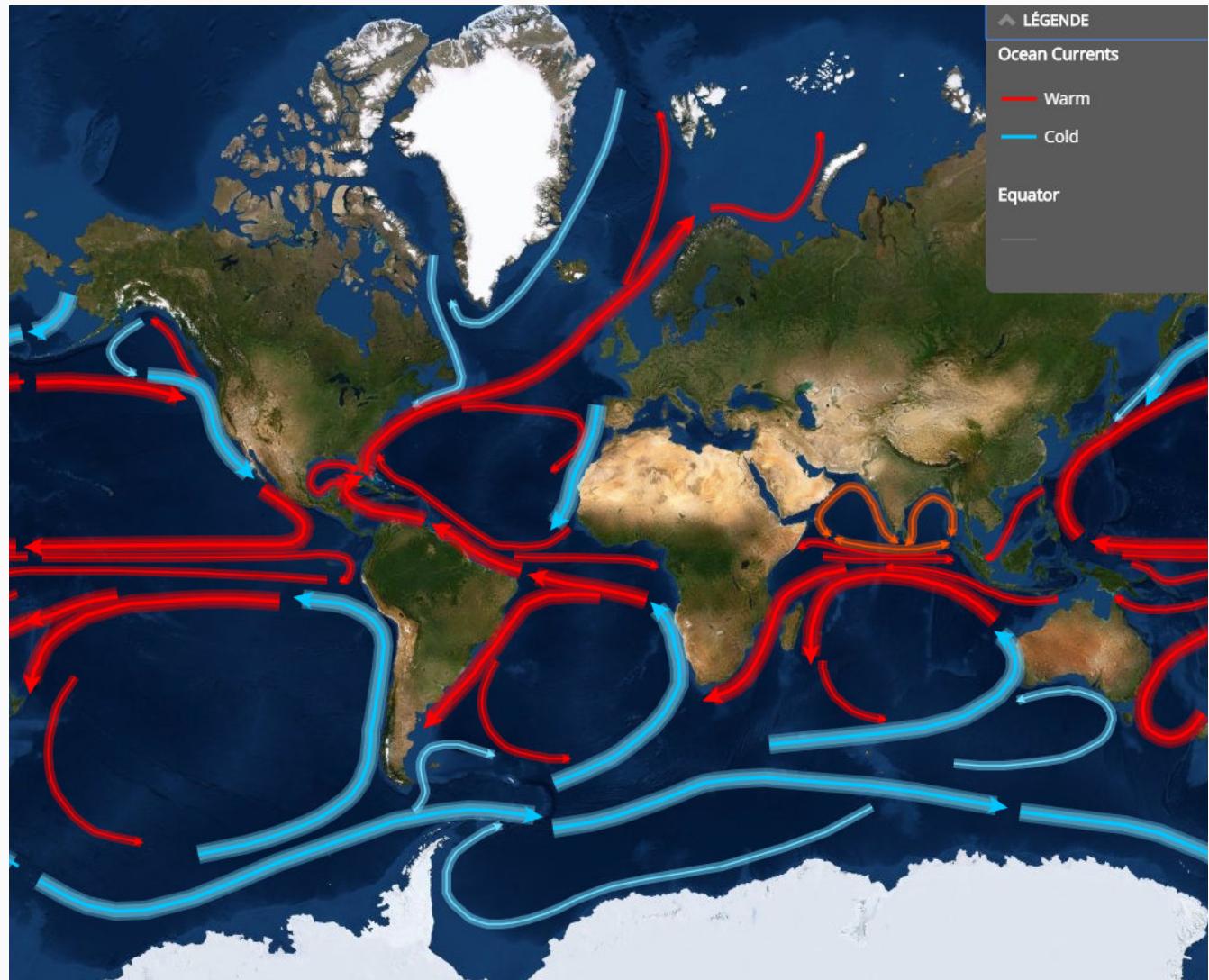
- Wind (Atmospheric Circulation)
- Coriolis effect
- Coast line



The Marine Environment

Currents

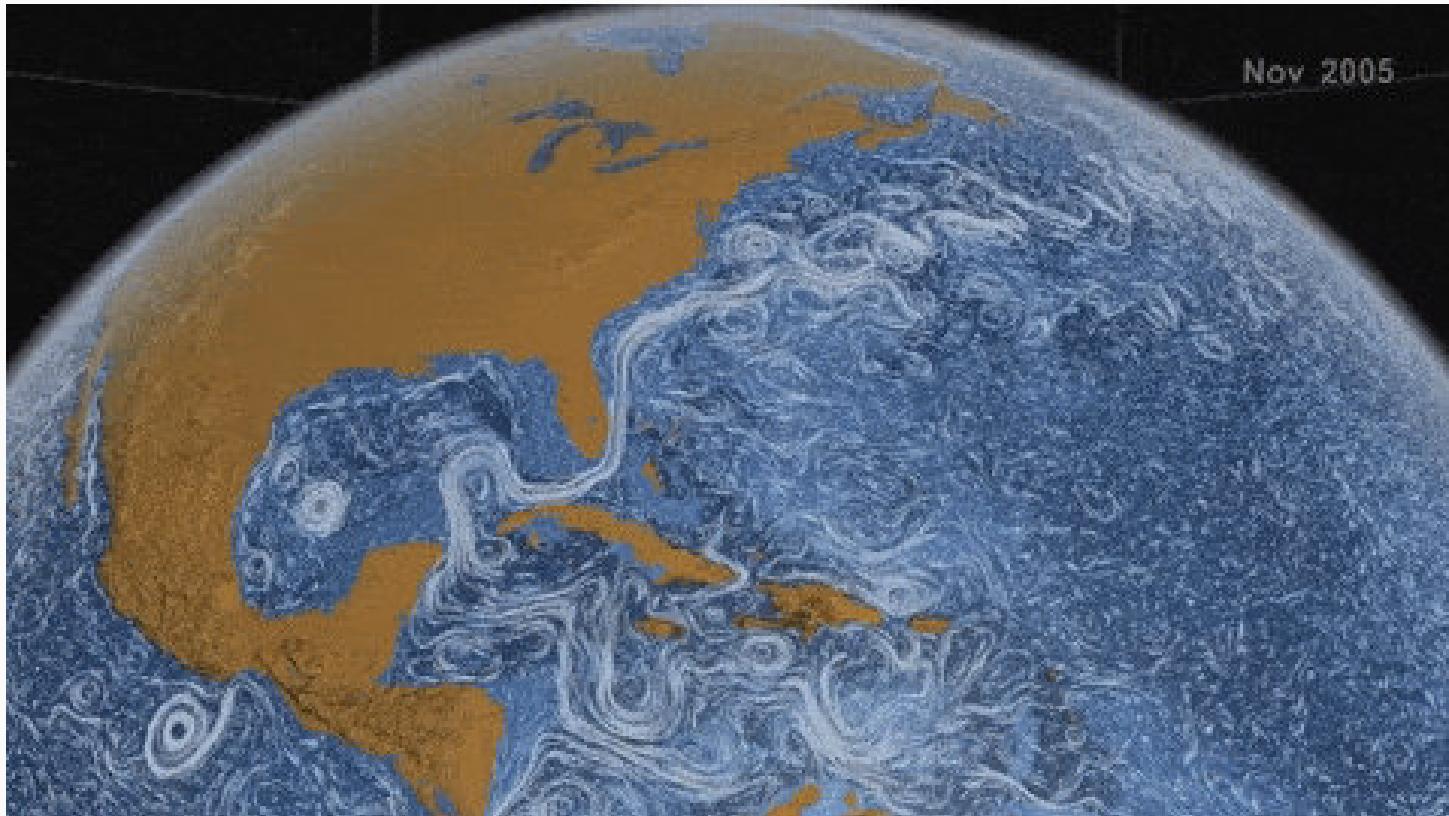
- Wind (Atmospheric Circulation)
- Coriolis effect
- Coast line



The Marine Environment

Currents

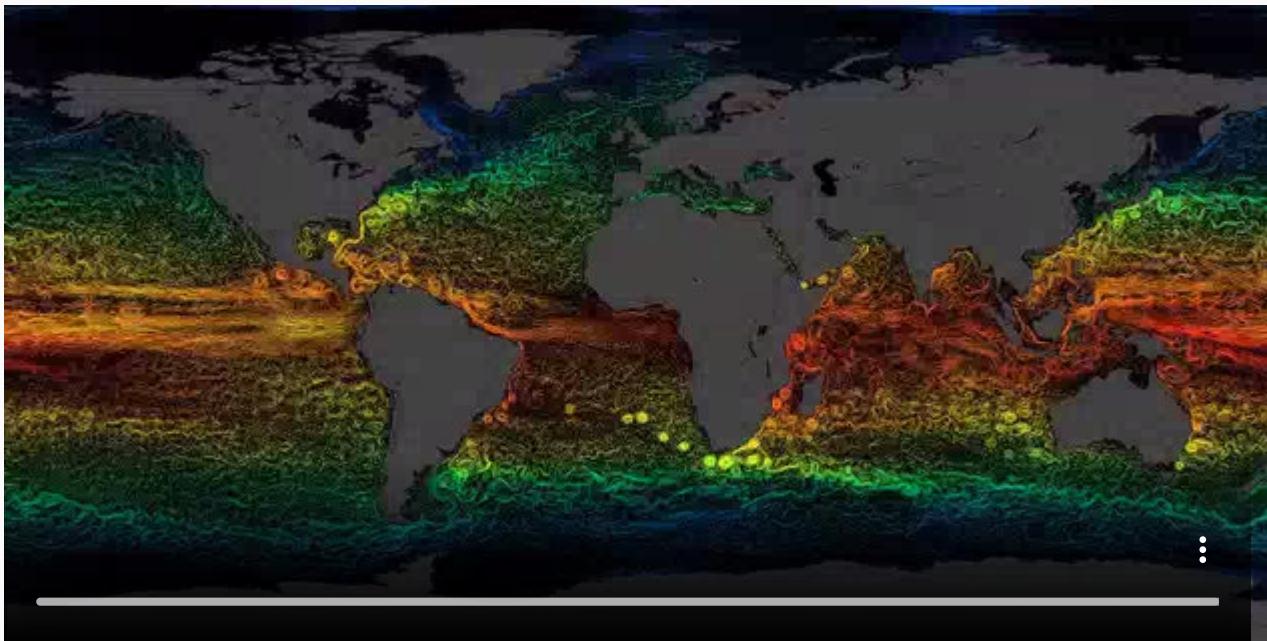
- Turbulence



The Marine Environment

Currents

- Turbulence

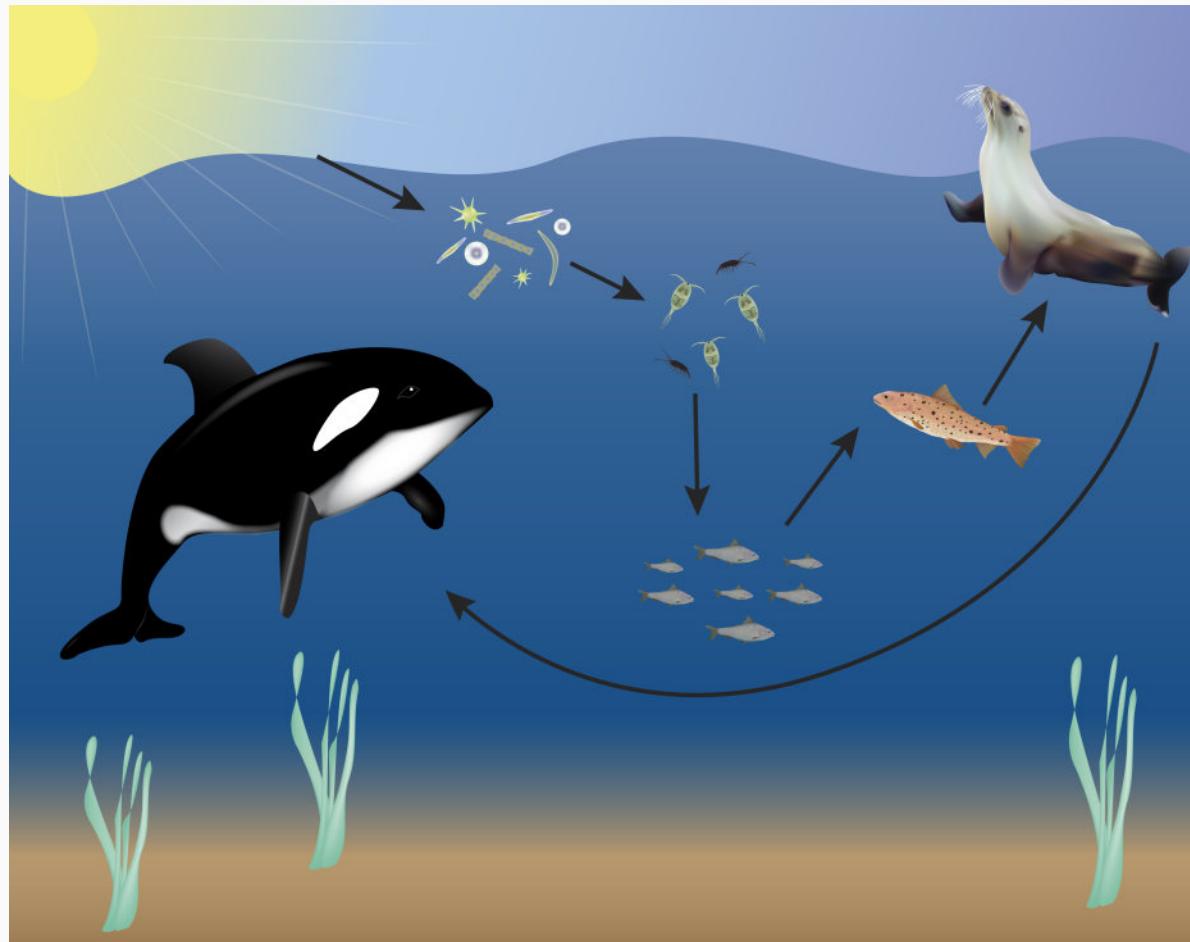


Marine phytoplankton



Marine phytoplankton

Classical view of marine foodwebs



Marine phytoplankton

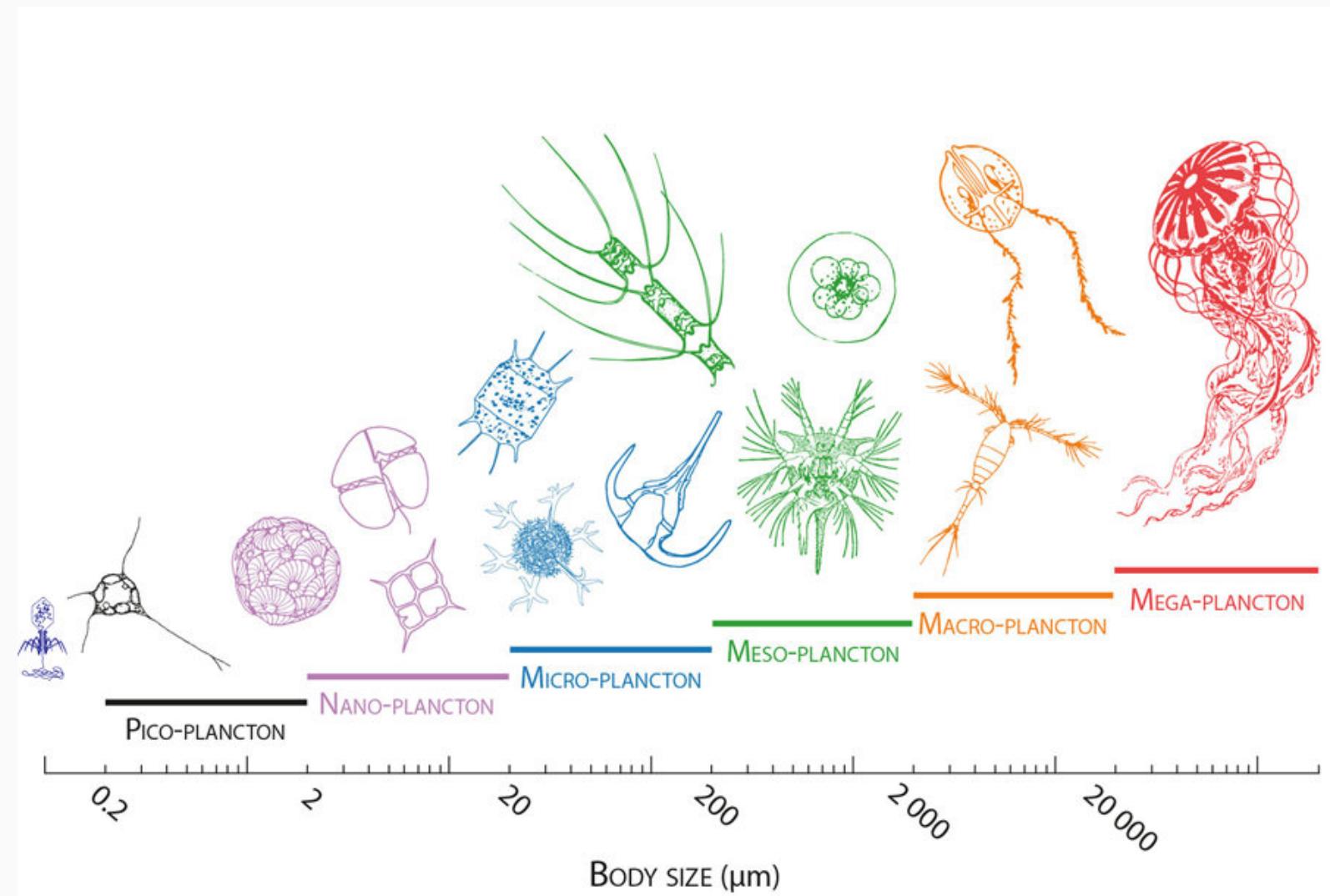
Plankton diversity

- Phytoplankton
- Zooplankton
- Bacteria
- Viruses



Marine phytoplankton

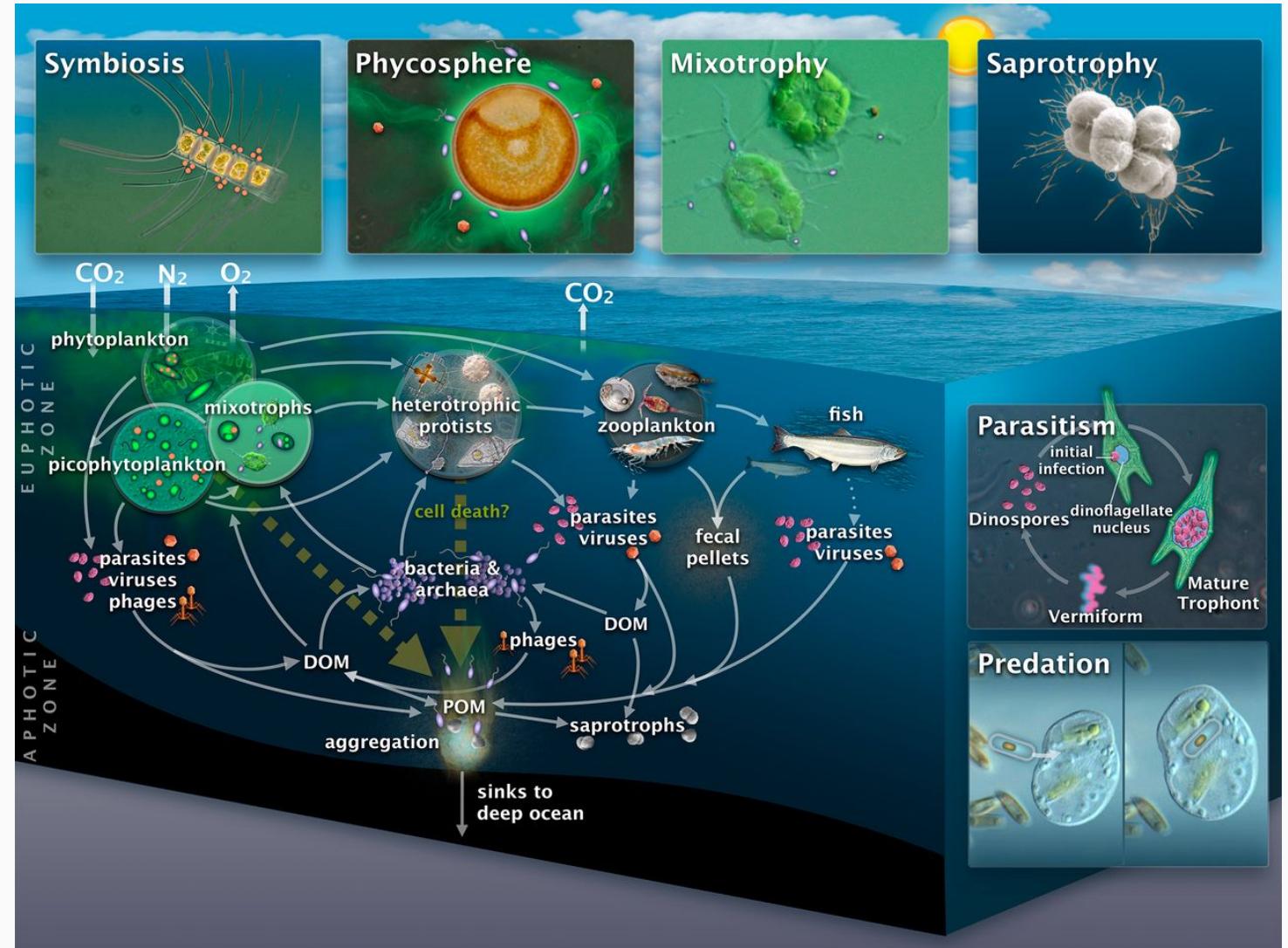
Size classes



Marine phytoplankton

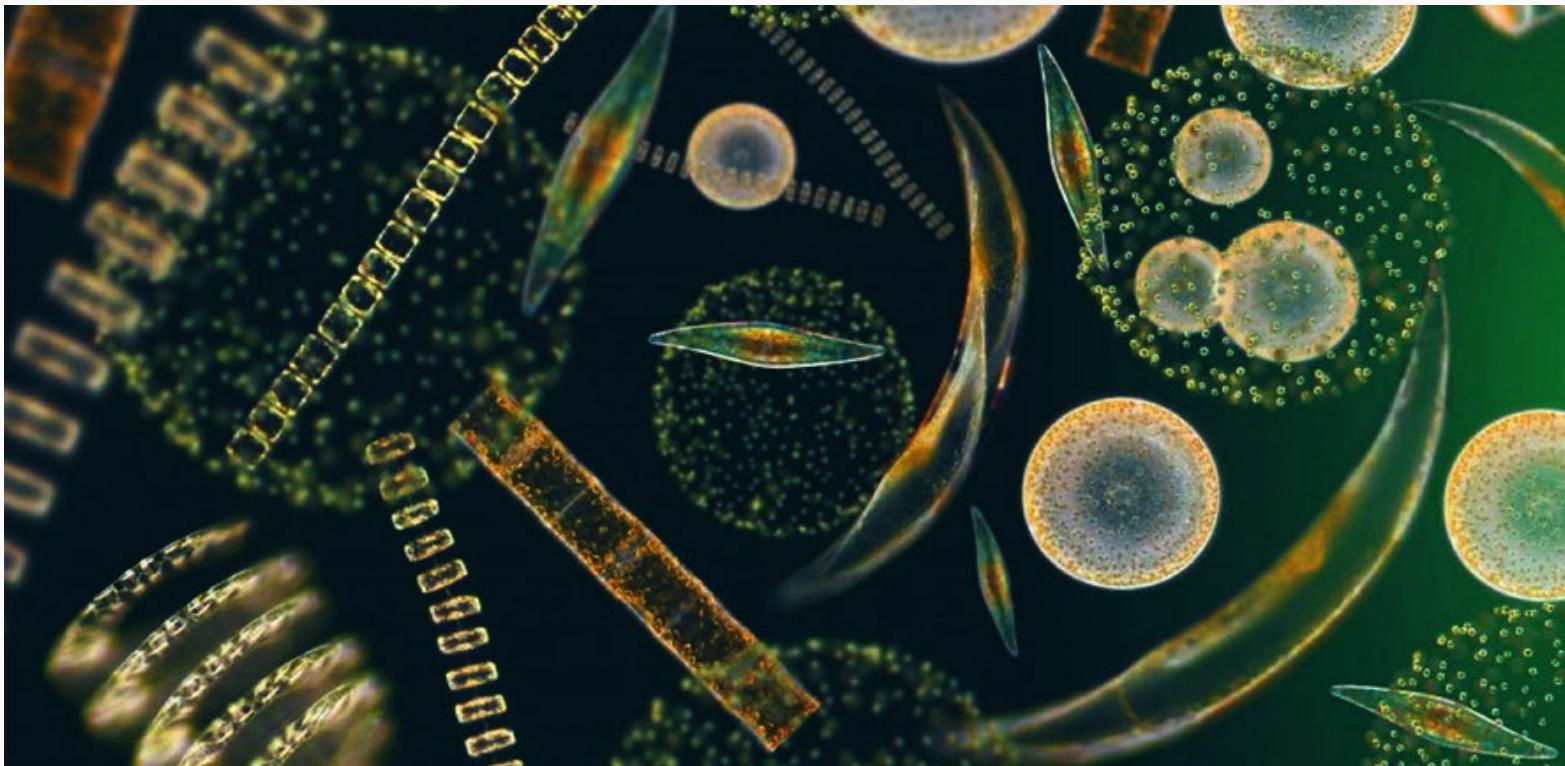
Complex processes

- Predation
- Symbiosis
- Mixotrophy
- Parasitism



Marine phytoplankton

Phytoplankton



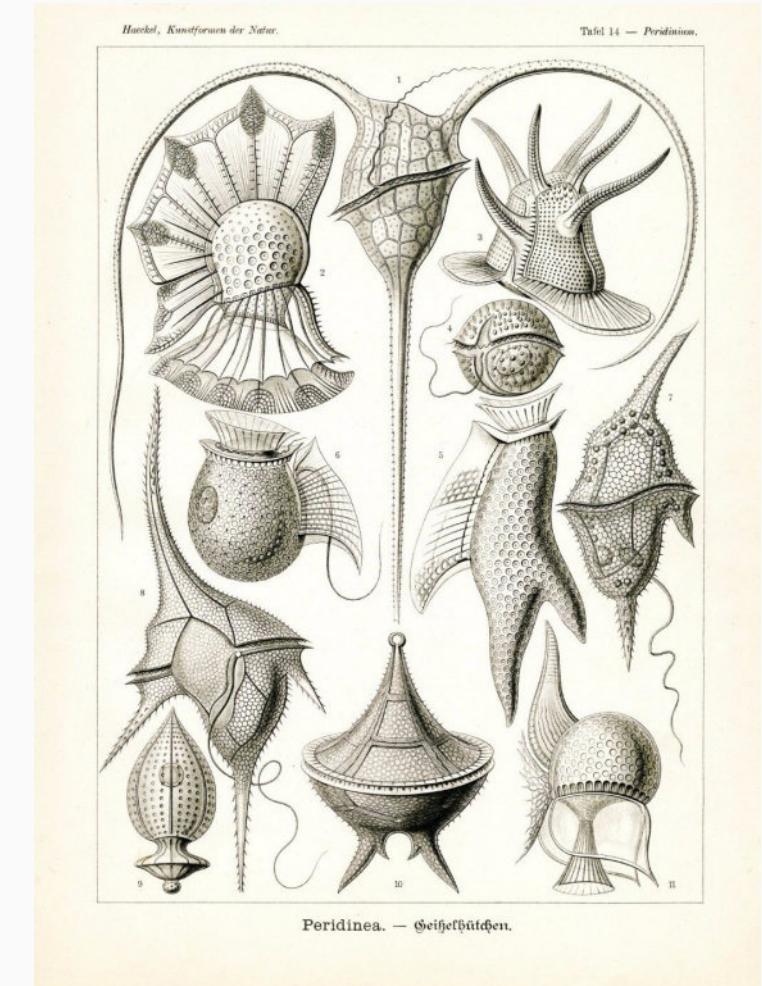
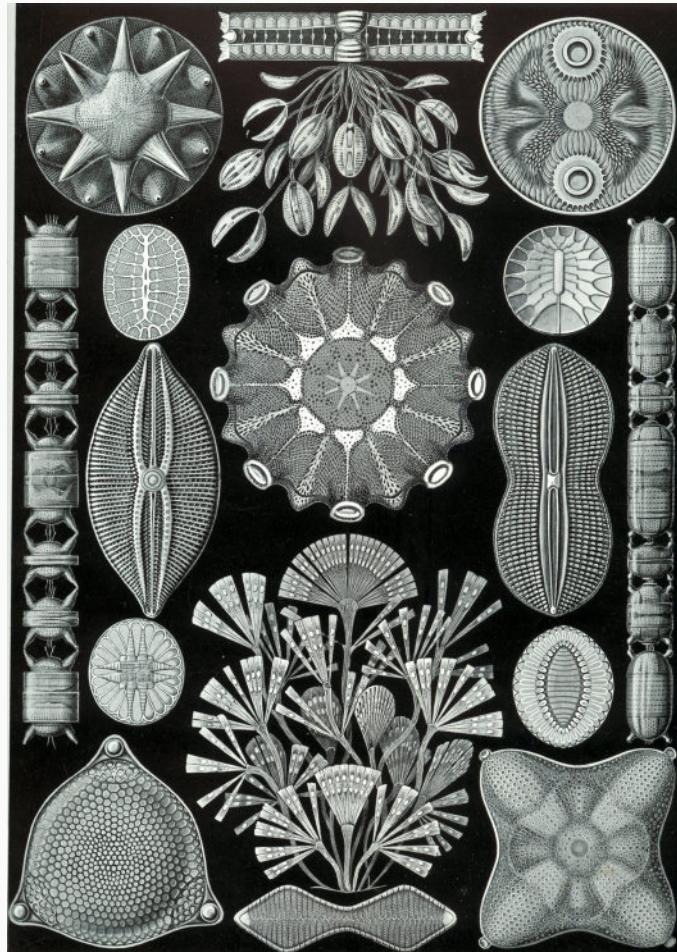
Marine phytoplankton

Major groups



Marine phytoplankton

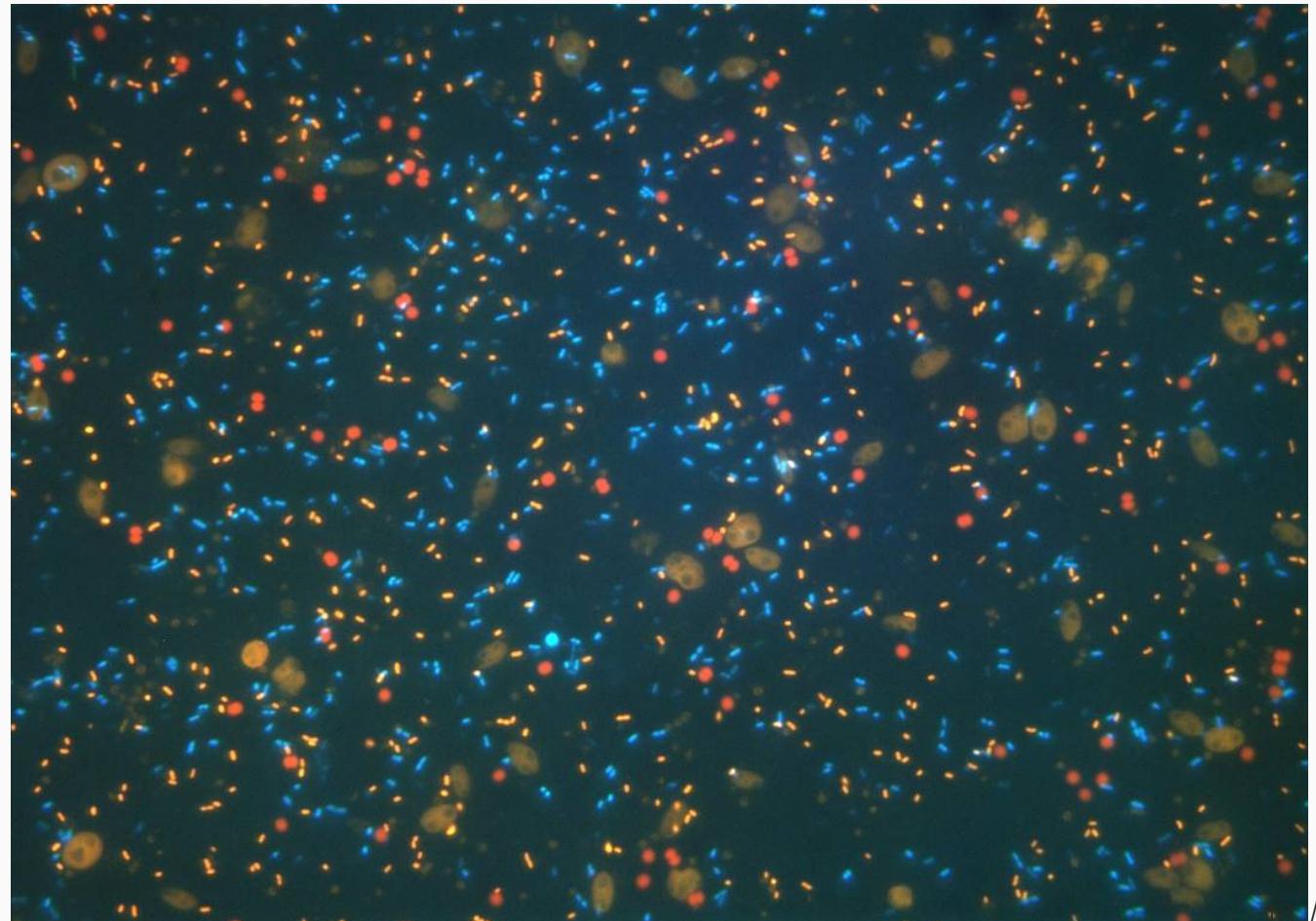
Diatoms and dinoflagellates: 20-200 µm



Marine phytoplankton

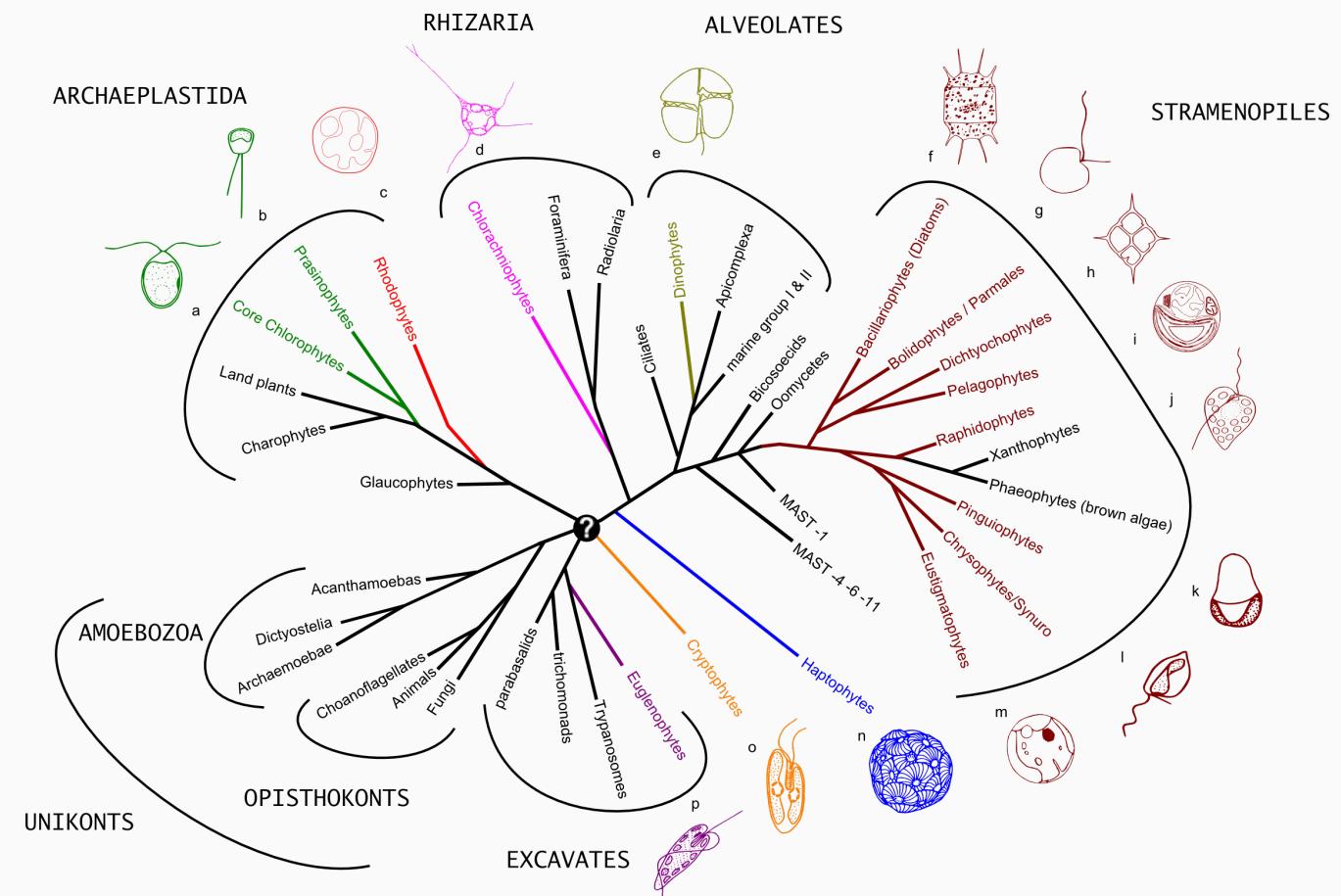
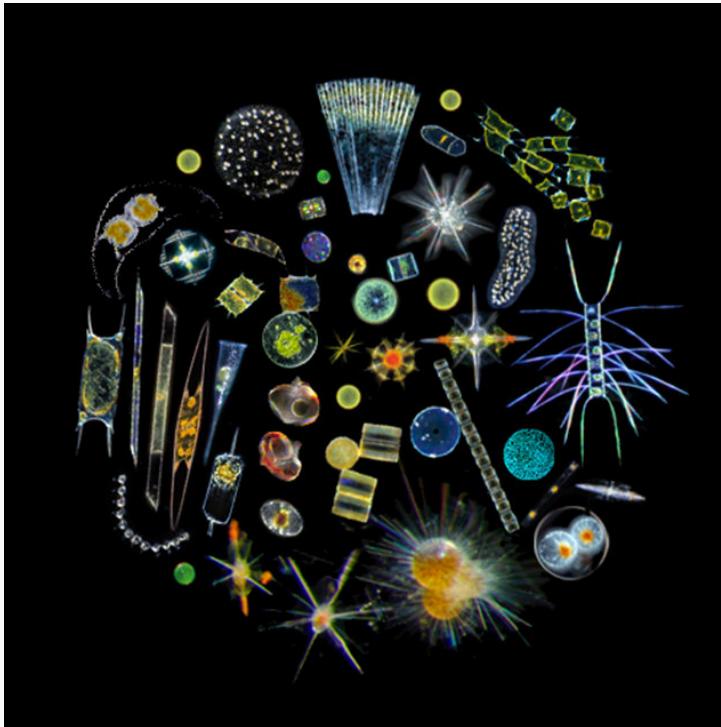
Picoplankton: 0.2-2 µm

- Very small eukaryotes (*Ostreococcus*)
- Cyanobacteria (*Synechococcus*)



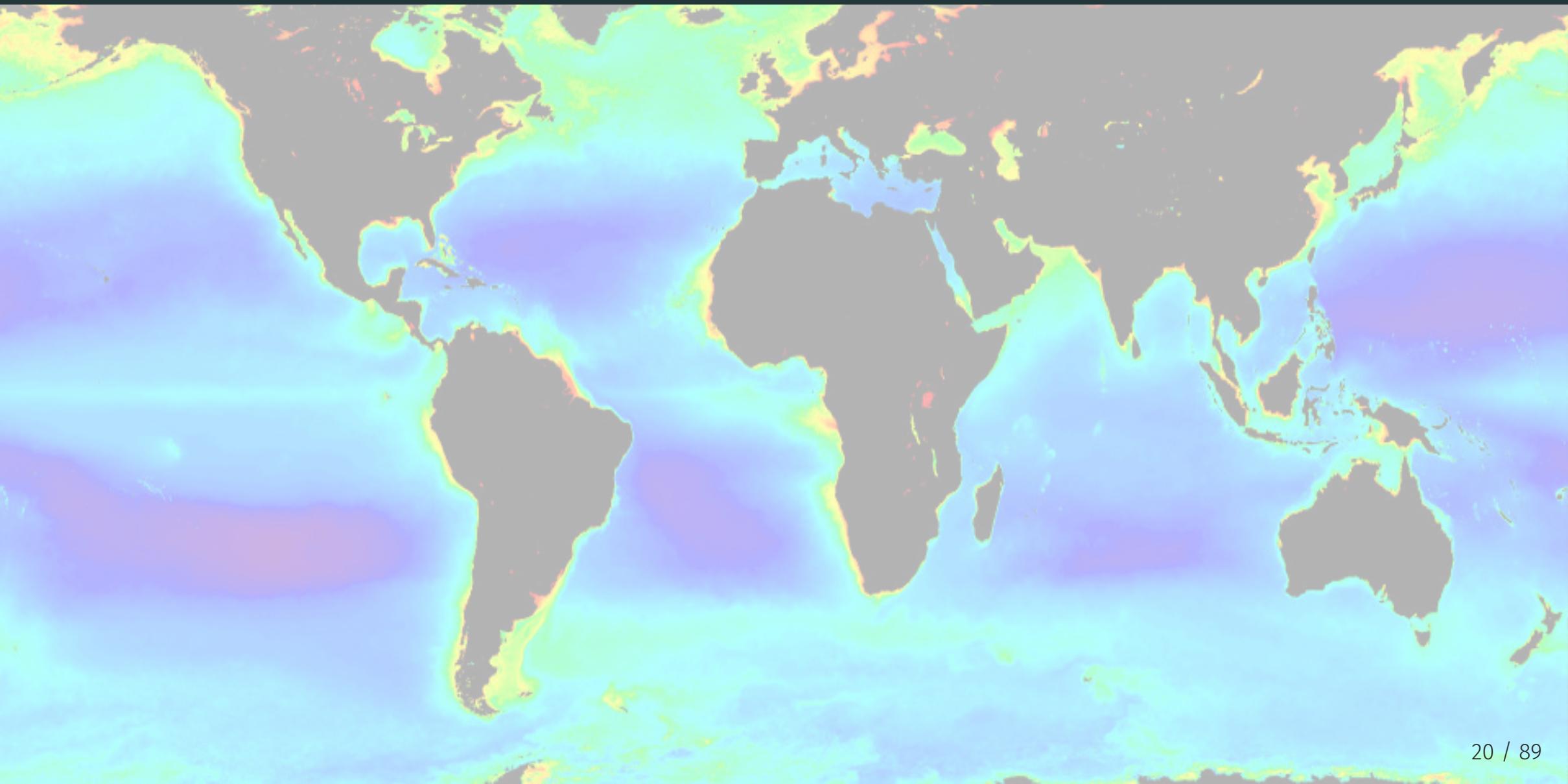
Marine phytoplankton

Wide phylogenetic diversity



Not, F., Siano, R., Kooistra, W.H.C.F., Simon, N., Vaulot, D. & Probert, I. 2012. In Piganeau, G. [Ed.] Genomic Insights Gained into the Diversity, Biology and Evolution of Microbial Photosynthetic Eukaryotes. Elsevier.

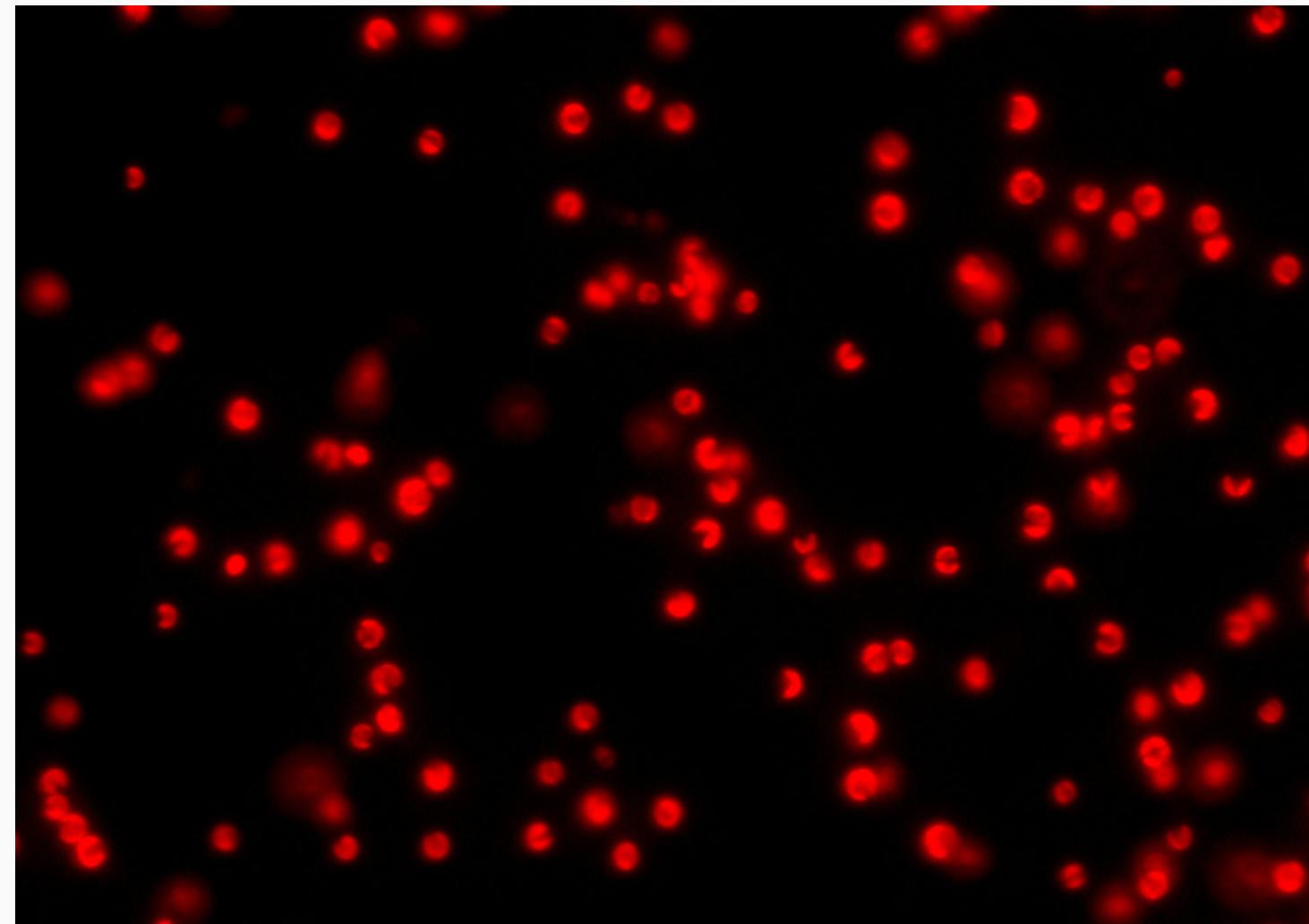
Spatial scales



Spatial scales

Chlorophyll

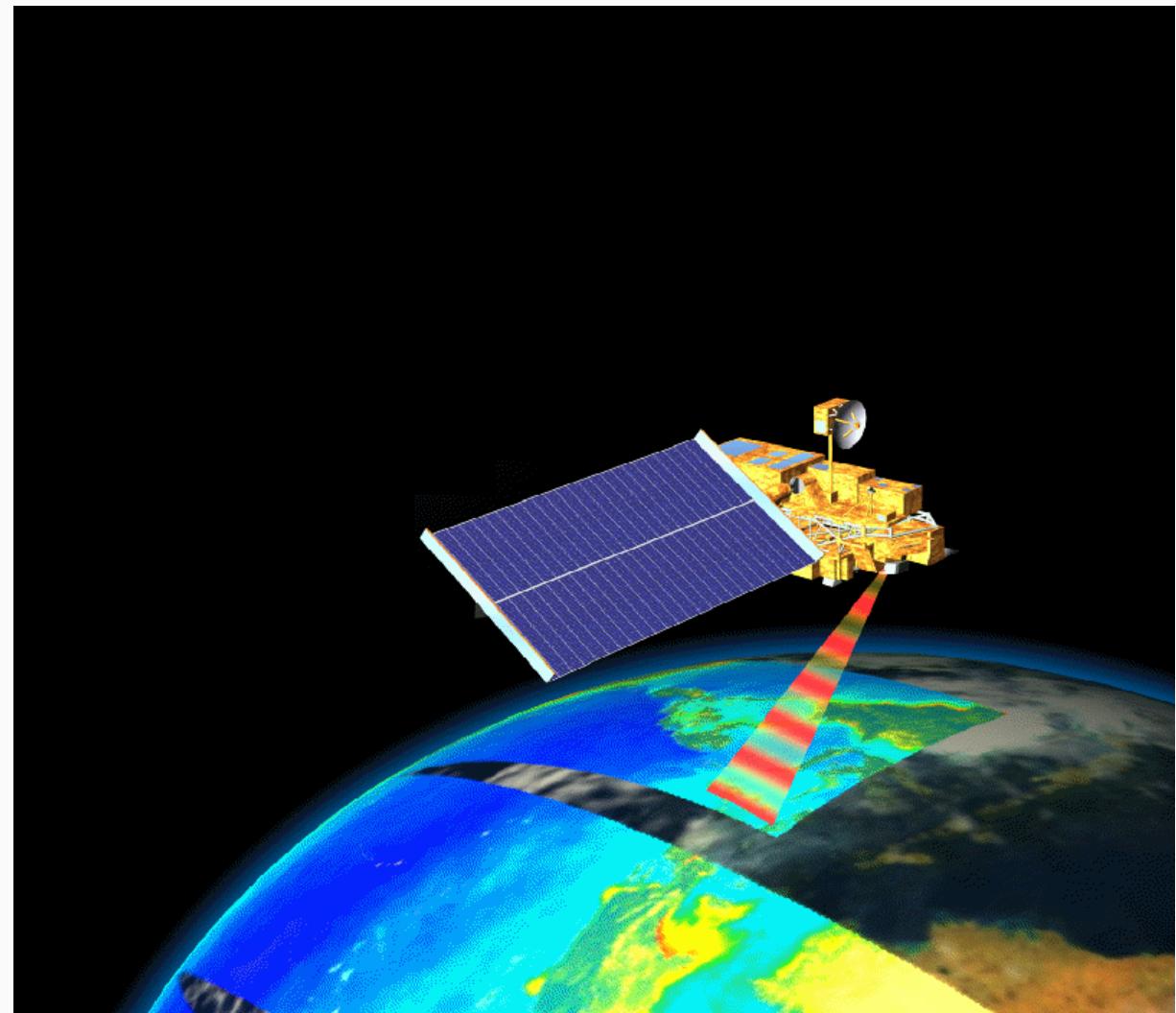
Proxy of phytoplankton biomass



Spatial scales

Chlorophyll

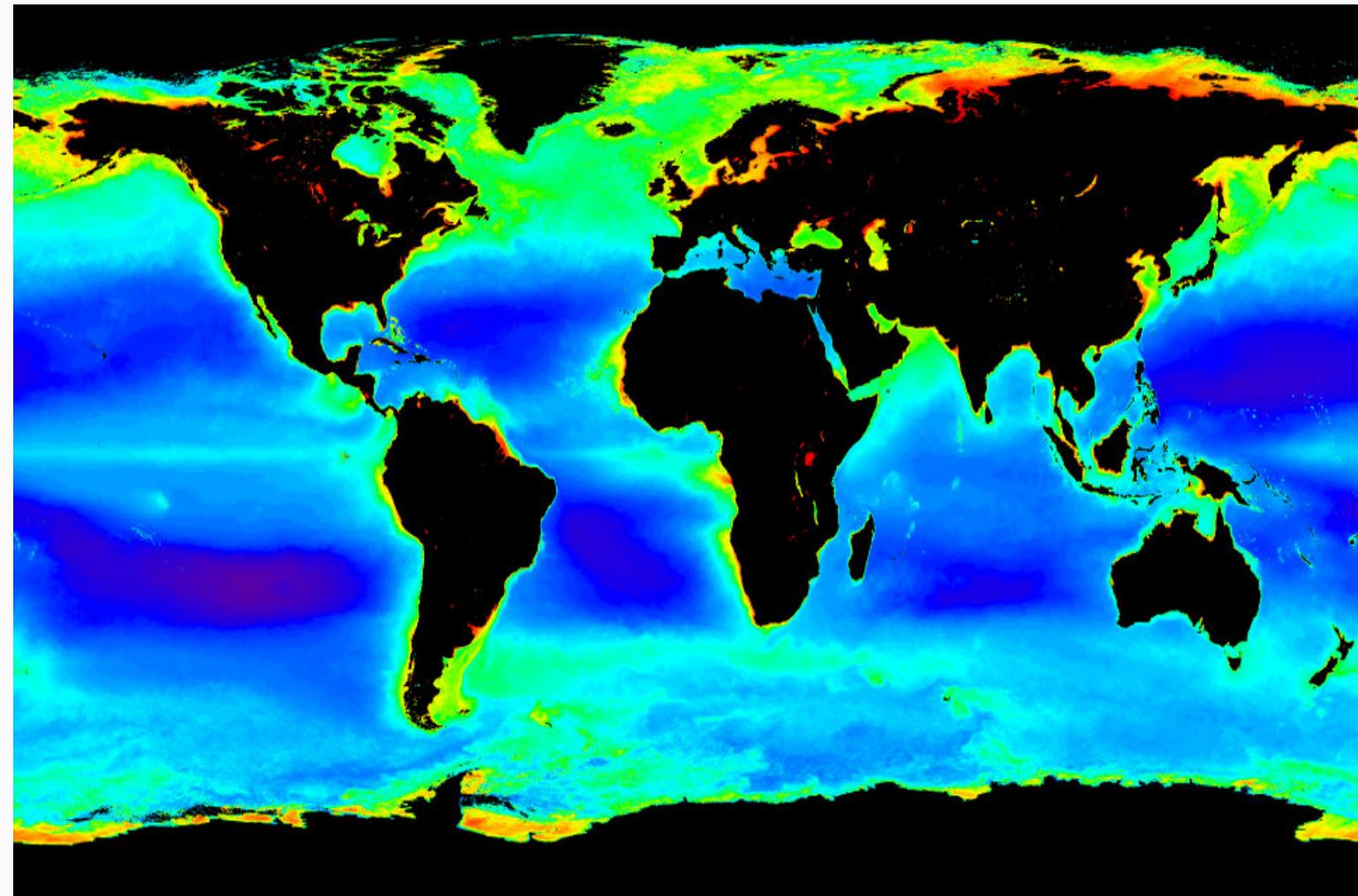
Can be measured from space



Spatial scales

Chlorophyll

What can you see ?

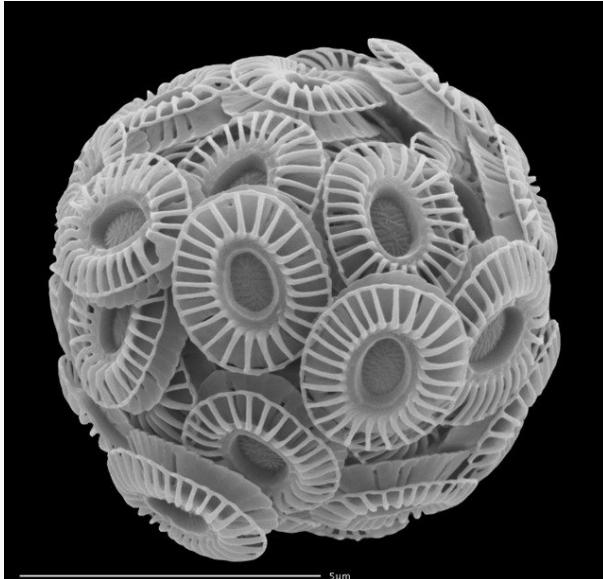


Spatial scales

Blooms

English Channel

Coccolithophorids



Spatial scales

Blooms

New Zealand



Spatial scales

Blooms

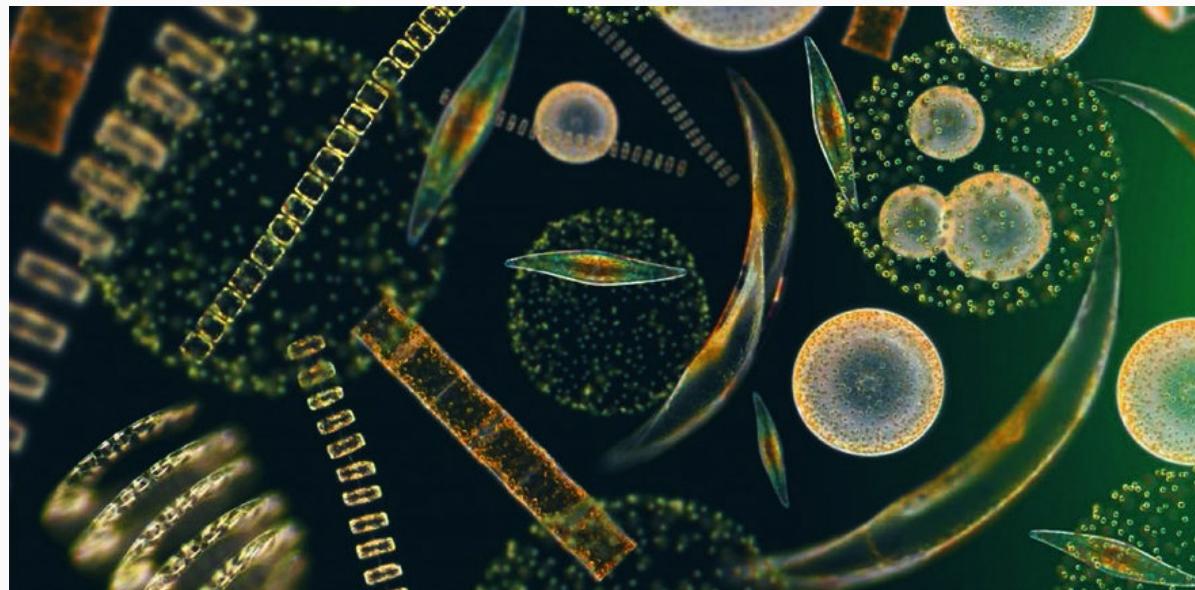
Baltic

Cyanobacteria



Spatial scales

What factors control phytoplankton ?



Spatial scales

What controls phytoplankton ?

Positive

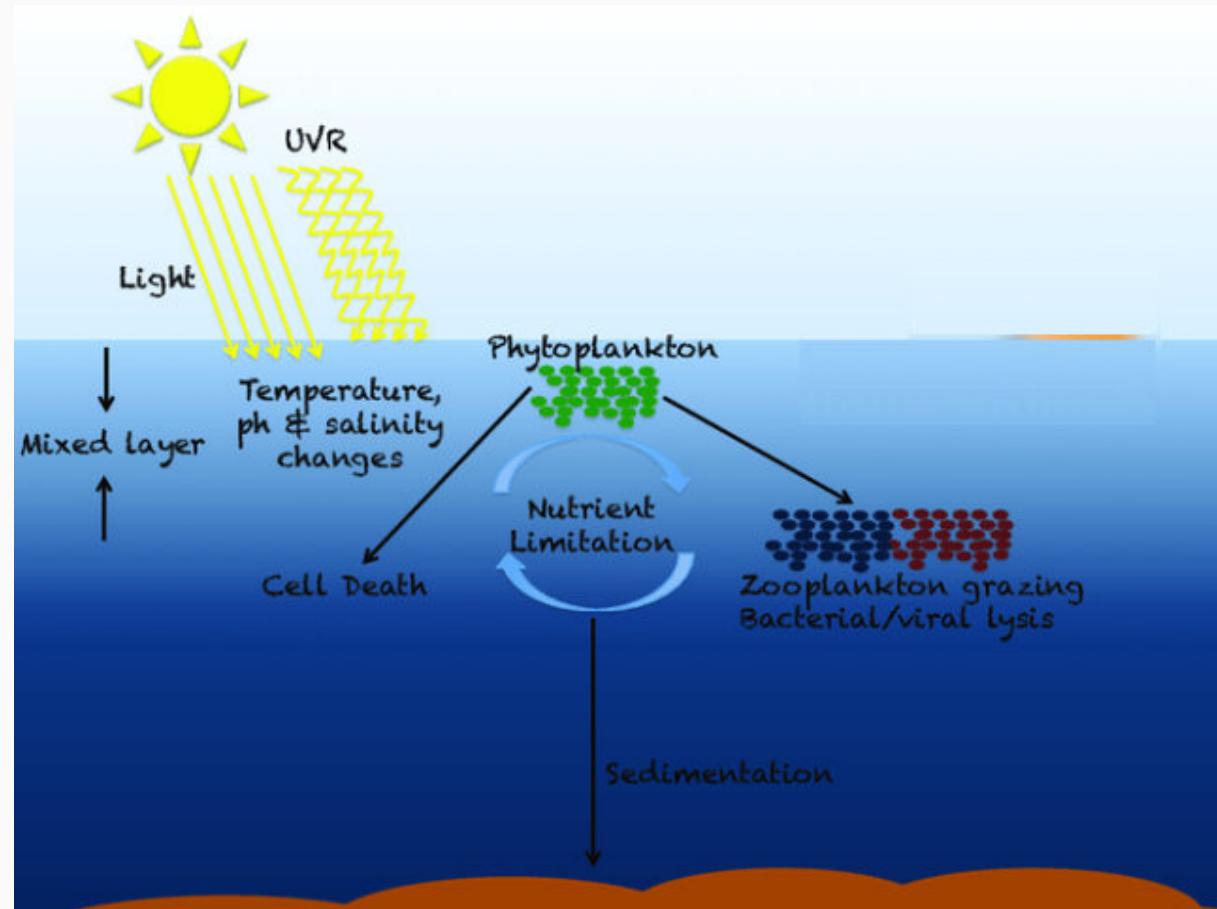
- Light
- Nutrients (Nitrogen, Phosphorus)
- Trace elements (Iron)

Negative

- Predation
- Parasites (e.g. viruses)
- Death

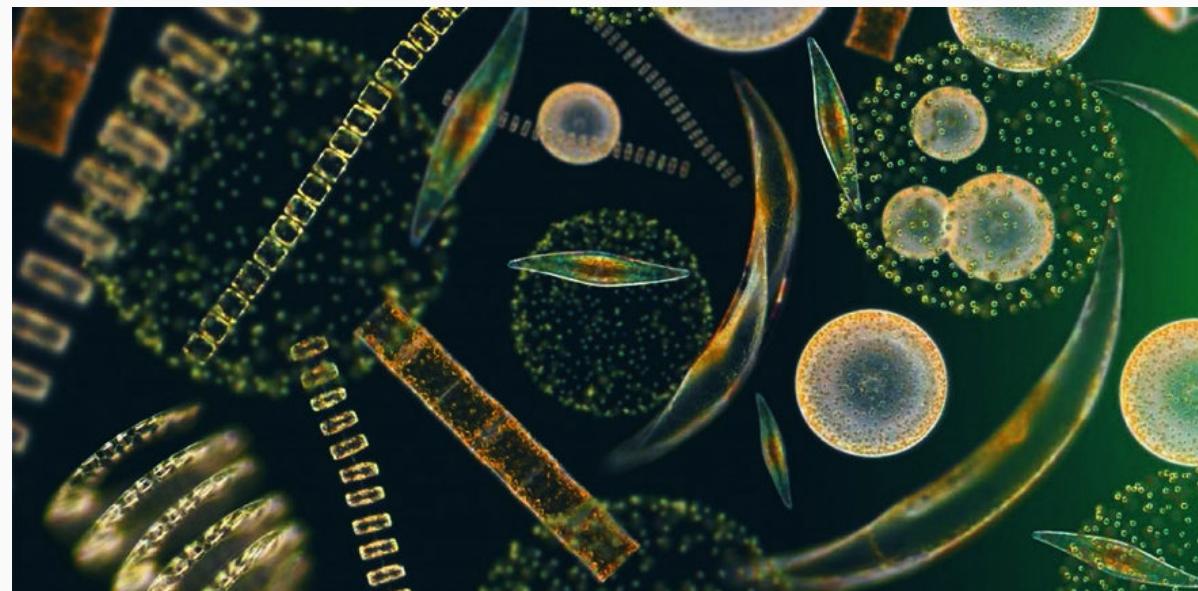
Species selection

- Temperature
- Salinity



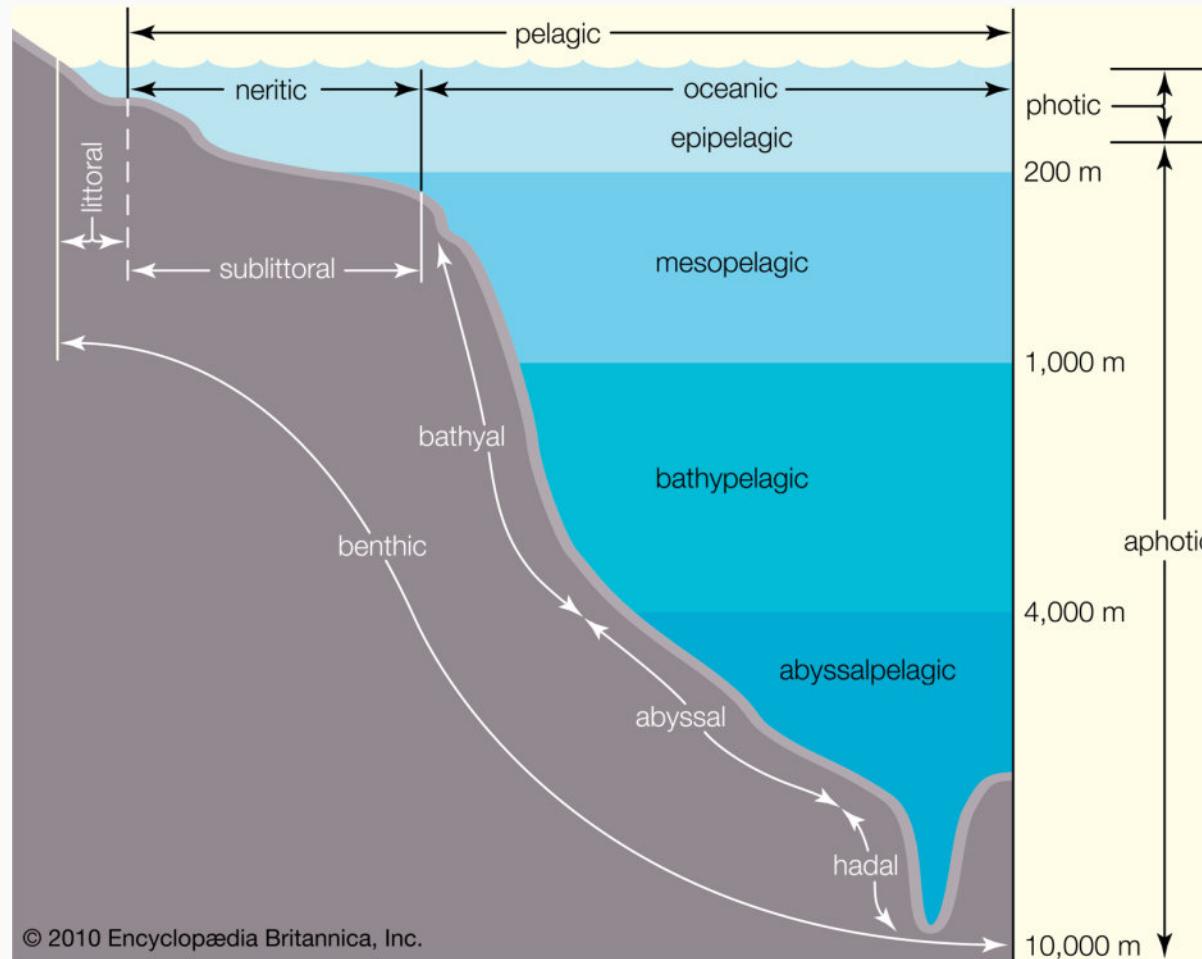
Spatial scales

Is phytoplankton uniformly distributed in the water column?



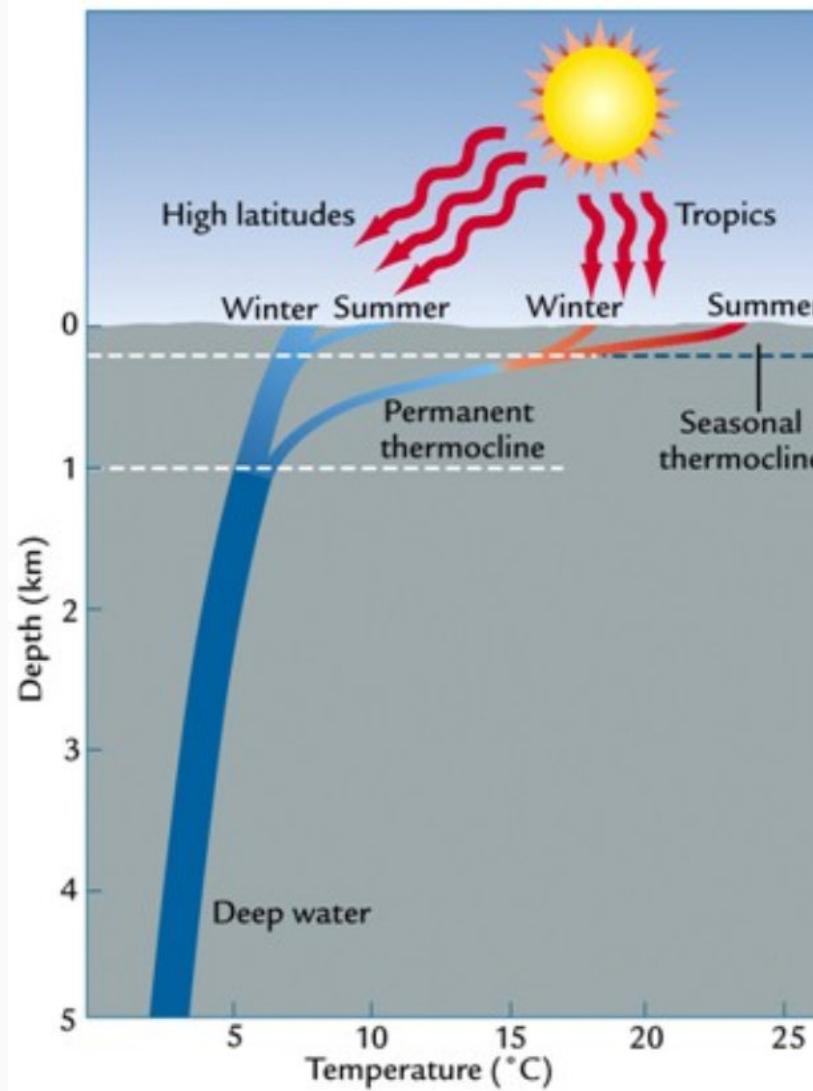
Spatial scales

Water column



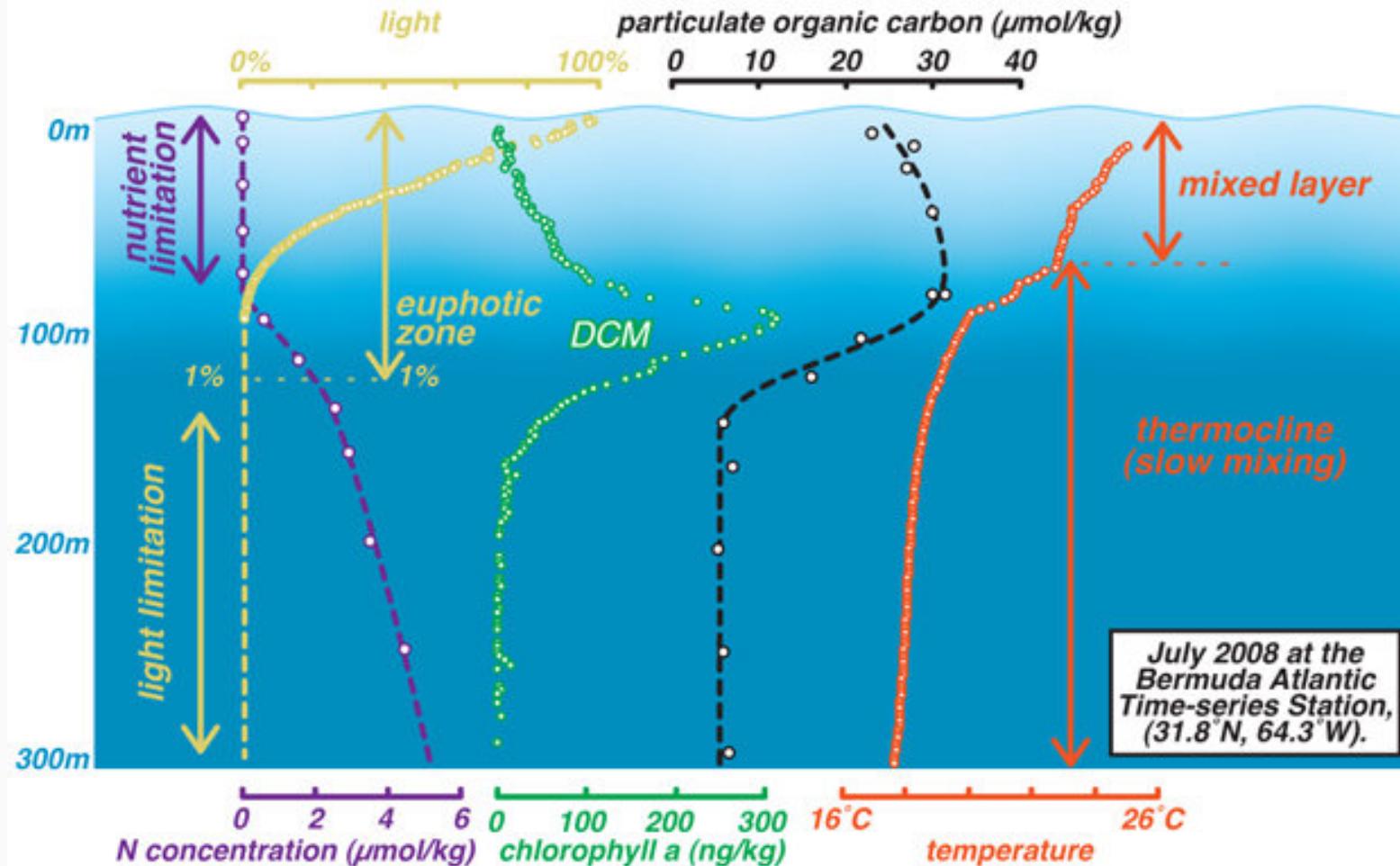
Spatial scales

Euphotic layer



Spatial scales

Chlorophyll maximum



Spatial scales

Sampling the ocean

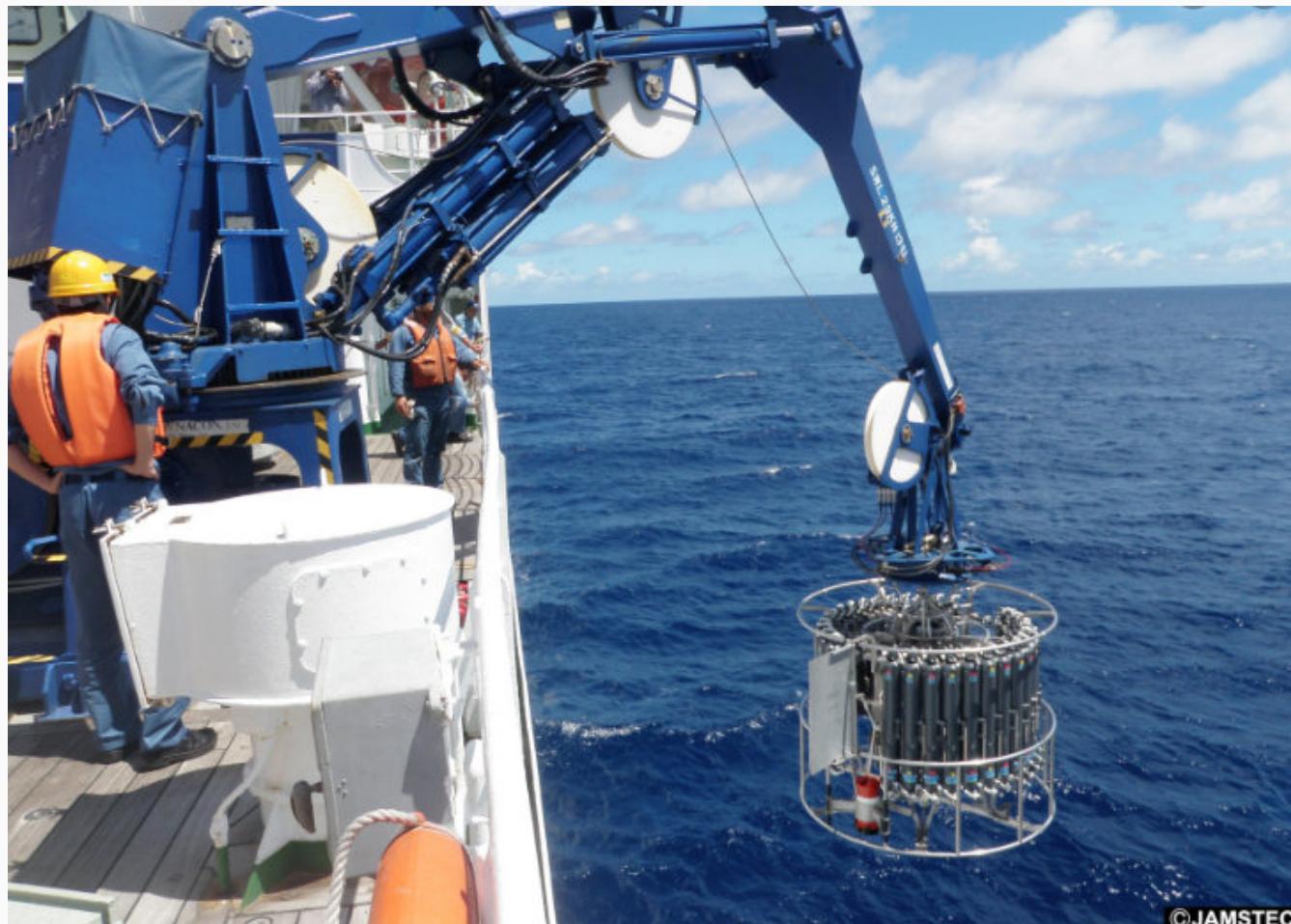
- Bucket sampling



Spatial scales

Sampling the ocean

- Bottles on a Rosette
- CTD - Conductivity, Temperature, Depth



Spatial scales

Sampling the ocean

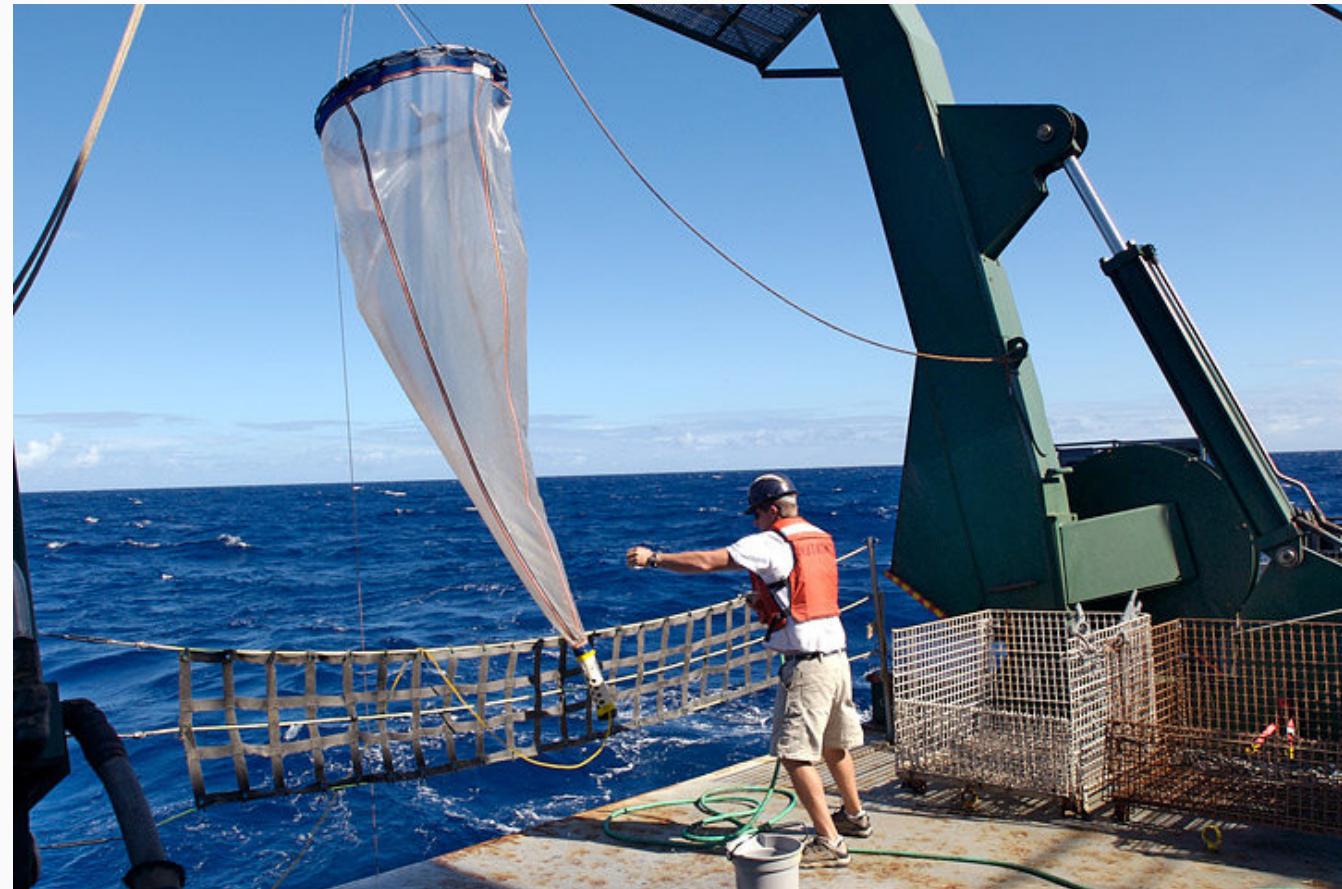
- Filtration



Spatial scales

Sampling the ocean

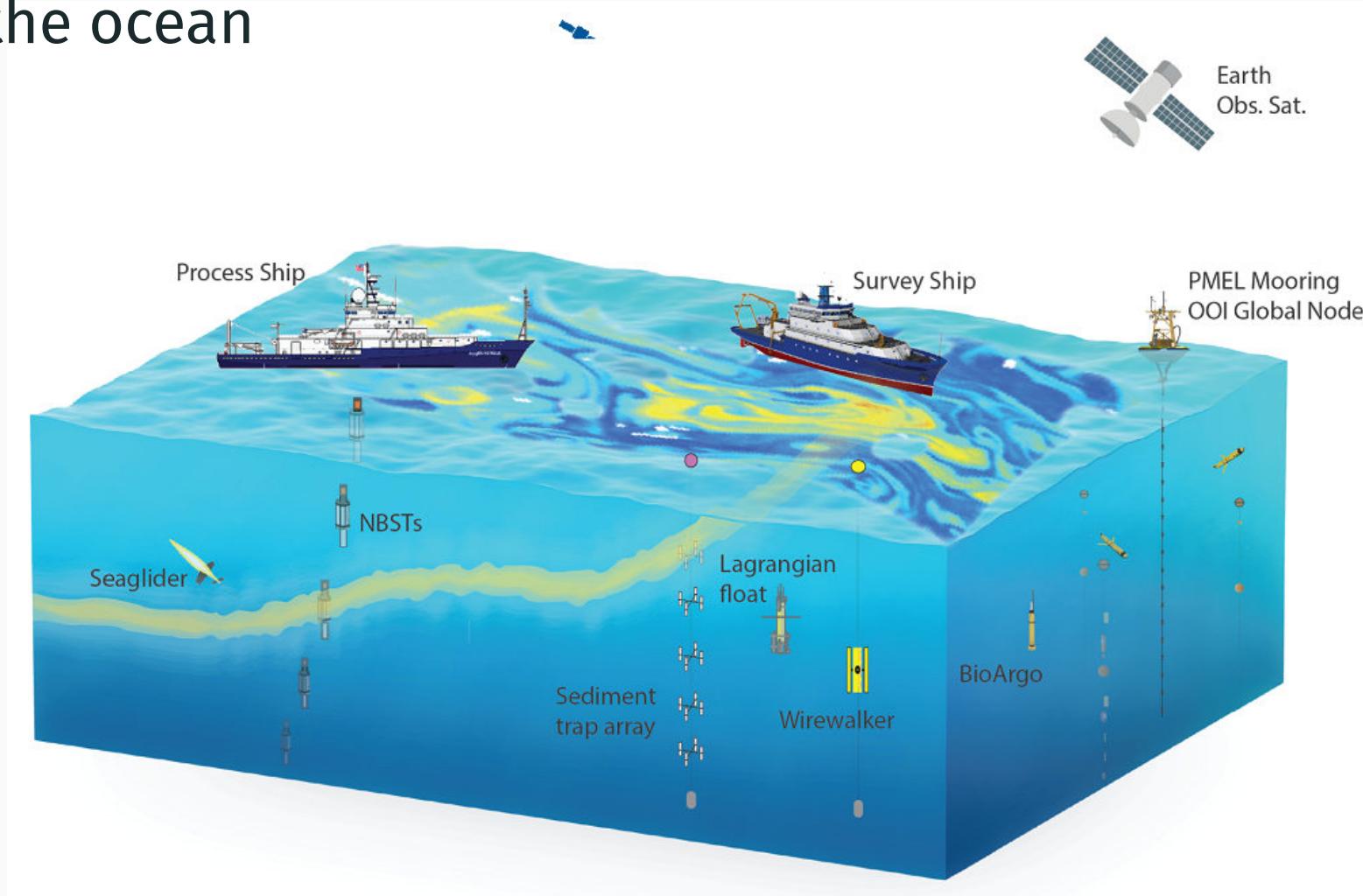
- Nets



Spatial scales

Sampling the ocean

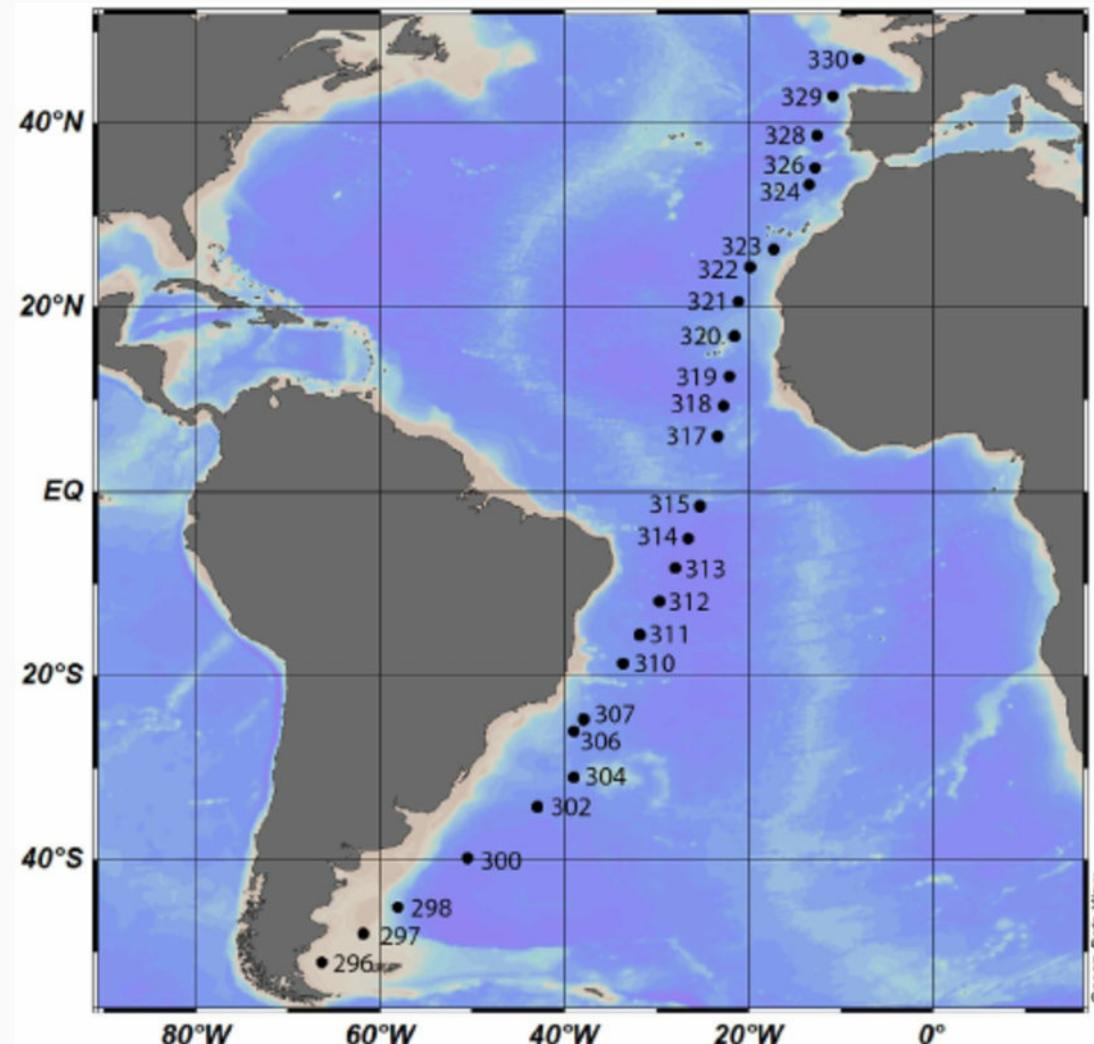
- Eulerian
- Lagrangian



Spatial scales

Sampling the ocean

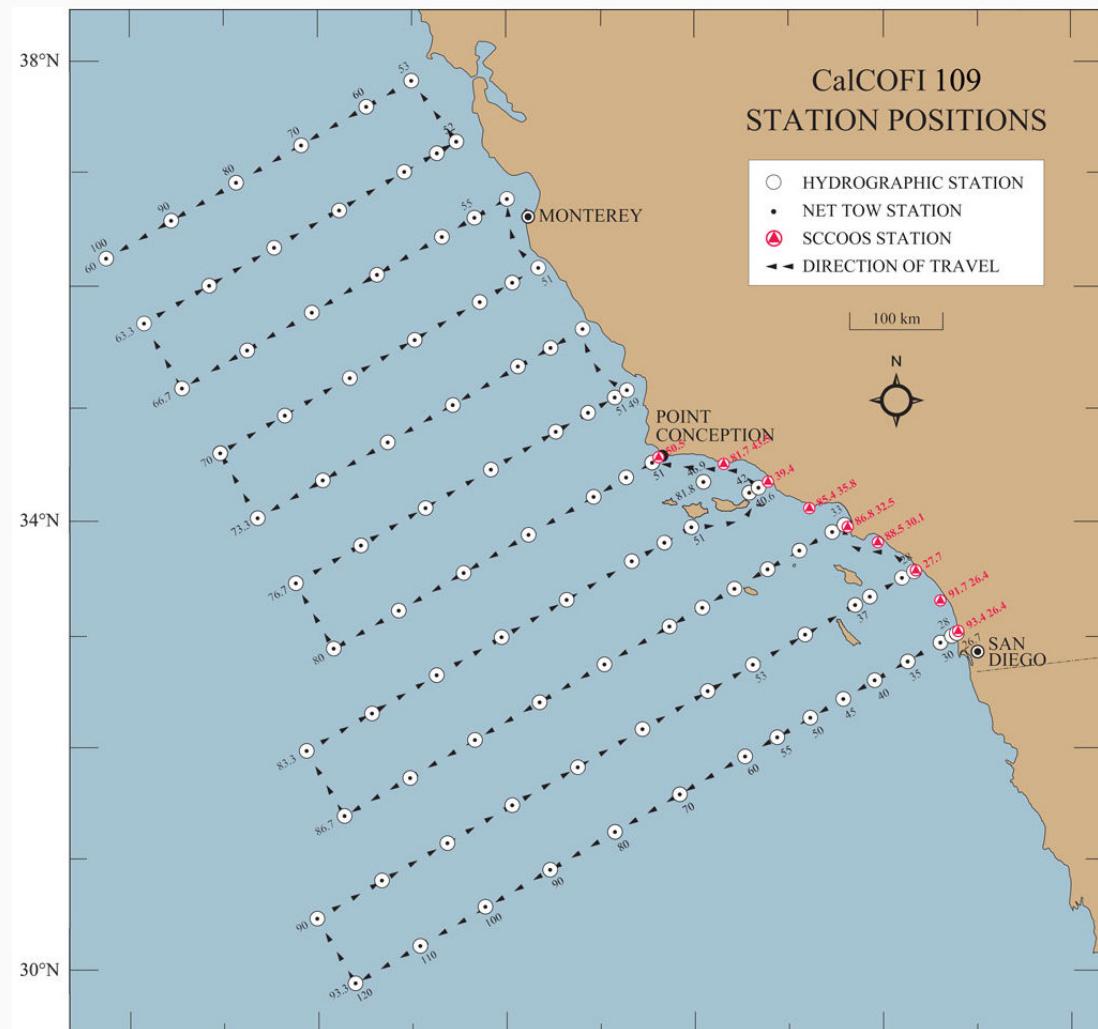
- Transects (Eulerian)



Spatial scales

Sampling the ocean

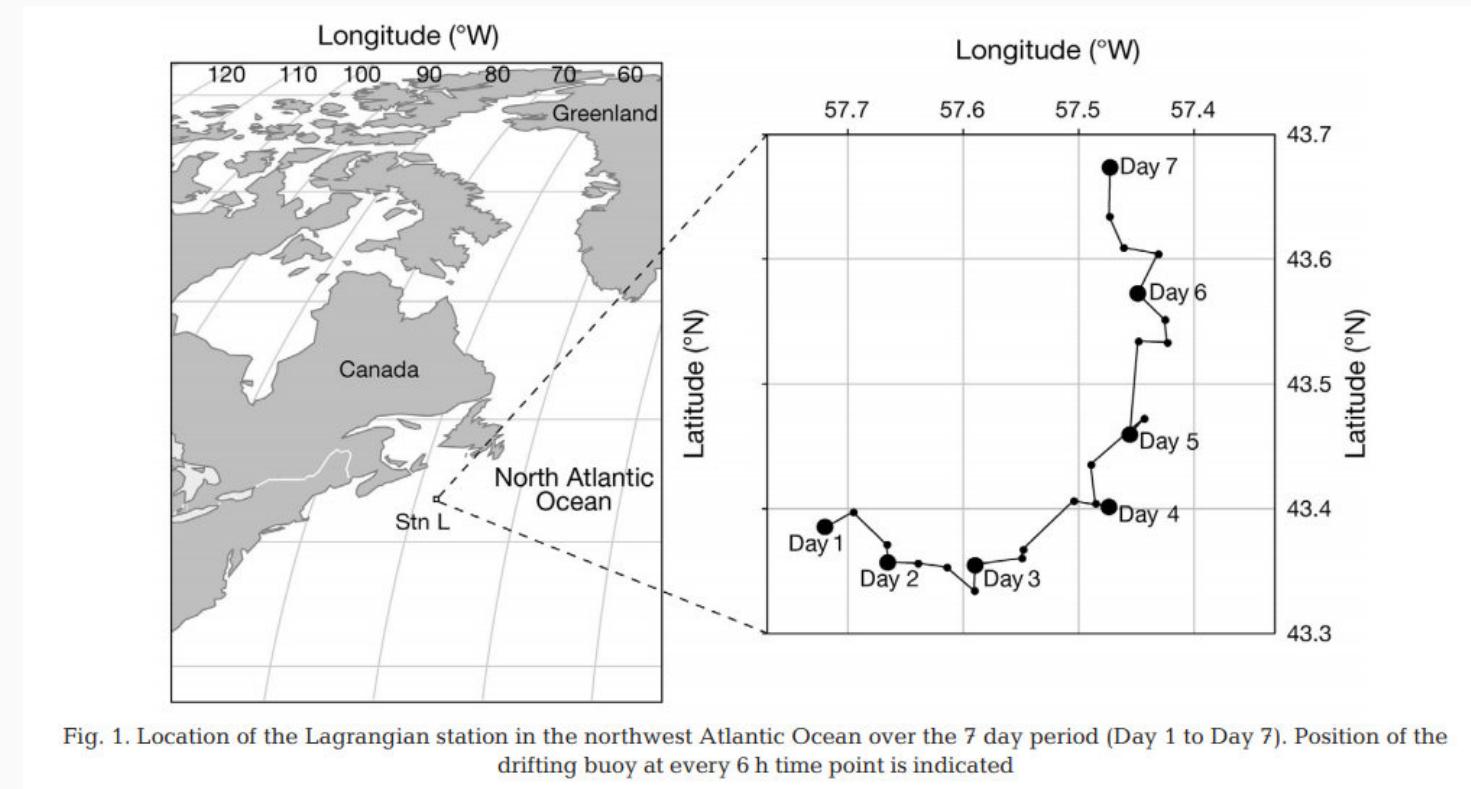
- Grids (Eulerian)



Spatial scales

Sampling the ocean

- Drifting buoy (Lagrangian)



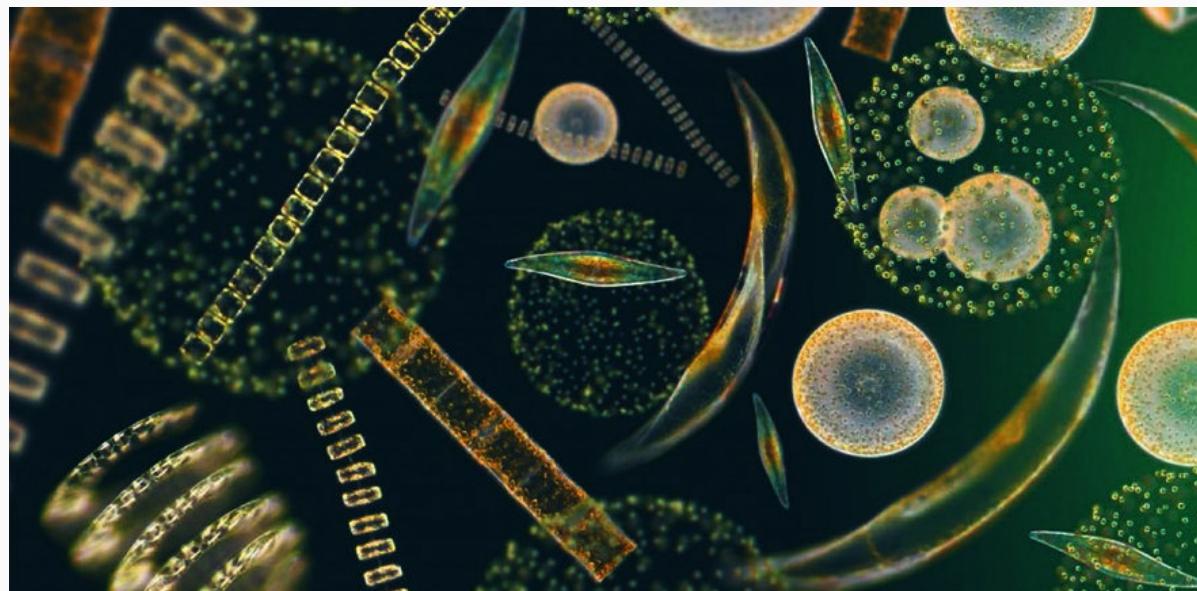
Temporal scales

Polar			
Chemotrophic-based foodweb	Spring bloom release of DOM	Phototrophic-based foodweb	?
Temperate	Spring bloom release of DOM	Stratification	?
(Sub) tropical			

The diagram illustrates the temporal scales of ocean productivity across different environmental zones. The columns represent different productivity pathways: Chemotrophic-based foodweb, Spring bloom release of DOM, Phototrophic-based foodweb, and an unlabeled column marked with a question mark. The rows represent environmental zones: Polar, Temperate, and (Sub) tropical. The diagrams show phytoplankton blooms (represented by green swirls), sunlight (yellow circles), and ocean currents (represented by arrows). In the Polar zone, the Chemotrophic-based foodweb diagram shows a chemotrophic base at the bottom of the water column. The Temperate zone shows stratification with a dashed line separating the surface from the deep ocean. The (Sub) tropical zone shows a more uniform water column. The 'Spring bloom release of DOM' row highlights the timing of phytoplankton blooms and the subsequent release of dissolved organic matter (DOM) into the water column.

Temporal scales

What are the most important scales in the ocean?



Temporal scales

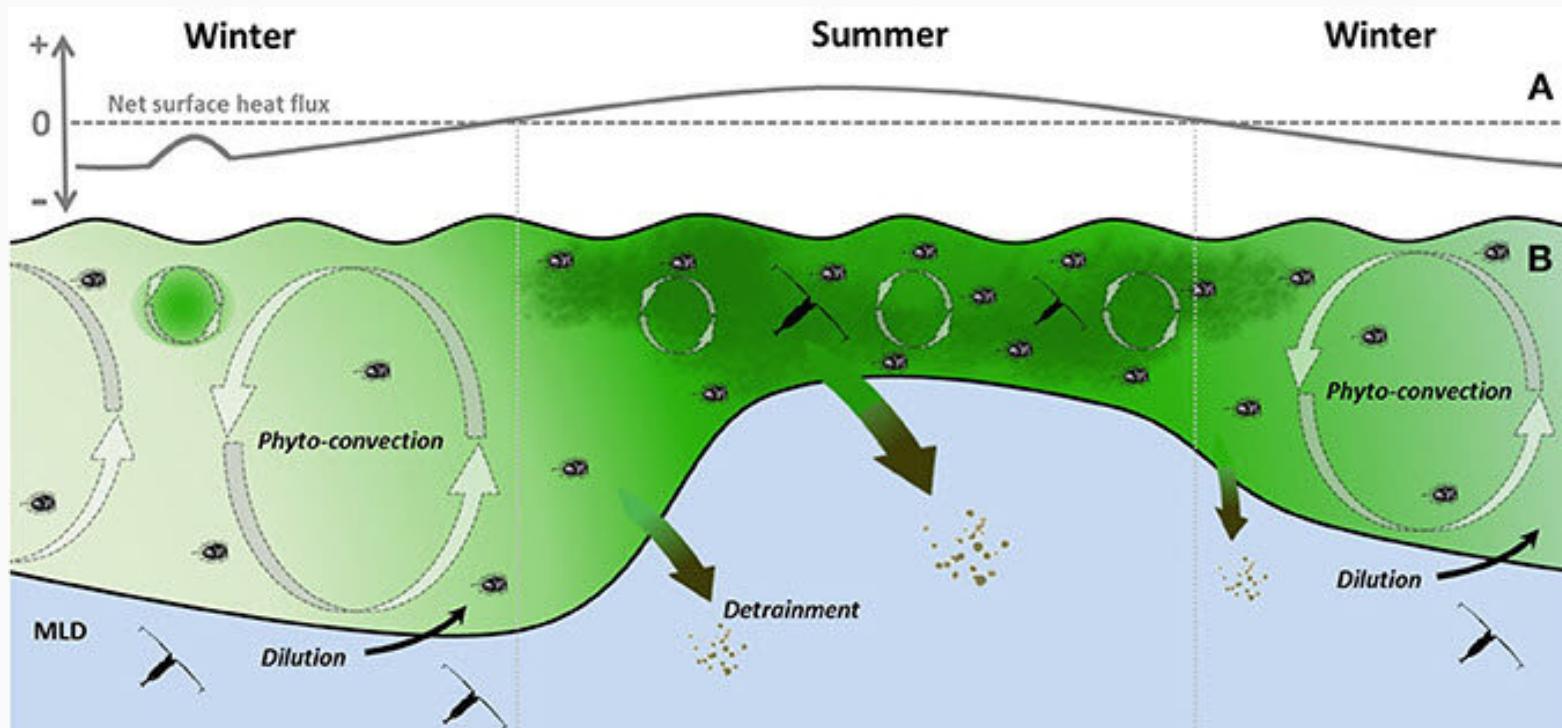
Temporal variations



Temporal scales

Annual scale - Spring bloom

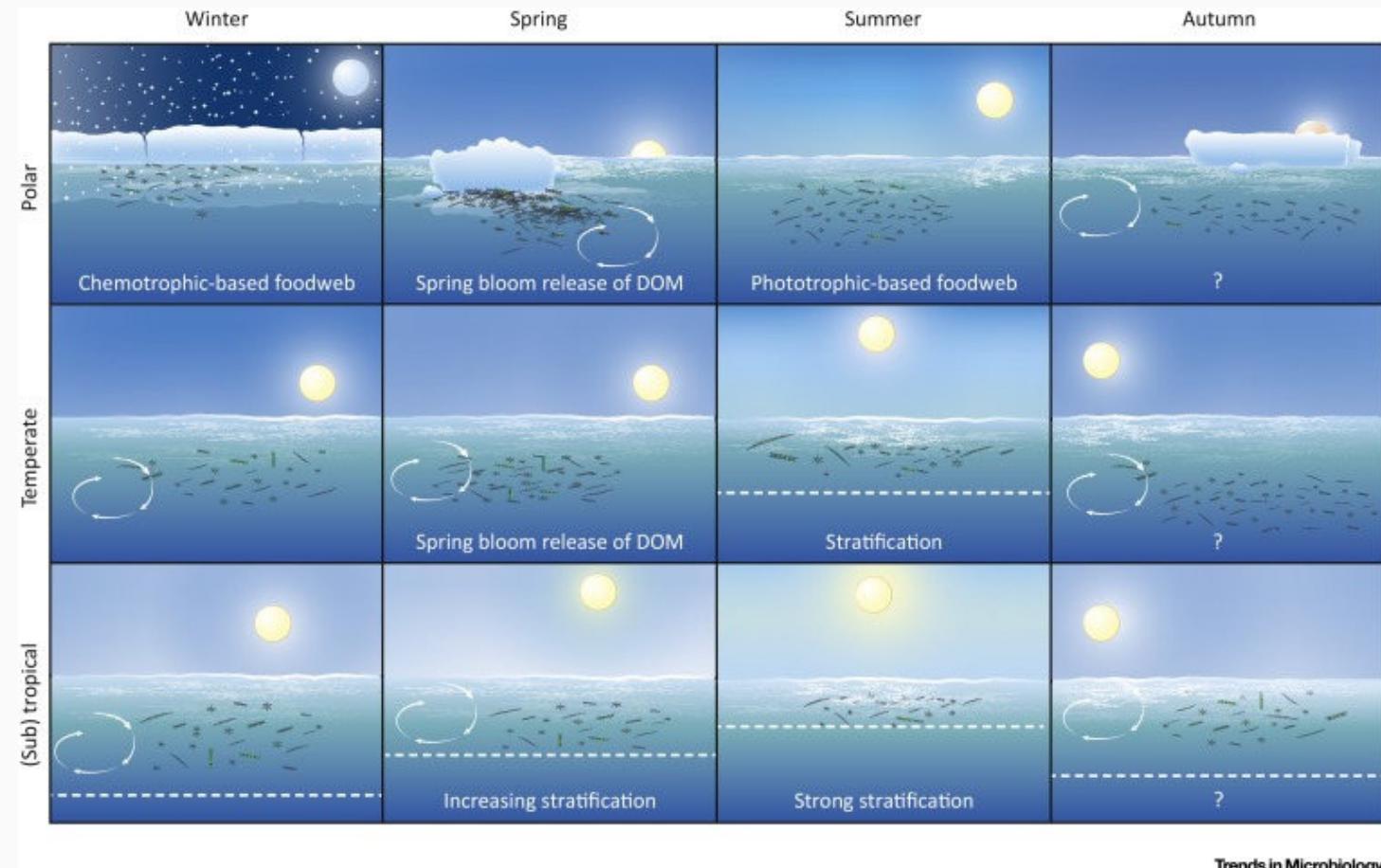
- Diatoms
- Dinoflagellates



Temporal scales

Annual scale - Spring bloom

- Depends on latitude
 - Temperate
 - Tropical
 - Arctic

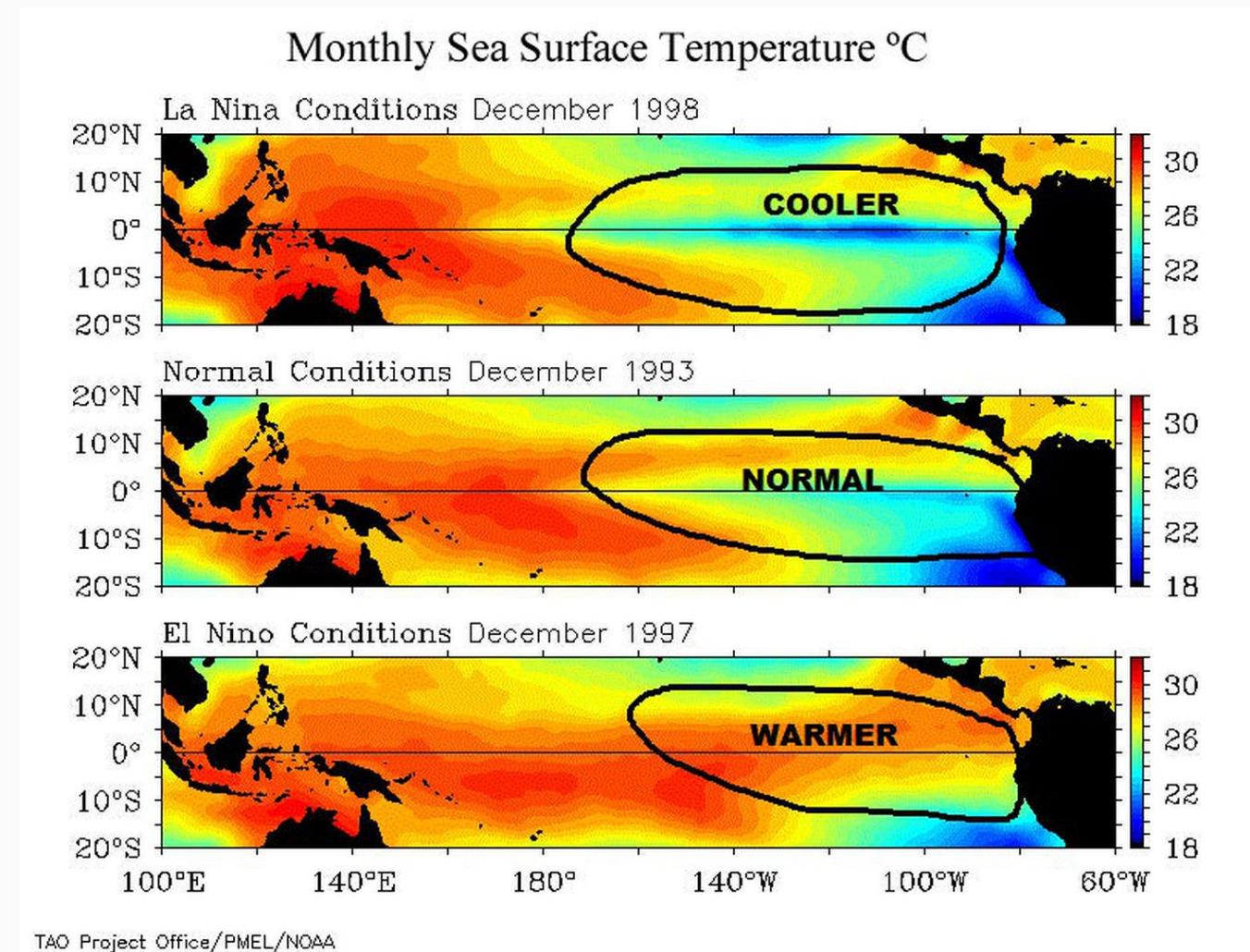


Trends in Microbiology

Temporal scales

Multi-year scale - El Niño

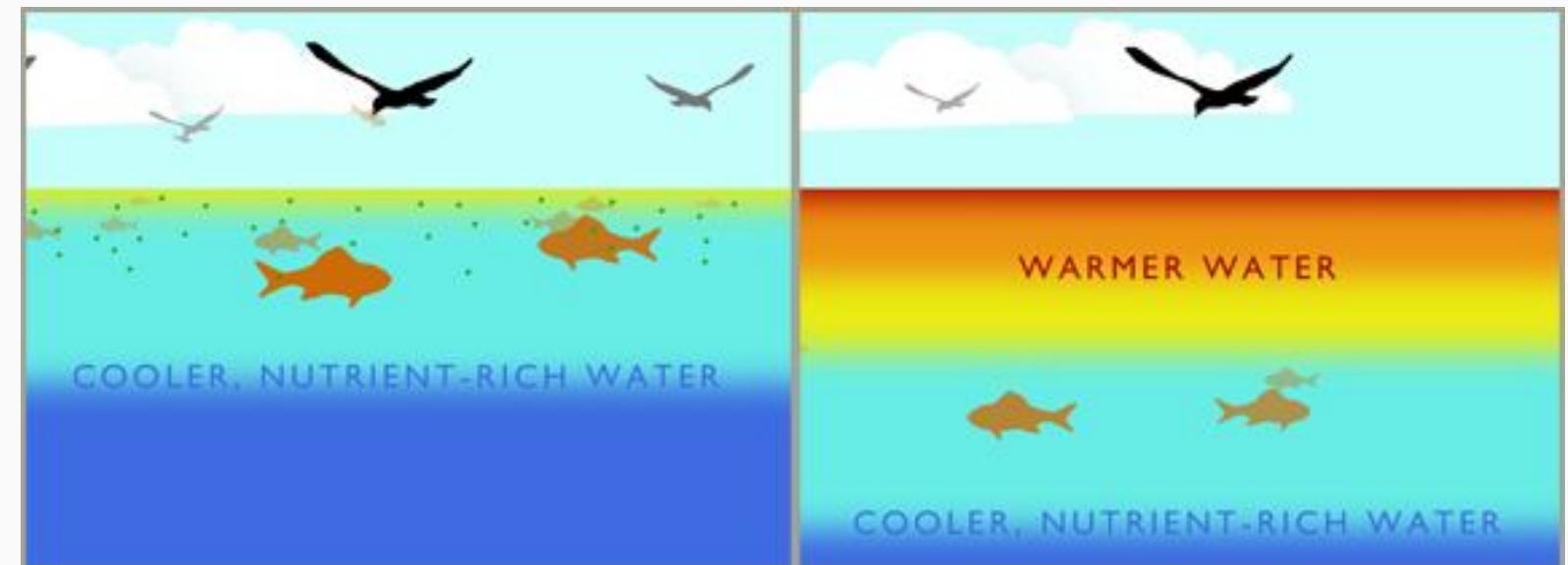
Warm water accumulates over East Pacific



Temporal scales

Multi-year scale - El Niño

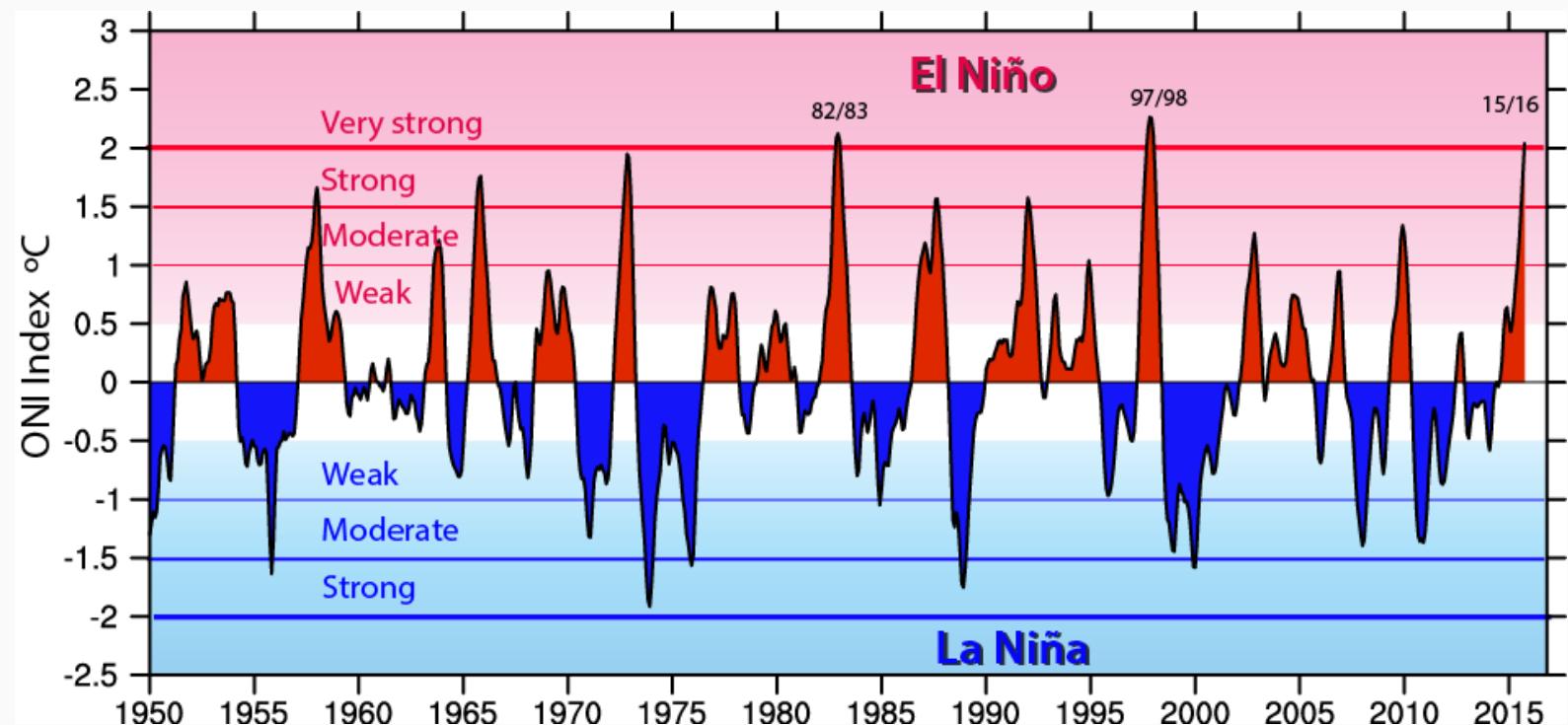
- Blocks upwelling
- Phytoplankton decrease
- Lower fish capture (anchovy)



Temporal scales

Multi-year scale - El Niño

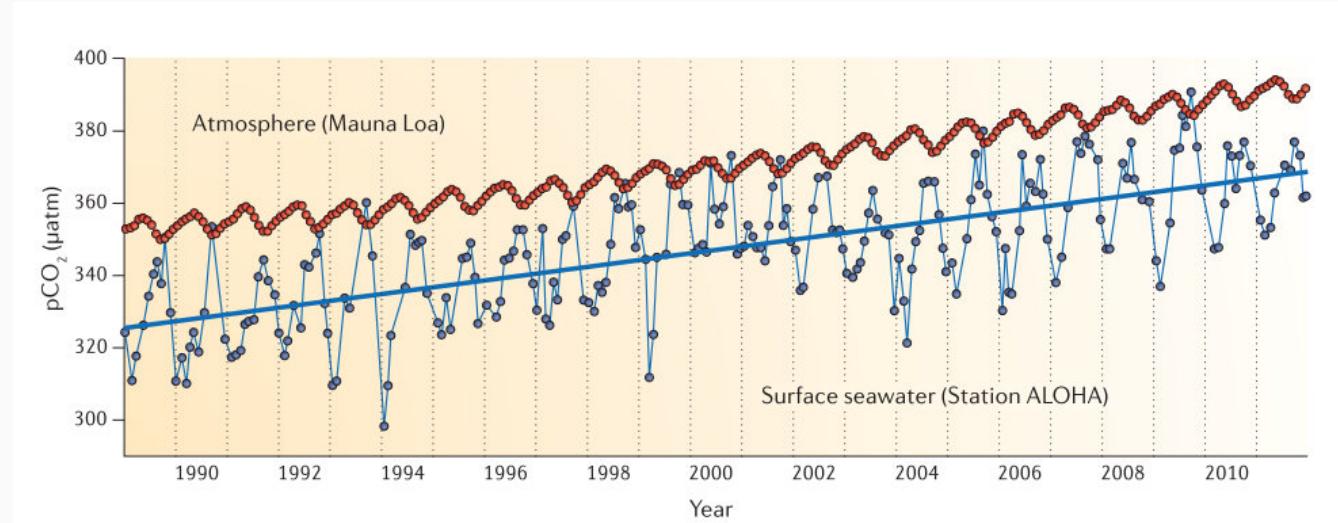
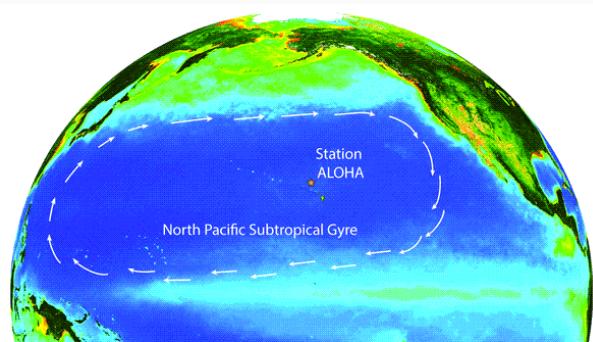
- Year to year change in intensity



Temporal scales

Climatic change

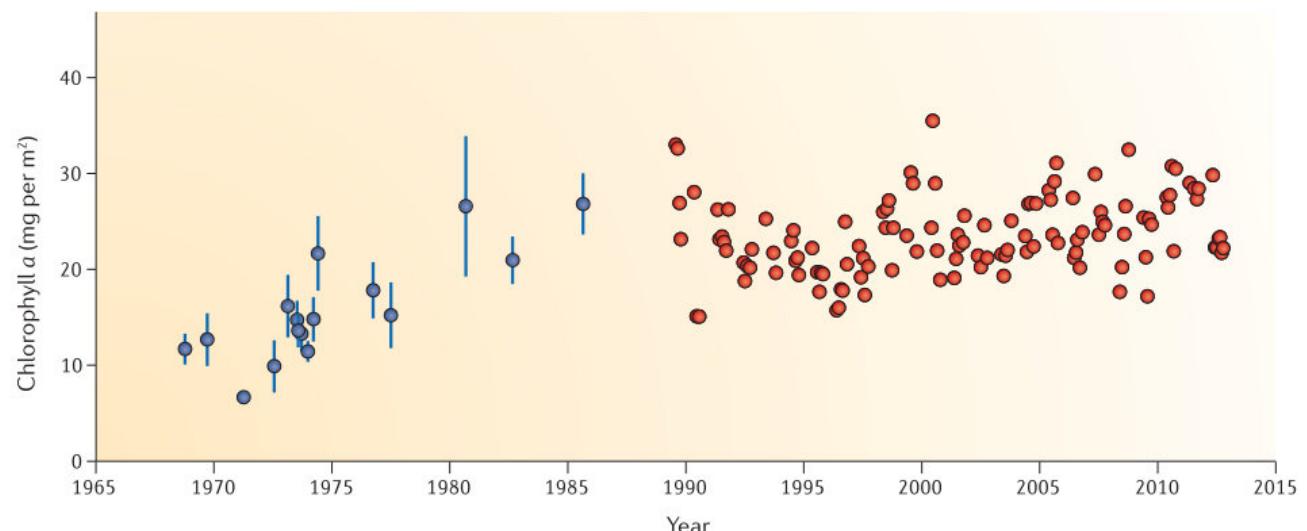
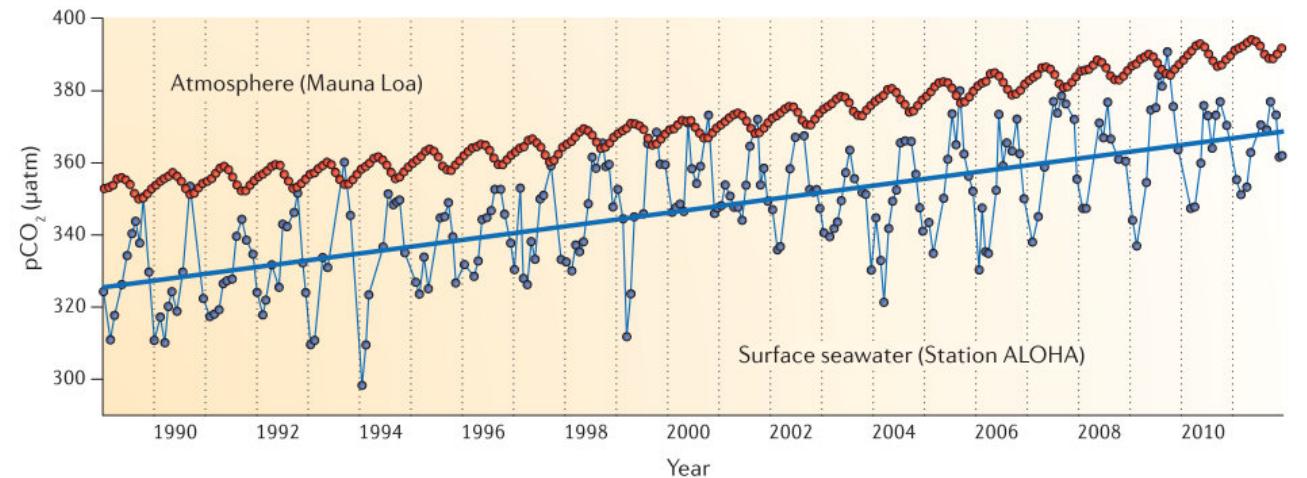
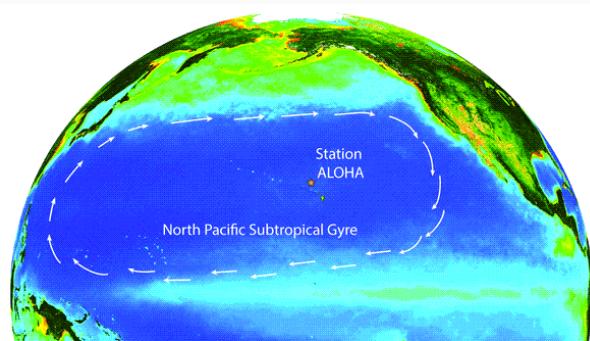
- ALOHA station



Temporal scales

Climatic change

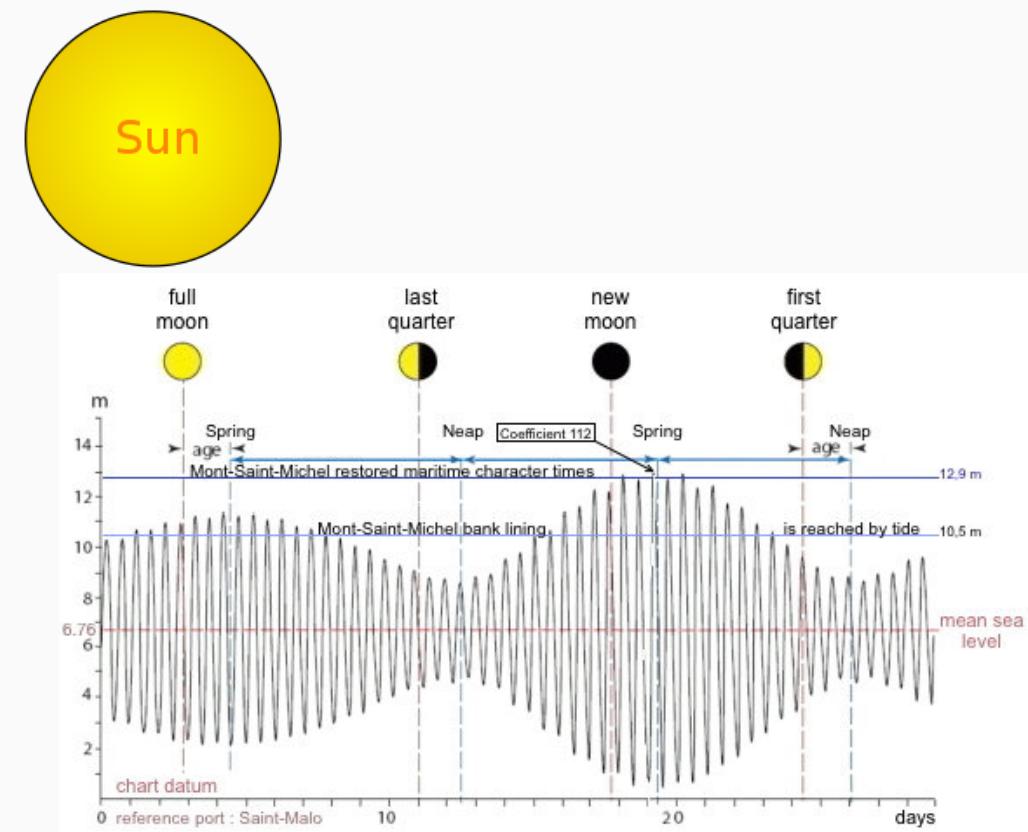
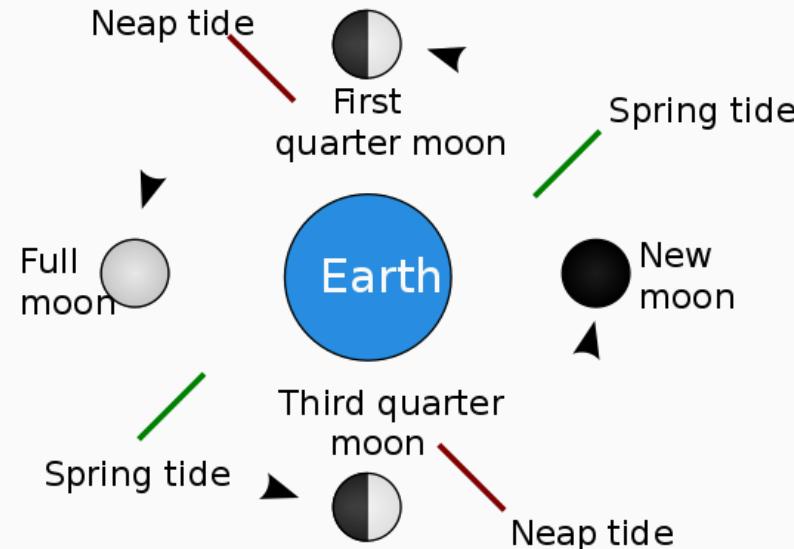
- ALOHA station



Temporal scales

Monthly scale

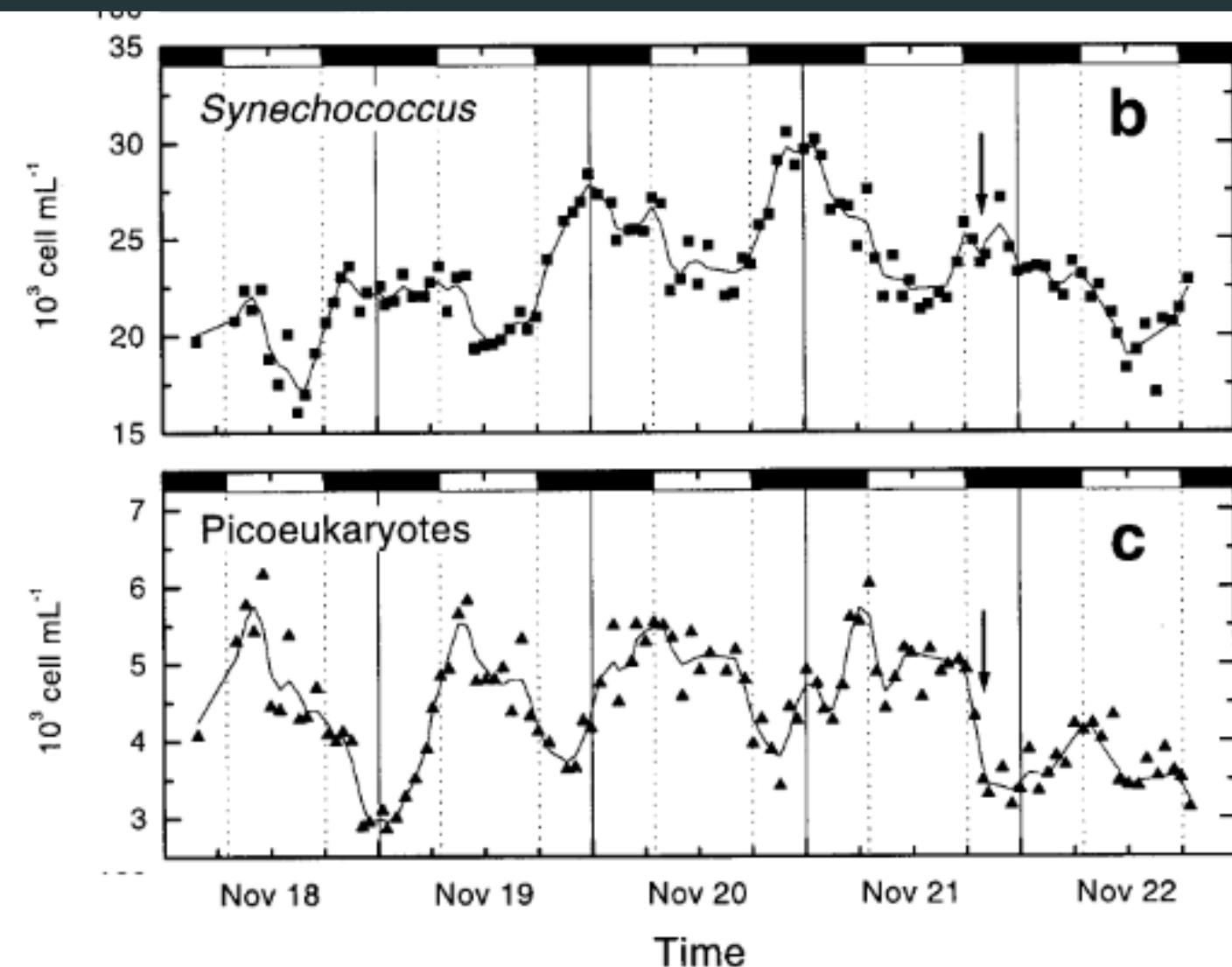
- Neap tide
- Spring tide



Temporal scales

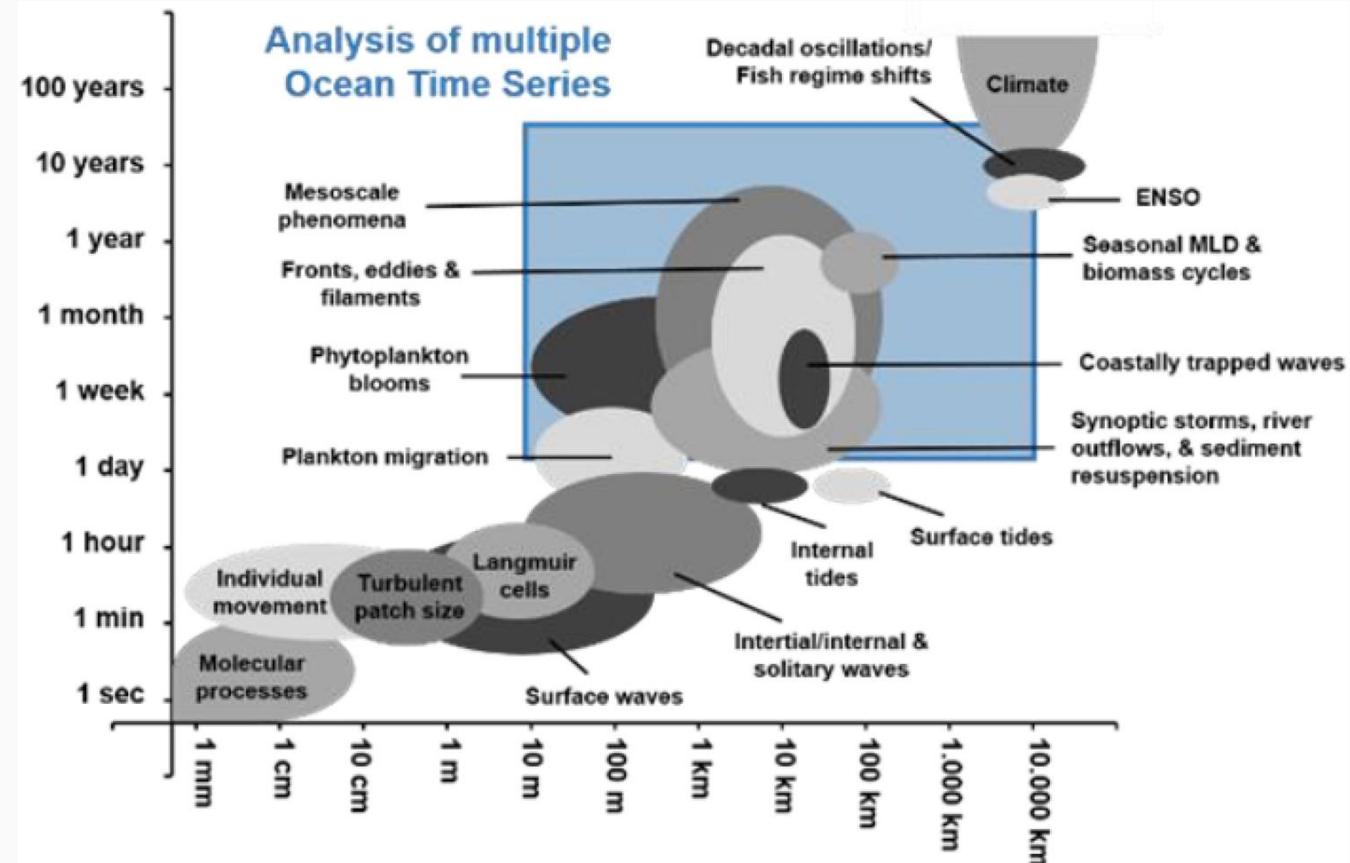
Daily scale

Unique to marine systems

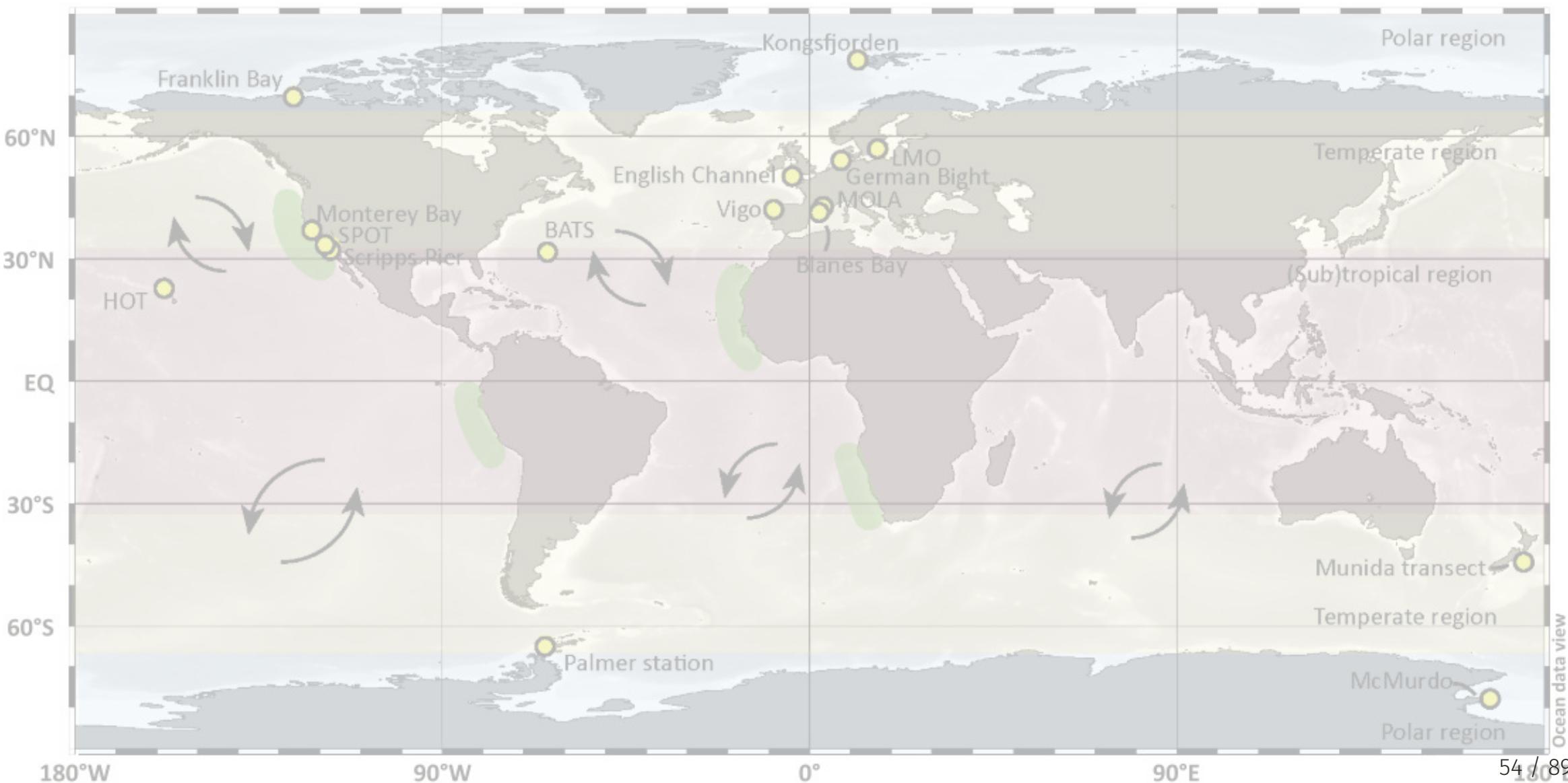


Temporal scales

Spatial and temporal scales

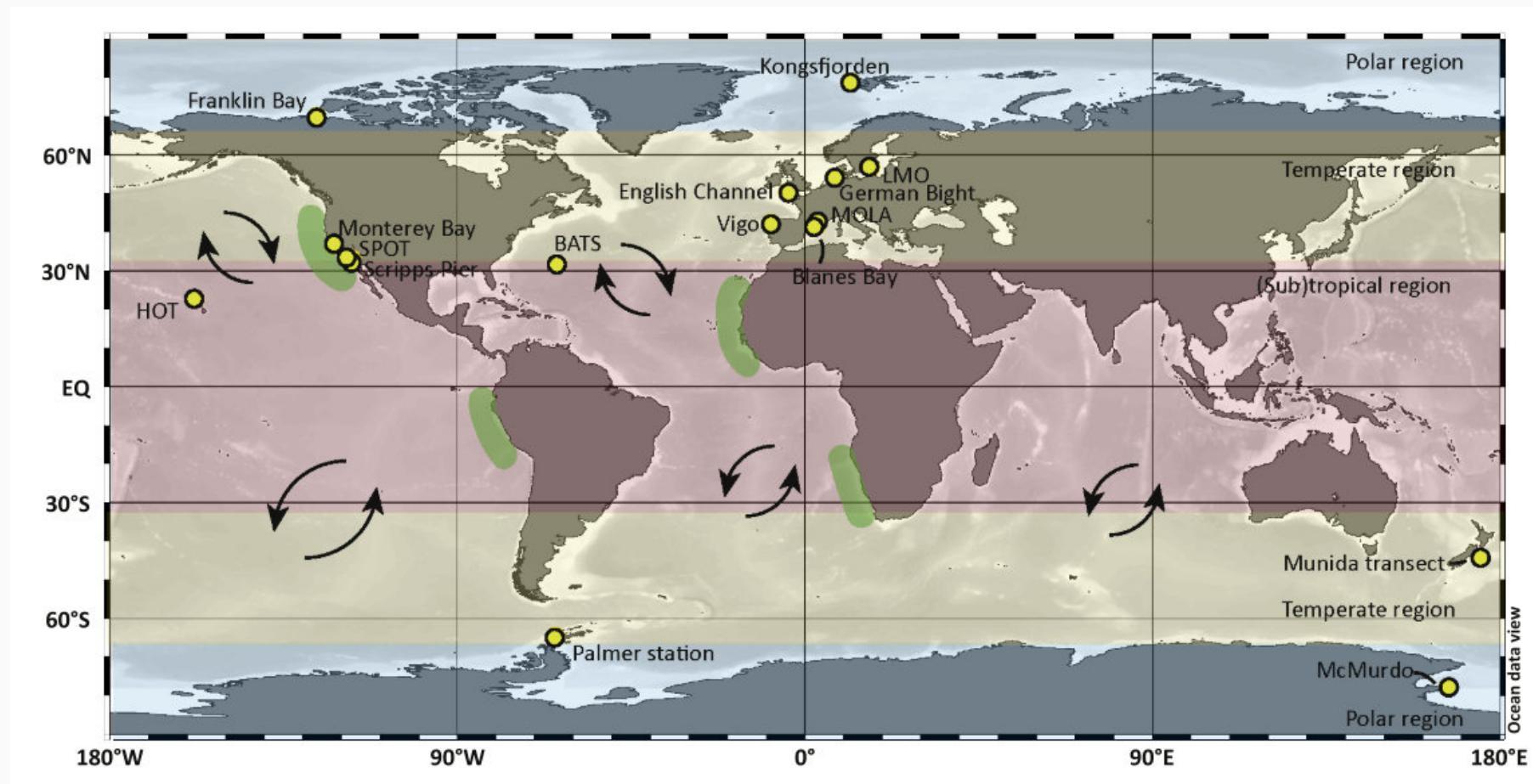


Time series



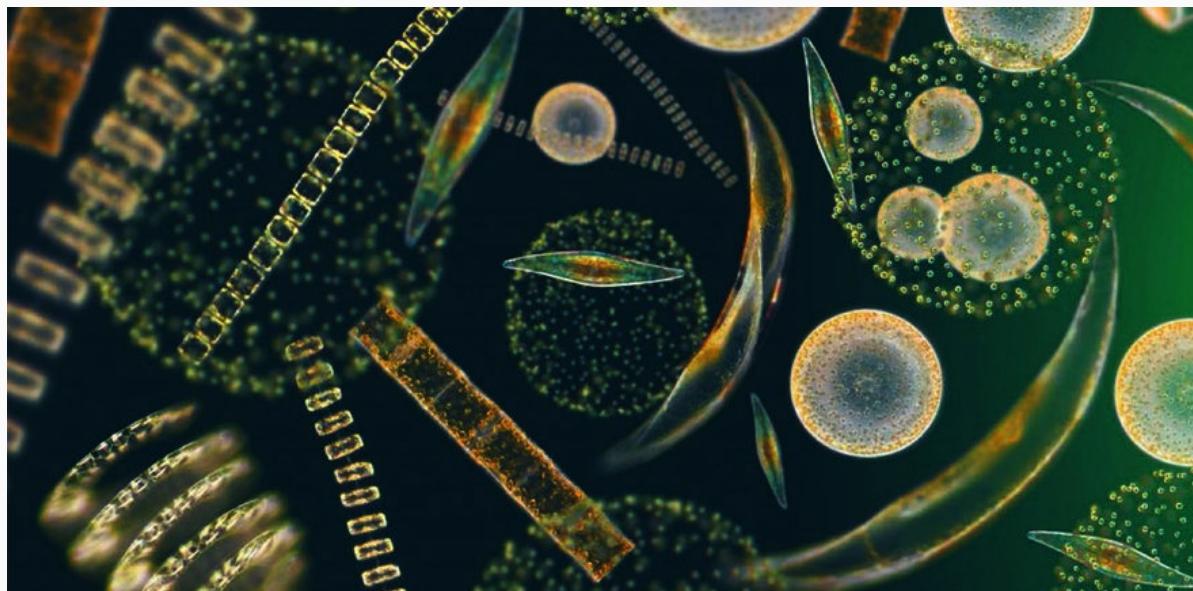
Time series

Long term stations



Time series

What kind of questions can be addressed by such long term series?



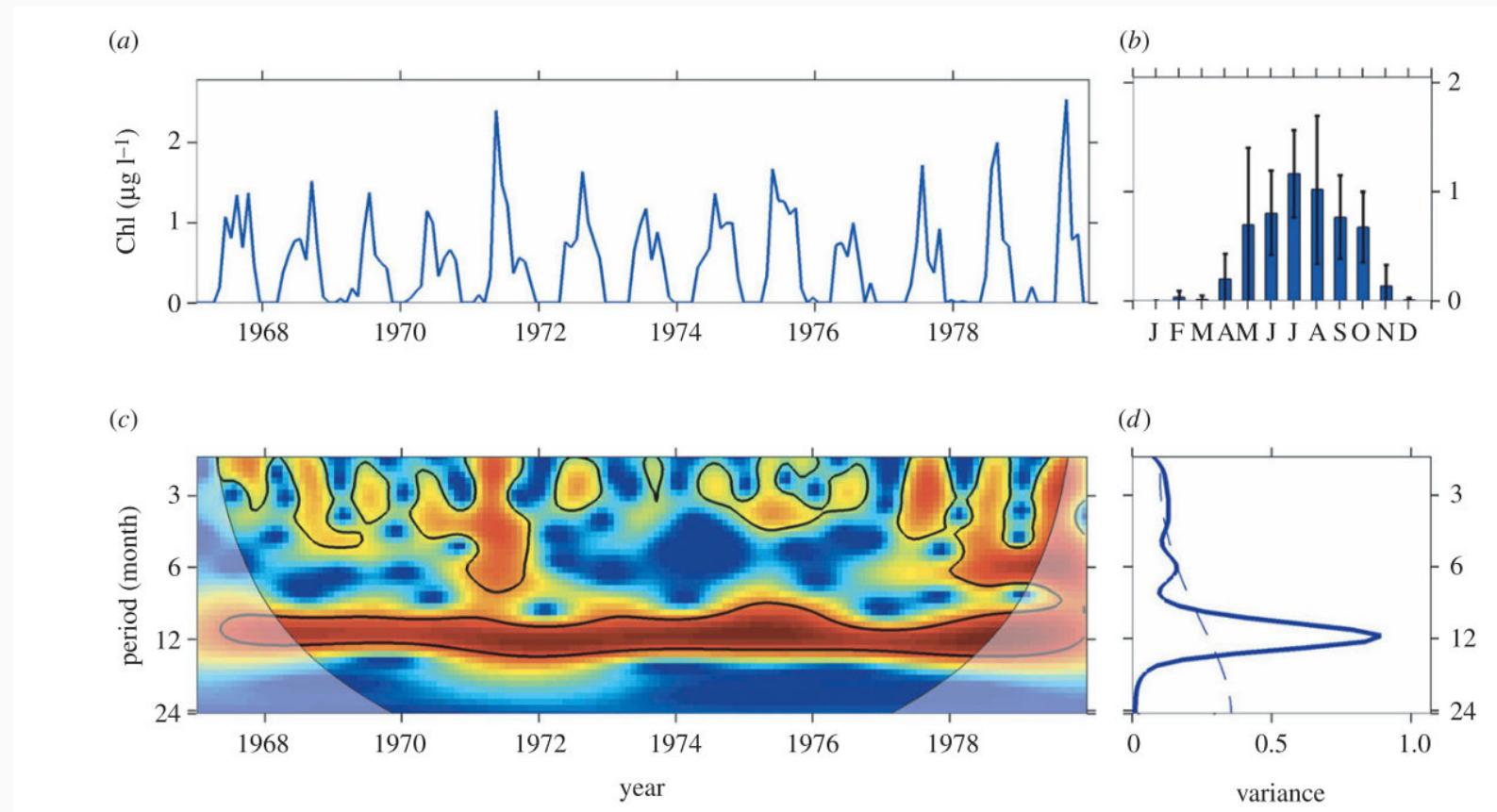
Time series

- What are the key periodicities ?
 - annual (what about equator ?)
 - tides (monthly)
 - daily
- Long term climatic trends
- What drives the year to year variability
- Recurring species ?

Time series

Chlorophyll time series

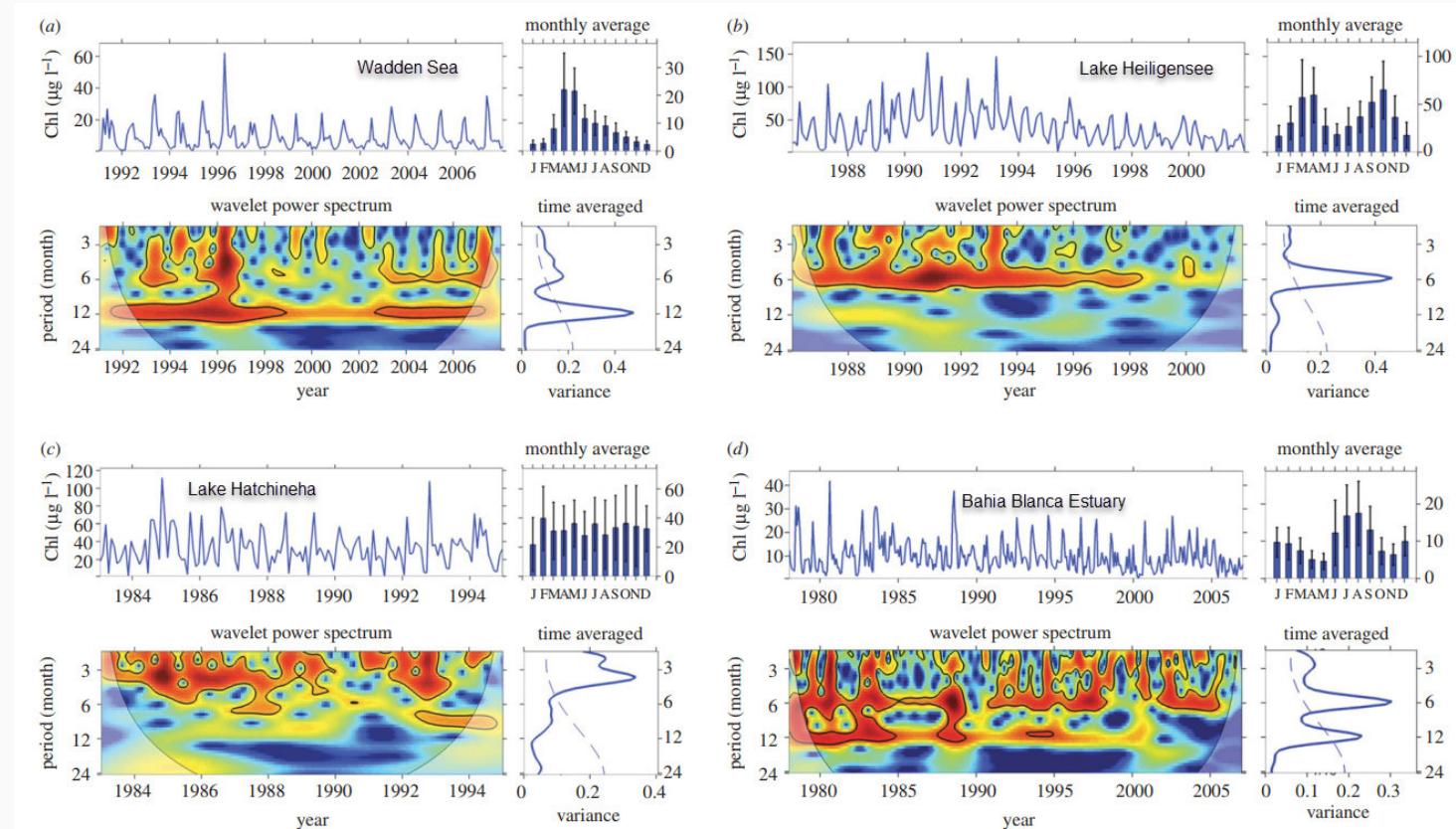
- North Atlantic Chl-a time series (57–62° N, 20–108° W) from 1967 to 1979



Time series

Chlorophyll time series

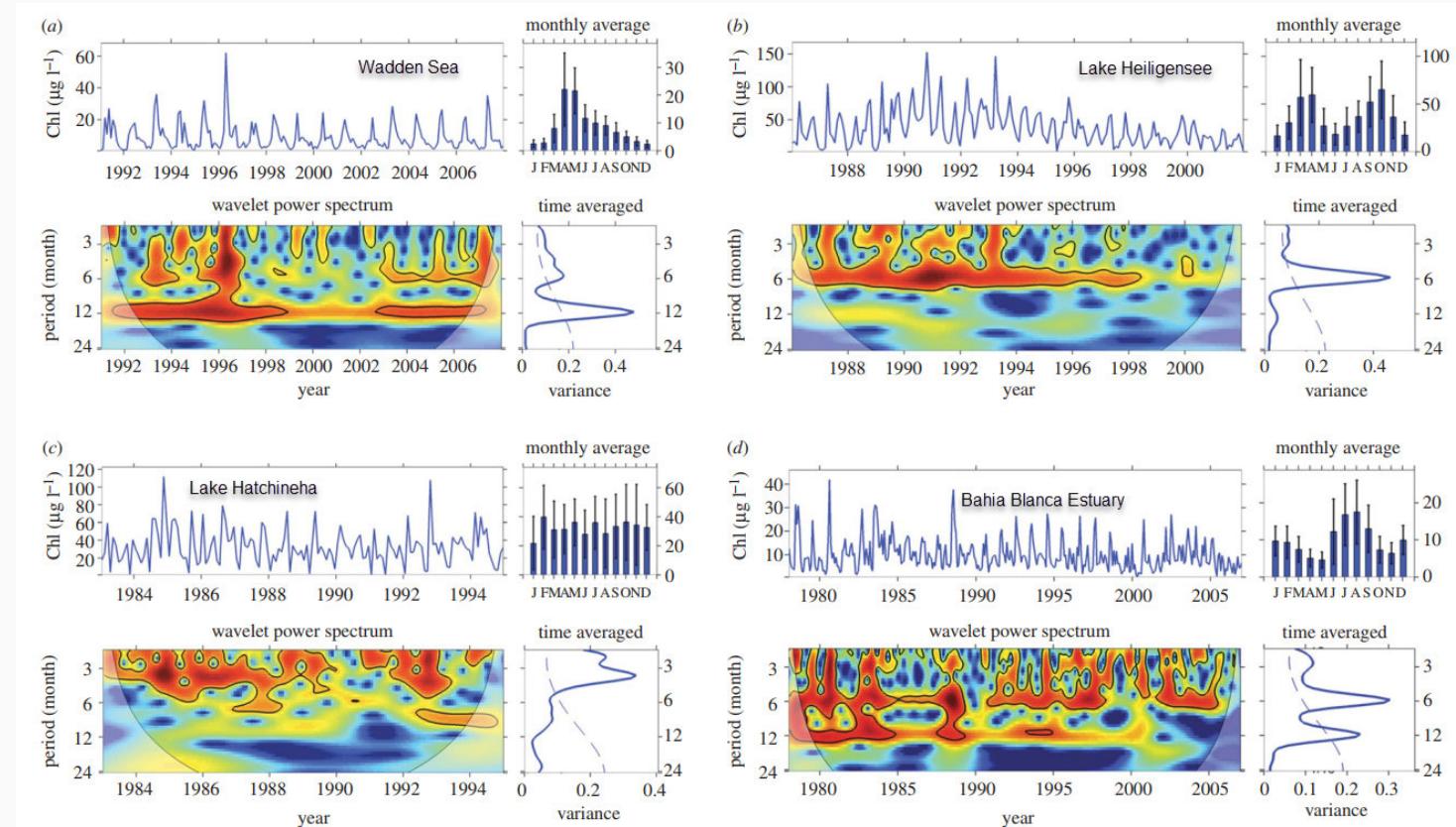
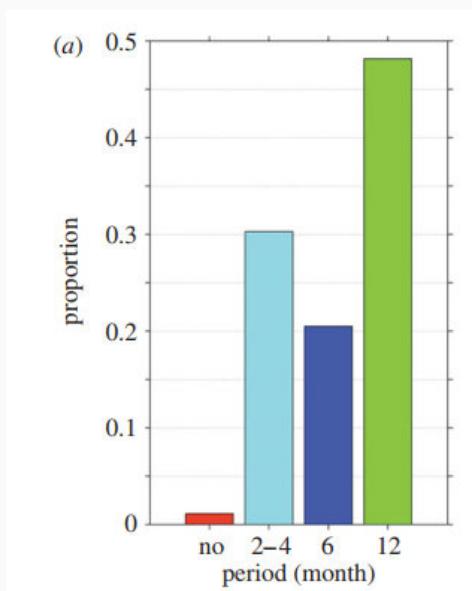
What can you see ?



Time series

Chlorophyll time series

- Different environments have different frequencies



What drives the *Synechococcus* bloom ?

Physiological and ecological drivers of early spring blooms of a coastal phytoplankton

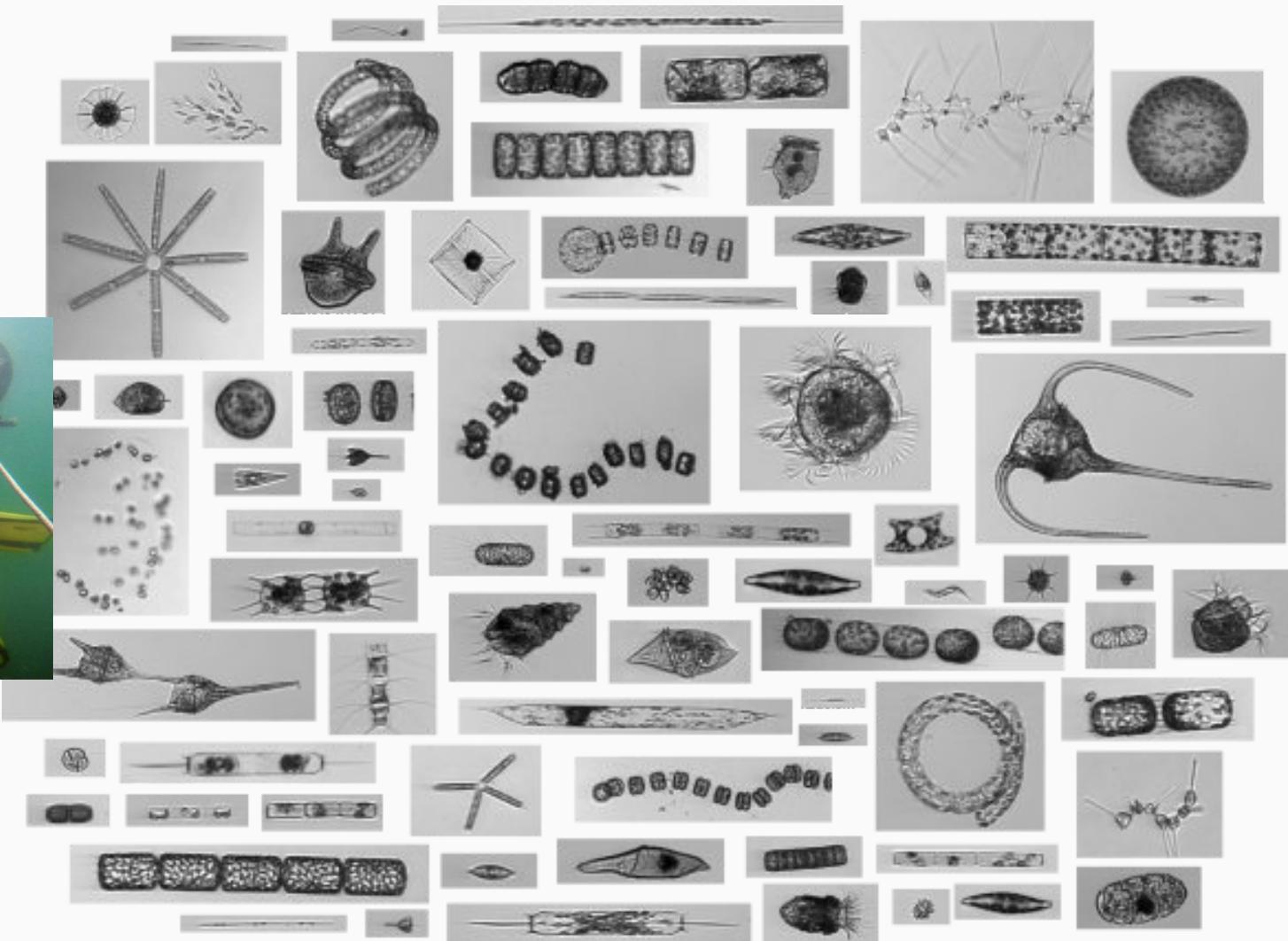
Kristen R. Hunter-Cevera,¹ Michael G. Neubert,¹ Robert J. Olson,¹ Andrew R. Solow,²
Alexi Shalapyonok,¹ Heidi M. Sosik^{1*}

Climate affects the timing and magnitude of phytoplankton blooms that fuel marine food webs and influence global biogeochemical cycles. Changes in bloom timing have been detected in some cases, but the underlying mechanisms remain elusive, contributing to uncertainty in long-term predictions of climate change impacts. Here we describe a 13-year hourly time series from the New England shelf of data on the coastal phytoplankton *Synechococcus*, during which the timing of its spring bloom varied by 4 weeks. We show that multiyear trends are due to temperature-induced changes in cell division rate, with earlier blooms driven by warmer spring water temperatures. *Synechococcus* loss rates shift in tandem with division rates, suggesting a balance between growth and loss that has persisted

What drives the *Synechococcus* bloom ?

Flow Cytobot

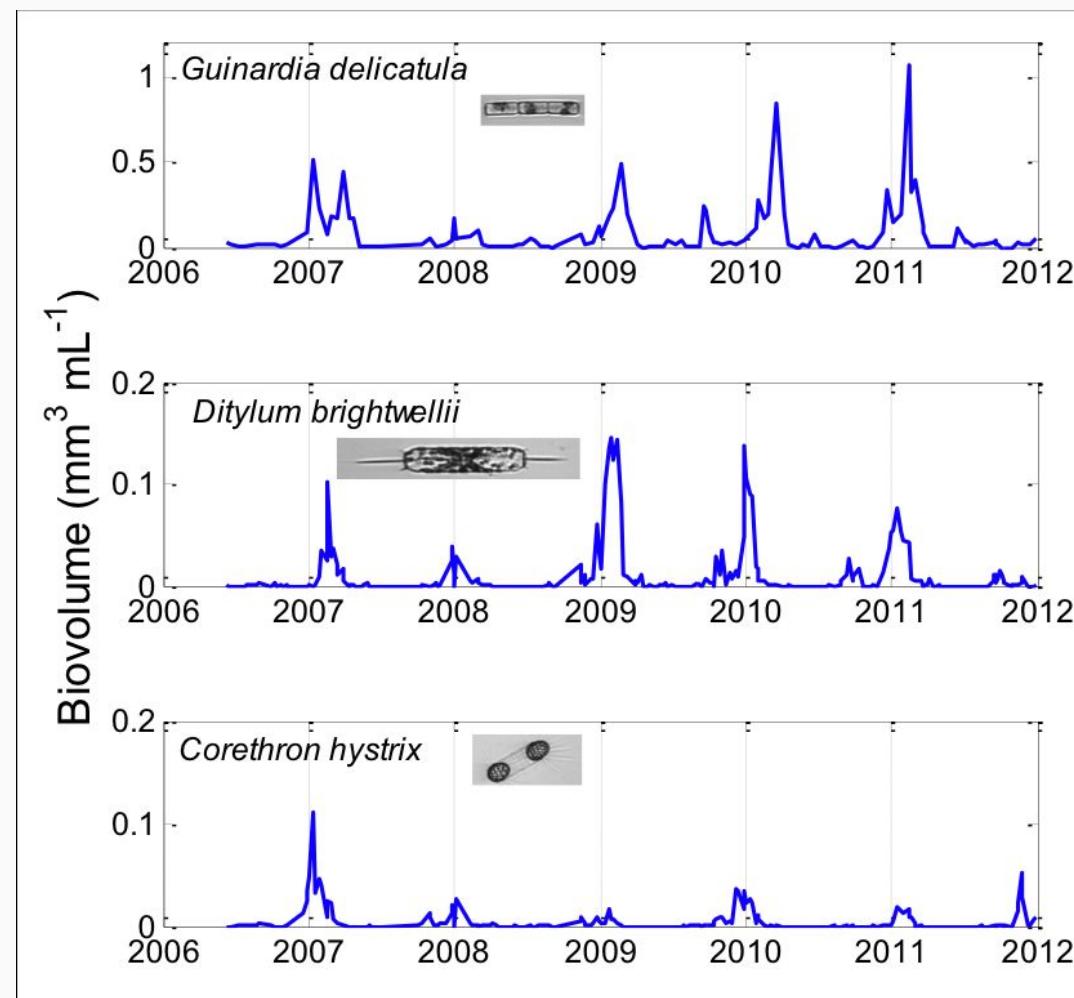
- Imaging and flow cytometry



What drives the *Synechoccus* bloom ?

Flow Cytobot

- Diatoms



What drives the *Synechococcus* bloom ?

Synechococcus

- Discovered in 1979 by John Waterbury - Epifluorescence microscopy

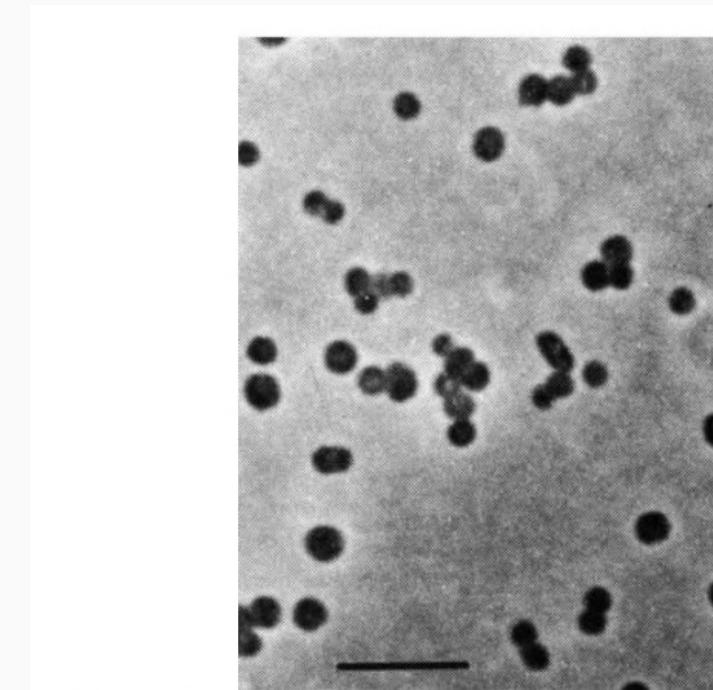
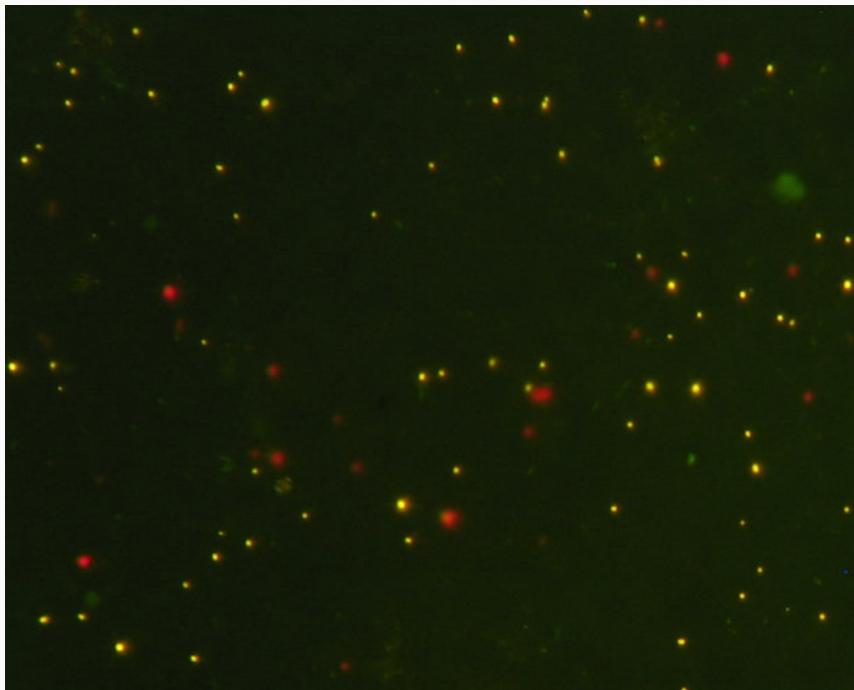
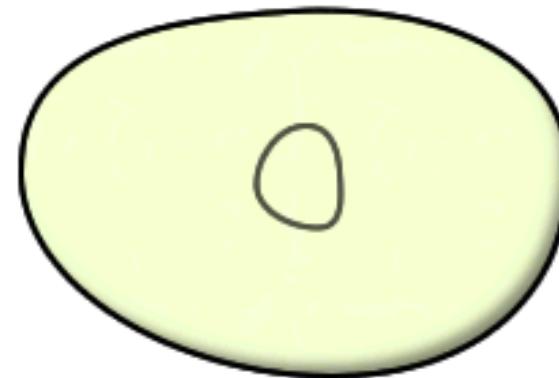


Fig. 1 Phase contrast photomicrograph of *Synechococcus* sp. (strain Syn-48) illustrating general cell morphology (scale bar, 5.0 μm).

What drives the *Synechoccus* bloom ?

Cell multiplication

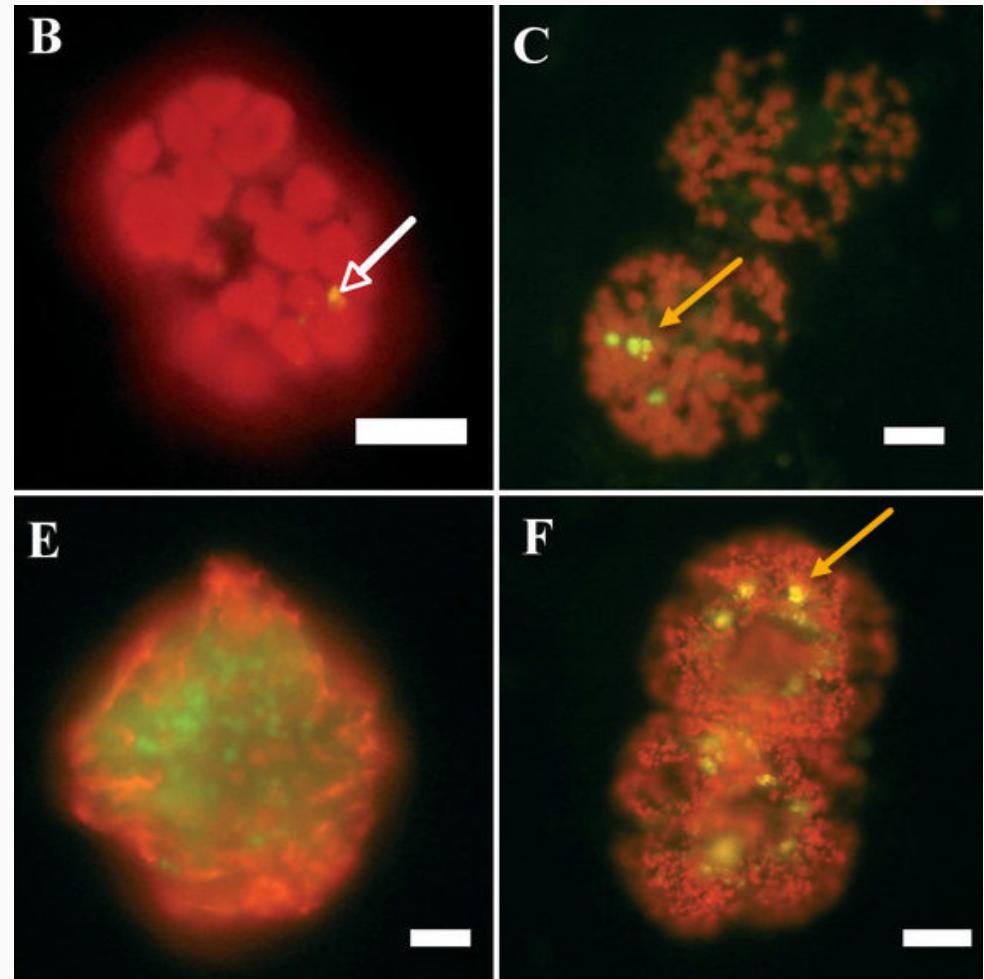
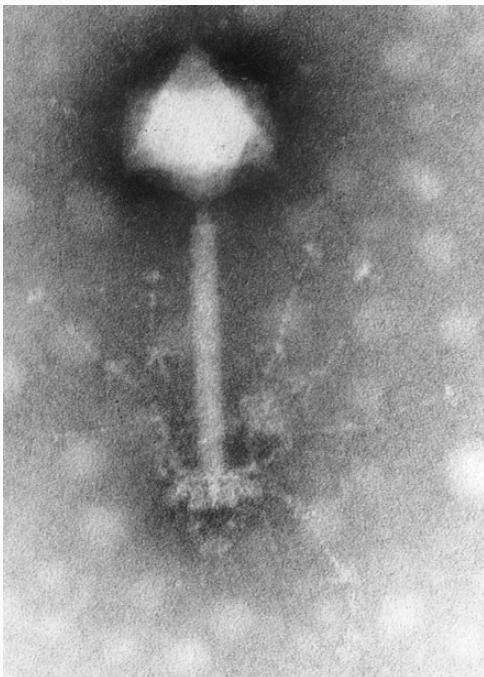
- Binary fission
- Typically once every day



What drives the *Synechoccus* bloom ?

Cell disappearance

- Virus
- Predation
- Cell death (UV, nutrient deprivation)



What drives the *Synechoccus* bloom ?

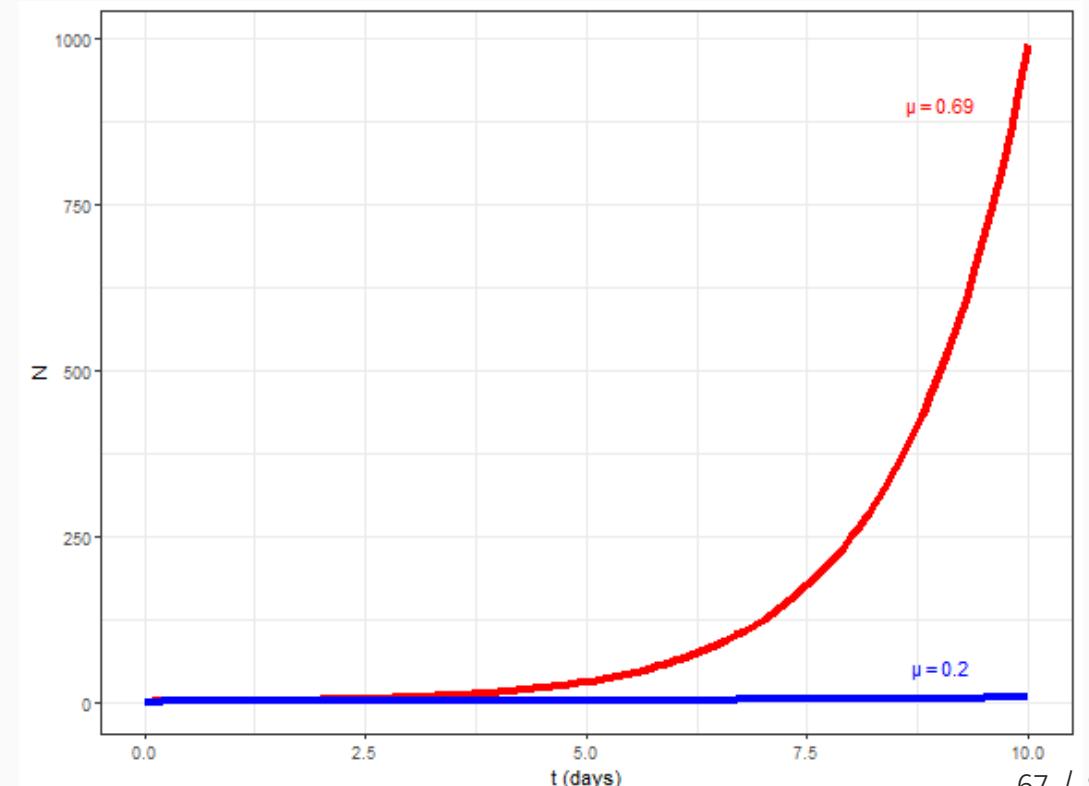
Growth rate vs Loss rate

$$\frac{dN}{dt} = \mu_{net} * N$$

$$N = N_0 \exp^{\mu_{net}*t}$$

$$\mu_{net} = \mu_{growth} - \mu_{loss}$$

- Growth rate = division
- Loss rate = cell death, predation, viruses



What drives the *Synechoccus* bloom ?

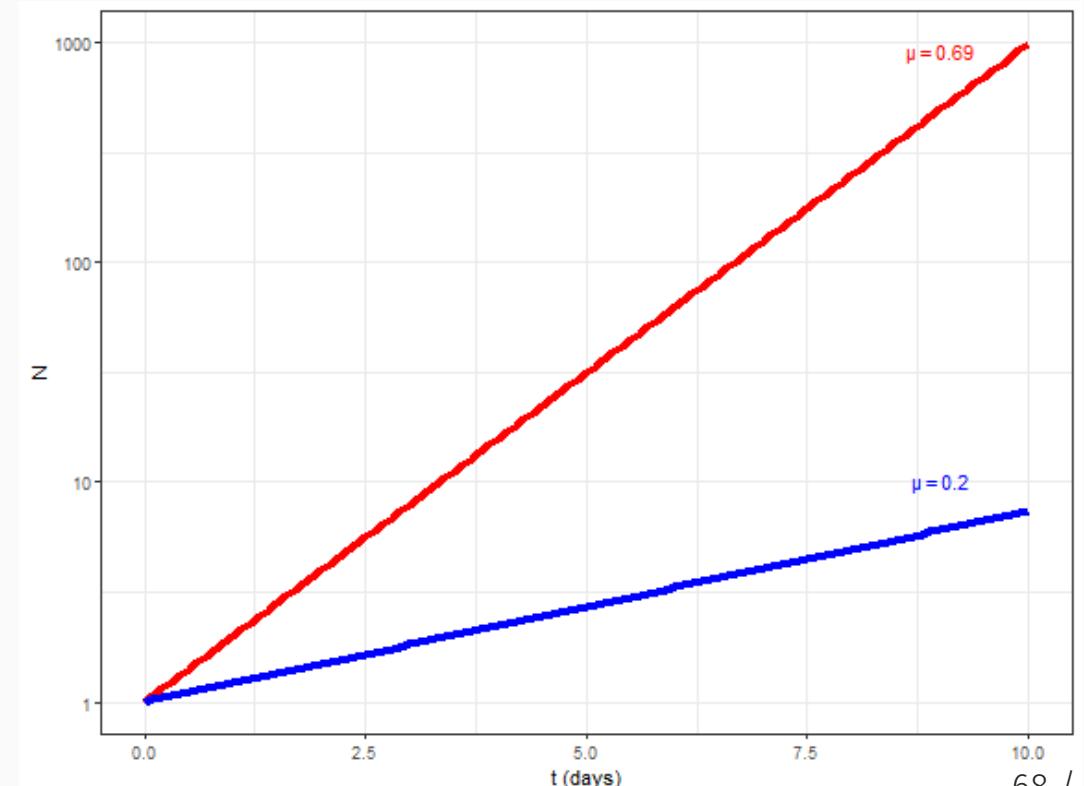
Growth rate vs Loss rate

$$\frac{dN}{dt} = \mu_{net} * N$$

$$N = N_0 \exp^{\mu_{net}*t}$$

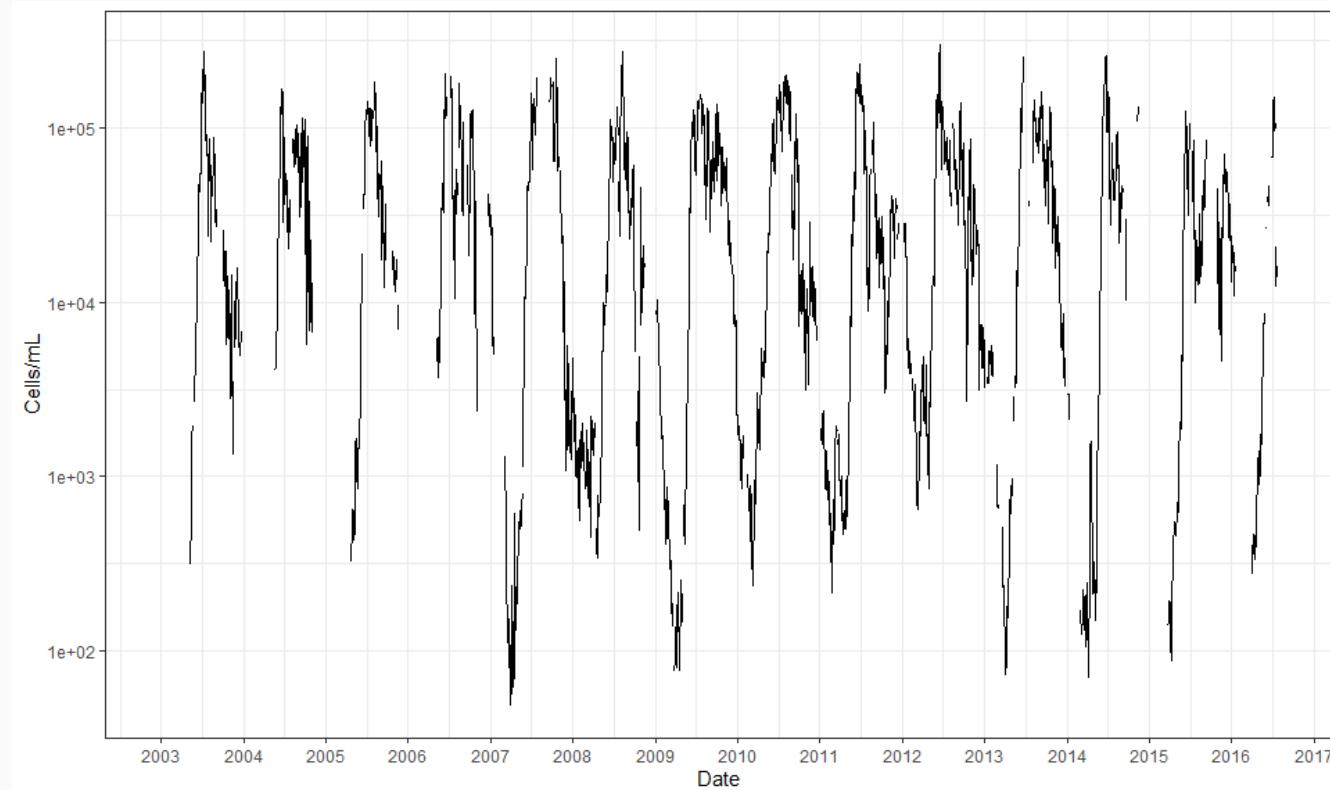
$$\mu_{net} = \mu_{growth} - \mu_{loss}$$

- Growth rate = division
- Loss rate = cell death, predation, viruses



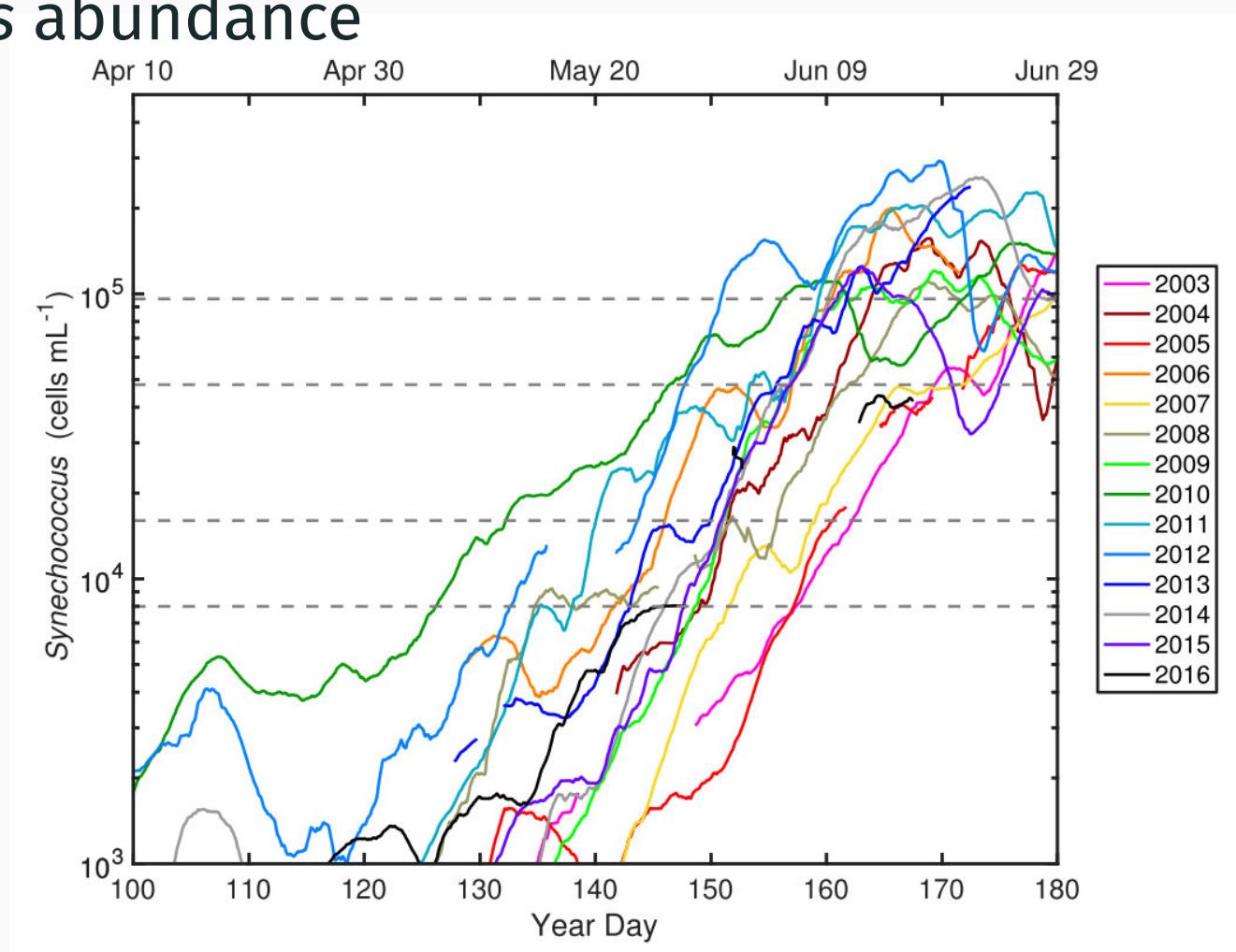
What drives the *Synechococcus* bloom ?

Synechococcus abundance



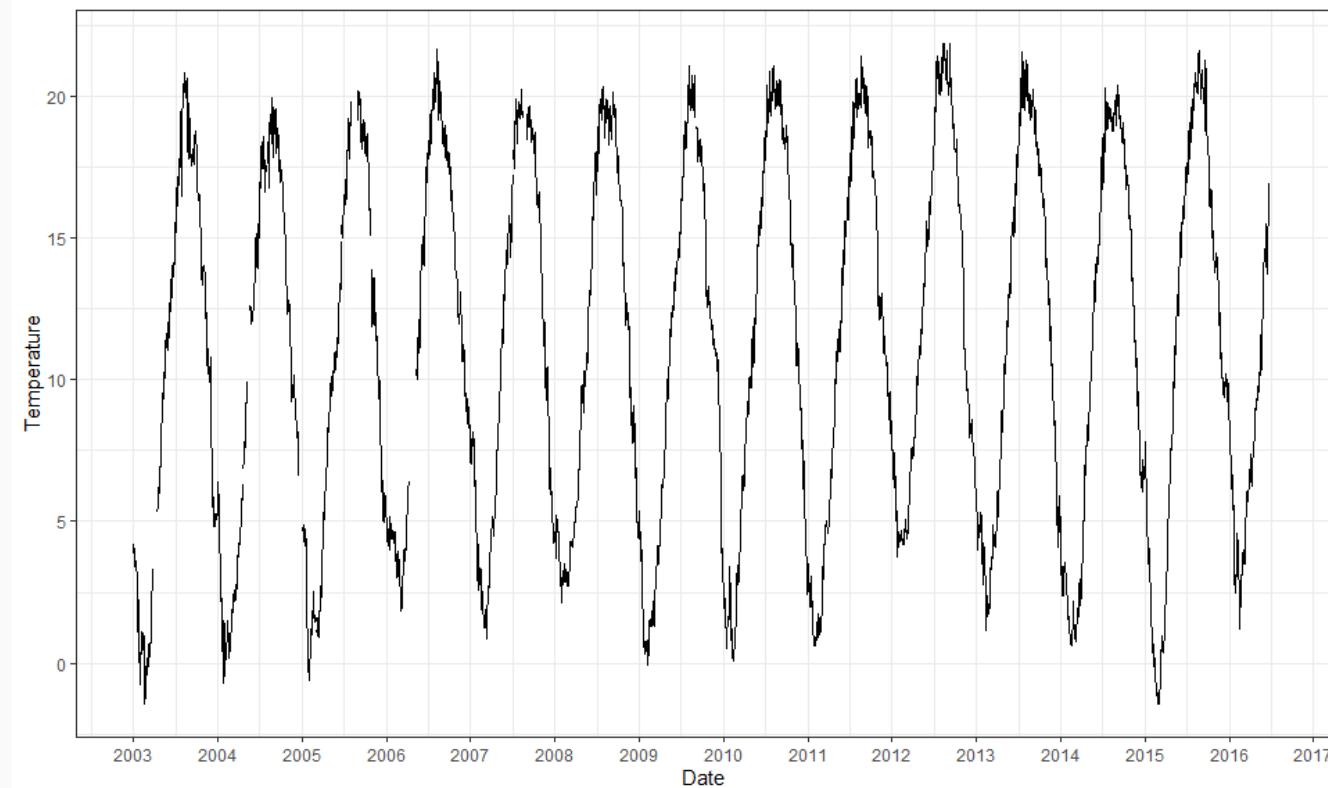
What drives the *Synechococcus* bloom ?

Synechococcus abundance



What drives the *Synechoccus* bloom ?

Temperature



What drives the *Synechoccus* bloom ?

Temperature anomaly

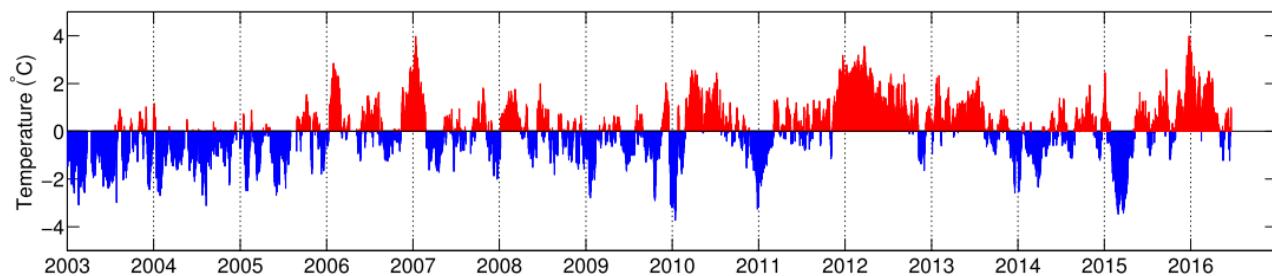


Figure S3. Daily temperature anomalies ($^{\circ}\text{C}$) from daily climatological average for 2003 to available 2016. Red values indicate positive anomalies, while blue indicates negative anomalies.

What drives the *Synechococcus* bloom ?

Synechococcus vs. Temperature

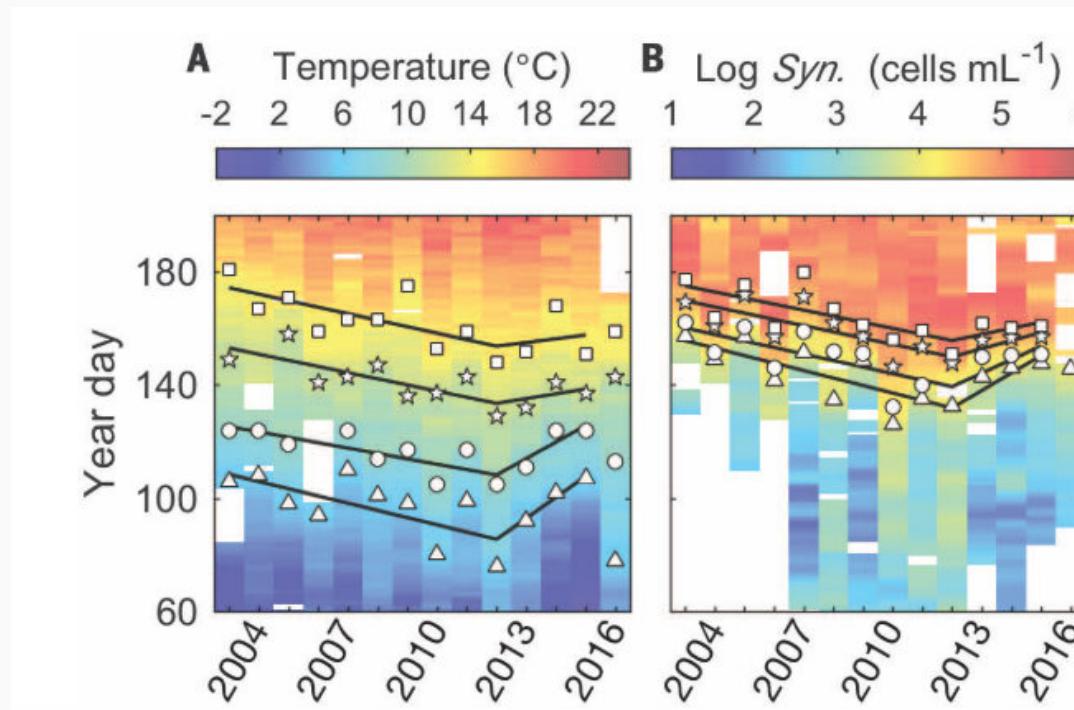
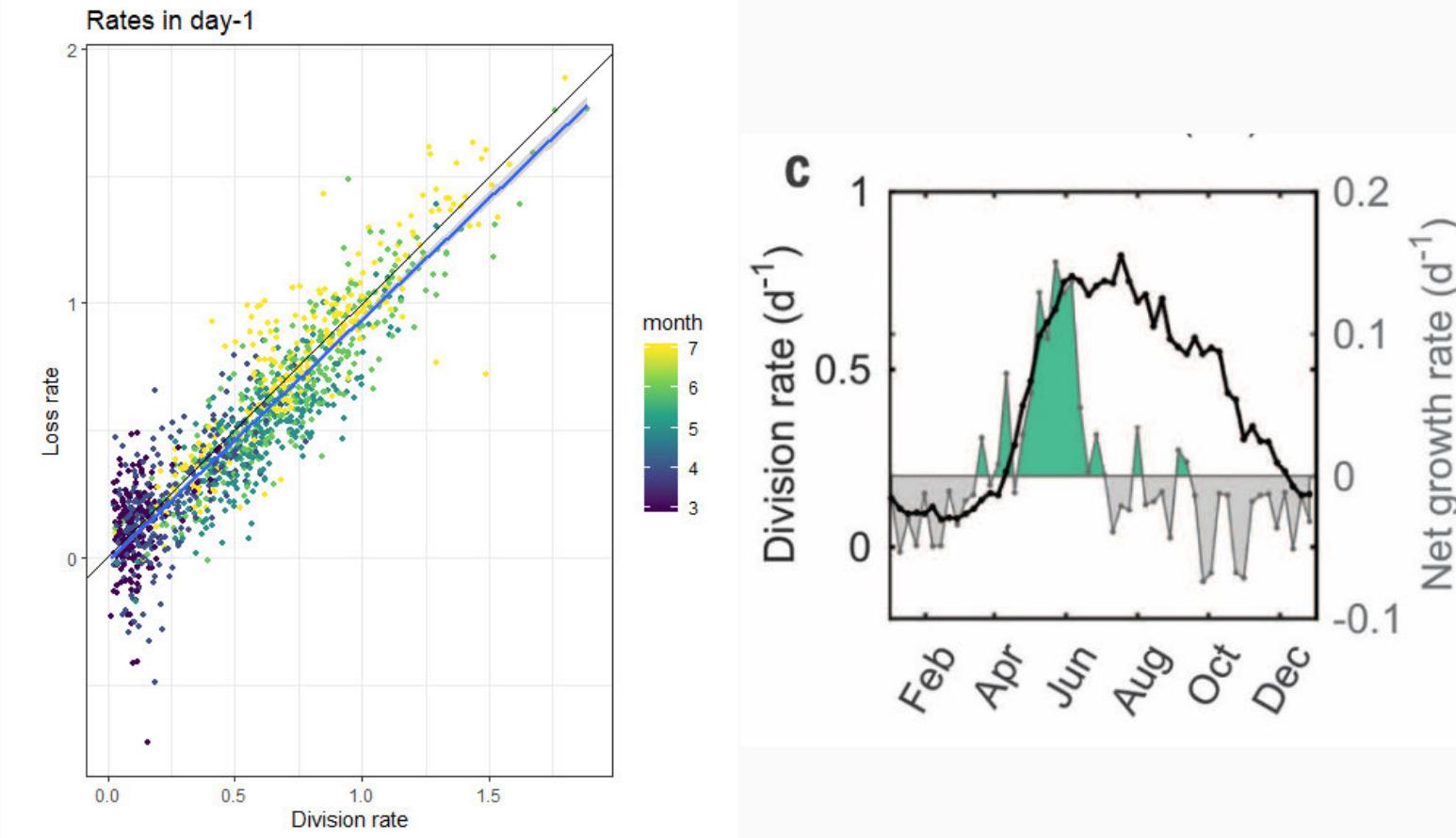


Fig. 2. Multiyear trends showing spring temperature changes and *Synechococcus* bloom shifts from 2003 to 2016. The data are shown by day of the year (vertical axis), with values denoted by color. (A) Temperature. Markers indicate the day in each year when water temperature first exceeds 6 $^{\circ}\text{C}$ (triangles), 9 $^{\circ}\text{C}$ (circles), 12 $^{\circ}\text{C}$ (stars), or 15 $^{\circ}\text{C}$ (squares). (B) *Synechococcus* cell concentration. Markers indicate the day in each year when cell concentration exceeds 8×10^3 (triangles), 1.6×10^4 (circles), 4.8×10^4 (stars), or 9.6×10^4 (squares) cells mL^{-1} . (C) Integrated division rate (cumulative summed division

What drives the *Synechoccus* bloom ?

Loss vs. Division rate



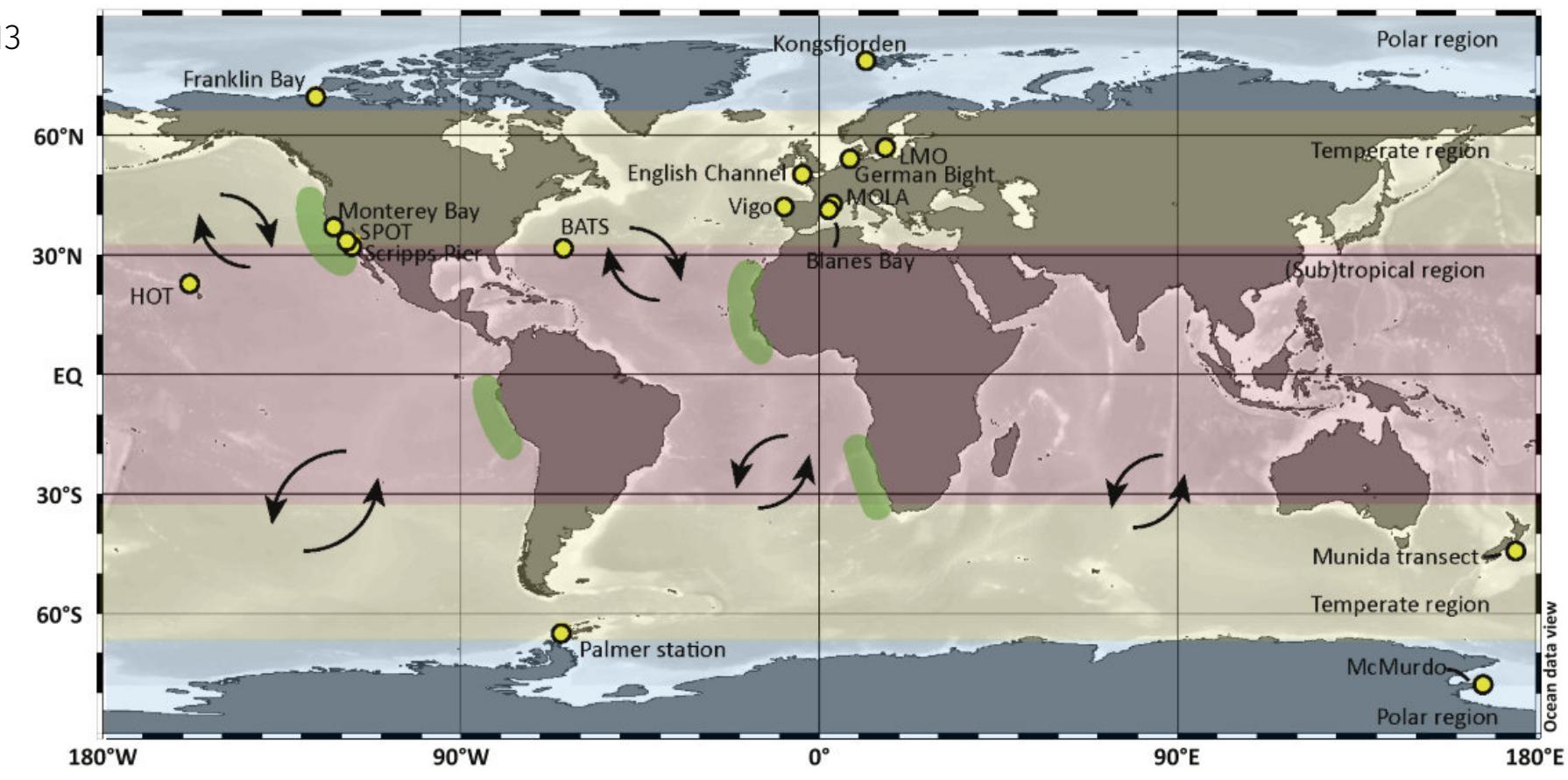
Which groups/species exhibit periodic recurrence ?



Which groups/species exhibit periodic recurrence ?

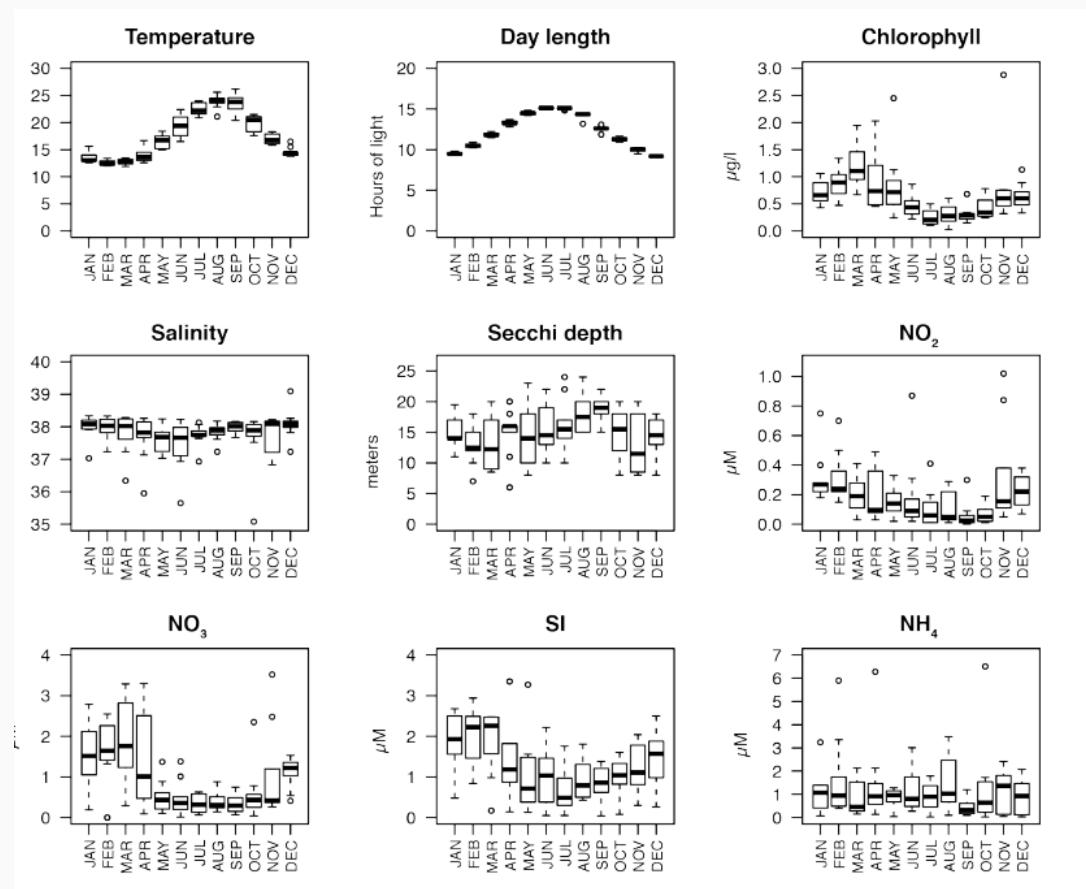
Study in the Mediterranean Sea

- 2014-2013



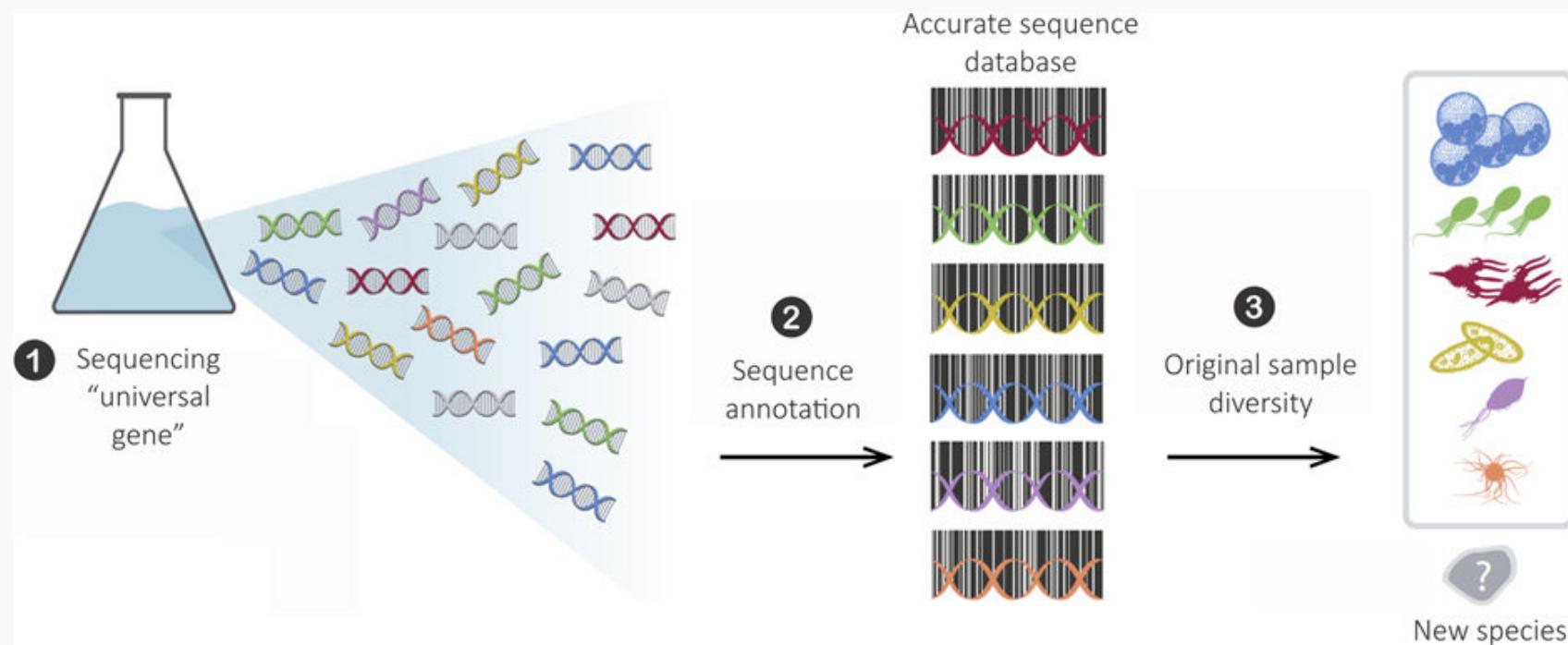
Which groups/species exhibit periodic recurrence ?

Yearly cycles



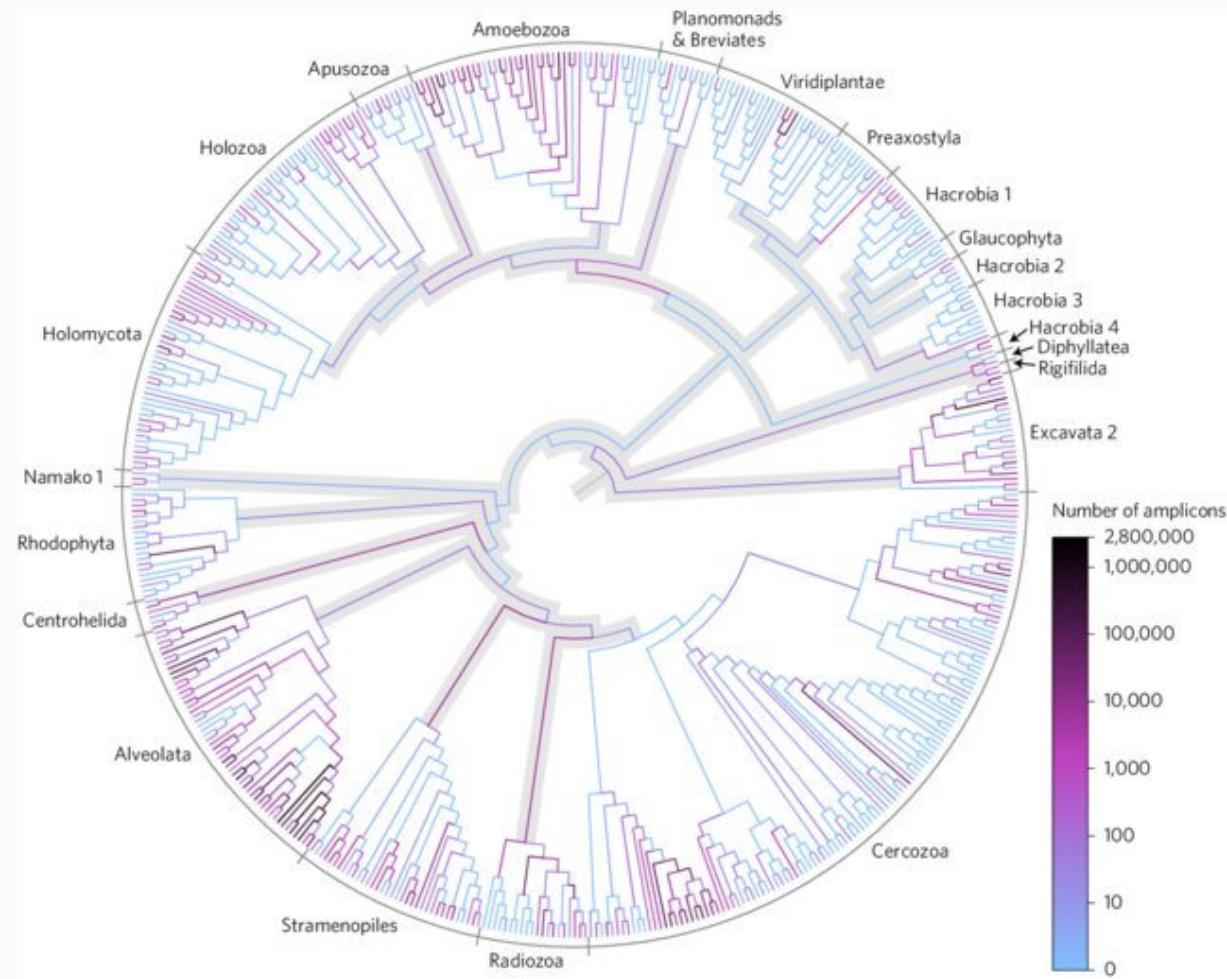
Which groups/species exhibit periodic recurrence ?

Metabarcoding



Which groups/species exhibit periodic recurrence ?

Metabarcoding



Which groups/species exhibit periodic recurrence ?

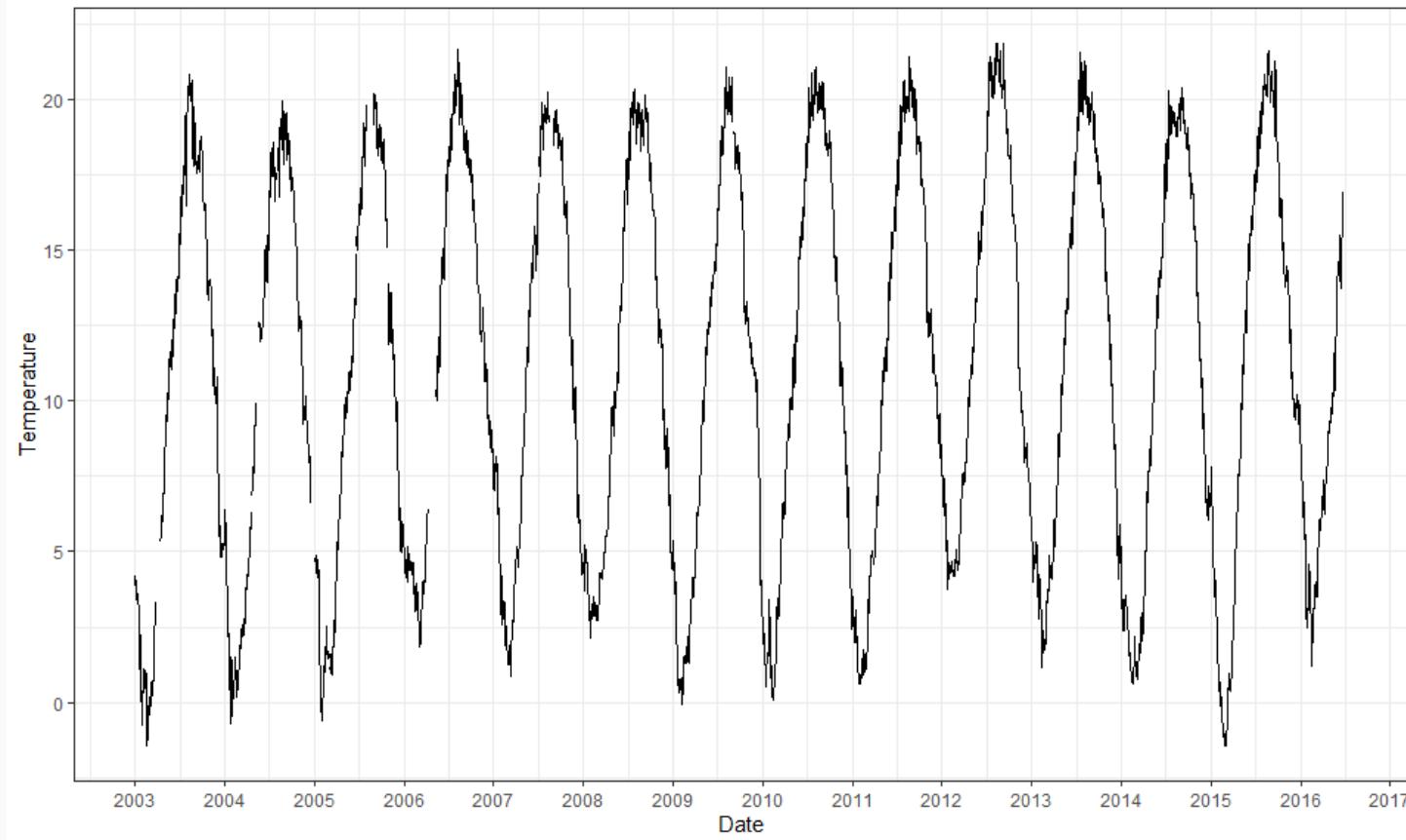
Metabarcoding

	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S	T	U		
	Taxonomic units (OTUs, ASVs)														Samples								
1	otu_id	kingdom	superfamily	division	class	genus	species	EC04XS4	EC08XS1	EC07XS1	EC08XS2	EC11XS1	EC11XS2	EC11XS3	EC14XS3	EC14XS4	EC17XS5	EC17XS6	EC19XS6	EC20X19SSXS10	EC21X16SSXS11		
12	otu_0011	Eukaryota	Alveolata	Dinoflagellata	Dinophyceae	Gyrodinium	Gyrodinium_fusiforme	0	0	0	0	0	256	239	0	0	0	0	0	0	474	0	11
44	otu_0043	Eukaryota	Alveolata	Dinoflagellata	Dinophyceae	Gonyaulax	Gonyaulax_spinifera	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
48	otu_0047	Eukaryota	Opisthokonta	Metazoa	Arthropoda	Temora	Temora_turbinata	0	0	0	0	0	414	0	0	0	0	0	0	0	102	88	0
52	otu_0051	Eukaryota	Opisthokonta	Metazoa	Arthropoda	Bestiolina	Bestiolina_similis	0	0	697	0	0	0	478	1452	0	0	0	0	0	1748	0	5
61	otu_0060	Eukaryota	Stramenopiles	Ochrophyta	Bacillariophyta	Chaetoceros	Chaetoceros_sp_P_quinq	26	0	0	0	44	40	0	26	0	0	0	116	37	0	!	
66	otu_0065	Eukaryota	Opisthokonta	Metazoa	Arthropoda	Paracalanus	Paracalanus_aculeatus	0	0	0	0	1831	973	455	186	1644	0	0	0	0	0	0	16
72	otu_0071	Eukaryota	Stramenopiles	Ochrophyta	Bacillariophyta	Thalassiosira	Thalassiosira_sp.	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	
78	otu_0077	Eukaryota	Opisthokonta	Metazoa	Urochordata	Oikopleura	Oikopleura_dioica	324	238	575	1421	0	0	241	2208	97	246	0	590	0	32		
79	otu_0078	Eukaryota	Opisthokonta	Metazoa	Cnidaria	Caligorgia	Caligorgia_benigni	52	0	0	0	0	0	0	0	0	0	0	0	0	0	0	
80	otu_0079	Eukaryota	Archaeplastida	Chlorophyta	Mamiellophyceae	Micromonas	Micromonas_commoda_AE	483	0	0	183	135	96	453	158	719	1006	388	0	1446	0	41	
84	otu_0083	Eukaryota	Opisthokonta	Metazoa	Arthropoda	Acrocalanus	Acrocalanus_gracilis	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	
88	otu_0087	Eukaryota	Opisthokonta	Metazoa	Mollusca	Bathymodiolinae	Bathymodiolinae_gen.	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	
95	otu_0094	Eukaryota	Opisthokonta	Metazoa	Arthropoda	Parvocalanus	Parvocalanus_crassiostriatus	0	0	0	0	0	0	0	0	161	0	0	0	0	0	0	
108	otu_0108	Eukaryota	Opisthokonta	Metazoa	Urochordata	Oikopleura	Oikopleura_dioica	315	0	400	540	108	0	0	0	0	784	64	339	0	32		
115	otu_0115	Eukaryota	Alveolata	Dinoflagellata	Dinophyceae	Dinophyceae_XXX	Dinophyceae_XXX_sp.	151	0	0	0	0	0	1056	488	0	269	0	315	0	2079	4	
119	otu_0119	Eukaryota	Opisthokonta	Metazoa	Arthropoda	Paracalanus	Paracalanus_sp.	81	0	1925	855	0	0	371	0	113	179	0	0	0	0	11	
127	otu_0127	Eukaryota	Archaeplastida	Chlorophyta	Mamiellophyceae	Micromonas	Micromonas_clade_B_war	246	0	0	0	0	0	109	251	178	153	226	152	233	0	0	
136	otu_0136	Eukaryota	Haploia	Cryptophyta	Cryptophyceae	Geminigera	Geminigera_cryophilus	347	299	0	289	135	52	247	146	194	430	201	109	341	0	21	
141	otu_0141	Eukaryota	Archaeplastida	Chlorophyta	Trebouxiophyceae	Nannochloris	Nannochloris_sp.	0	0	0	0	0	44	0	0	0	0	0	0	0	0	0	
146	otu_0148	Eukaryota	Opisthokonta	Metazoa	Arthropoda	Bestiolina	Bestiolina_sp.	0	0	706	83	558	0	0	0	0	0	0	0	0	0	51	
148	otu_0150	Eukaryota	Archaeplastida	Chlorophyta	Trebouxiophyceae	Nannochloris	Nannochloris_sp.	0	0	0	0	0	0	0	0	0	0	0	0	0	0		
151	otu_0153	Eukaryota	Opisthokonta	Metazoa	Arthropoda	Oithona	Oithona_daviseae	0	0	0	0	0	0	0	0	0	0	0	0	0	0		
171	otu_0173	Eukaryota	Archaeplastida	Chlorophyta	Mamiellophyceae	Ostreococcus	Ostreococcus_sp.	0	0	0	0	0	0	0	0	0	0	0	0	0	0		
173	otu_0175	Eukaryota	Alveolata	Dinoflagellata	Dinophyceae	Dinophyceae_XXX	Dinophyceae_XXX_sp.	0	54	551	0	0	0	0	0	0	0	0	0	0	0	14	
175	otu_0177	Eukaryota	Stramenopiles	Ochrophyta	Bacillariophyta	Ceratula	Ceratula_pelagica	0	0	0	0	0	0	0	0	0	0	0	0	0	0		
177	otu_0179	Eukaryota	Stramenopiles	Ochrophyta	Bacillariophyta	Cyclotella	Cyclotella_chocawhatchee	0	0	0	0	0	47	67	0	0	0	0	0	0	0		
190	otu_0192	Eukaryota	Alveolata	Dinoflagellata	Dinophyceae	Gyrodinium	Gyrodinium_gutratum	0	131	176	0	0	0	0	0	0	0	0	118	0	0	8	
191	otu_0193	Eukaryota	Rhizaria	Radiolaria	RAD-B	RAD-B-Group-IV_X	RAD-B-Group-IV_X_sp.	0	20	0	51	0	0	0	0	656	68	0	0	0	0	0	
193	otu_0195	Eukaryota	Opisthokonta	Metazoa	Arthropoda	Acrocalanus	Acrocalanus_gracilis	0	0	0	0	0	0	0	0	0	0	1252	0	0	0		
194	otu_0196	Eukaryota	Opisthokonta	Metazoa	Porifera	Unclassified_Halichondrida	Halichondrida_sp.	0	0	0	0	0	0	0	0	0	0	0	0	0	0		
198	otu_0200	Eukaryota	Opisthokonta	Metazoa	Arthropoda	Oithona	Oithona_similis	0	0	0	0	0	0	0	0	0	0	0	0	0	0		
199	otu_0201	Eukaryota	Alveolata	Dinoflagellata	Dinophyceae	Woloszynska	Woloszynska_halophila	0	0	0	0	0	0	0	0	0	0	0	0	0	0		
205	otu_0207	Eukaryota	Archaeplastida	Chlorophyta	Mamiellophyceae	Ostreococcus	Ostreococcus_sp.	0	0	0	0	0	0	0	0	0	0	0	0	0	0		
208	otu_0210	Eukaryota	Rhizaria	Cercozoa	Filosa-imbricate	Novel-clade-2_X	Novel-clade-2_X_sp.	329	40	0	0	0	58	0	18	0	123	123	0	0	2		
209	otu_0211	Eukaryota	Opisthokonta	Metazoa	Cnidaria	Forskalia	Forskalia_edwardsii	0	0	0	0	0	0	0	0	209	0	0	0	0	0		
217	otu_0219	Eukaryota	Rhizaria	Cercozoa	Filosa-Thecofilo	TAGIR1-lineage_X	TAGIR1-lineage_X_sp.	0	0	0	0	0	0	0	0	0	0	0	0	0	0		
219	otu_0221	Eukaryota	Stramenopiles	Ochrophyta	Bacillariophyta	Thalassiosira	Thalassiosira_hispida	0	0	0	0	0	0	0	0	0	0	0	0	0	0		
224	otu_0226	Eukaryota	Stramenopiles	Ochrophyta	Bacillariophyta	Cyclotella	Cyclotella_chocawhatchee	0	0	0	0	0	0	0	0	0	0	0	0	0	0		
226	otu_0228	Eukaryota	Opisthokonta	Metazoa	Arthropoda	Oithona	Oithona_daviseae	0	0	0	0	0	0	0	0	0	0	0	0	0	0		
227	otu_0229	Eukaryota	Opisthokonta	Metazoa	Arthropoda	Artemia	Artemia_salina	0	0	0	0	0	0	0	0	0	0	0	0	0	0		
229	otu_0231	Eukaryota	Archaeplastida	Chlorophyta	Mamiellophyceae	Ostreococcus	Ostreococcus_clade_B	0	0	0	57	0	0	0	0	0	0	0	0	129	0	0	

Number of sequences

Which groups/species exhibit periodic recurrence ?

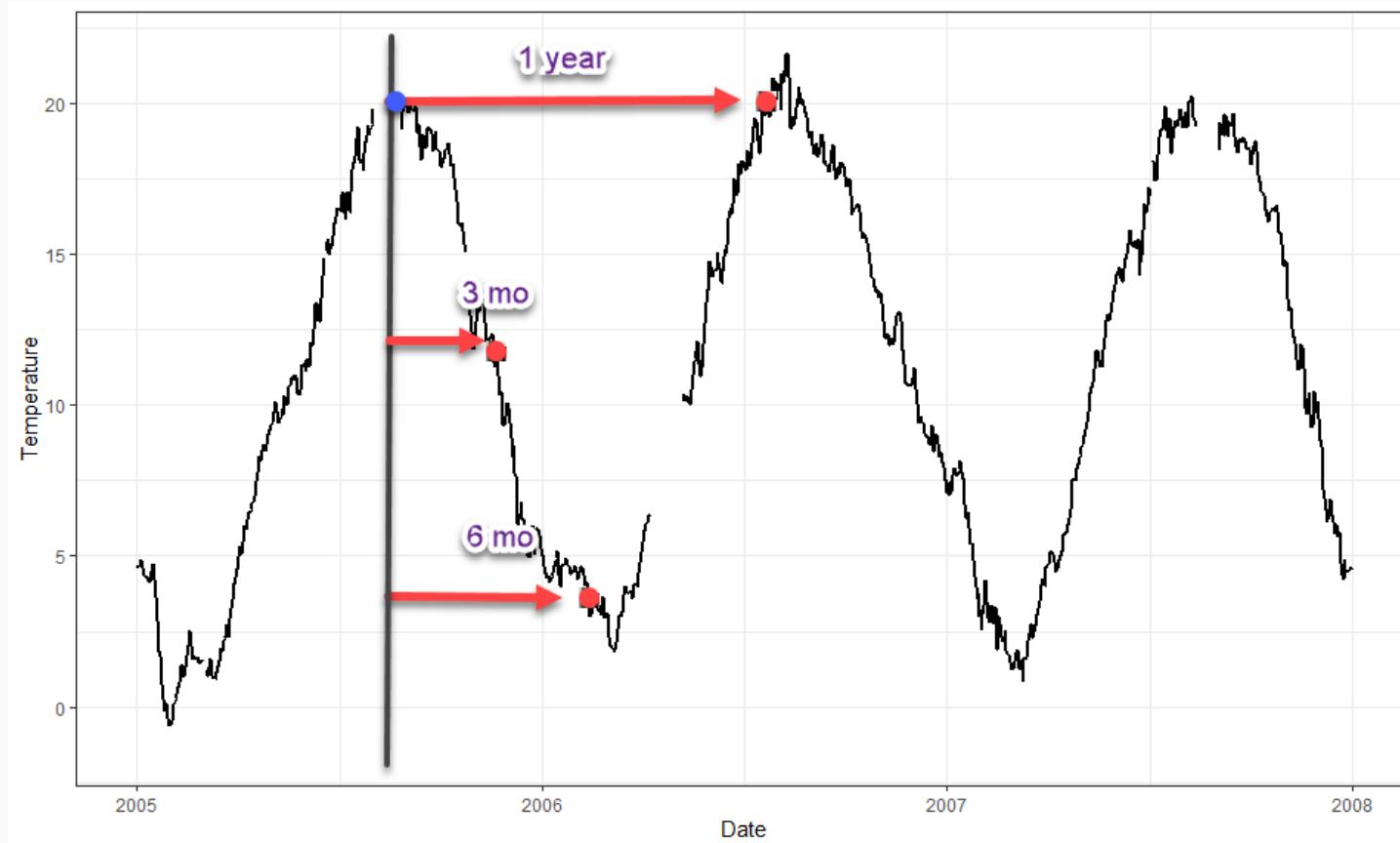
How to determine periodicity ?



Which groups/species exhibit periodic recurrence ?

How to determine periodicity ?

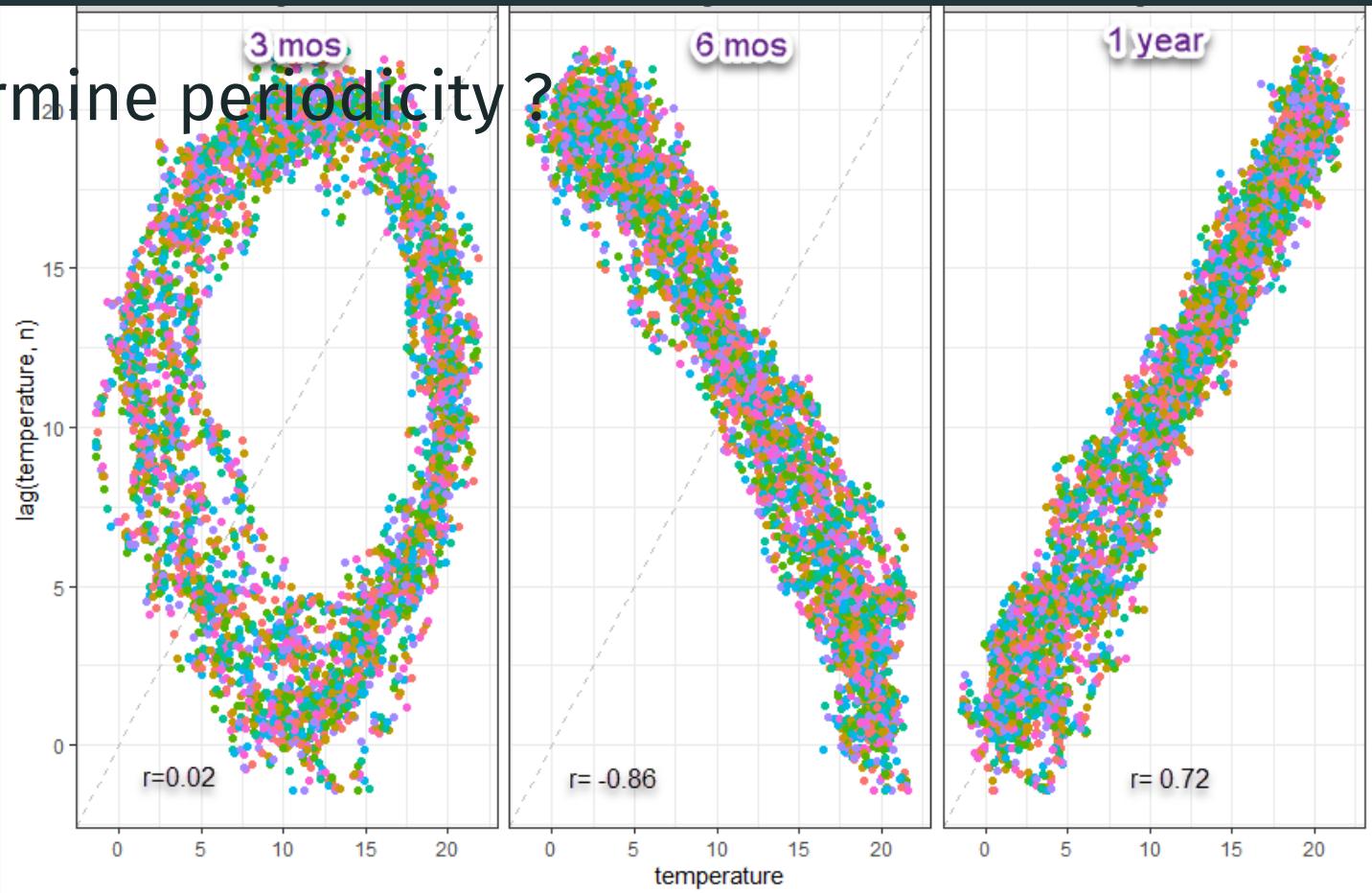
- Autocorrelation



Which groups/species exhibit periodic recurrence ?

How to determine periodicity ?

- Autocorrelation

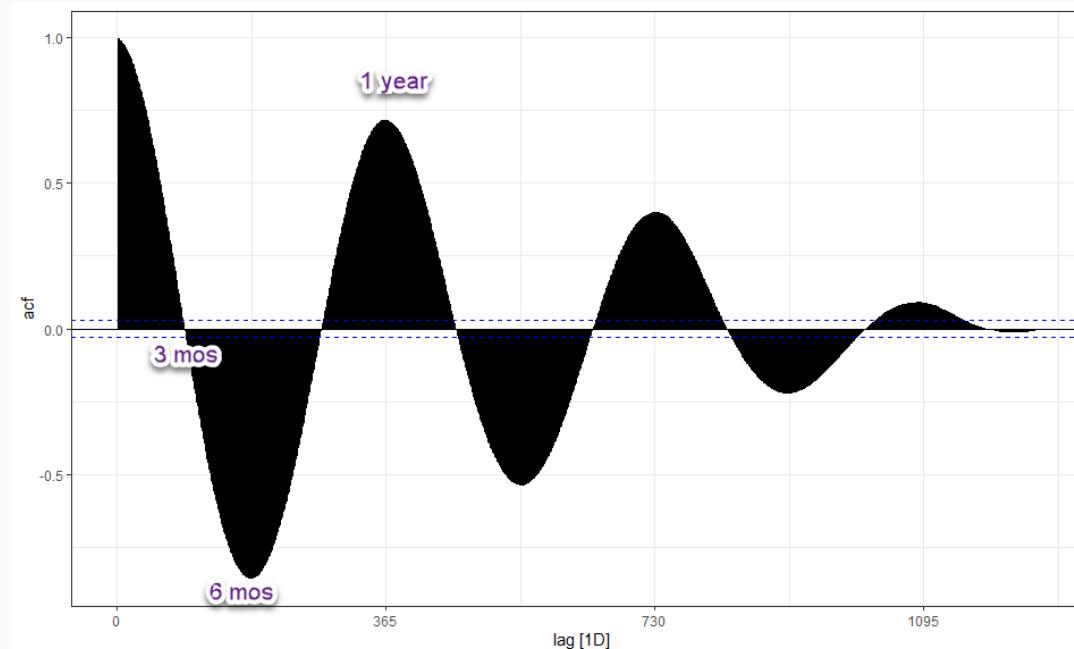


$$r_{xy} = \frac{\sum_{i=1}^n (x_i - \bar{x})(y_i - \bar{y})}{\sqrt{\sum_{i=1}^n (x_i - \bar{x})^2} \sqrt{\sum_{i=1}^n (y_i - \bar{y})^2}}$$

Which groups/species exhibit periodic recurrence ?

How to determine periodicity ?

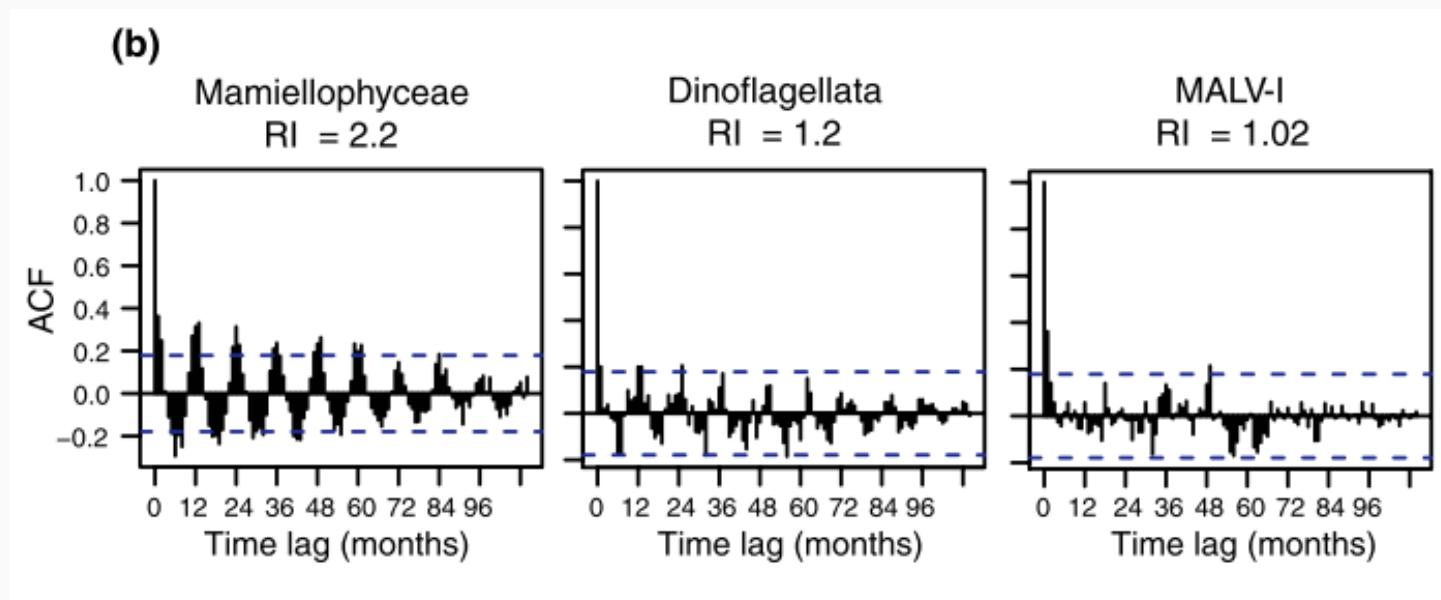
- Autocorrelation



Which groups/species exhibit periodic recurrence ?

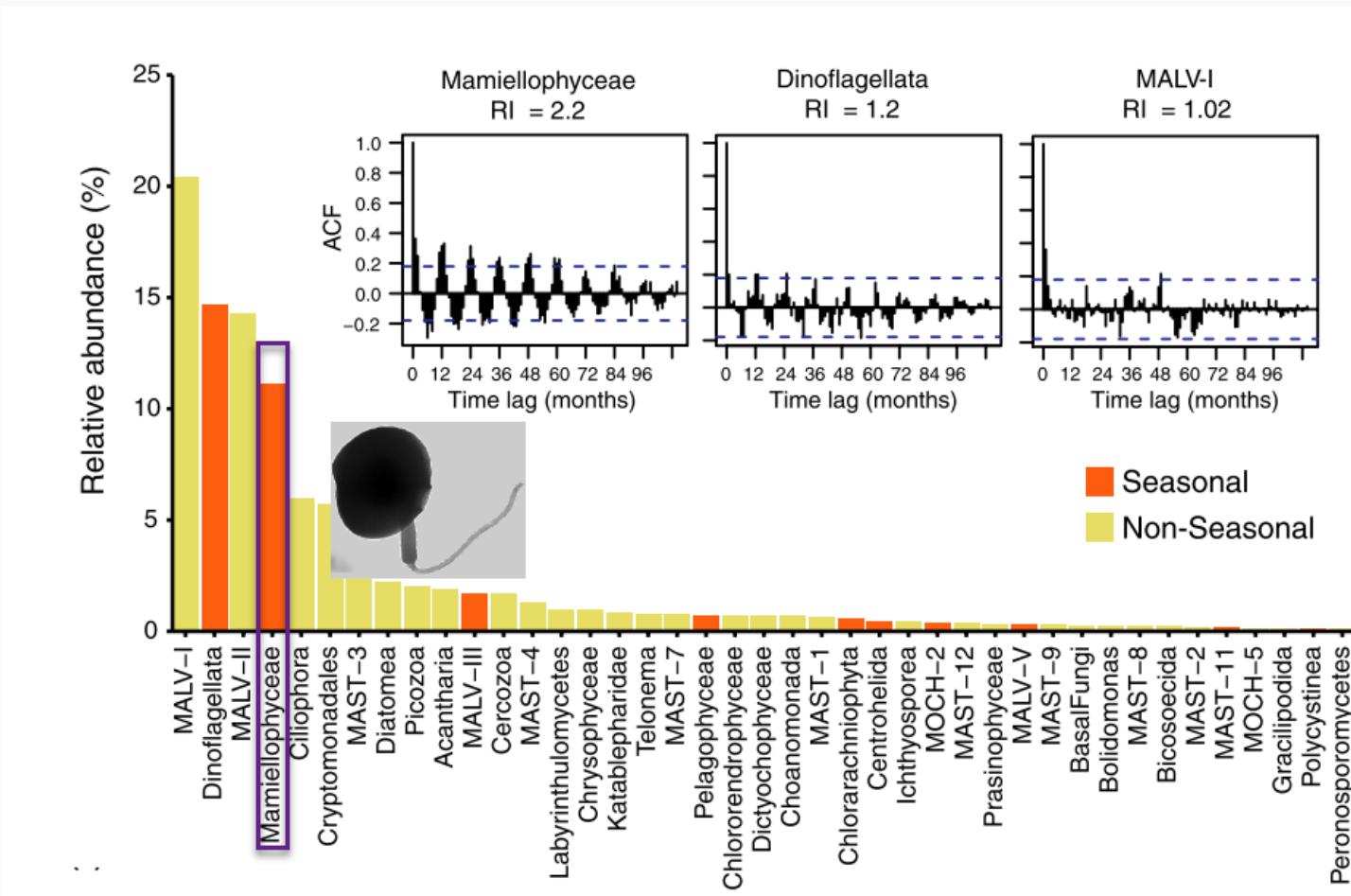
Group periodicity

- Autocorrelation function



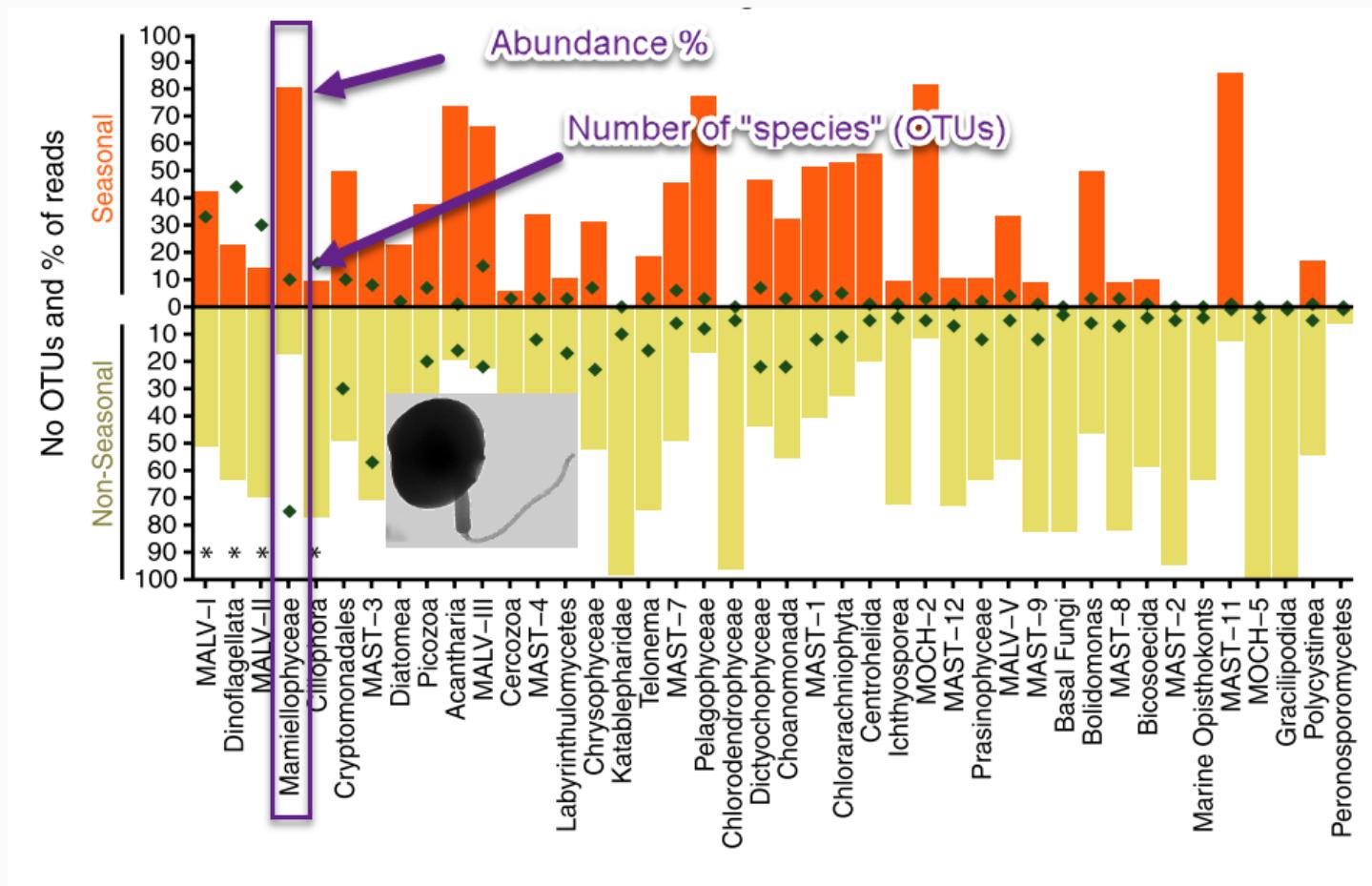
Which groups/species exhibit periodic recurrence ?

Group periodicity



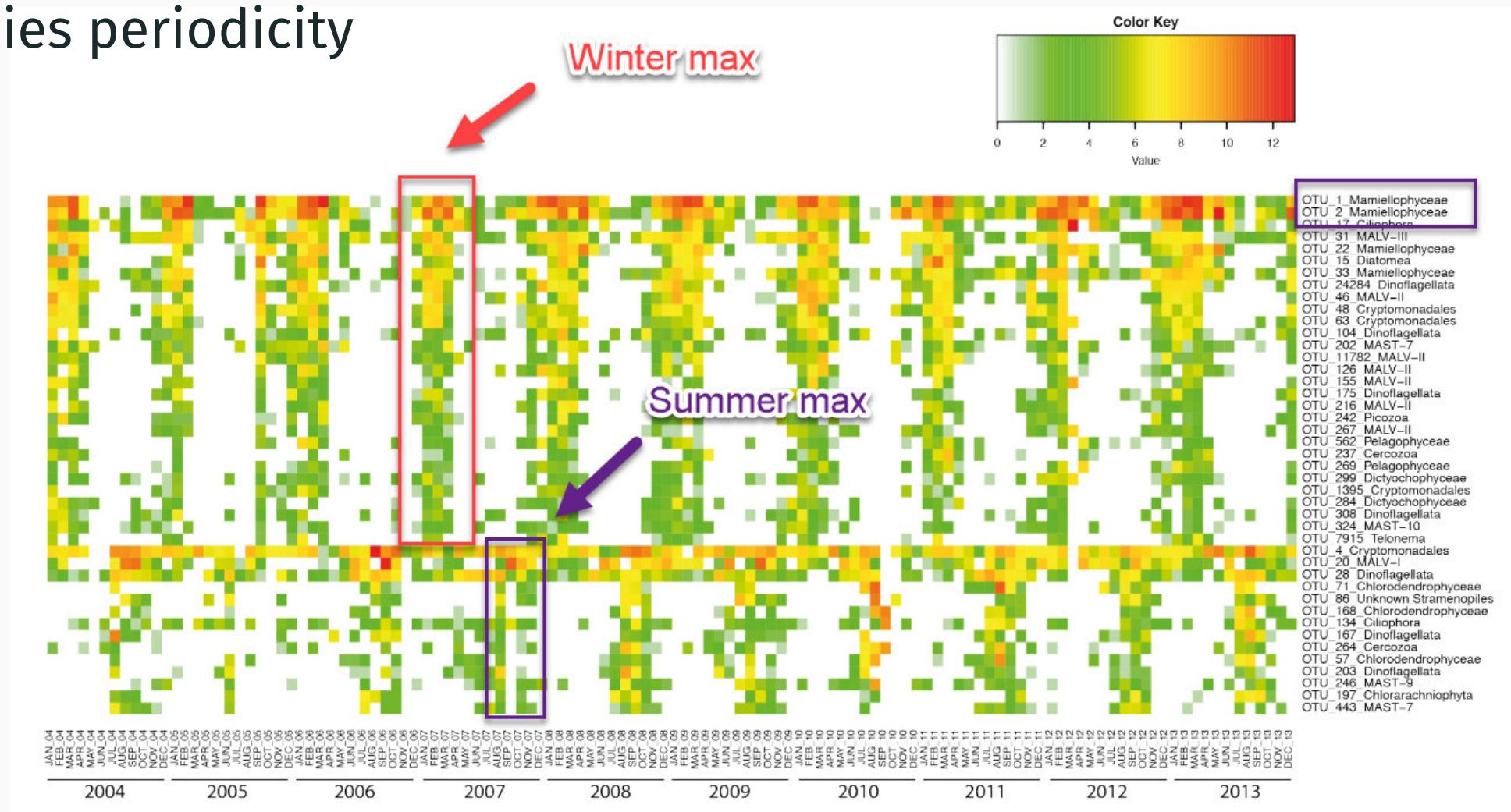
Which groups/species exhibit periodic recurrence ?

Species periodicity



Which groups/species exhibit periodic recurrence ?

Species periodicity



What did we talked about ?

- Spatial scales
- Time scales
- Sampling the Ocean
- Time series
 - Chlorophyll periodicity
 - Bloom dynamics
 - Which species are periodic ?