

# Modelling harmful algal growth under climate change

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# What are Models?

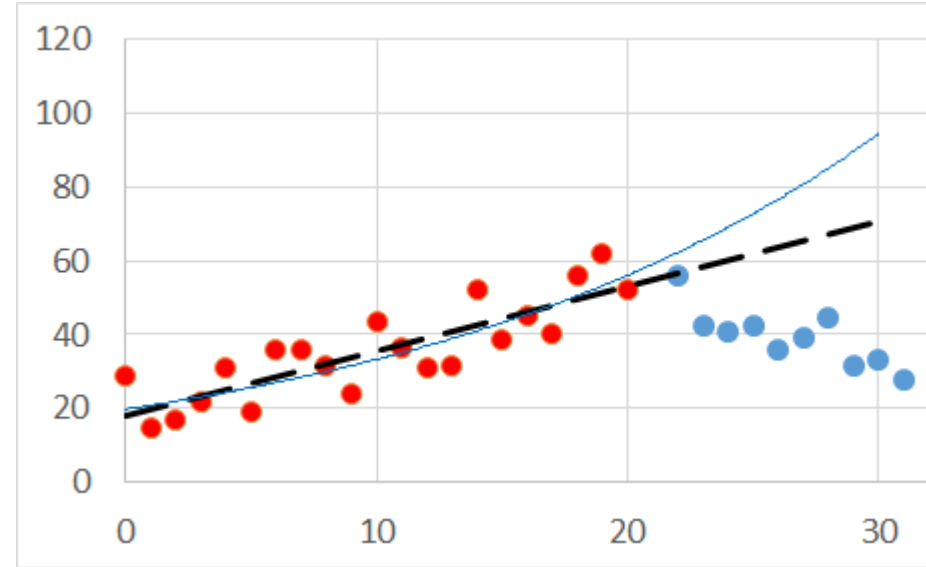
- Models are simplifications of reality
- Deciding on where & how to simplify is a critical step, depending in part on the type and role of the model,
- ... and depends in part upon our understanding of the system

# What are models for?

- Integrate knowledge (dynamic conceptual models)
- Used to explore theory through to prediction
- An inability to match model output to reality can tell us much ...
- but we need to establish whether failure reflects an ignorance of reality &/or a failure in transcribing knowledge into equations

# Into the future

- Simple models may be likened to regression statistics
- Typically they do not offer a sound base for prediction beyond the data series used for their construction
- Climate change takes us beyond our experience



**Prediction underpinned by understanding requires a careful balance between model simplicity and complexity**

# Prediction requires a sound understanding of the system

- What is “the system”?
- How well do we understand the system?
- **known knowns**; things we know we know.
- **known unknowns**; things we know we do not know.
- **unknown unknowns** – things we don't know we don't know
- **And one more ....**

# the unknown knows ...

- .... things that we intentionally refuse to acknowledge that we know
- This is a common issue in modelling, driven by the need to simplify

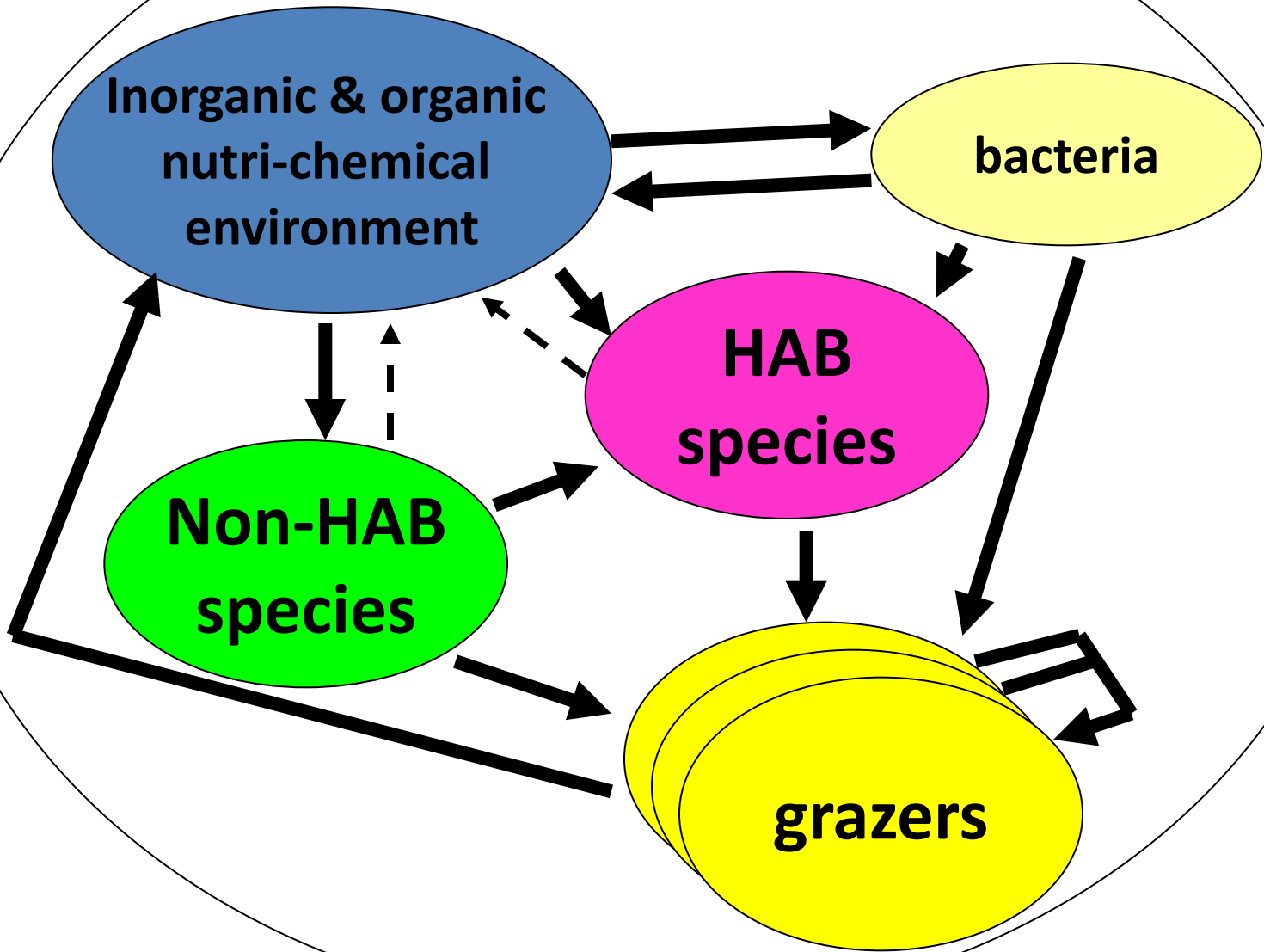
## These may include....

- Climate change, “weather” inc. cloudiness, rainfall, temperature; salinity; OA; etc.
- Aspects of ecology such as cysts, mixotrophy, allelopathy, role of DOM/mucus, aggregation, vertical migration, grazers (inc. selectivity) & trophic cascades, virus & parasites, etc.

# What is so special about HAB species?

- What is a weed?
- .. “a plant in the wrong place”
- So are HABs species just **(too much of)** an “unwanted” species in the wrong place?
- Studies of HABs from a holistic standpoint appear little different to studies of plankton in general terms
- **HABs models have more in common with end-2-end fisheries models than with biogeochemical models**

# Physical environment





# Two major challenges in modelling of HABs, and of plankton in general

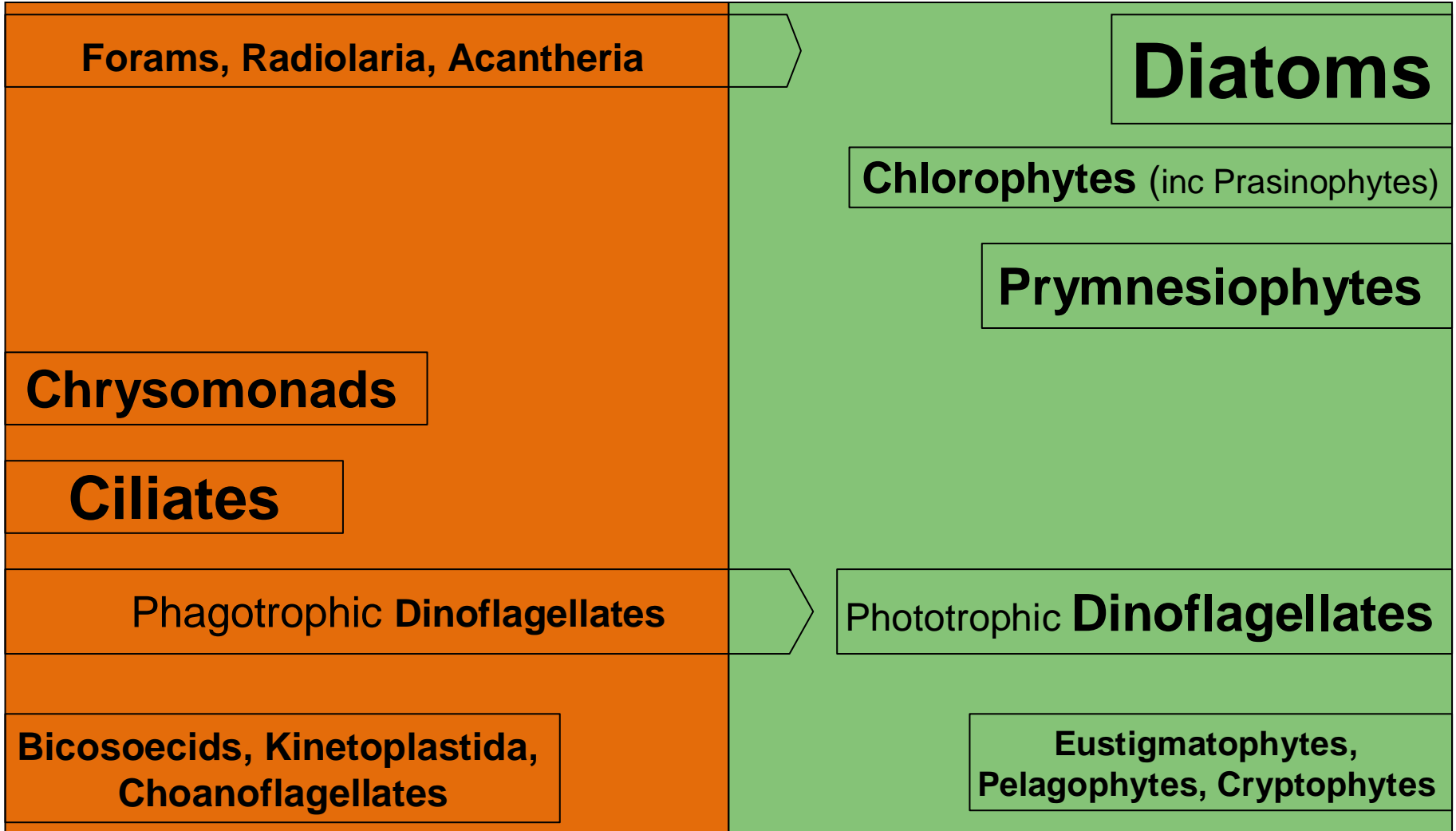
- Mixotrophy in protists (CF emphasis on classic phytoplankton, light and inorganic nutrients)
- Grazing activity (blooms can only occur in the absence of grazing, &/or presence of selective grazing, which may relate to the mixotrophic capacity of the HAB species)

# Harmful *Algal Blooms*

- The term “algal blooms” invokes notions of (only) photoautotrophy
- In reality, and other than cyanobacteria and diatoms, most HAB species are likely phago-mixotrophic
- ... not just phototrophic (CF. the emphasis in HAB models on phototrophy and the use of inorganic nutrients)

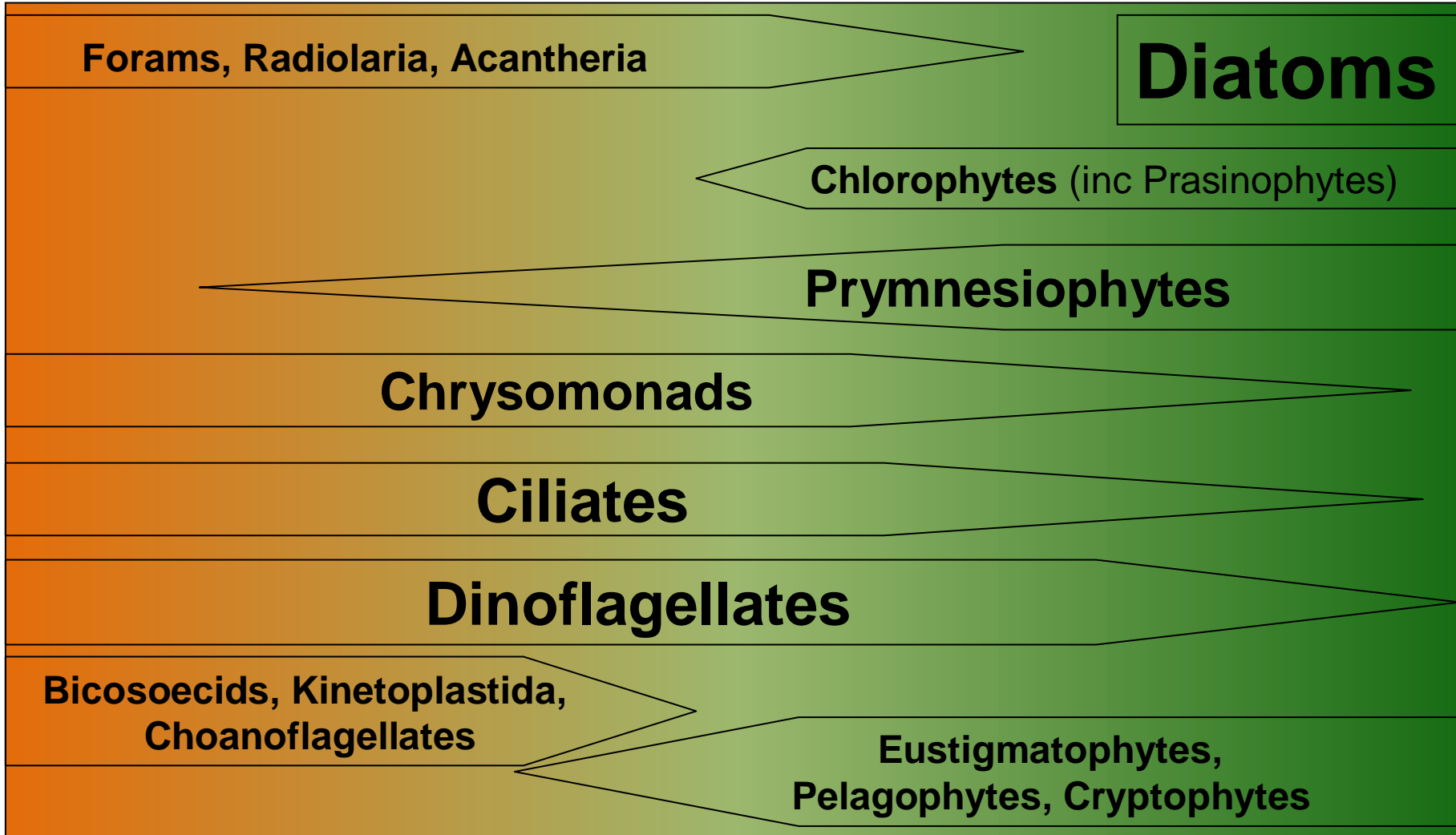
# Phagotroph (zooplankton)

# Phototroph (phytoplankton)



↓ **Strict non-phototroph**

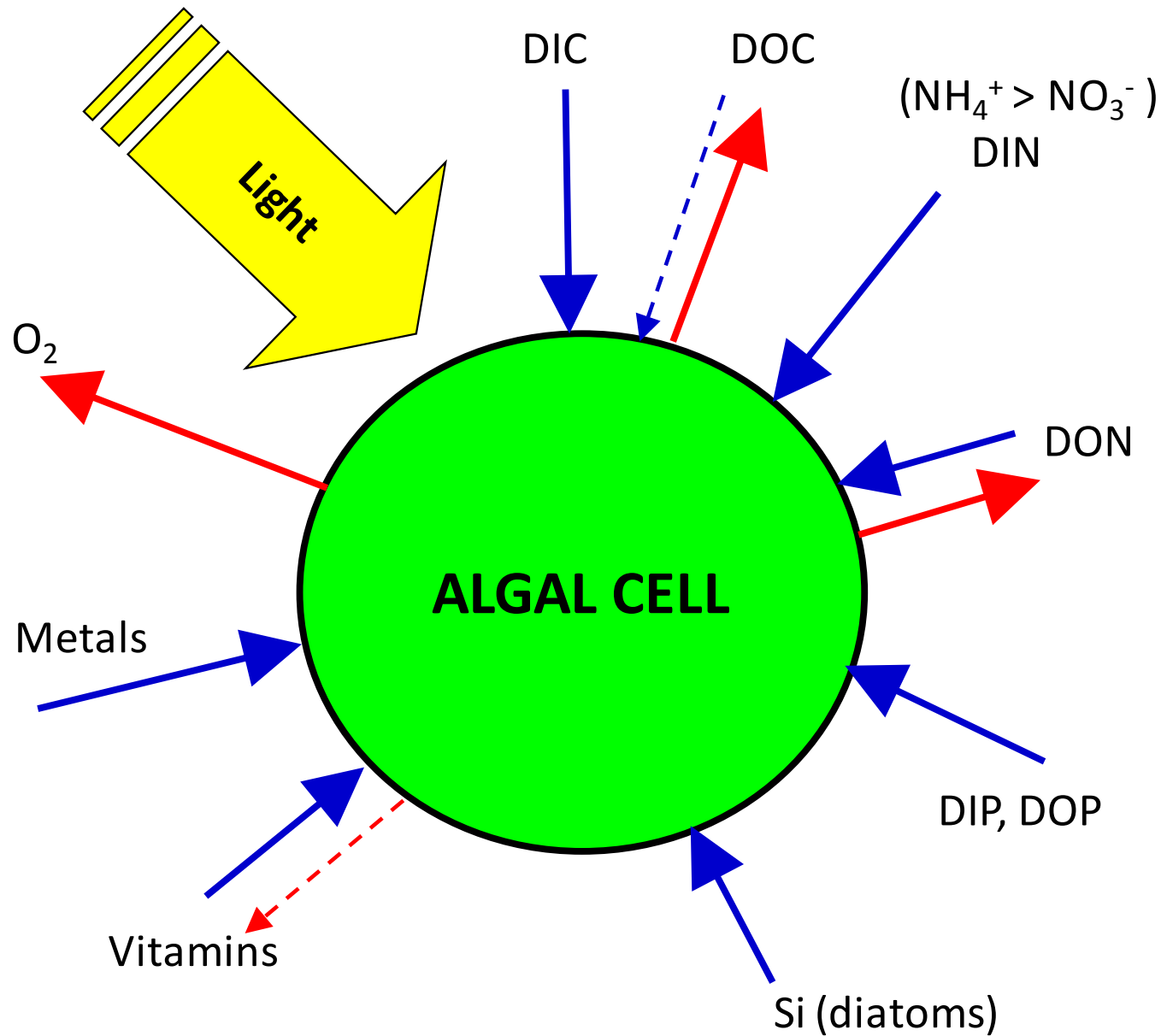
**Strict non-phagotroph** ↓



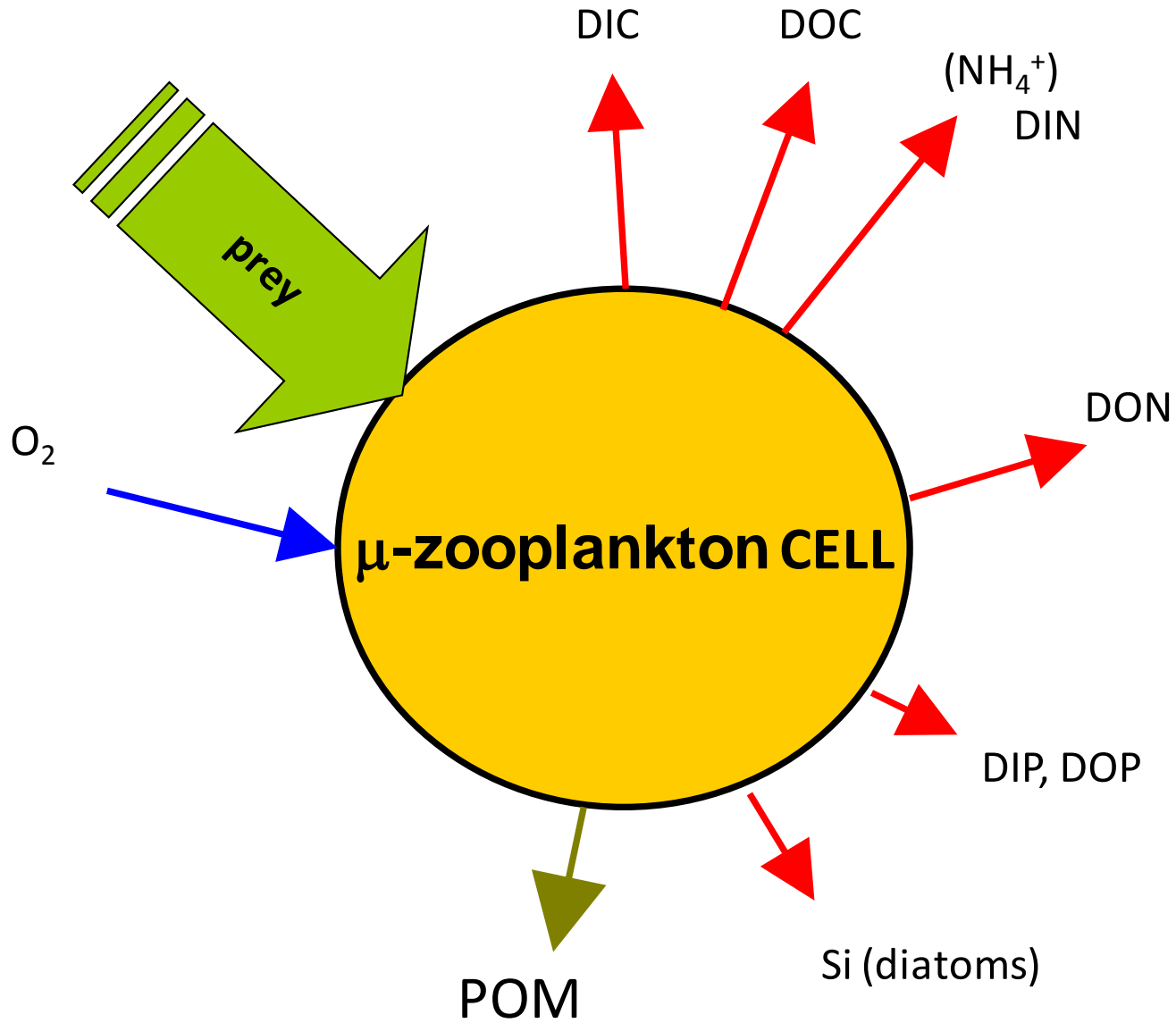
# Photo-phago Mixotrophy

- The biggest *known unknown*, or is it actually an *unknown known* (deliberately ignored)?
- Mixotrophy is common in protists, and esp. common in HAB species
- Modelling mixotrophy is particularly challenging, combining the processes of phototrophy and phagotrophy (grazing)

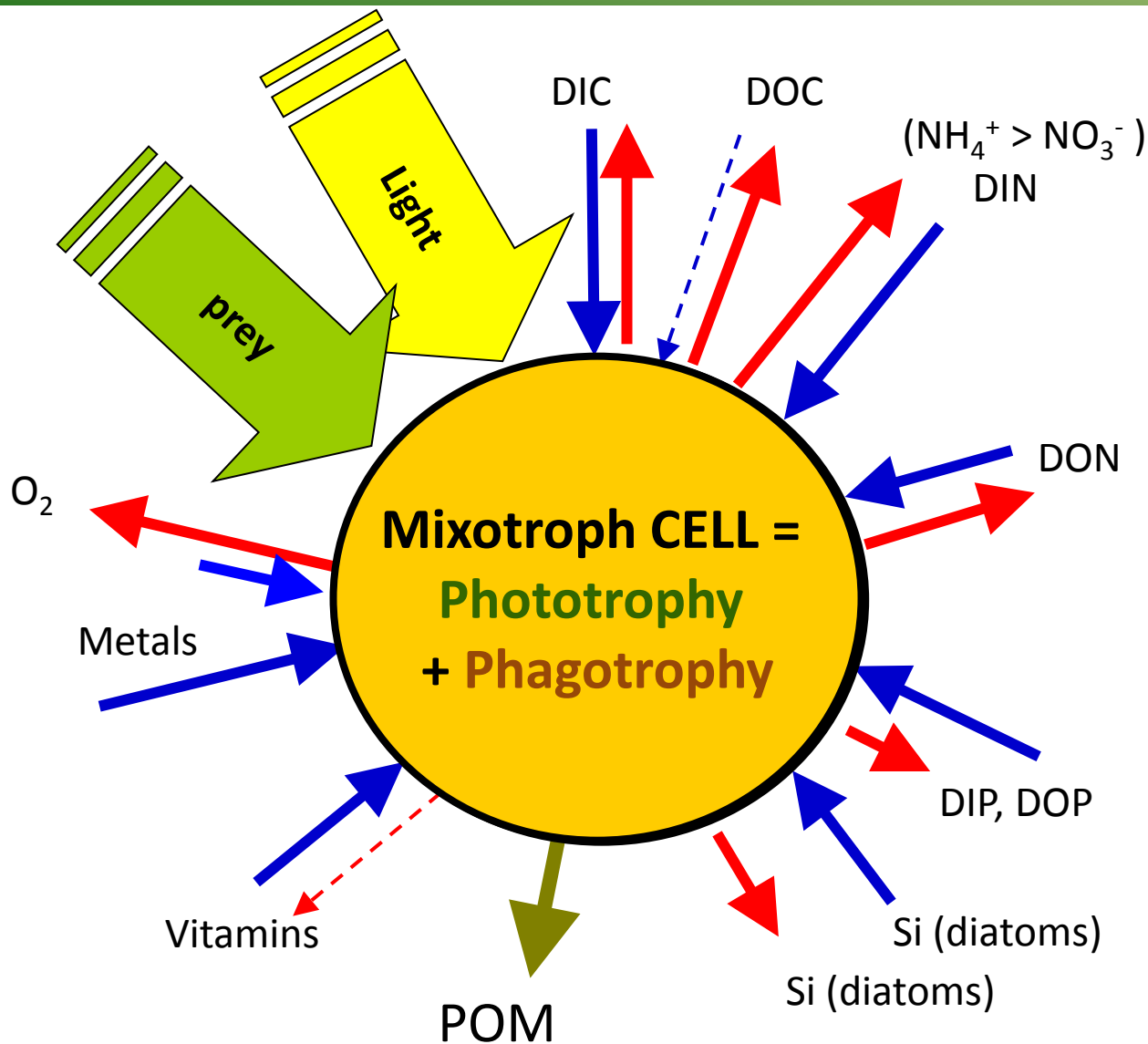
# Phototroph



# Phagotroph

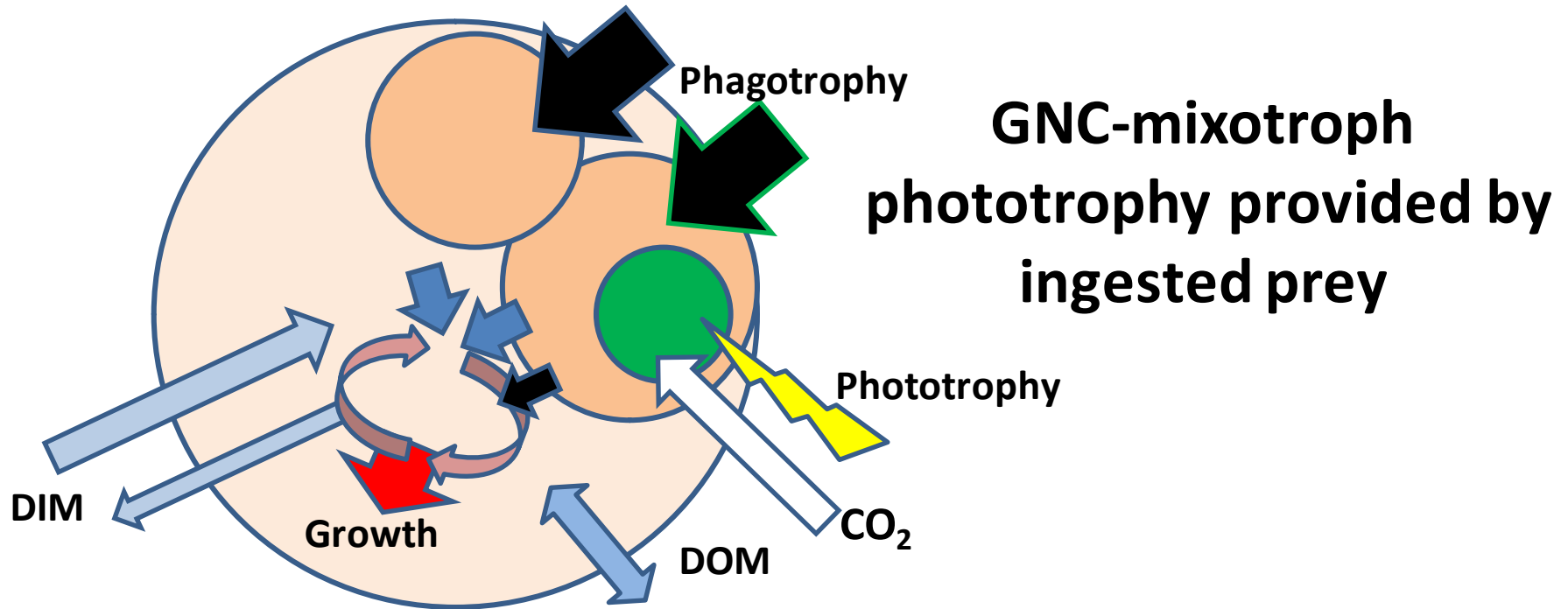


# Mixotrophy = Phototrophy + Phagotrophy



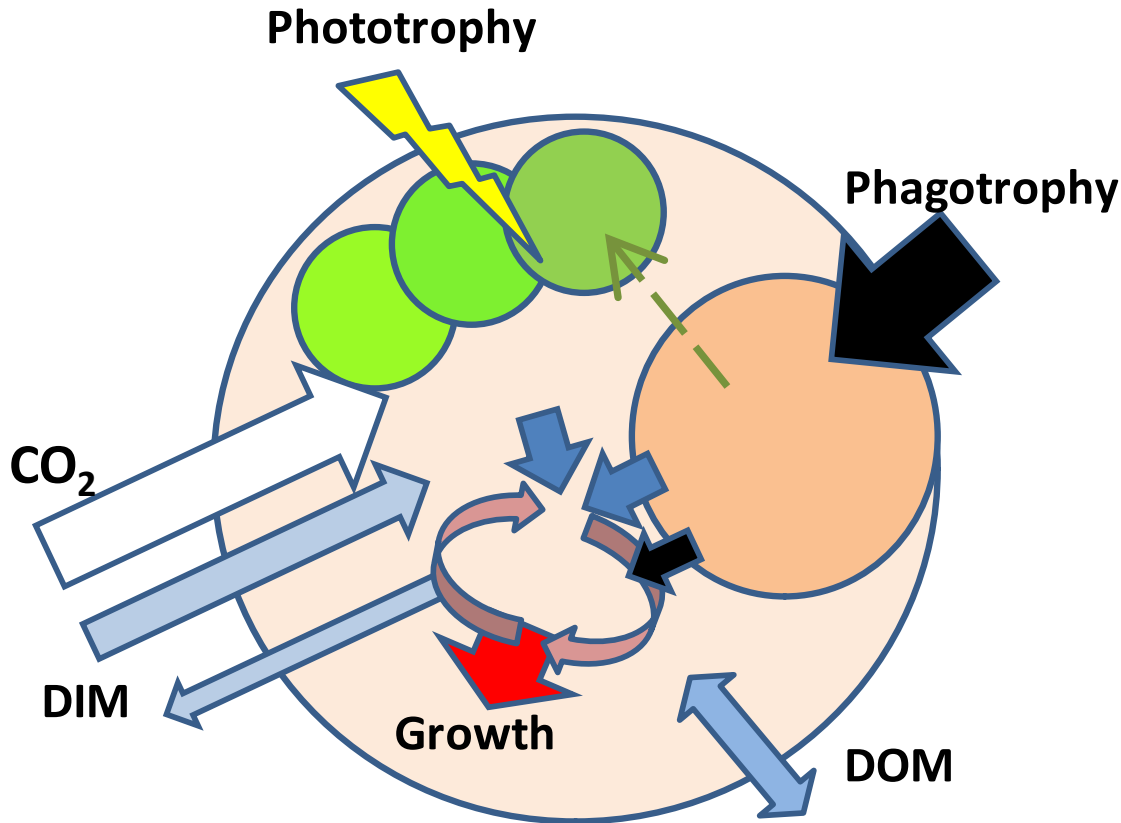


# Mixotroph functional type: Generalist Non-Constitutives



Example:  
plastidic ciliates – 1/3<sup>rd</sup> of photic zone  $\mu$ Zoo

# Mixotroph functional type: Specialist Non-Constitutives (kleptoplasty)



**SNC-mixotroph**  
**partial integration of phototrophy**

Examples:  
*Mesodinium*,  
*Dinophysis*

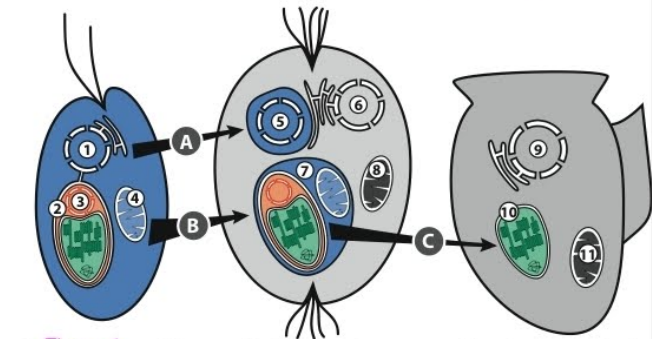
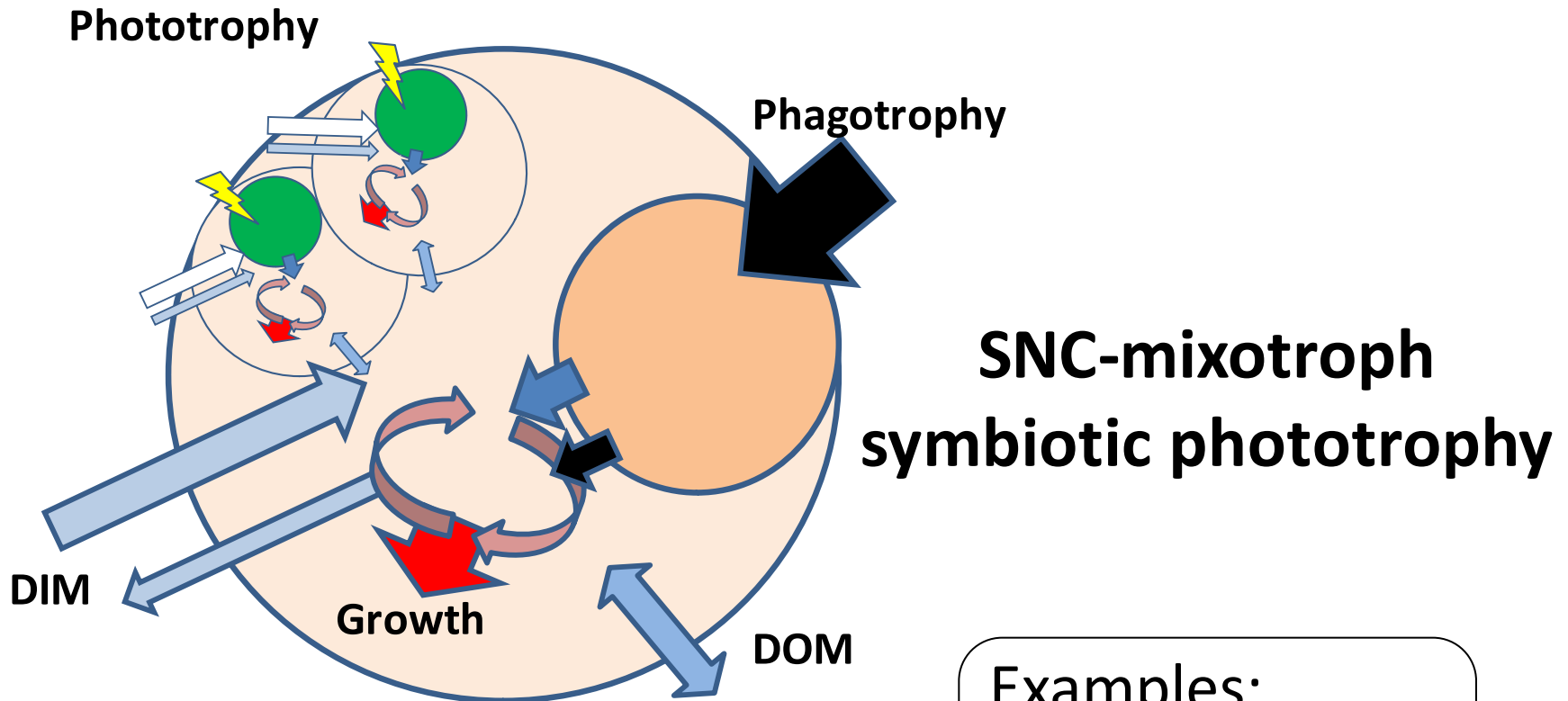


Figure 1  
*Geminiigera cryophila*    *Myrionecta rubra*    *Dinophysis acuminata*  
Wisecaver & Hackett 2010 BMC Genomics

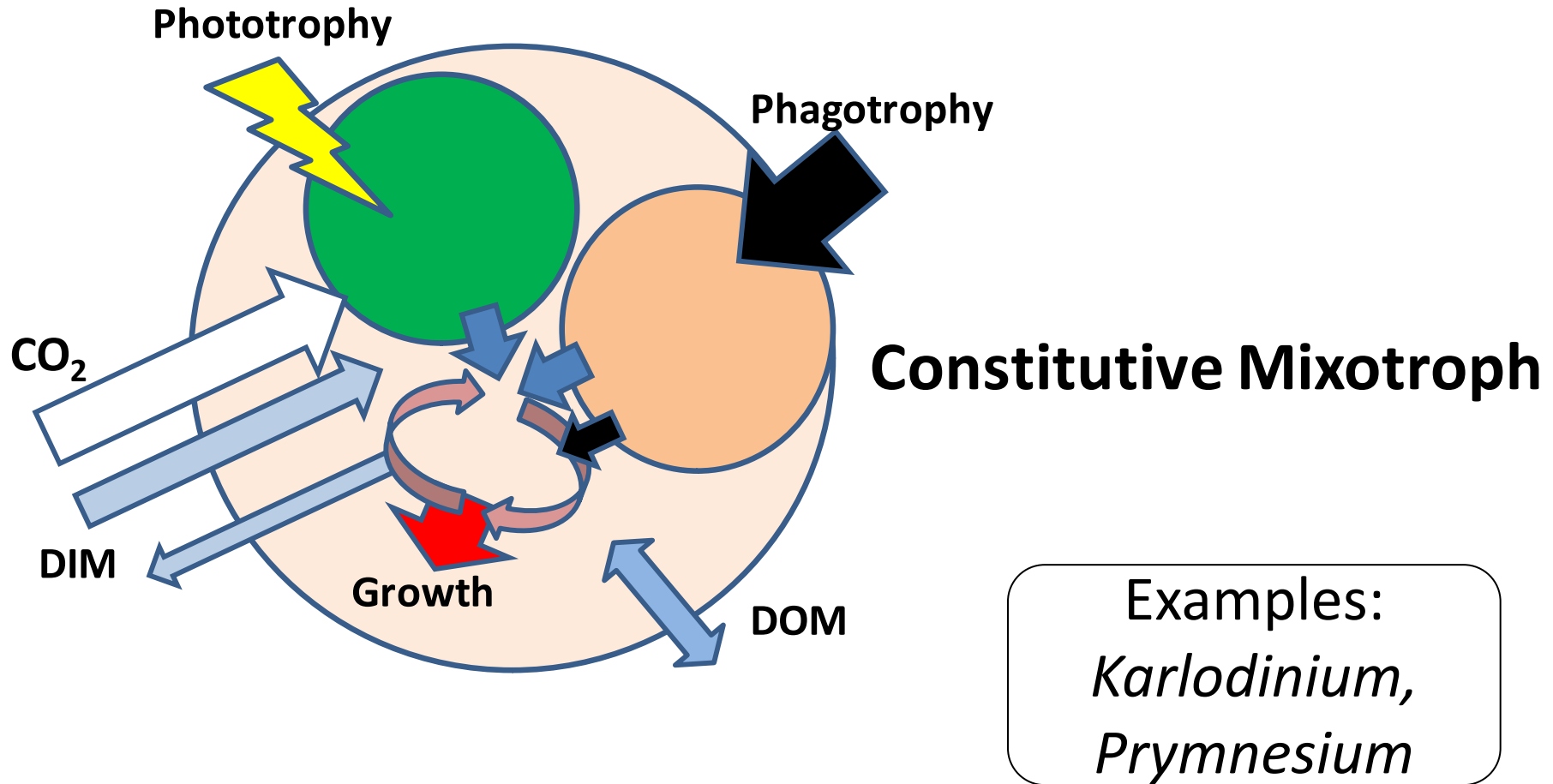
# Mixotroph functional type: Specialist Non-Constitutives (endosymbionts)



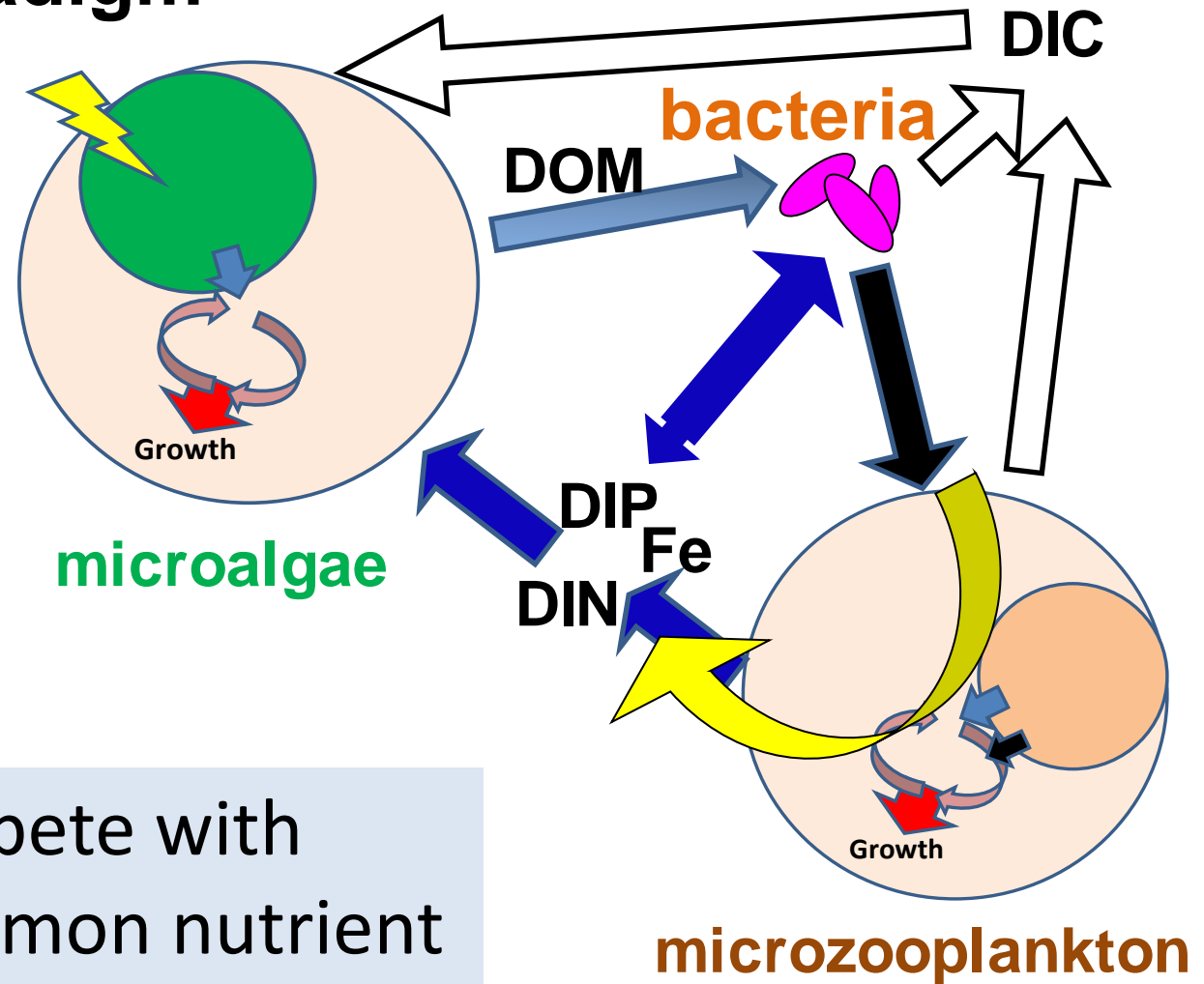
**SNC-mixotroph  
symbiotic phototrophy**

Examples:  
green *Noctiluca*,  
foraminiferans

# Mixotroph functional type: Constitutives

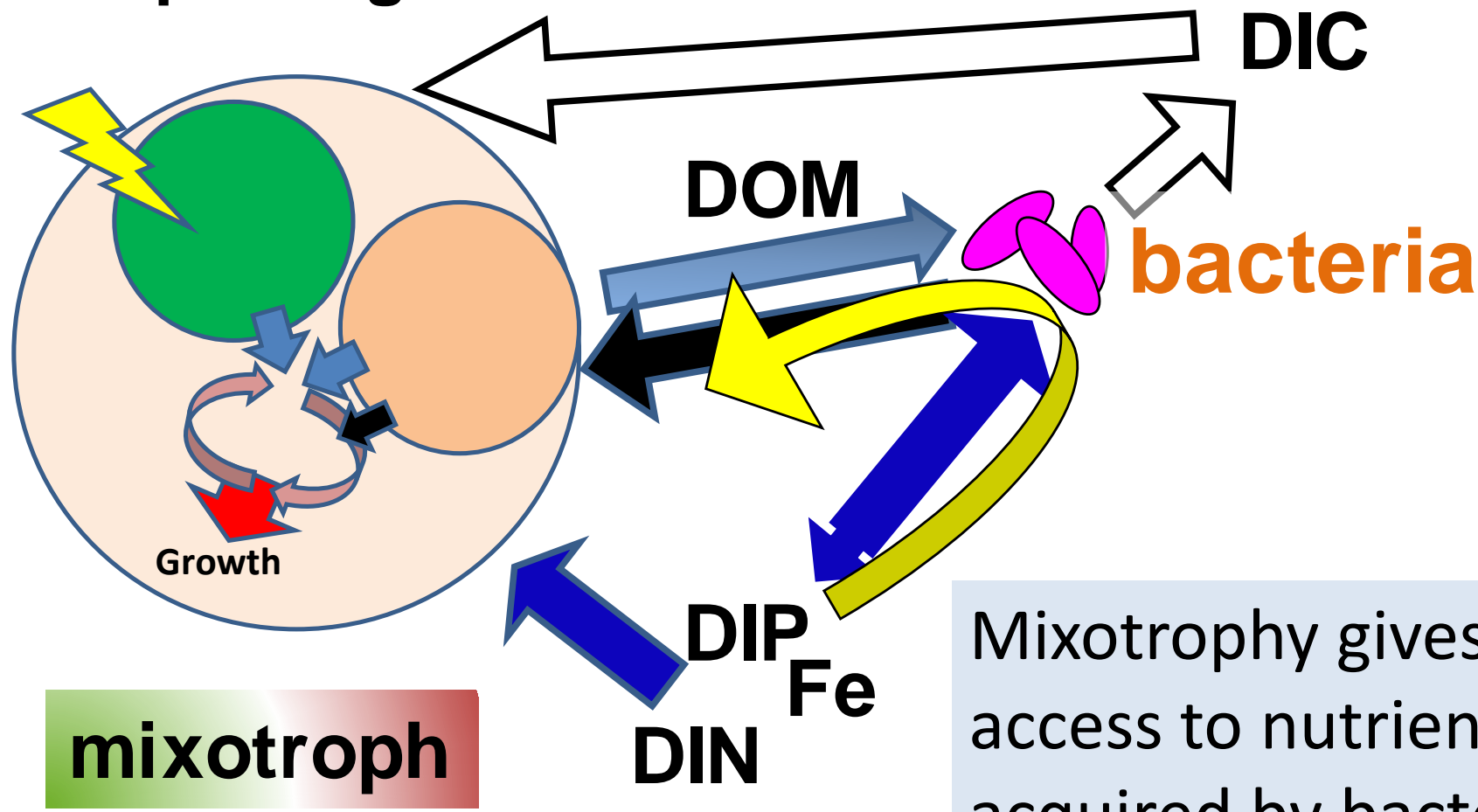


# Traditional paradigm



Microalgae compete with bacteria for common nutrient needs, with grazers controlling the outcome

# New paradigm

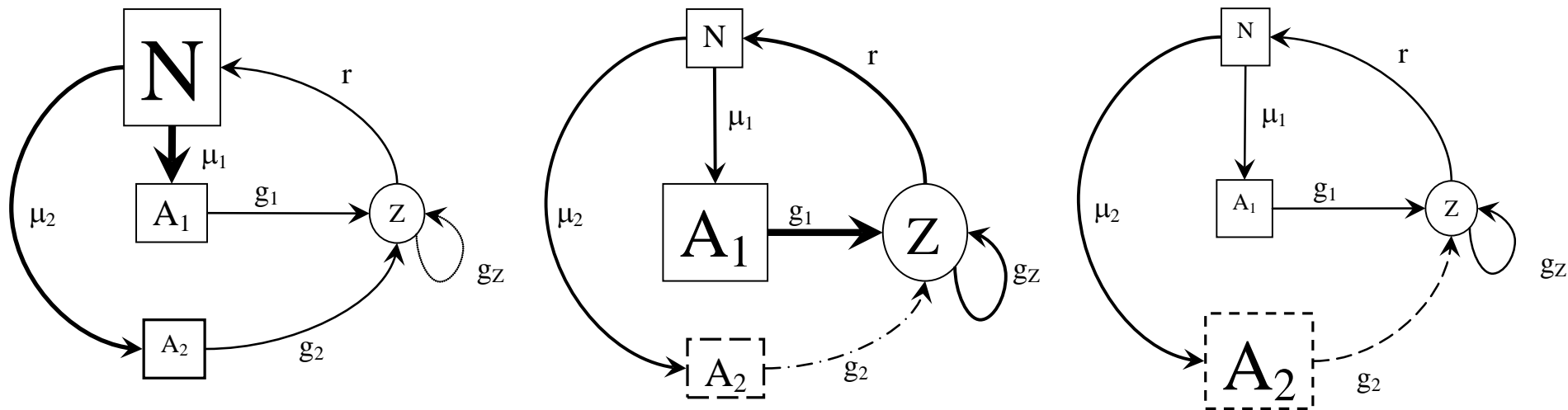


Mixotrophy gives access to nutrients acquired by bacteria, and not otherwise directly available to support C-fixation

Fig.6(b), Mitra et al. (2014) Biogeosciences  
doi:10.5194/bg-11-1-2014

**Moving on to grazers ...**

# Scope for zooplankton (Z) act as a vector transferring nutrients (N) from first bloom ( $A_1$ ) to a second ( $A_2$ ) which forms an EDAB

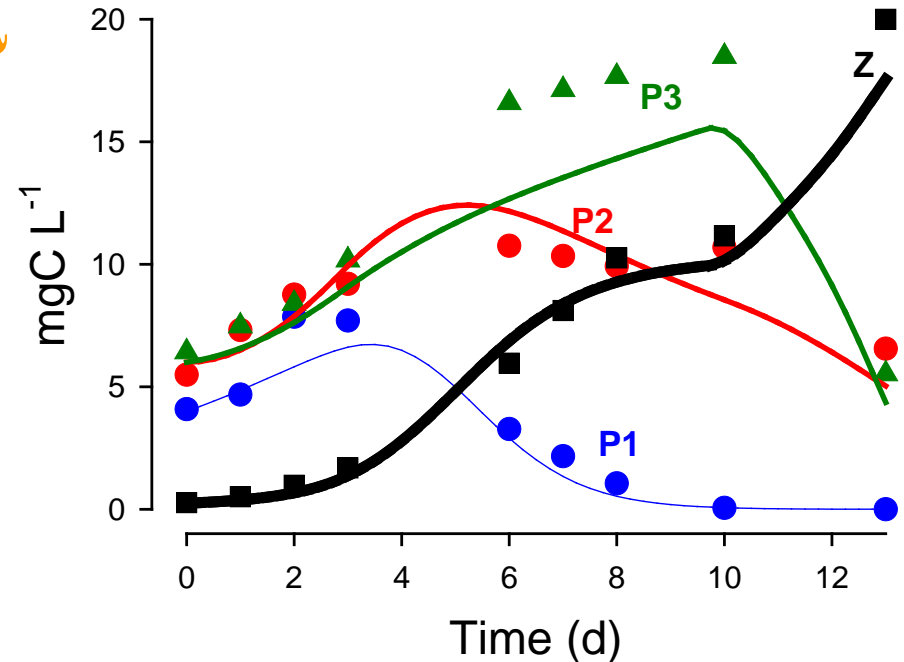
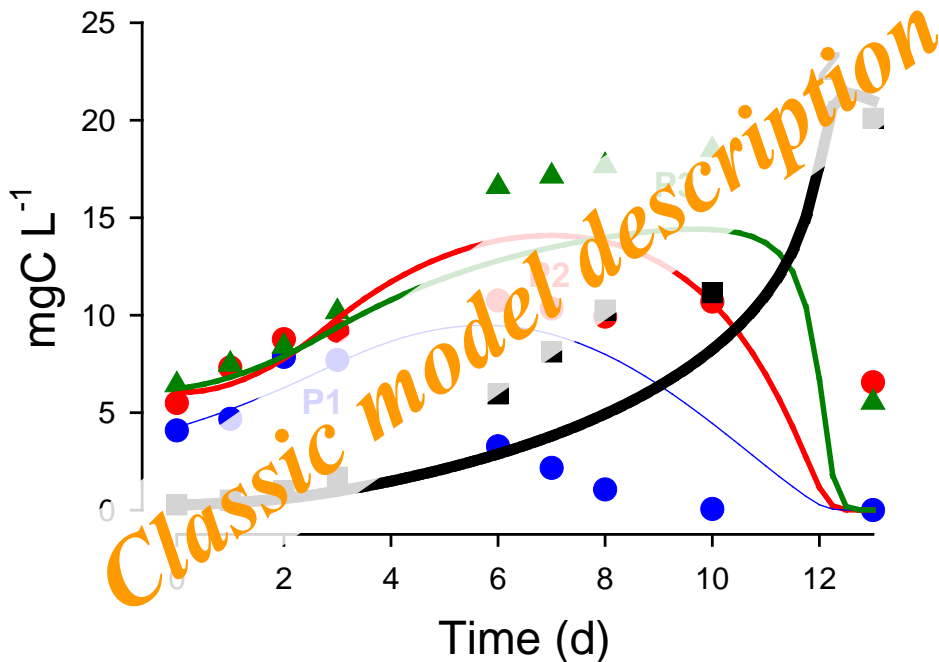


Growth using regenerated nutrients becomes rate limiting;  $A_2$  becomes nutrient stressed and hence becomes poor quality feed for grazers (de-selected) or perhaps noxious



# Prey de-selection by grazers is an important enabler of bloom formation

Experimental data of grazer Z on 3 prey options



**Ratio-based selection term**  
uses relative preference terms

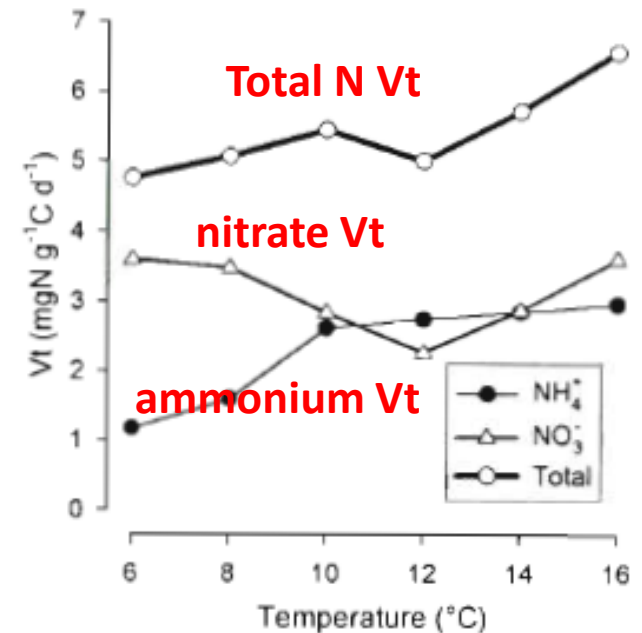
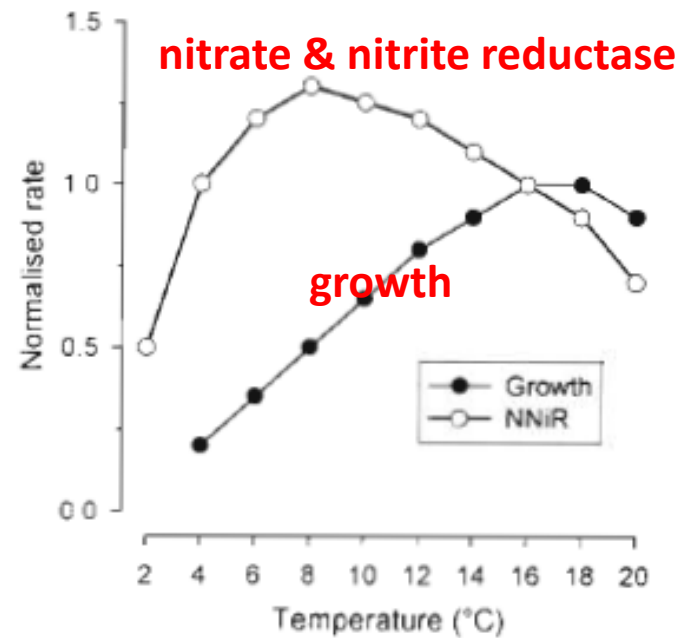
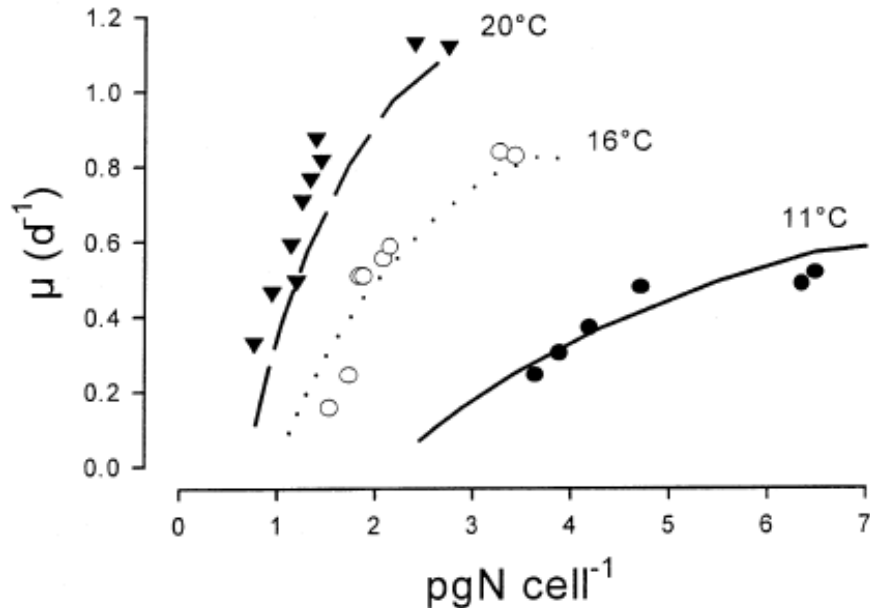
**Selective feeding function,**  
linked to prey quality & quantity

# Climate change for HABs

- What we consider climate change need not align simply with what organisms “see”
- These organisms encounter generational changes in their climate every season
- .. in part that they cause through their own activity.
- The environment proximal to the cells may also differ from bulk environmental conditions (**varies with organism size, growth rates, vertical migration**)
- Models can help us better appreciate such issues

# Temperature affects more than growth rate

- It affects physiology
- It affects organism size (and thence predator-prey interactions, and cell count-biomass transforms)

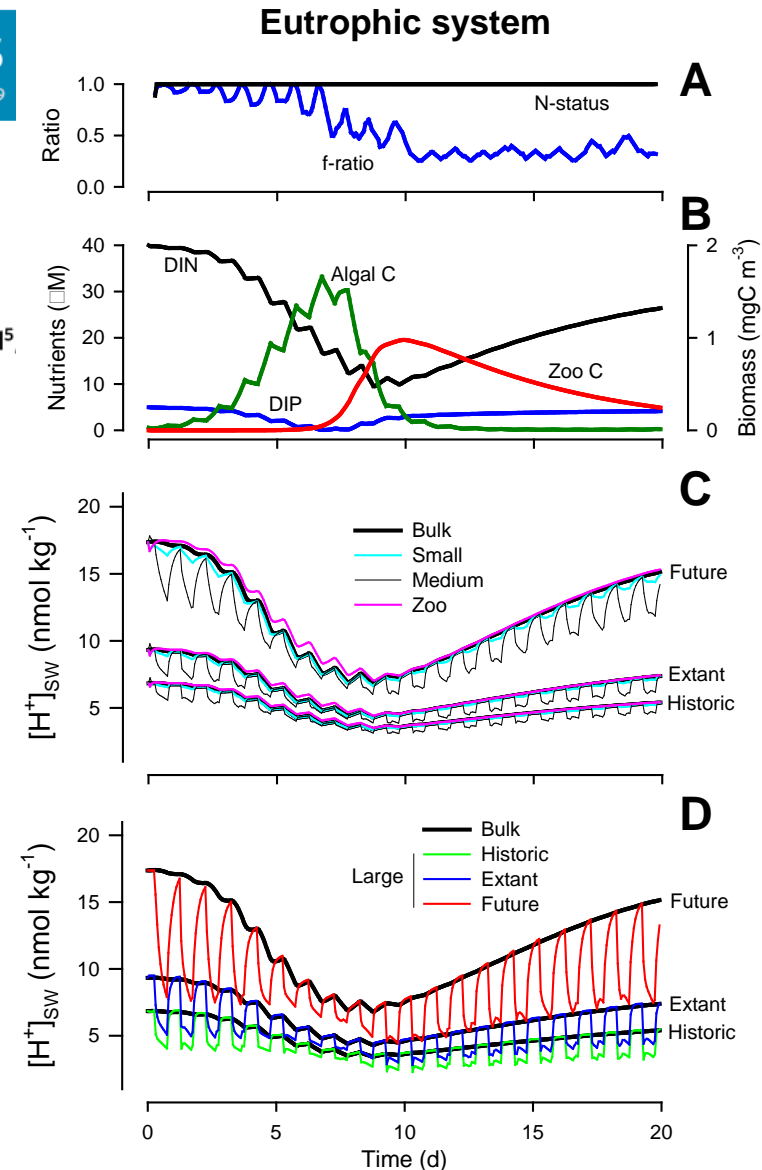


# Changes in pH at the exterior surface of plankton with ocean acidification

Kevin J. Flynn<sup>1\*</sup>, Jerry C. Blackford<sup>2</sup>, Mark E. Baird<sup>3</sup>, John A. Raven<sup>4</sup>, Darren R. Clark<sup>2</sup>, John Beardall<sup>5</sup>, Colin Brownlee<sup>6</sup>, Heiner Fabian<sup>1</sup> and Glen L. Wheeler<sup>2,6</sup>

- With OA,  $[H^+]$  (hence pH) is less stable as buffering is less
- Bulk pH tells only part of the story
- particle-surface pH changes over the day, increasing with size and activity
- OA & basification stresses will be greater for larger organisms and those in aggregates

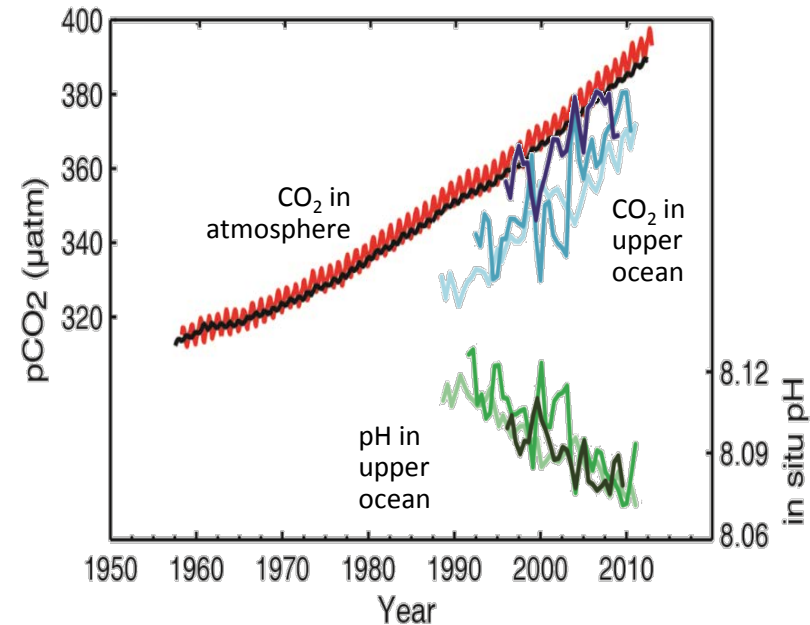
(but those may be better adapted)

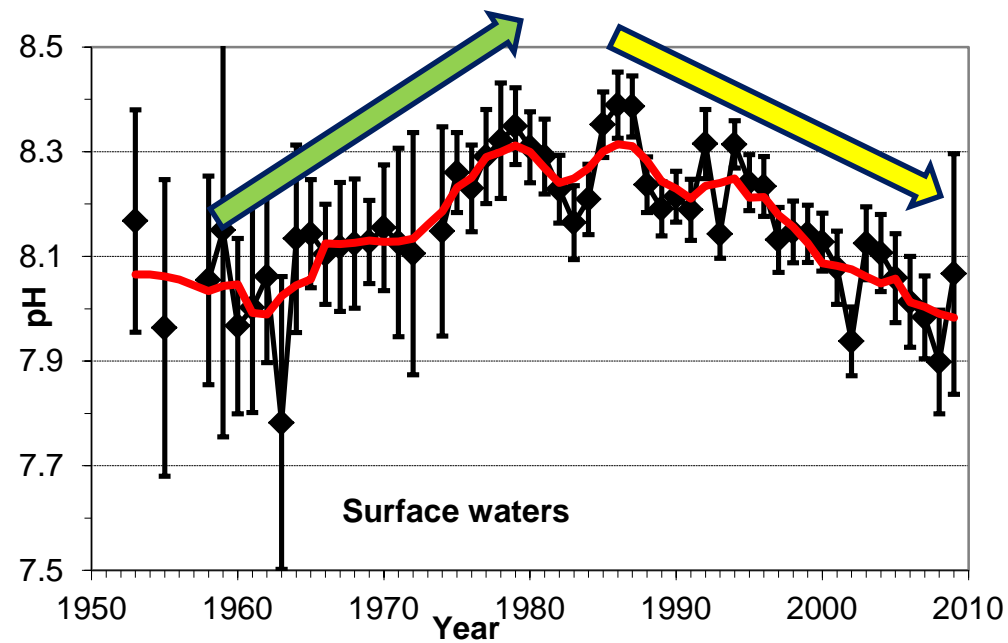


Particle ESD 25, 75, 150 $\mu$ m; zoo 200  $\mu$ m

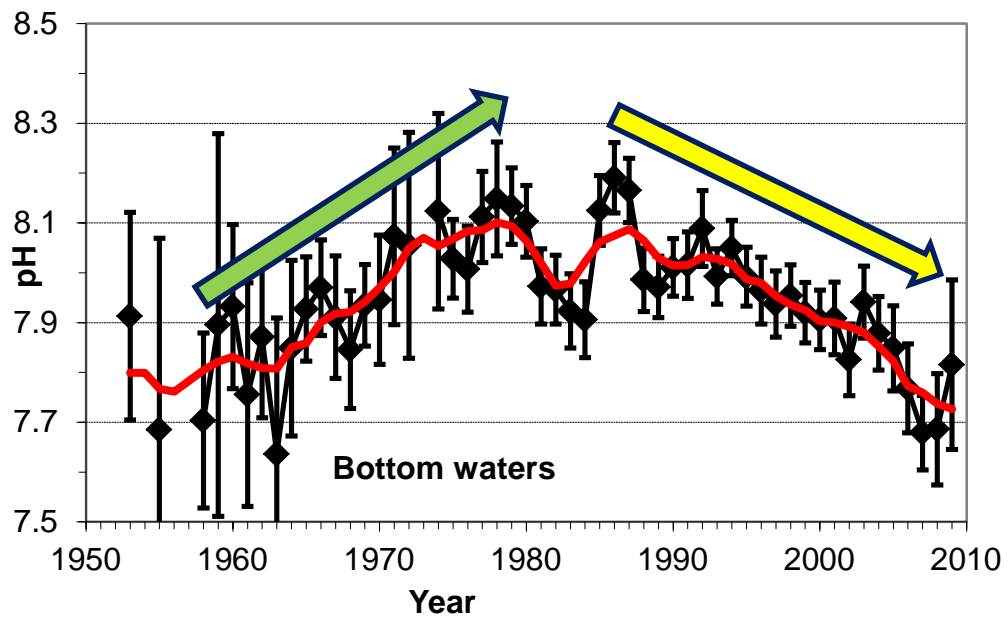
# Ocean Acidification (OA) – an example of biotic-abiotic interactions

- Dissolution of atmospheric  $\text{CO}_2$  in the oceans leads to OA
- Primary production consumes  $\text{CO}_2$ , resulting in pH increasing (“**basification**” – the opposite of acidification)
- **Basification adversely and selectively affects plankton growth**





In some coastal waters, home to most fisheries, nutrient pollution (**eutrophication**) until the 1980's stimulated phytoplankton growth, countering OA (**pH increased**)

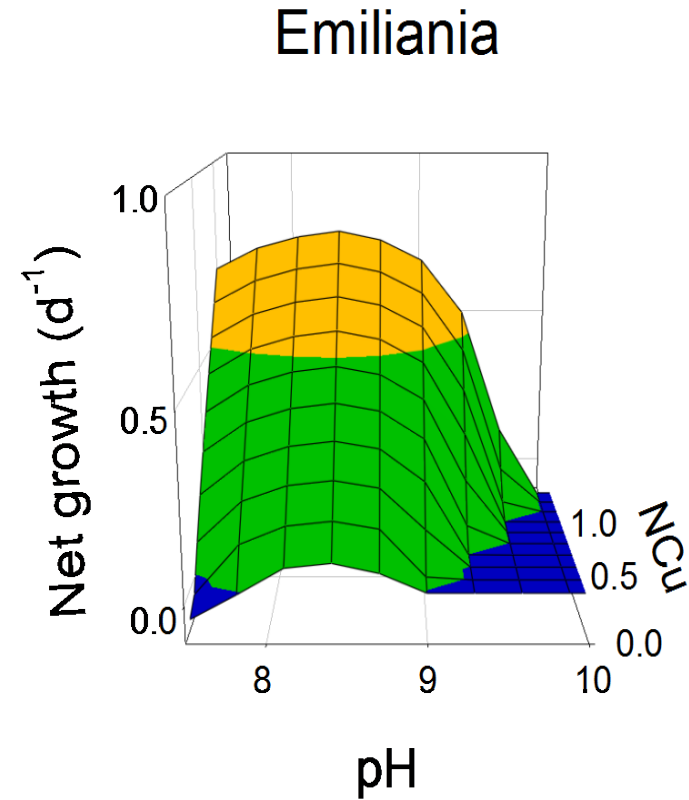
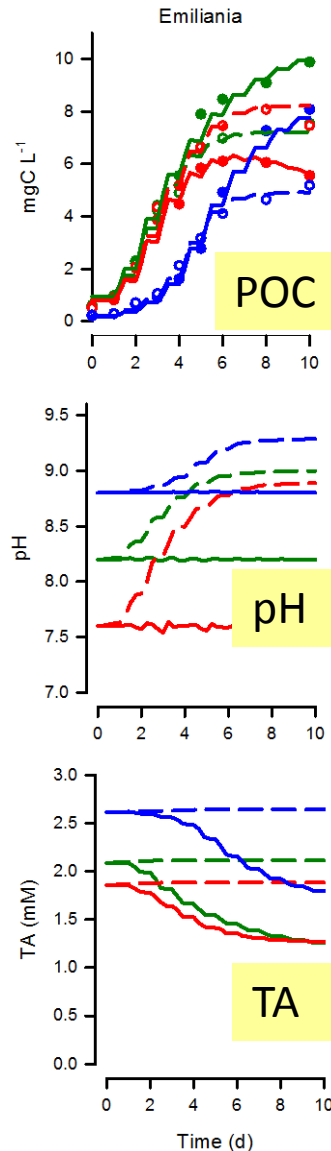


...the impact of OA may now be faster in such waters because of de-eutrophication starting in the 1980's

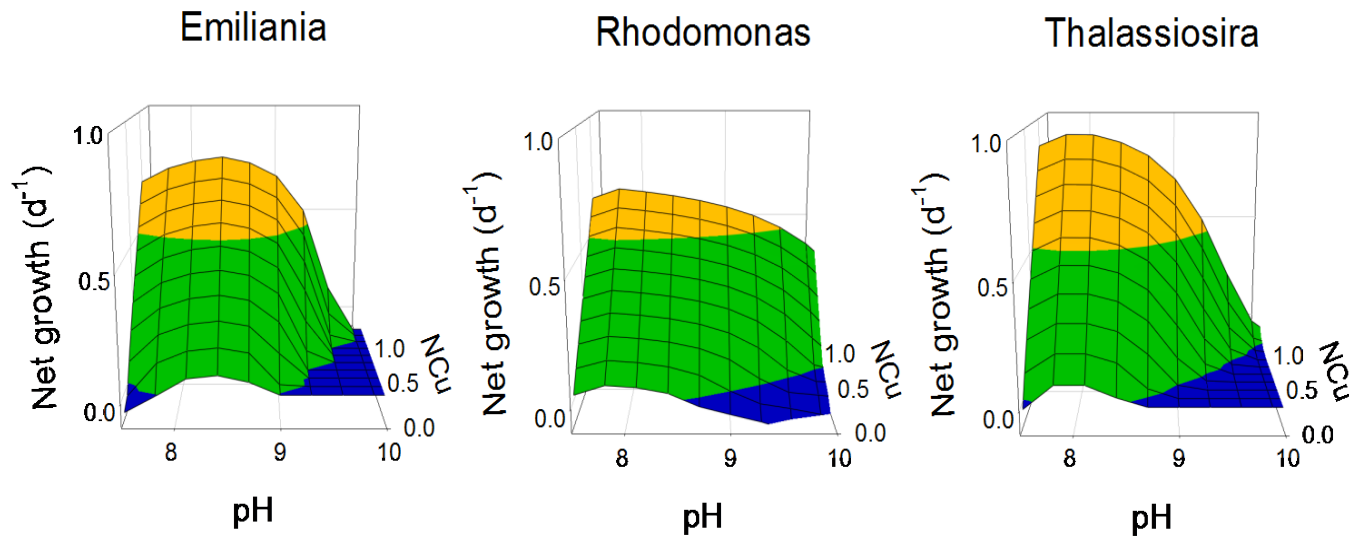
Variations in seawater pH in inner Danish waters Data from NJ Carstensen, Dept. of Biosciences, AU, Denmark

# An example of linking nutrients, pH, algal growth, and models

- Unialgal cultures grown in fixed/drift pH used to parameterise CNPChl acclimative models ...
- ... generating response curves linking pH and nutrient status to growth and death rates



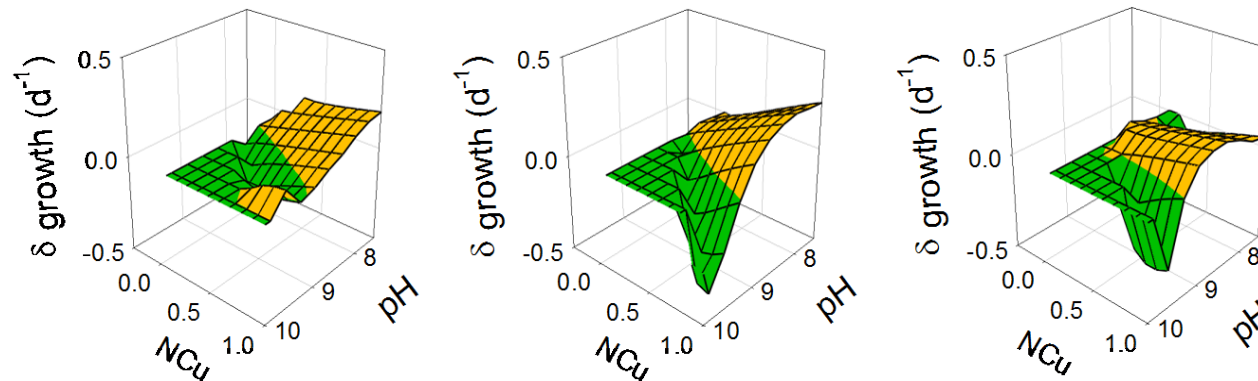
Poor nutrient status (low NCu) narrows the pH optima for growth



Thalassiosira-Emiliana

Thalassiosira-Rhodomonas

Emiliana-Rhodomonas

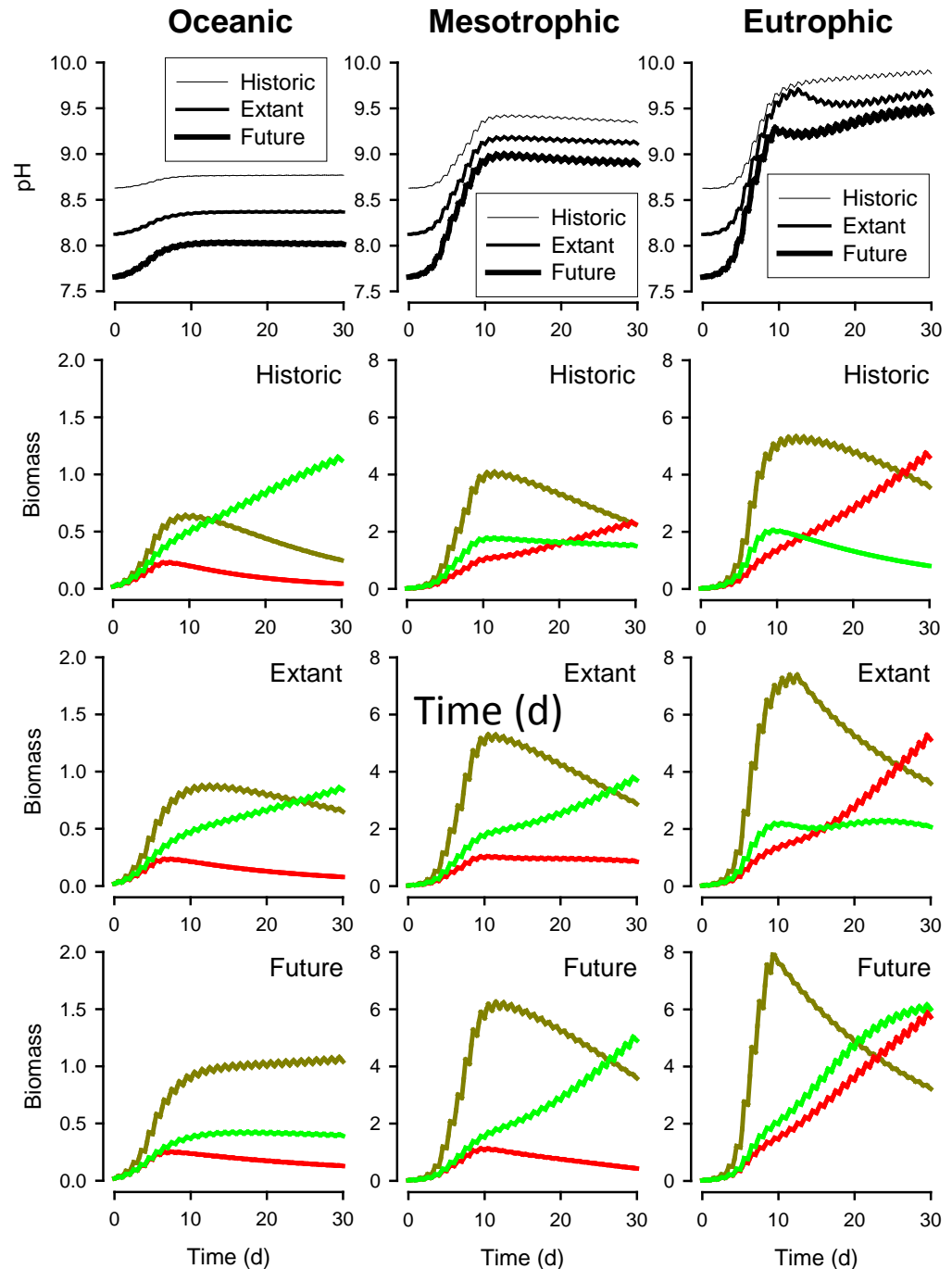


- Different species exhibit different response curves to pH and nutrient status, opening windows for competitive advantage
- NCu = cellular N-status (0 poor; 1 good)



# Simulation Scenarios

- Different oceanographic conditions (mixing depths, nutrient load)
- Different coloured lines for different phytoplankton configurations
- **Historic** (preindustrial)  $p\text{CO}_2$  280 ppm
- **Extant**  $p\text{CO}_2$  390 ppm
- **Future** (prediction for 2100)  $p\text{CO}_2$  1000 ppm



# And we need to understand interactions far beyond this

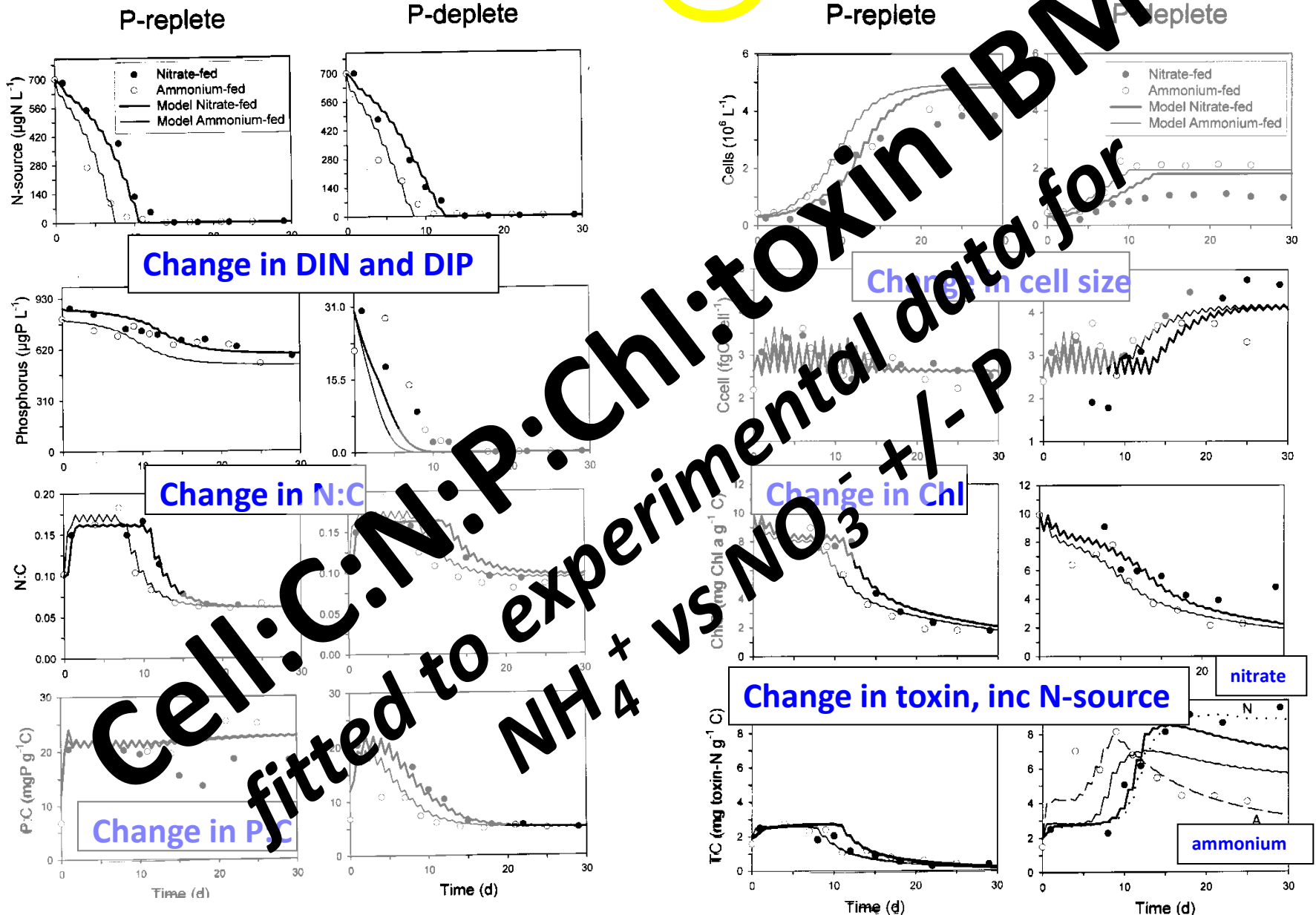
- Likely that similar optima curves as for pH also exist for temperature + nutrient-status, and likewise for prey and also grazers
- And these will all have knock-on impacts on trophic dynamics

# Stoichiometric quality, toxins & grazing

- Stoichiometric quality (C:N:P) is key to trophic dynamics,
- yet variable stoichiometry is often not modelled (nor measured in experiments of HAB or non-HAB plankton)
- Grazing functions capable of properly describing feeding and switching between different prey types, C:N:P, sizes are also very rare (nor well studied in exp.)
- Implicit or explicit modelling of toxicity is typically very simplistic
- But then data collection is still too often (often solely) based upon organism counts, with little information on nutrient history (C:N:P)
- **Little seems to have advanced over the last decade that helps systems dynamics modelling ☹️**

# Alexandrium PSP with N and P-stress

(John & Flynn 2002 MEPS)



# Models, nutrient ratios and Redfield

- Coupling variable stoichiometry studies and models reveals problems in interpreting N:P ratios and Redfield “optima”.
- External N and P concentrations, and Internal C:N and C:P are the drivers for growth (**links to external N:P or internal N:P are emergent**)

Journal of Marine Systems 83 (2010) 170–180



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Do external resource ratios matter?

Implications for modelling eutrophication events and controlling harmful algal blooms

Kevin J. Flynn \*

Progress in Oceanography 84 (2010) 52–65



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Progress in Oceanography

journal homepage: [www.elsevier.com/locate/pocean](http://www.elsevier.com/locate/pocean)

Ecological modelling in a sea of variable stoichiometry: Dysfunctionality and the legacy of Redfield and Monod

Kevin J. Flynn \*

The optimal cellular C:N:P varies widely....

... P-ratios lower than Redfield can support good growth.

Conversely poly-P accumulation enables far higher P contents than may be expected and enables good growth in the absence of external P for many generations.

# A Pragmatic Challenge

## Molecular Biology vs Data For Models

- Molecular techniques identify immense variety in biological systems, and are frequently promoted as tools in monitoring impacts of climate change
- Models need to simplify, decrease/summarise all that variety into few ecological functional type descriptions
- But where € limits research, decisions need to be taken on the direction of studies .. **Breadth of functional types vs comparison between strains ..**  
**Molecular vs biomass+rate measurements.**
- Molecular techniques do not typically provide rate values of utility to systems dynamics models

# Routes to the future

- HAB models require us to model much more than the HAB organisms
- Need to identify & describe the ecological plankton functional types across all trophic levels
- More emphasis needs to be placed on understanding causal interactions
- ... rates, feedbacks, cascades etc are needed to aid model construction, and greater appreciation of variability and risks in model operation
- Systems modelling should be just as part and parcel of HAB science as 'omics, statistics, toxin analysis etc.
- **If we can't usefully model it, then we don't understand it**

# THE challenge ....

- .. is getting modelling and field/lab work really linked up
- Repeatedly stated as important, but little happens, complicated by semantics and other points of confusion between different researchers
- Typically takes 10yrs for advances in biology to progress to models
- Can we afford this delay, this waste of effort?



# The role of the Expert Witness

- Collecting data is a major logistic challenge
- But there is a vast amount of phenomenological information – ***we need to exploit this***
- Modellers can engage the ecologist and biologist through “expert witness validation” ...
- ... *does the model do what the expert expects it to do under all plausible forcings?*



*J. Plankton Res.* (2015) 0(0): 1–9. doi:10.1093/plankt/fbv036

# HORIZONS

## Acclimation, adaptation, traits and trade-offs in plankton functional type models: reconciling terminology for biology and modelling

KEVIN J. FLYNN<sup>1\*</sup>, MICHAEL ST JOHN<sup>2</sup>, JOHN A. RAVEN<sup>3,4</sup>, DAVID O.E. SKIBINSKI<sup>5</sup>, J. ICARUS ALLEN<sup>6</sup>, ADITEE MITRA<sup>1</sup>  
AND EILEEN E. HOFMANN<sup>7</sup>

# .. And one final application of models for risk assessment for HABs in new climates

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Research



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Monster potential meets potential monster: pros and cons of deploying genetically modified microalgae for biofuels production

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- much research is being conducted to generate GM microalgae
- there must be a risk that these organisms will escape (especially biofuels algae from vast open ponds)
- these could pose a very serious HAB threat, as all the features needed in a GM microalga also describe those for an EDAB (rapid growth, efficient light & nutrient usage, resistant to grazers)