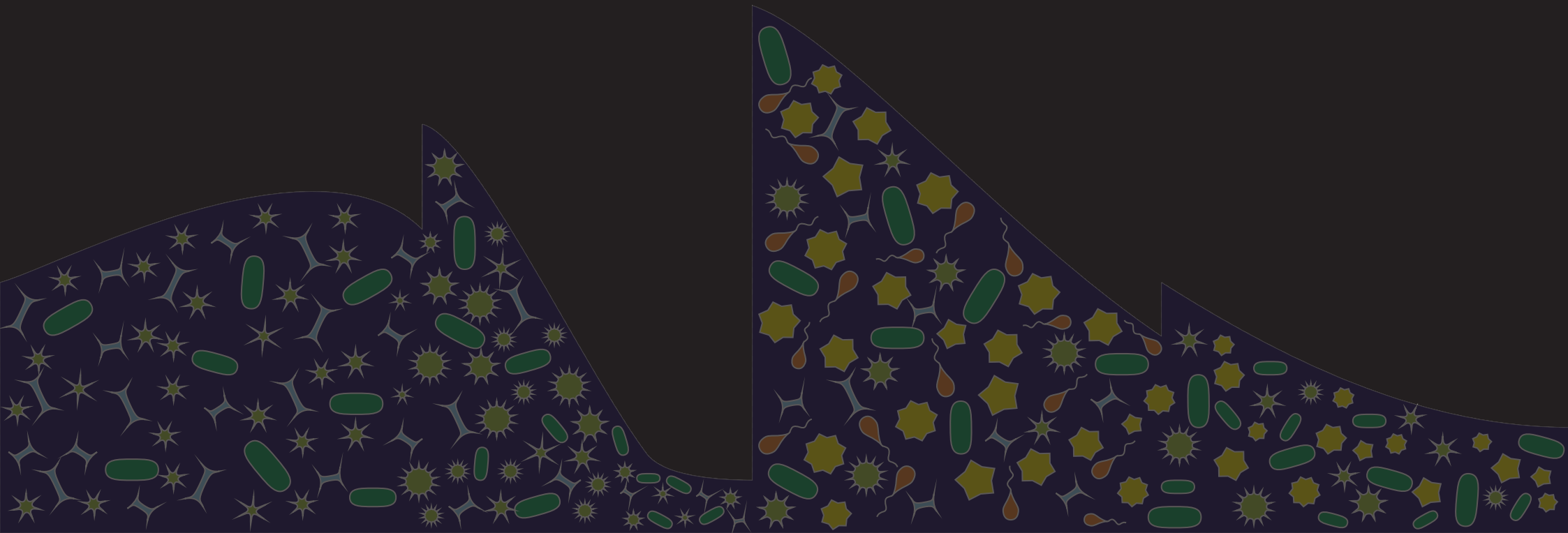


# *The ecology of numerical models and other baked goods*

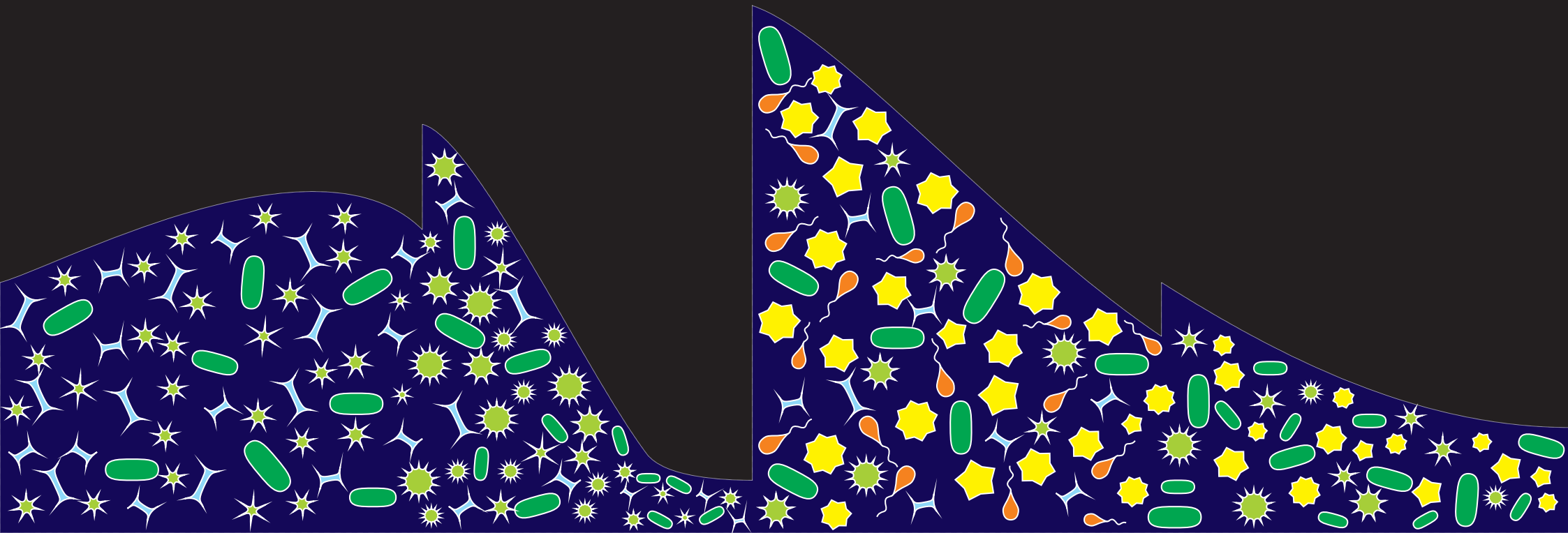


**Andy Ridgwell**

University of Bristol,  
University of California – Riverside



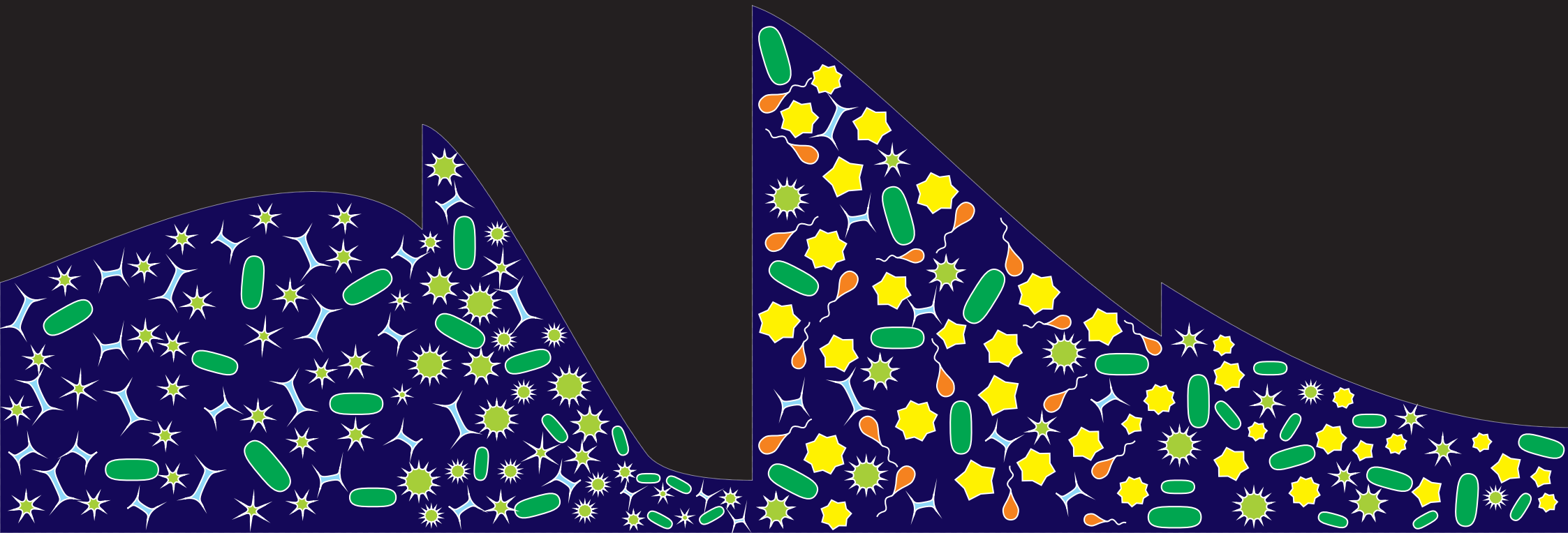
- (1) Muffins.
- (2) Cupcakes.
- (3) Other baked goods.



(1) Some GENIE results.

(2) Current/emerging GENIE developments and potential for a GUI-based 'teaching model'.

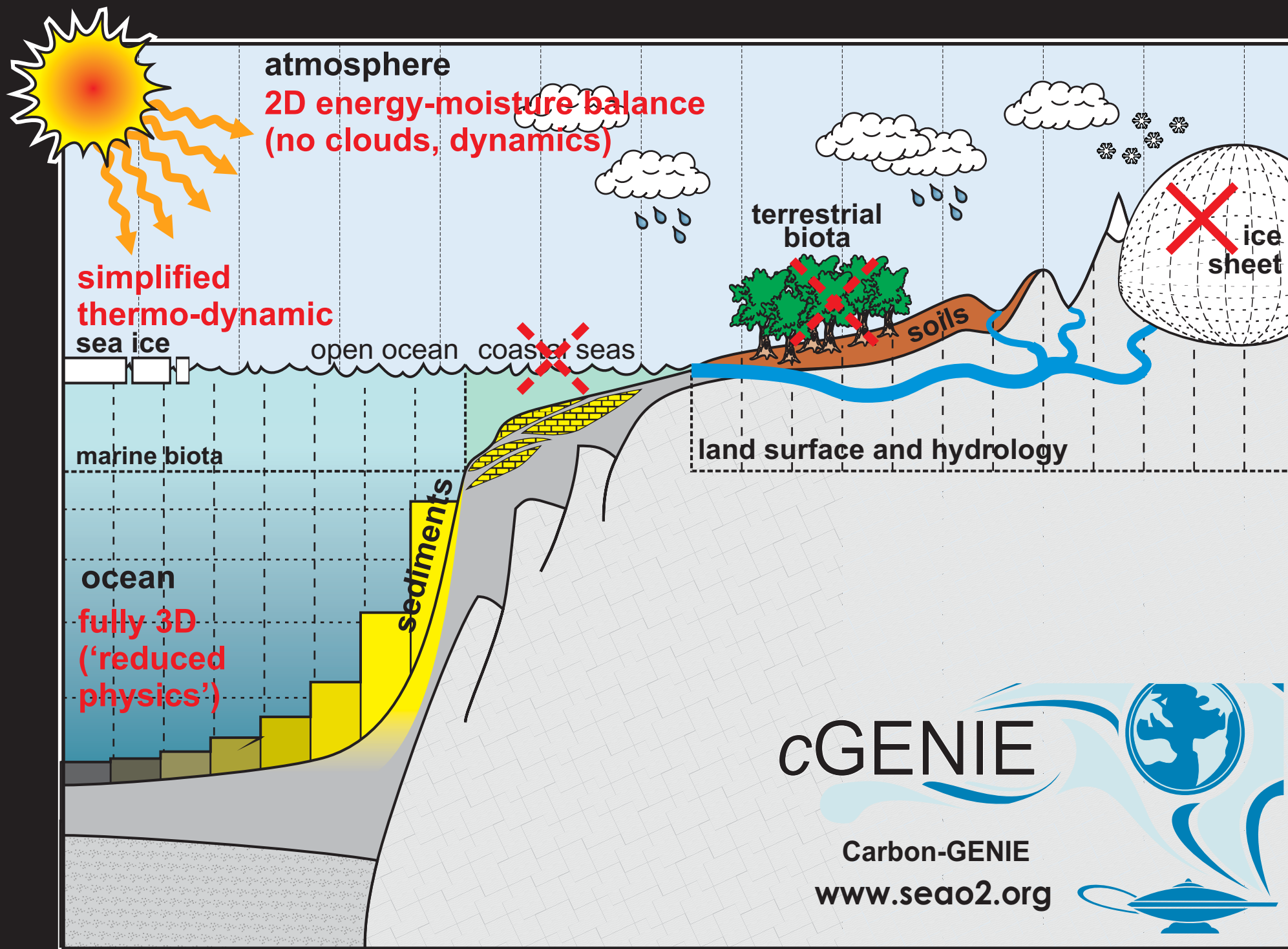
(3) Future directions in ecological modelling.

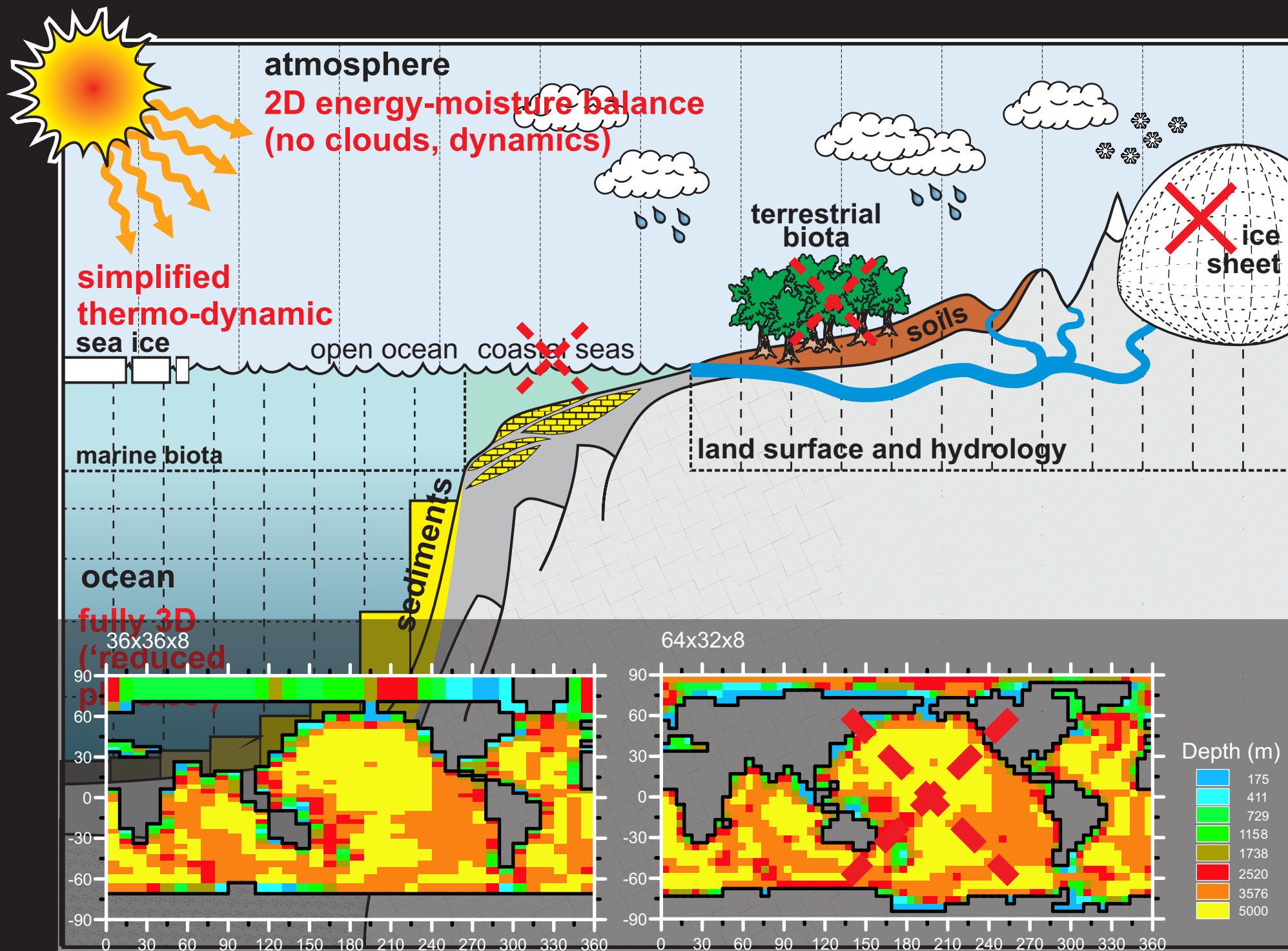


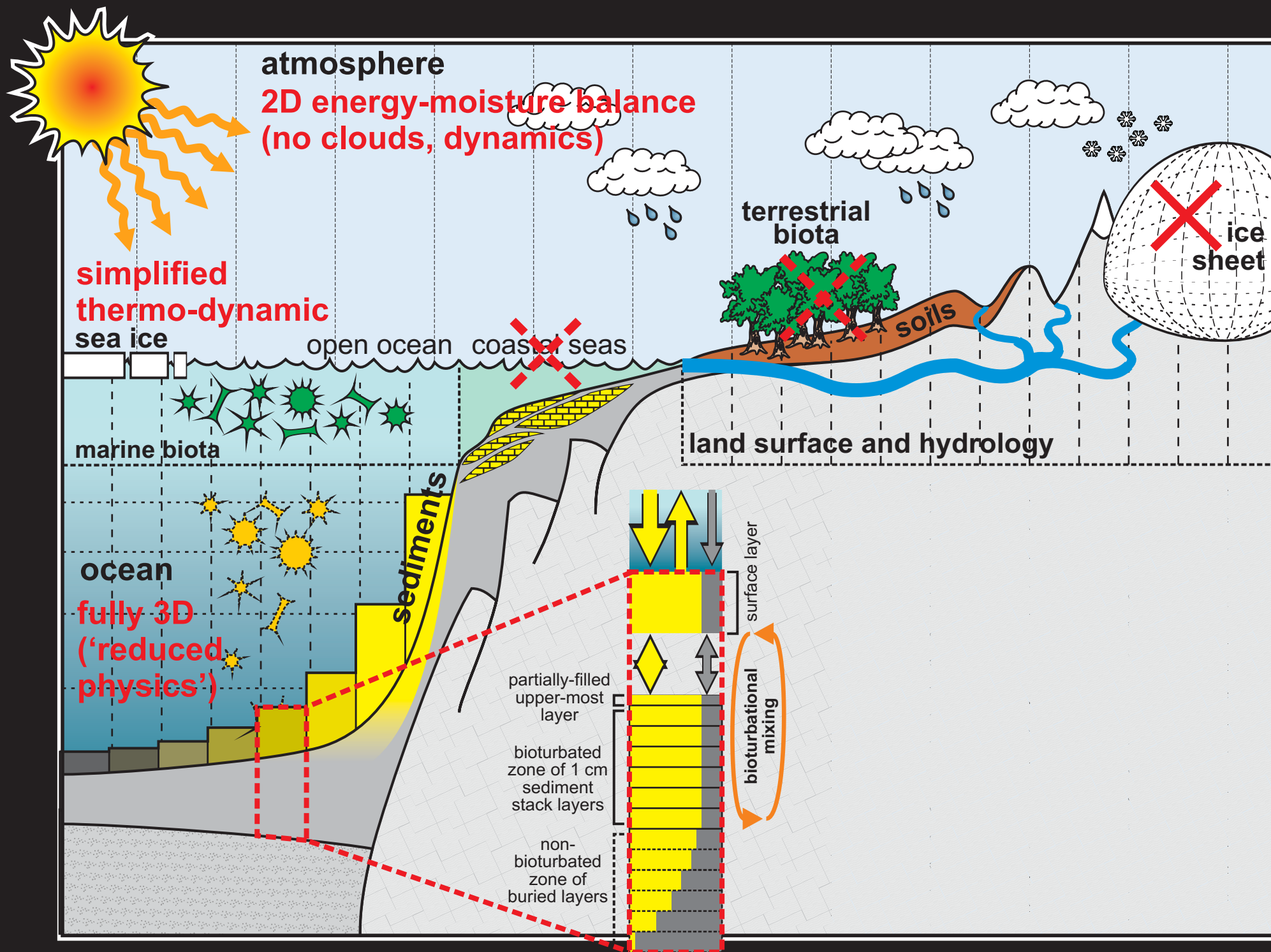


Grid ENabled Integrated Earth system model

[www.genie.ac.uk](http://www.genie.ac.uk)







## major changes vs. 'GENIE'

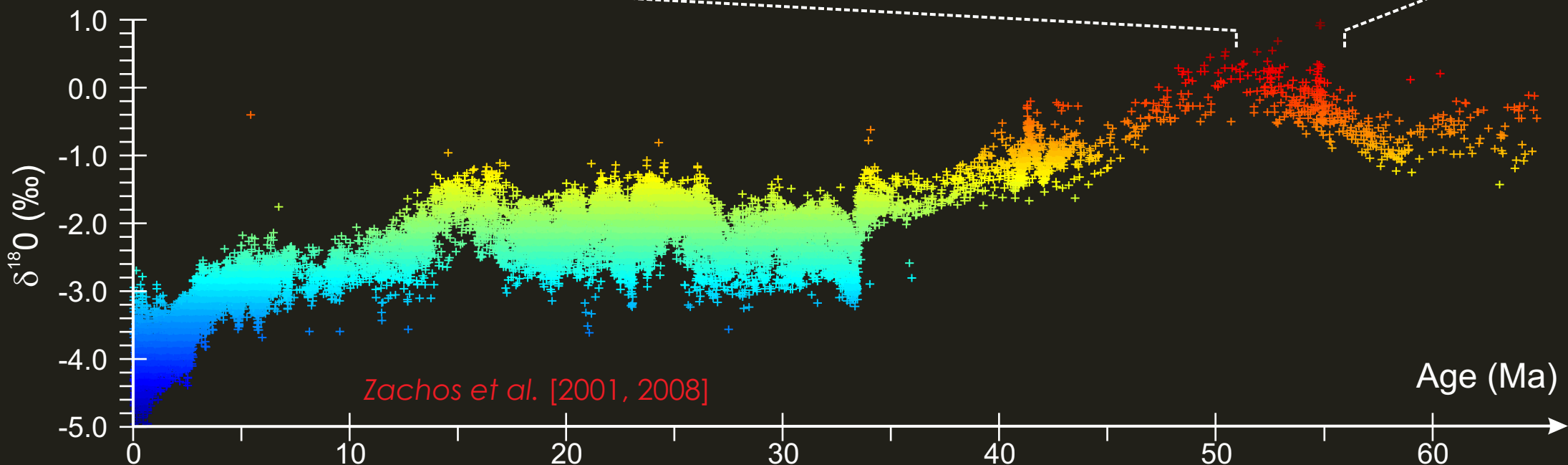
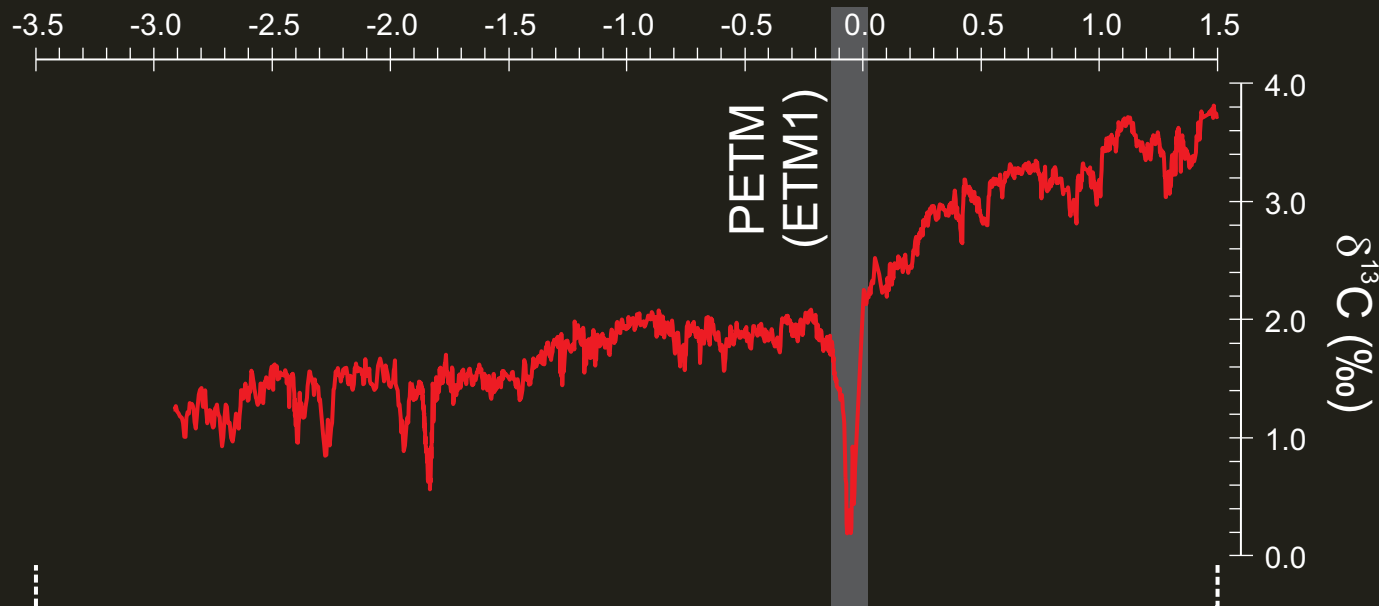
- ★ deletion of 'legacy' science modules, e.g. IGCM, GLIMMER, MOSES/TRIFFID, etc.  
(improving compiler compatibility)
- ★ attempt at parallelization  
(concurrent GOLDSTEIN/BIOGEM, domain de-compositoin of GOLDSTEIN)
- ★ reorganization of main GENIE.F loop and introduction (completion) of 'GEMlite'
- ★ simplification of `runmuffin.sh` script configuration, name-list checking
- ★ complete reorganisation of redox (in progress)
- ★ continued tracer addition and functionality such as proxy 'inversion' methodology
- ★ added netCDF restarts for biogeochem modules
- ★ added netCDF sedcor data saving
- ★ MATLAB plotting and analysis function development

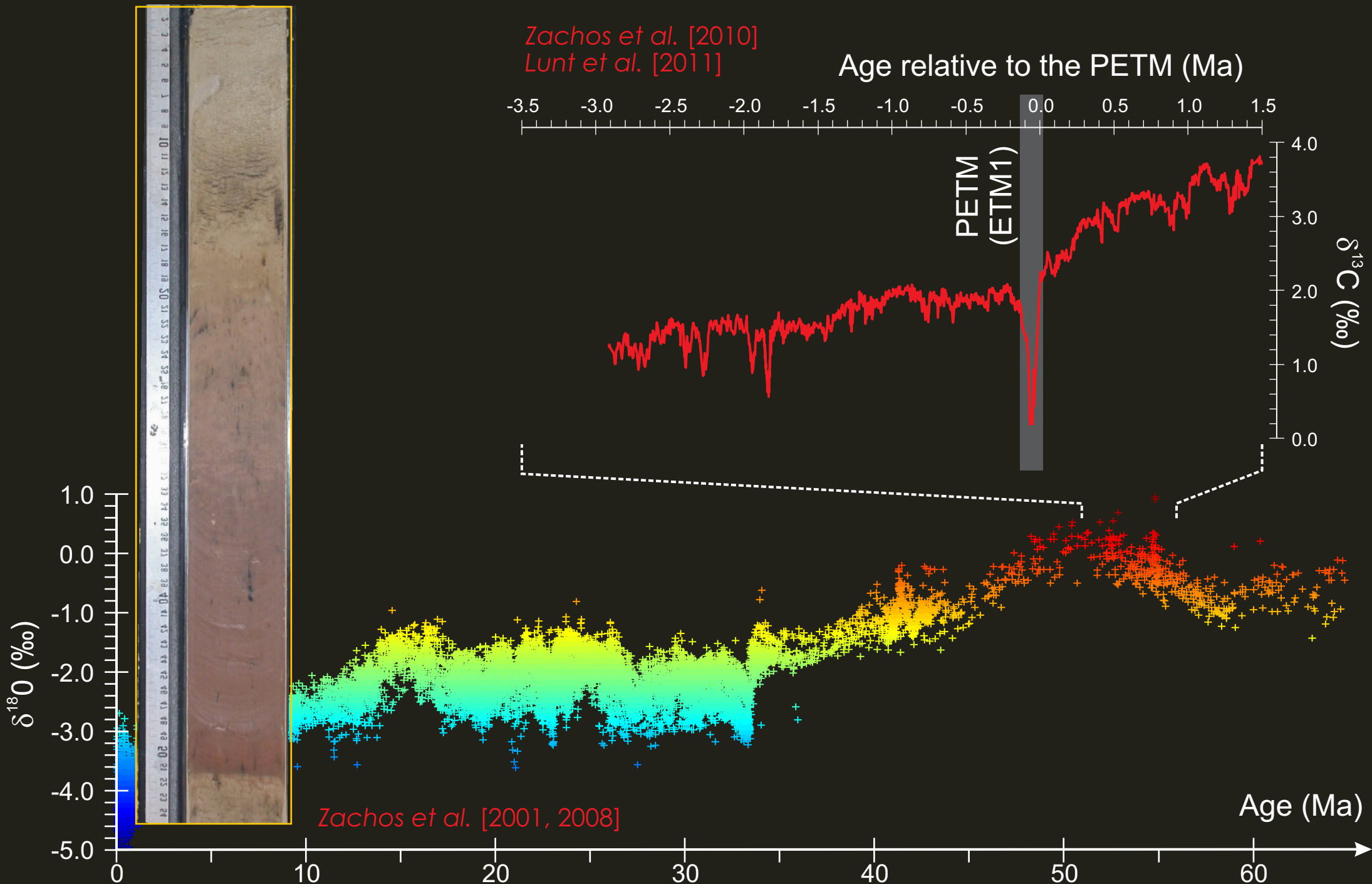


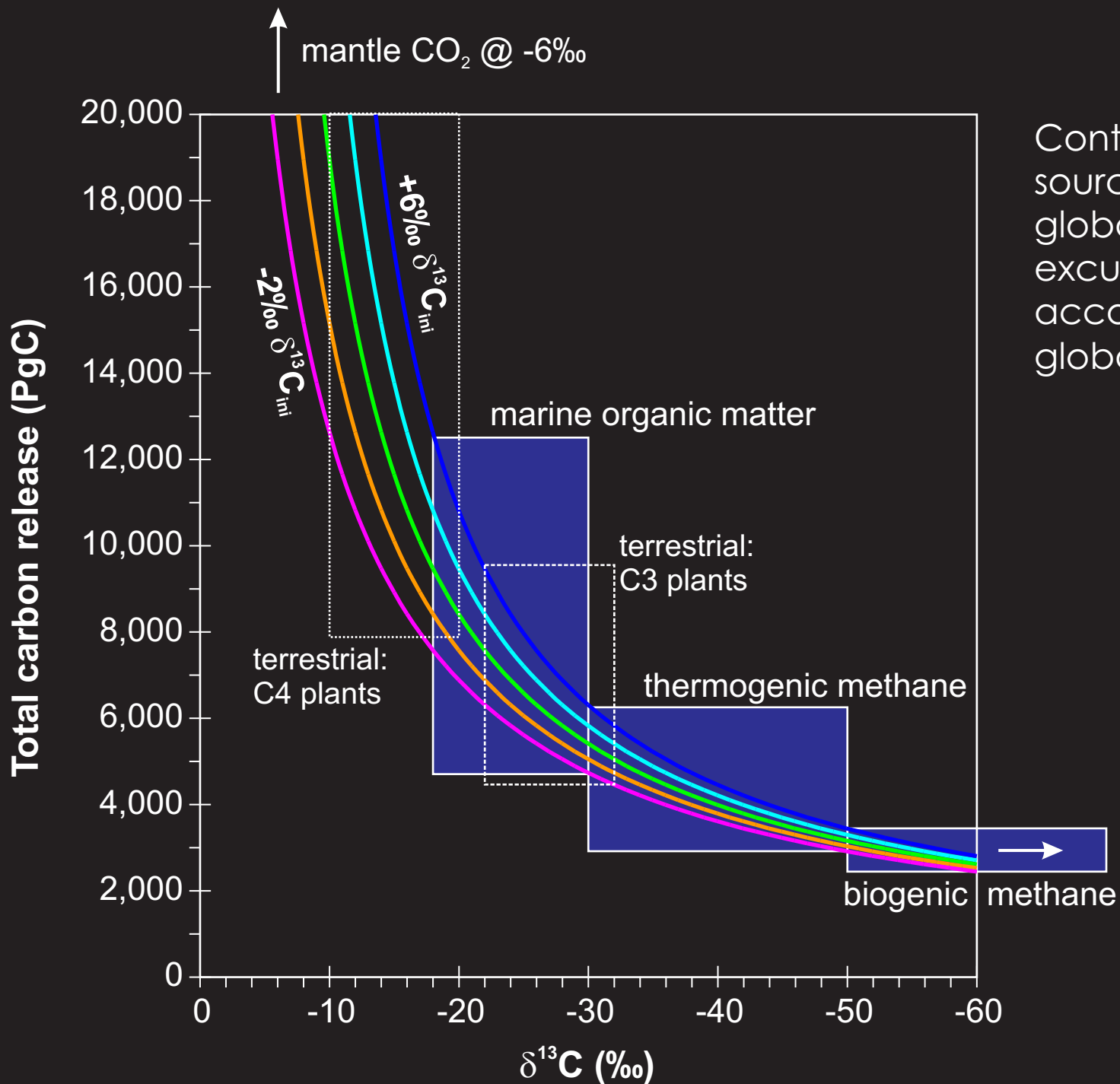


*Zachos et al. [2010]*  
*Lunt et al. [2011]*

Age relative to the PETM (Ma)



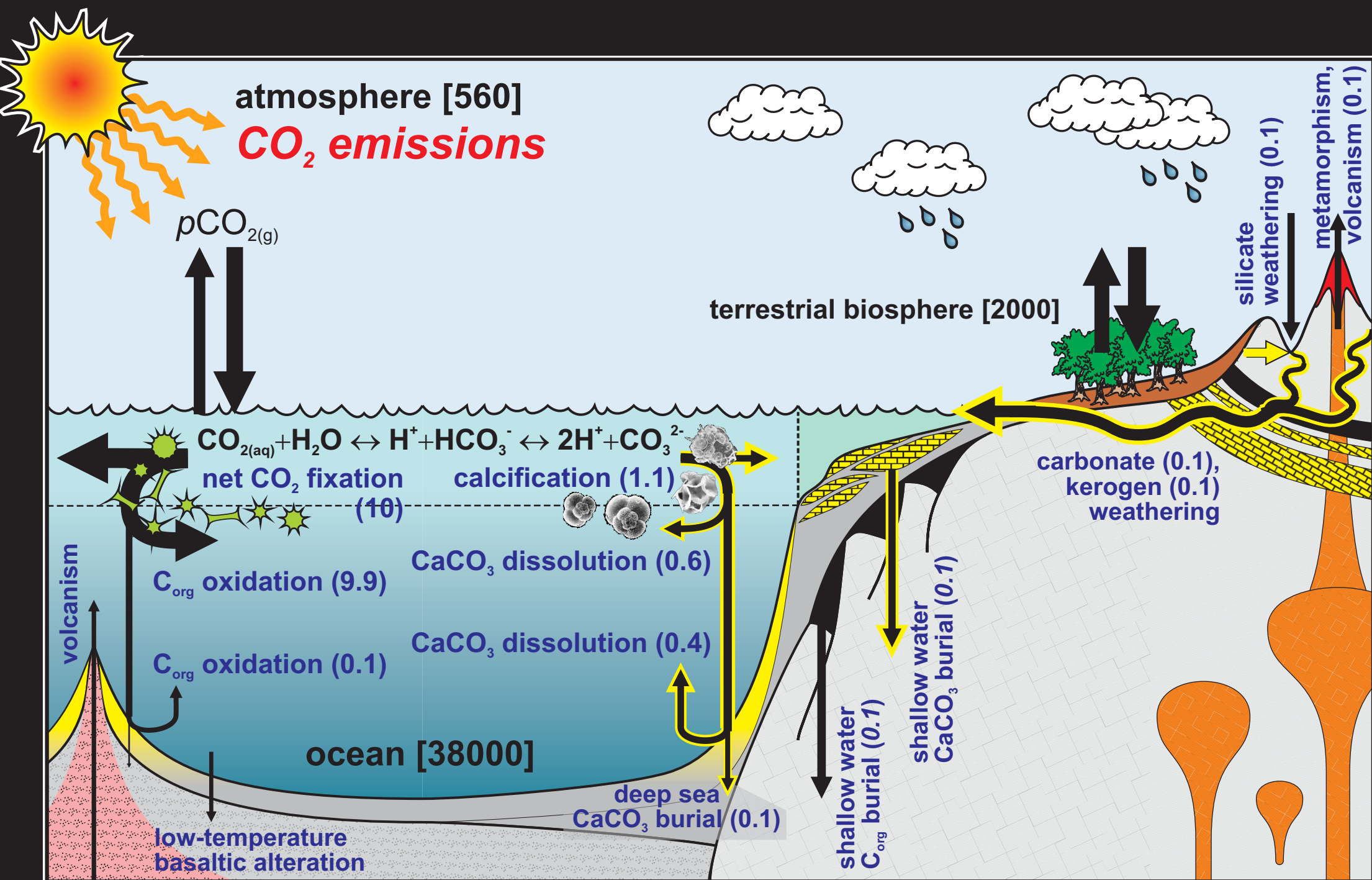


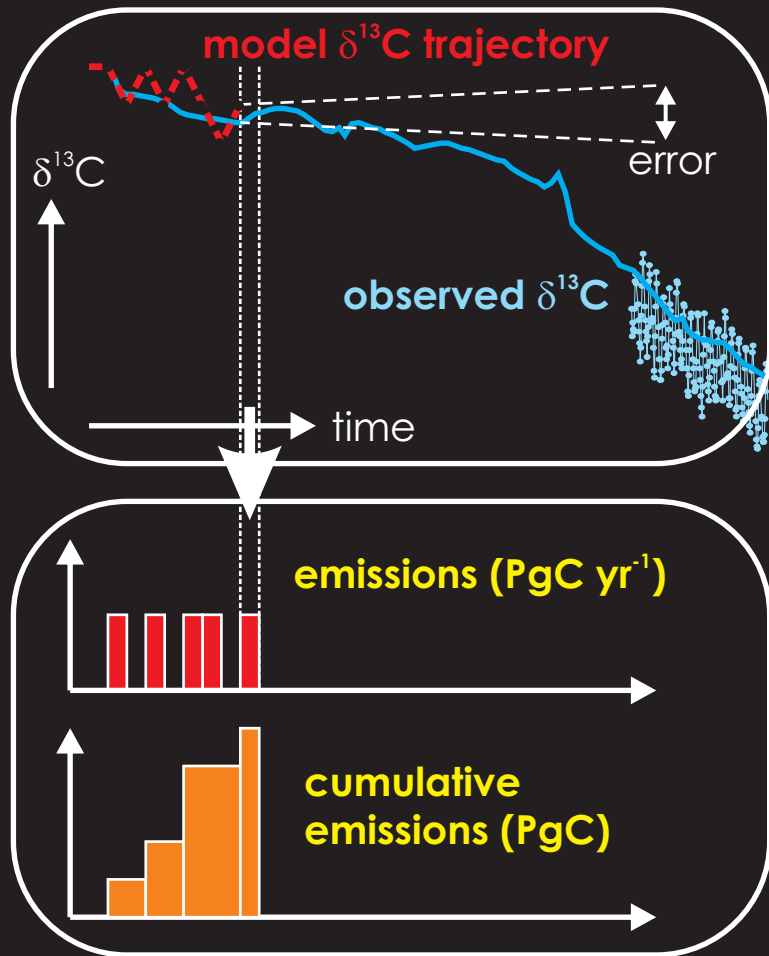


Contours of carbon release vs. source isotopic signature for a global  $-4\text{‰}$  carbon isotopic excursion. Contours differ according to the initial mean global  $\delta^{13}\text{C}$ .

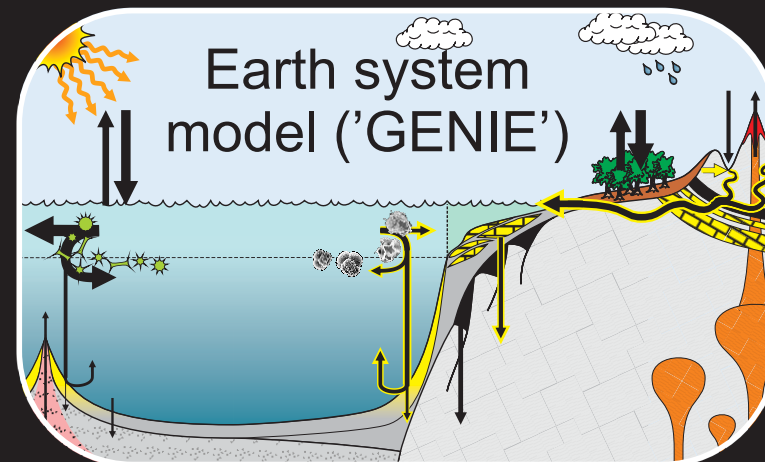
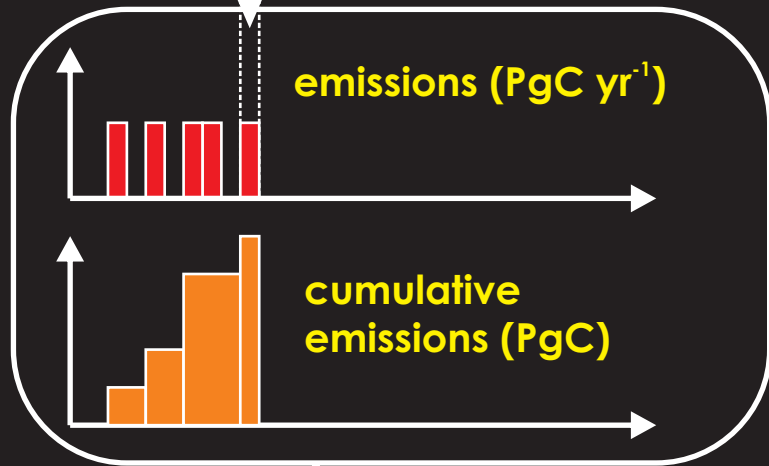
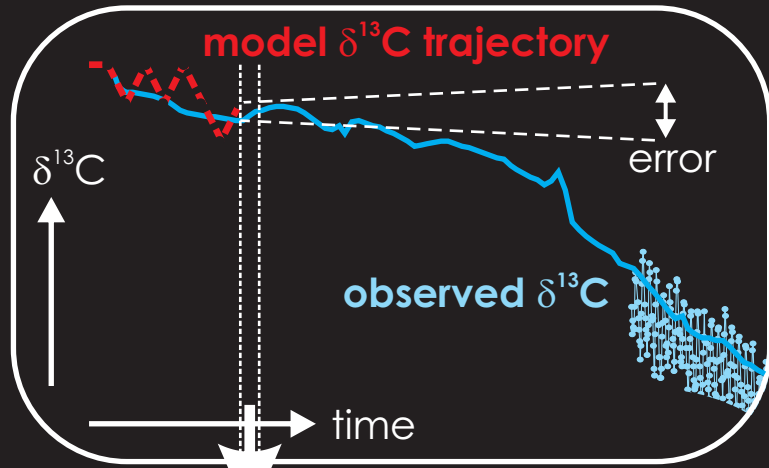
# muffin application: Paleocene-Eocene Thermal Maximum

Computer models and other baked goods





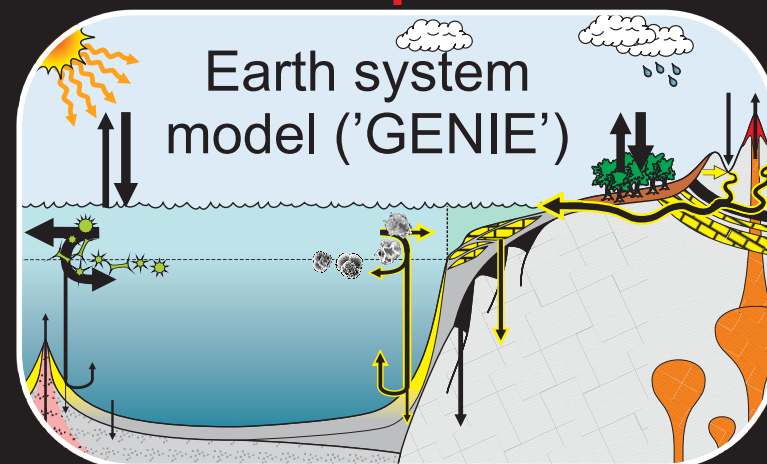
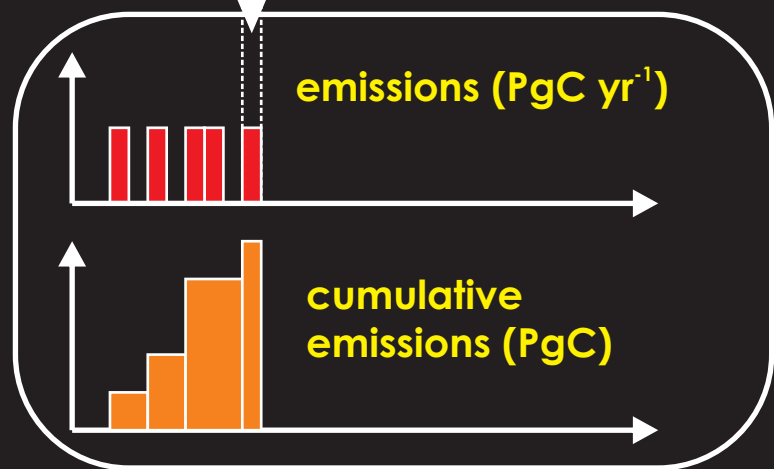
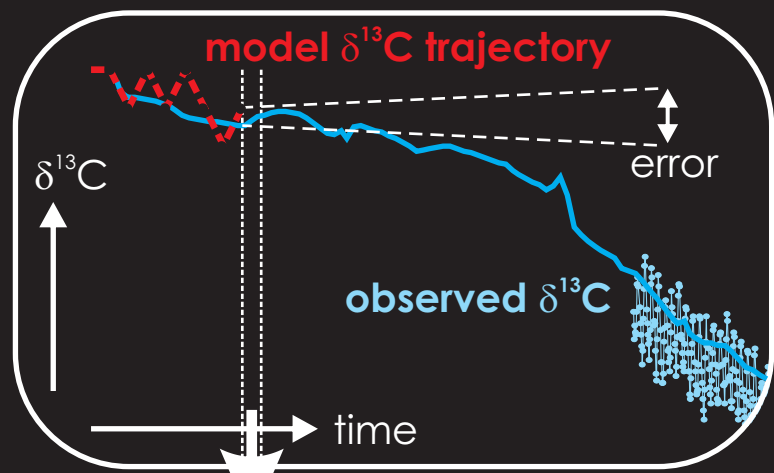
1. Calculate model-data error at a weekly time-step:  
too high  $\Rightarrow$  emit carbon  
'OK'  $\Rightarrow$  do nothing  
(too low  $\Rightarrow$  remove carbon)



2. If  $\text{CO}_2$  emissions required:  
Add  $\text{CO}_2$  to atmosphere  
in an Earth system model

assume:  
 $\delta^{13}\text{C}$  signature  
of fossil fuels  
for emissions

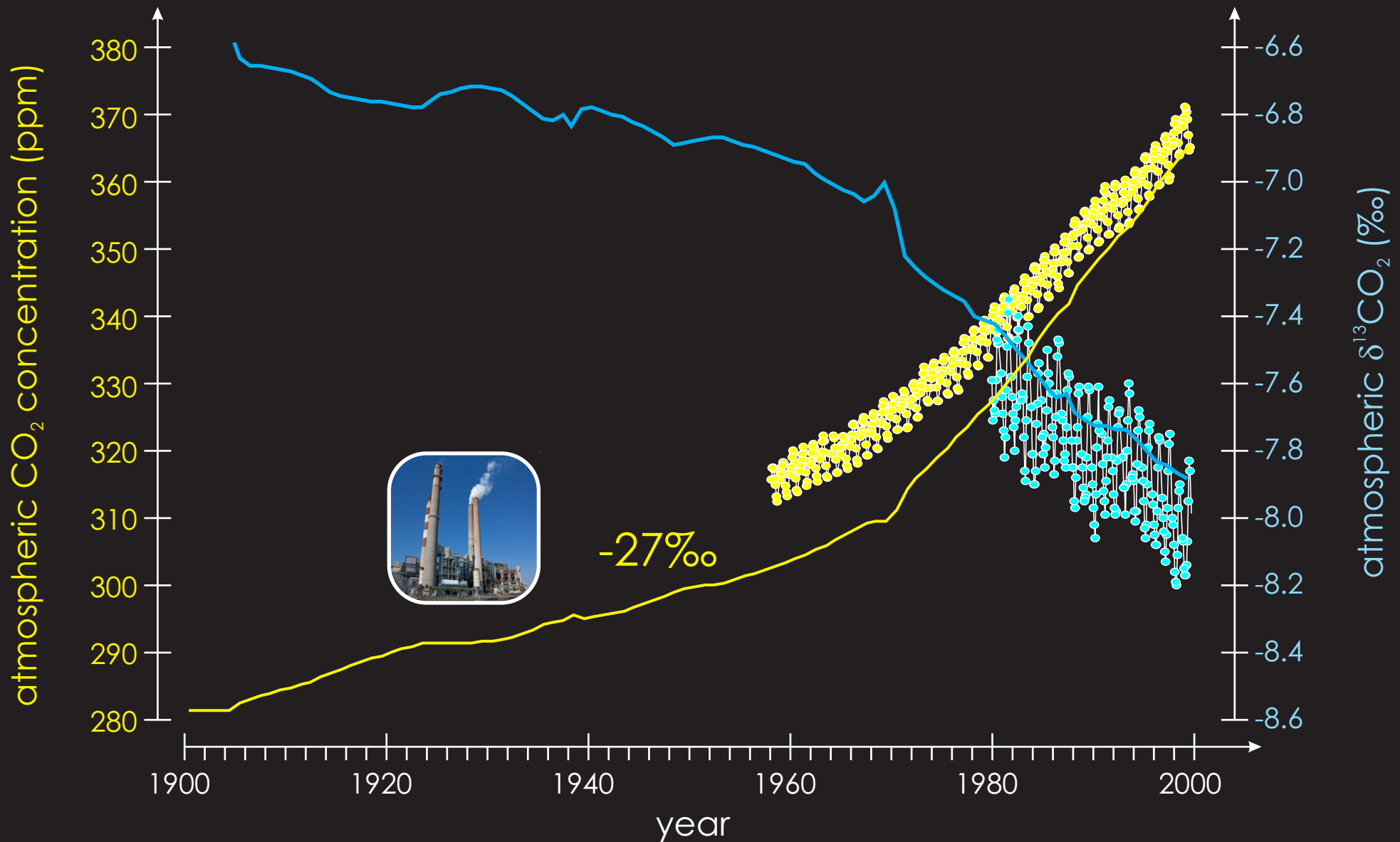




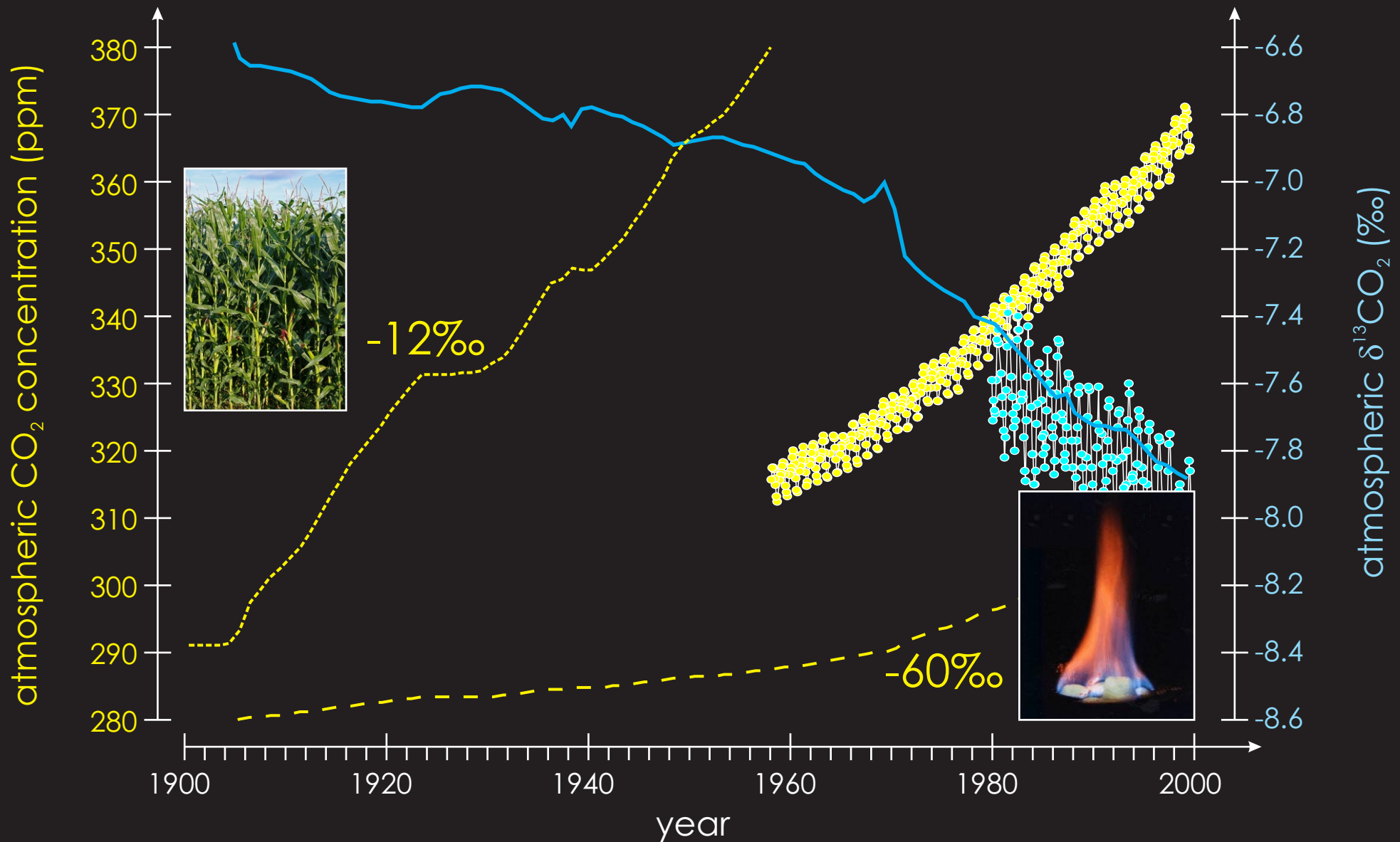
3. Calculate new atmospheric  $\text{CO}_2$   $\delta^{13}\text{C}$  value in model  
**<REPEAT>**

assume:  
 $\delta^{13}\text{C}$  signature  
of fossil fuels  
for emissions



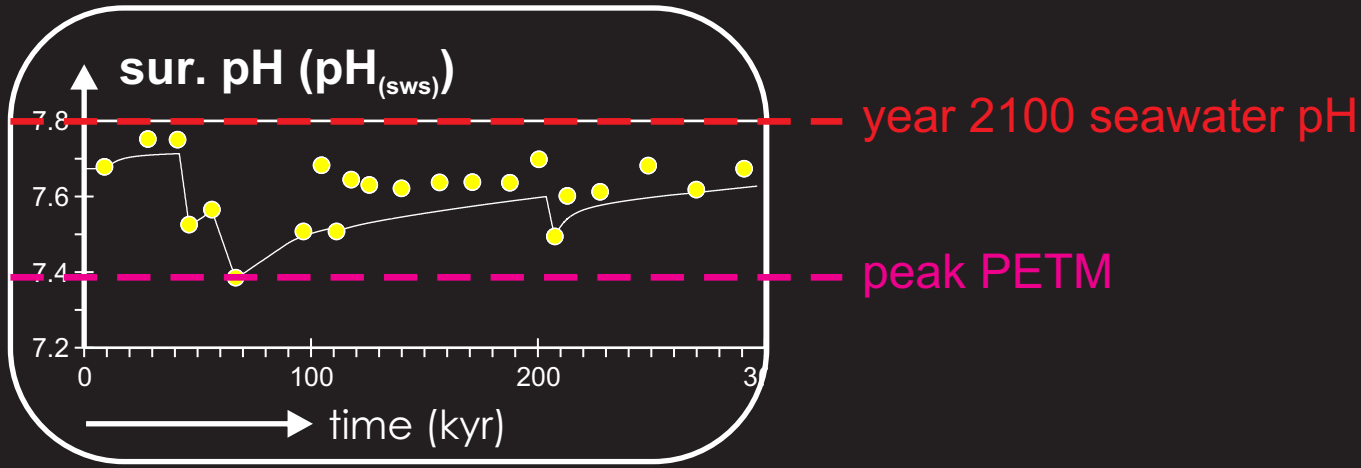


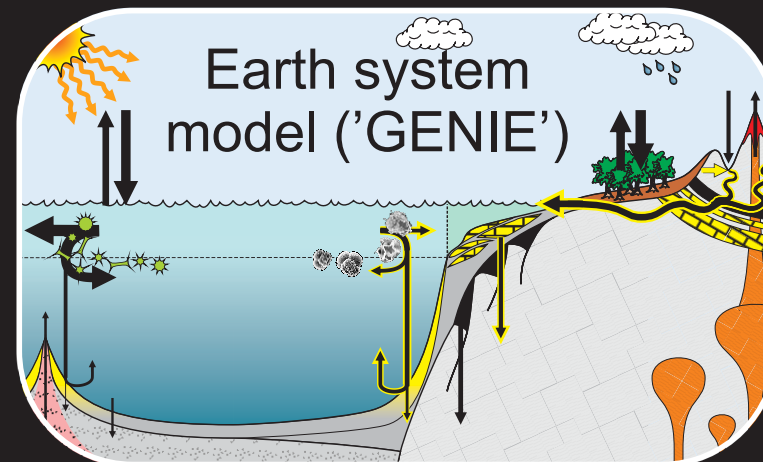
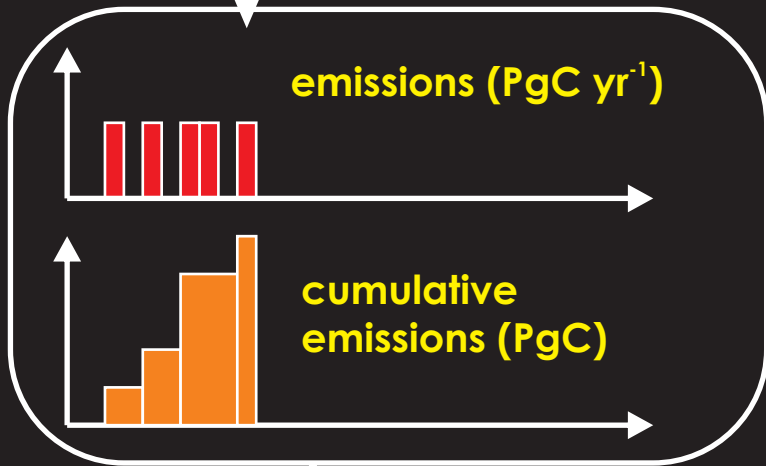
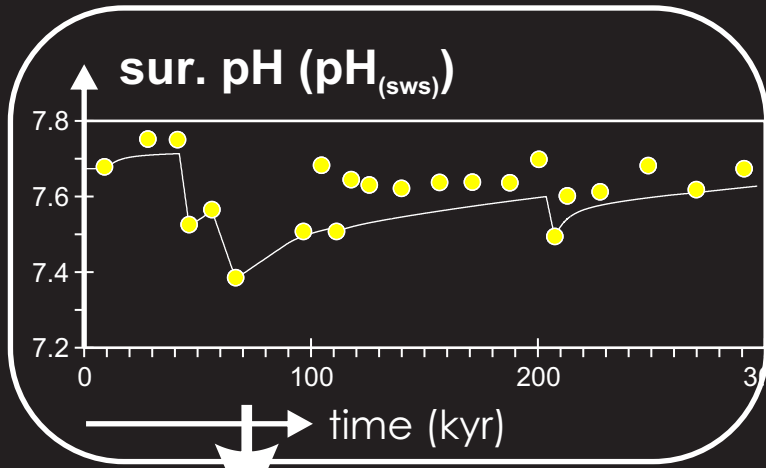


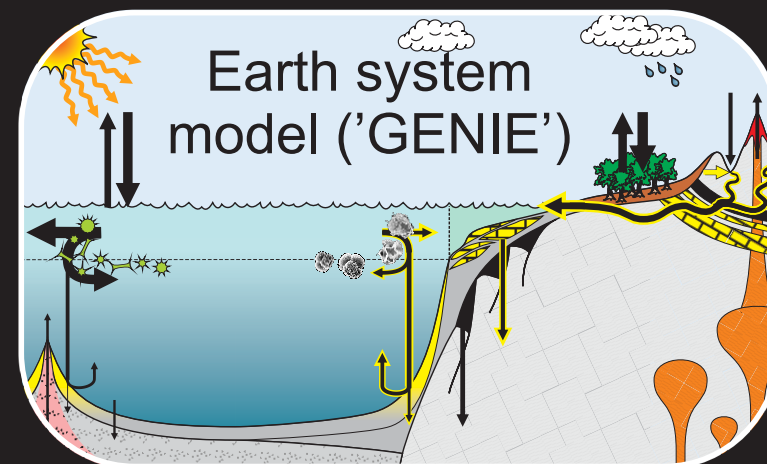
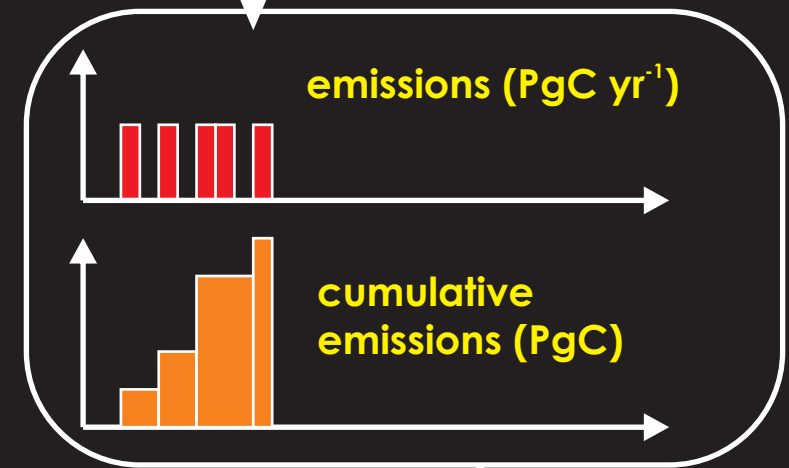
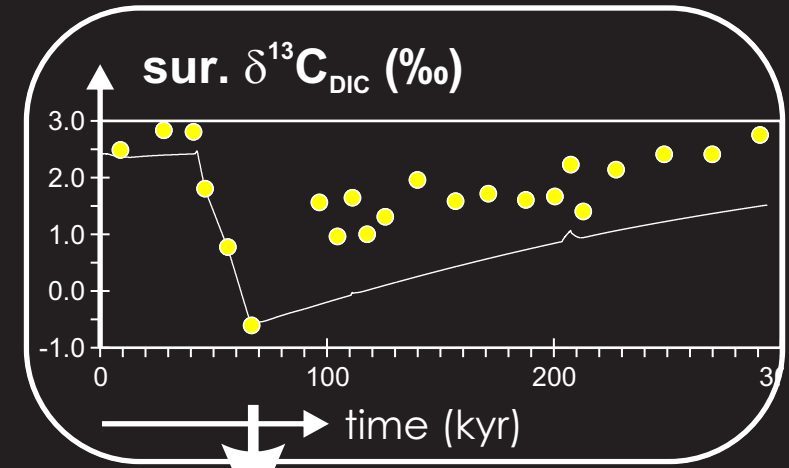


# muffin application: Paleocene-Eocene Thermal Maximum

Computer models and other baked goods

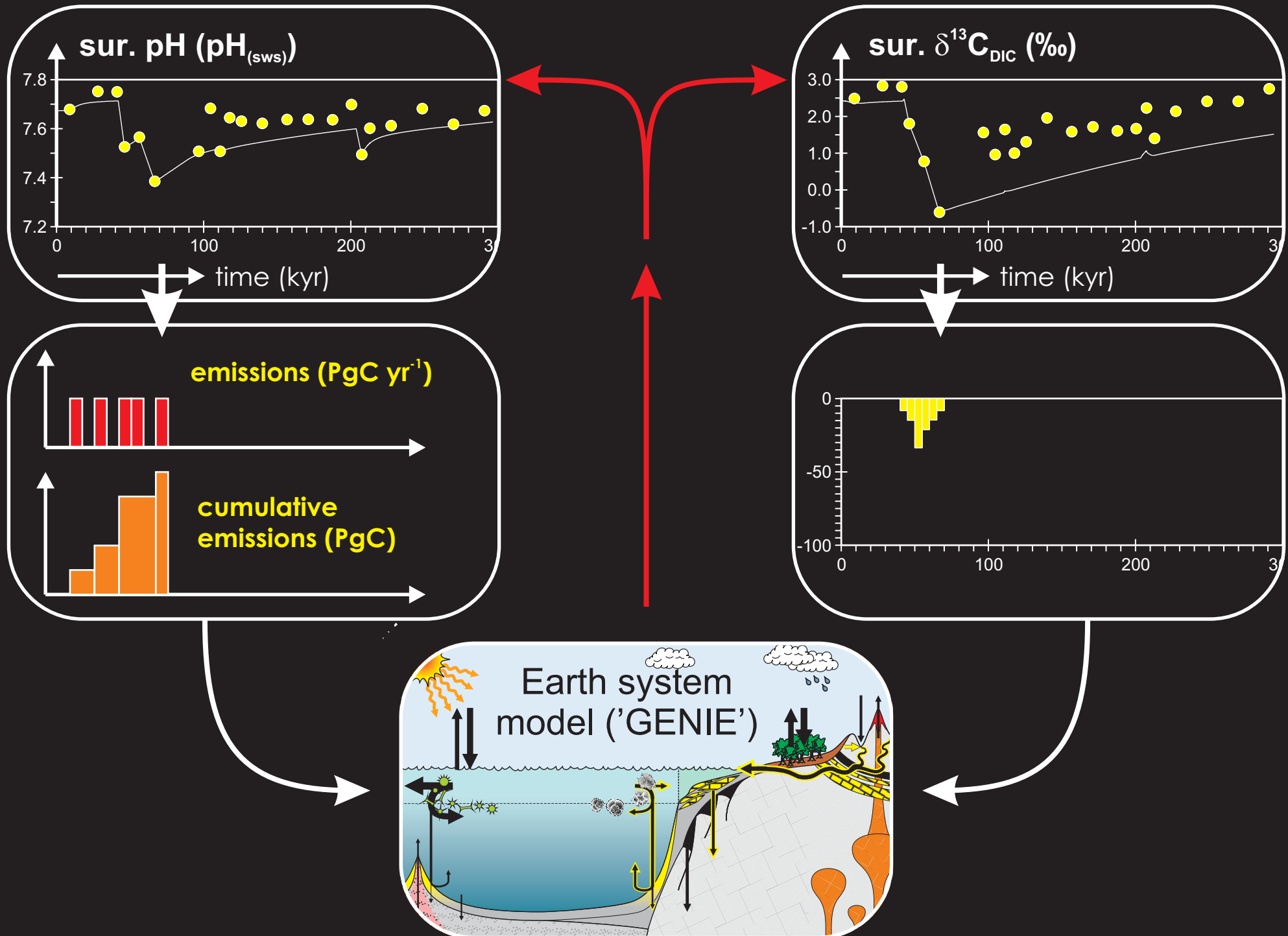


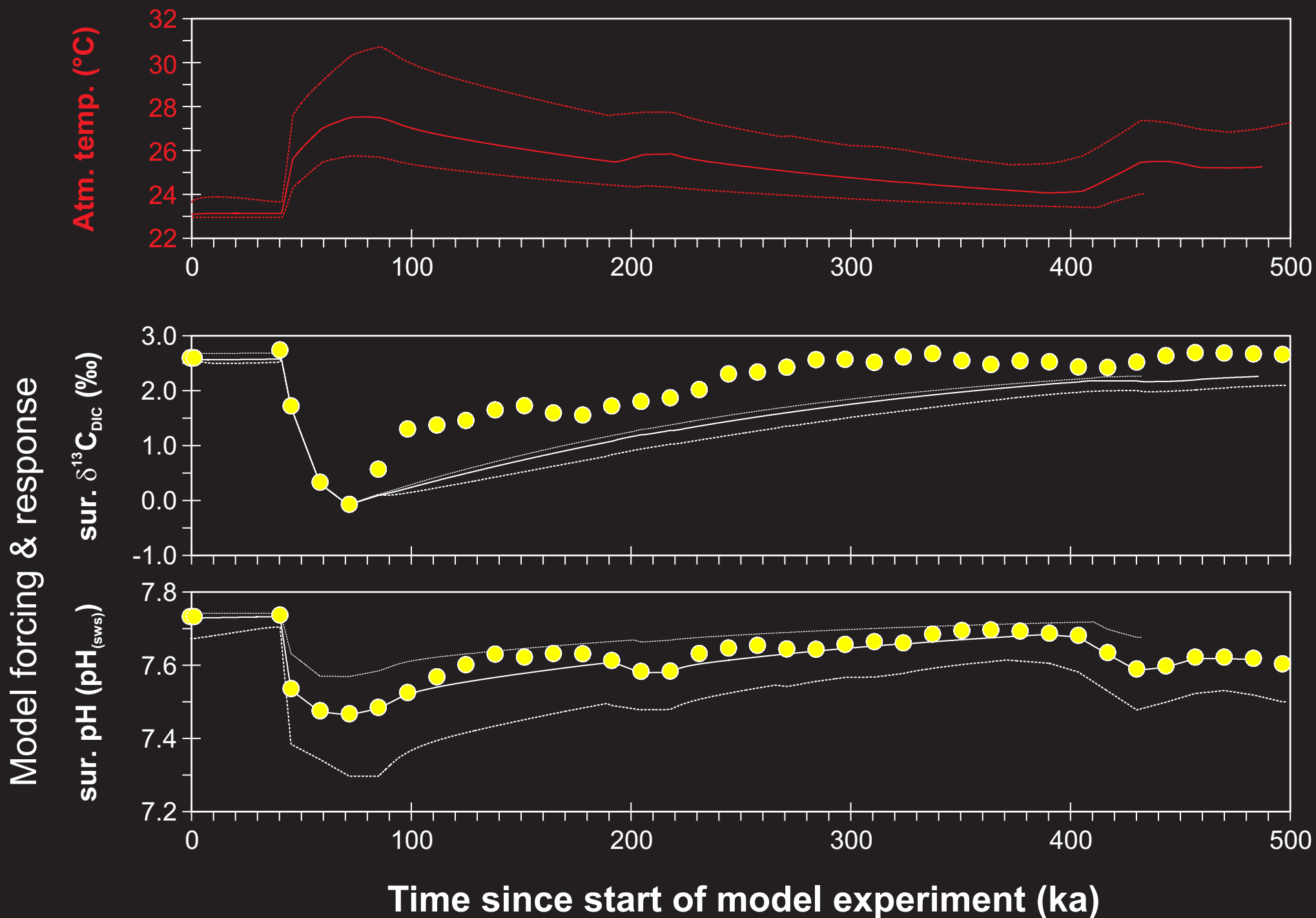


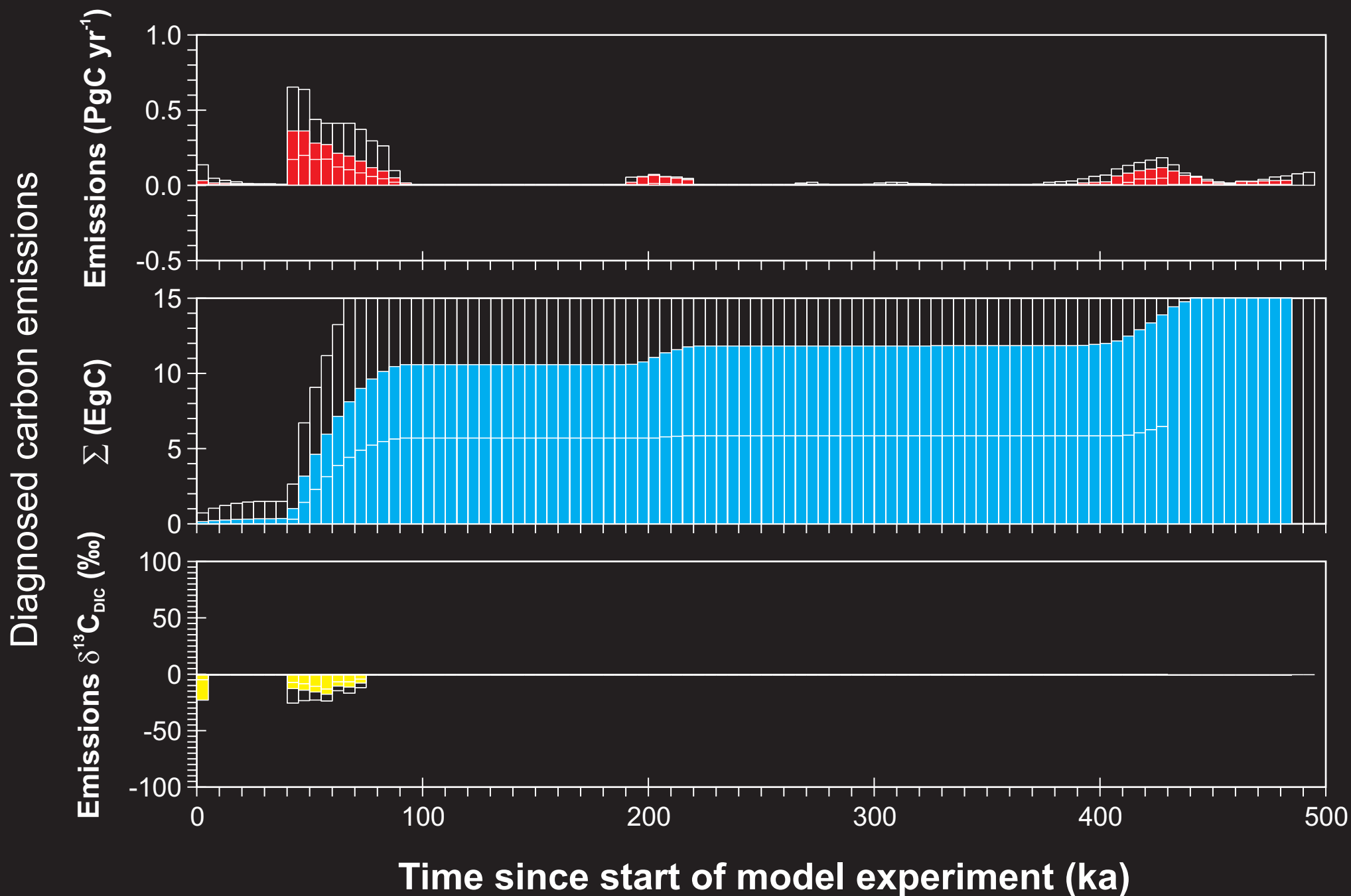


# muffin application: Paleocene-Eocene Thermal Maximum

Computer models and other baked goods







## issues

- \* continued use of FORTRAN77 code, e.g. preventing compile-time array dimensioning
- \* netCDF installation issues (partly an issue of the use of C++ code in the netCDF comparison model 'test')
- \* linux-only (a problem?) (actually, can also now be natively on a Mac)
- \* non-intuitive construction of experiments
- \* limited applicability in teaching due to linux and command-line basis of the model





cupcake

Computer models and  
other baked goods



## major changes

- \* code management under `git` (not `svn`), so has lost its explicit historical link with 'GENIE'
- \* conversion to F90 throughout
- \* progress towards all run-time dimensioning of arrays (and no need for re-compilation)
- \* simpler directory structure and job creation/submission
- \* xml removed (and hence no need for python xml libraries (and hence a simpler install))
- \* cross platform support ... can be run under linux/MacOS/Windows



## *to-do*

- \* thorough performance profiling and optimization
- \* on-line /off-line matrix transport option (eventually replacing GEMlite)
- \* addition of the Darwin ecosystem model
- \* addition of the PALEOGENiE project 'PAM' (paleo-assembly model)
- \* addition of ECBILT AGCM??
- \* addition of JeDi terrestrial ecosystem model??



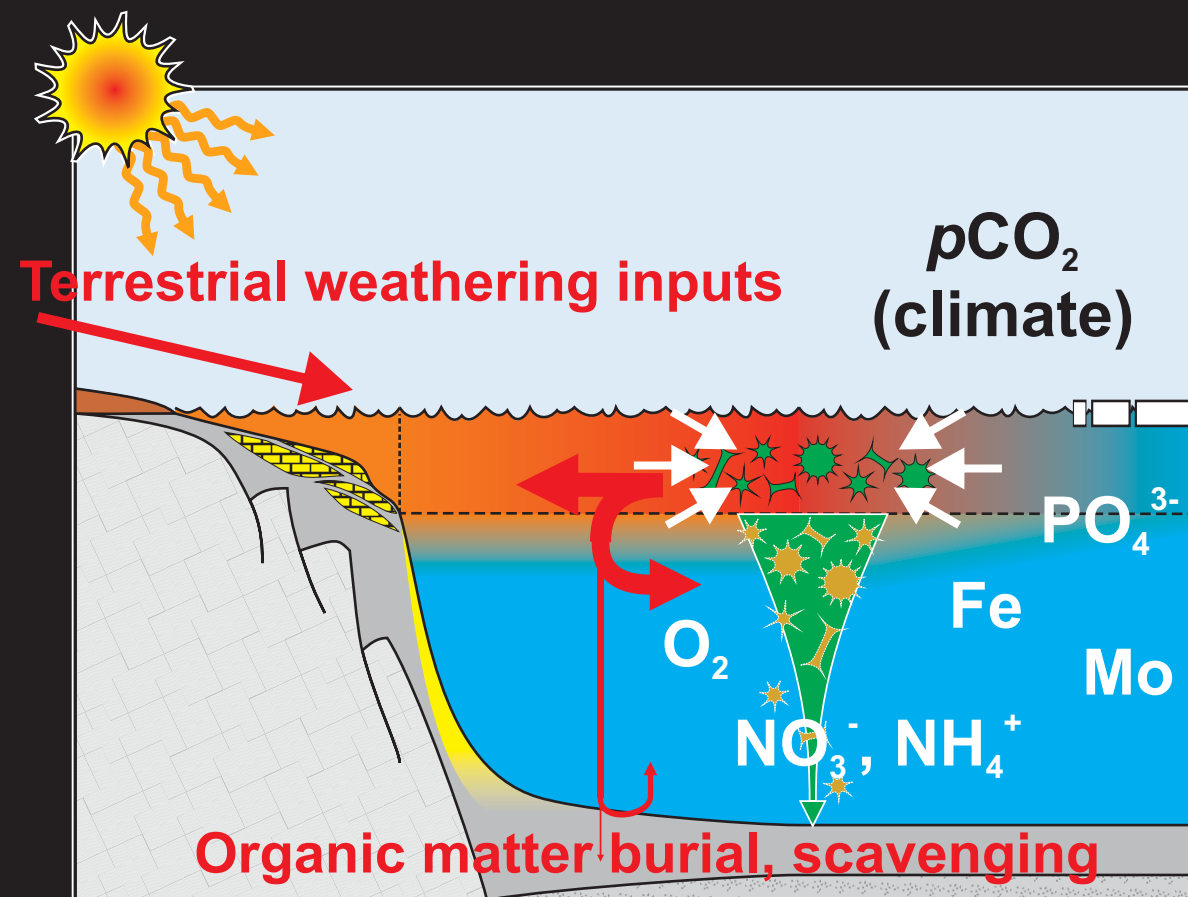
*to-do*

- \* GUI development ... ?



The nature marine ecosystems and strength of biological productivity and remineralization affects:

- ★ Oceanic macros nutrient inventories, esp. P and the form of fixed N.
- ★ Ocean oxygenation and hence micro nutrient inventories, esp. Fe – scavenged in an oxic ocean, and Mo – scavenged in a sulphidic ocean.
- ★ Atmospheric  $p\text{CO}_2$  and climate.



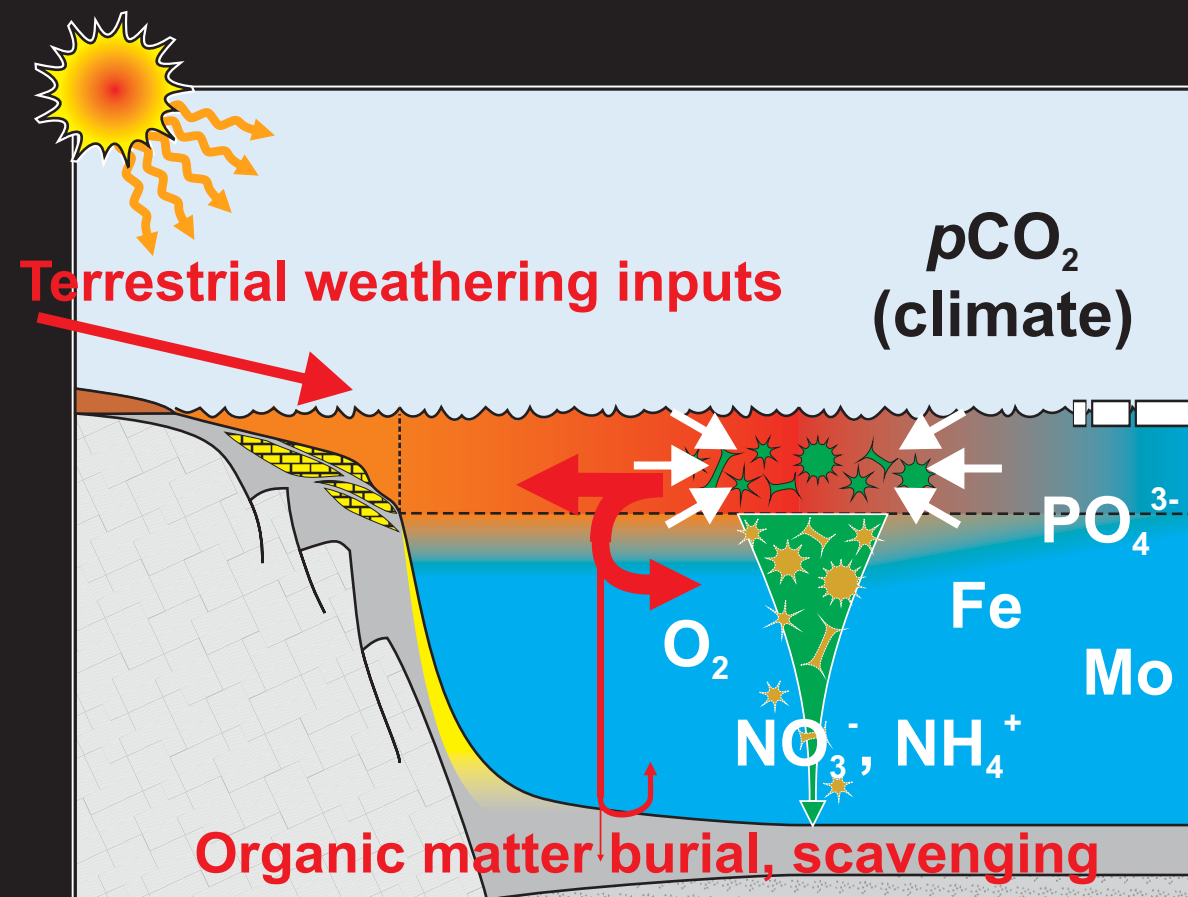
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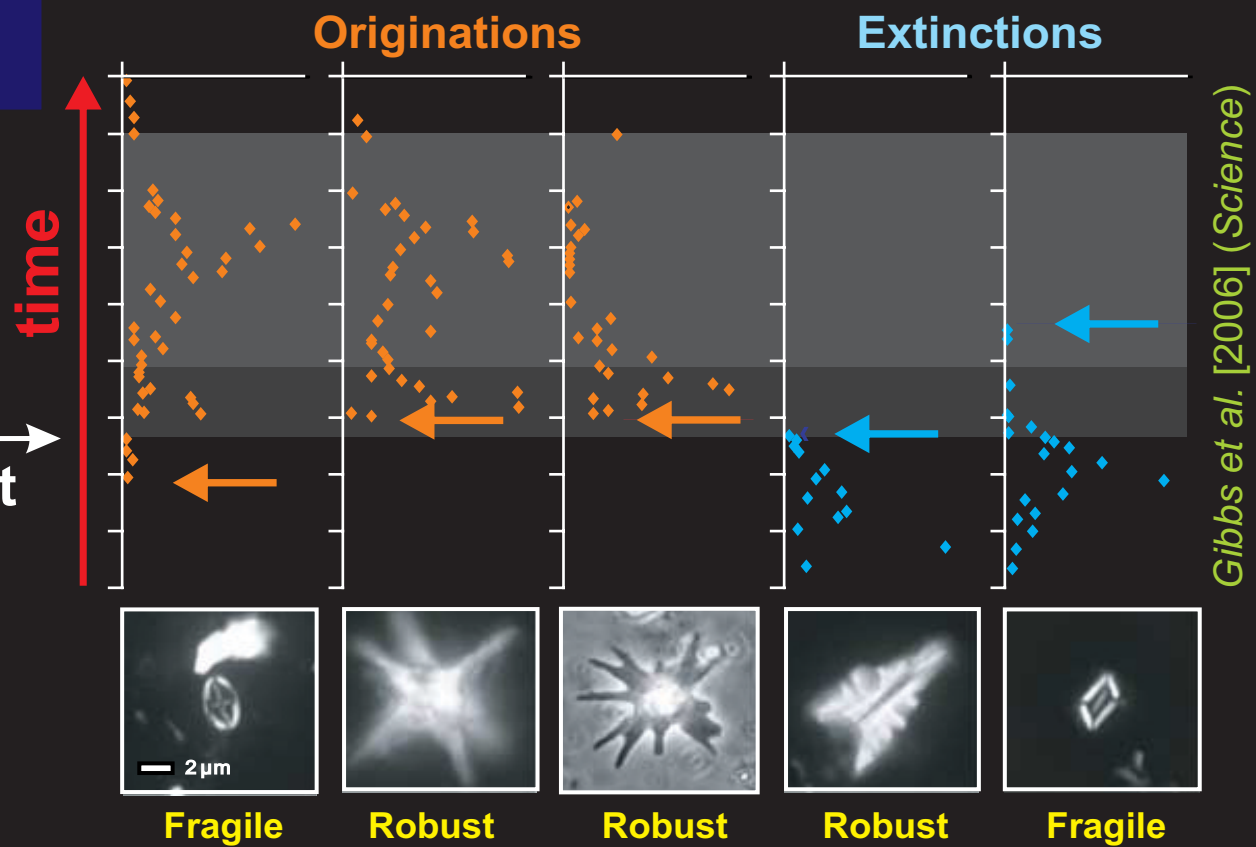
In turn, changes in the physical and biogeochemical (nutrient) environment will affect ecosystem composition and drive selection.

*The approximate coincidence between plankton evolutionary time-scales and the residence time of many of the key ocean and atmospheric tracers raises the possibility of interesting dynamical behaviours of the full system.*

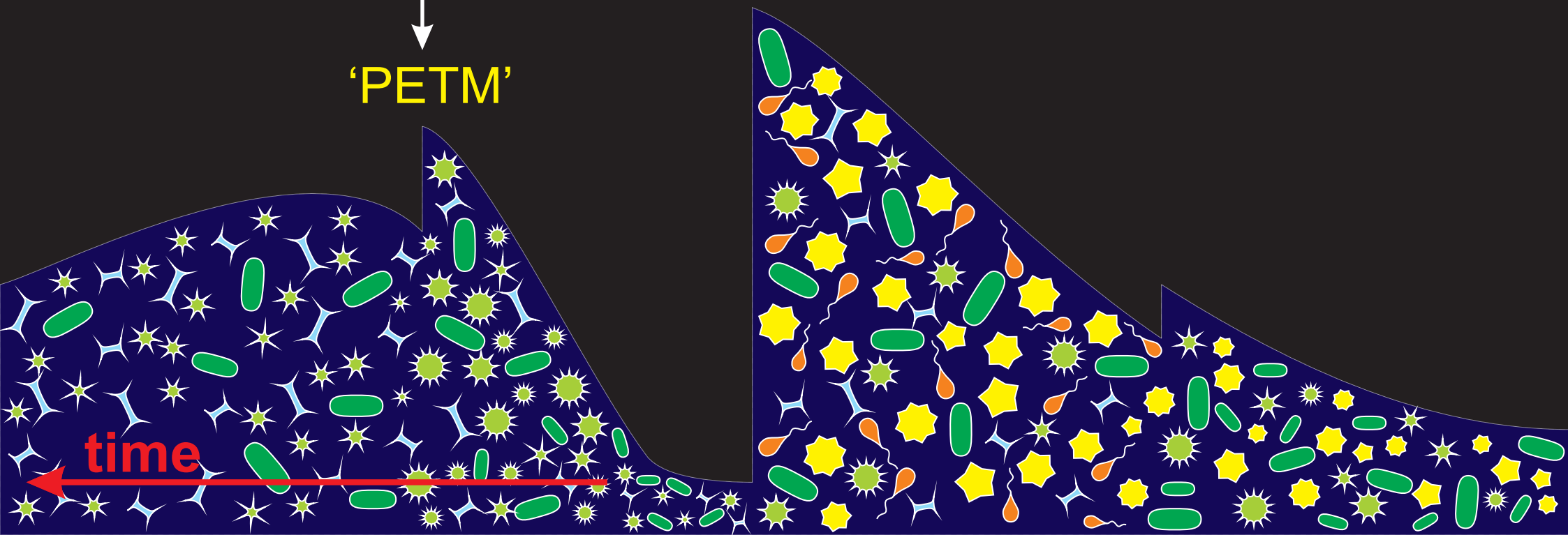
/end speculation



# PALEOGENIE – motivation

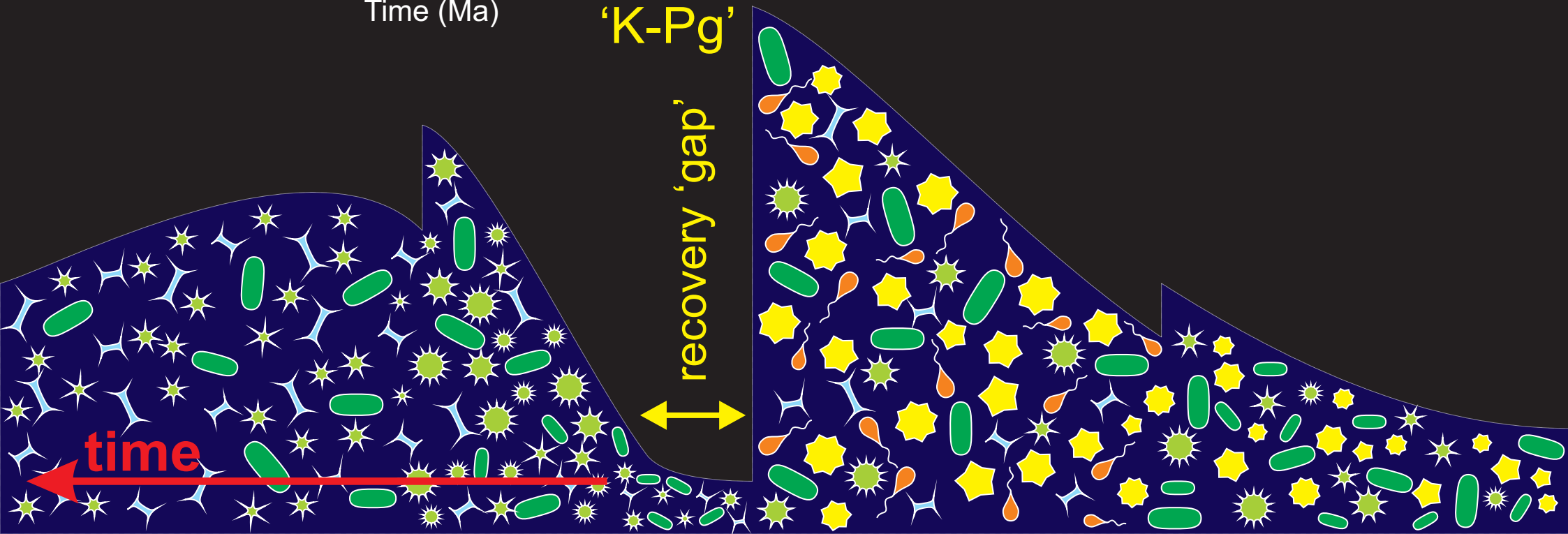
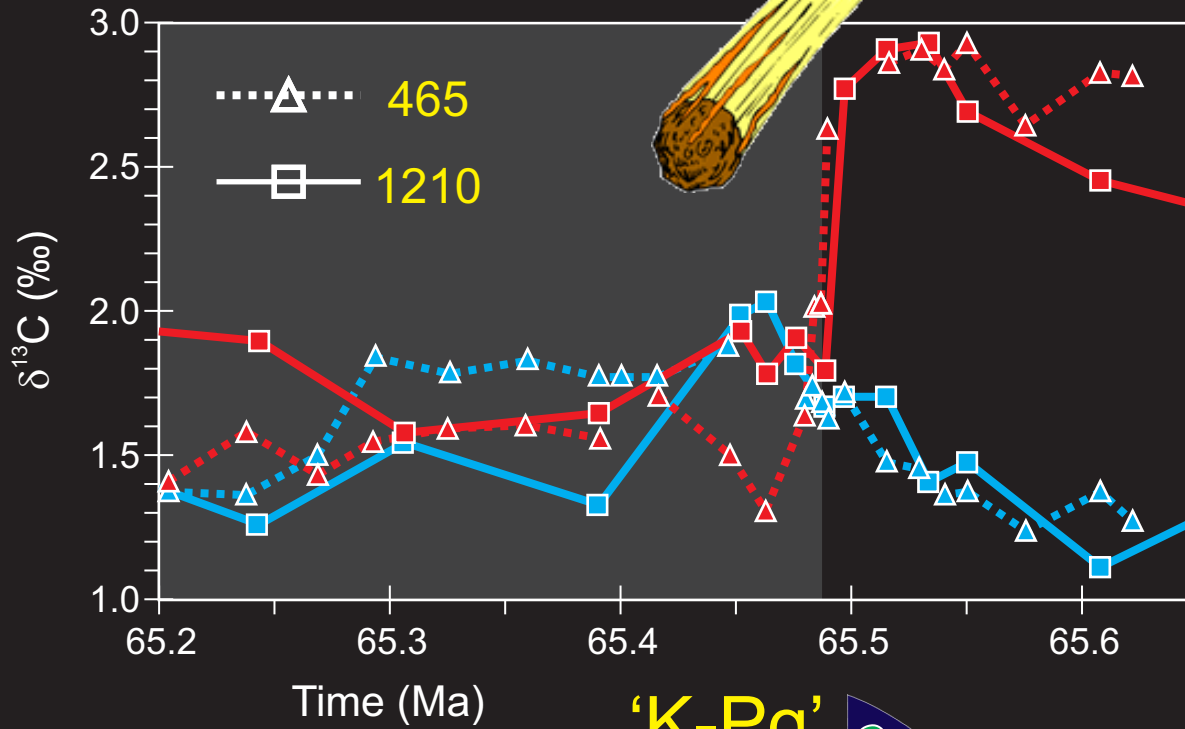


'PETM'



# PALEOGENIE – motivation

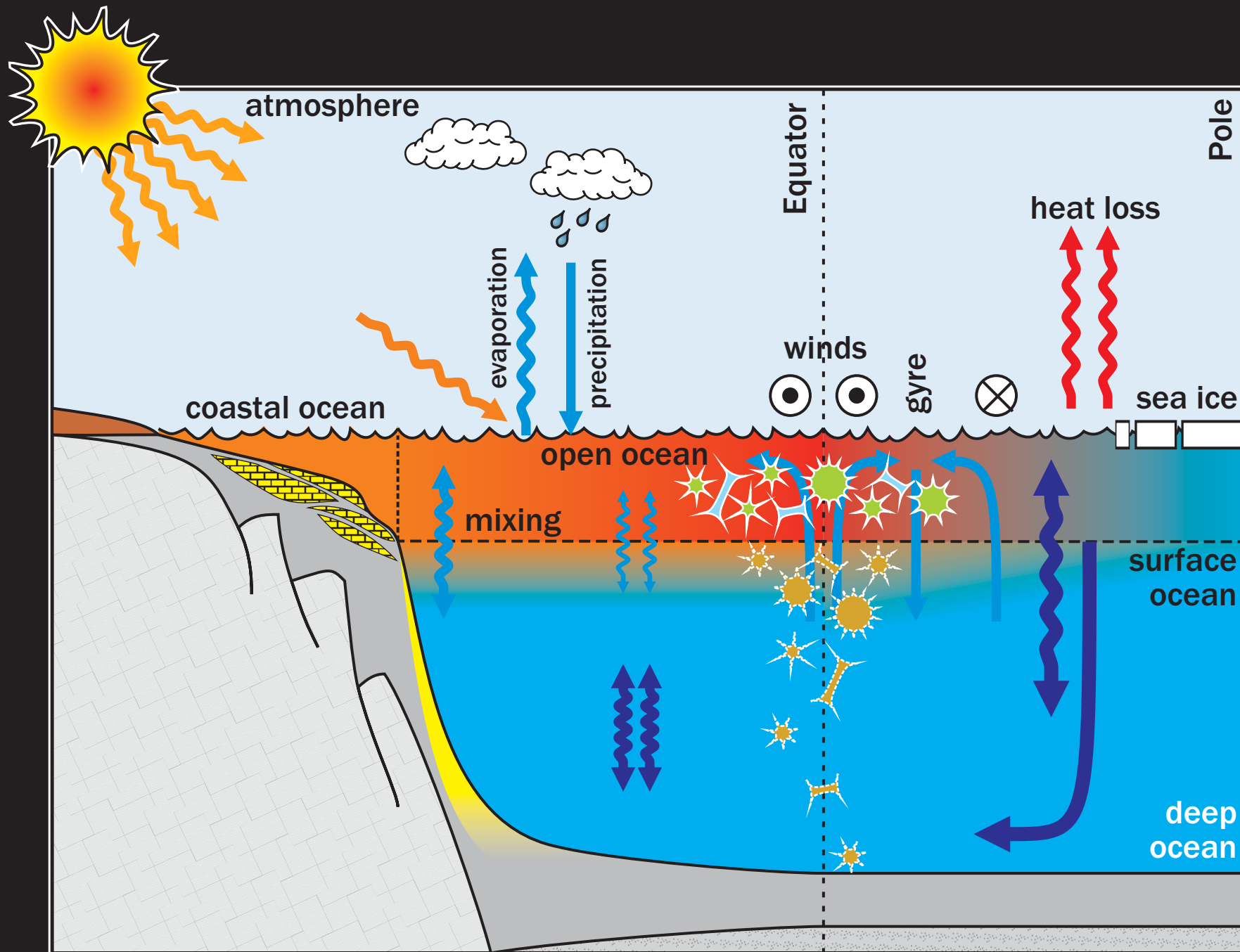
Computer models and other baked goods

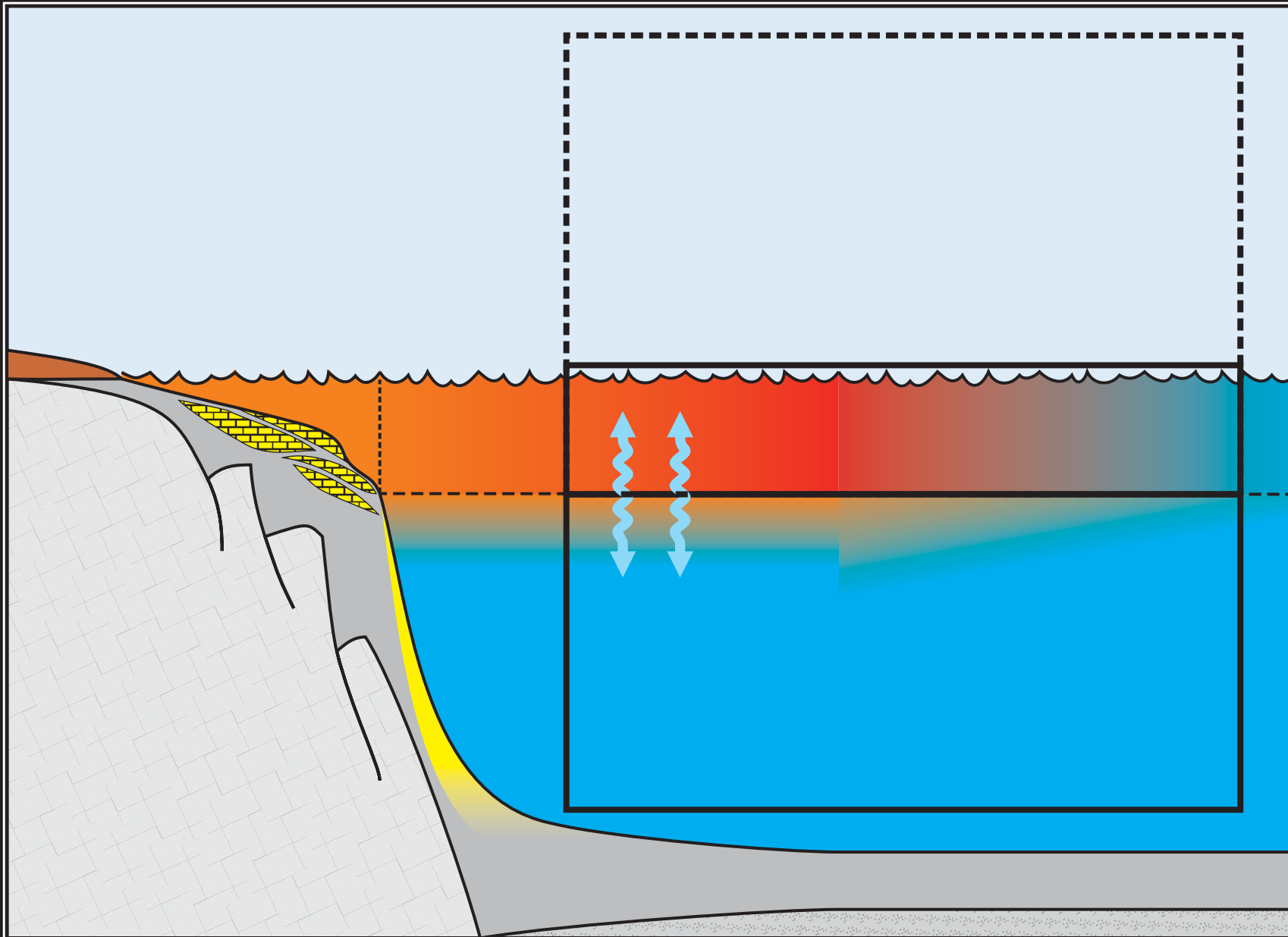




# strategies for modelling complex (marine) systems

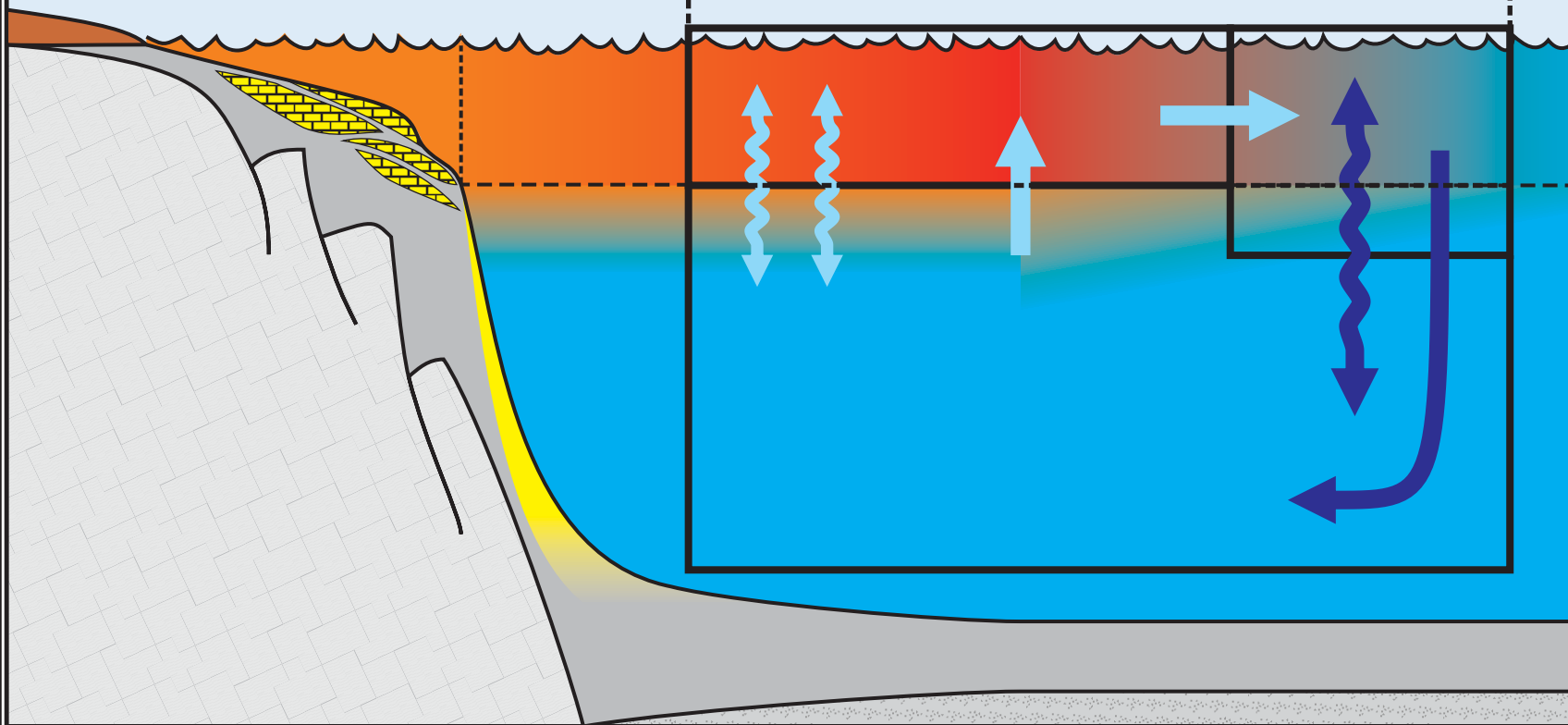
Computer models and other baked goods





*Creating models is effectively, the art of encapsulation of one's understanding (or preconceptions) of a system, numerically.*

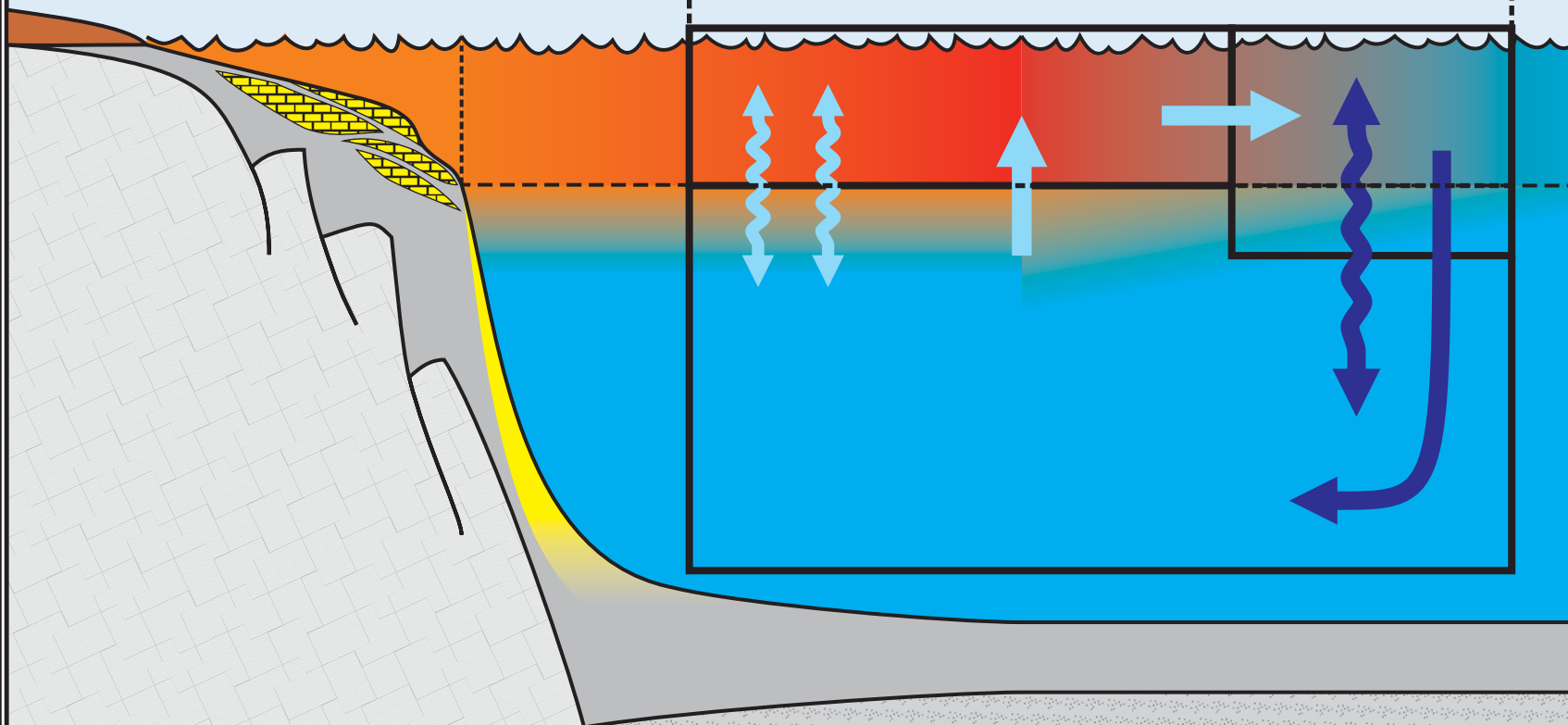
*BUT ...*



What happens under climate change?

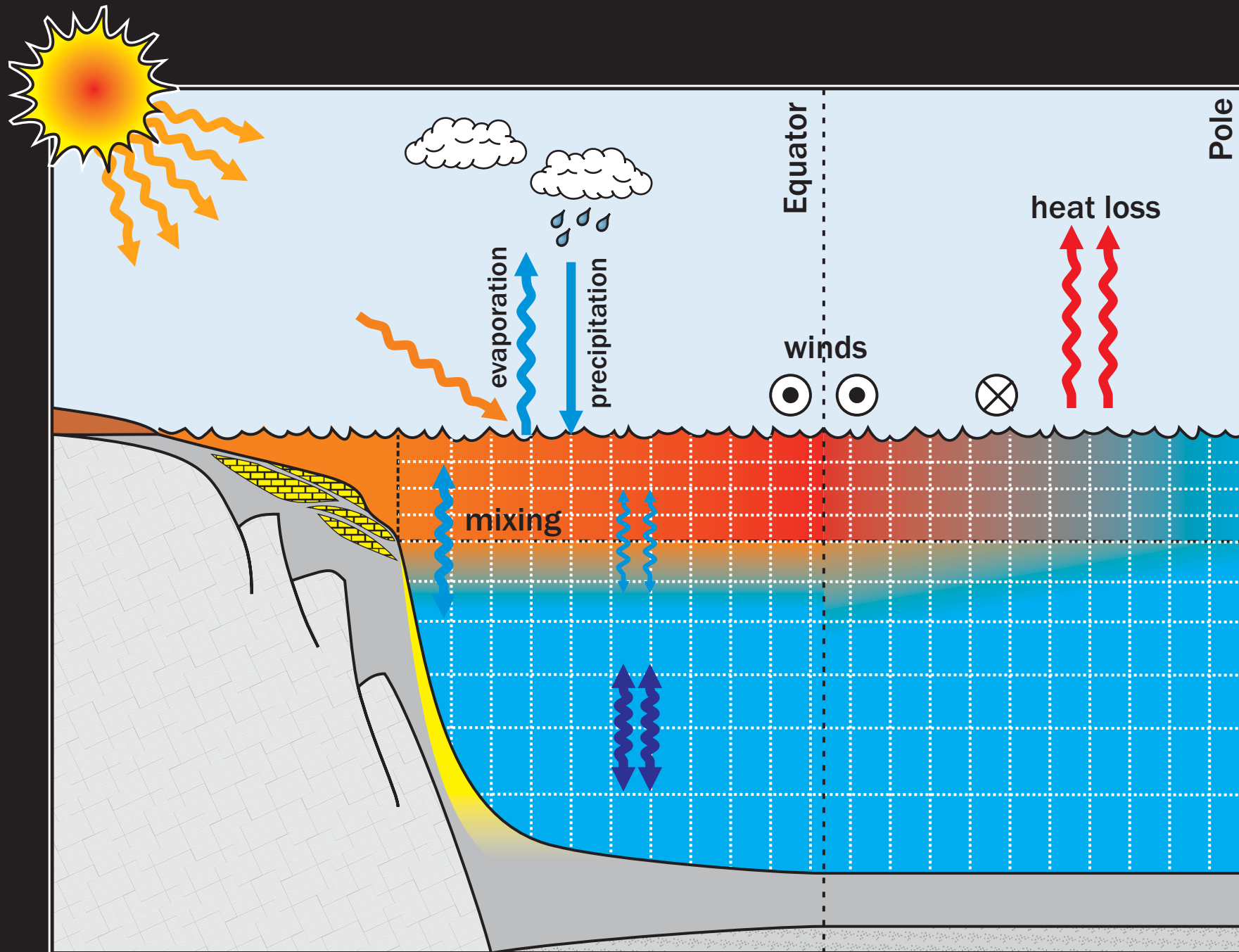
What did the system look like in the past (e.g. Cretaceous)??

What if the structure of the system is not correctly understood???

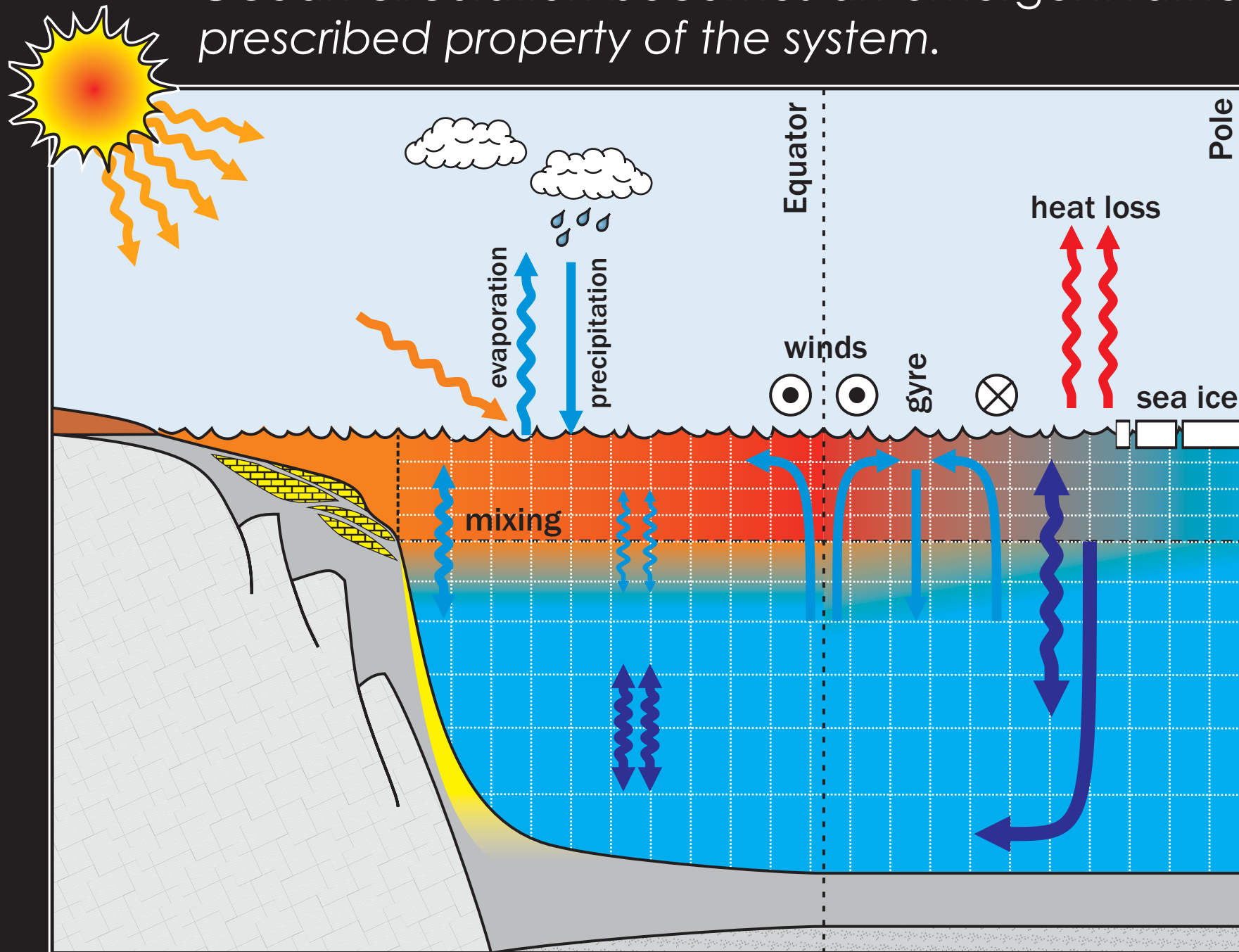


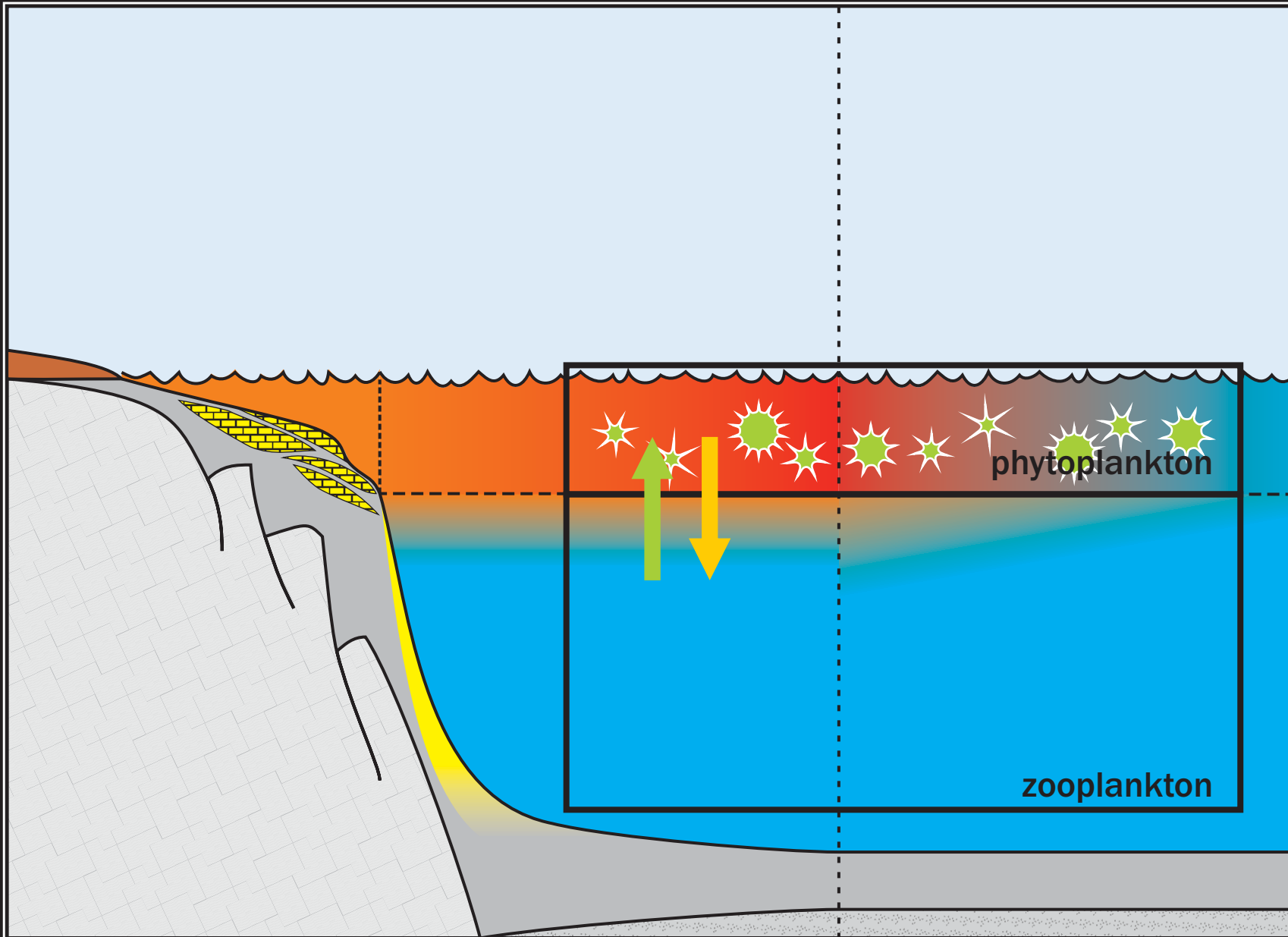
# strategies for modelling complex (marine) systems

Computer models and other baked goods



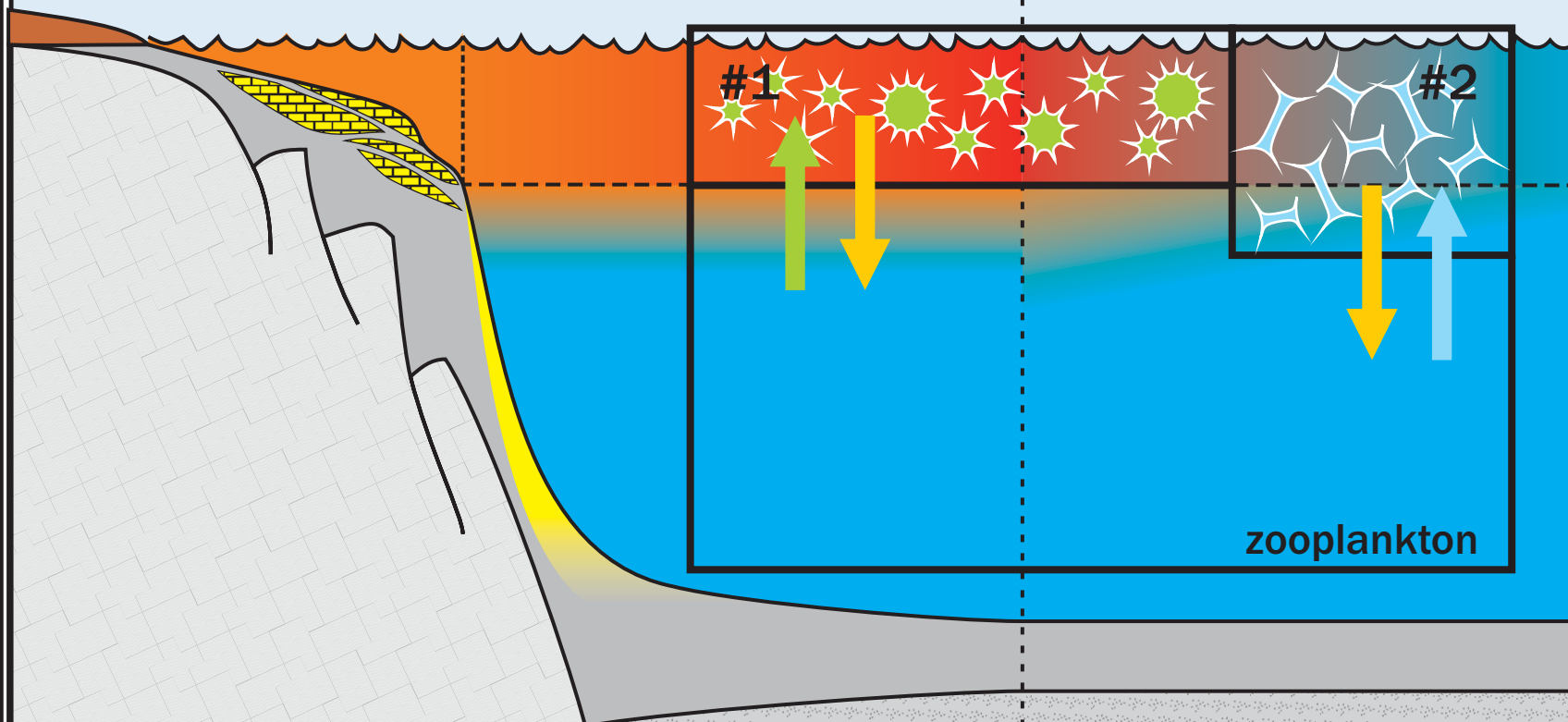
*Ocean circulation becomes an emergent rather than prescribed property of the system.*





*Creating models is effectively, the art of encapsulation of one's understanding (or preconceptions) of a system, numerically.*

*BUT ...*





Again:

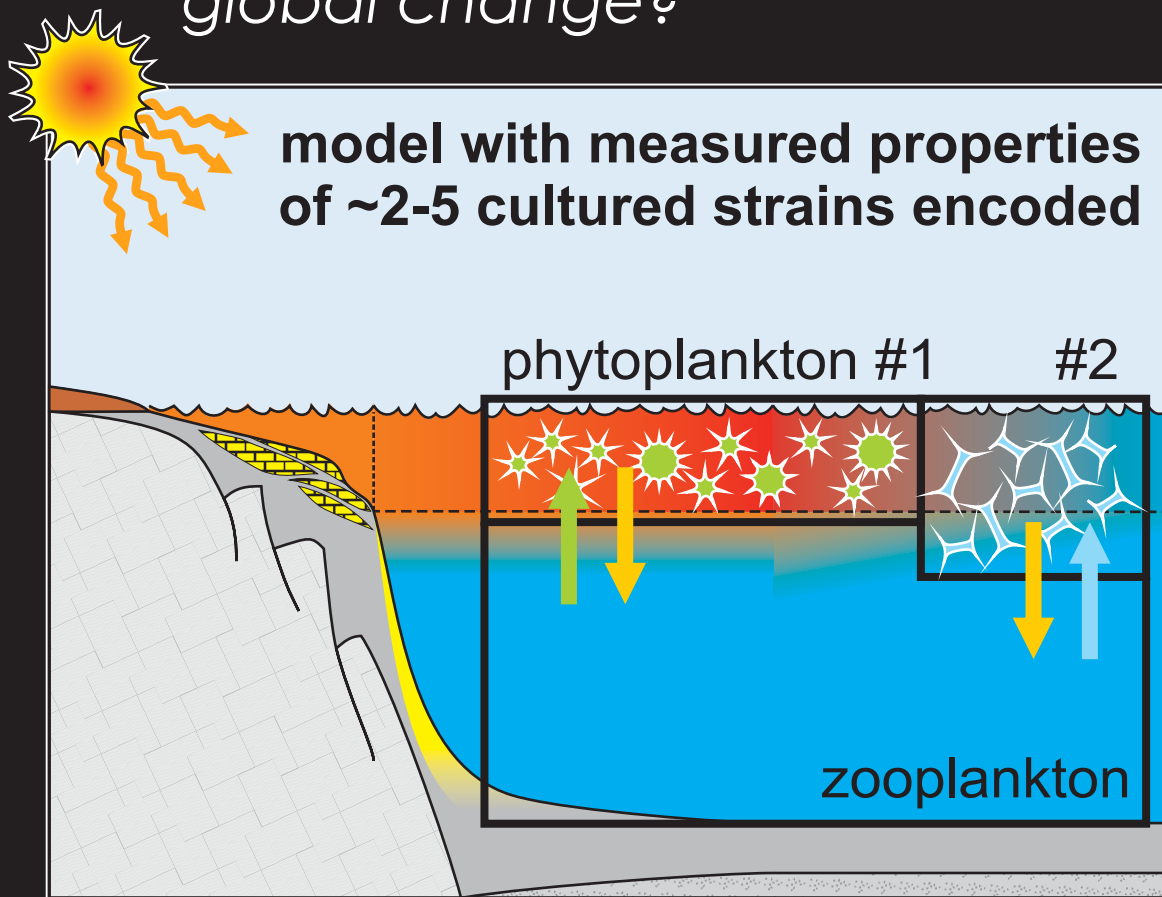
*What happens under climate change?*

*What did the system look like in the past (e.g. Cretaceous)?*

*What if the structure of the system is not correctly understood?*

But also:

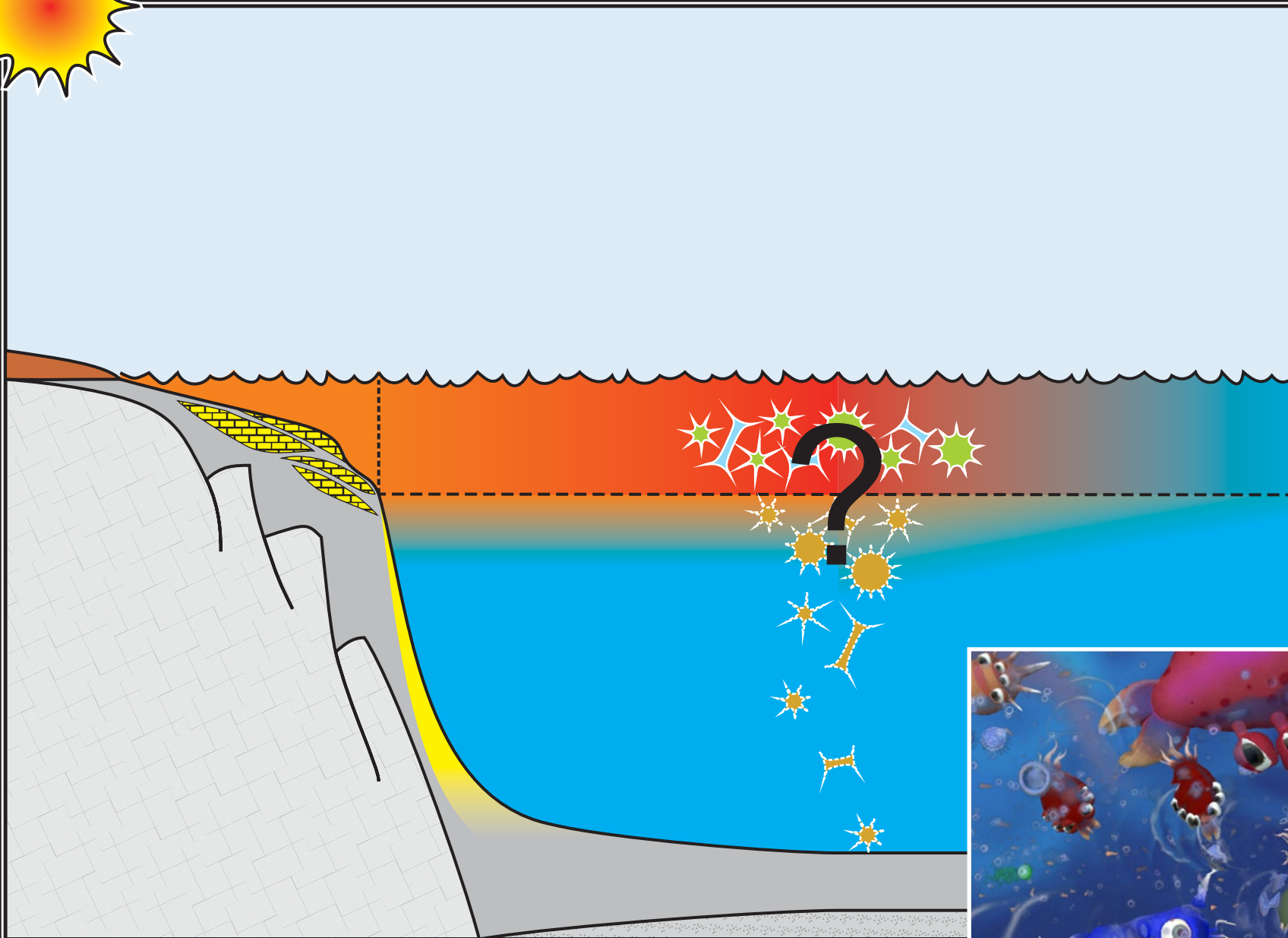
*What about adaptation (or even evolutionary responses) to global change?*

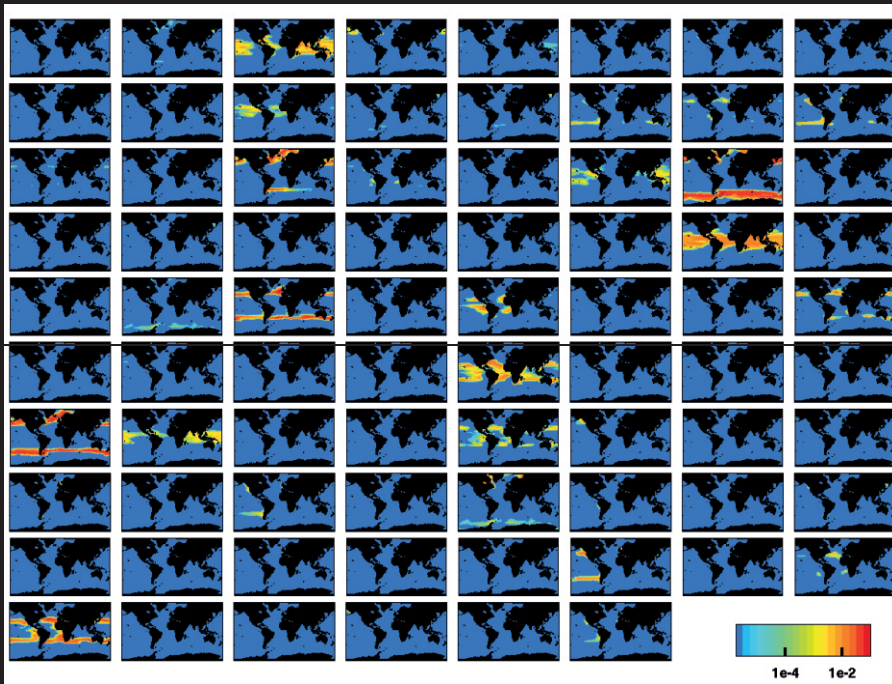
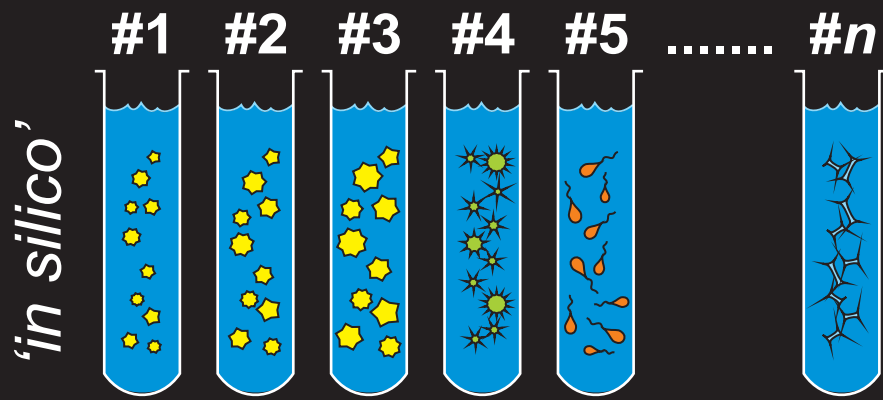


predominantly short-term laboratory  
perturbation experiments



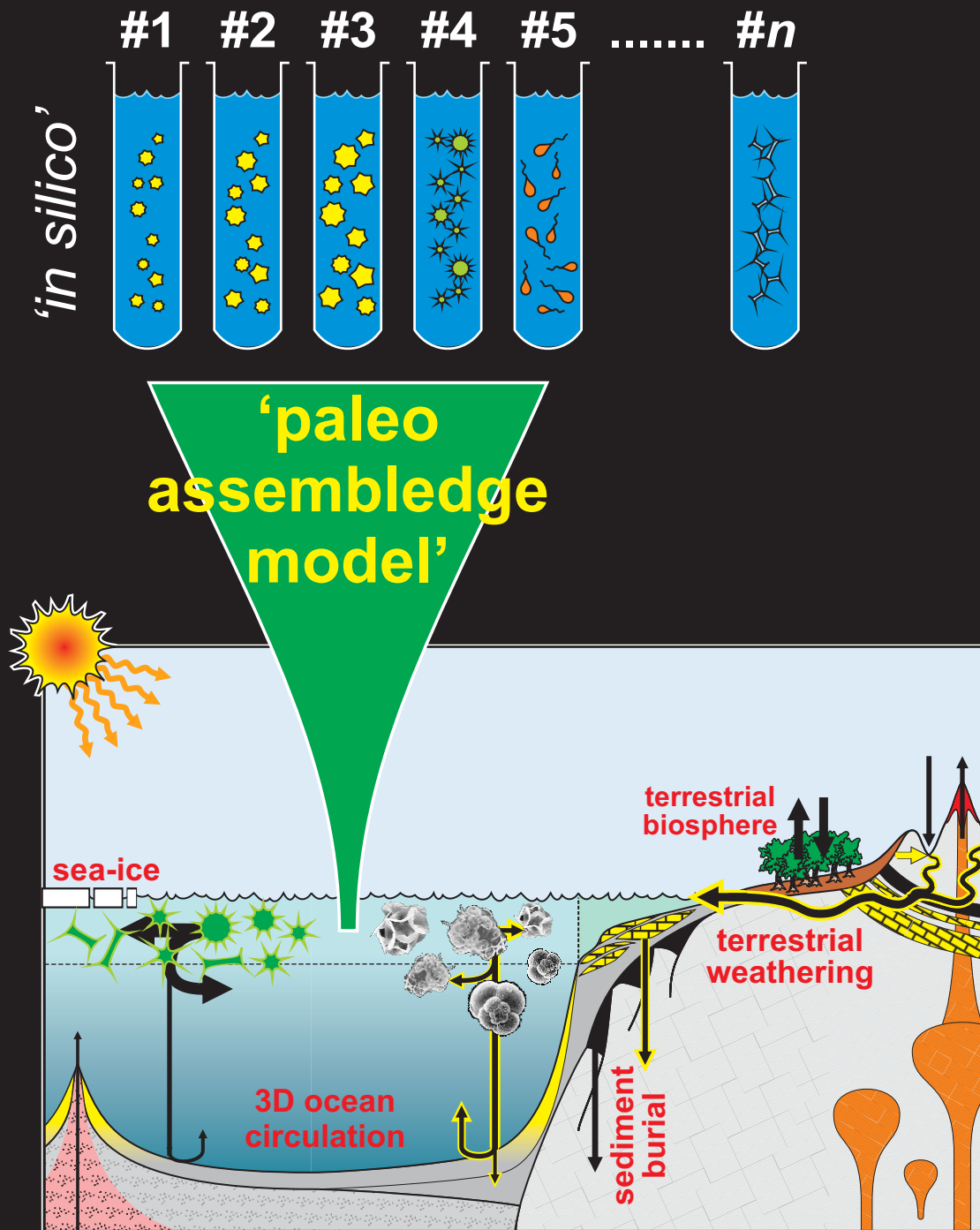
*(Ocean) General Ecological Models? (O-GEMs?)*





## Marine ecosystems *in silico*:

- ★ The MIT 'Darwin' model typically considered ca.  $n = 76$  randomly-generated trait vectors ('plankton').
- ★ Plankton trait vectors set according to physiological 'rules', e.g. larger cells have a higher nutrient limitation threshold, the ability to fix  $N_2$  comes at the expense of reduced growth rate, etc.
- ★ Plankton compete and the ecosystem is an **emergent** rather than prescribed property. But ...

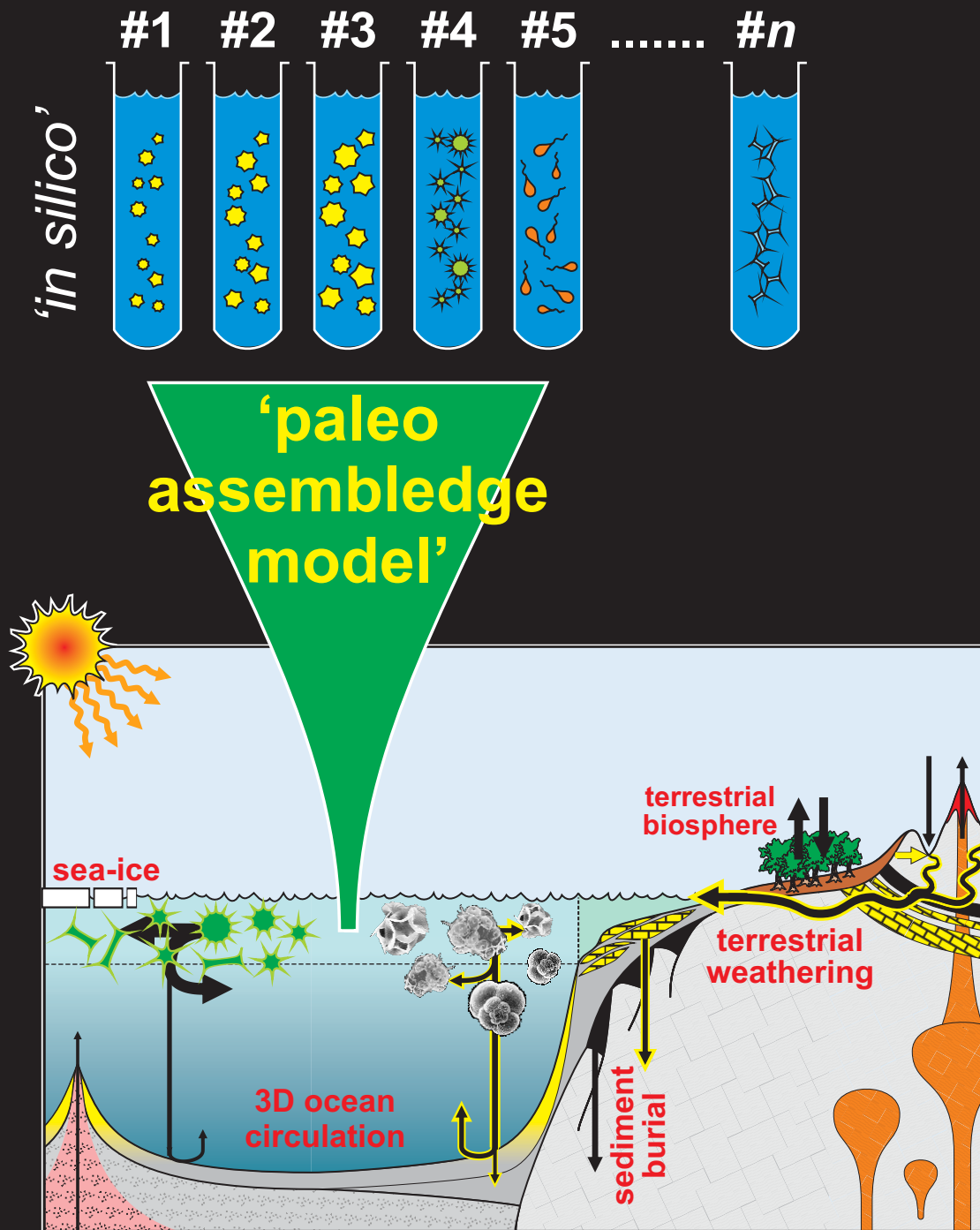


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- ★ Plankton compete and the ecosystem is an **emergent** rather than prescribed property. But ...  
... the geochemical environment and climate co-evolves as global nutrient cycles are modified.

# 'PALEOGENIE'

Computer models and  
other baked goods



- ★  $n = 1,000-10,000$  randomly-generated trait vectors ('plankton').

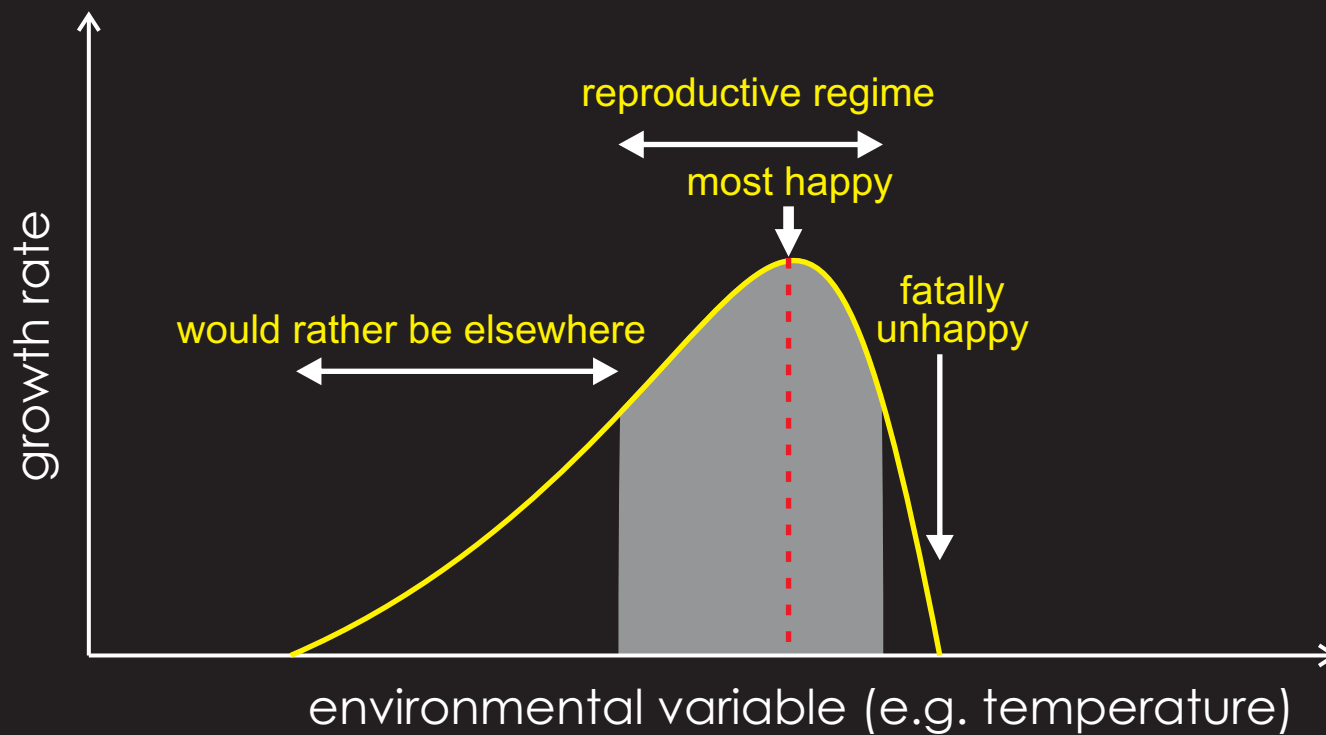
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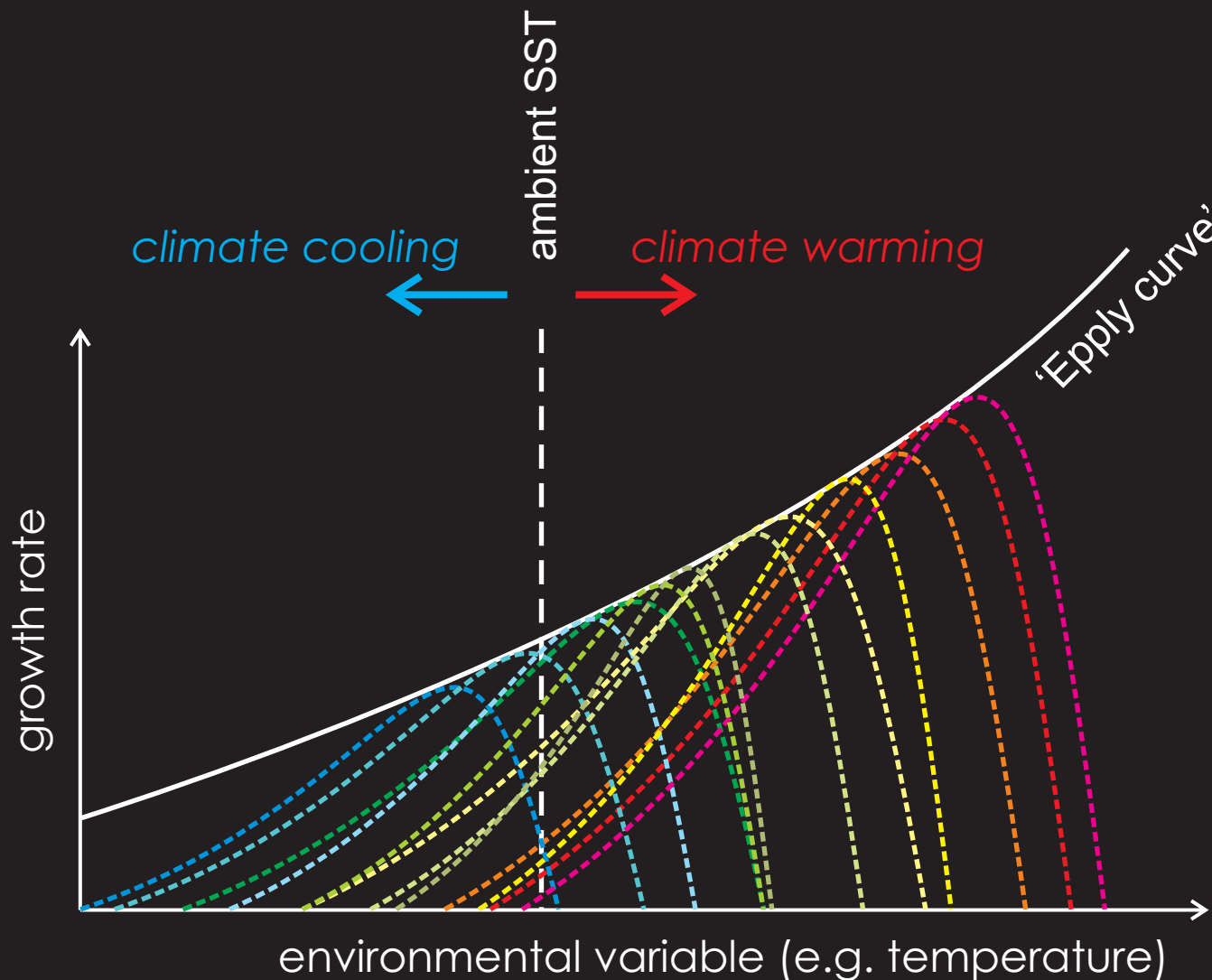
- ★ Plankton compete and the ecosystem is an **emergent** rather than prescribed property.

But ...

*... the geochemical environment and climate co-evolves as global nutrient cycles are modified.*

- ★ At very high resolved diversity, we can explore questions of **adaptation** and rates of **evolutionary change** by spawning new plankton with perturbed characteristics.



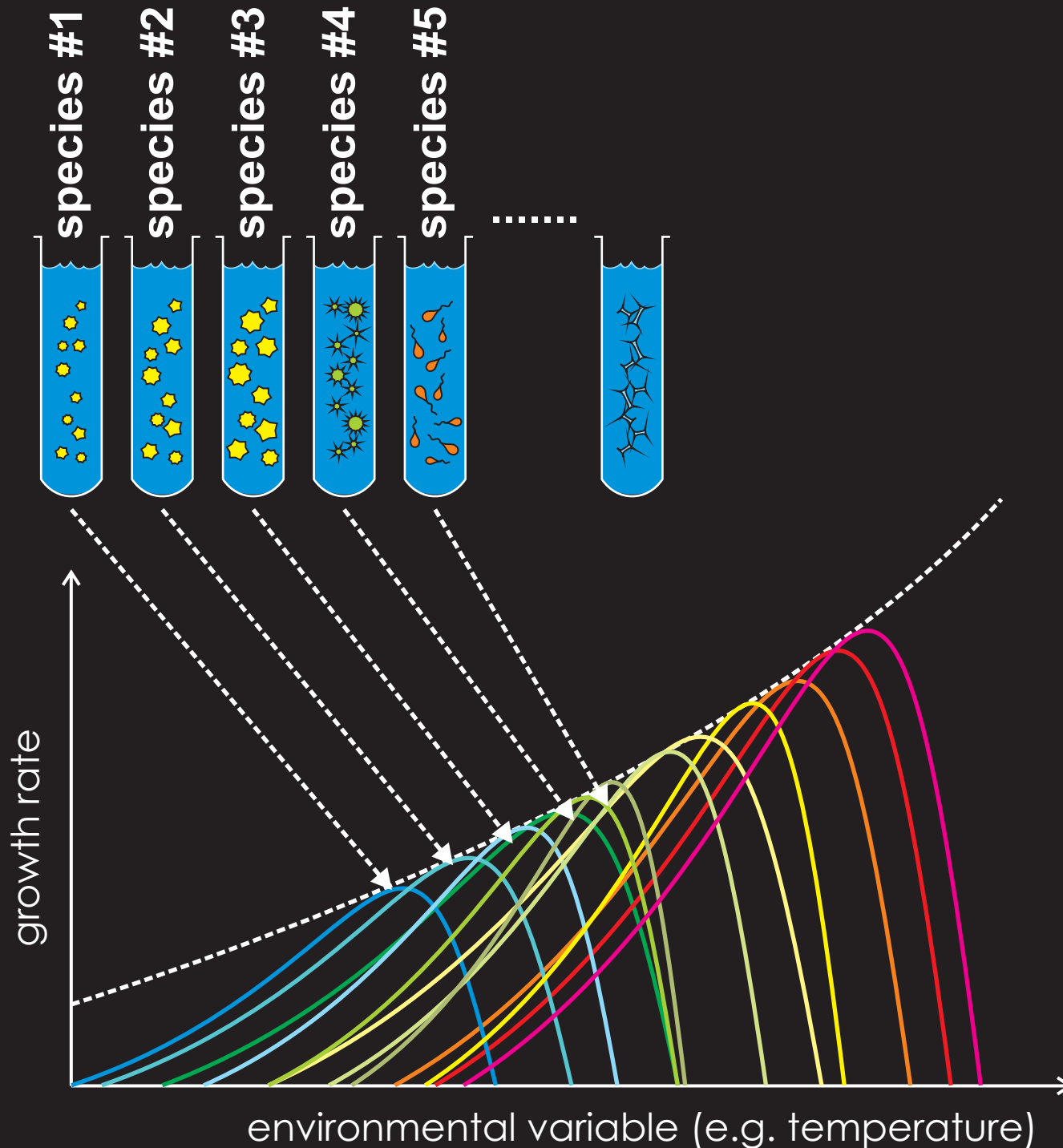


In traditional 'functional type' ecosystem models, diversity is not resolved, but instead its effects highly parameterized (e.g. the 'Epply curve').

*The response to a change in climate is then instantaneous and fully reversible.*

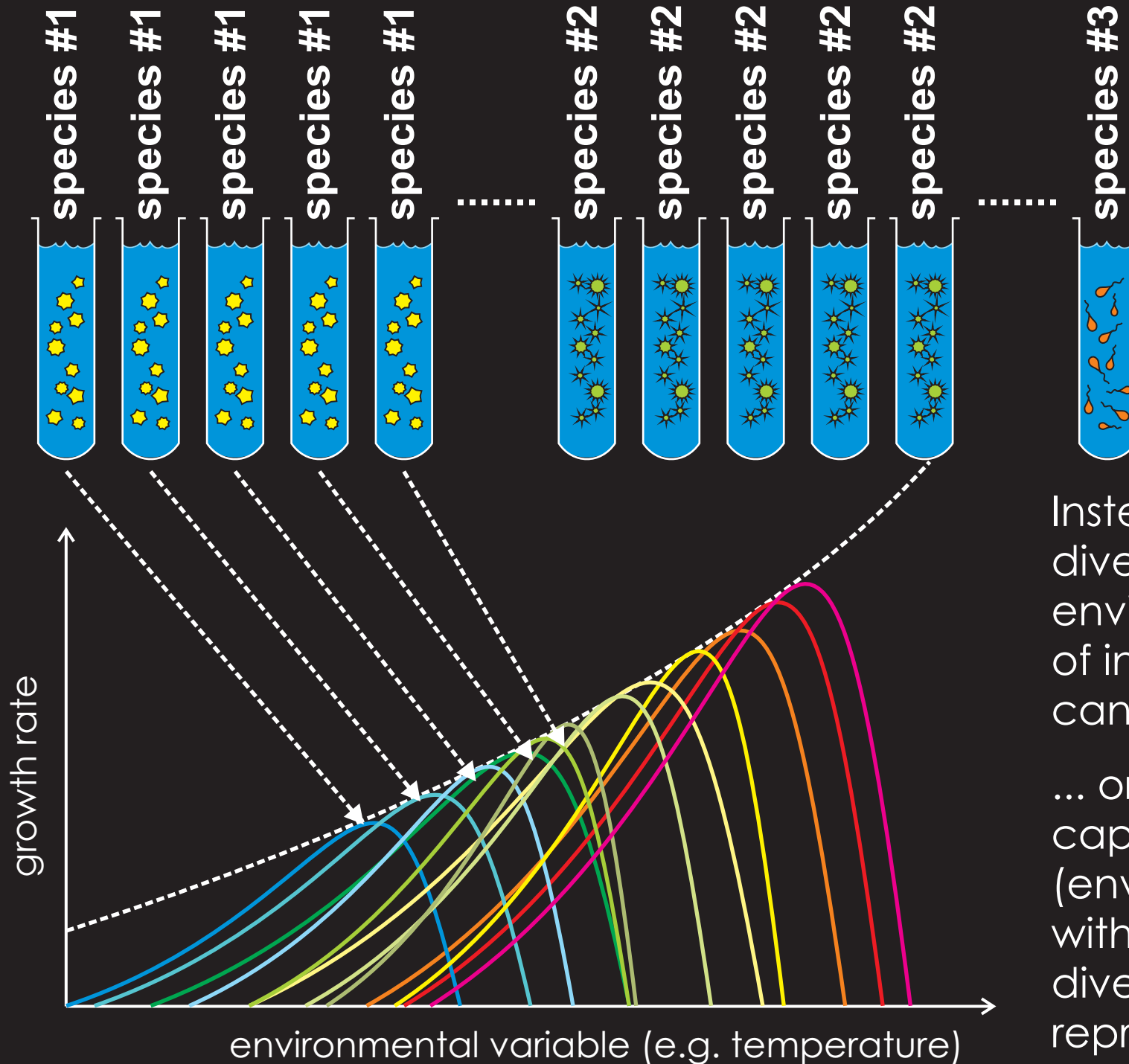
# 'PALEOGENIE'

Computer models and other baked goods



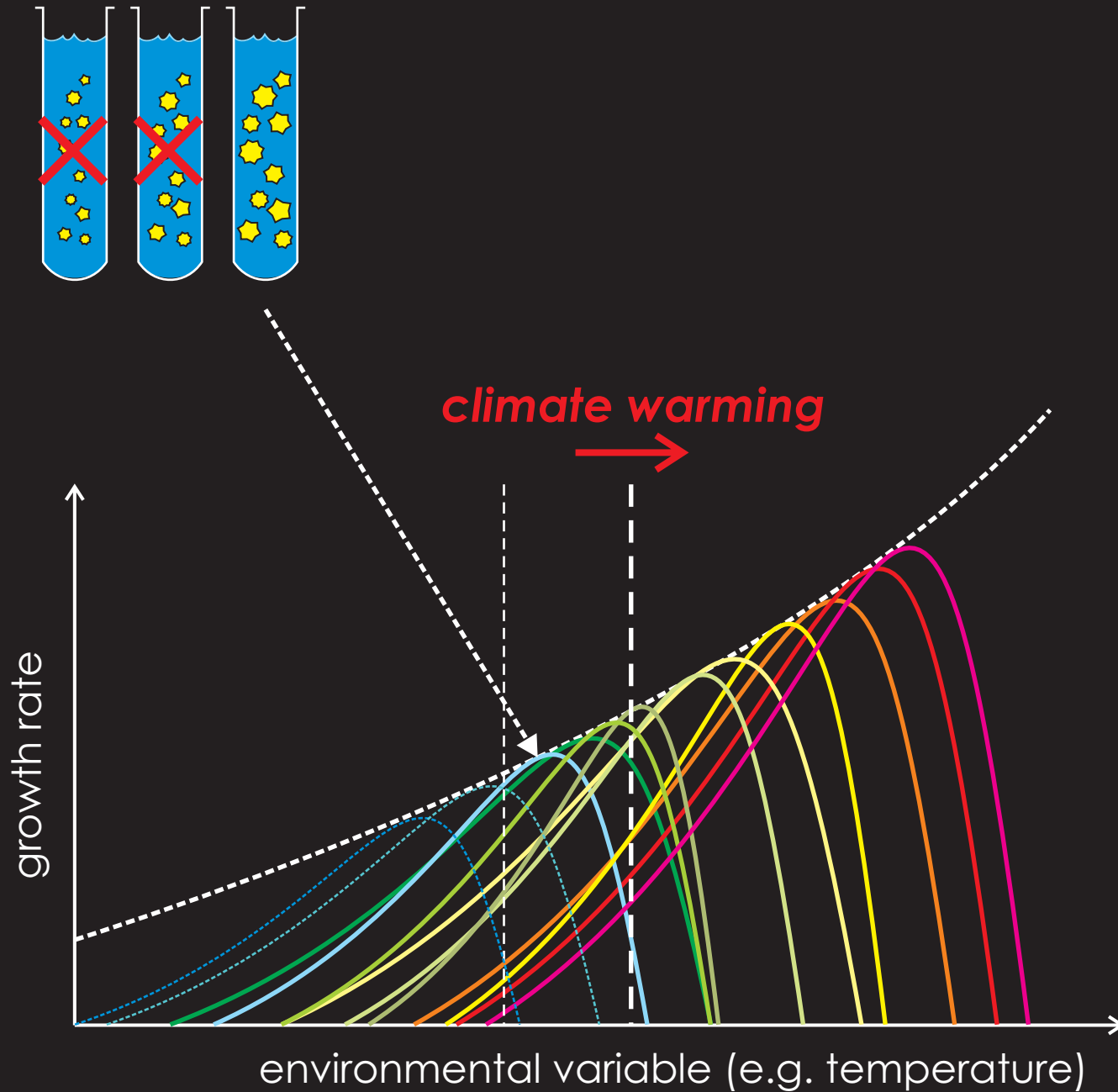
Instead, in a highly diverse model, the environmental response of individual 'species' can be resolved ...

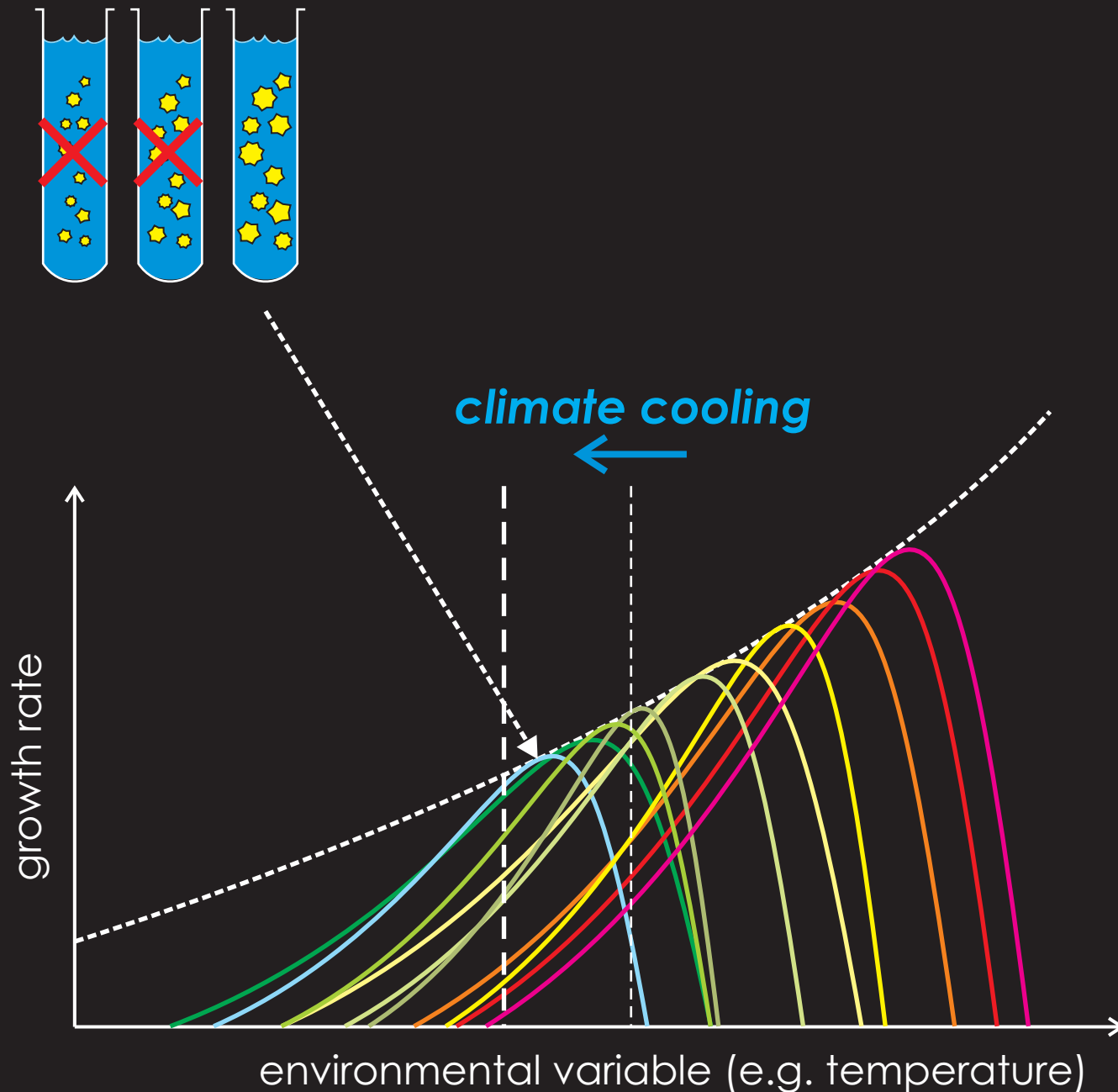




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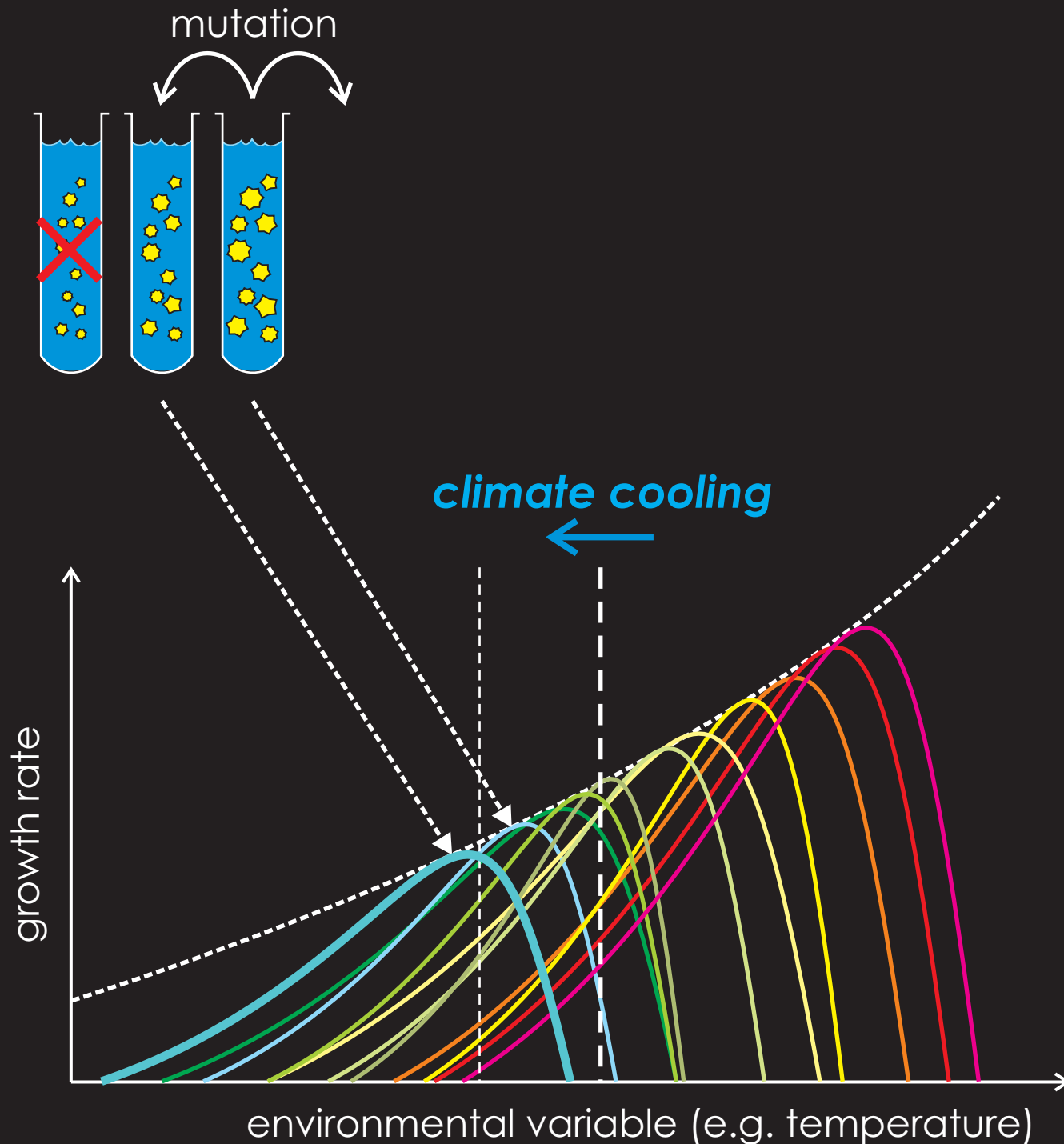
... or instead, the capability for adaptation (environmental selection within existing genetic diversity) can be represented(?)





If climate cools, the low SST optimized species/variants no longer exist. Ecosystem dynamics are presumably different.

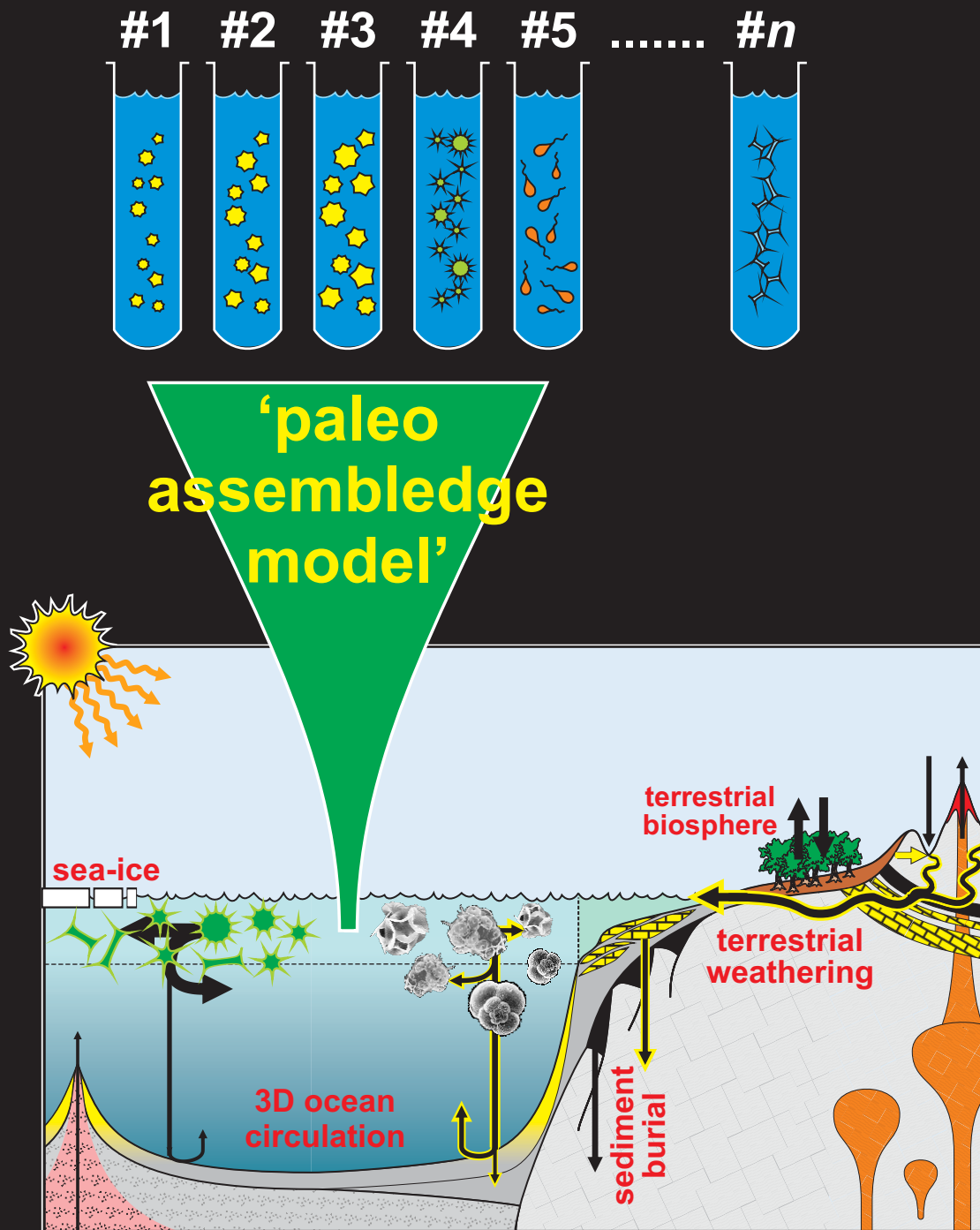
Niches are unfilled, so ...



Allow non-viable plankton to be replaced with 'mutations' of surviving species, using the trait based trade-offs.

Q. How 'frequently' to mutate, and as a function of what?

Q. What 'step size' to take for mutation?

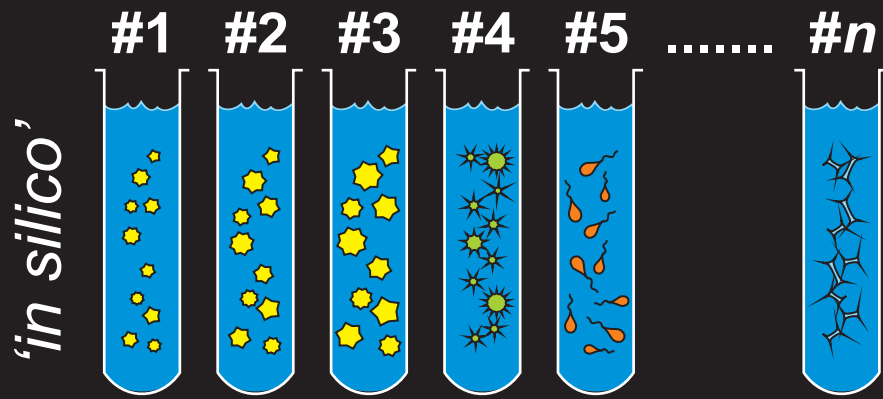


## 'PALEOGENiE':

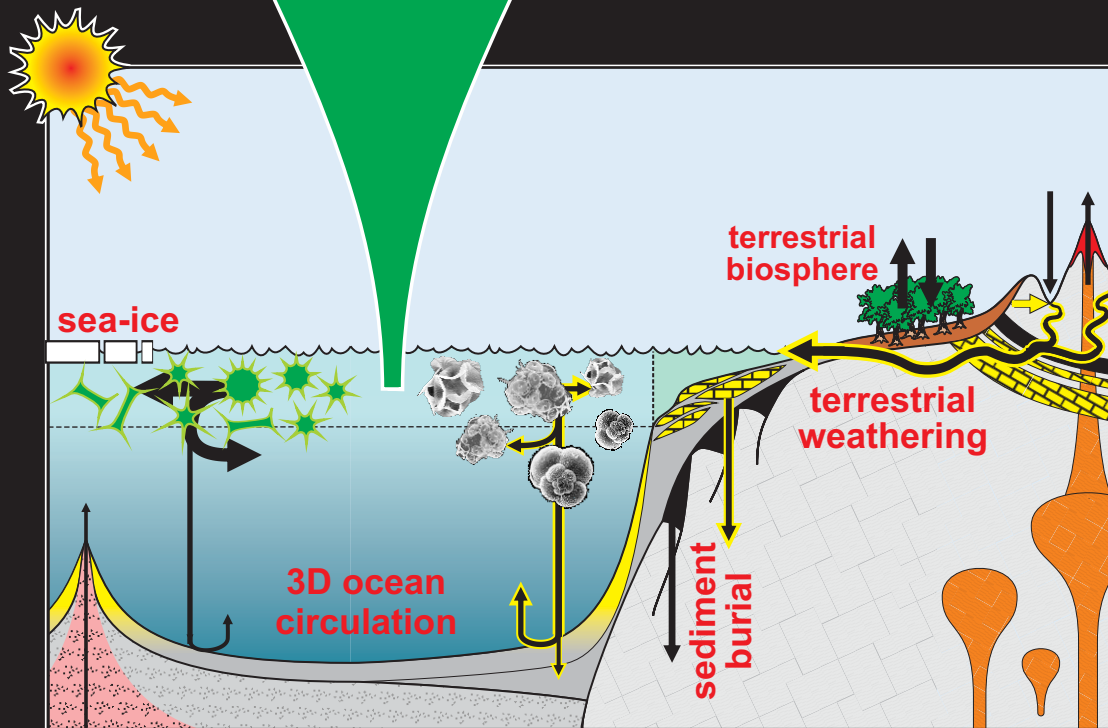
- ★ A radical paleo model-data concept for theoretically exploring questions of marine plankton adaptation and evolution.
- ★ Specific questions:
  - Cause(s) of the delayed recovery (100s of kyr) from end Cretaceous extinction
  - Determining which factor(s) best explain ecological responses to PETM carbon release.
- ★ A tool for gaining understanding about future ecosystem stability (+ proof concepts for future models).

# 'PALEOGENiE' – computational strategies

Computer models and other baked goods



'paleo assemblage model'



Marine ecosystems *in silico*:

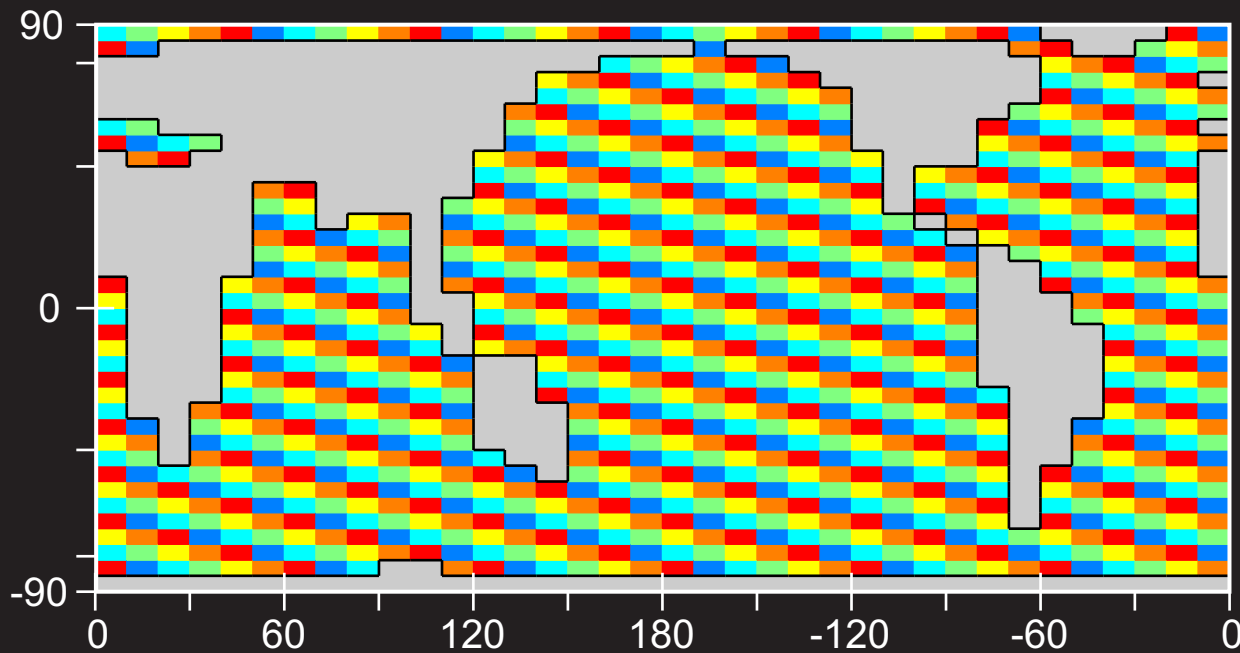
★  $n = 1,000-10,000$  randomly-generated trait vectors ('plankton').

...  
...

★ At very high resolved diversity, we can explore questions of **adaptation** and rates of **evolutionary change** by spawning new plankton with

There is clearly a very significant computational expense involved, even if using low resolution/efficient Earth system models such as 'GENIE'.

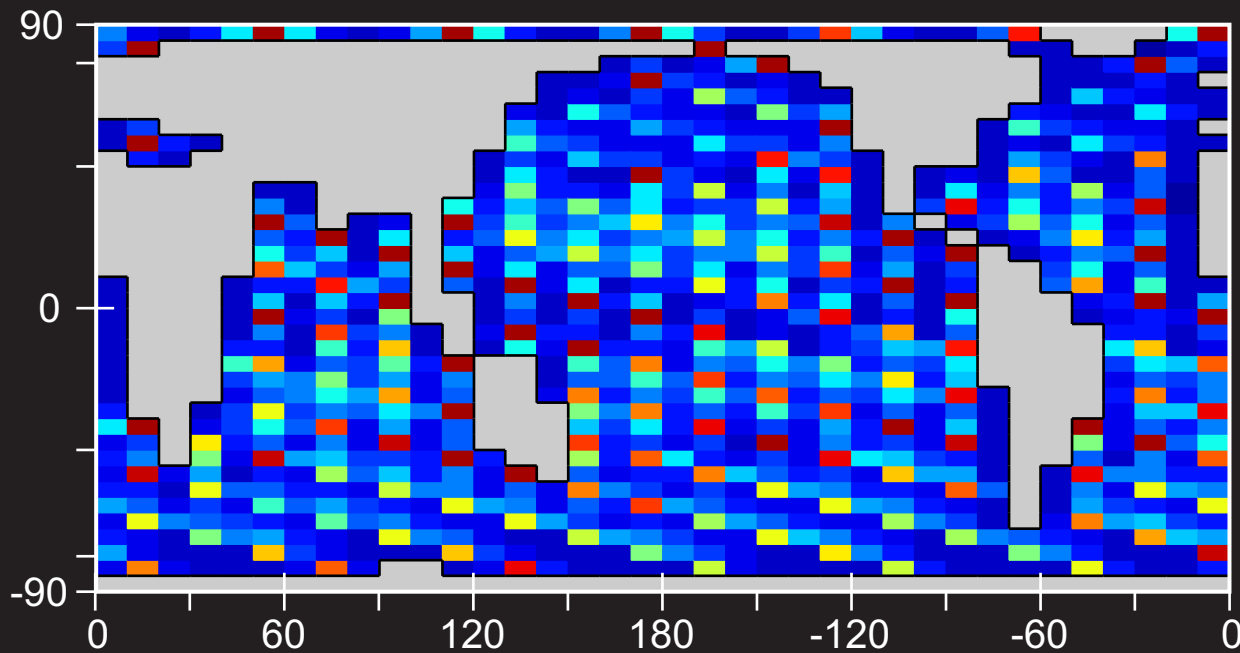
'Color' tracer pattern to unambiguously diagnose surface ocean transport



=> Diagnose full 3D circulation,  
and employ (sparse) parallelized  
matrix multiplication.

=> Calculate plankton transport  
separately from nutrients (and  
other dissolved tracers)?

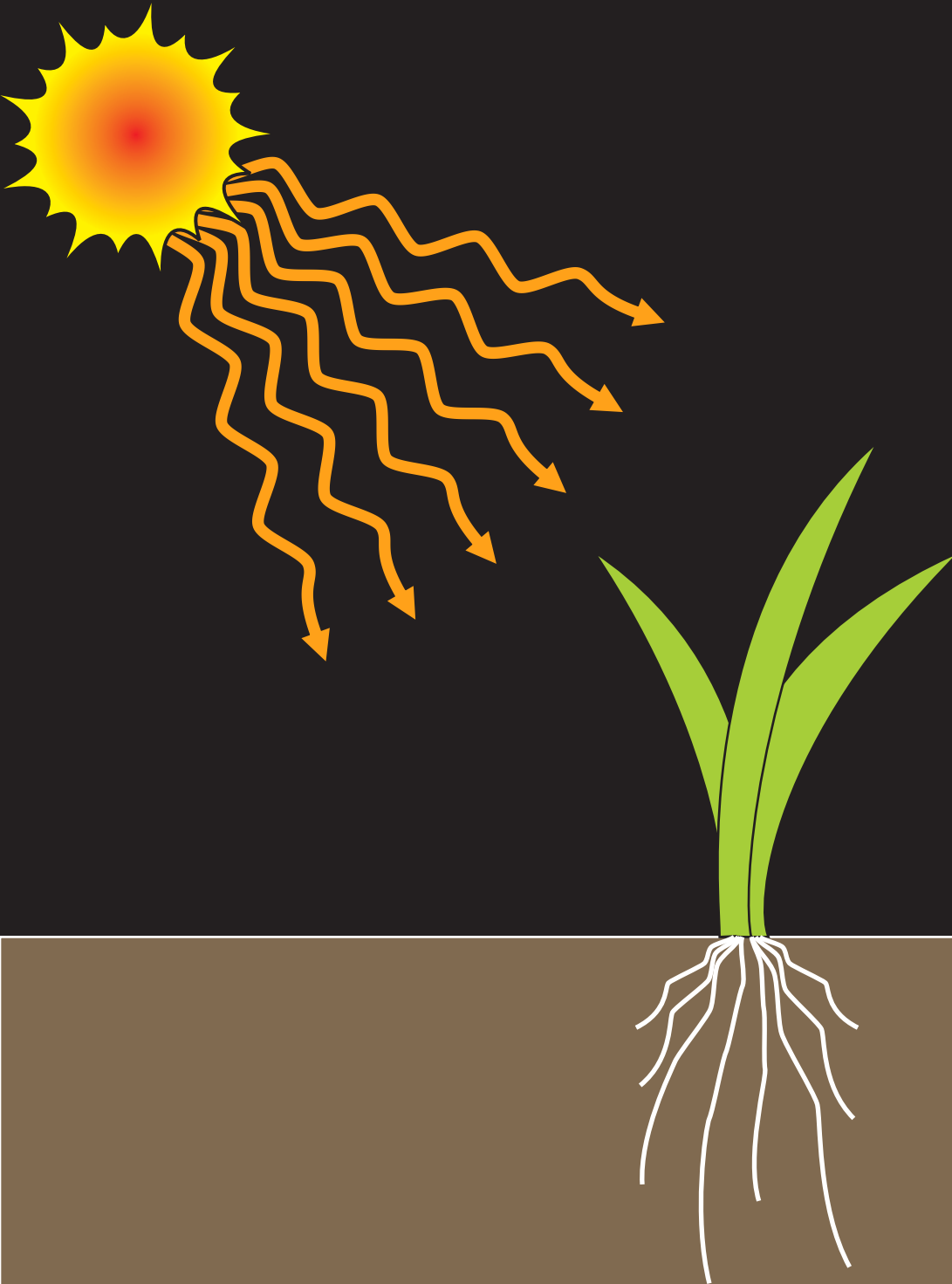
Dispersal of a single 'color' after 1 year

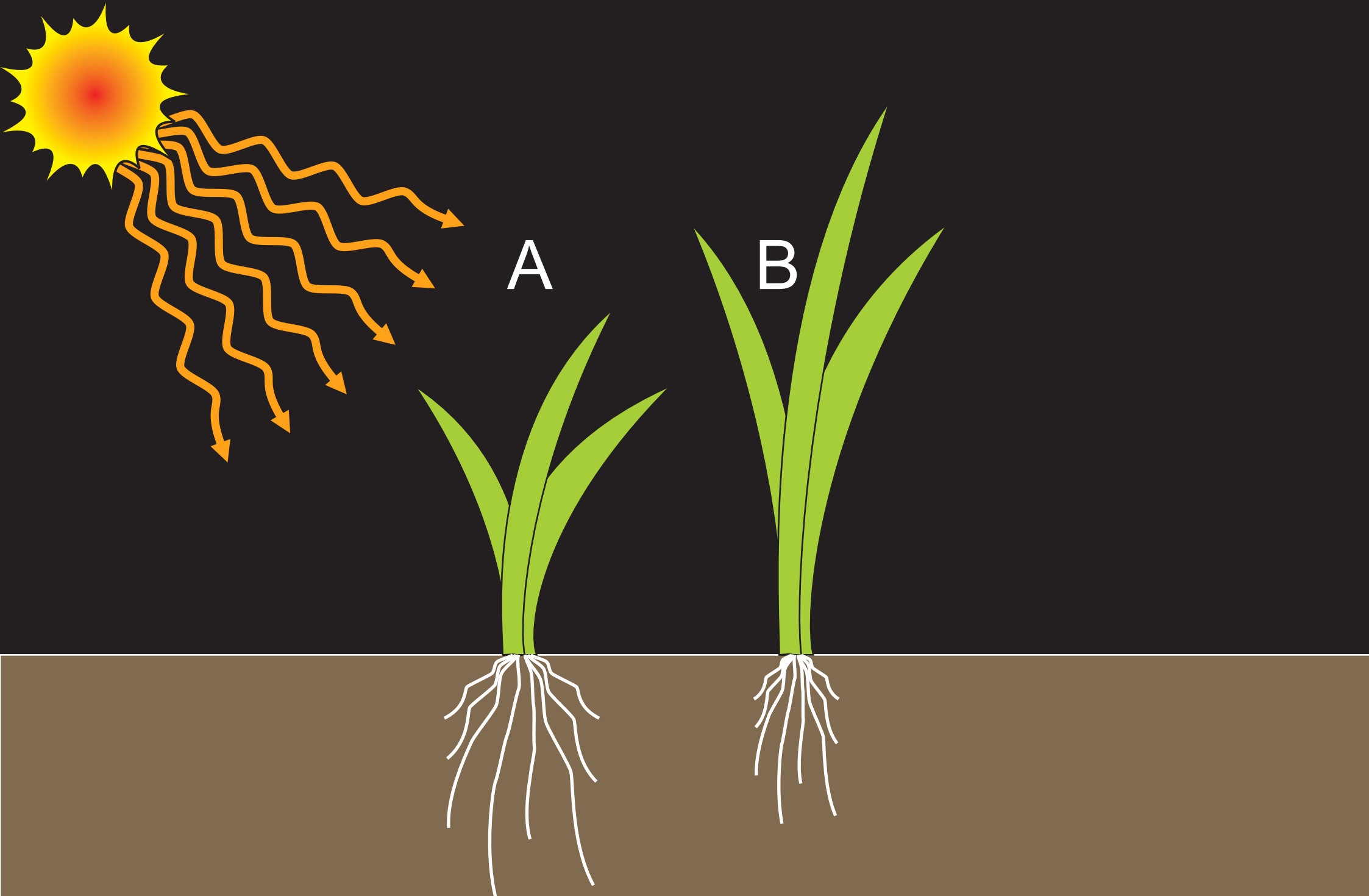


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separately from nutrients (and  
other dissolved tracers)?



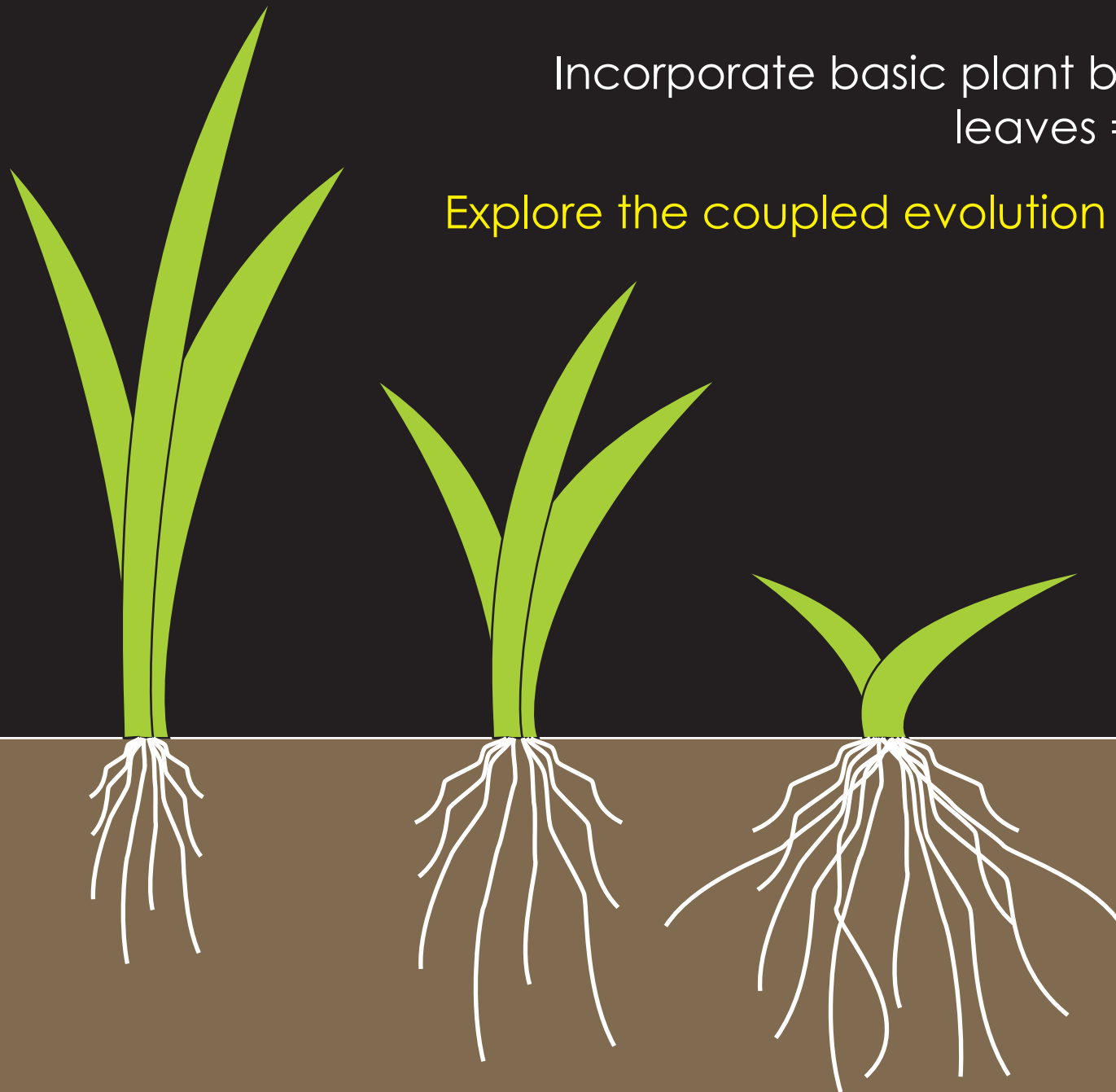


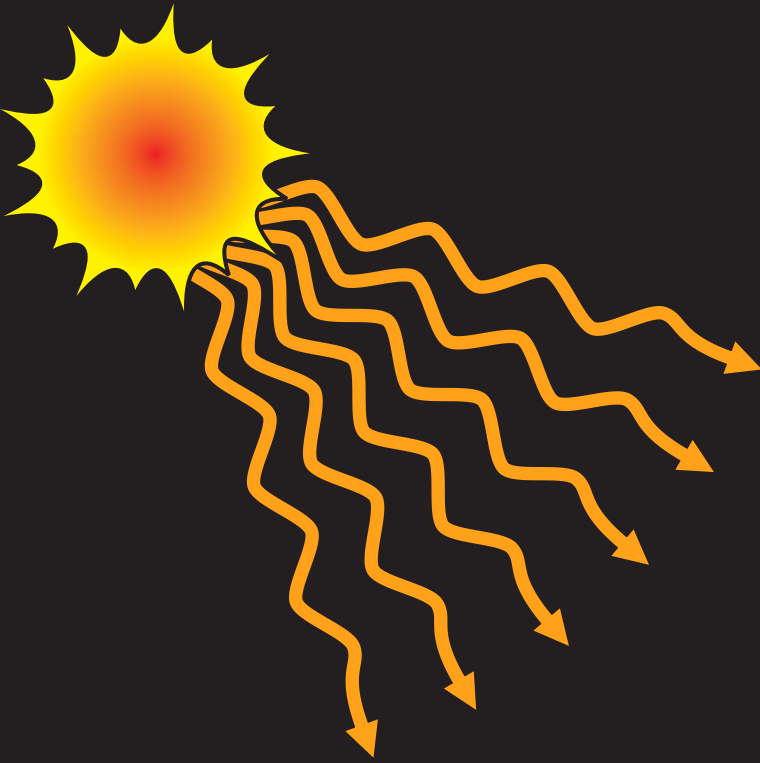


Use a crop (plant) model based on carbon resource allocation.

Incorporate basic plant biomechanics (60ft long leaves == not a good idea ...).

Explore the coupled evolution of terrestrial plants and environment?





Mutate the plants across millions of generations and across millions of 'fields' on a massively parallel computing basis.

Select for yield (but at the field scale, hence dealing with 'competition').

Can also select for e.g. water use efficiency, tolerance to gusty wind conditions, etc. etc.

Q. Would an 'optimal' crop plant have 6 triangular leaves that enables a hexagonal space-filling tessellation across the soil surface??





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