

# The role of movement in determining the global distribution of marine biomass



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# A. Global Fisheries Production

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- How much biomass does the ocean produce?

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## **Photosynthesis and Fish Production in the Sea**

The production of organic matter and its conversion to higher forms of life vary throughout the world ocean.

John H. Ryther

Science, 1969; Pauly & Christensen 1995,  
Chassot et al. 2010

# A. Global Fisheries Production

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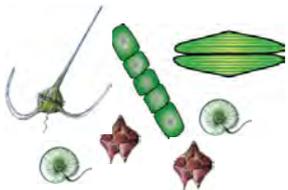
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Phytoplankton

Trophic transfer efficiency

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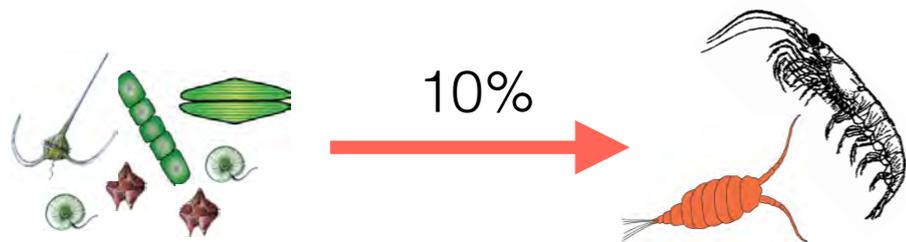
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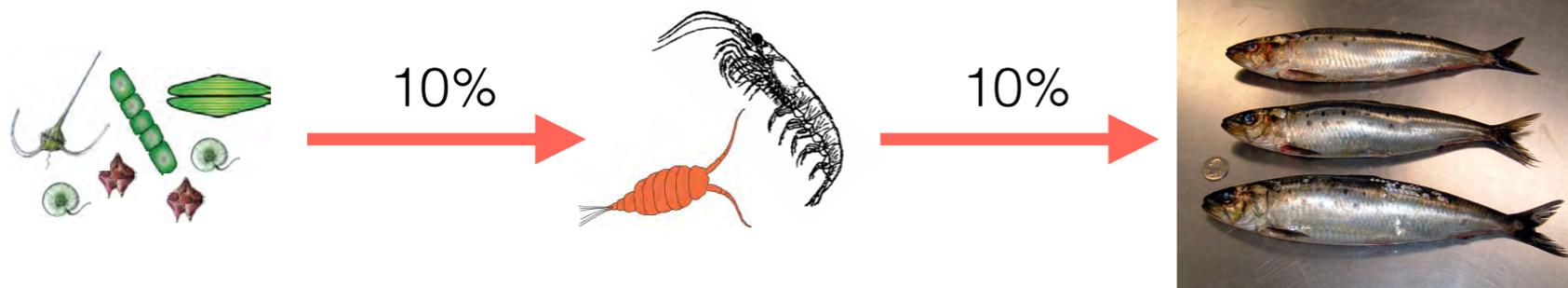
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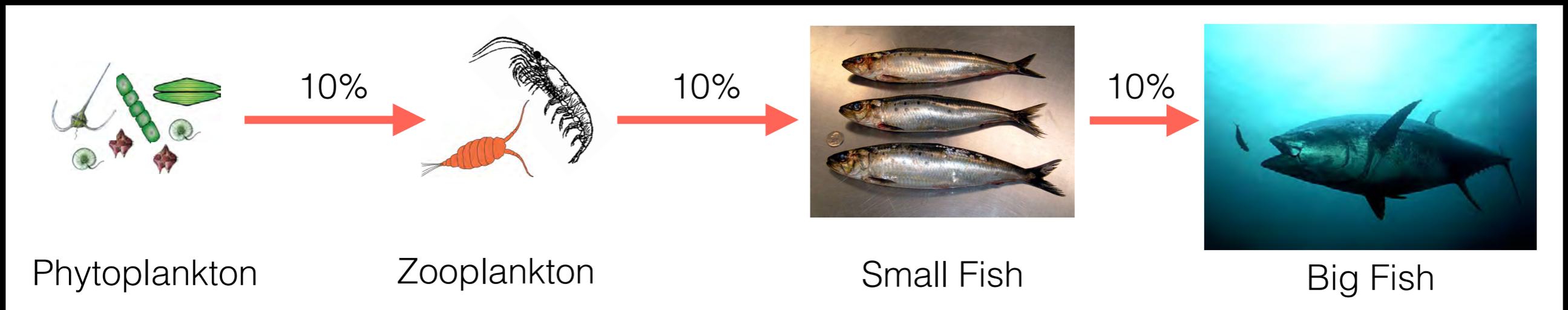
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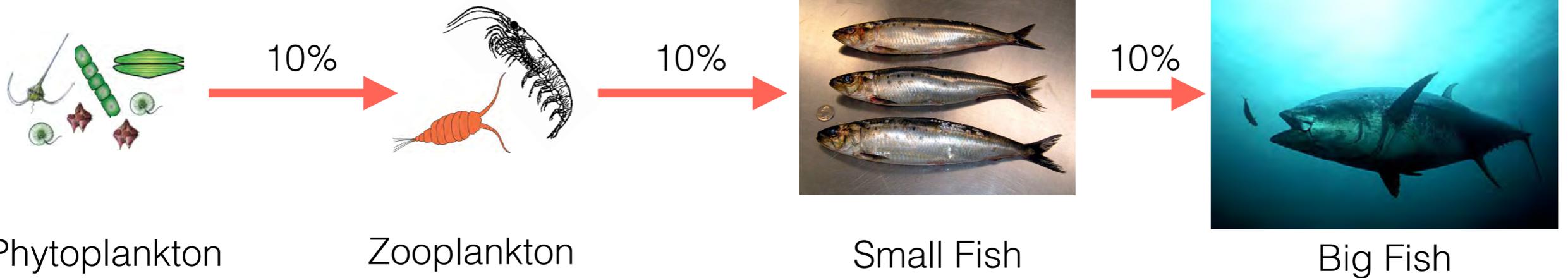
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Table 3. Estimated fish production in the three ocean provinces defined in Table 2.

Province	Primary production [tons (organic carbon)]	Trophic levels	Efficiency (%)	Fish production [tons (fresh wt.)]
Oceanic	$16.3 \times 10^9$	5	10	$16 \times 10^5$
Coastal	$3.6 \times 10^9$	3	15	$12 \times 10^7$
Upwelling	$0.1 \times 10^9$	1½	20	$12 \times 10^7$
Total				$24 \times 10^7$



Trophic transfer efficiency

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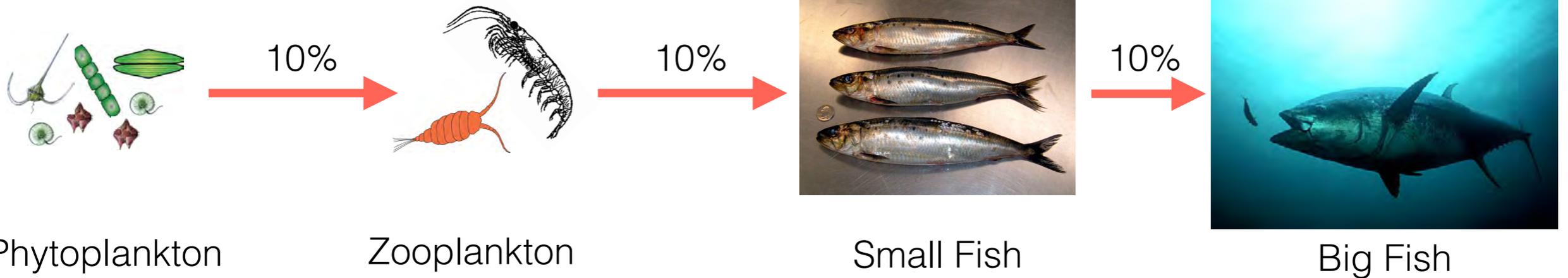
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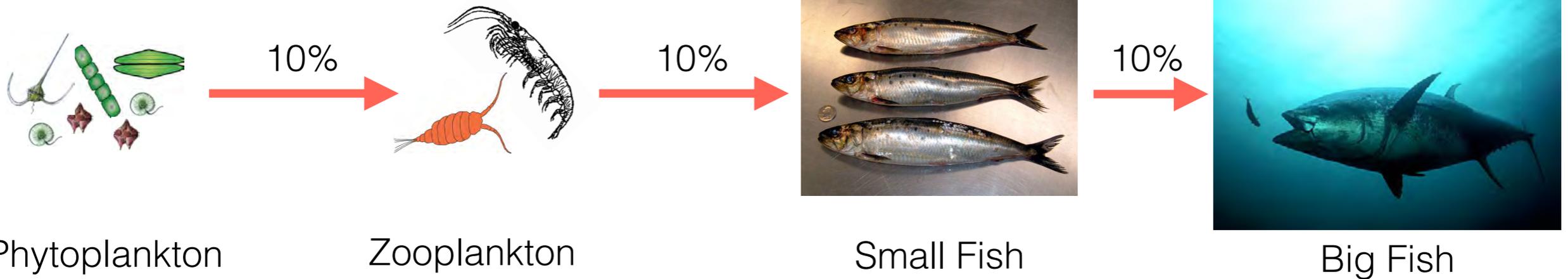
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**Maximum fisheries production: 240 MT year<sup>-1</sup>**



Trophic transfer efficiency

# Global Ecosystem Modeling

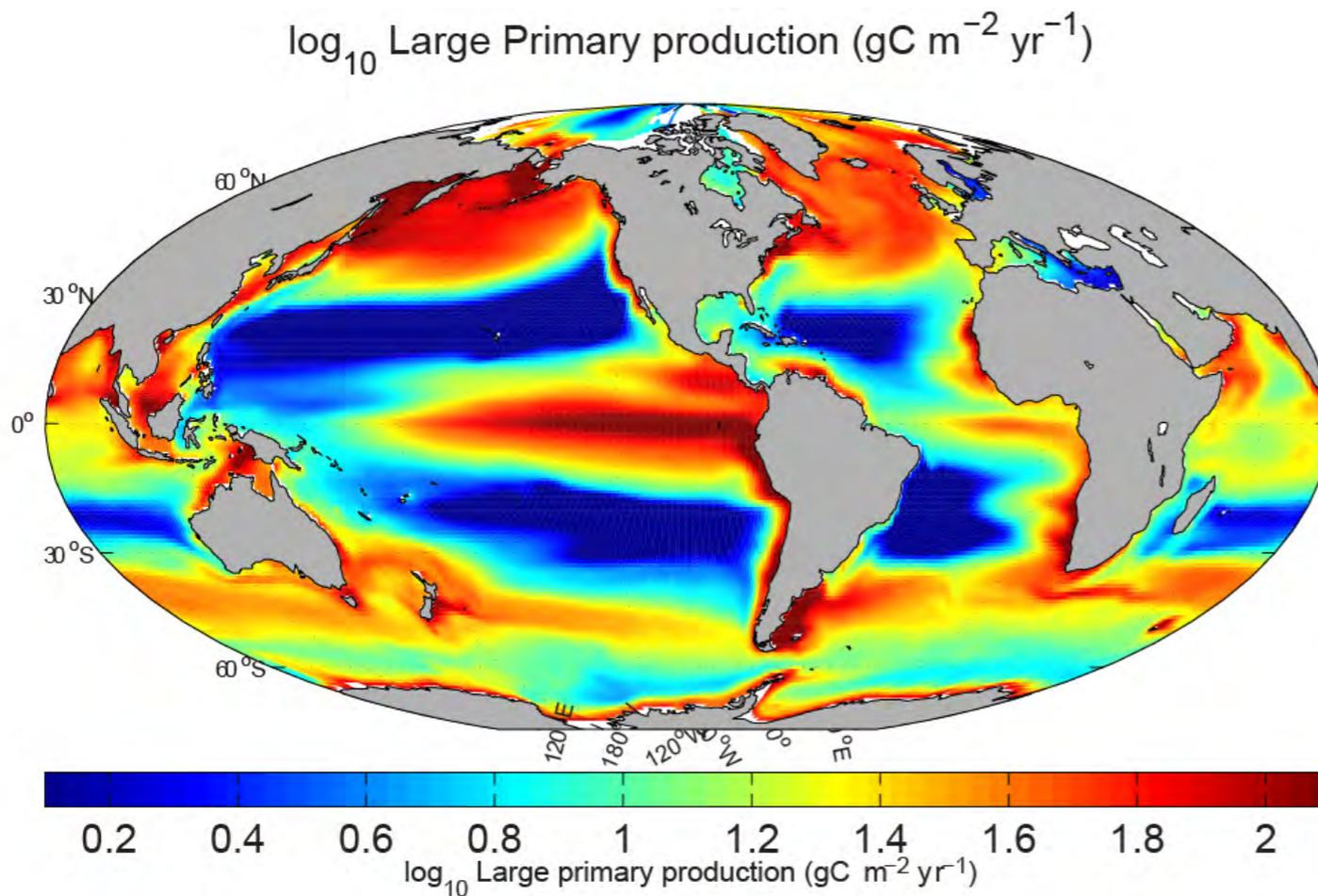
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- Can we do better than the trophic transfer efficiency (**nonlinear relationships, spatial resolution**)?



# Global Ecosystem Modeling

- Can we do better than the trophic transfer efficiency (nonlinear relationships, spatial resolution)?



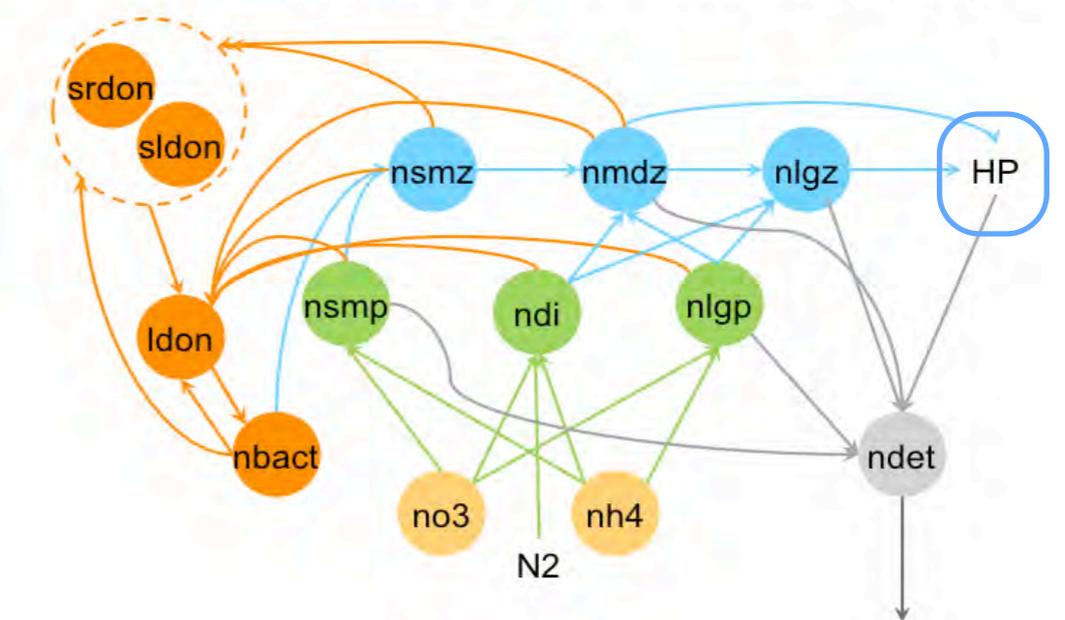
Figs: Charles Stock: COBALT

Charles A Stock, John P Dunne, and Jasmin G John. Progress In Oceanography, In press

## COBALT

Carbon, Ocean Biogeochemistry and Lower Trophics

Charles Stock, John Dunne, Jasmin John; GFDL



Mortality to higher predators

# The challenge...

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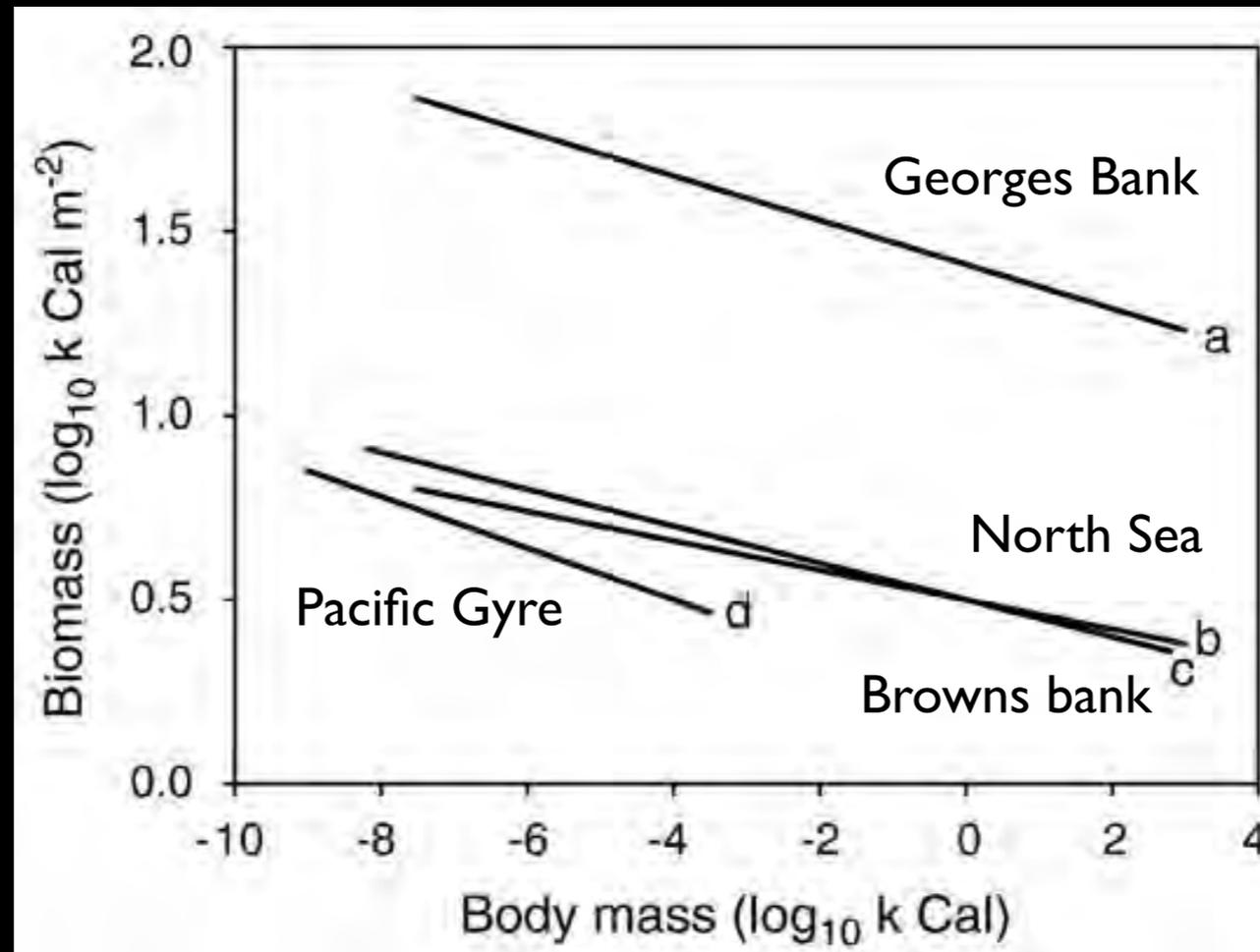
Quantify upper-trophic, or fisheries, production at a global scale...

Like plankton, big things are highly diverse

Unlike plankton, big things move against currents

# Size-based Models

A conserved feature of marine systems around the globe:

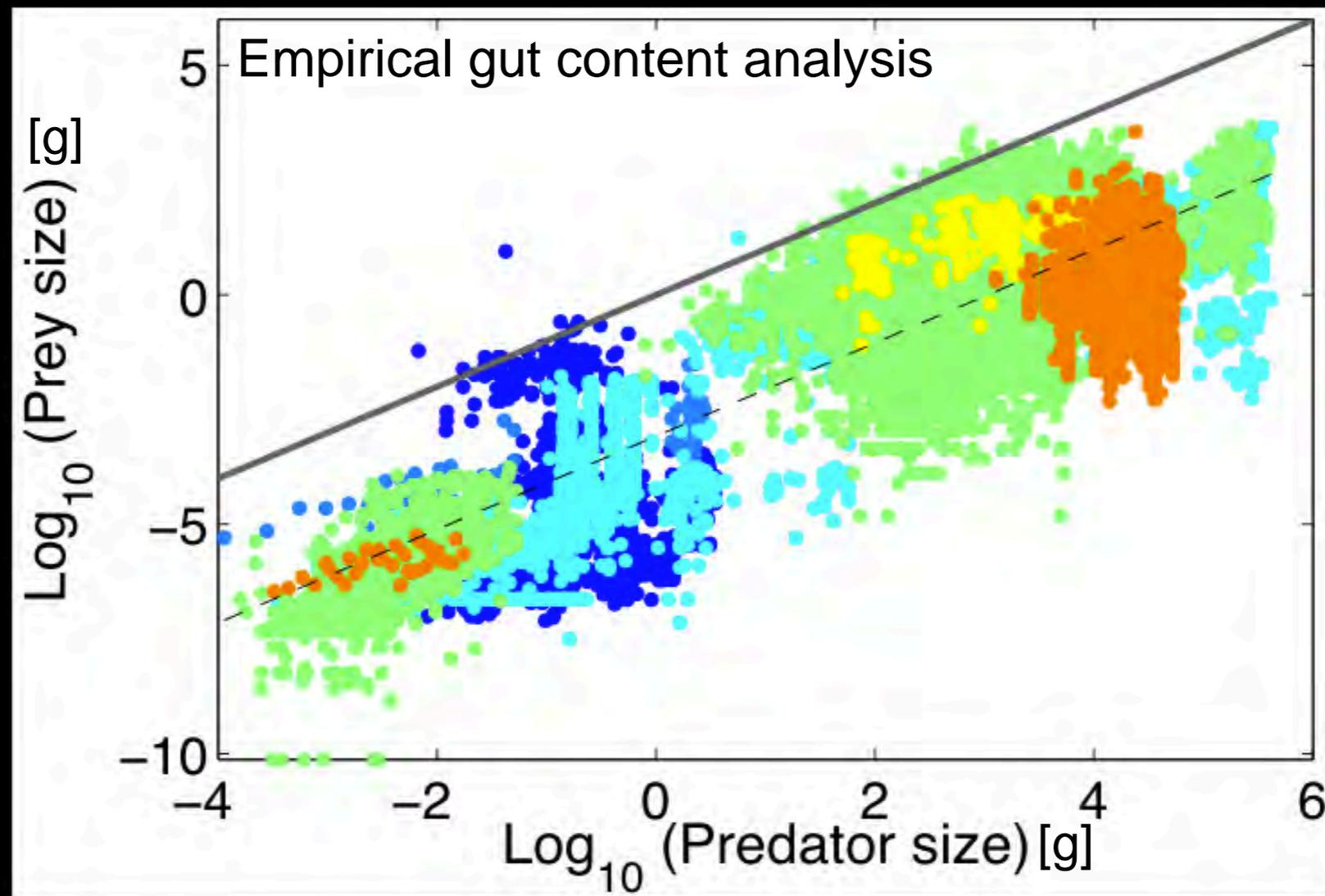


Jennings & Brander 2010,  
originally from Boudreau & Dickie 1992

# Big, medium, small... size simplifies

## Many things scale with size

- e.g. swimming speed, metabolic rates and predator-prey relationships
- Metabolic Theory of Ecology (Jim Brown @ U. New Mexico)



Barnes et al. 2009

# A Size-based Model: formulation

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Model the rate of change of biomass of a particular size-class:

$$\frac{dB_i}{dt} =$$



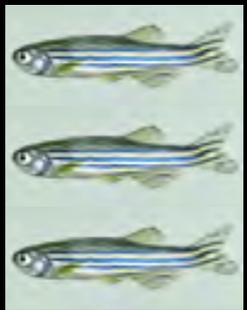
$i$  = medium fish

# A Size-based Model: formulation

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Model the rate of change of biomass of a particular size-class:

$$\frac{dB_i}{dt} = \text{Eat}(j)$$



j = small fish



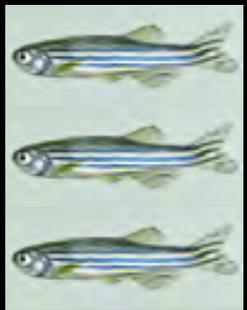
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# A Size-based Model: formulation

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Model the rate of change of biomass of a particular size-class:

$$\frac{dB_i}{dt} = \text{Eat}(j) - \text{Get eaten}(k)$$



j = small fish



i = medium fish



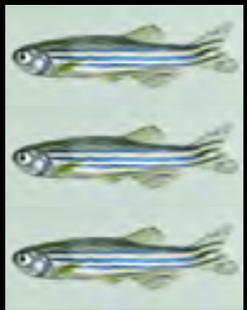
k = large fish

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Model the rate of change of biomass of a particular size-class:

$$\frac{dB_i}{dt} = \text{Eat}(j) - \text{Get eaten}(k) - \text{Metabolize}(i) + \text{move}(i)$$



j = small fish



i = medium fish

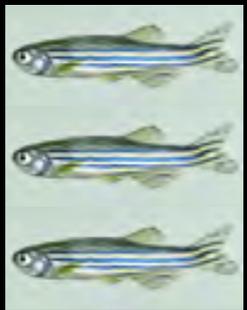


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# A Size-based Model: formulation

Model the rate of change of biomass of a particular size-class:

$$\frac{dB_i}{dt} = \underbrace{\text{Eat}(j) - \text{Get eaten}(k)}_{\text{Type II feeding function (PPMR, volume searched)}} - \underbrace{\text{Metabolize}(i)}_{\text{Allometric power law ... } a s_i^b} + \underbrace{\text{move}(i)}_{\text{Gradient ascent } J = f(dB_i/dx)}$$



j = small fish

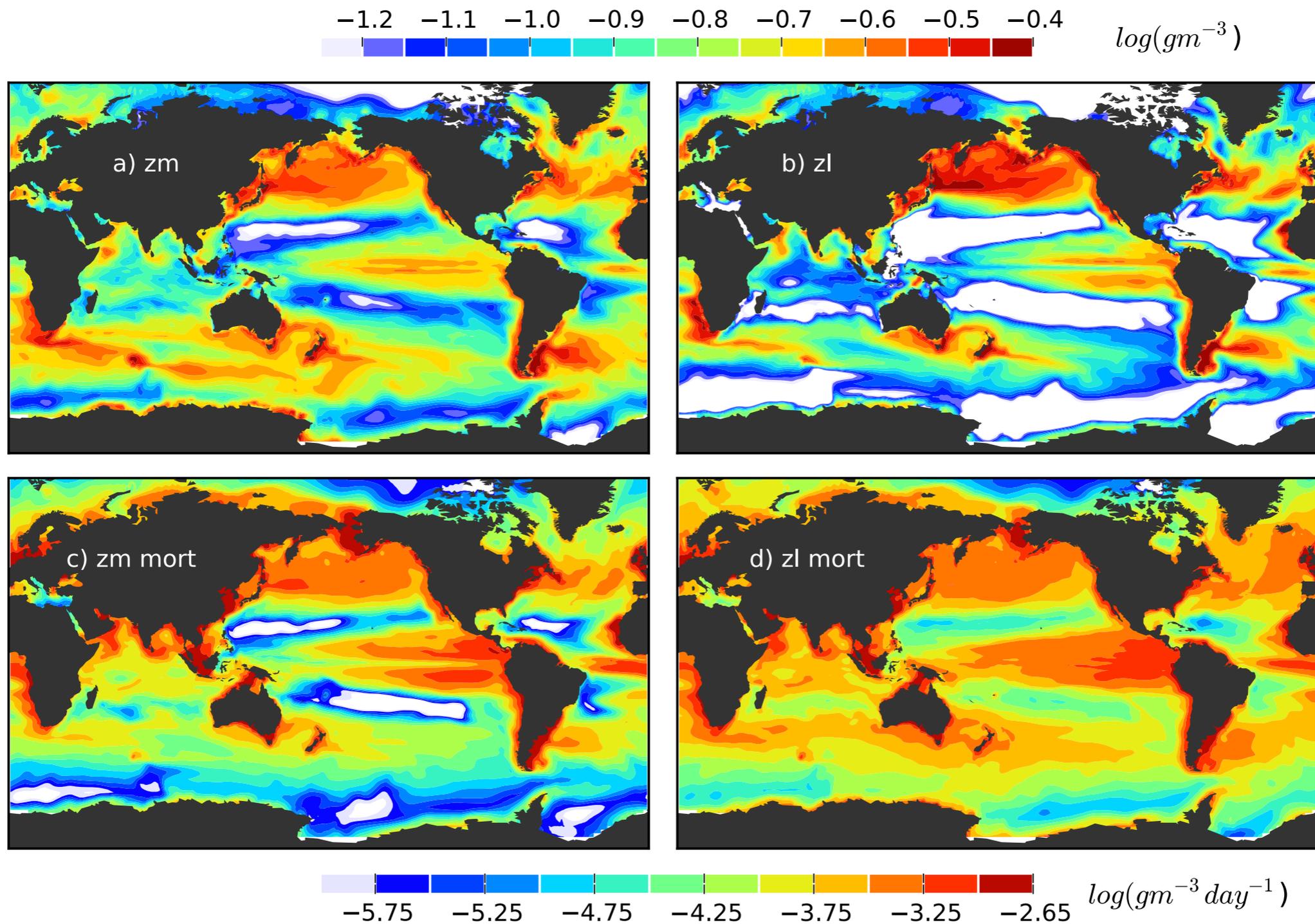


i = medium fish



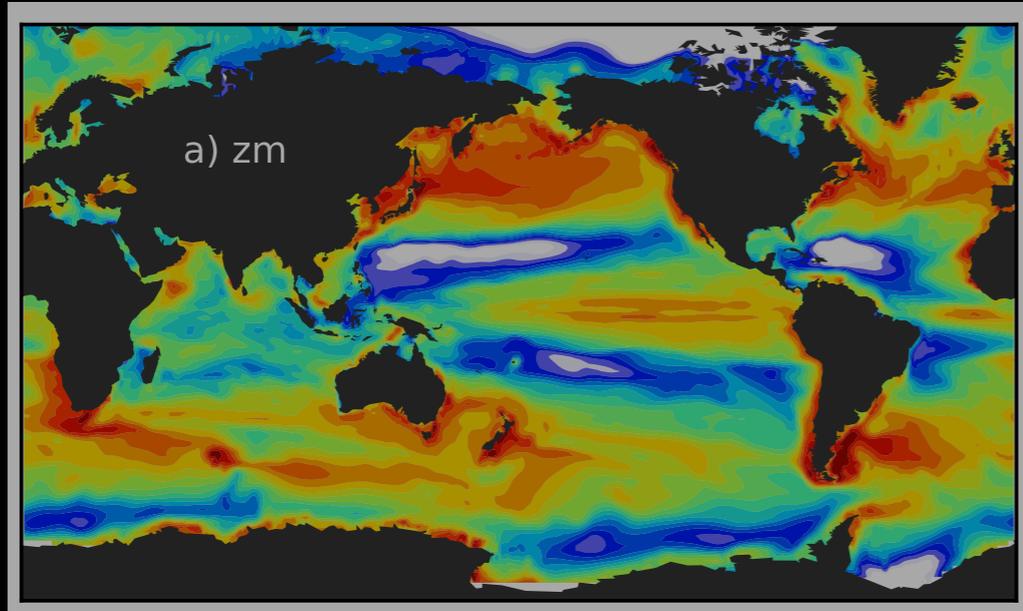
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# A Size-based Model: results



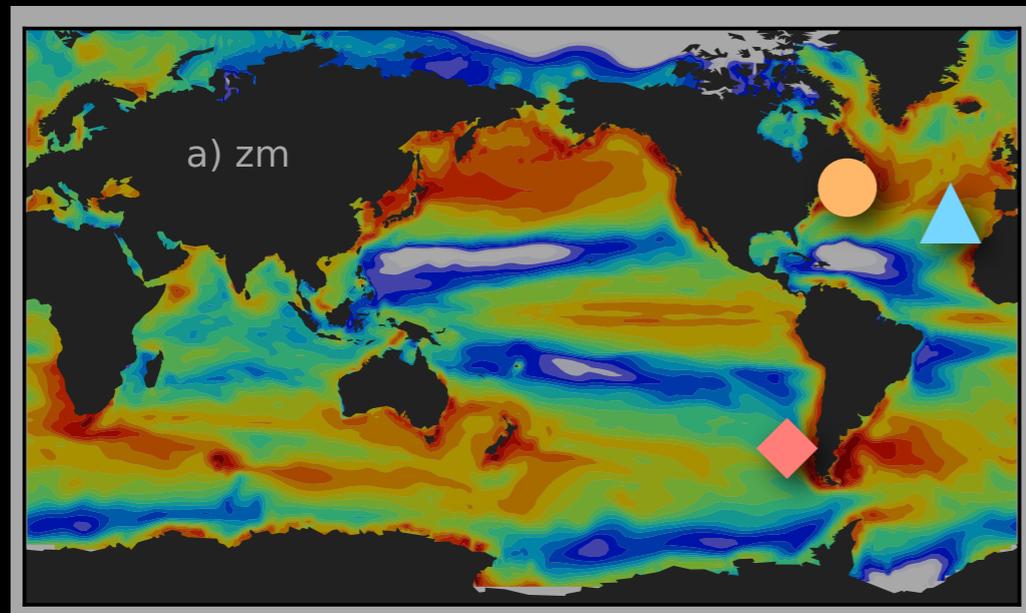
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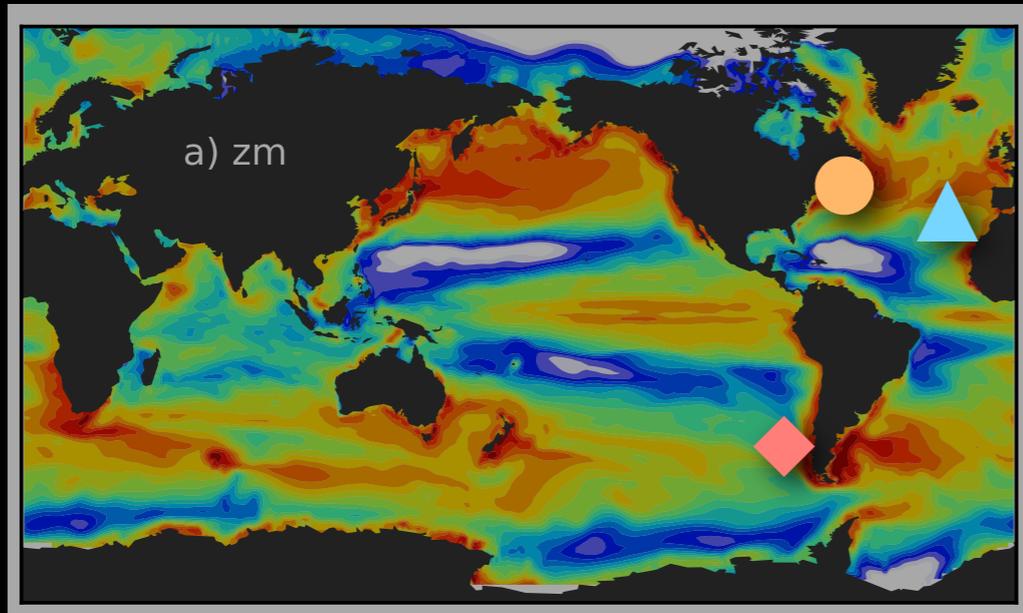
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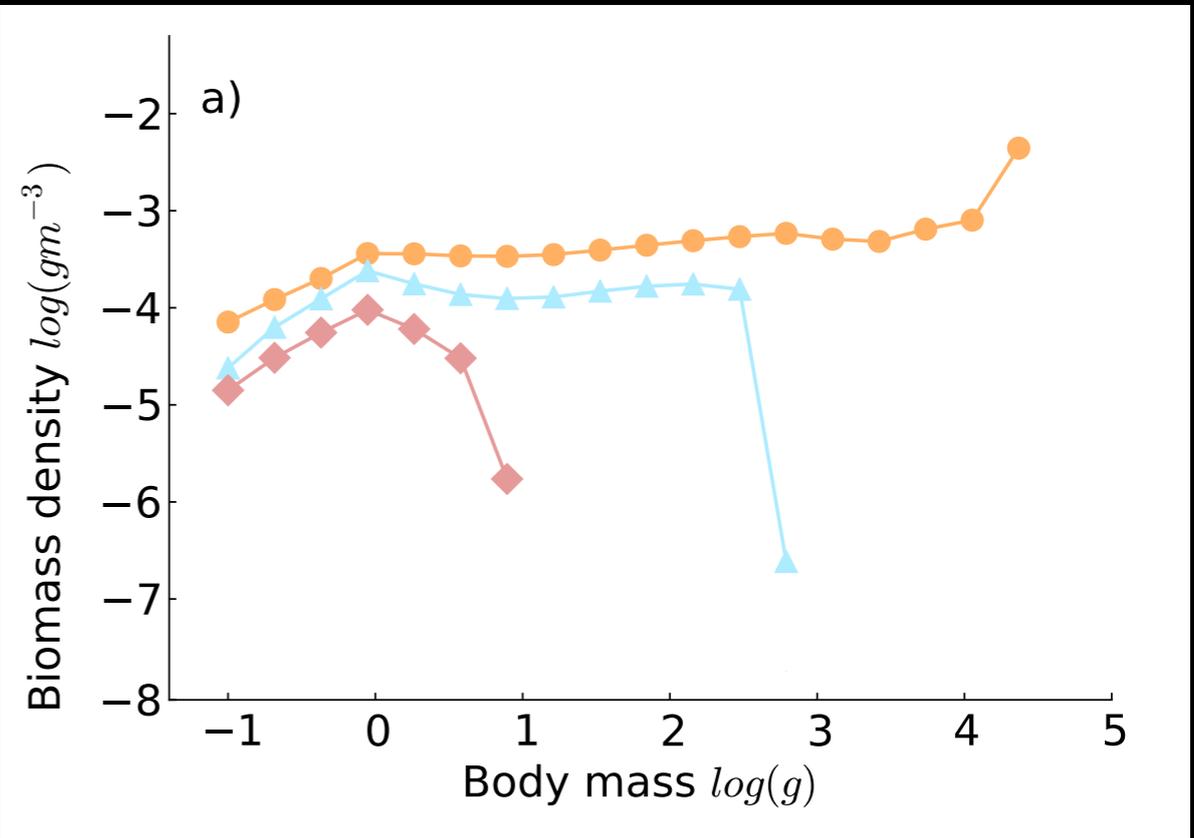
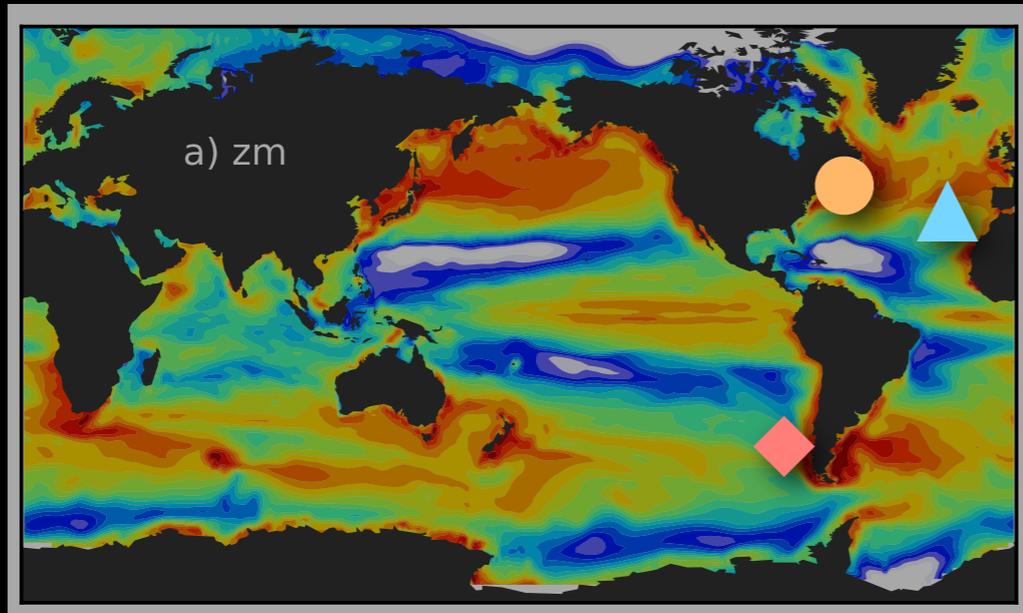


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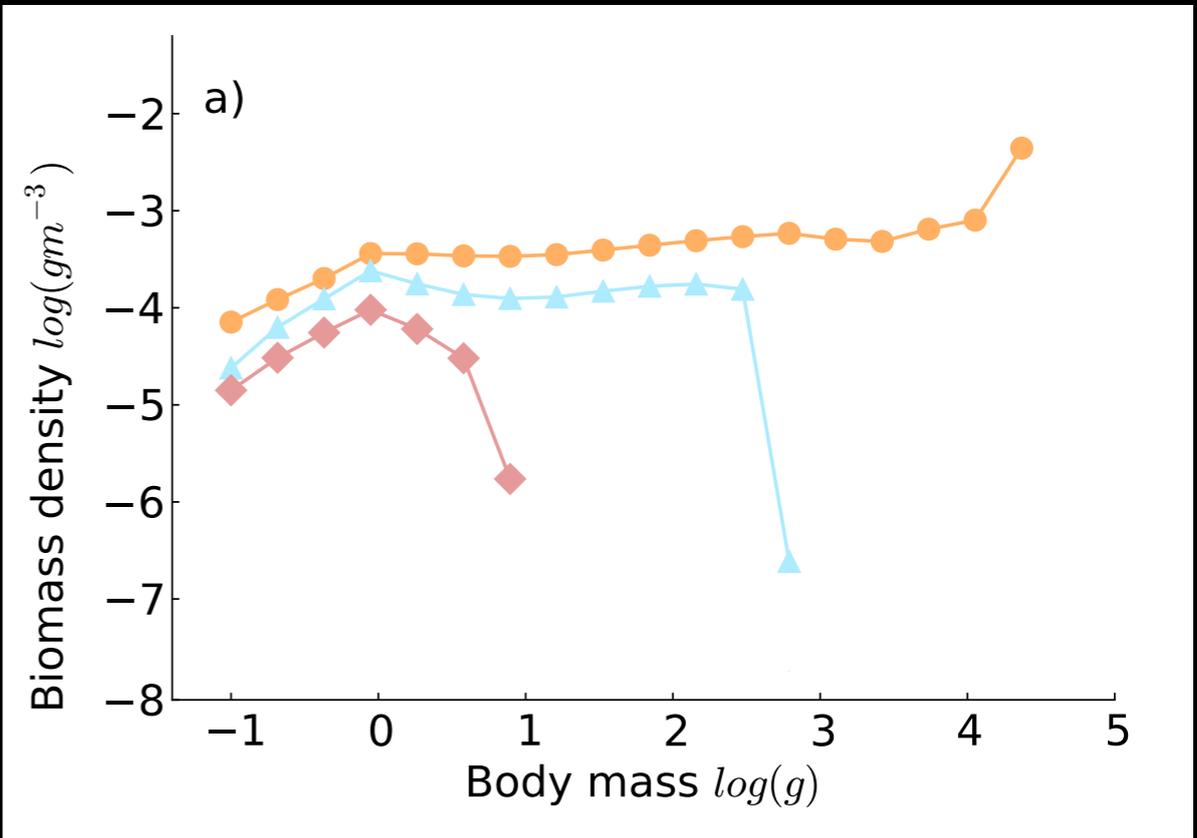
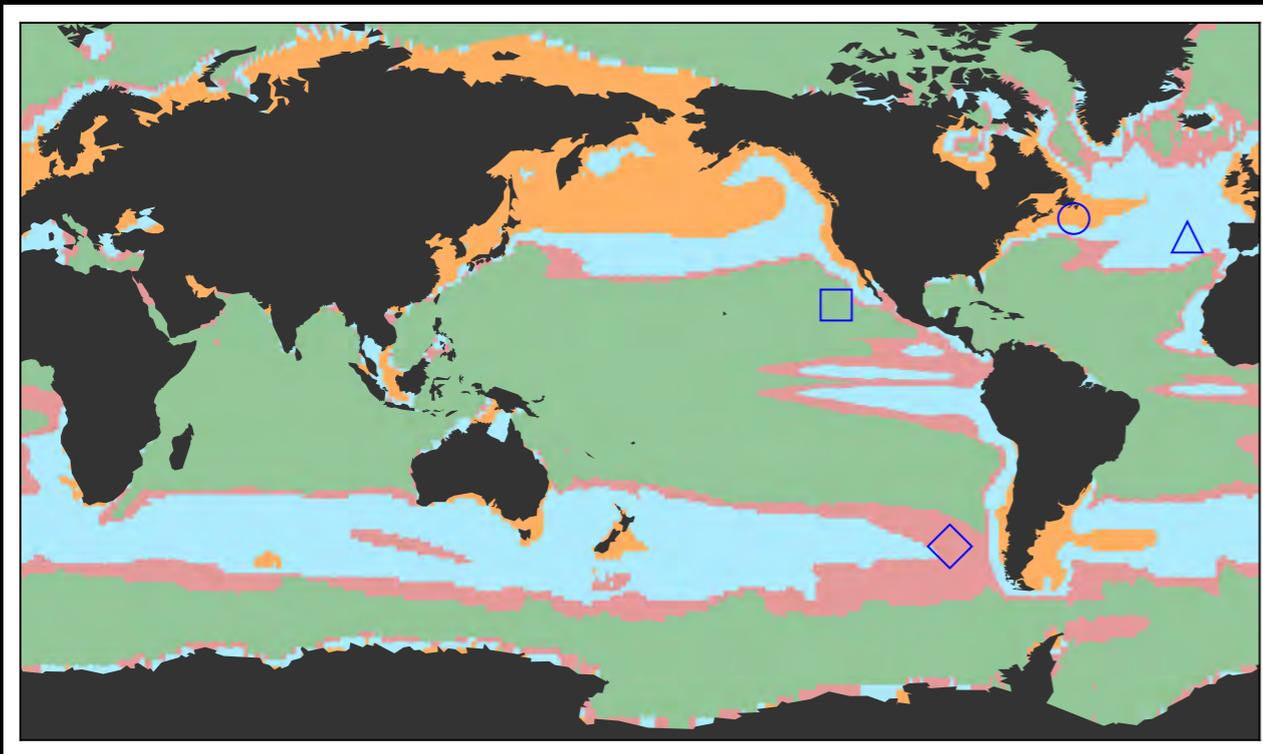
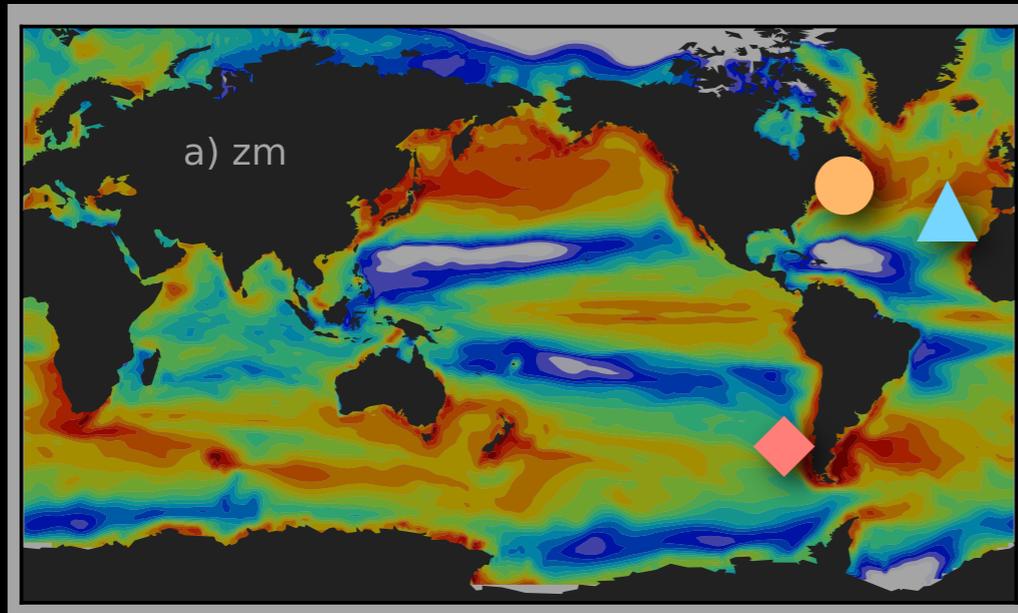


# A Size-based Model: results



Size-based model estimates biomass size spectra...

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Forage  
fish



~100g

>1kg



Top  
predator

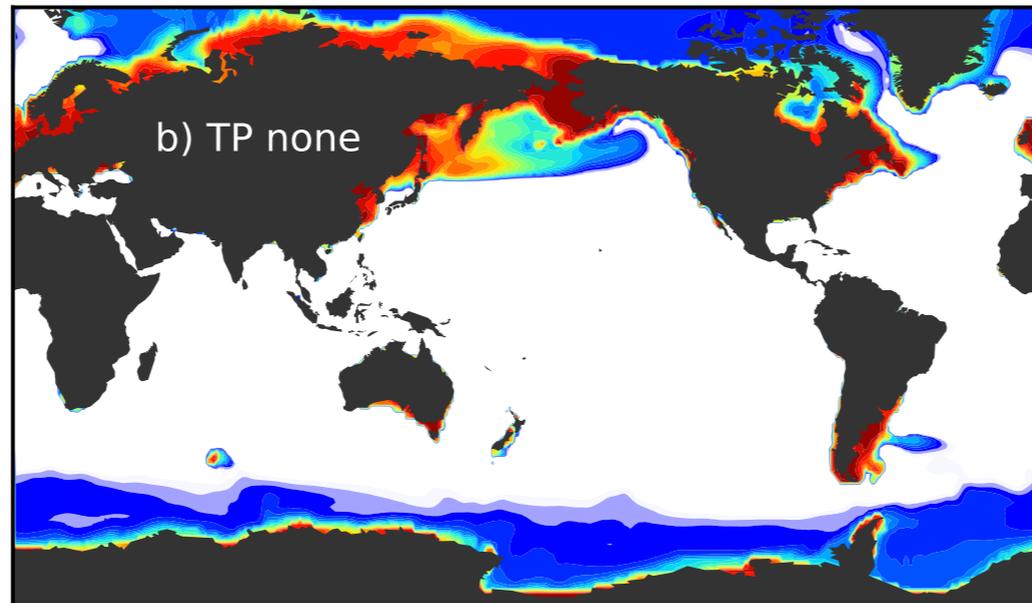
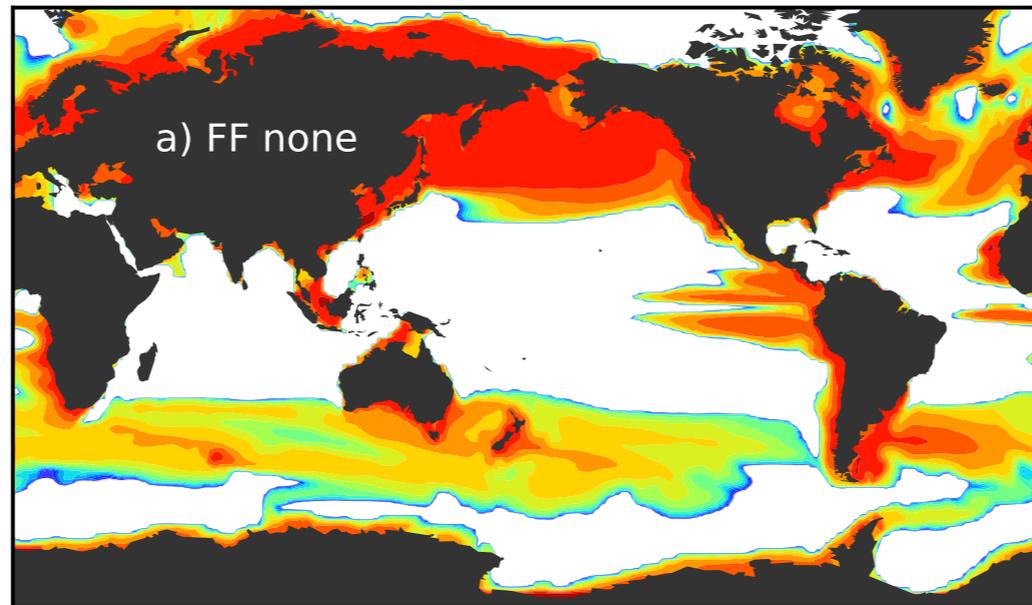
# A Size-based Model: results

Forage  
fish



~100g

-6.7 -6.1 -5.5 -4.9 -4.3 -3.7 -3.1 -2.4  $\log(gm^{-3})$



-6.7 -6.1 -5.5 -4.9 -4.3 -3.7 -3.1 -2  $\log(gm^{-3})$

>1kg



Top  
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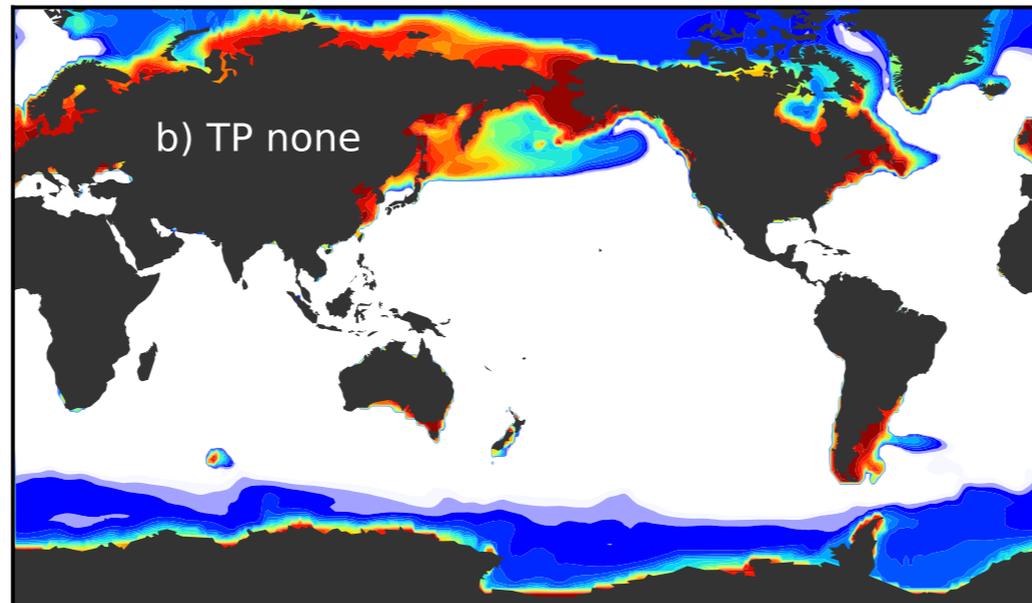
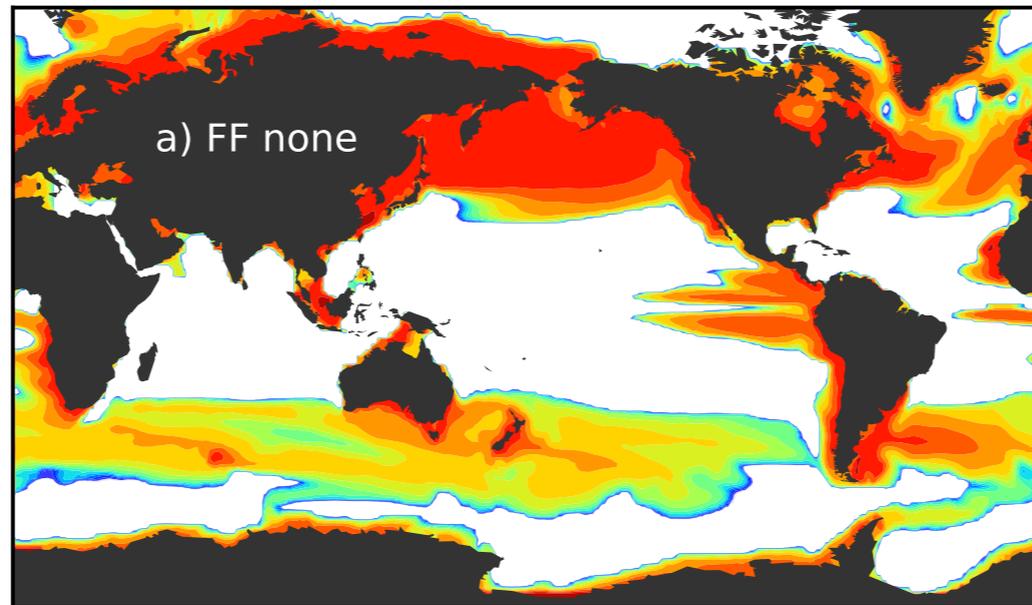
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No movement

>1kg



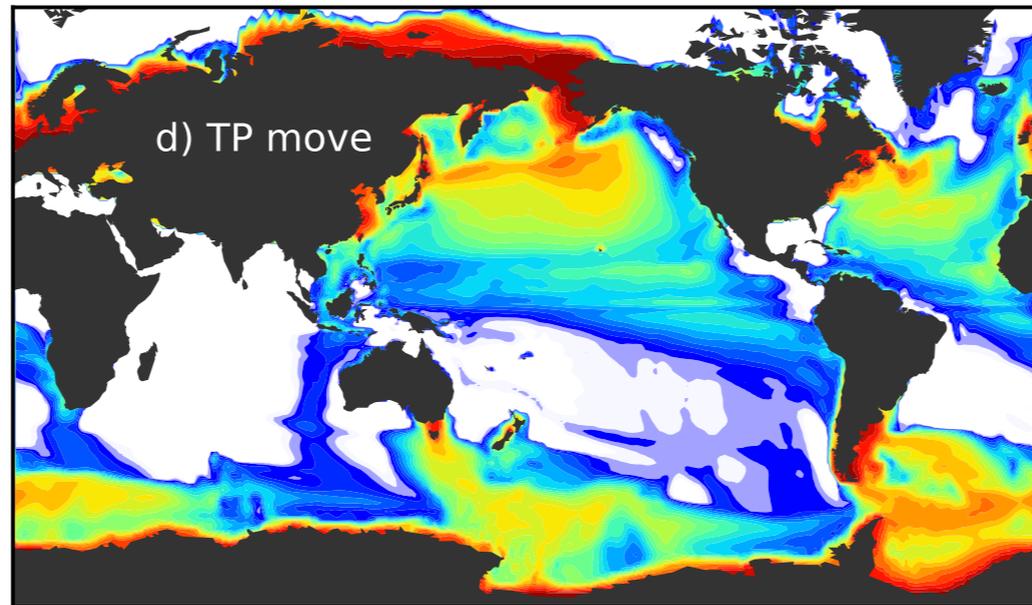
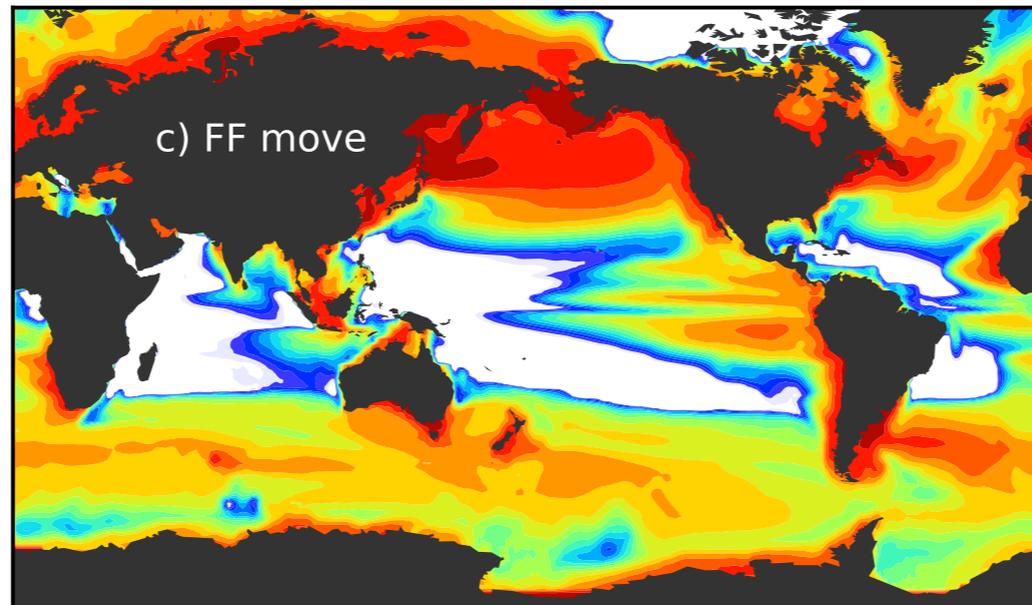
Top  
predator

# A Size-based Model: results

Forage  
fish



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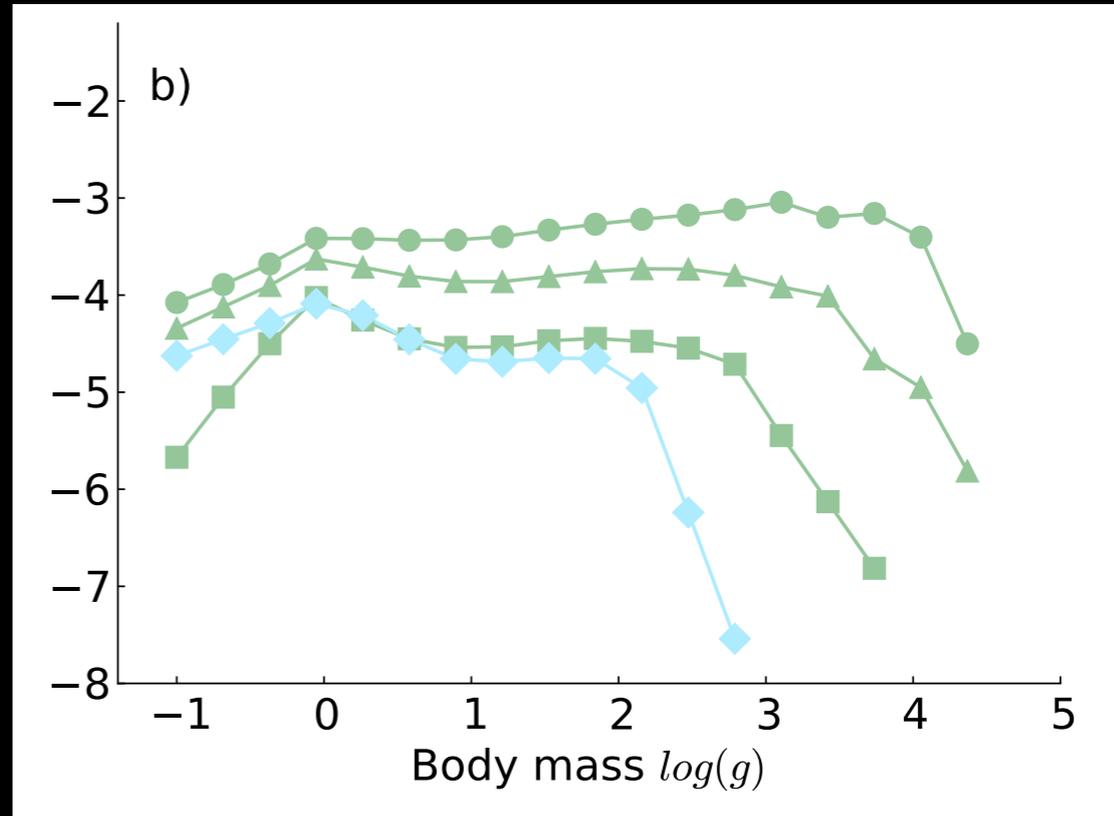
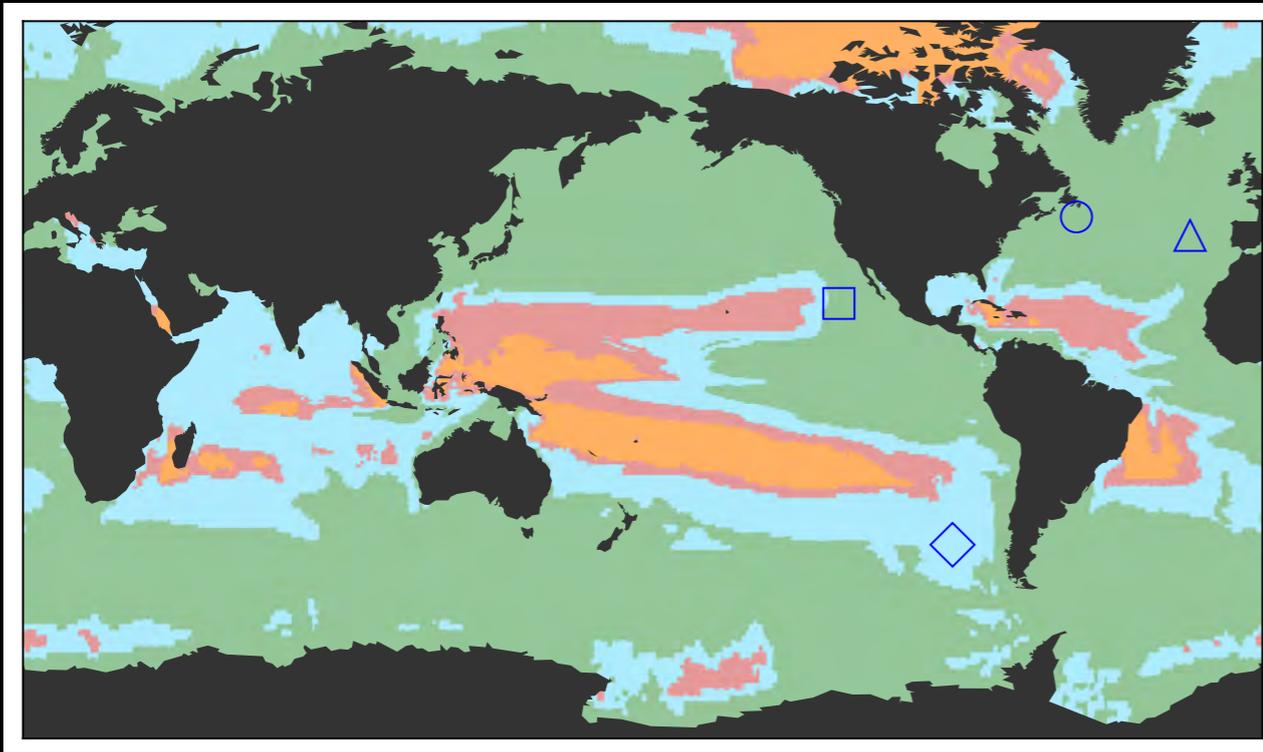
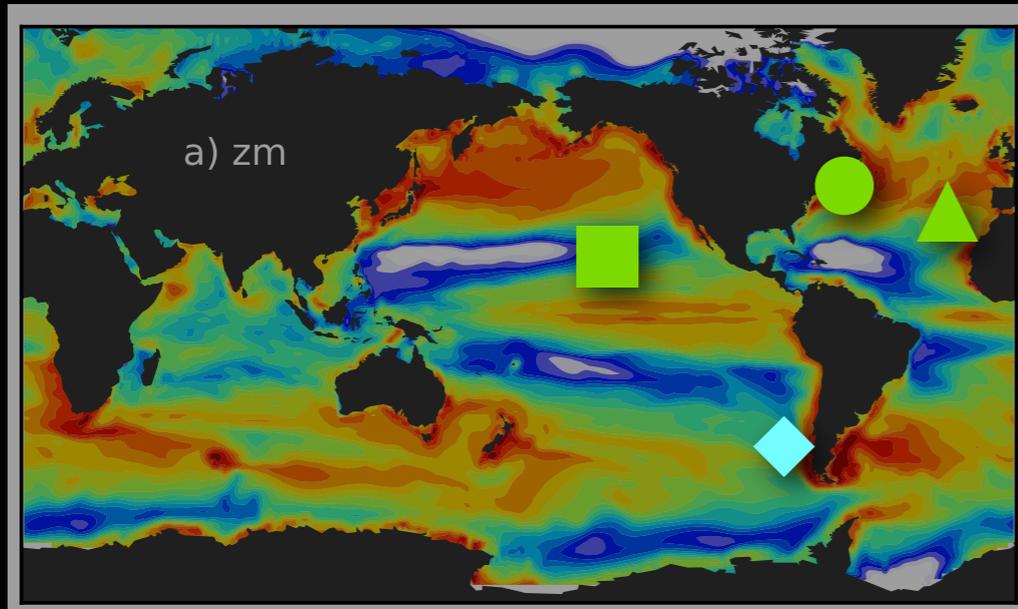
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With net-growth  
following movement



Top  
predator

# A Size-based Model: results



Ecoregions with net-growth following movement

# Limitations

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## Lacks species specific details:

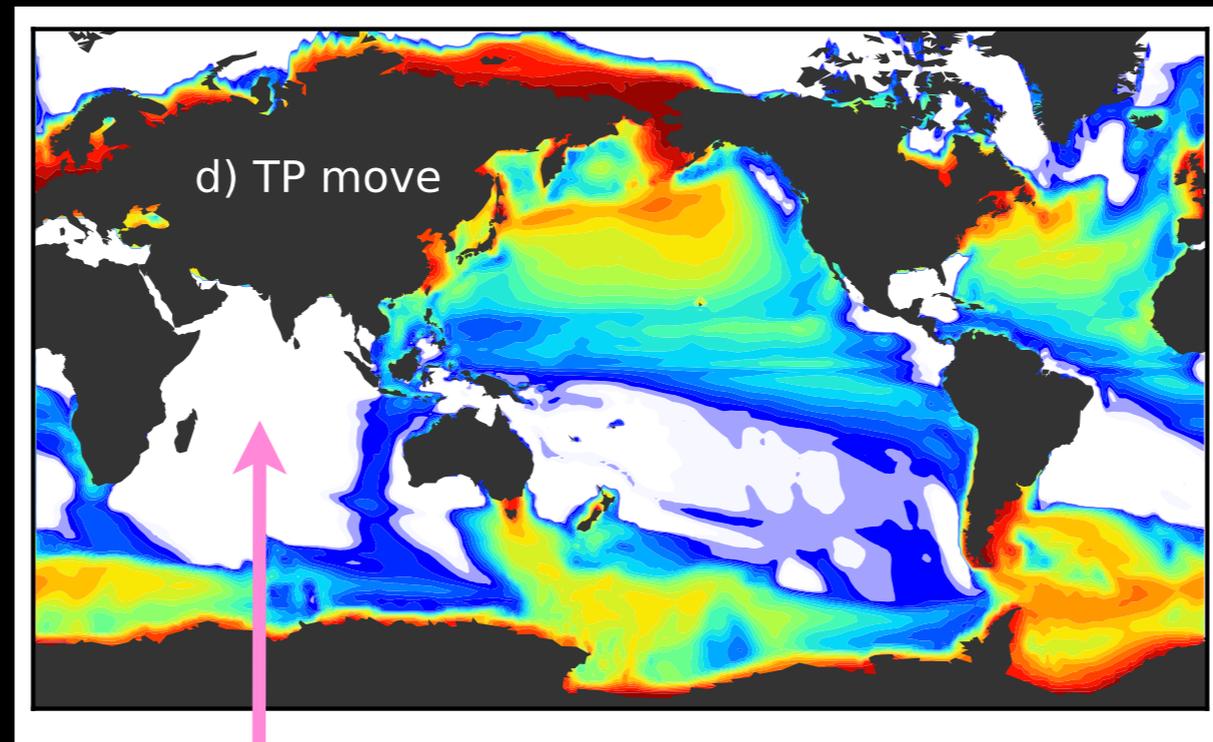
- Tuna in the Indian ocean
- No complex migration, no “extreme” parameters

# Limitations

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## Lacks species specific details:

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No big fish!



Top predator

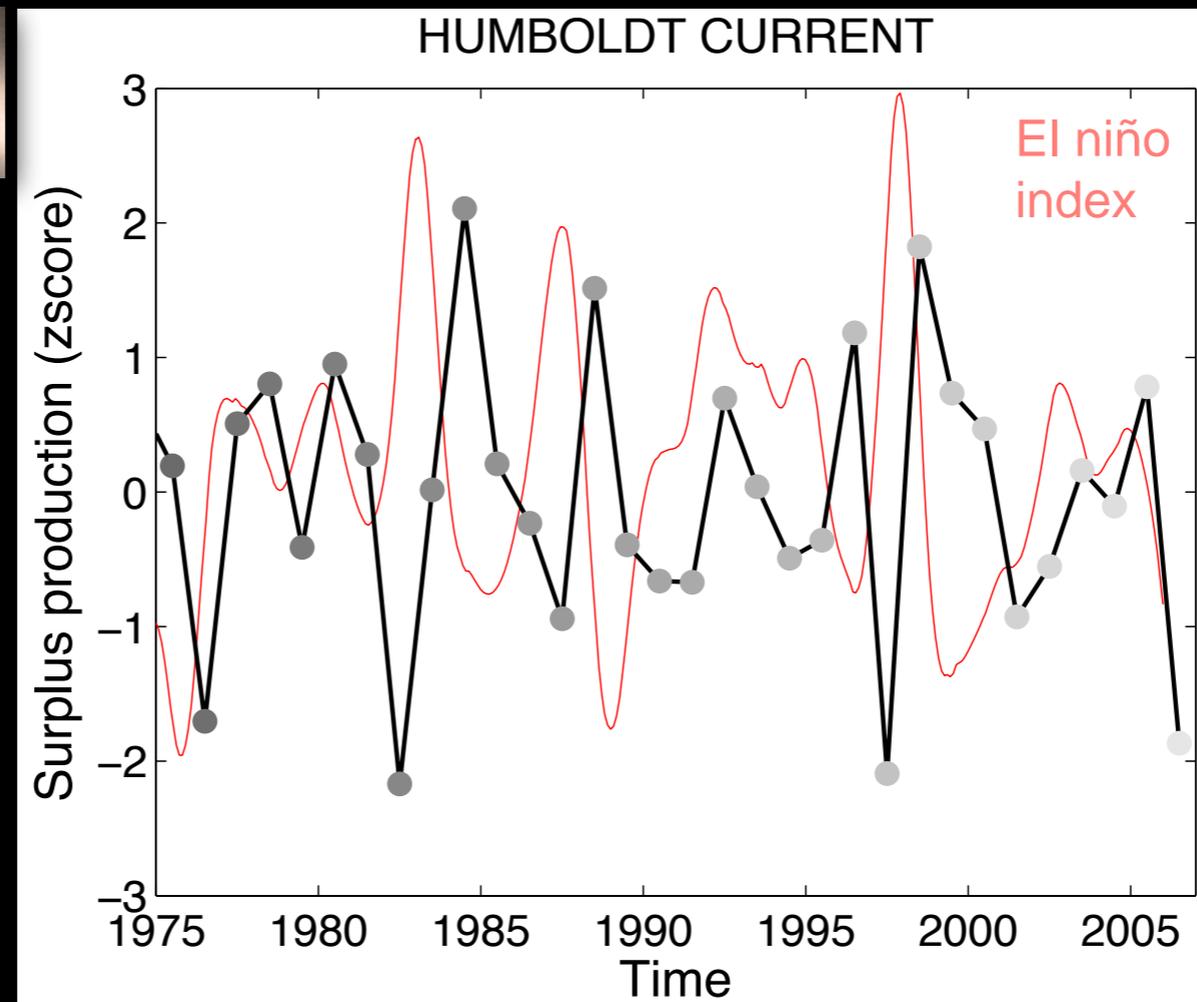
# Limitations

## Lack species specific details

- It can't resolve sardine and anchovy (only "forage fish")



~100g



# Limitations

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## Highly sensitive to parameters

Global ocean biomass (tonnes):  $\sim 86.2 \times 10^9$  (x30 Jennings et al. 2009)

Biomass production ( $\text{gm}^{-2}\text{yr}^{-1}$ ):  $\sim 0.5 \times 10^{10}$  (x0.5 Jennings et al. 2009)

Can completely change these results with a different consumption efficiency (0.7 to 0.5)

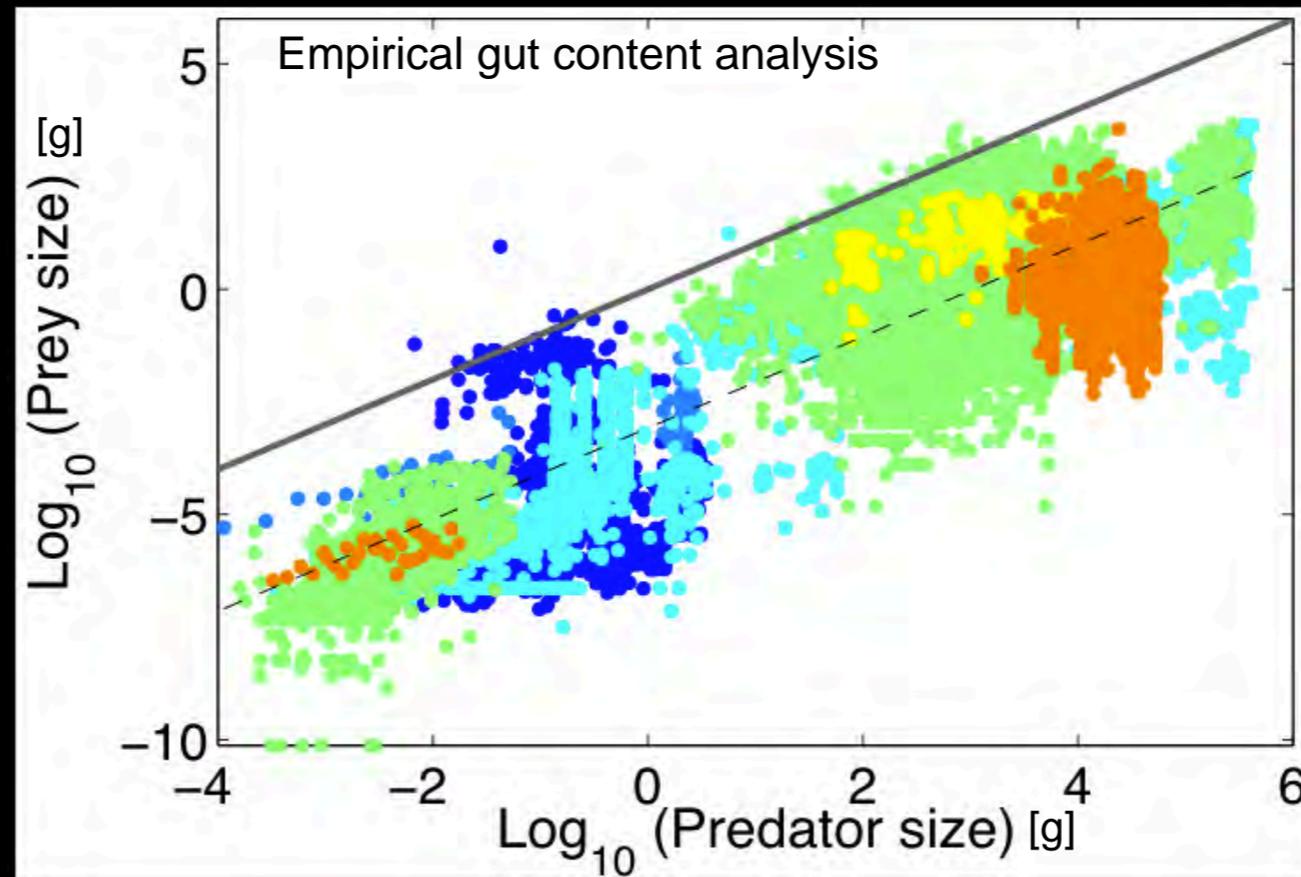
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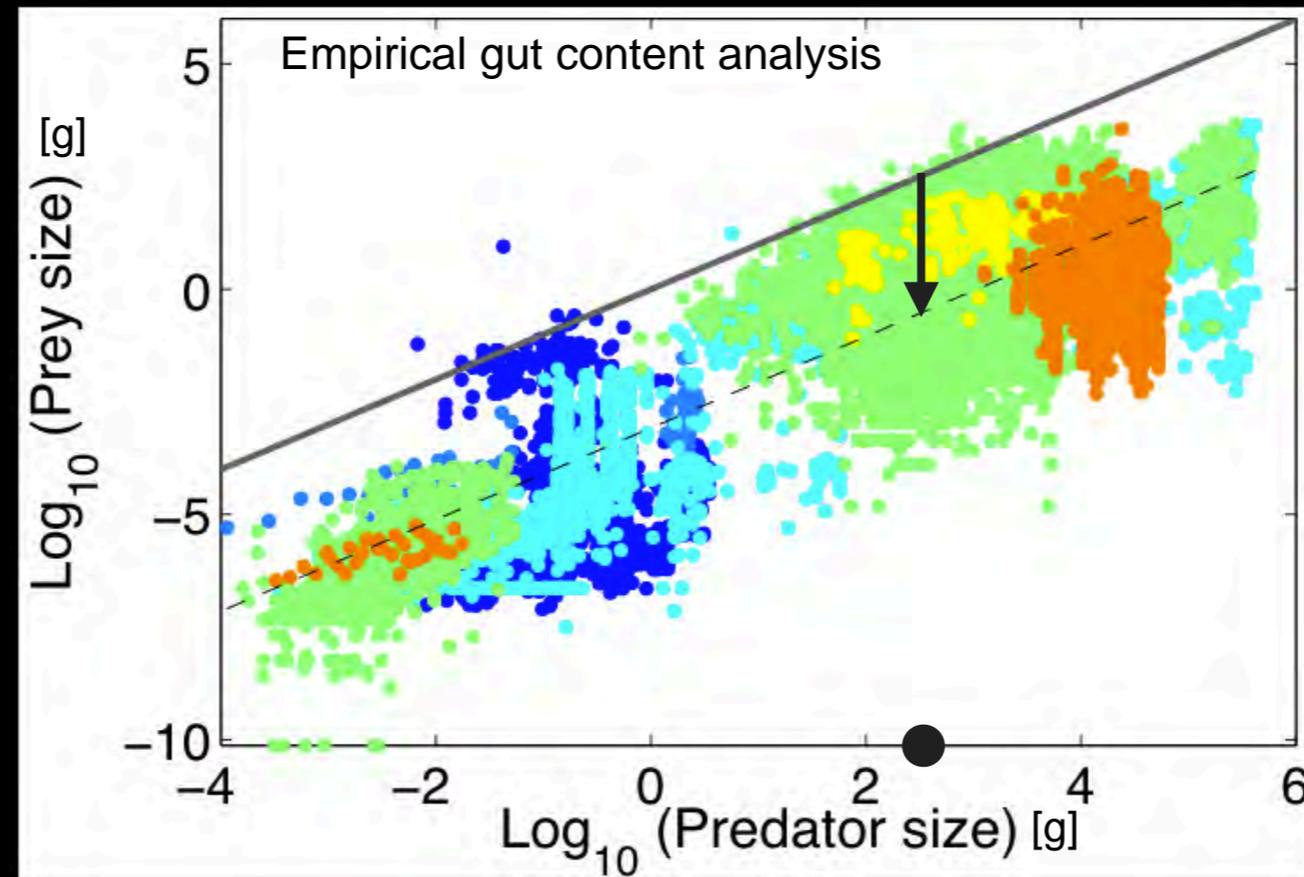
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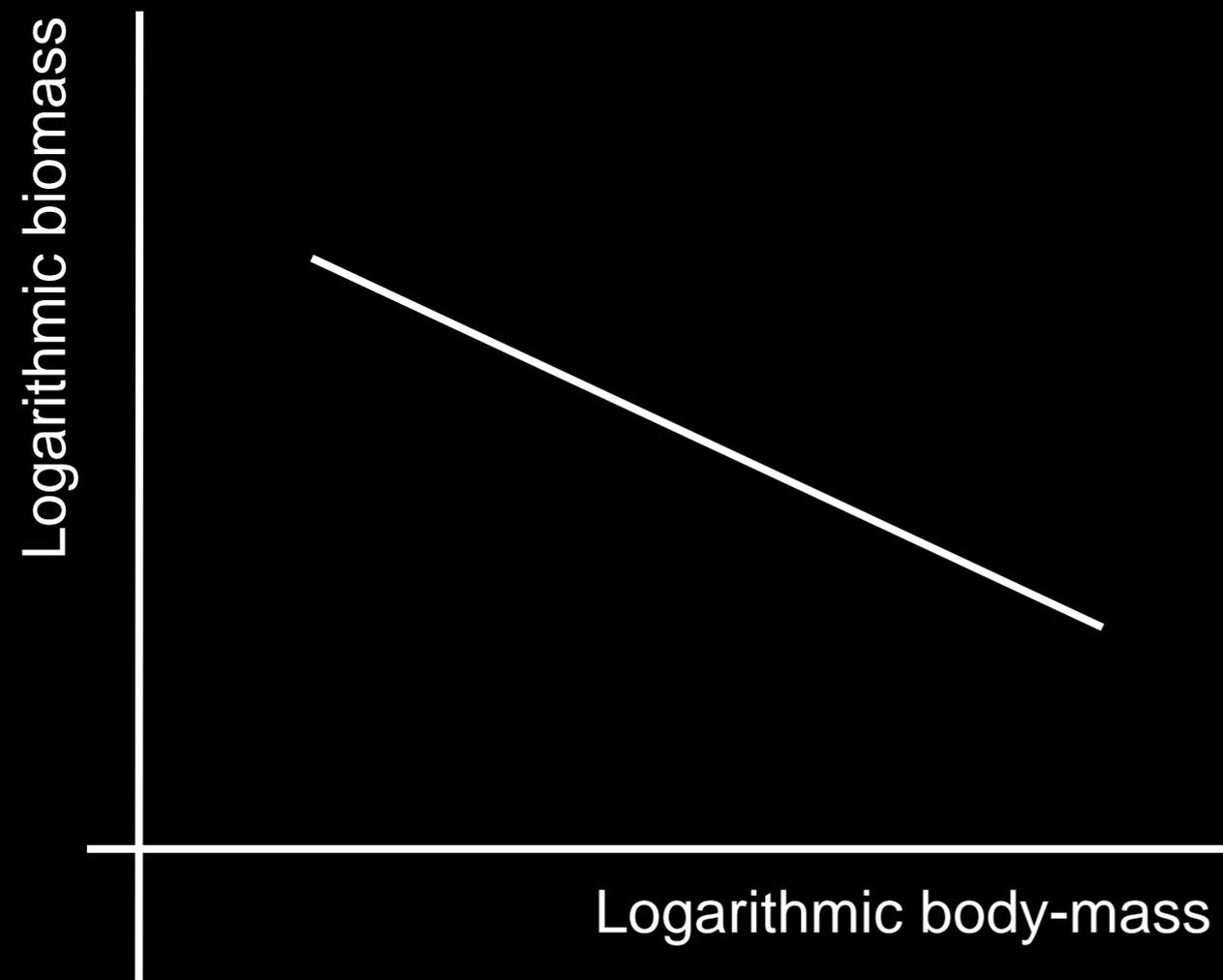
Barnes et al. 2009

# Comparison

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No ontogeny (not “size-structured”),  
- poor estimates of recruitment

Size-based population model

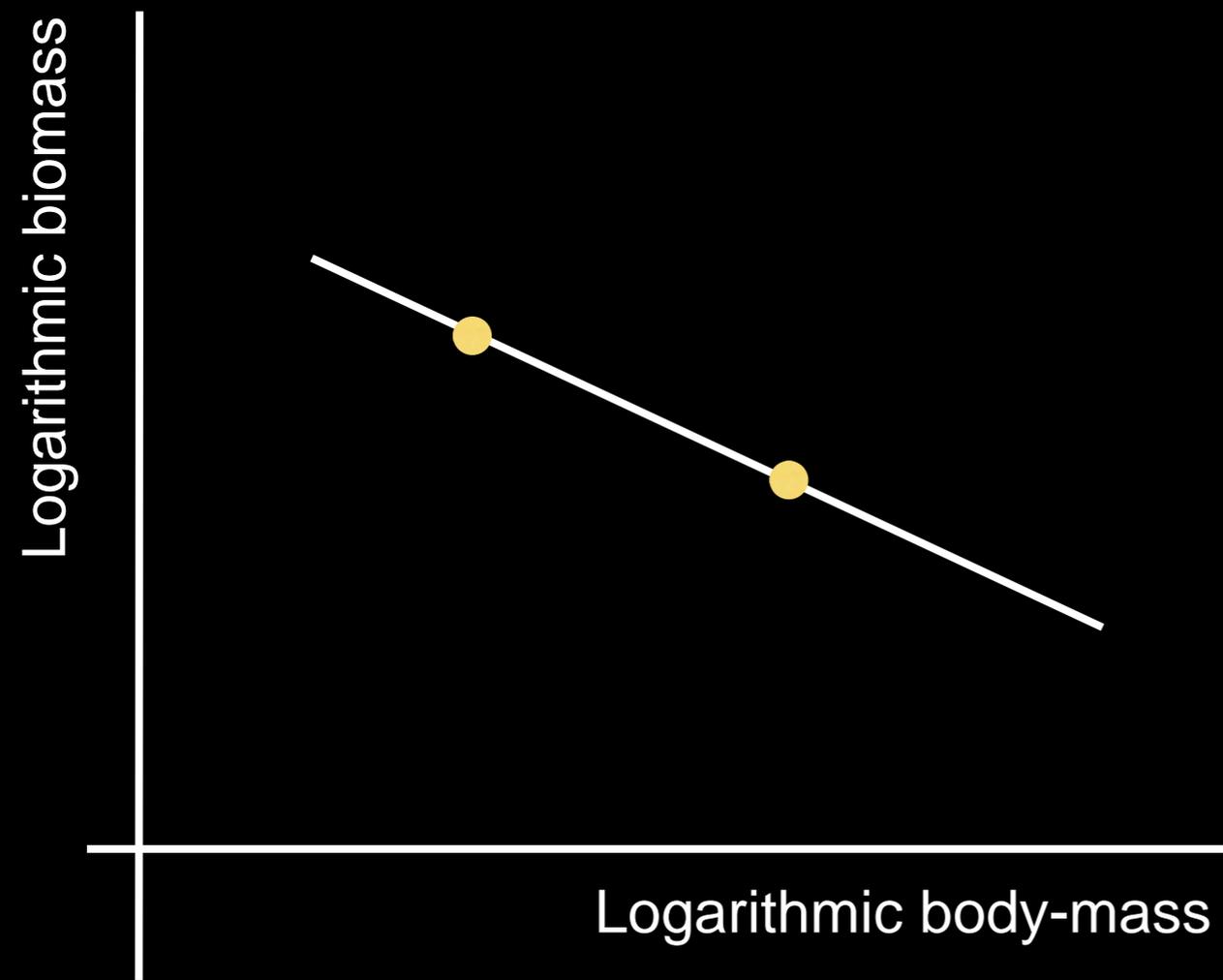


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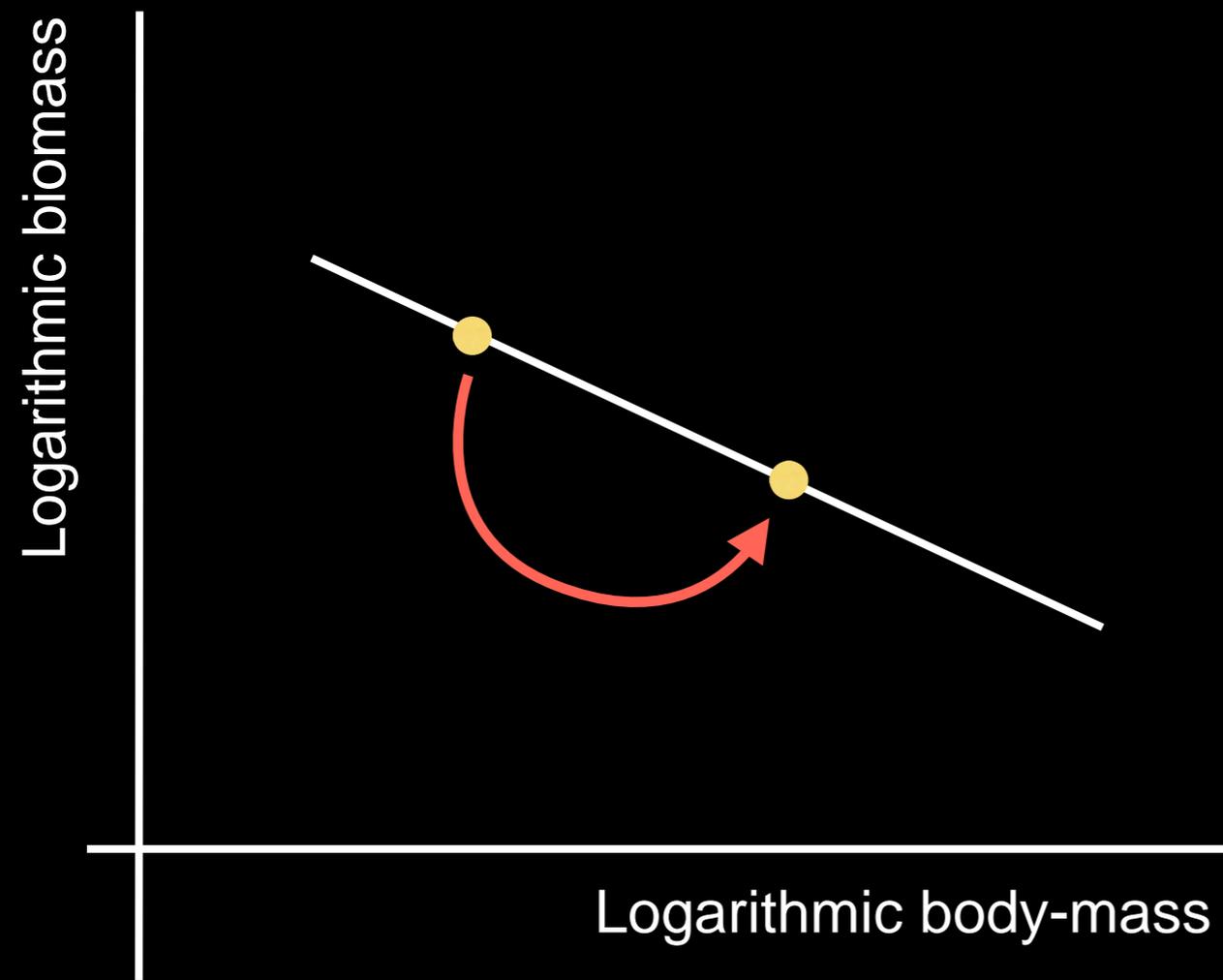


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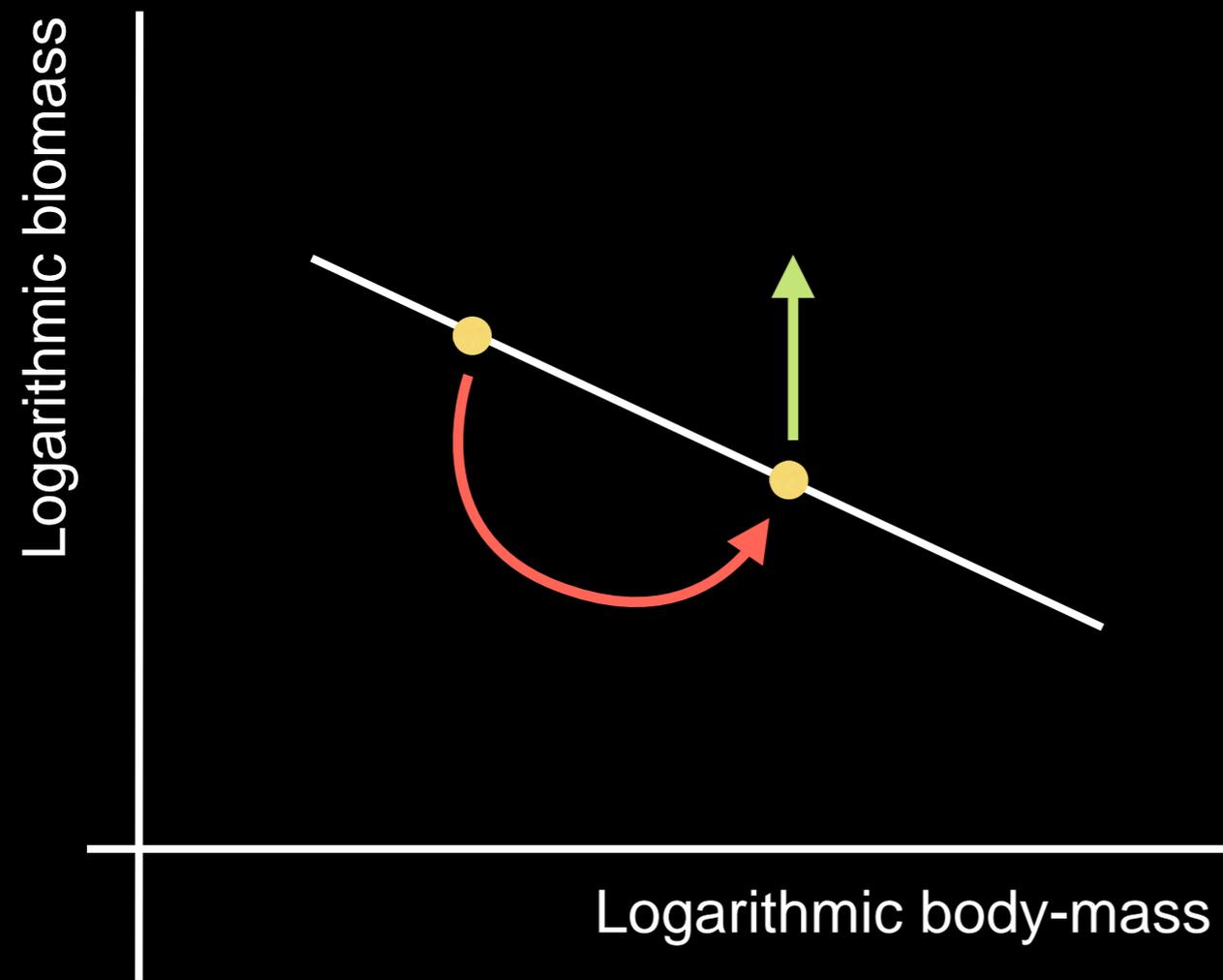


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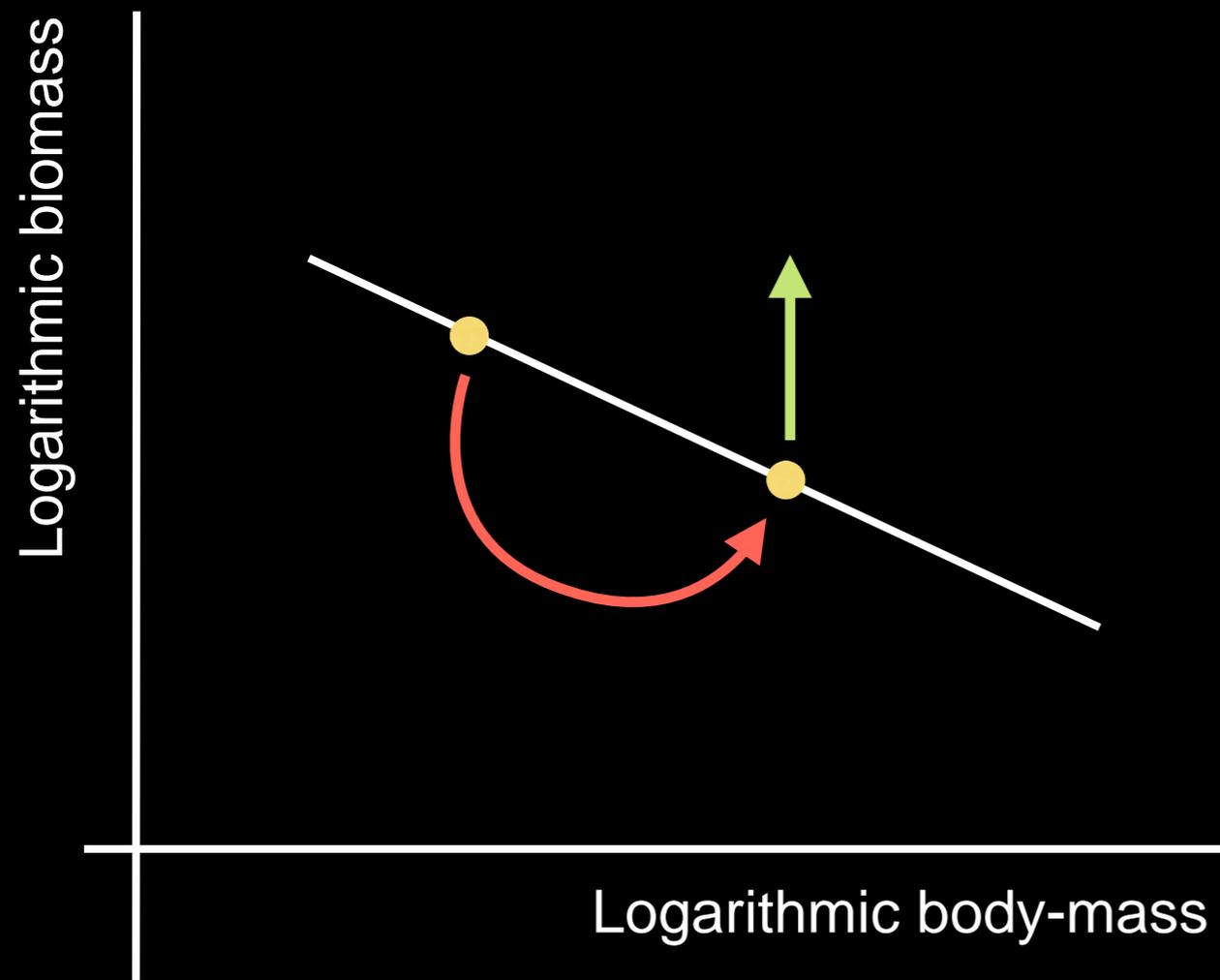


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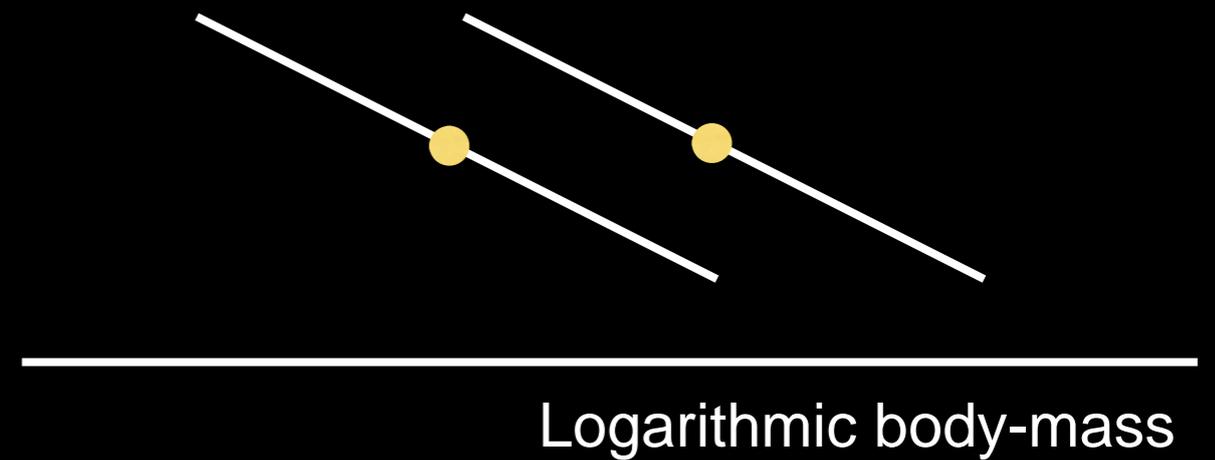
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Size-structured model

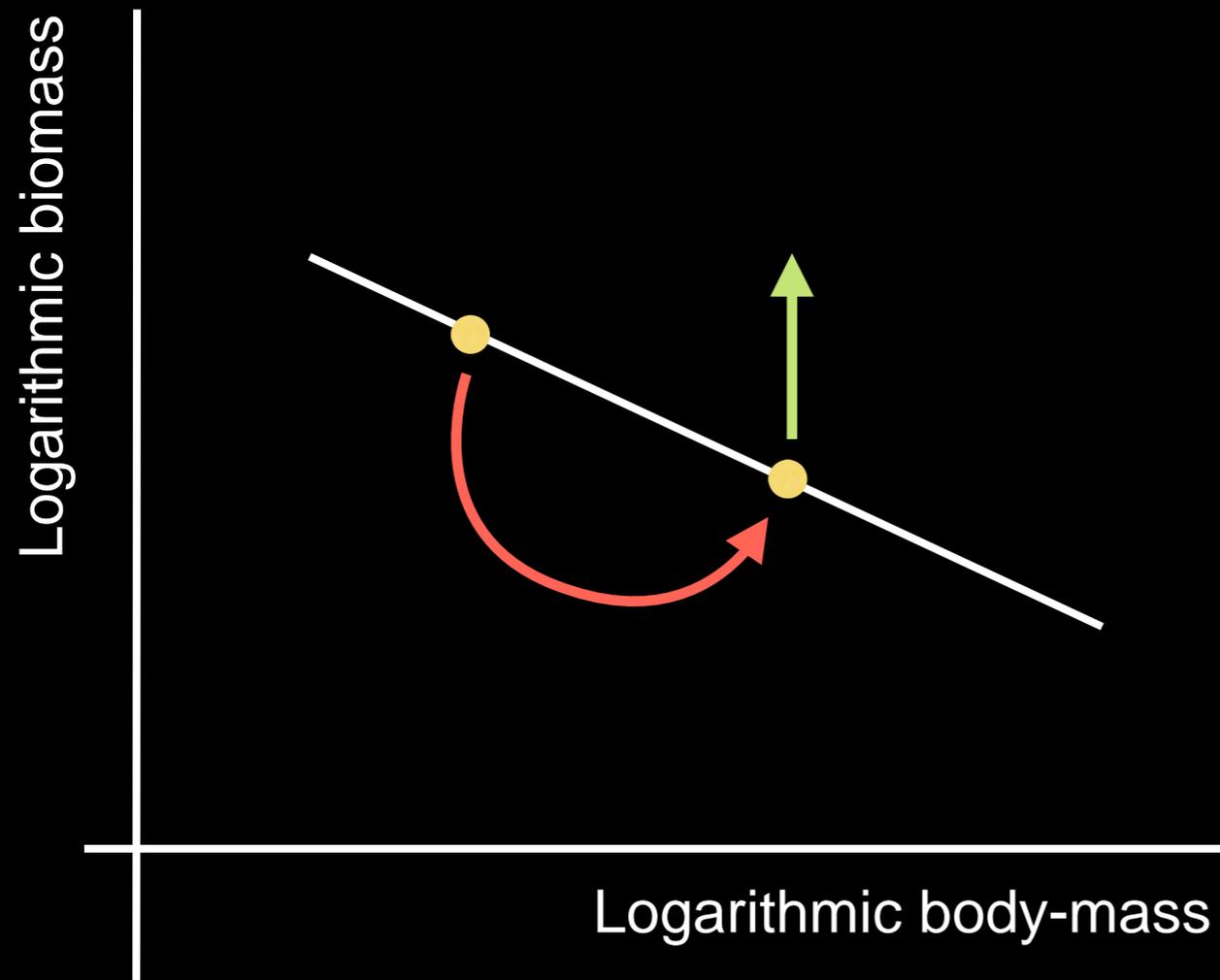


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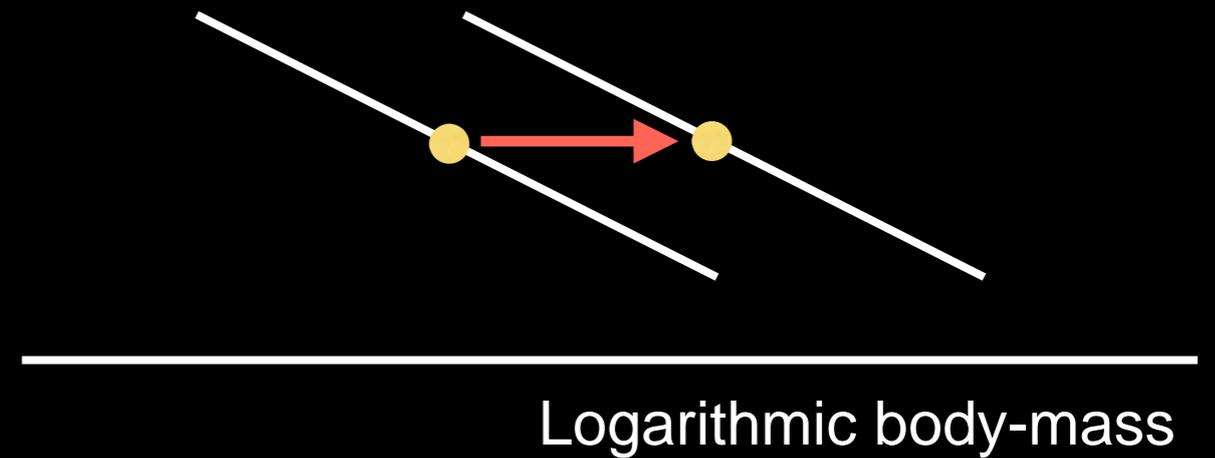
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Size-based population model



Size-structured model

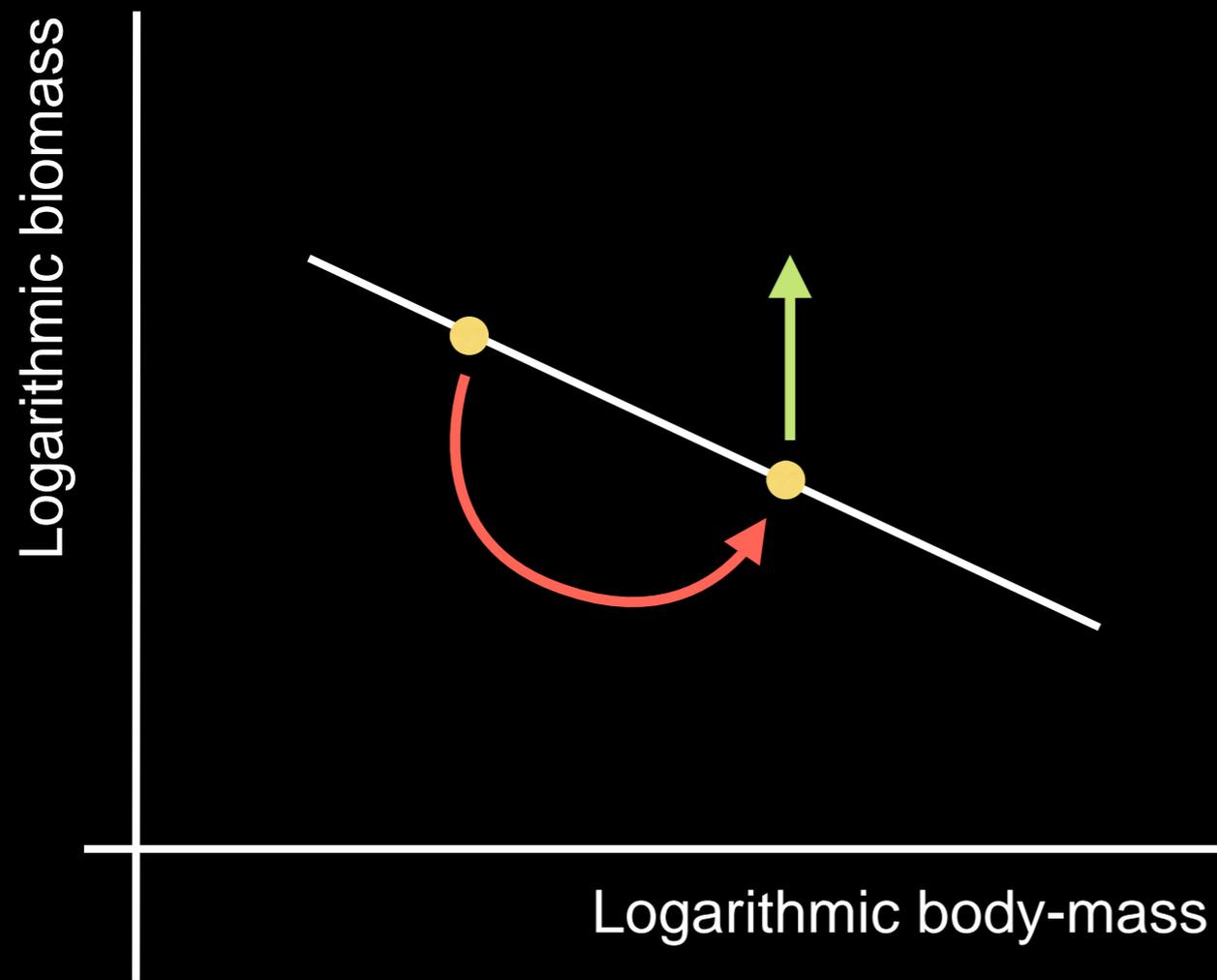


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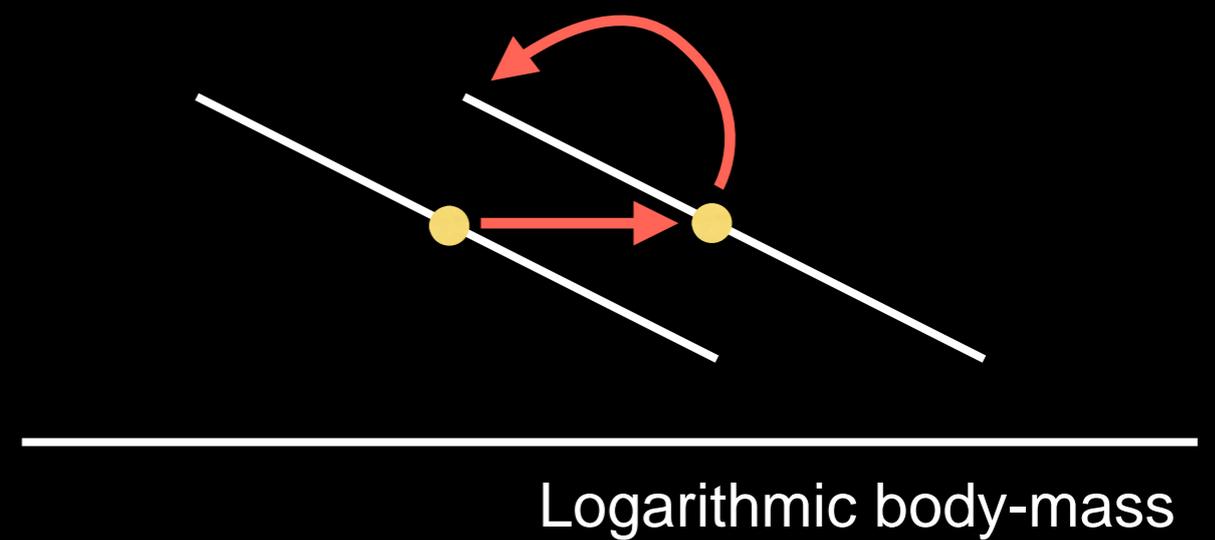
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Size-based population model



Size-structured model

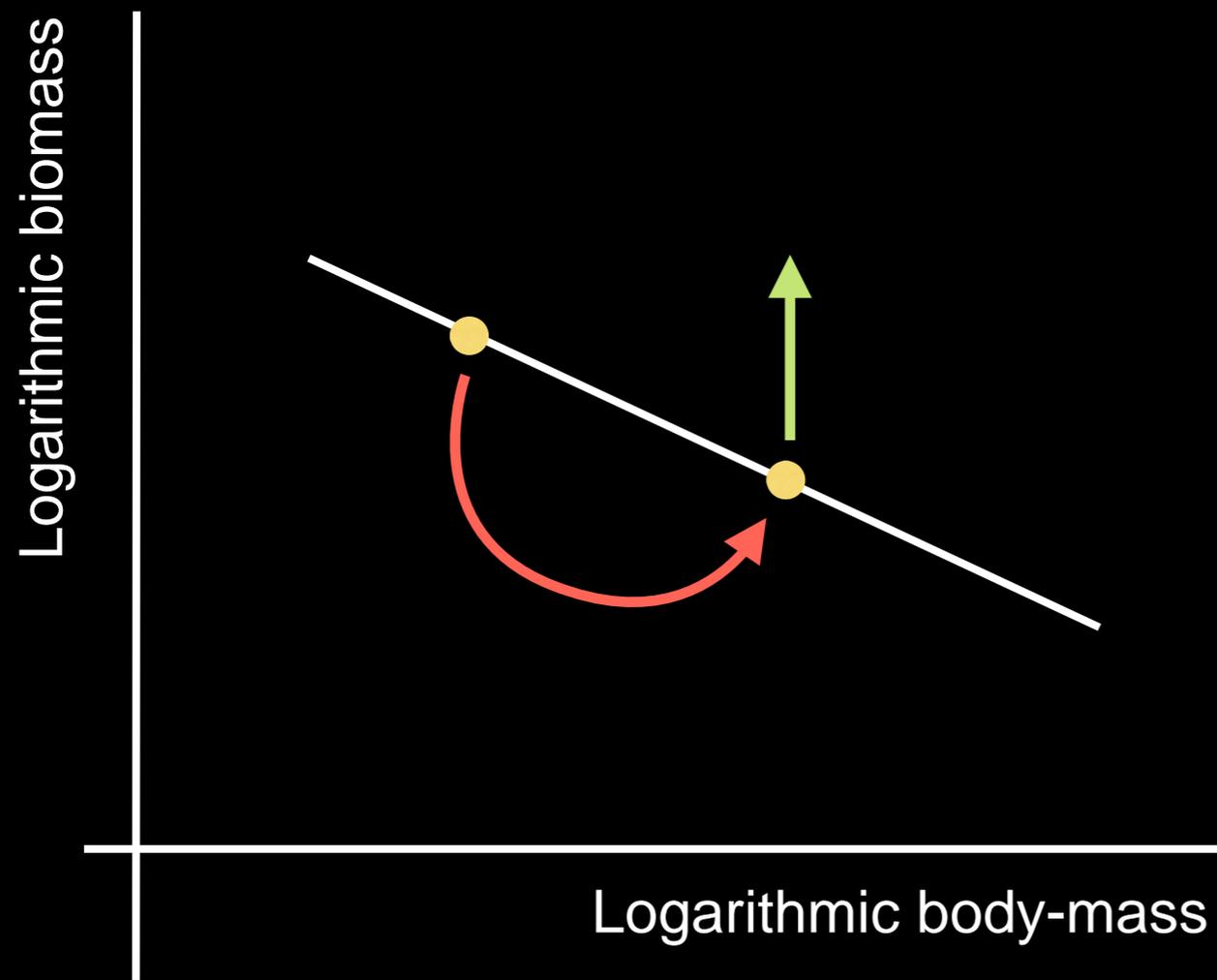


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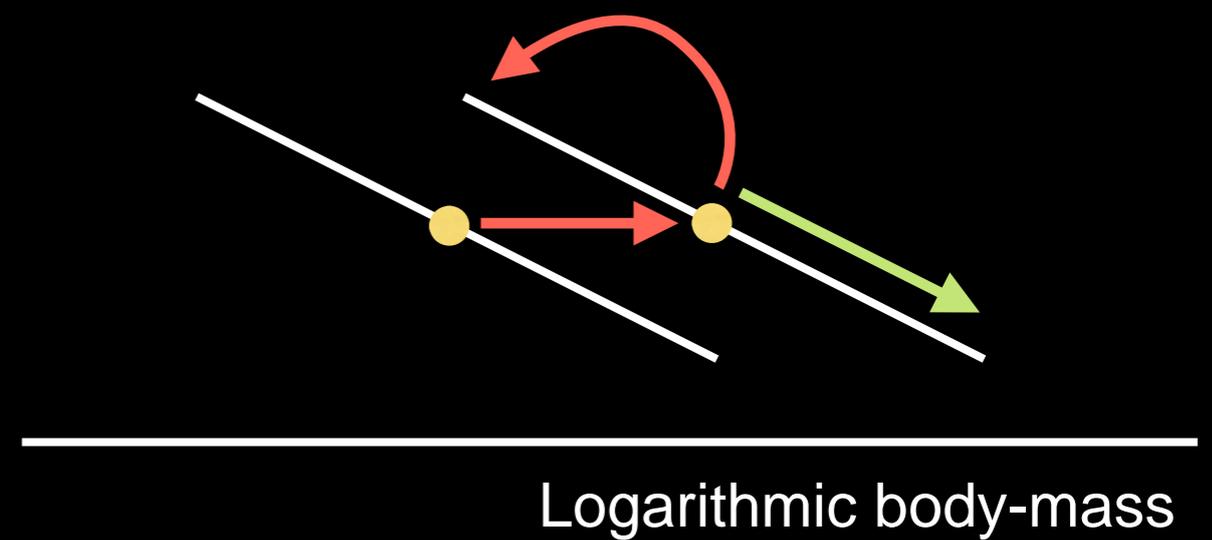
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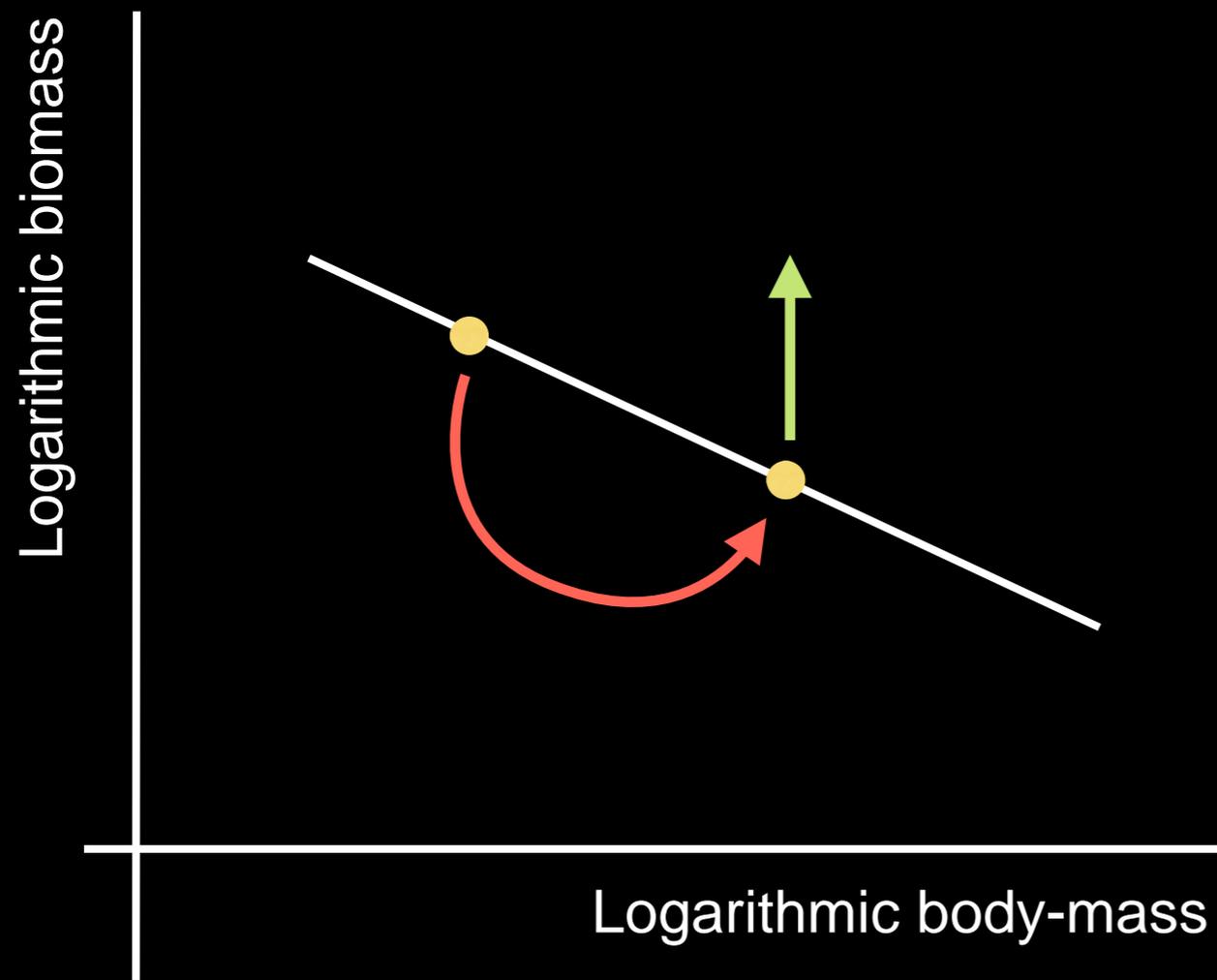
Size-structured model



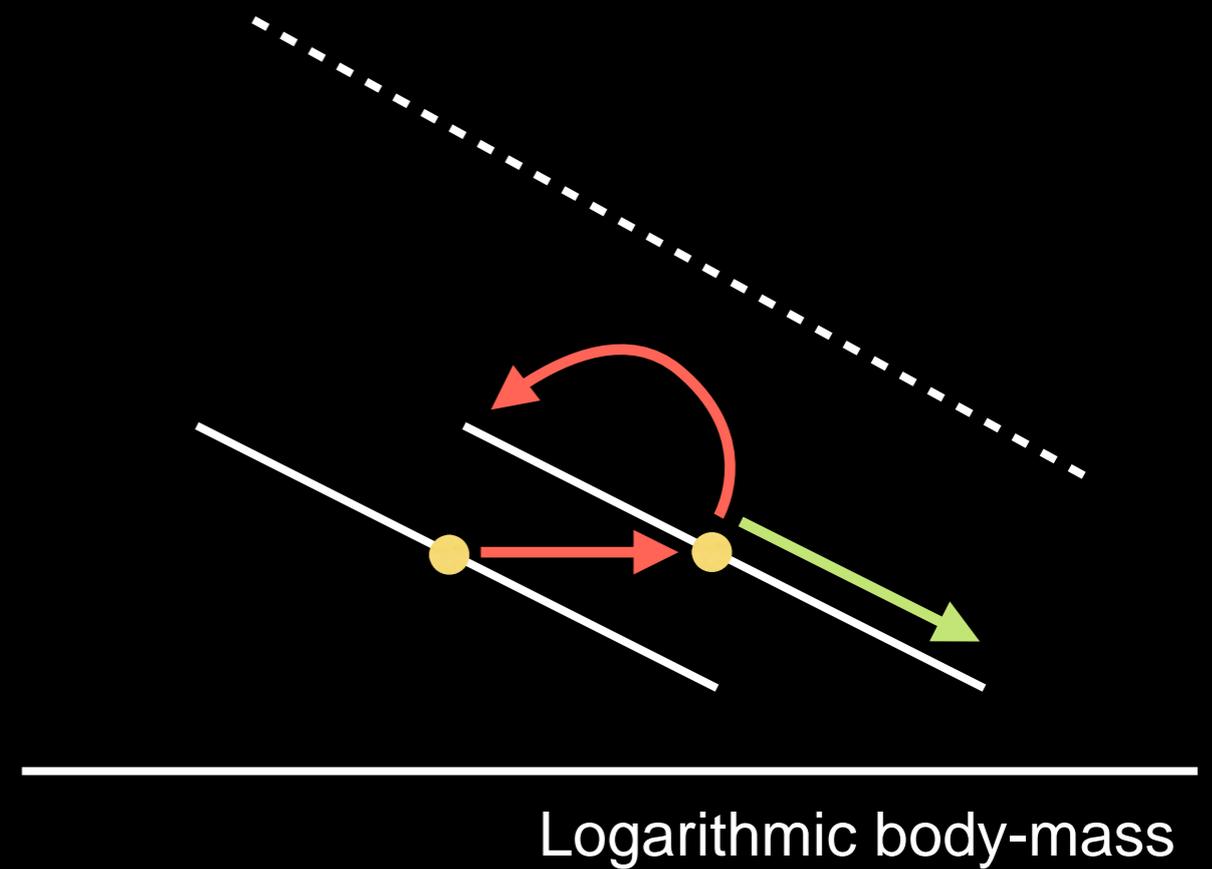
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Size-based population model



Size-structured model



# Summary

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## Size based models:

- ecological understanding: yes, movement is important
- prediction? useful **given the conditions**



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Jorge Sarmiento (Princeton)  
Simon Levin (Princeton)  
Charlie Stock (NOAA / GFDL)

Emma Fuller (Princeton)  
Andrew Tilman (Princeton)  
Malin Pinsky (Rutgers)

... and many others

James Watson  
jrwatson@princeton.edu





# Thank you

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