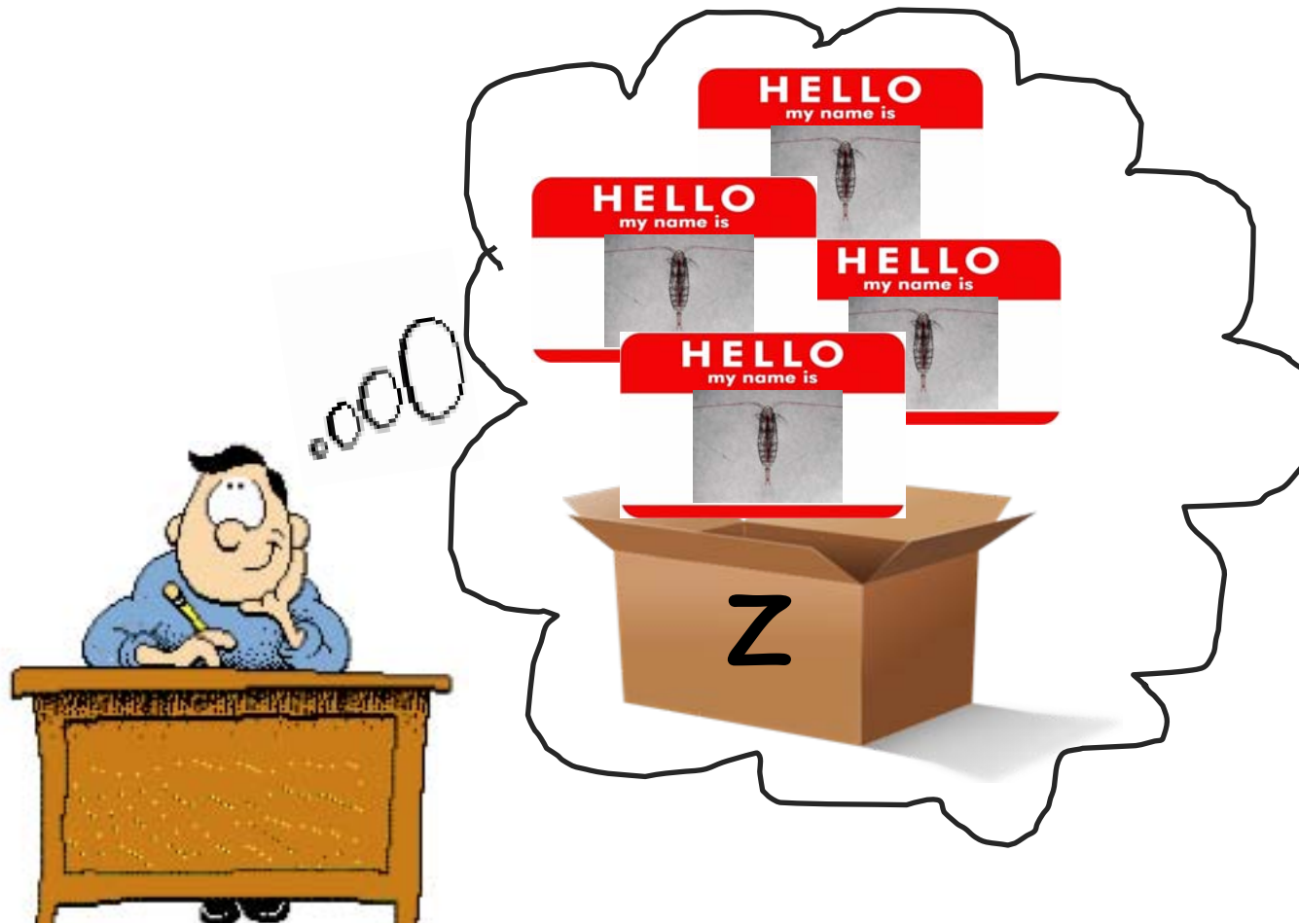


# THINKING OUTSIDE THE Z-BOX: How Individual-Based Models (IBMs) Can Advance Zooplankton Ecology



Wendy Gentleman

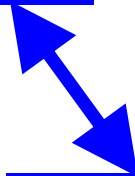
5<sup>th</sup> Zooplankton Production Symposium, CAN, Dalhousie University, CAN, Chile. Mar 2011

# ADVANCING ZOOPLANKTON ECOLOGY

*In situ*



*In vitro*



*In silico*



Test hypotheses

Quantify importance

Estimate

Design Studies

Identify gaps

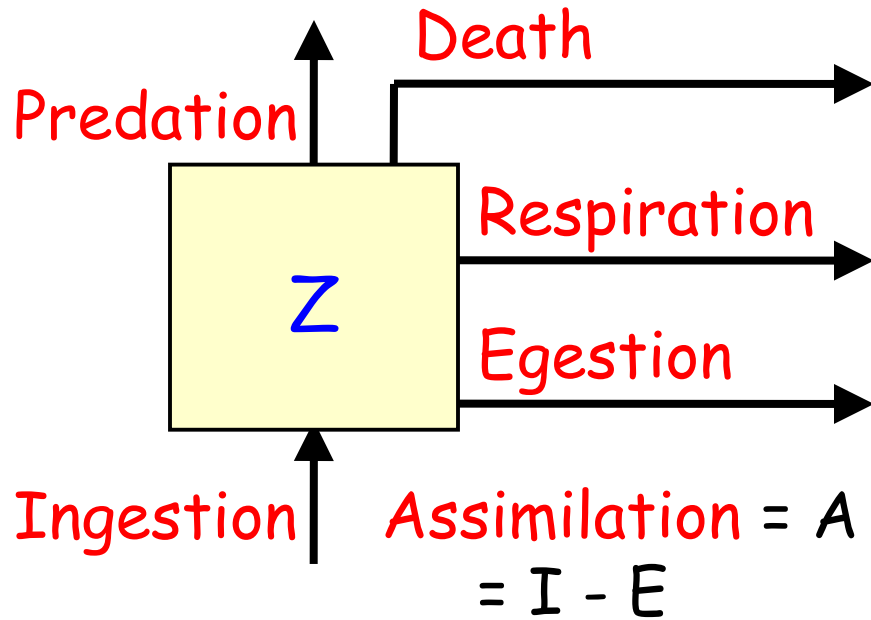
Interpret data

Assess sensitivity

Predict

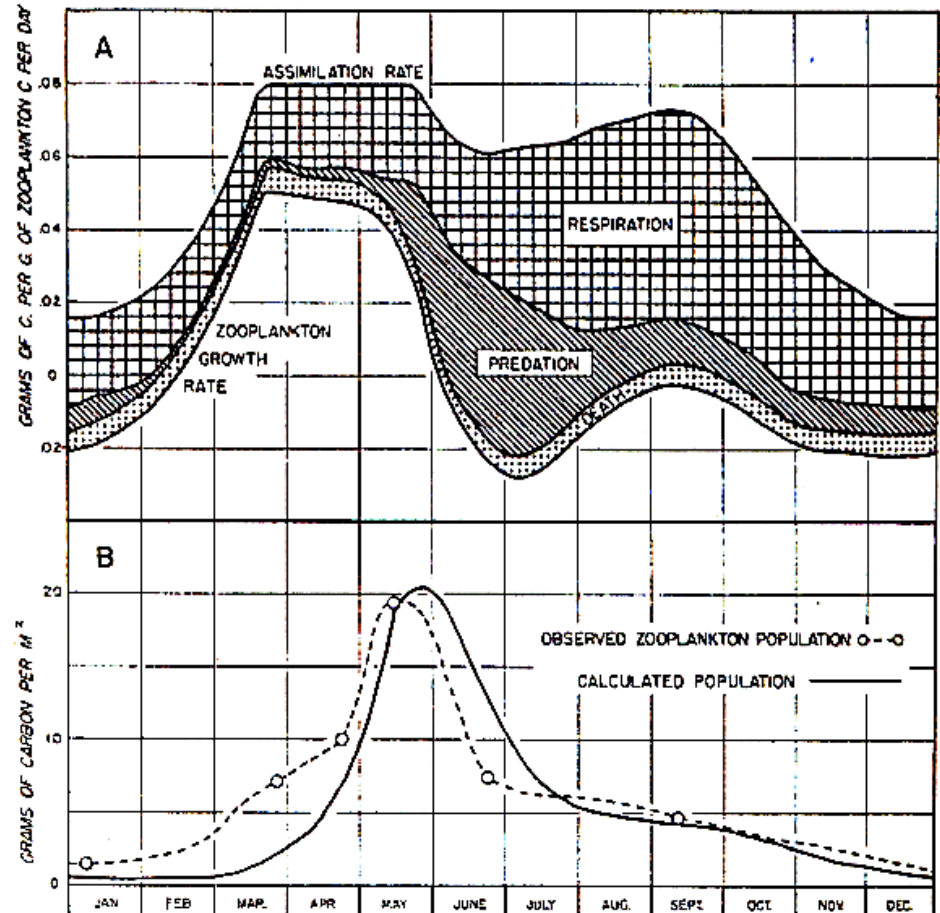
# FIRST Z-DYNAMICS MODEL: RILEY 1947

$Z$  = Herbivore volume, converted to  $C/m^2$



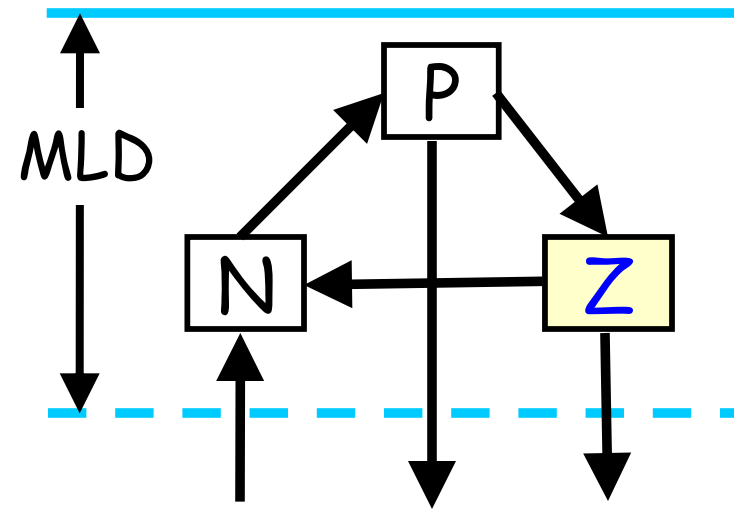
$$\frac{dZ}{dt} = A(P) - R(T) - D - P(C)$$

$P$  = Phytoplankton  
 $T$  = Temperature  
 $C$  = Carnivores



Understand Z-box dynamics by variation in rates (arrows)

# NPZ ECOSYSTEM MODELS



Questions about Z (or P)  
-- Grazing arrow links Z to P

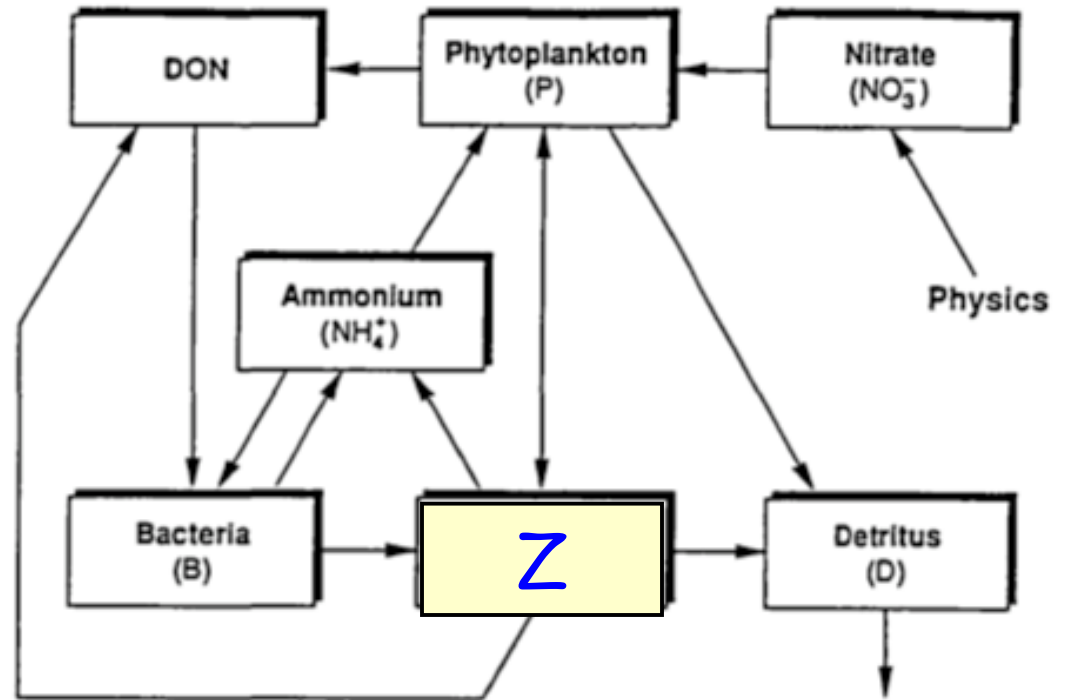
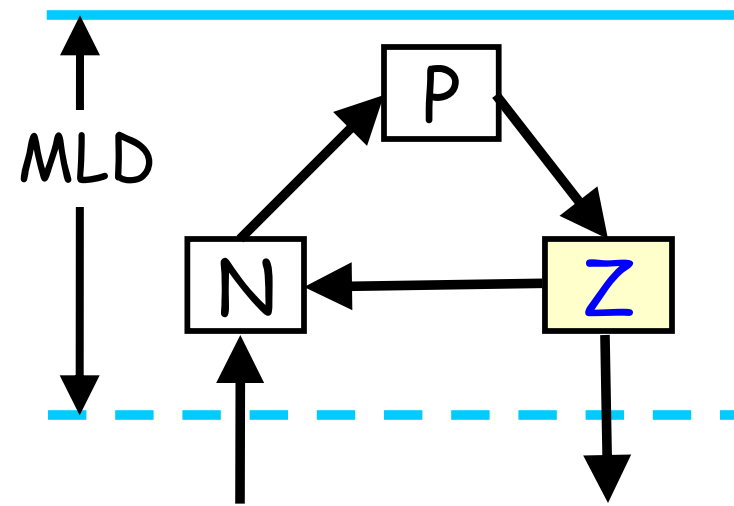
Questions about N  
-- Recycling arrow links Z to N

Questions about Z (or N or P)  
-- Transport arrows link Z (N & P)  
to physics & behavior

1950s - 60s: Riley, Steele

1980s: Evans & Parslow, Franks et al.

# "NPZ-TYPE" ECOSYSTEM MODELS

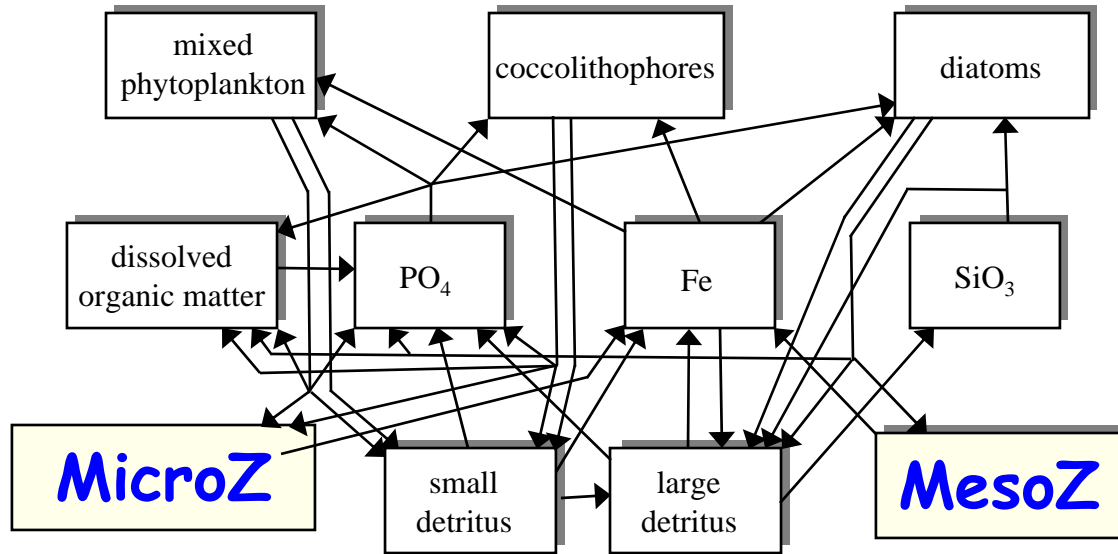


1950s - 60s: Riley, Steele  
1980s: Evans & Parslow, Franks et al.

Fasham et al. 1990

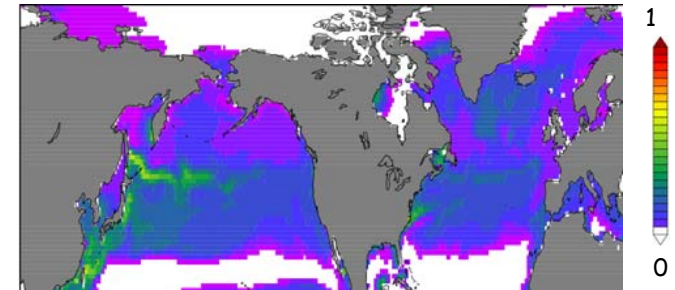
Single Z-box ecosystem models still used today  
But, arrows & questions limited by aggregate Z-box

# SOME ECOSYSTEM MODELS USE 2+ Z-BOXES

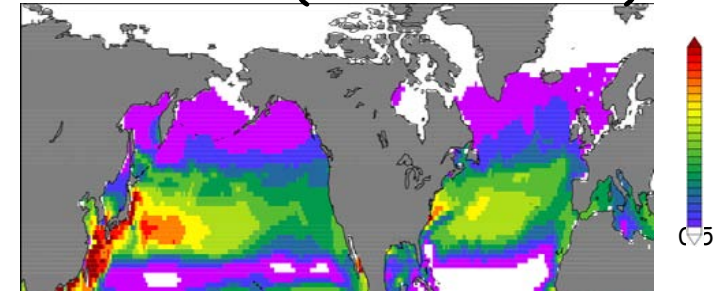


Anderson et al., 2010

Surface Chl (mg/m<sup>3</sup>)



Prim. Prod (mmol C/m<sup>3</sup> d)



(Often) better grazing & recycling arrows  
But, arrows and questions limited by aggregate mesoZ-box  
(and maybe microZs too, e.g. Neilsen talk on Monday)

# STRUCTURED MODELS OF MESO-Zs (COPEPODS)

Copepod ecological role governed by stage structure



Eggs



Nauplii



Copepodites

$Z_{\text{Copepods}}$



# STRUCTURE MODELS OF MESO-Zs

Copepod ecological role governed by stage structure



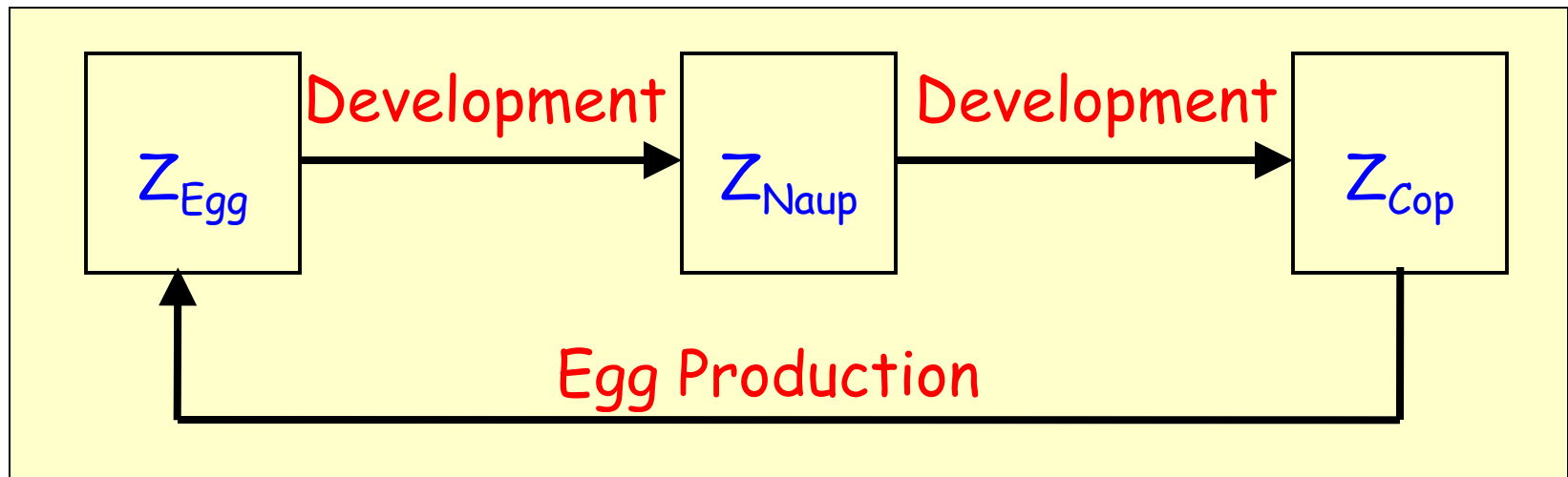
Eggs



Nauplii



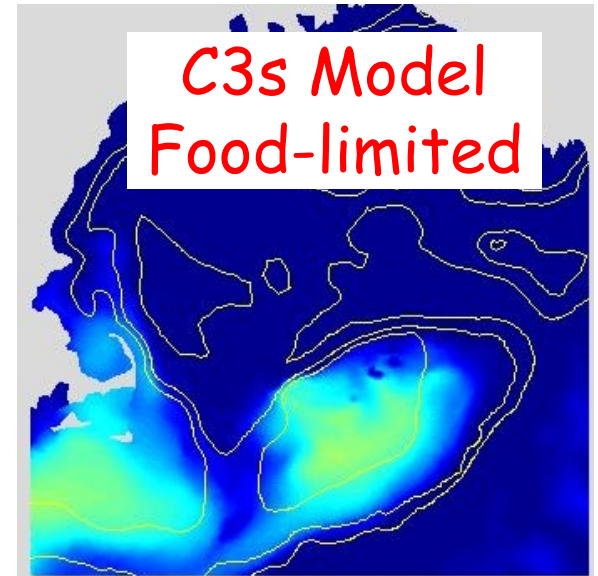
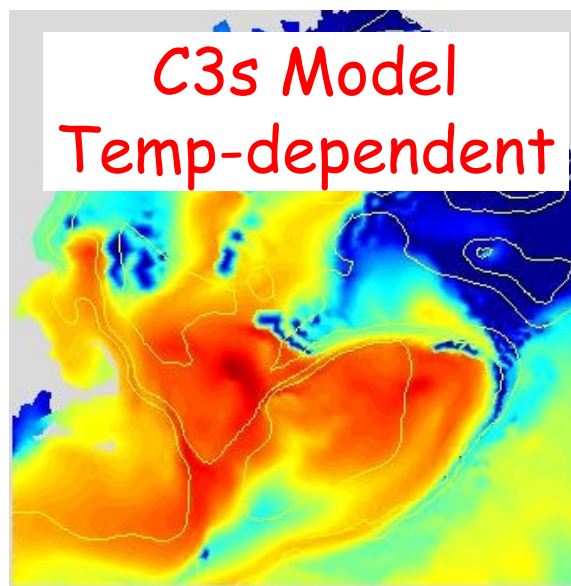
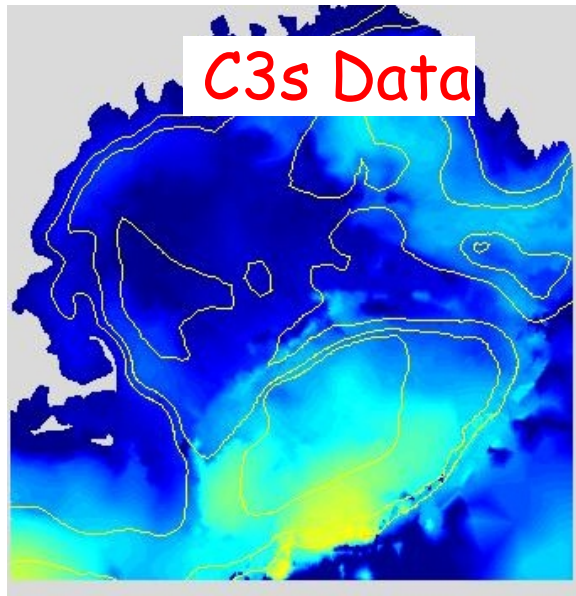
Copepodites



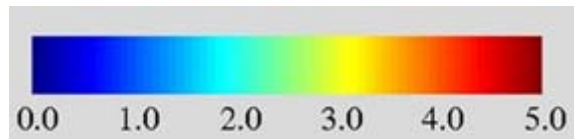
Ingestion & Mortality arrows typically forcing functions



# HOST OF STRUCTURED MODEL APPLICATIONS (1970s - TODAY)



Log Scale  
Abundance



Gentleman, 2000

Good for patterns of spatial demography and production  
But, arrows limited by math of development & transport

# INDIVIDUAL-BASED MODELS (IBMs)

For an individual

**HELLO**  
my name is

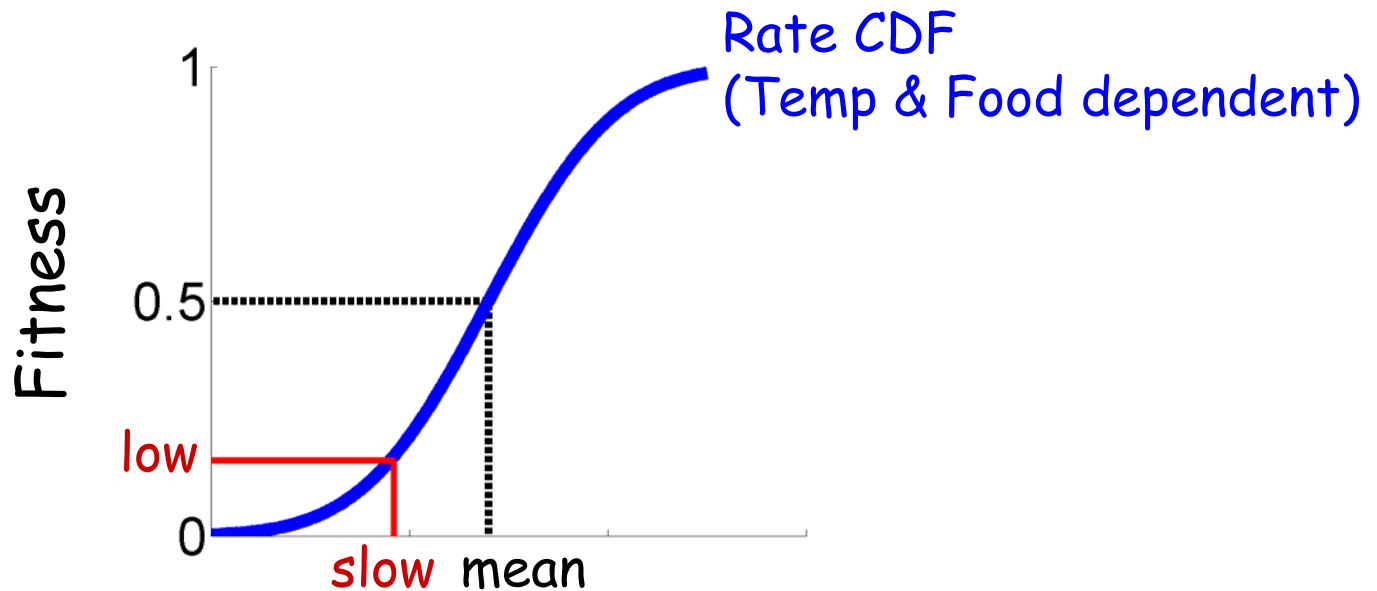
Metrics

Physiology: Stage, Age, Weight, etc.

Behavior: Swim, Emerge date, etc.

"Fitness"

For individual stochasticity  
= number between 0 and 1



# INDIVIDUAL-BASED MODELS (IBMs)

For an individual

**HELLO**

my name is

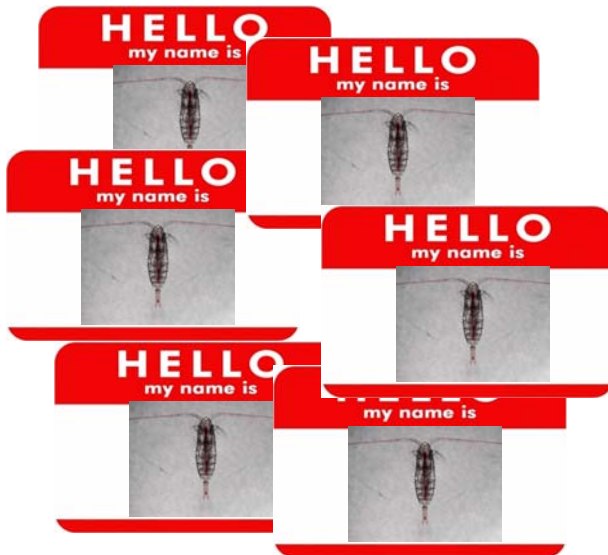
Metrics

Physiological: Stage, Age, Weight, etc.  
Behavior: Depth, Emergence Date, etc.

"Fitness"

For individual stochasticity  
= number between 0 and 1

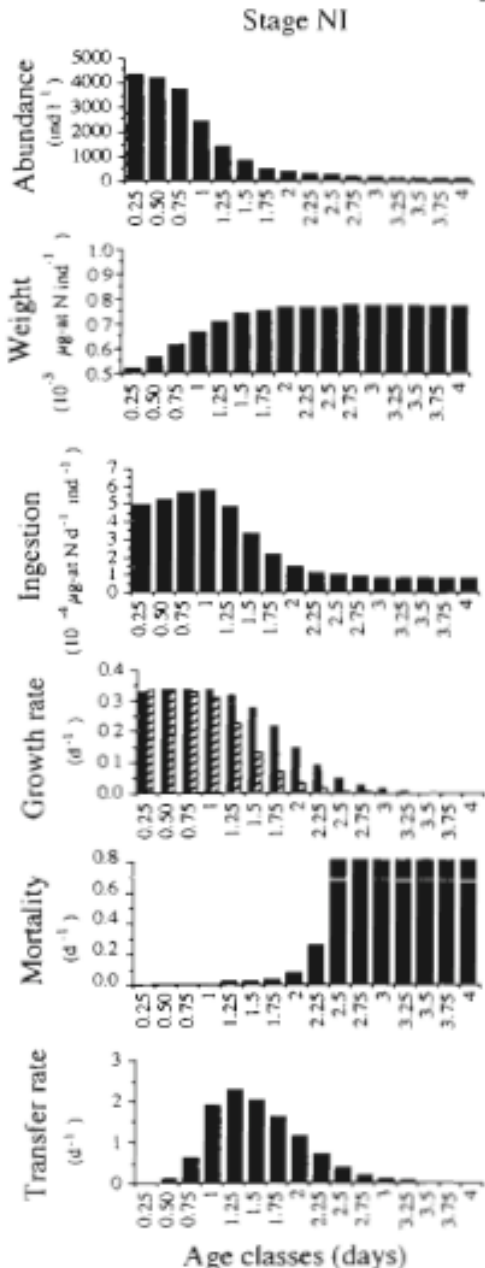
Population =  $\Sigma$  individuals



IBMs simulate population-level properties that emerge from variations and interactions among individuals

(i.e. arrows are result, not *a priori*)

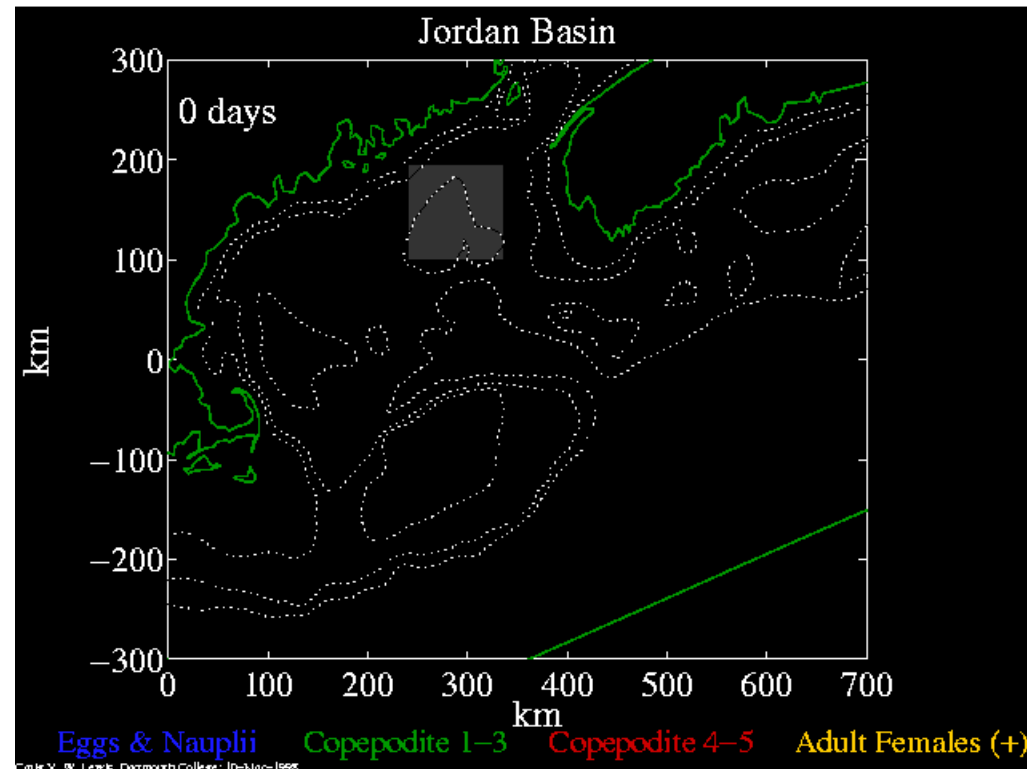
# IBMs GENERATE NOVEL KINDS OF OUTPUT



**Variations:** abundance, metrics & rates

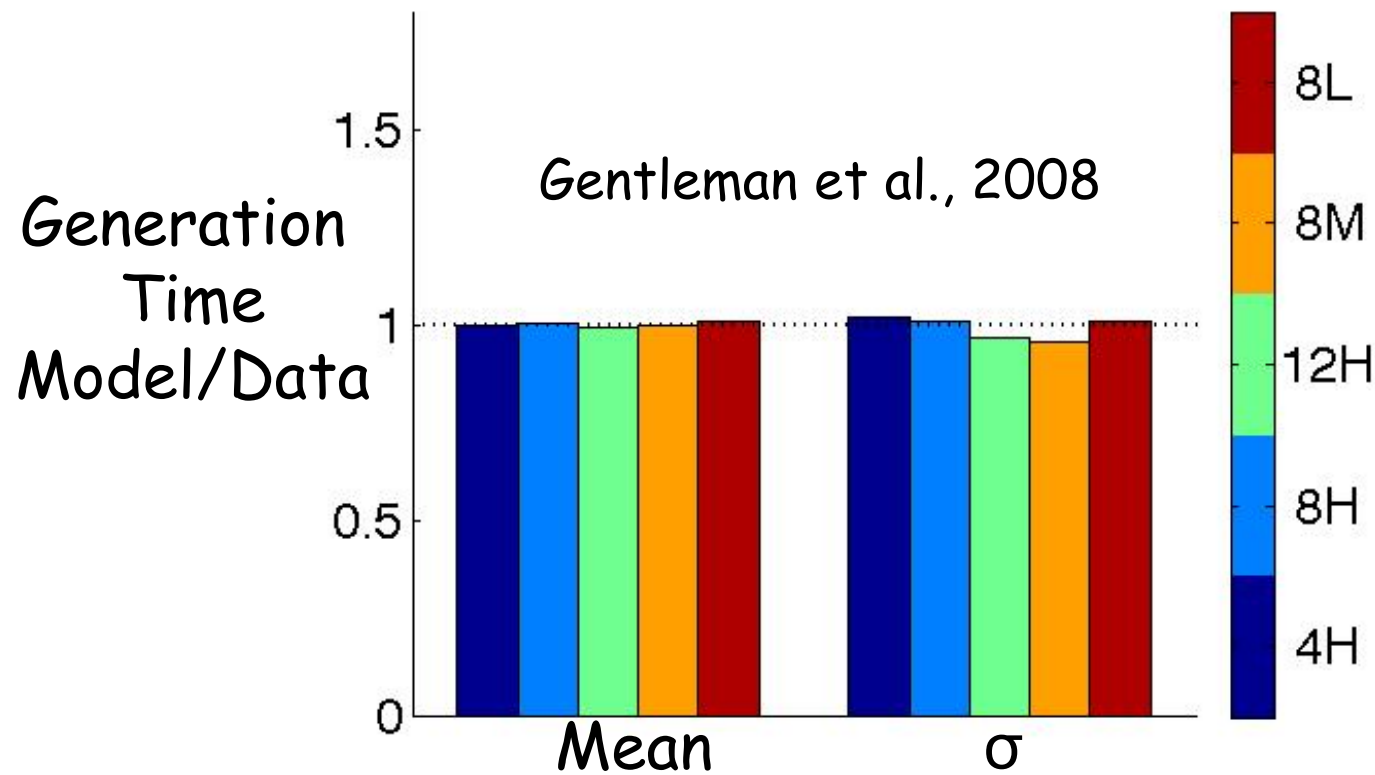
**Physiological History:** e.g. Size, Age  
Stage duration, Total egg production

**Environmental History:** e.g. Growing  
Degree-day, Location(t)



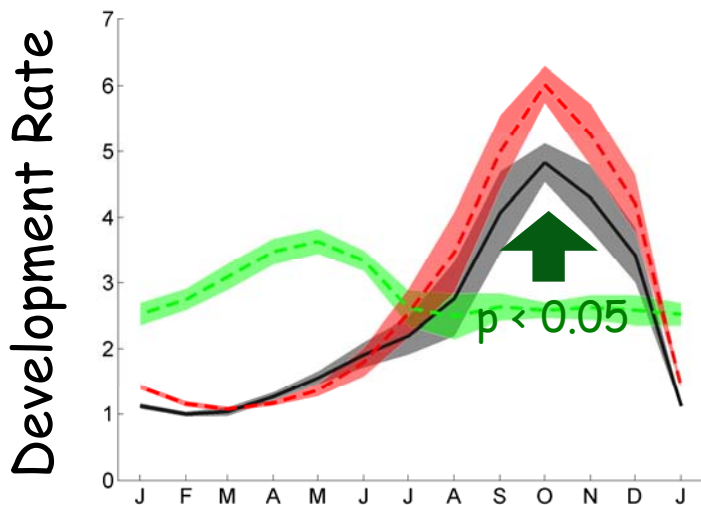
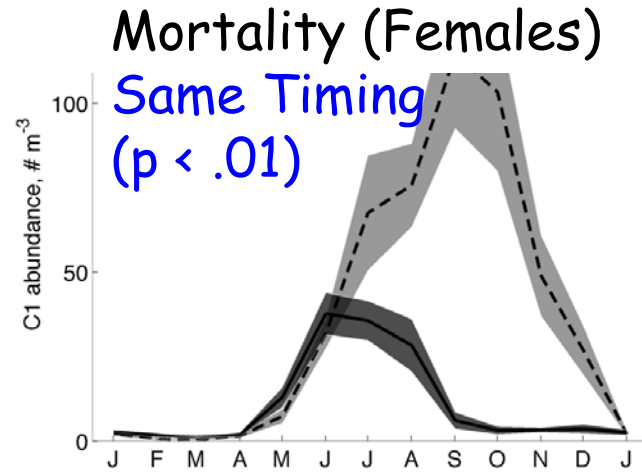
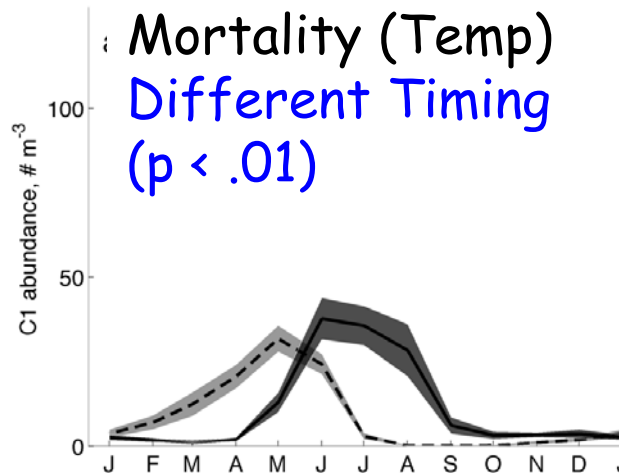
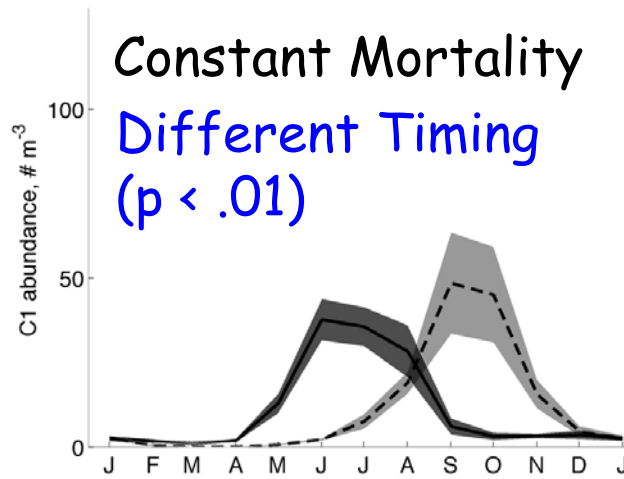
# ADVANTAGES OF IBMs I: AVOID ISSUES OF STRUCTURED MODELS

- Easily parameterize individual fitness-development relationship so "emergent arrows" accurate for range of lab conditions and dynamic environments



- Lagrangian transport: Conceptually straightforward, Codes available & No wiggles

# ADVANTAGES OF IBMs II: RIGOROUS STATISTICS

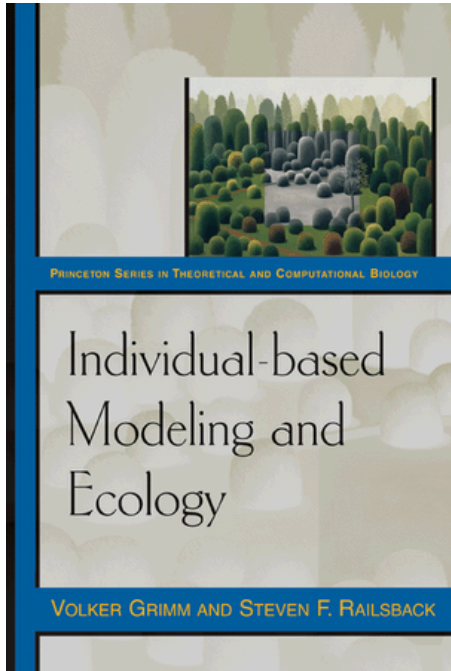


Variation in rate driven by **Temp**  
**Food** only significant at peak



# ADVANTAGES OF IBMS III:NOVEL QUESTIONS

Emergent properties & novel output of IBMs good for study of complex life histories and environmental dependencies



First IBMs in 1970s, gained momentum in 90s

"The individual-based approach is now firmly established in ecology. Hundreds of publications have been based on IBMs" (Grimm & Railsback, 2005)

Z-IBMs among first (e.g. Steele), but Z-IBMs absent/rare in reviews

**Why slow popularity rise? Maybe not appreciate utility**

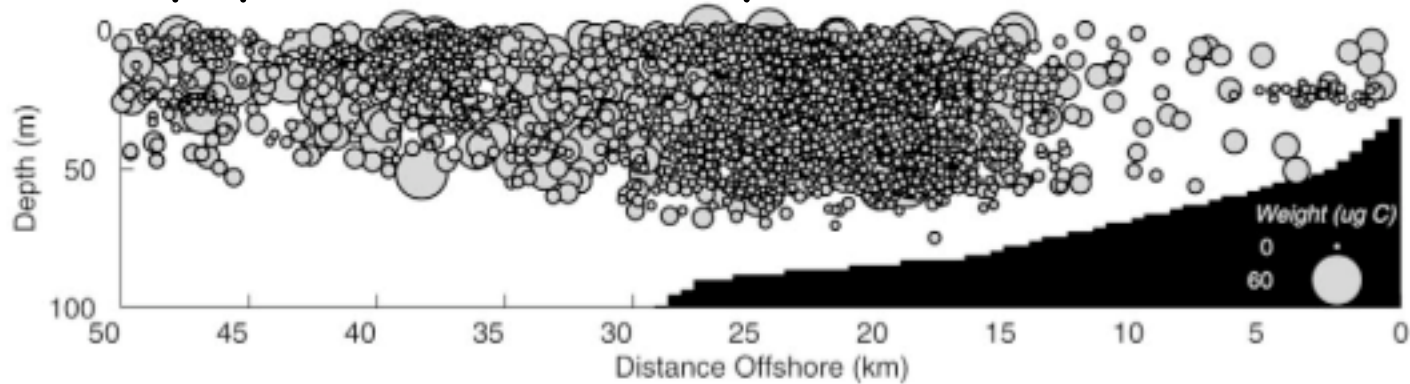
Many Z-IBMs motivated by use of Lagrangian transport

Here, showcase Z-IBMs that address other questions...

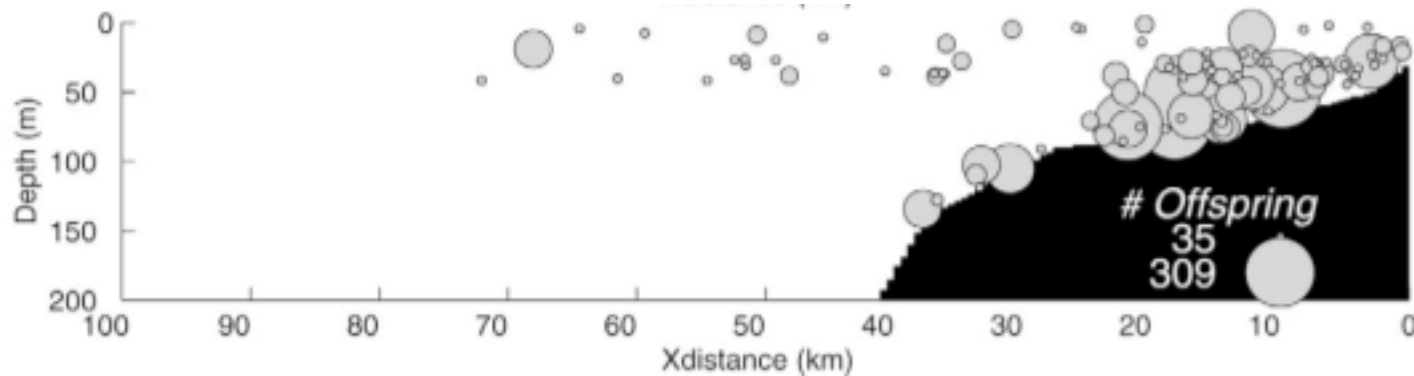


# EXAMPLE 1: DOMINANT SOURCES?

Simulated population at 80 days



Initial locations of Females who spawned survivors & bubbles scaled to total surviving offspring



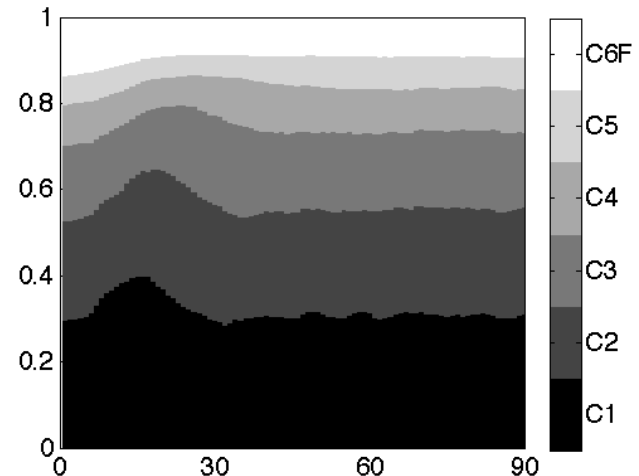
Insight into connectivity & growth vs. transport

# EXAMPLE II: ESTIMATION METHODS BIASES?

- $\sigma_{\text{Growth}}$  &  $\sigma_{\text{Size}}$  NOT important for **Production** (McLaren, 1997)
- $\sigma_{\text{EP}}$  &  $\sigma_{\text{Mort}}$  NOT important for **Stage-based Mortality**  
(Aksnes & Ohman, 1996; Gentleman et al., in prep)
- $\sigma_{\text{Dur}}$  IS important for **Stage-based Mortality**

Estimation methods assume  
stage-ratios are constant

But,  $C.V._{\text{Dur}} = 30\%$  varies  
stage-ratios by 30 - 90%

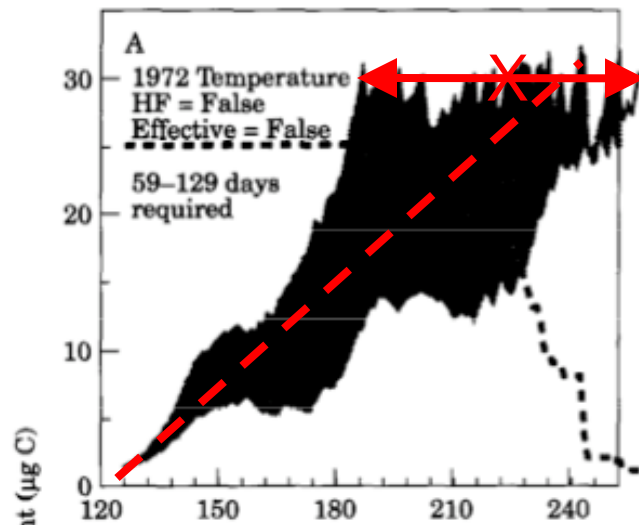


**Error in mortality estimate = 15 - 75%**

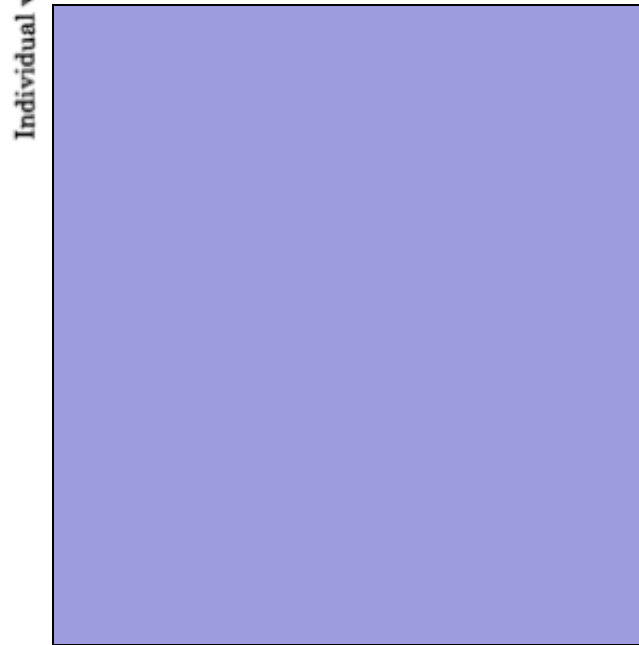
Gentleman et al., in prep

# EXAMPLE III: INFLUENCE OF HUNGER?

Standard response



- growth rate
- X generation time median
- ↔ generation time range

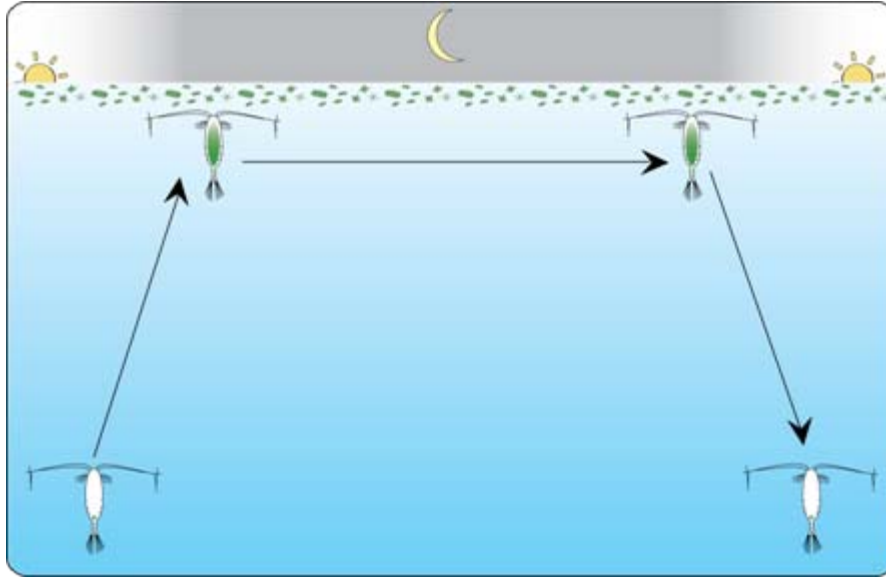


Implemented hunger response  
= when phytoplankton has been low  
they increase max ingestion rate

Feeding history has significant effect

(Batchelder & Williams, 1995)

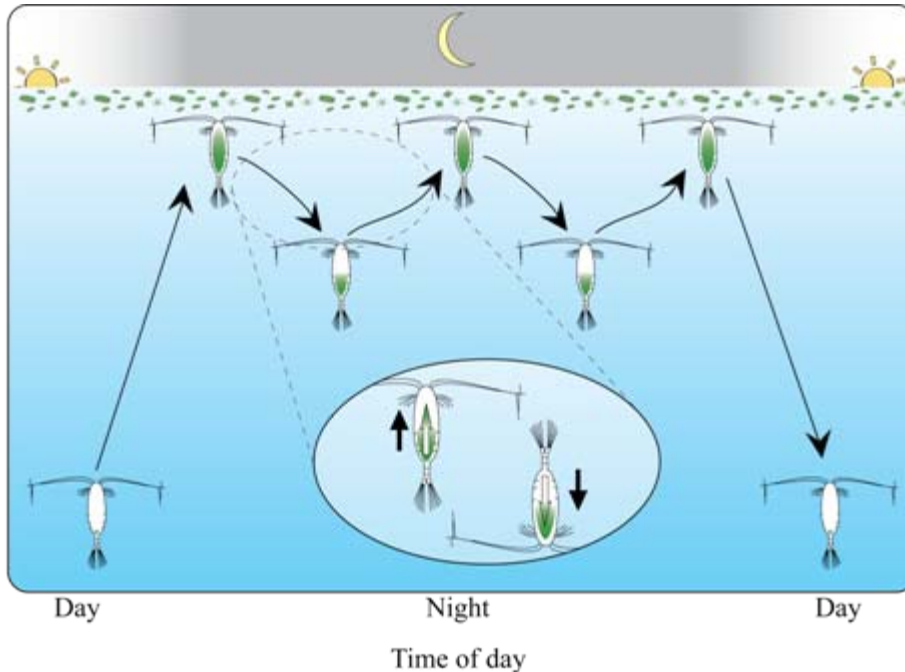
# EXAMPLE IV: TEST FORAY HYPOTHESIS



Standard DVM not explain observations

Forays = trade-off of foraging vs. predation

Implemented behavior

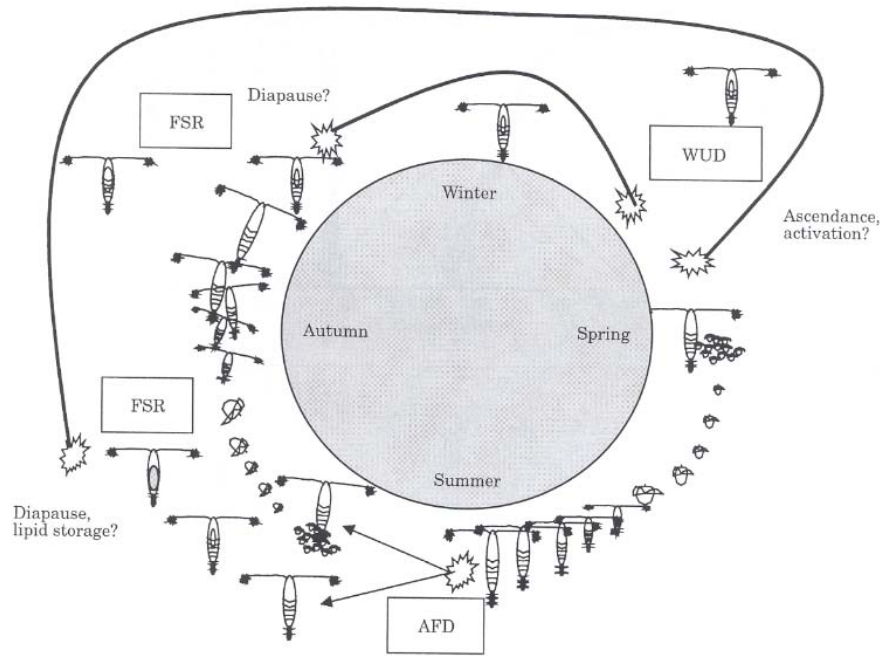


Showed advantage of Forays vs. DVM (mortality reduced by 50%)

Designed field study to test for evidence of forays

Leising & Pierson, 2005

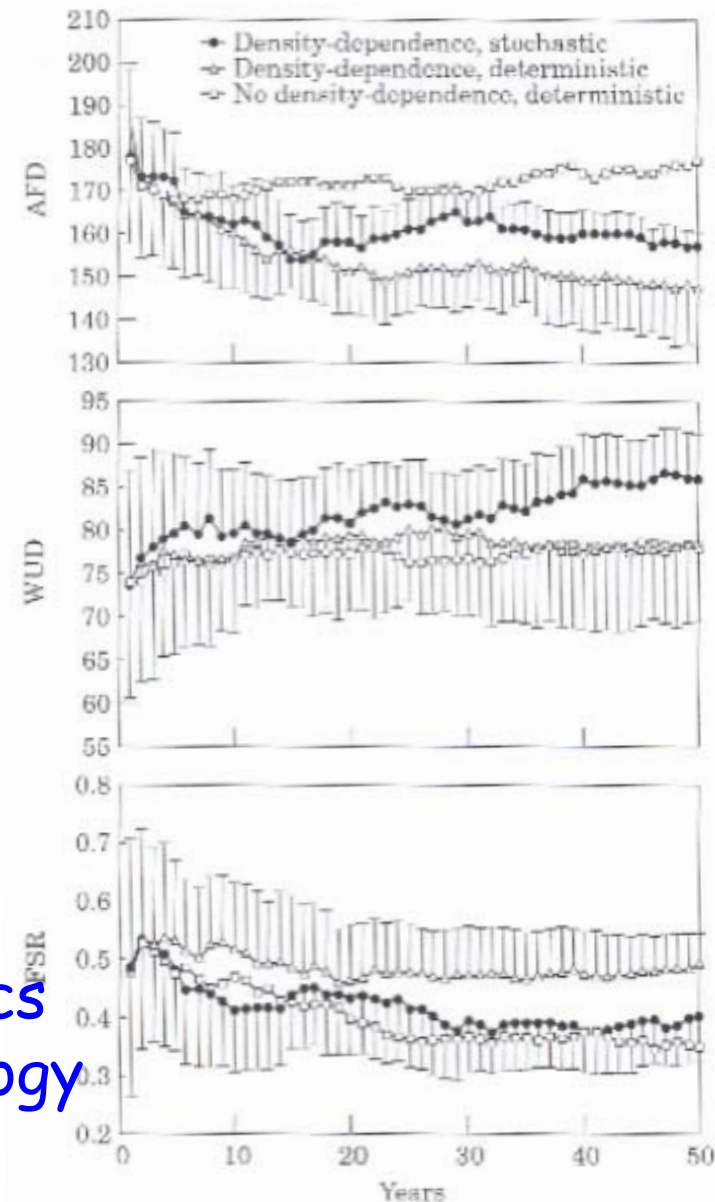
# EXAMPLE V: TIMING OF DORMANCY?



- Wake Up Date (WUD)
- Allocation to Fat Date (AFDs)
- Fat/Somatic Ratio to diapause (FSR)

Initialize with range of behavior metrics  
Genetic algorithm finds optimal phenology

Timing depends on density-dependence  
& environmental variability



# IBMs GOOD FOR MANY QUESTIONS...



- Emergent properties
- Variance & History
- Development timing
- Transport
- Fitness & Environment
- Optimal behaviors

## BUT IBMs NOT SO GOOD FOR OTHERS

- Z-community prod
- Trophic influences

- Spatial demog & prod
- Density-dependence



- Emergent properties
- Variance & History
- Development timing
- Transport
- Fitness & Environment
- Optimal behaviors



- Z-community prod
- Trophic links



- Spatial demog & prod
- Density-dependence

Pick hammer to suit nail (i.e. use right tool for the question)





## IBMs

- Emergent properties
- Variance & History
- Development timing
- Transport
- Fitness & Environment
- Optimal behaviors



## Ecosystem

- Z-community prod
- Trophic influences

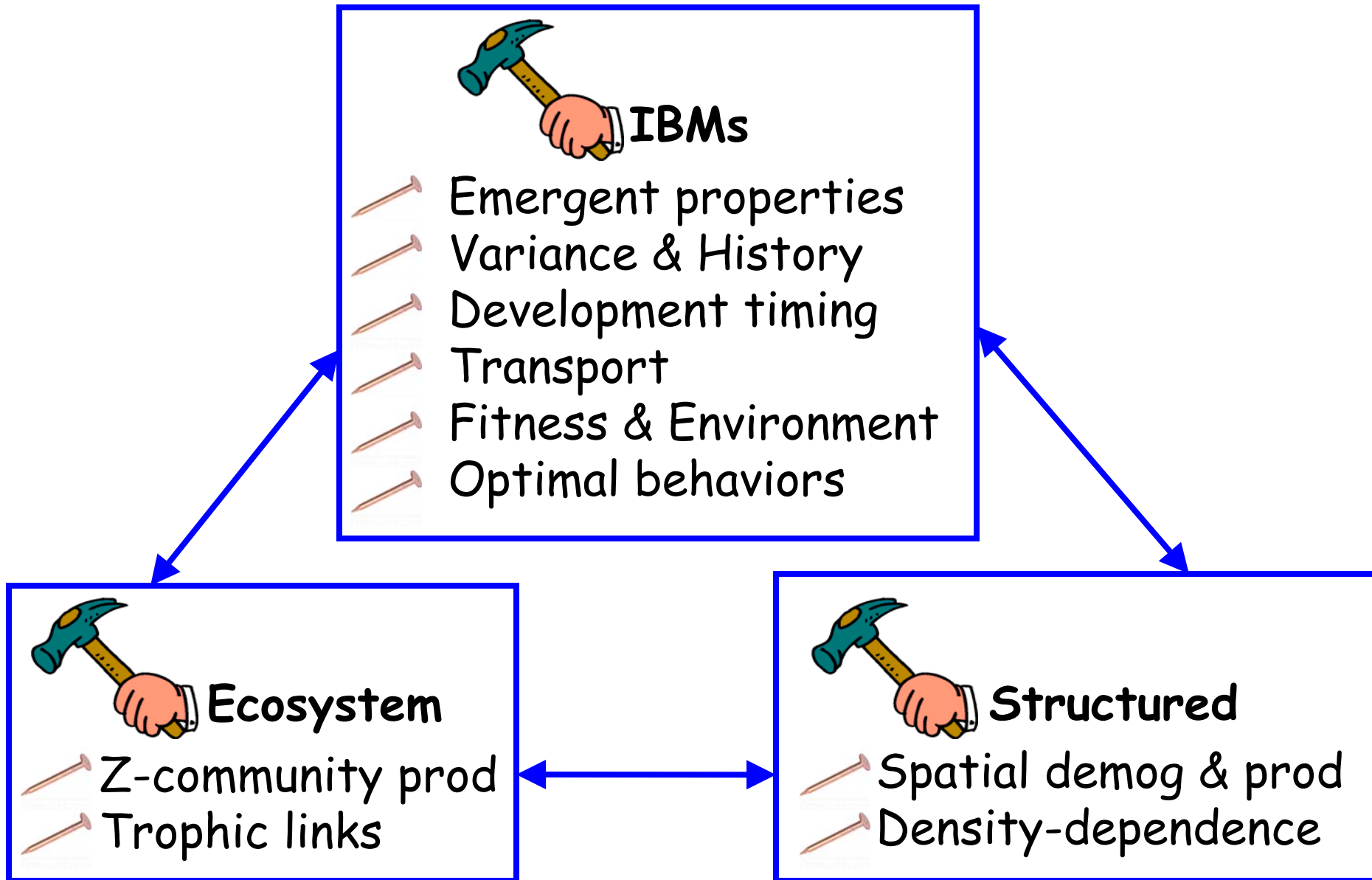


## Structured

- Spatial demog & prod
- Density-dependence

Some IBM "nails" do-able with other approaches (fancy math!)

# SYNERGISM OF COMPLEMENTARY APPROACHES



# ADVANCING ZOOPLANKTON ECOLOGY

*In situ*



*In vitro*



*In silico*



Test hypotheses

Quantify importance

Estimate

Design Studies

Identify gaps

Interpret data

Assess sensitivity

Predict