

# Developing a bioenergetics model for *Euphausia pacifica* larvae in the California Current

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November 1, 2007

PICES XVI



# **Talk Overview**

- 1. Motivations**
- 2. Some basics on models used in biological oceanography;  
Rationale for an individual-based bioenergetics model**
- 3. Development of the bioenergetics model; comparison to  
2002 field data**
- 4. Brief look at model sensitivity to select parameters**
- 5. There's always room for improvement and more work...**



# Meet *Euphausia pacifica*



Most numerically abundant euphausiid (krill) species off the coast of Oregon  
(Has been considered for commercial harvest as salmon farm supplement)

Long life span (2+ years off Oregon)

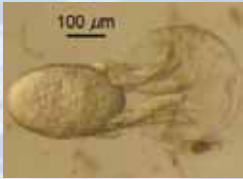
Important link between lower and higher trophic levels:

***E. pacifica* eats:** phytoplankton, some copepods, ciliates, nano- and picoplankton (with transparent exopolymer particles)

***E. pacifica* eaten by:** salmon juveniles, birds, whales

Sampling on the NH line over 10 years (1996-2005) shows peak egg abundance from June-September --> “upwelling spawner”

# **Euphausia pacifica** Life Stages



**Nauplius (1 - 2)** – oval unsegmented body, no compound eyes, 3 pairs of appendages (which ultimately become the 2 pairs of antennae and 1 pair of mouthparts)



**Metanauplius** – body divided into two parts, only first 2 pairs of appendages



**Calyptopis (1 – 3)** – body clearly divided into cephalothorax and abdomen, which begins to segment; compound eyes begin to form; antennae and **mouthpart appendages present**



**Furcilia (1 – 7)** – compound eyes developed, **antennae still used for swimming, thoracic legs and abdominal pleopods begin to develop**



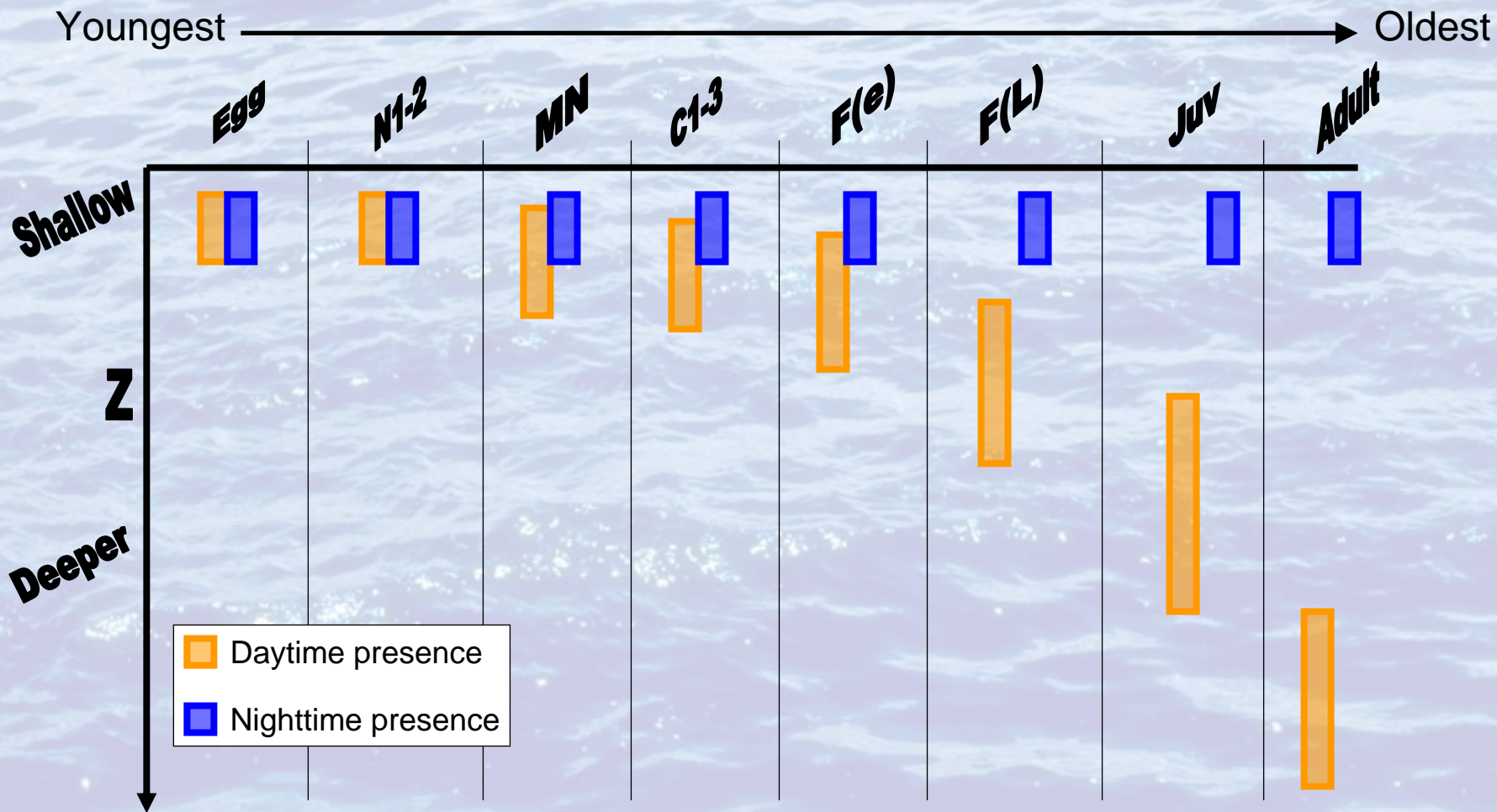
**Juvenile** – all **limbs developed**, but not yet full sized or sexually mature



**Adult** – reproductively mature



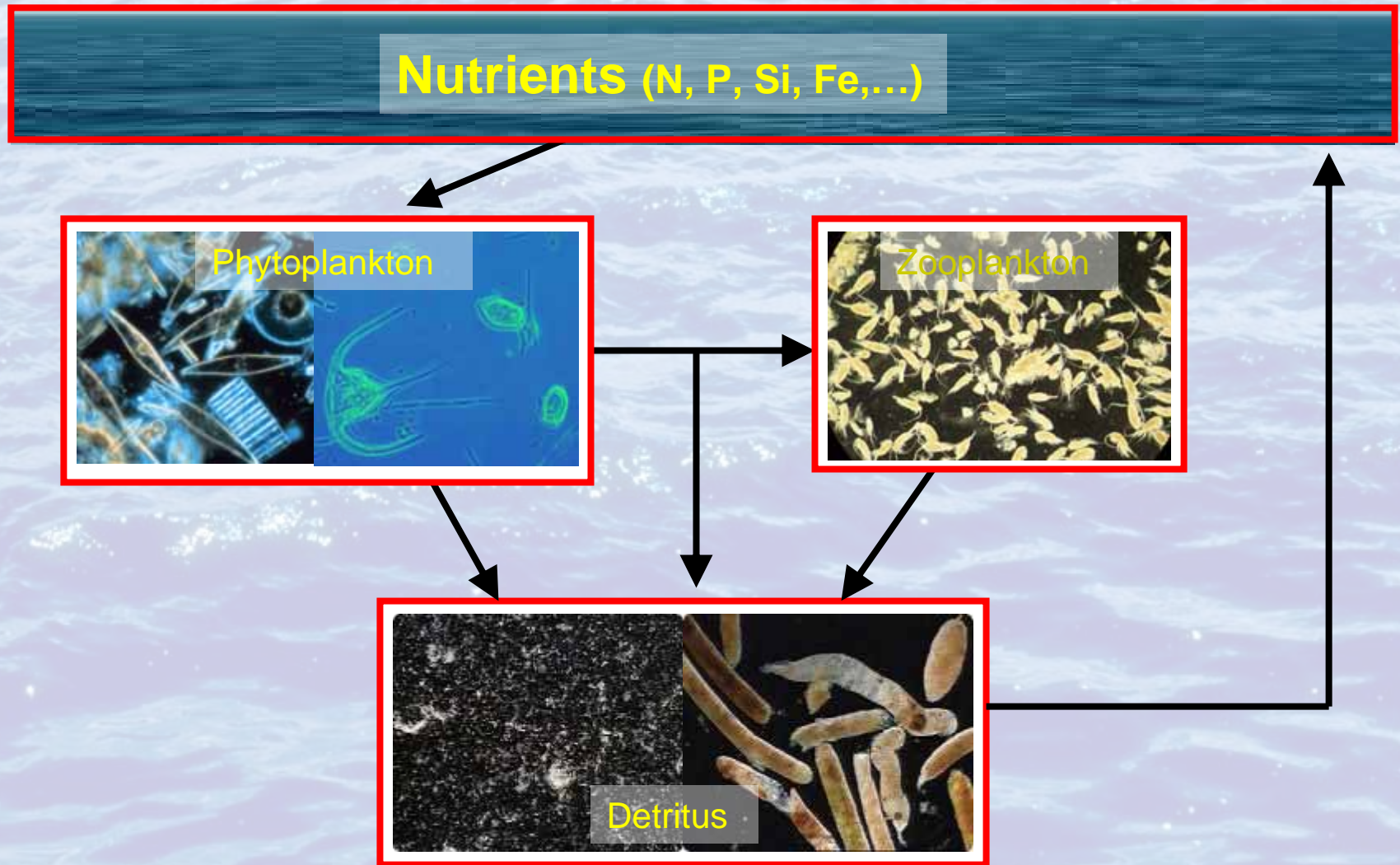
# *Euphausia pacifica* off the Oregon Coast



Stage-based differences in vertical migration extent

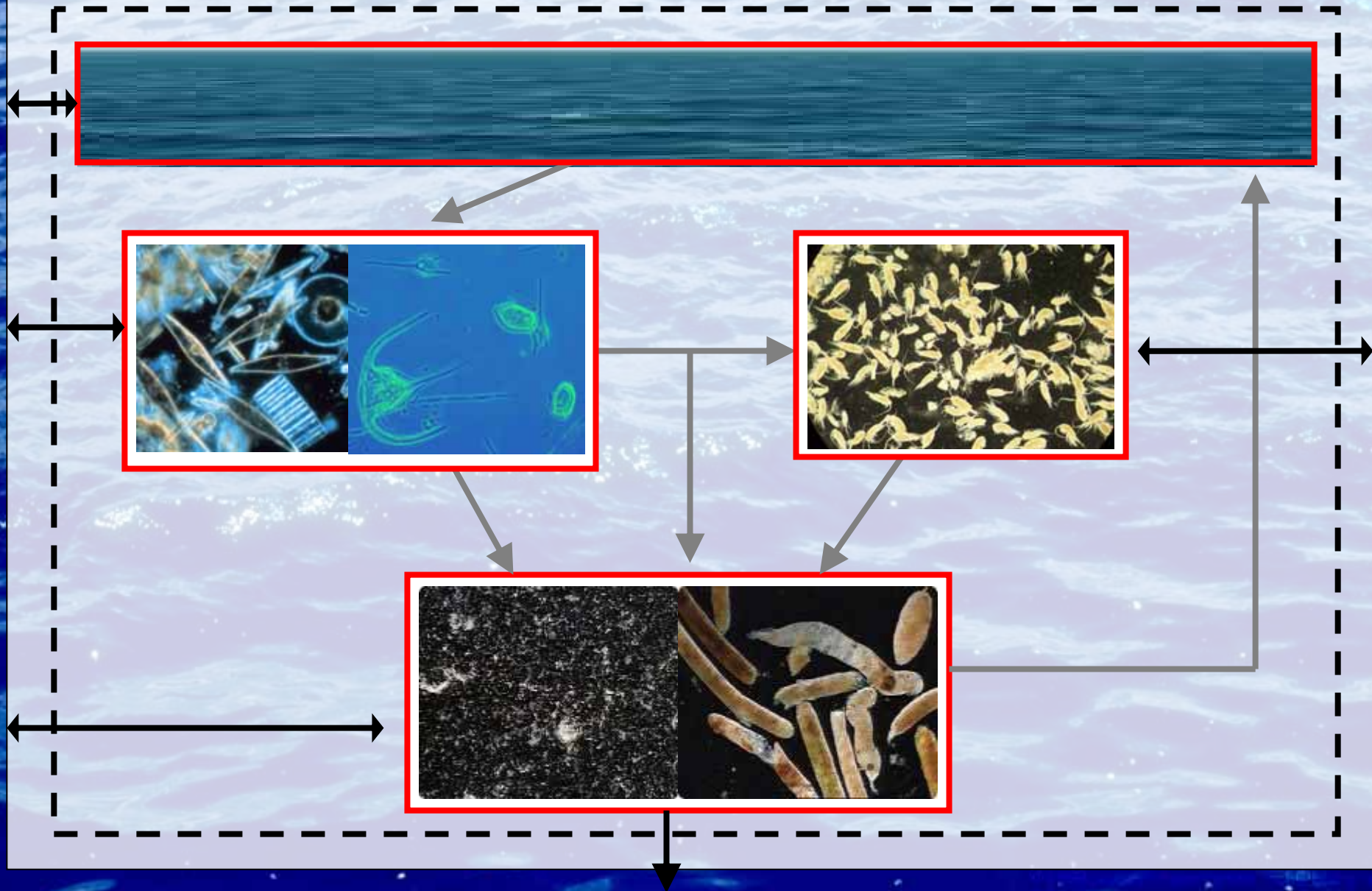
(schematic based on Vance et al, 2002)

# A Basic Ecosystem Model: NPZD

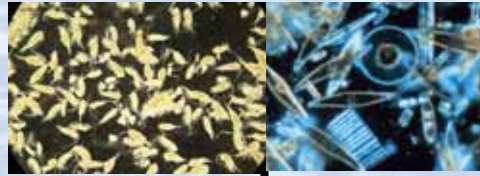




# A Basic Ecosystem Model: NPZD



# A Bioenergetics Model



Consumption



Metabolism



Excretion



Egestion



Growth

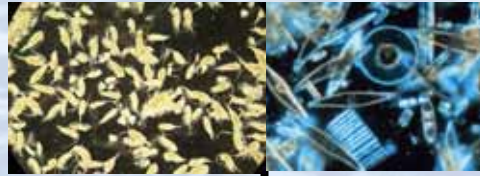


Reproduction





# A Bioenergetics Model (Individual)



Consumption

Metabolism

Excretion

Egestion

*Euphausia pacifica*

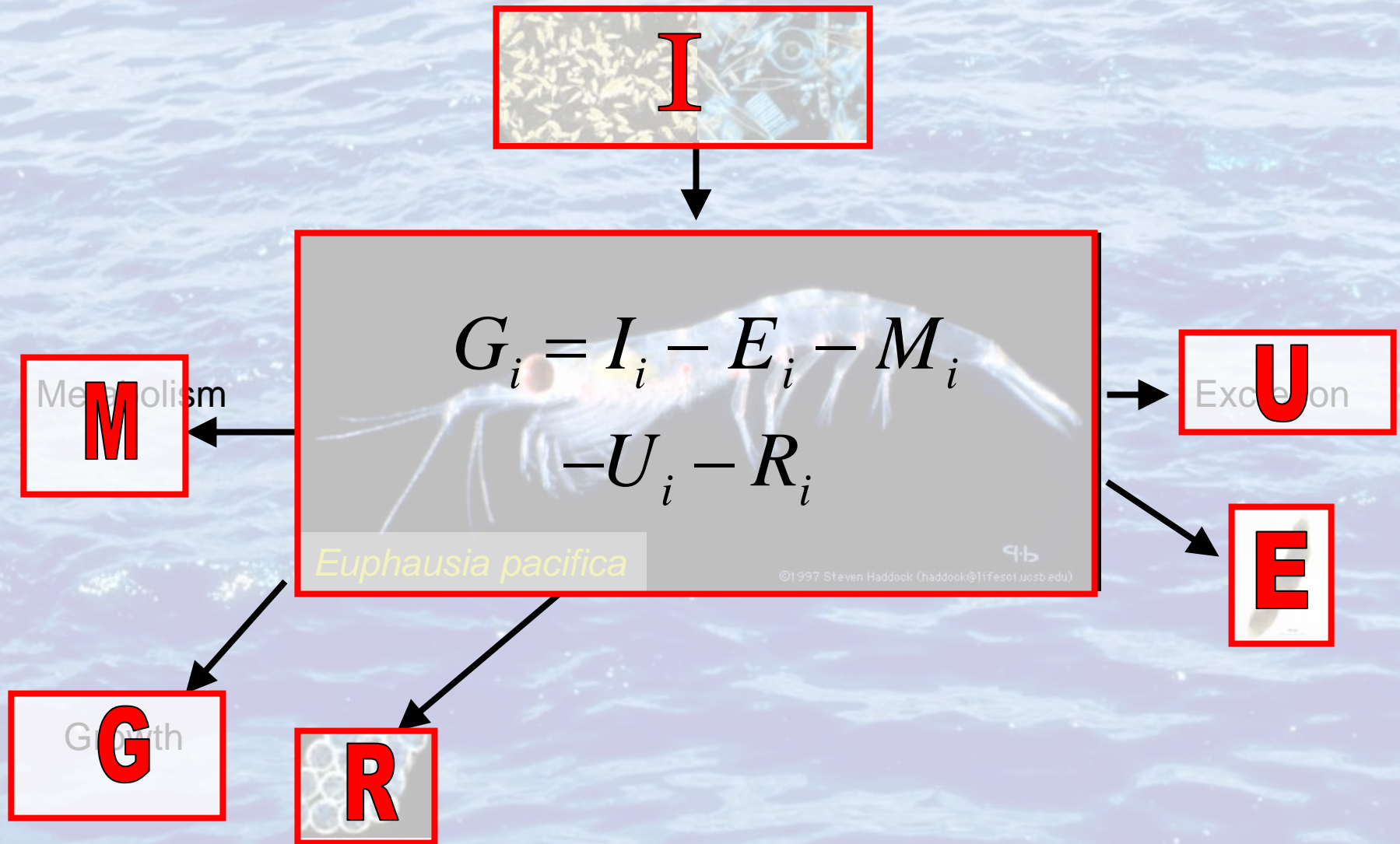
©1997 Steven Haddock (haddock@lifesci.ucsb.edu)

Growth

Reproduction

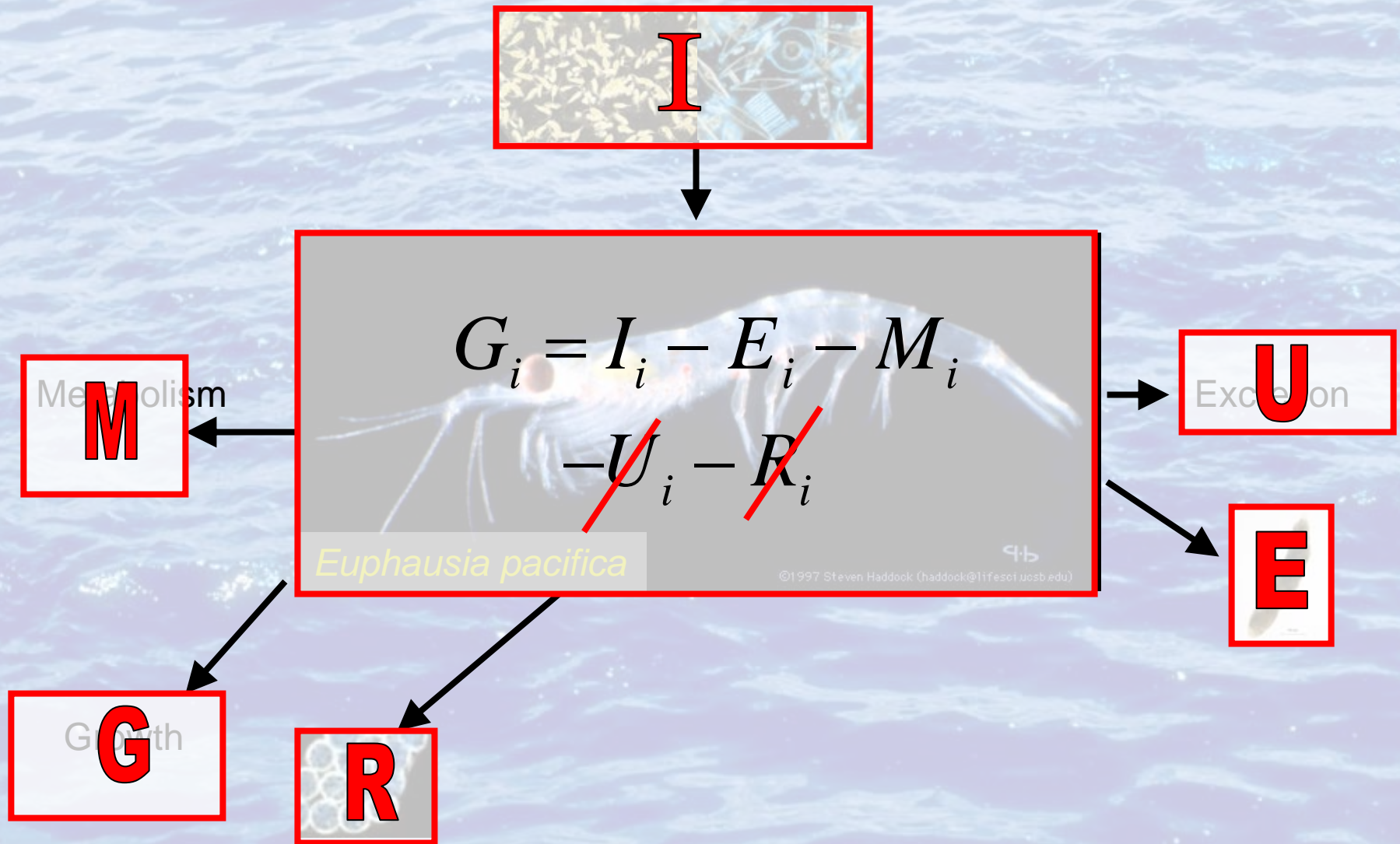


# Developing the Bioenergetics Model





# Developing the Bioenergetics Model



# Developing the Bioenergetics Model

## Stage-specific relationships

Respiration – allometric relationship, based on R.M. Ross's work (1982)

$$R = aW^b$$

Ingestion, growth – allometric, based on Ross (1982), and observed growth trajectories (Feinberg and Peterson, pers. comm.)

Depends primarily on *food*, secondarily on *temperature*

Development – Stage-based, Belehradek curve with empirically-derived parameters

Depends exclusively on *temperature*



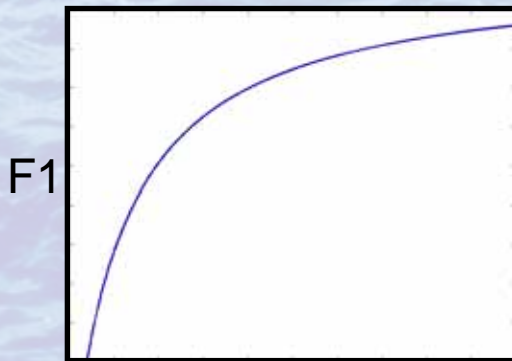
# Developing the Bioenergetics Model - Growth

Respiration

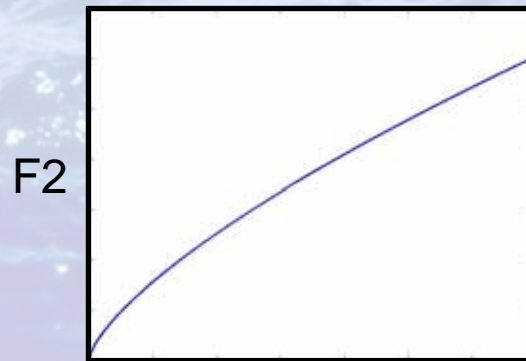
$$R_{TOT} = R_A + R_B$$

Ingestion

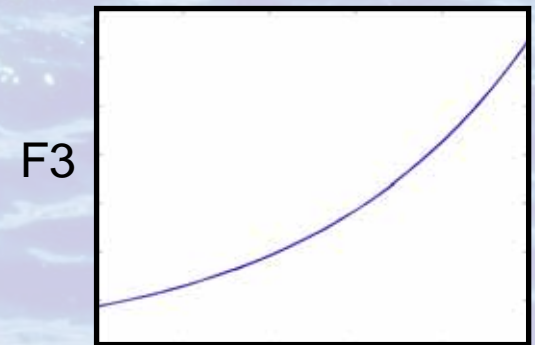
$$I_{TOT} = I_{max} * F_1 * F_2 * F_3$$



Food Concentration



Body Weight



Temperature

# Developing the Bioenergetics Model - Development

*E. pacifica* Belehradek function  
for time to stage as function of  
temperature

Basic Form is:

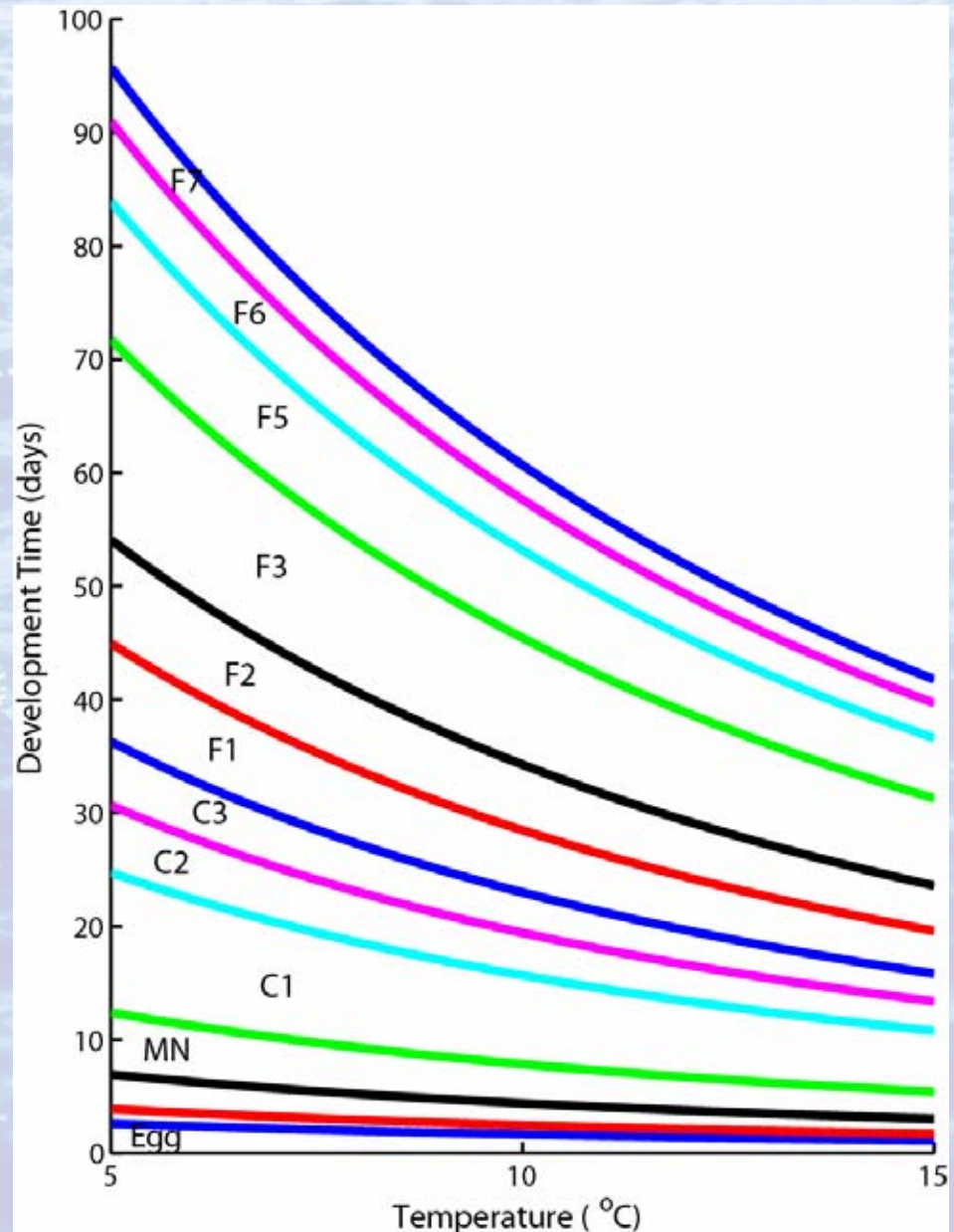
$$D_i = a_i (T + b)^c$$

$D_i$  is the time (days) from egg to  
stage  $i$

$a_i$  is a stage specific constant

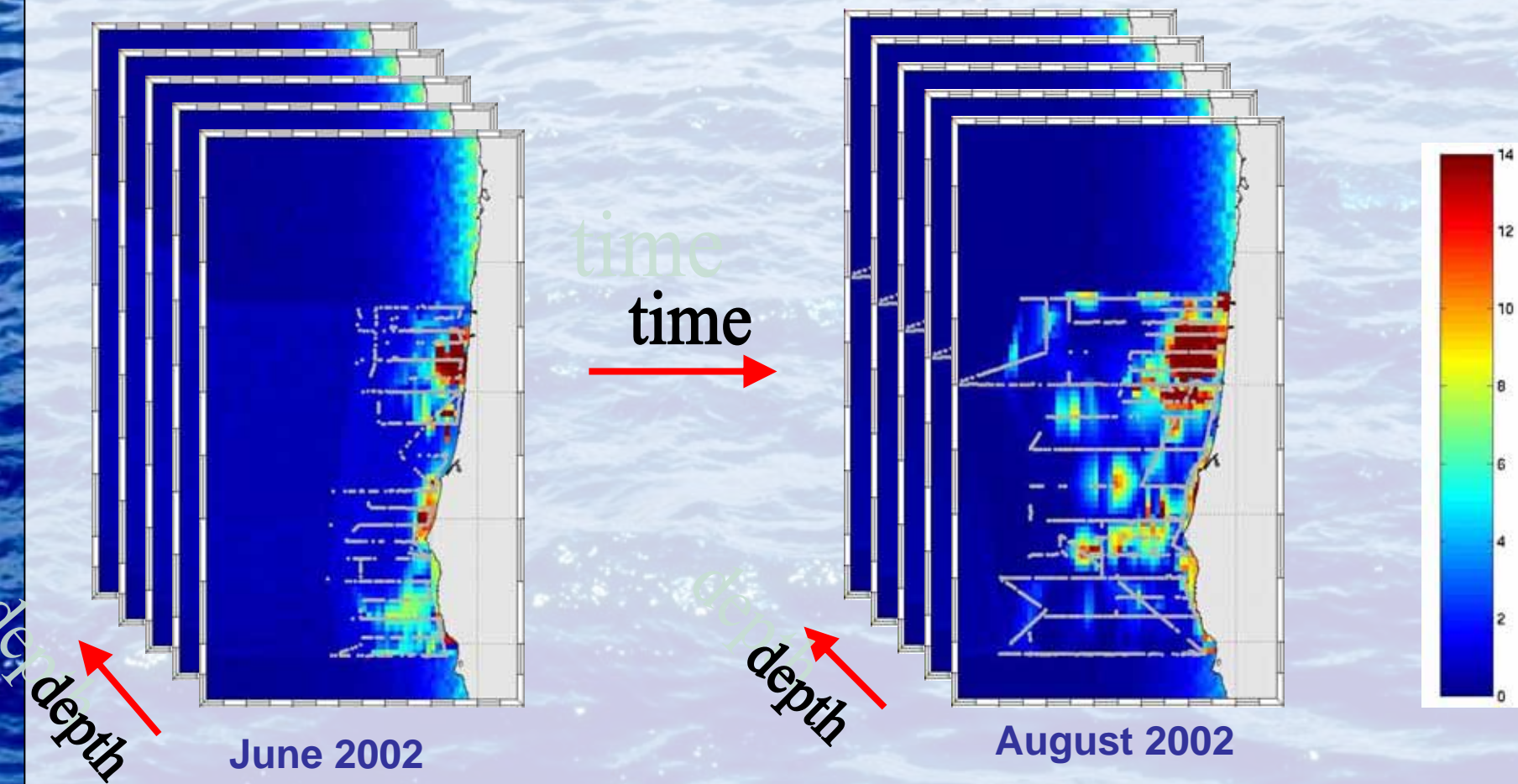
$b$  is a stage-independent shift in  
temperature

$c$  is assumed to be -2.05  
(commonly observed from  
experiments; determines the  
curvature)



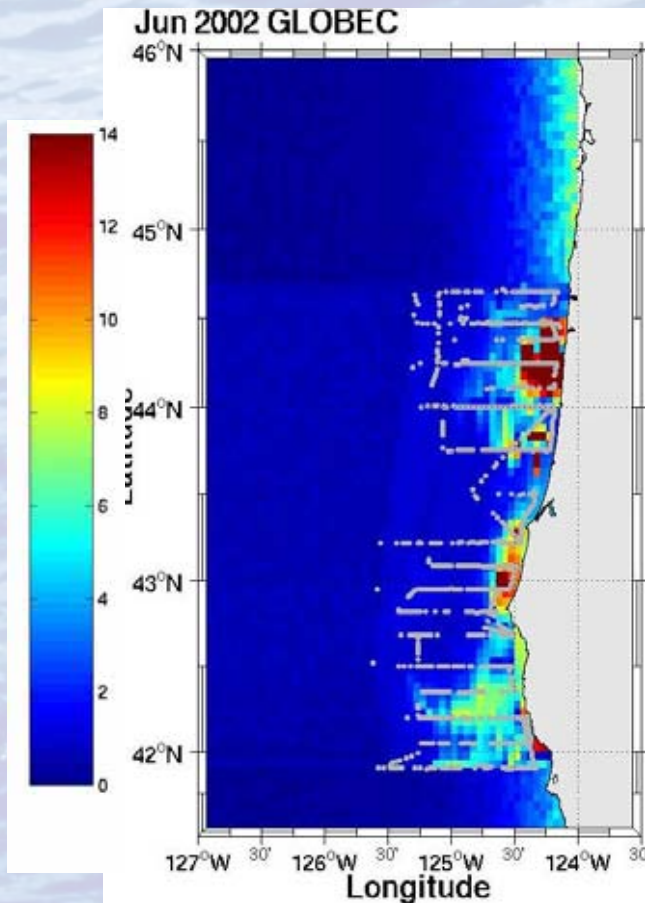


## Food fields (Phytoplankton)

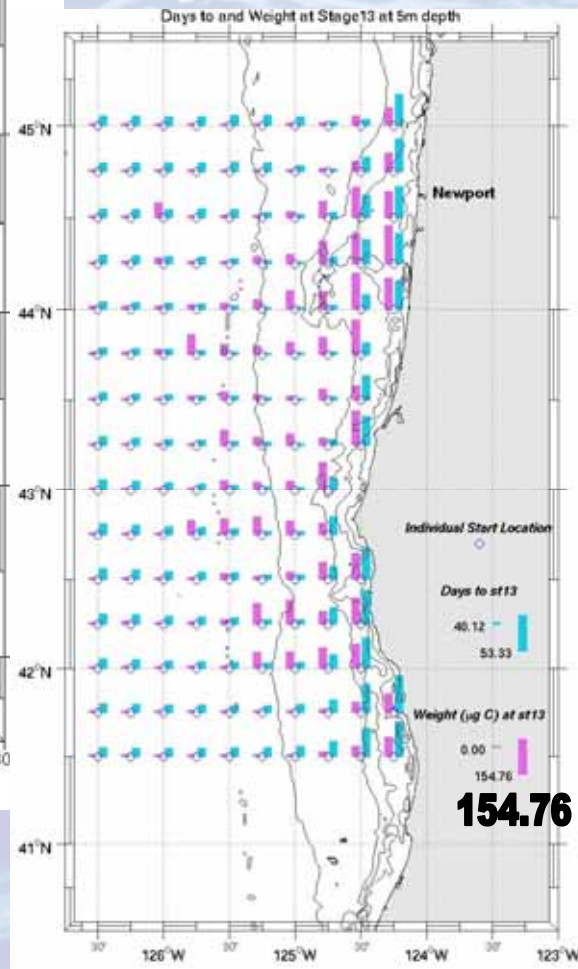


**SEASOAR (chlorophyll) observations from US GLOBEC Cruises**

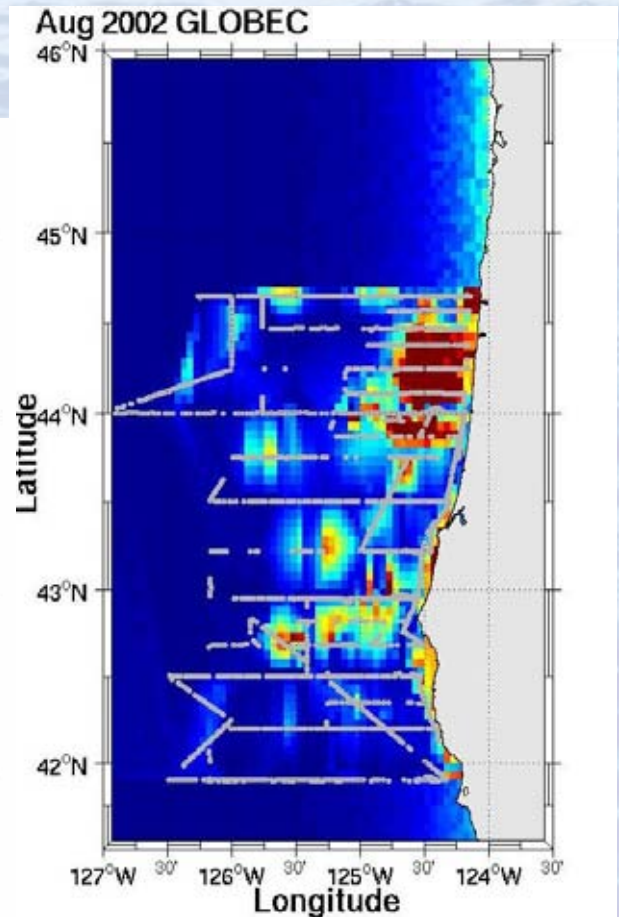
# Early Results – Growth (No Behavior)



June 1, 2002



5-m Depth

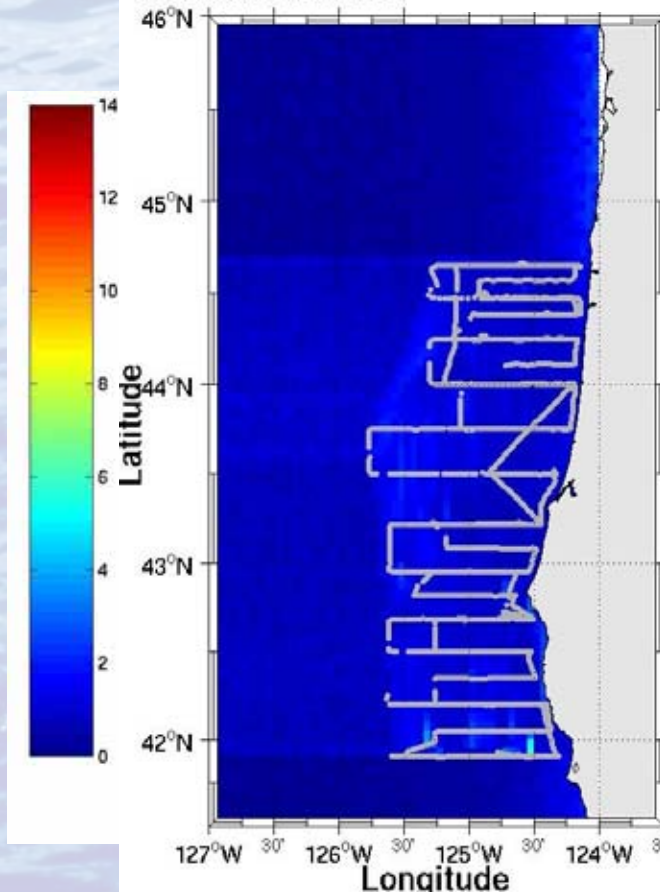


August 10, 2002



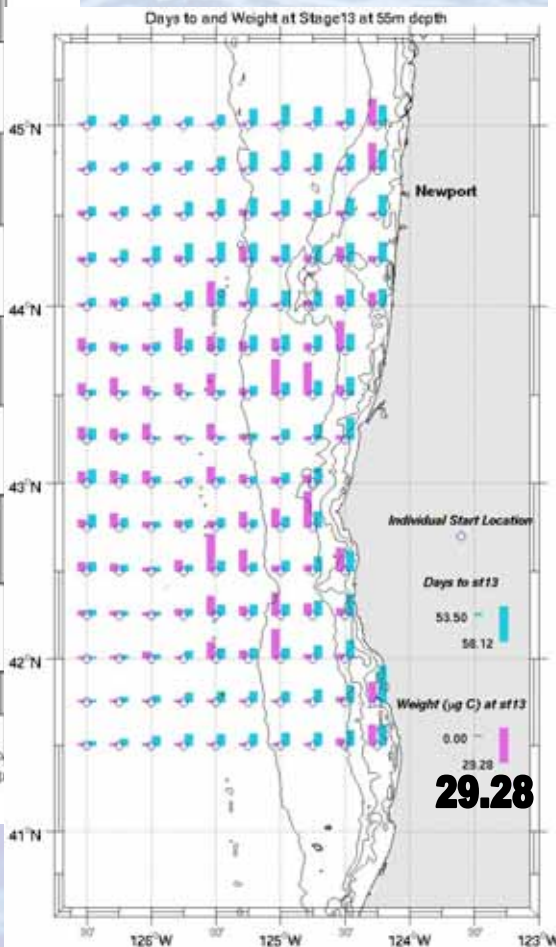
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Jun 2002 GLOBEC



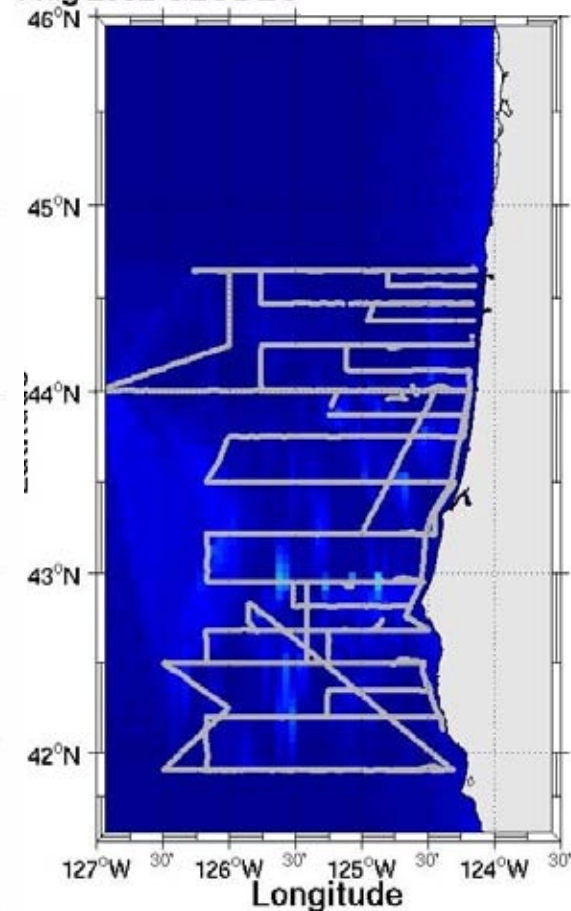
June 1, 2002

1



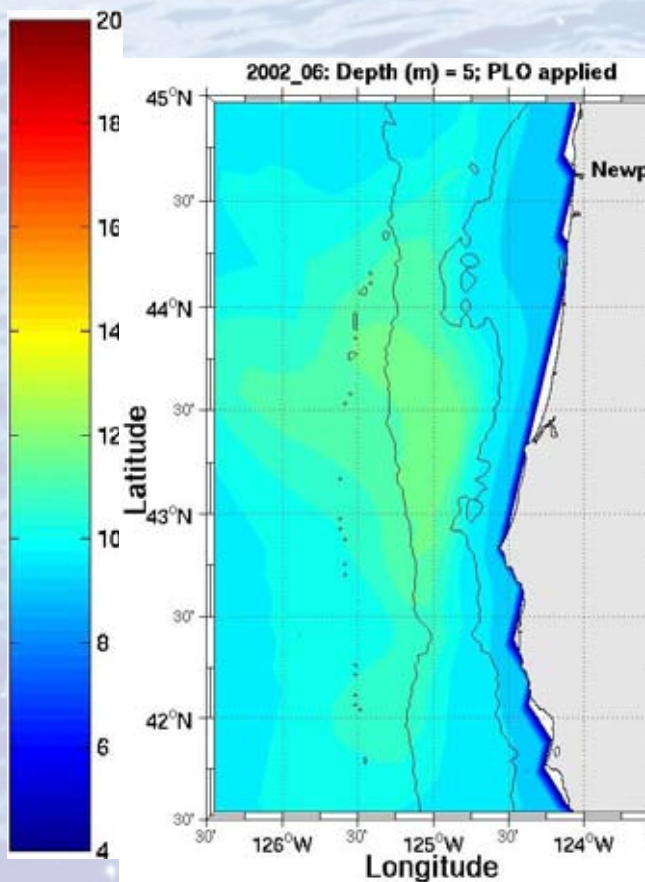
55-m Depth

Aug 2002 GLOBEC

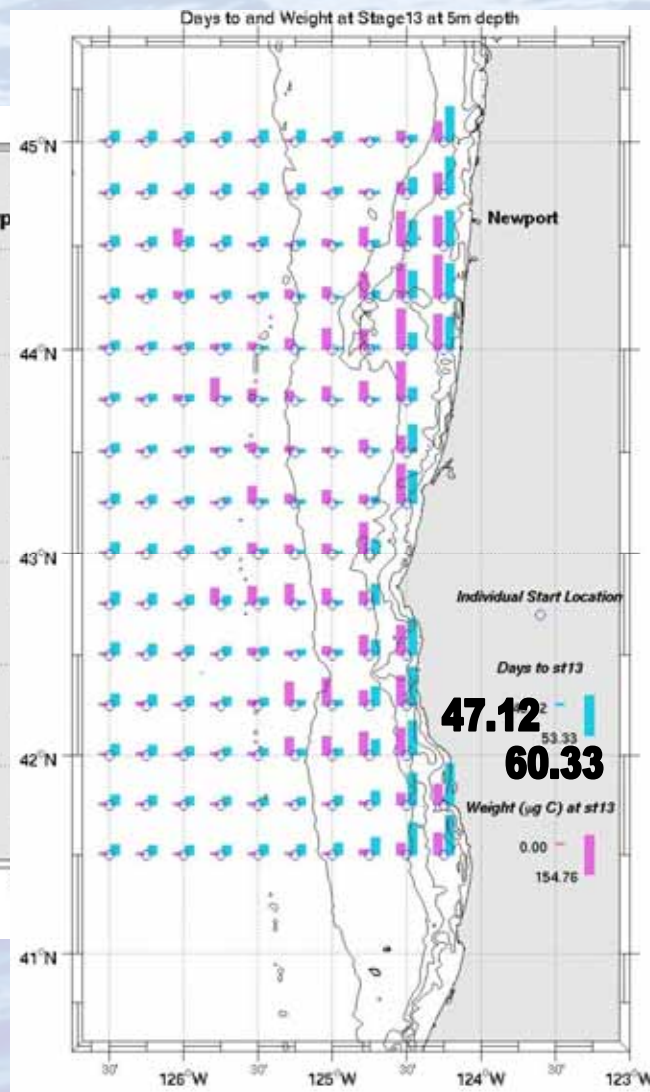


August 10, 2002

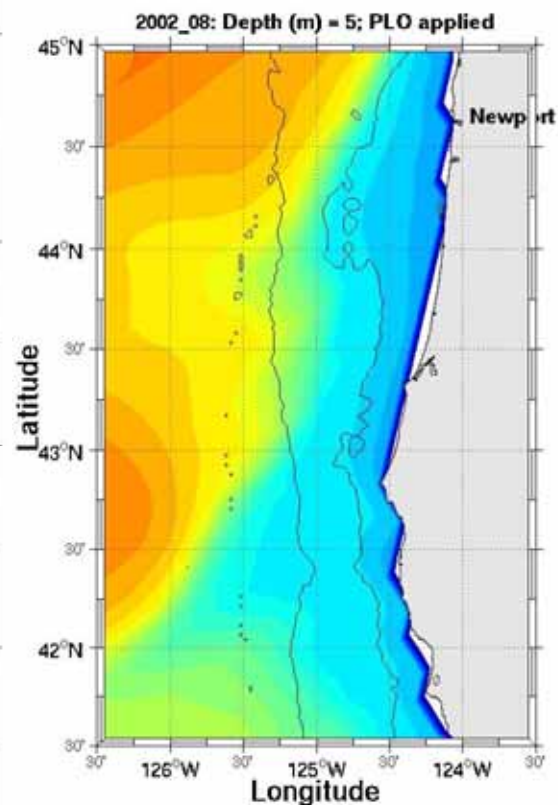
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June 2002



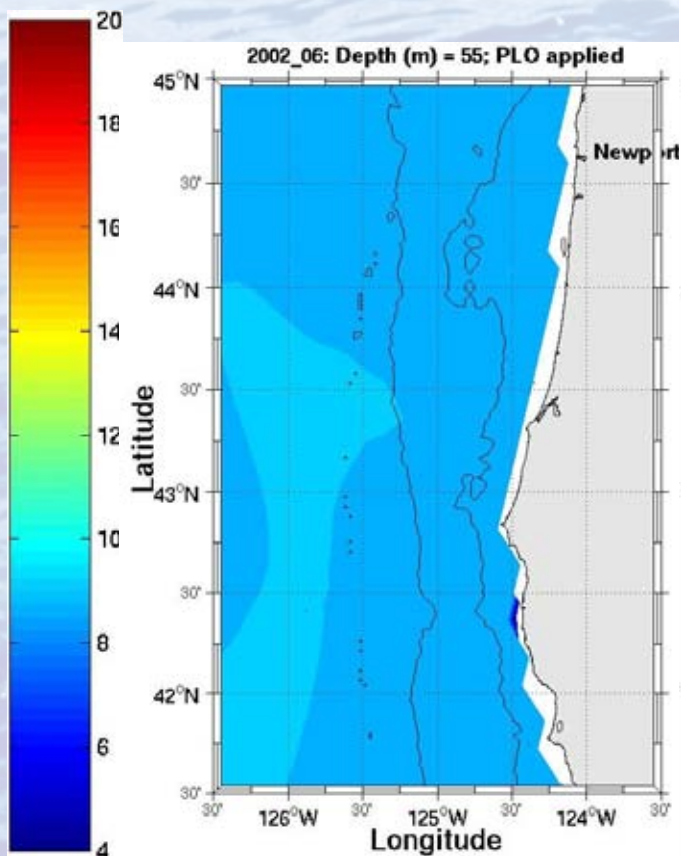
5-m Depth



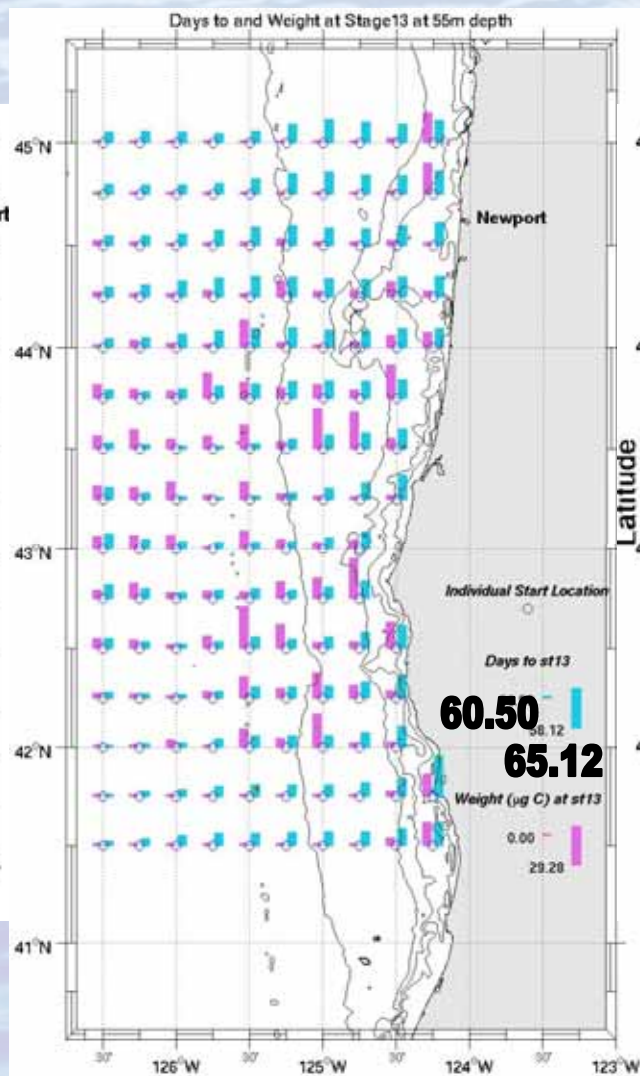
August 2002



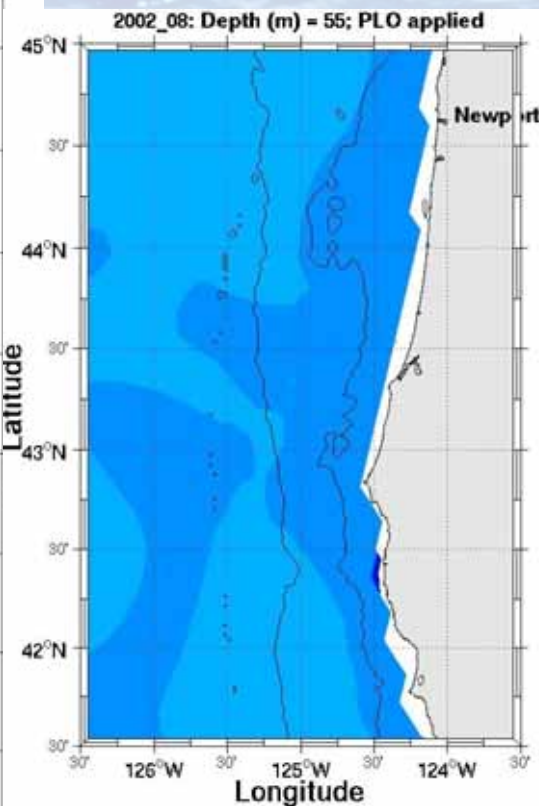
# Early Results – Development (No Behavior)



June 2002



55-m Depth



August 2002

# Early Results – Comparisons

Data:

Stage	Median time @ 10.5°C	Range in stage
N1	0.3	0 – 4.0 (4)
N2	1.1	1.0 – 7.1 (6.1)
MET	3.0	1.0 – 7.5 (6.5)
C1	6.4	5.5 – 20.6 (15.1)
C2	14.1	10.1 – 23.1 (13)
C3	17.8	13.5 – 26.1 (12.6)
FI	21.3	17.1 – 36.2 (19.1)
FII	26.7	19.6 – 43.6 (24)
FIII	32.4	22.5 – 58.2 (35.7)
FIV/V	43.4	27.1 – 67.1 (40)
FVI	51.0	33.2 – 75.2 (42)
FVII	55.4	36.7 – 75.0 (38.3)
IIIV	58.4	40.6

Model:

Feinberg et al. (2006) - MEPS 316:127-137

Time to Furcilia 7:

5-m: 47.12 - 60.33d

55-m: 60.50 - 65.12d



# Early Results – Comparisons

Data:

Furcilia 7 range from 41.93 - 120.64 ugC:

**71.94 ± 22.97 ugC (n=15)**

(Feinberg, Shaw and Peterson, unpublished data)

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Model:

At 5-m depth: Furcilia 7 stages were present at up to 154.76 ugC

Too big

At 55-m depth: Furcilia 7 stages were present at up to 29.28 ug

Too small

Feinberg et al. (2006) - MEPS 316:127-137

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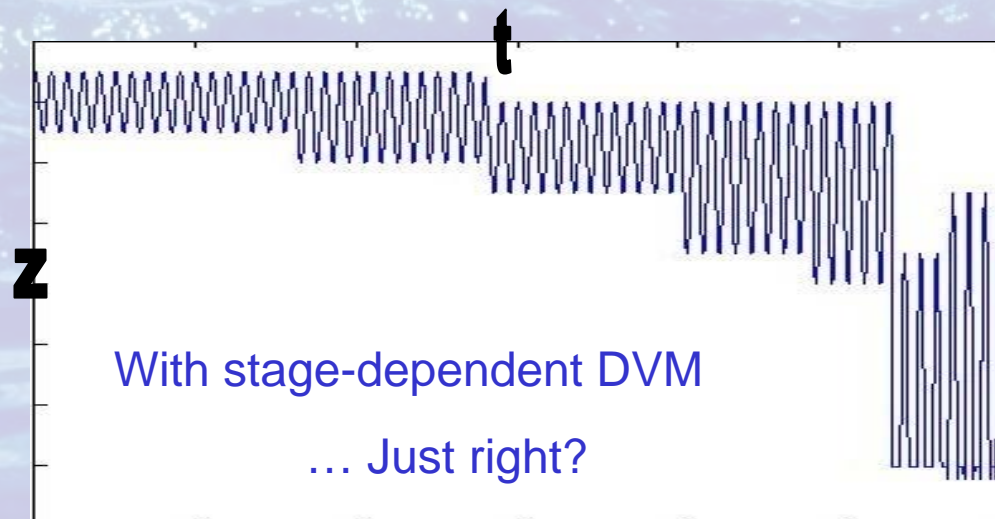
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Too small



## Early Results – With Behavior

Model:

Time to F7: 51.54 - 62.04d

(Recall Feinberg et al median 55.4d to F7)

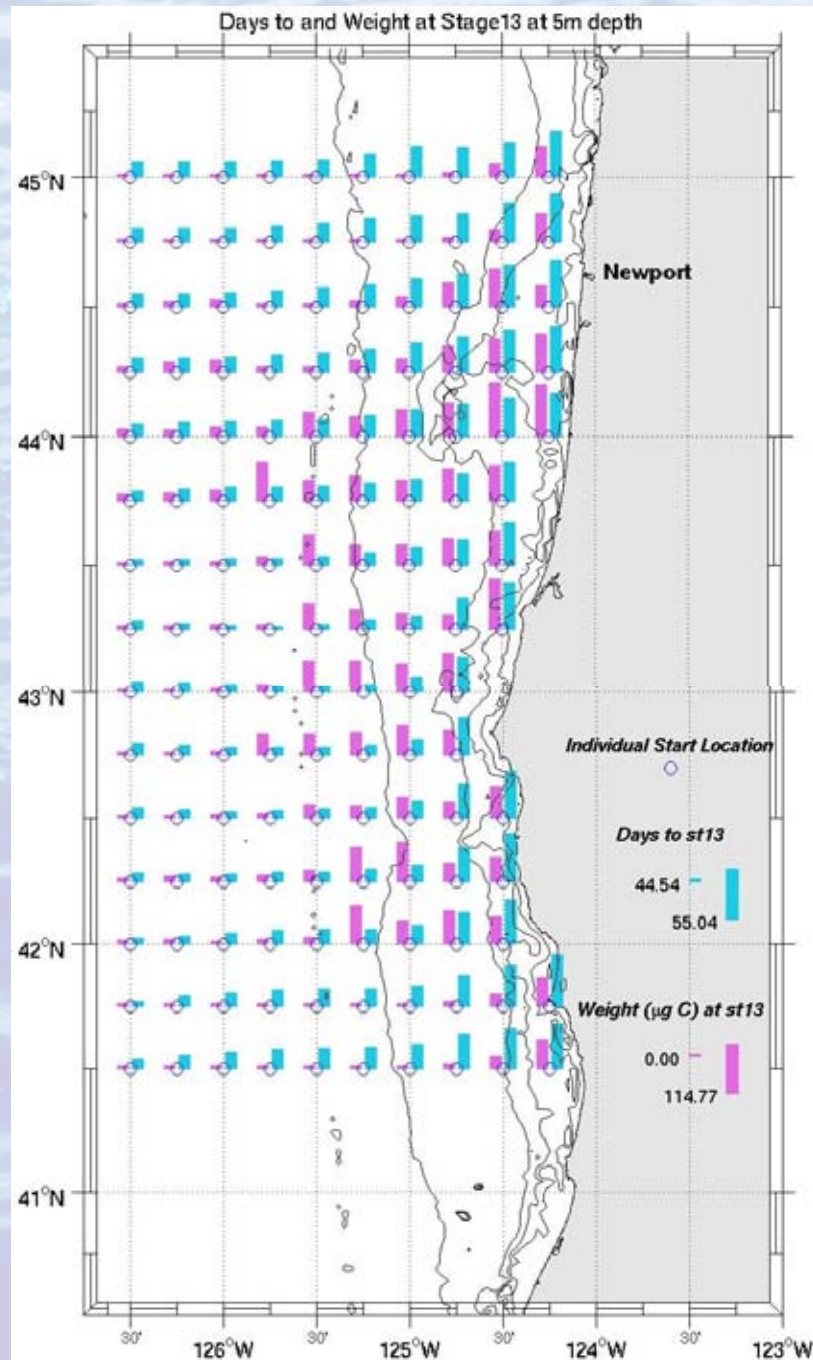
F7s weigh up to 114.77  $\mu\text{gC}$ ;

If those that have starved are ignored,  
the F7s weigh:

65.07  $\pm$  17.62  $\mu\text{gC}$

(closer to 71.94  $\pm$  22.97)

~~DVM is important~~





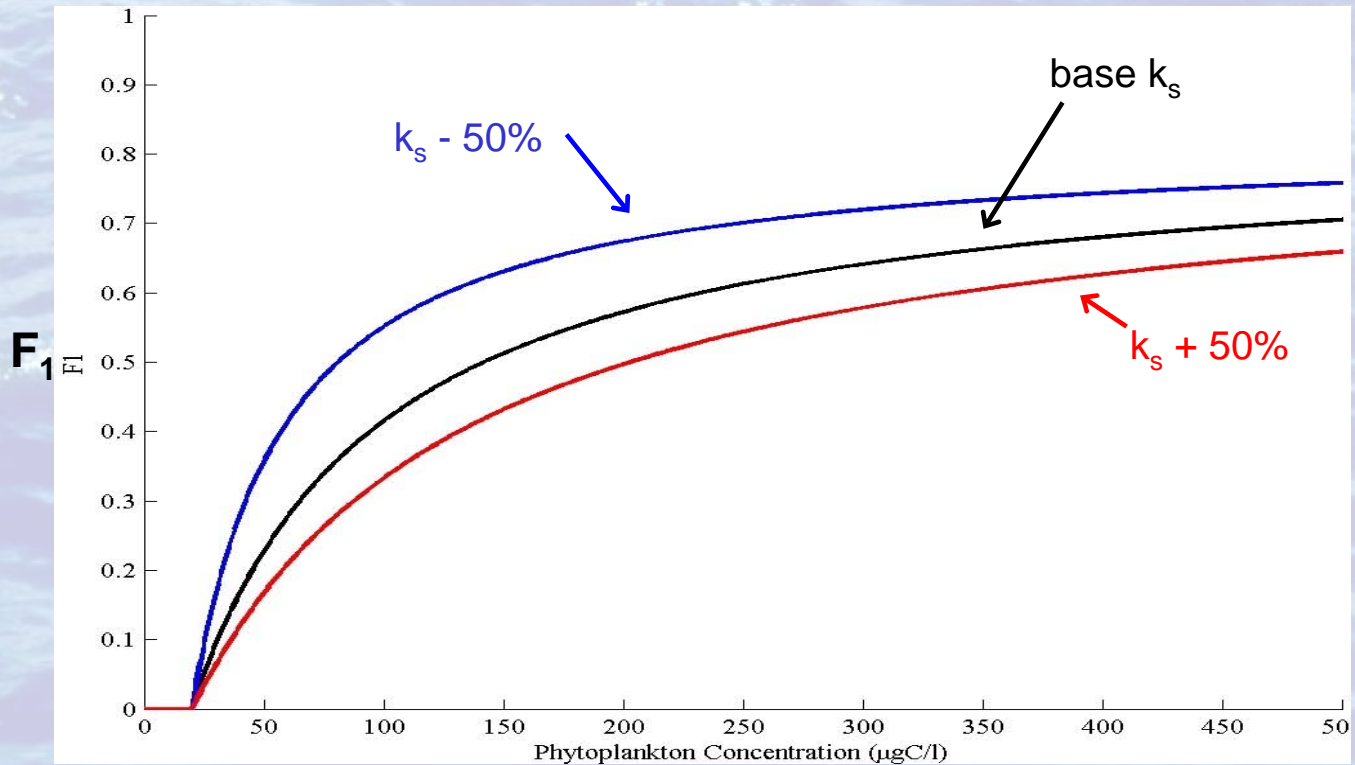
# Model Sensitivity

Ingestion terms:

$$S = \frac{\text{Fractional change in response}}{\text{Fractional change in parameter}}$$

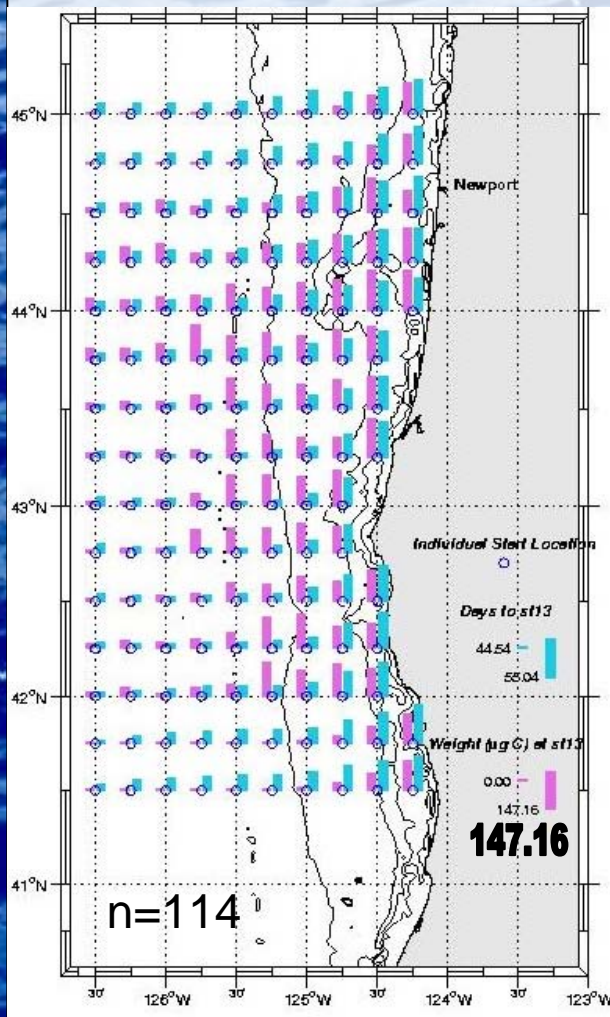
$$I_{\max} * F_1 = I_{\max} * [(P - \text{thr}) / (k_s + (P - \text{thr}))]$$

$k_s \pm 50\%$ :



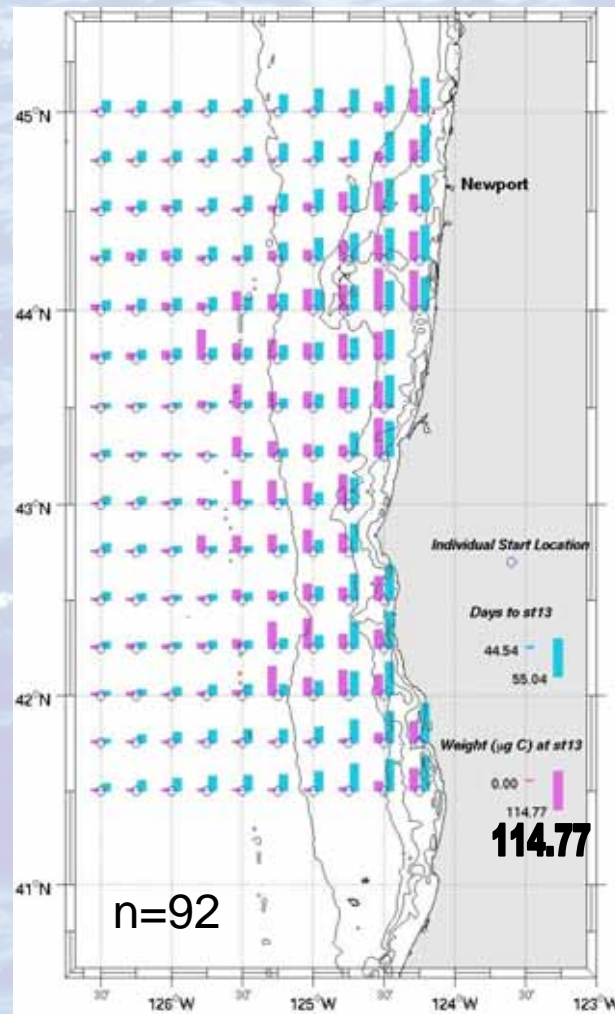
# Model Sensitivity

$k_s$  - 50% ( $S=1.0$ )



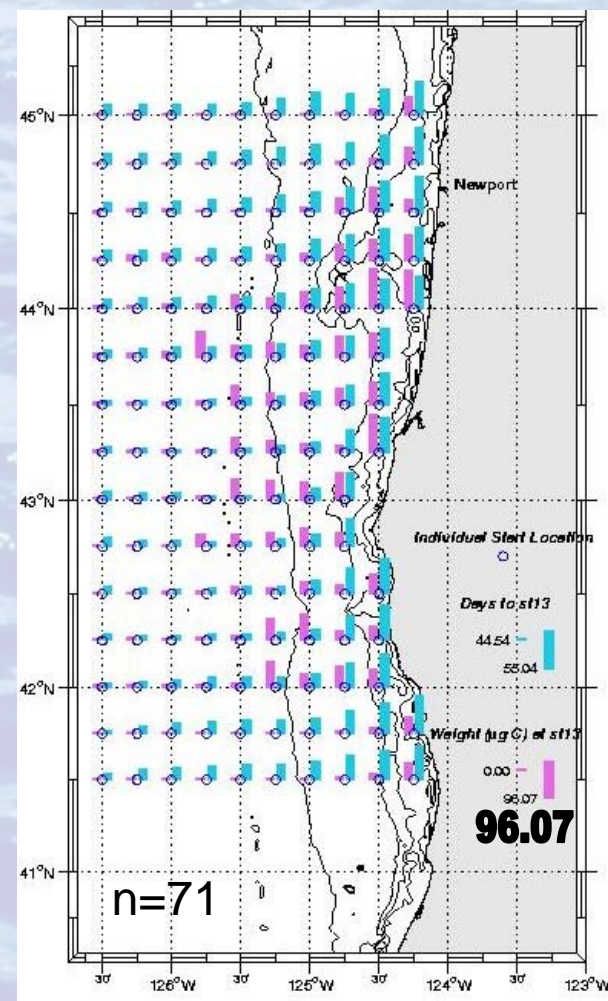
mean wt = base + 52%

$k_s$  in base case



base case

$k_s$  + 50% ( $S=0.38$ )



mean wt = base - 19%



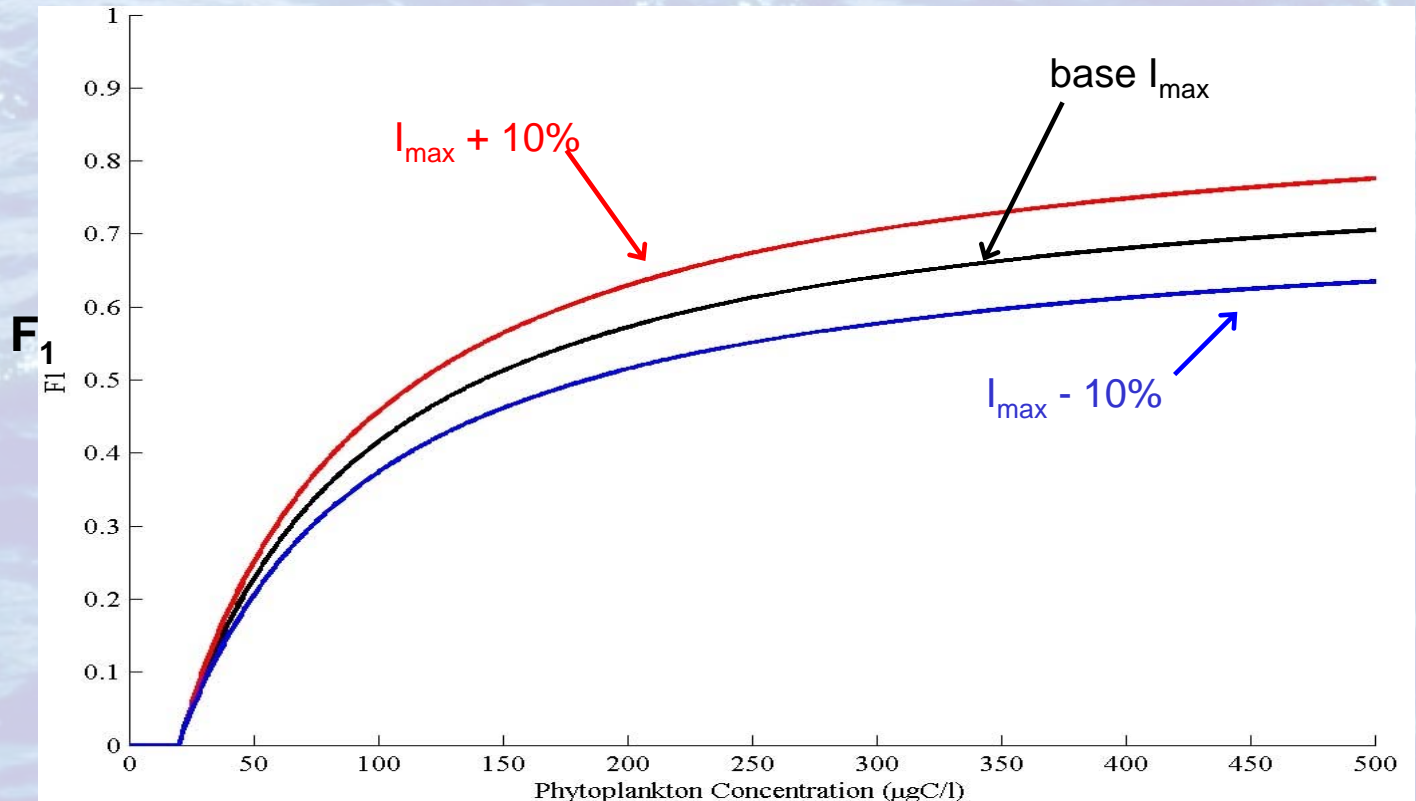
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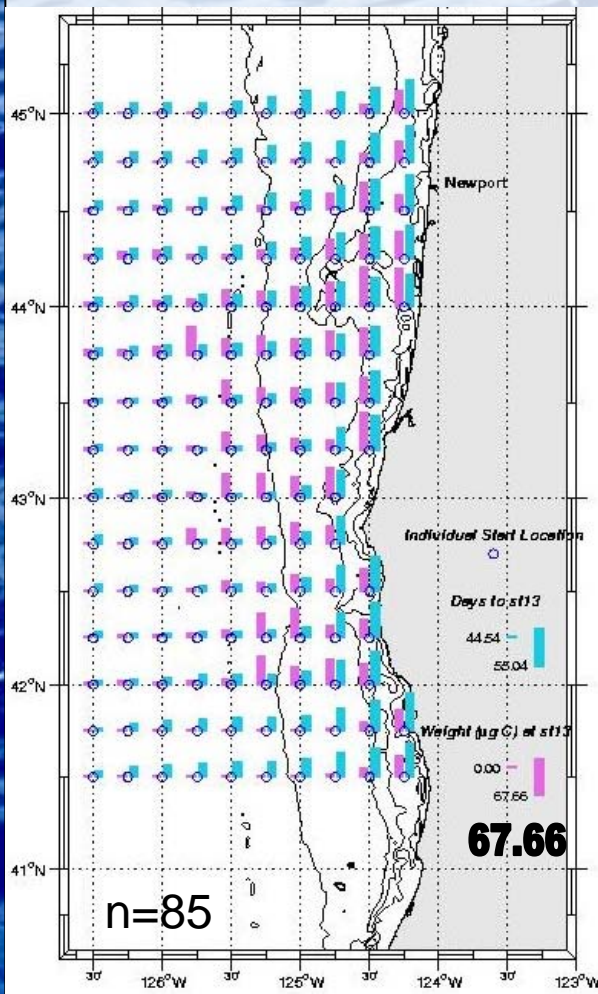
$$I_{\max} * F_1 = I_{\max} * [(P - \text{thr}) / (k_s + (P - \text{thr}))]$$

$I_{\max} \pm 10\%$ :



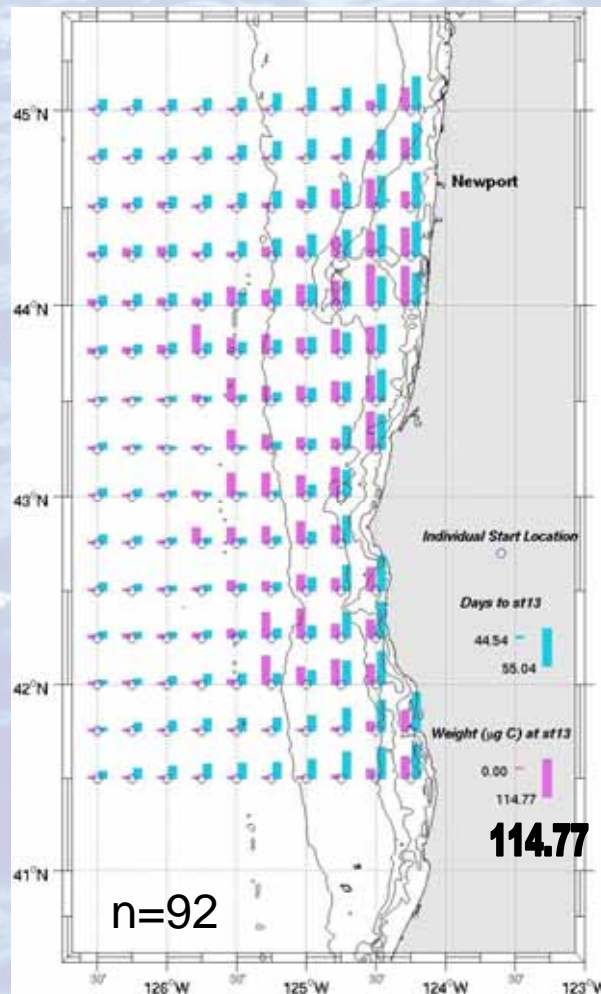
# Model Sensitivity

$I_{\max} - 10\%$  (S=2.5)



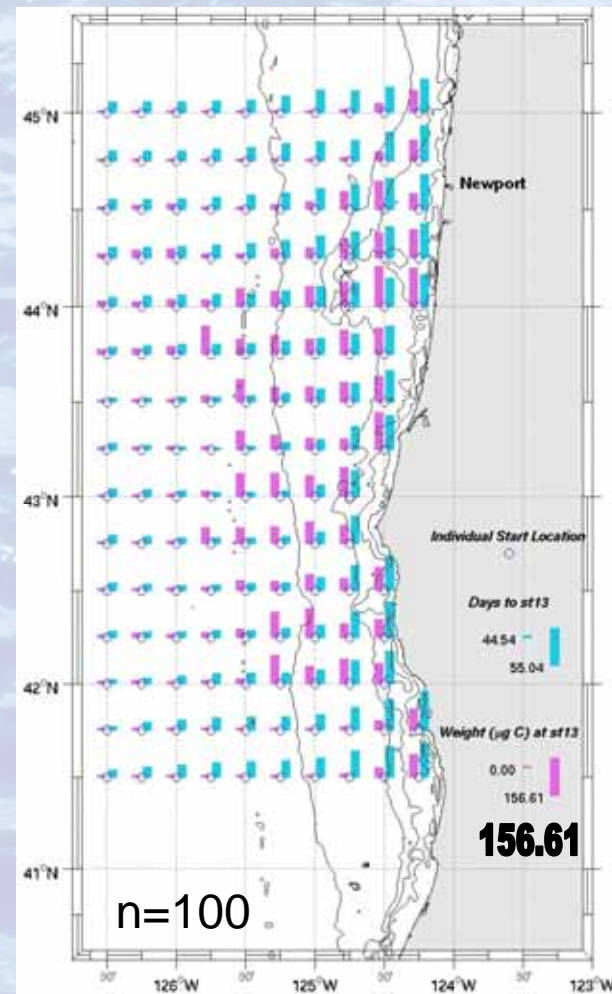
mean wt = base - 25%

$I_{\max}$  base case



base case

$I_{\max} + 10\%$  (S=2.8)



mean wt = base + 28%



# Summary and Conclusions

**Spatially-explicit euphausiid model that decoupled growth and development**

**The model that incorporated information on DVM did better at providing development duration and weights than models that did not.**

**Model is more sensitive to changes in  $I_{\max}$  than to  $k_s$**

***Need to be sure of max ingestion rates!***

**Bill Peterson's lab to the rescue:**

**will inform us of appropriate values**

# **Future Work– Plenty Left to Do**

## **Implement:**

**Explicit molting function**

**Starvation (critical weights per stage)**

**Expand to non-feeding larval stages and reproductive adults**

**Present model is geographically fixed --> Move to 3-D transport ☐**



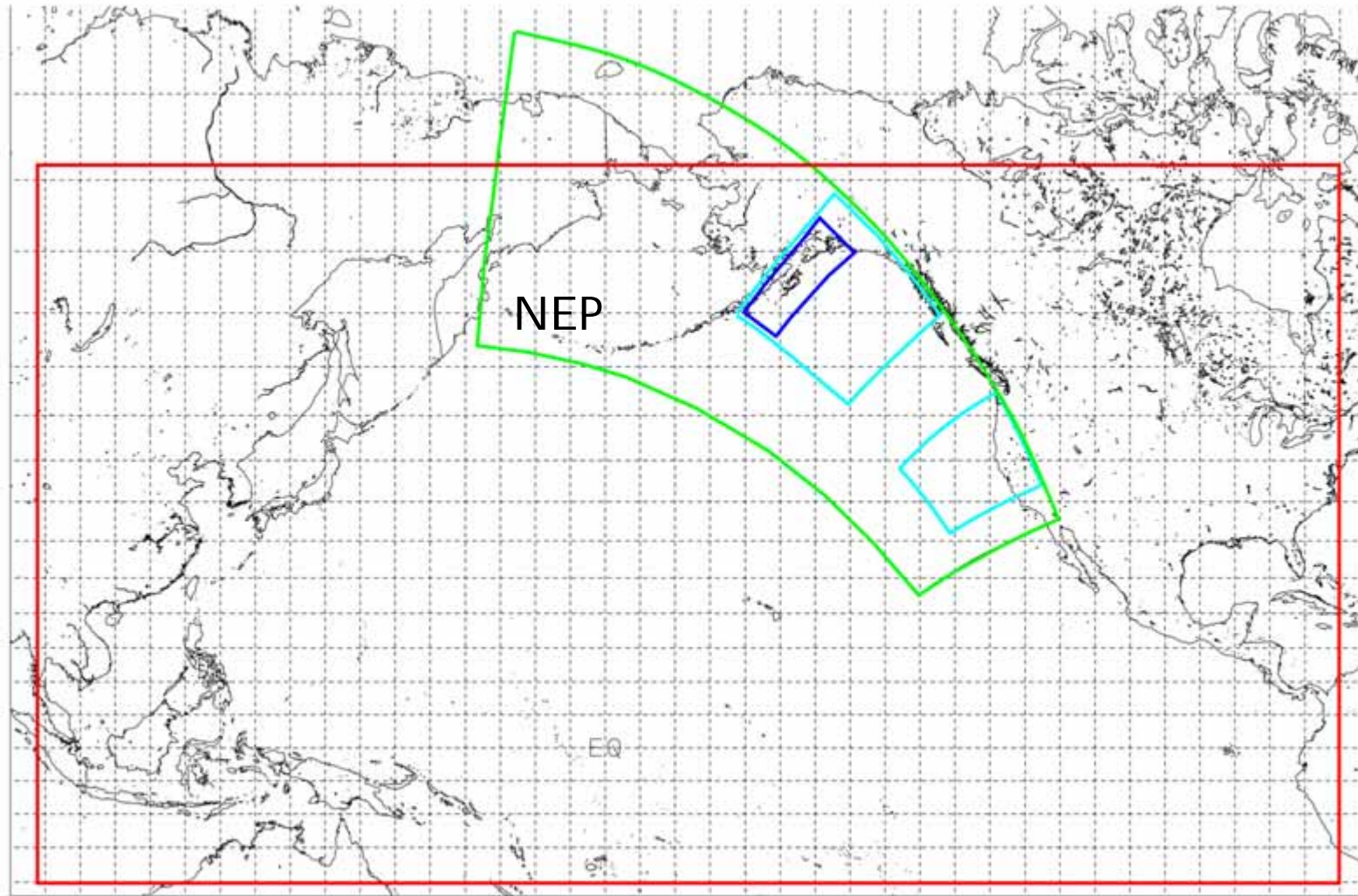
# Questions?

Why some  
modelers stay in  
front of their  
computers?



**MANY Thanks to:** Bill Peterson, Leah Feinberg, Tracy Shaw and Newport crew, Enrique Curchitser, Kate Hedstrom, Jack Barth, and the many unnamed scientists who performed the fieldwork and lab work we rely on to write models.

# U.S. GLOBEC Nested Model Domains



Delta x = 20 40 km

Delta x = 10 km

Delta x = 3 km

Delta x = 1 km



# NEP Implementation

Domain: 20 - 73N, 115 - 210E

ROMS: 226 x 642 x 42 gridpoints

Subdaily (6 hr) T42 CORE wind and fluxes (Large and Yeager)

Initial/boundary conditions provided by CCSM-POP hindcast model

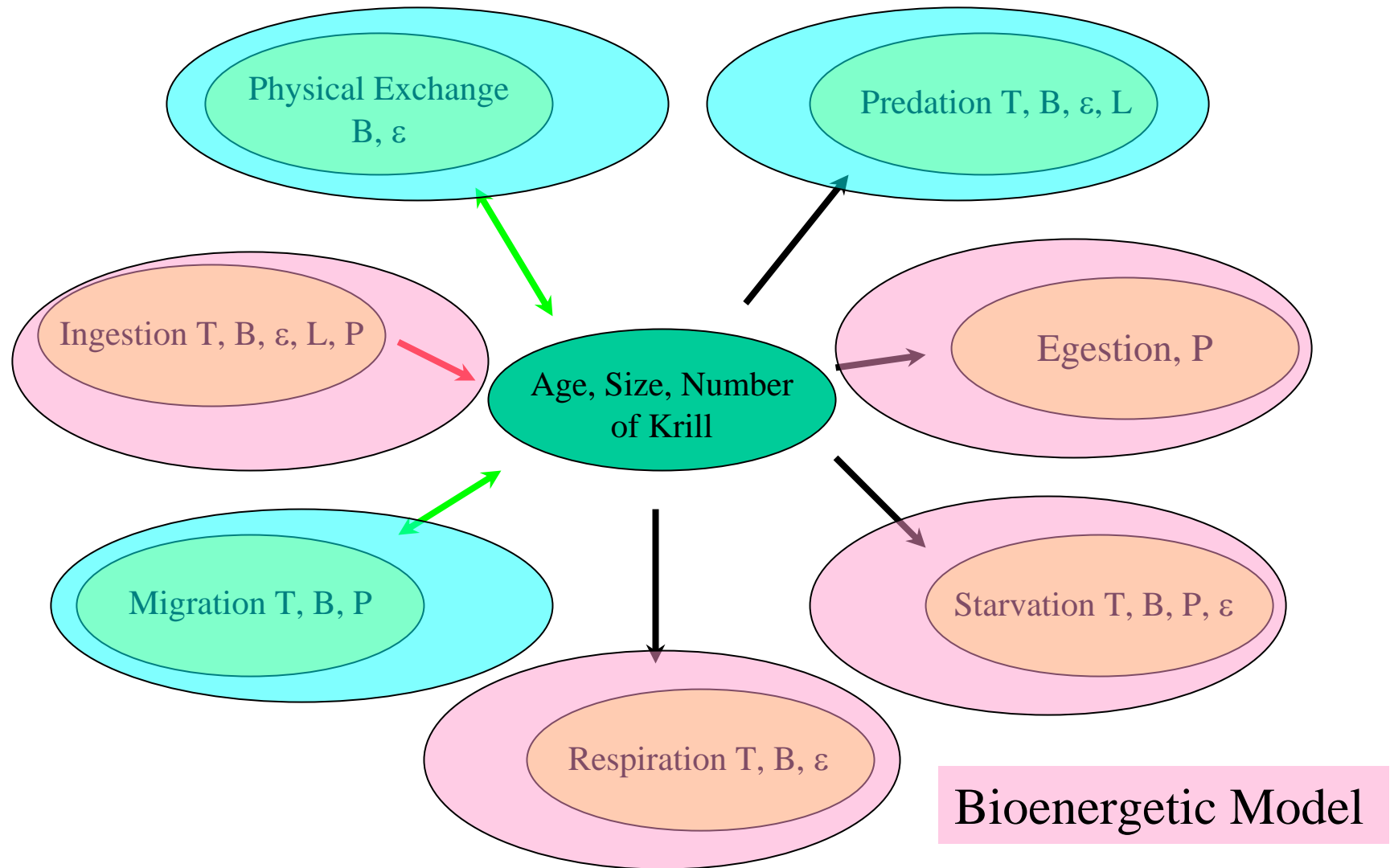
Forward run for 1958-2004—includes multiple El Nino's, Regime Shifts, and 2002 cold intrusion

Daily averaged physical snapshots of velocity, temperature, etc.

Especially want to thank Enrique Curchitser (Rutgers) and Kate Hedstrom (UAF) for providing these model fields.

# Processes and Environmental Variables Influencing Krill Growth and Number

## Spatially-Explicit Model

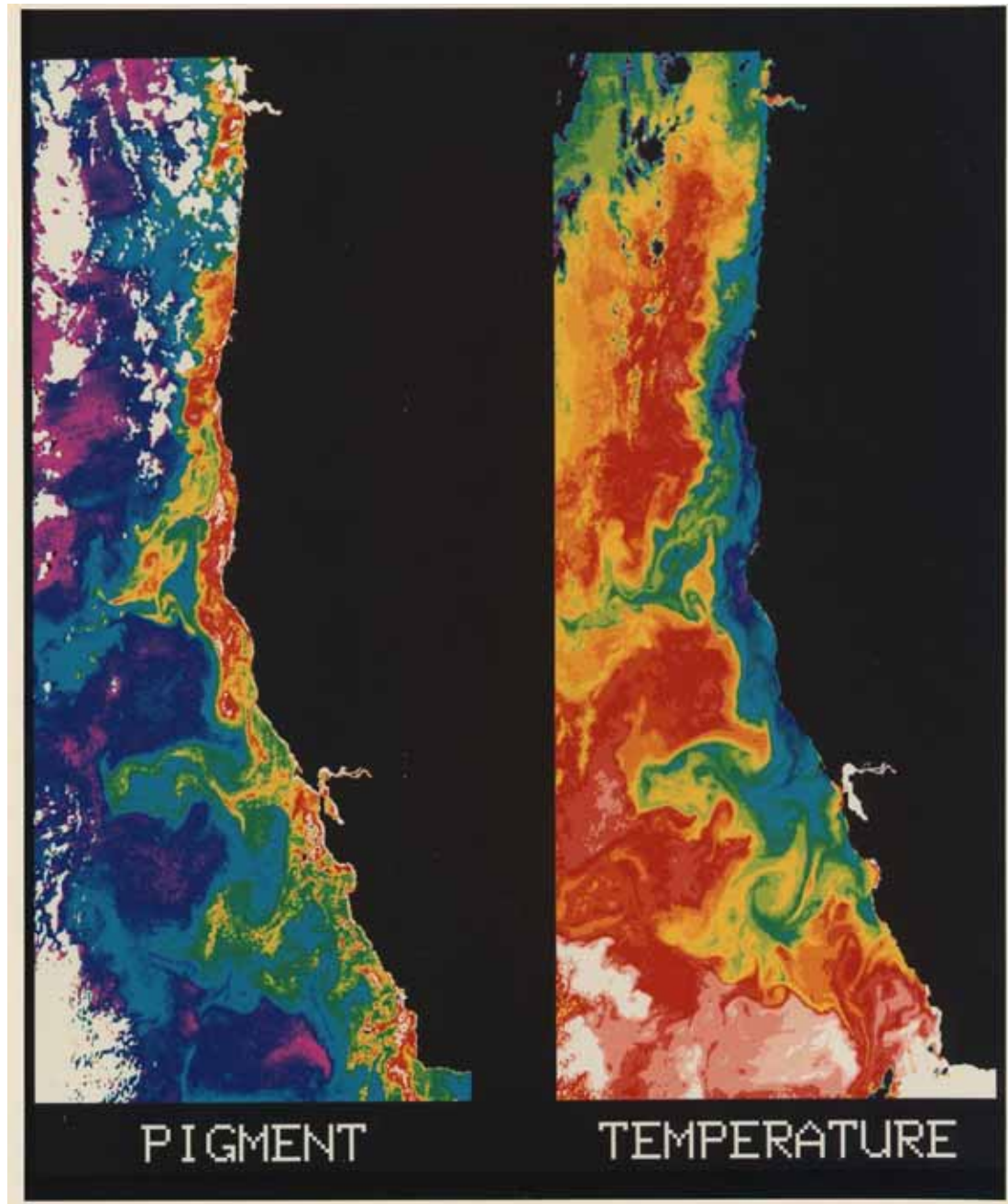


T = Temperature; B=Behavior;  $\epsilon$ =Turbulence; P=Prey; L=Light



California  
Current  
Mesoscale  
Spatial  
Variability

(From Abbott and Zion)



# Coastal Upwelling is the Fuel for the High Productivity in the Northern California Current

EQUATORWARD WINDS (Summer)

