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## **Outline**

- Classical methods for measuring zooplankton production
- Artificial Cohort (AC) methods and Caveats
- Utility and practicality of AC methods
- Status of AC research in the USA

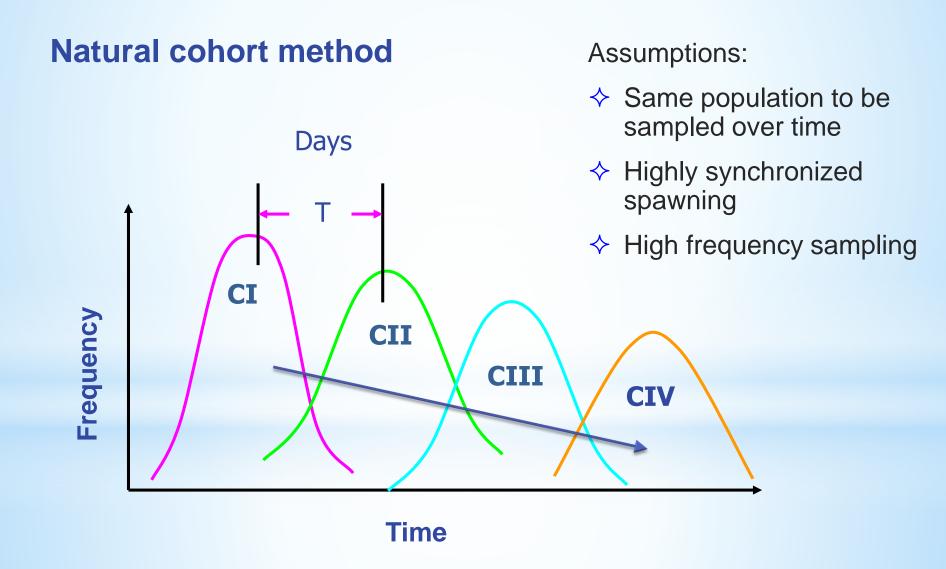
## **Zooplankton Production**

- Limited spatial-temporal resolution of zooplankton production
- A bottleneck for estimating zooplankton production

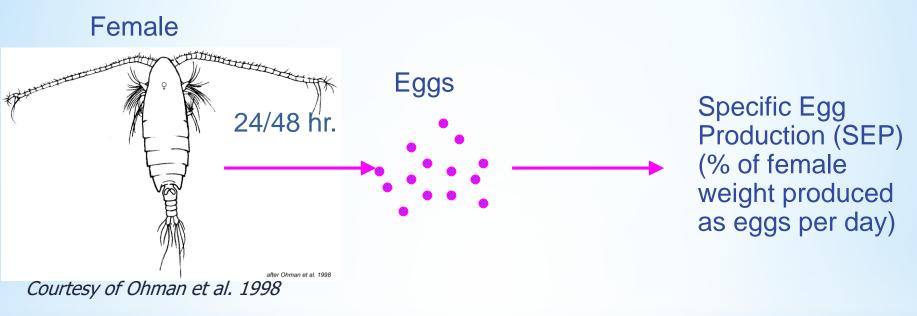
$$P_{2nd} = \sum_{i=1}^{n} G_i \times B_i$$

Lack of consensus on practical methods for measuring zooplankton growth (Hirst et al. 2005, Kimmerer et al. 2007, Liu et al. 2013)

## **Methodological Challenge**



## **Egg production rate**

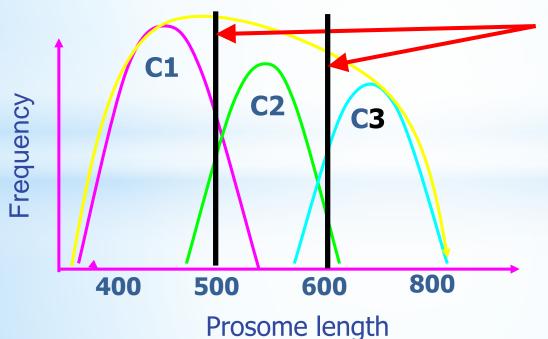


## **Assumptions**

- SEP not influenced by incubation
- Somatic growth of all preceding stages is equivalent to female SEP
- Female remains in steady-state

## Artificial Cohort Method (Kimmerer & McKinnon 1987)

- uses sieves of varying mesh sizes to separate the copepod community into different size classes (sizefractioned cohorts)
- also can be done by manually picking specific stages (cleaned and sorted cohorts)



Screens restrict sizes/stages into 3 classes more easily followed over time

## **Caveats of AC methods**

## **Assumptions**

- Close coupling between moulting and growth (Hart 1990, Peterson et al. 1991)
- Handing does not stimulate moulting, "moulting burst" (Miller et al. 1991)

### Limitations

- No control over number and kinds of species
- Differential growth among stages and species
- Different developmental stage isolated for different species. Incubation times to be appropriate for species and stages of interest

## Methodological considerations of AC

Age structure within stages

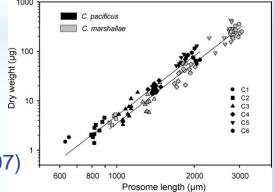
Ideally uniform age structure within stages assumed (Hirst et al. 2005). In practice growth often labeled by stage, not age

Biomass increment of growth

Direct measurement of biomass (Kimmerer et al. 2007), or using a length-weight relationship (Liu & Hopcroft

Liu & Hopcroft (20

2006a&b,&07&08)



Kimmerer et al.: Growth rate methods

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Table 1. Applications of the Kimmerer & McKinnon (1987) artificial cohort method. Temp.: ambient mean temperature or range; MR: experiments that measured molting rates alone and not growth; C: copepodite stages; N: naupliar stages

Location Species	Temp. (°C)	Weight method	Growth rate (d <sup>-1</sup> )	Incubation period (h)	Source
Australia Acartia fancetti	11-22	Mean weight of stage	0.025-0.26	26-50	Kimmerer & McKinnon (1987)
Skagerrak Centropages typicus Temora longicornis Paracalanus parvus Pseudocalanus spp. Calanus finmarchicus Acartia longiremis	16-17	Length-weight regression	0.24-0.77 0.15-0.56 0.16-0.48 0.12-0.35 0.01-0.14 0.15-0.24	24	Peterson et al. (1991)
Norway Temora longicornis	18	Length-weight regression	0.00-0.32	1 sample (24 h) <sup>-1</sup>	Hernández-León et al. (1995)
Canary Islands Oncaea sp.	29			(=)	
Jamaica Oikopleura dioica Parvocalanus crassirostris		Length-weight regression	1.38-3.12 0.24-0.79	120 1 sample (24 h) <sup>-1</sup>	Hopcroft & Roff (1995)
Jamaica Acar fia spp. Centropages velificatus Par acalanus aculeatus Par vocalanus crassirostris Temora turbinata Corycaeus spp. Oithona nana Oithona simplex	28	Length-weight regression	0.25-1.43 0.70-1.00 0.25-1.26 0.44-1.08 0.34-1.23 0.10-0.36 0.40-0.91 0.17-0.53	120 1 sample (24 h) <sup>-1</sup>	Hopcroft et al. (1998b) Hopcroft & Roff (1998b,c)
France Acartia bifilosa		Length-weight regression	0.03-0.14	72	Irigoien & Castel (1995)
Agulhas Bank Calanus agulhensis	17-18	Length-weight regression	0.19-0.46	24	Peterson & Hutchings (1995)
North Sea Temora longicornis Pseudocalanus elongatus	6-16	-	MR MR	24	Klein Breteler et al. (1998)
Plymouth Calanus helgolandicus	15	-	MR	48	Shreeve et al. (1998)
Alboran Sea Centropages typicus	17	Volume-weight relationship	< 0.01-0.27	24-26	Calbet el al. (2000)
Georges Bank Calanus finmarchicus		Volume-weight relationship	C: -0.09 to 0.3 N: -0.07 to 0.20		Campbell et al. (2001a)
Indian Ocean Mixed calanoid guild Mixed cyclopoid guild	21-31	Volume-weight relationship	C: 0.38 N: 0.43 C: 0.28 N: 0.38	48 24 48 24	McKinnon & Duggan (2003)
Great Barrier Reef Mixed calanoid guild Mixed cyclopoid guild	22-30	Volume-weight relationship	C: 0.12-0.53	48 (2 expts sampled also after 24 h)	McKinnon et al. (2005)
Gulf of Alaska Neocalanus flemingeri/ plumchrus	5-9	Length-weight regression	0.01-0.28	120	Liu & Hopcroft (2006a)
Gulf of Alaska Metridia pacifica	5-14	length-weight regression	0.01-0.28	96 or 120	Liu & Hopcroft (2006b)
Gulf of Alaska Calanus marshallae, C. pacificus	5-14	Length-weight regression	0.03-0.30	96 or 120	H. Liu & R. R. Hopcroft (unpubl.)

By 2008, 18 studies, 14 regions, 31 species and 4 copepod guilds

Kimmerer et al. (2007)

## **Deployment of the AC experiments**



## Size-fractionated vs. manually picked cohorts

#### Comparison of Two Methods

#### Single-Stage Method

#### Pros:

- known development stages for given species
- exact stage-specific growth data available

#### Cons:

- apt for few large species
- labor intensive and requires suitable working condition at sea

#### Screen-Filter Method

#### Pros:

- routinely deployed at sea
- simultaneously applicable to whole copepod community

#### Cons:

- mixed development stages
- exact stage-specific growth data unavailable

#### Stage Error in Screen-Filter Data

Forcing numerical values calculated from mixed stages to represent the single stage to facilitate comparison to the singlestage method







## Size-fractionated vs. manually picked cohorts

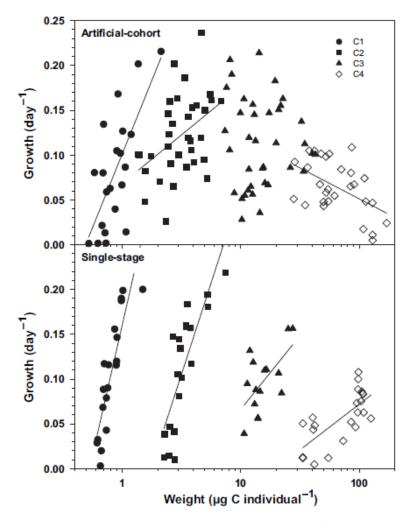
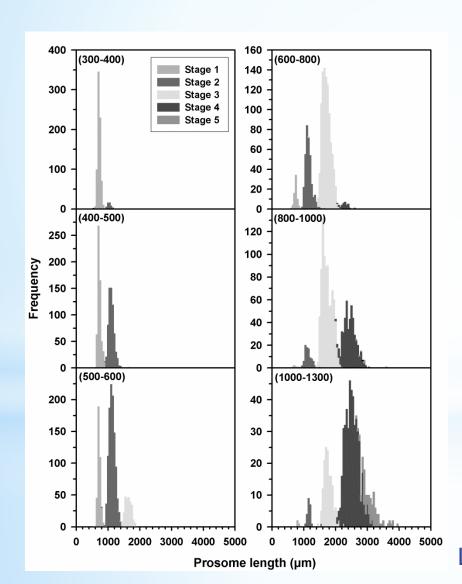


Fig. 6. Relationship between growth rate of Neocalanus flemingeri/plum-dnus and the body weight (μg C individua 1) within early copepodite stages estimated by artificial-cohort and single-stage methods in the northern Gulf of Alaska.

Liu & Hopcroft (2006)

## Mixed stages in size-fractionated cohorts



$$\overline{\mathbf{C}} = \sum_{i=1}^{5} (fc)_i / N$$

C: stage (1,2,3,4,5)

f: stage frequency

N: total observations of target species at each mesh size

Liu et al. (2013)

## Quantifying the stage error in size-based cohorts



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## Statistical modeling of copepod growth rates: Comparisons for data collections using the artificial cohort (AC) method



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```
\begin{split} S_i(\cdot): & \text{univariate smoothing function for } i=1,2\\ \epsilon_i - & \text{iid } N(0,\sigma^2)\\ & \text{Model 2}\\ Y_i = \beta_1 X_{i1} + \beta_2 X_{i2} + \beta_3 X_{i3} + \beta_4 X_{i4} + \beta_5 \text{log}_{10}(X_{i5}) + \beta_6 X_{i6}/(X_{i6}+\beta_7) + \epsilon_i\\ & \text{The } X_{ij} \text{ is the same as in Model 1 } (j=1,...,6), \text{ and, as before,}\\ & \text{the } \epsilon_i - & \text{iid } N(0,\sigma^2)\\ & \text{Model 3}\\ Y_i - & \text{normal } (\mu,\sigma^2)\\ & \mu_i = (\beta_1 + \Delta_1 \times \text{ind}) X_{i1} + (\beta_2 + \Delta_2 \times \text{ind}) X_{i2} + (\beta_3 + \Delta_3 \times \text{ind}) X_{i3}\\ & + (\beta_4 + \Delta_4 \times \text{ind}) X_{i4} + \beta_5 \text{log}_{10}(X_{i5}) + \beta_6 X_{i6}/(X_{i6}+\beta_7)\\ & \text{The } X_{ij} \text{ is the same as Model 1 } (j=1,...,6)\\ & \lambda_i (j=1,2,3,0) \text{ the stare arrows for stare 1 to stare 4} \end{split}
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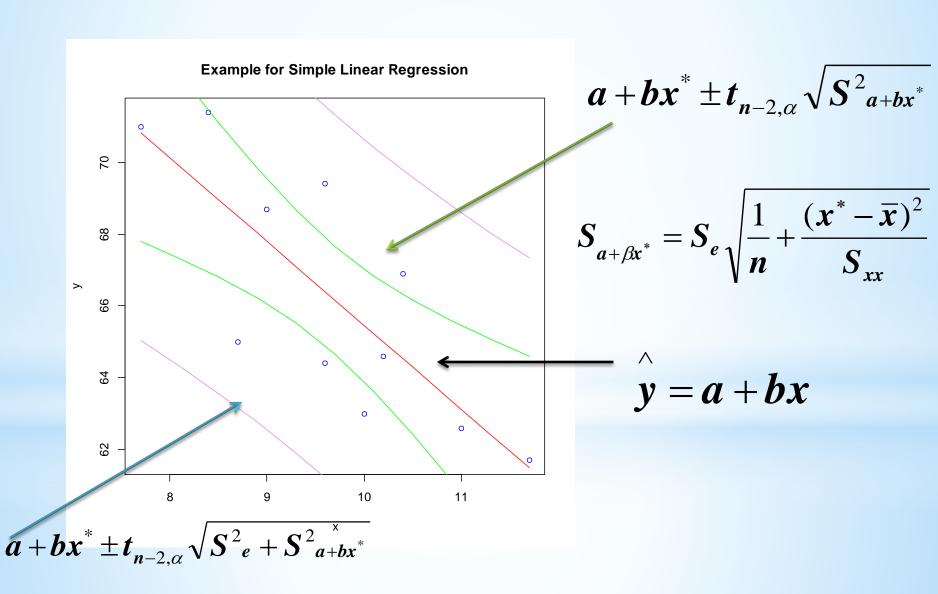
- Nonlinear Model
- 2. Parametric approach
- Prediction
- Bavesian model
- Parameters considered as random variables
- Posterior estimation for parameters based on data available

Same as Model 1

Modeling growth rates and discerning the stage errors in the screen-filter data

- Stage errors estimated not significantly different from zero
- The stages labeled with the practical technique in the screenfilter method not statistically different from that identified by manually picking

## **Uncertainty for using the L-W equations**



# Inferences of a prediction value a+ βx\* using the L-W equations

 $\triangleright$  The estimated standard deviation of the statistic a+  $\beta x^*$ 

is

$$S_{a+\beta x^*} = S_e \sqrt{\frac{1}{n} + \frac{(x^* - \overline{x})^2}{S_{xx}}}$$

When the assumptions are met, the probability distribution of is t-distribution with df=(n-2)

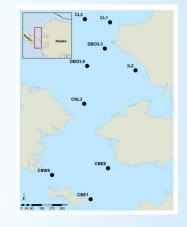
$$t = \frac{a + bx^* - (\alpha + \beta x^*)}{S_{a+\beta x^*}}$$

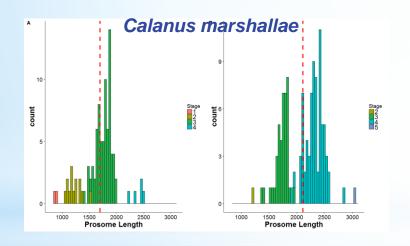
Confidence interval for a+ βx\* has form:

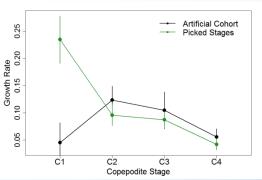
$$a+bx^*\pm t_{n-2,\alpha}S_{a+bx^*}$$

## **Current AC research in the USA**

Field AC work ongoing in the Bering Sea and Chukchi Sea on Calanus marshallae and Pseudocalanus spp. (Hopcroft)







- Modeling research on AC (Liu)
- Others

## Recap

- Size-based AC method is mostly practical for measuring growth rates of zooplankton with caveats
- Sized-based method can be a substitute of the manually picked methods for measuring stage-specific growth rates
- A potential way to tackle the uncertainty using L-W relationship for measuring biomass
- Methods of theoretically perfect and practically operational

## **Acknowledgements**







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## **Thank You**