

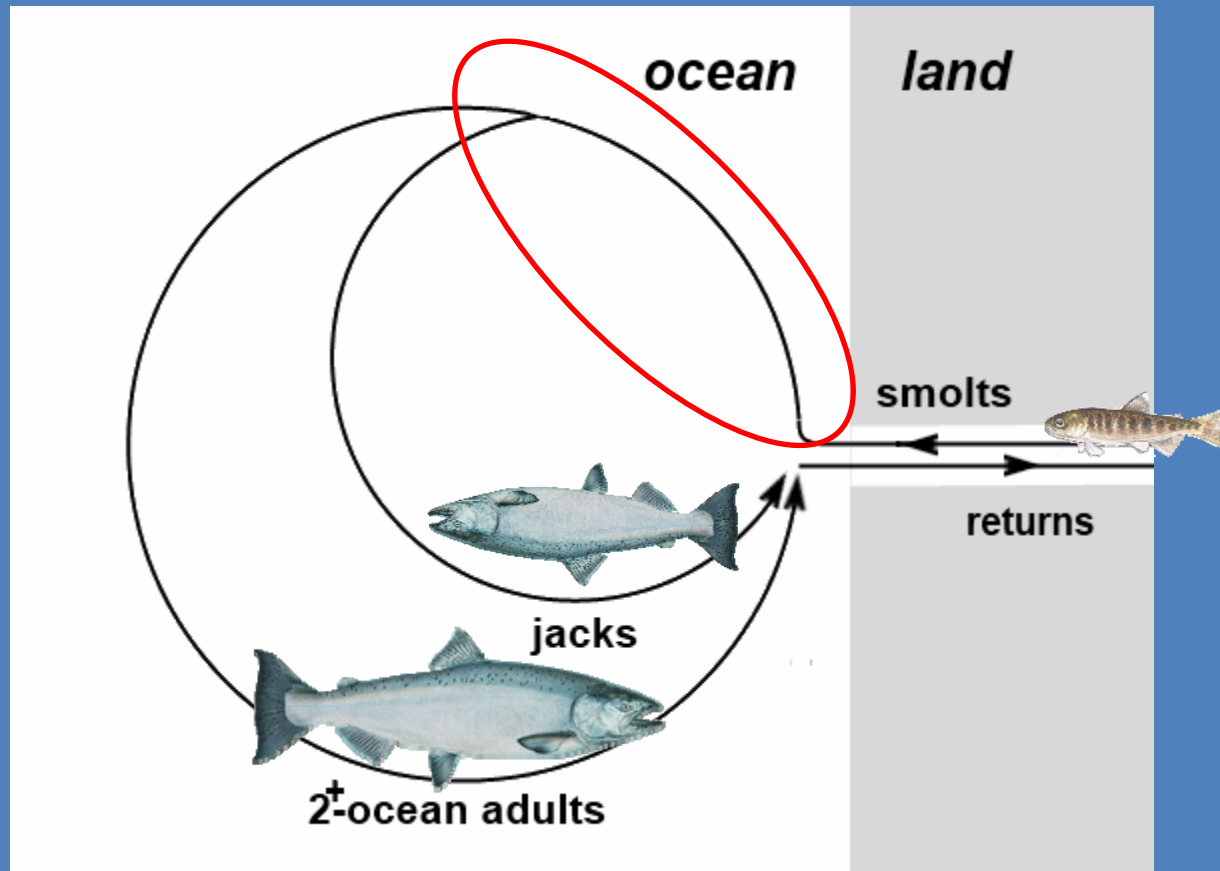
# Modeling Chinook Growth and Mortality

And the implications of  
size-selective culling

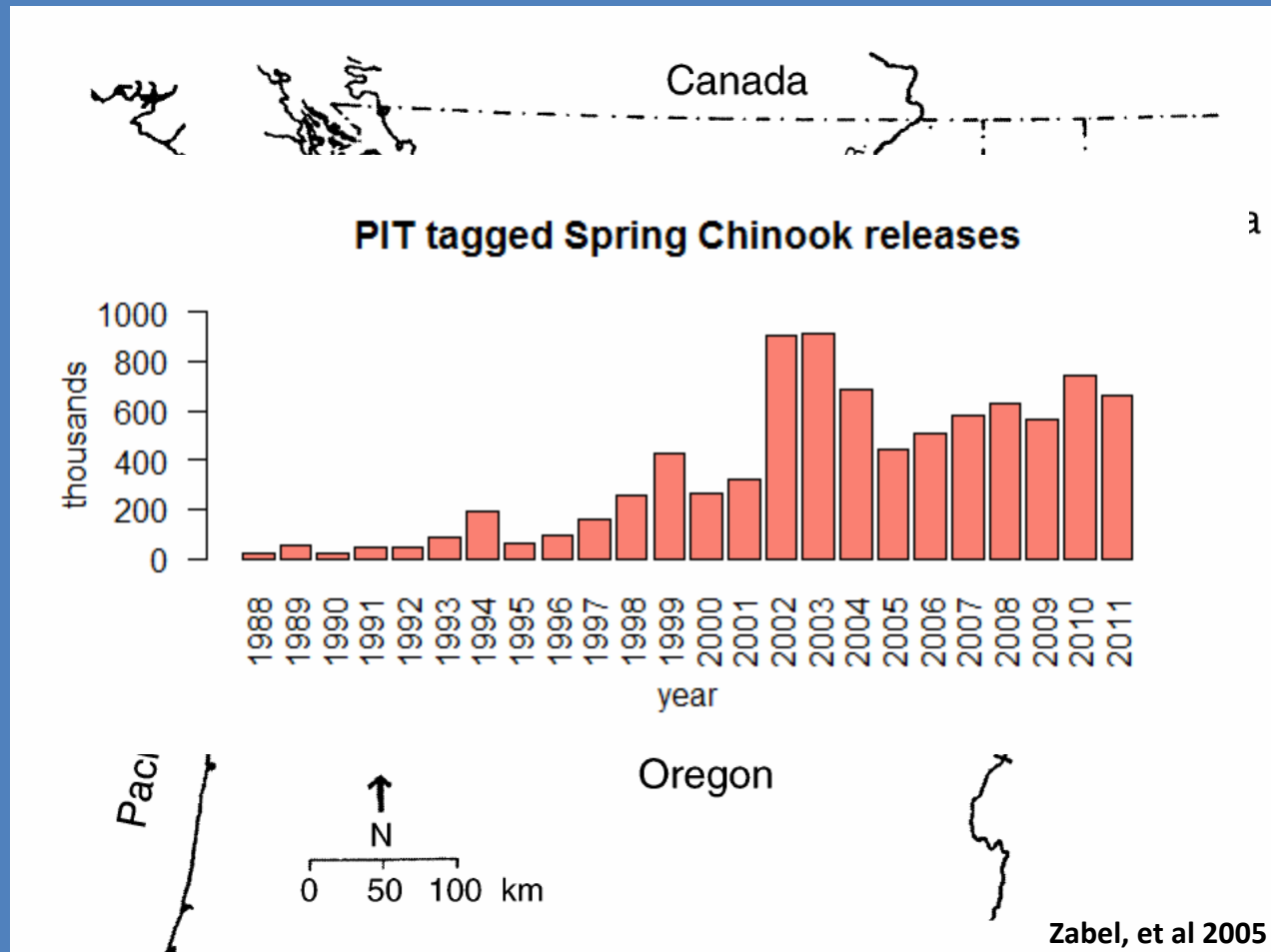
# Growth and Mortality

- Background
- Mathematical Models
- Measuring Growth
- Maturation Models

# Chinook Salmon Lifecycle

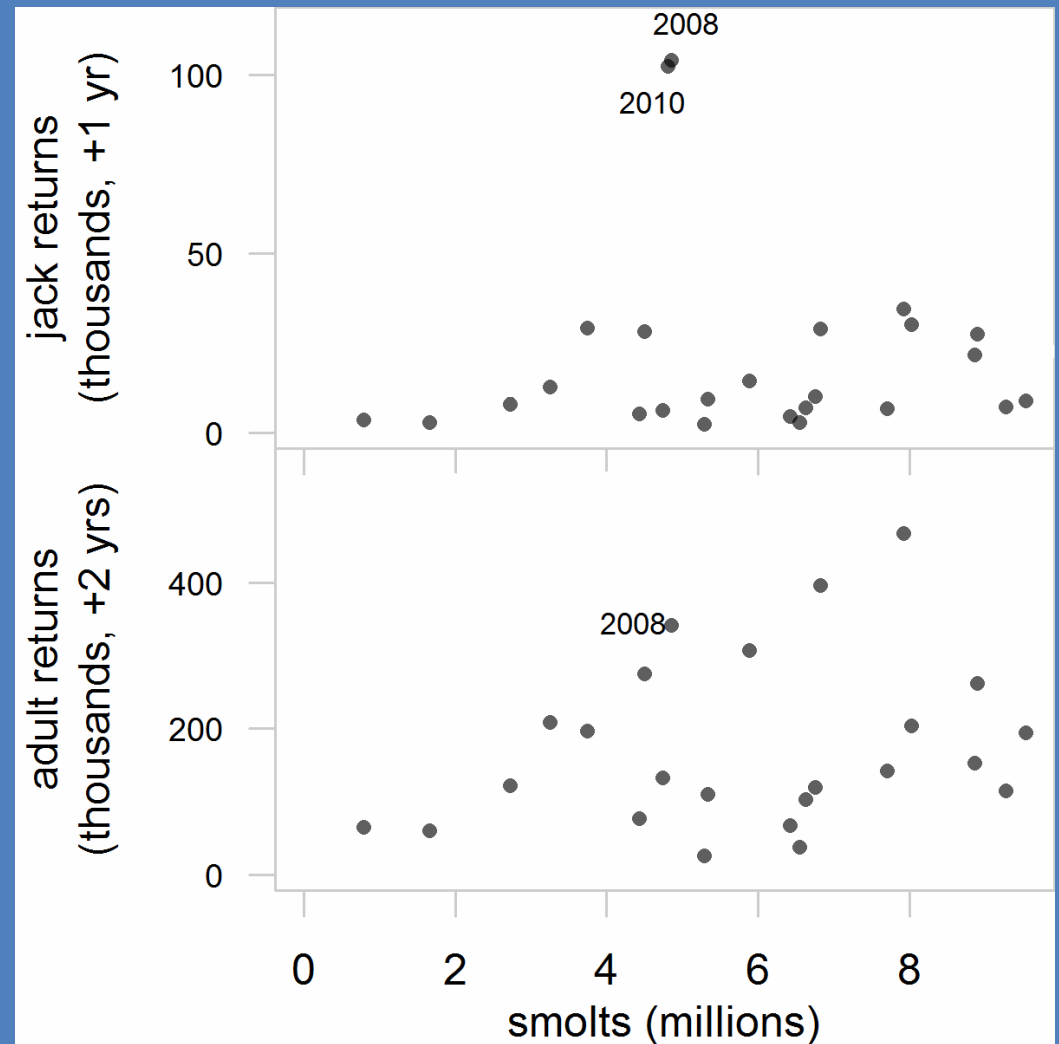


# Columbia River Basin Salmon

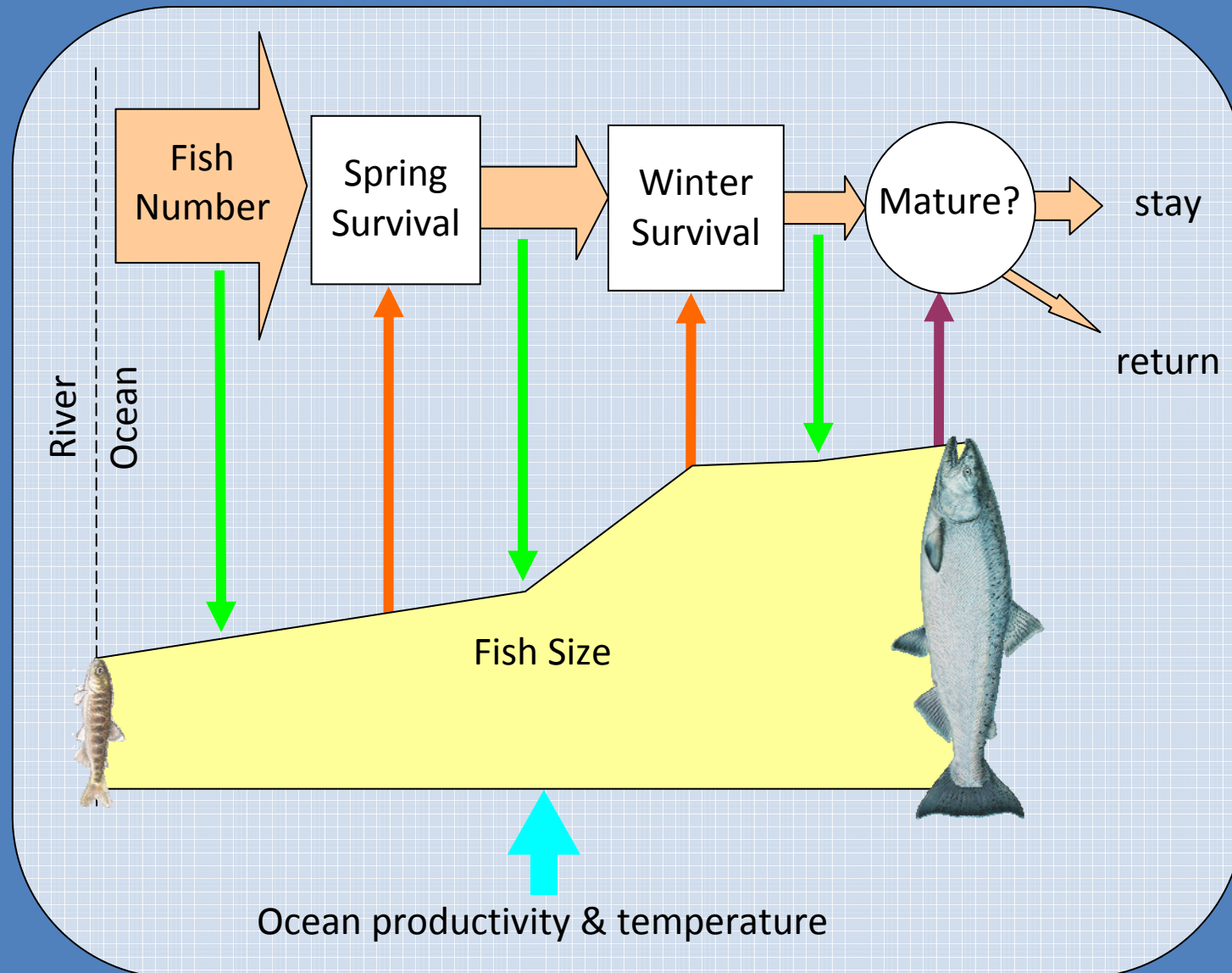


# The Puzzle

- CRB Chinook
  - Saturation
  - DD in Freshwater
  - Diminishing returns
  - DD in ocean



# First Ocean Year



# Basic Growth & Mortality Model

- Mortality rules:
  - Larger → greater survival capacity
- Growth rules:
  - Variable food → Variation in growth
    - ↑: Low, patchy, competition
    - ↓: High, well-distributed, no competition
  - Genetics
  - Density dependence:
    - Fewer salmon → more food per → faster growth

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# McKendrick - von Foerster PDE

$$\frac{\partial N}{\partial t} = -\frac{\partial}{\partial x}(g N) - m N$$

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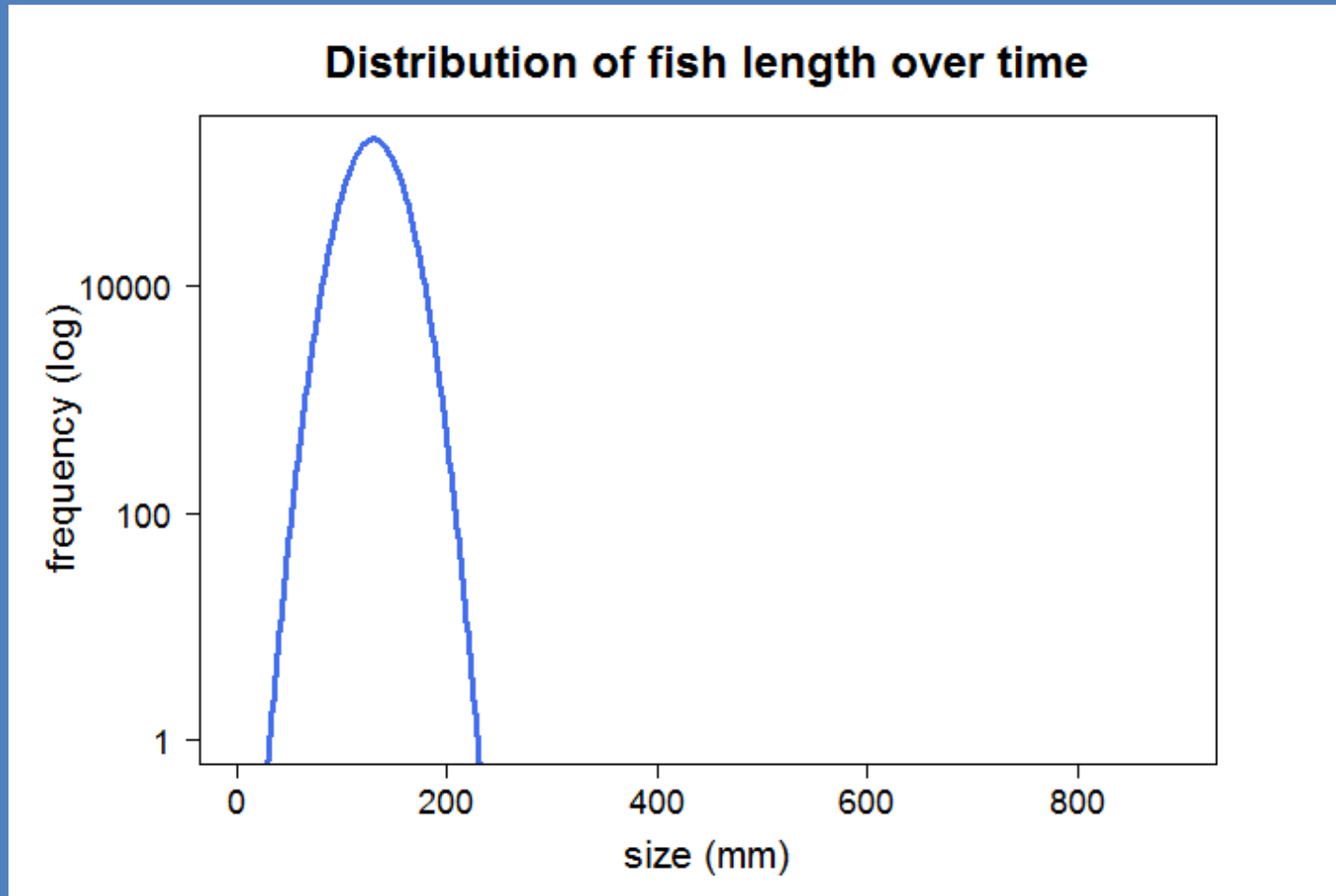
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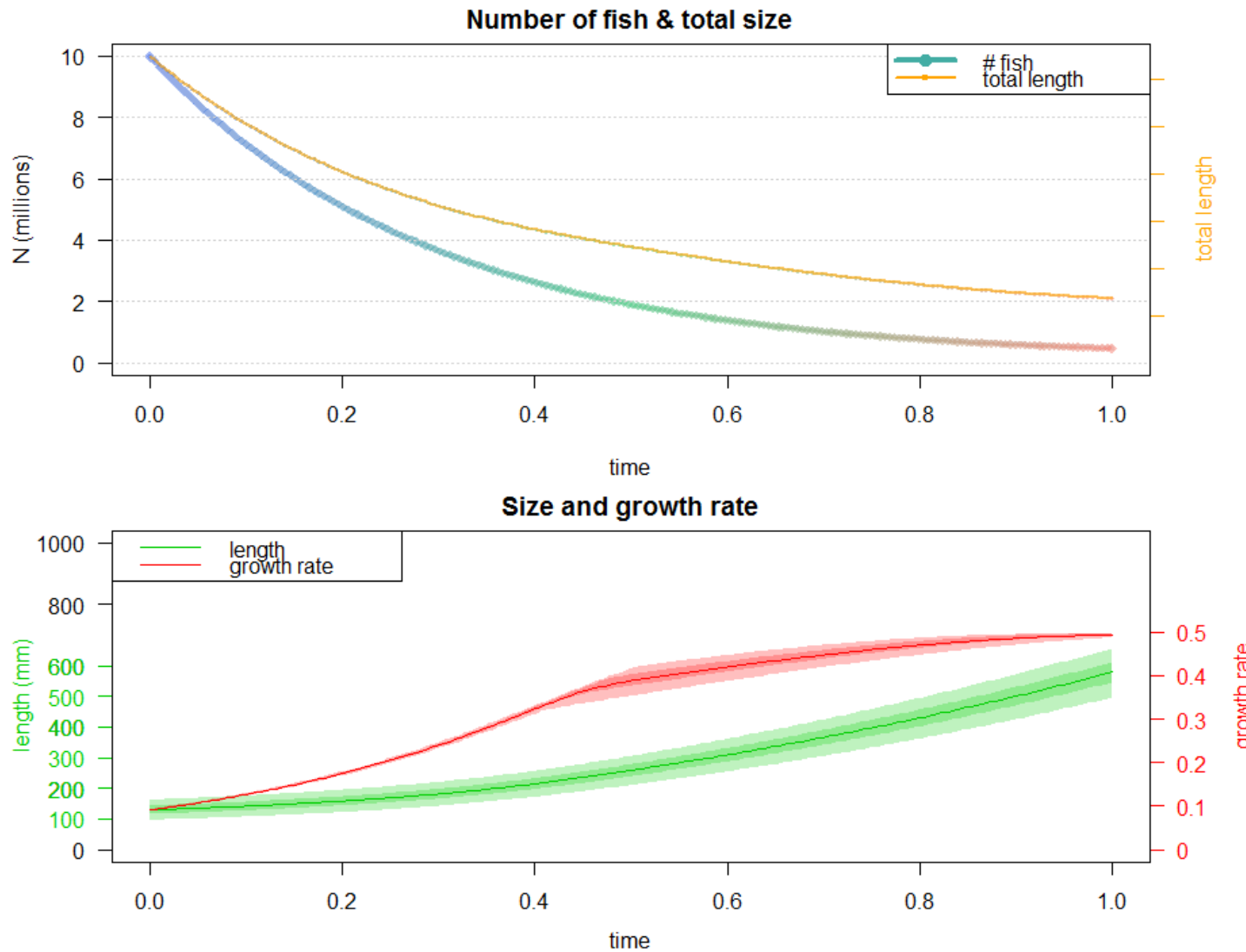
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# MKVF example



# MKVF example



# Munch formulation (2003)

$$\frac{dN}{dt} = -m(x)N \qquad \frac{dx}{dt} = g(x)$$

where

$x(t)$  is the size of a fish at time  $t$   
(which was size  $x_0$  at time 0)

$N(t)$  is the number fish at time  $t$  (which were  
size  $x_0$  at time 0 and size  $x_t$  at time  $t$ )

$g(x)$  is the growth rate for fish of size  $x$   $\left(\frac{dx}{dt}\right)$

$m(x)$  is the mortality rate for fish of size  $x$   $\left(\frac{1}{N} \frac{dN}{dt}\right)$



# Munch formulation (2003)

$$\frac{dN}{dt} = -m(x)N$$

$$\frac{dx}{dt} = g(x)$$

$$\int \frac{dN}{N} = - \int m(x) dt$$

$$\int_{x_0}^{x_t} \frac{dz}{g(z)} = \int_0^t ds$$

$$\frac{N(x_t, t)}{N(x_0, 0)} = \exp \left( - \int_0^t m(x_s) ds \right)$$

$$\varphi^{-1}(x_t) \equiv t$$

$$\frac{N(x_t, t)}{N(x_0, 0)} = \exp \left( - \int_{x_0}^{x_t} \frac{m(x)}{g(x)} dx \right)$$

$$x_t \equiv \varphi(t; x_0)$$

# Munch formulation (2003)

$$\frac{N(x_t, t)}{N(x_0, 0)} = \exp \left( - \int_{x_0}^{x_t} \frac{m(x)}{g(x)} dx \right)$$

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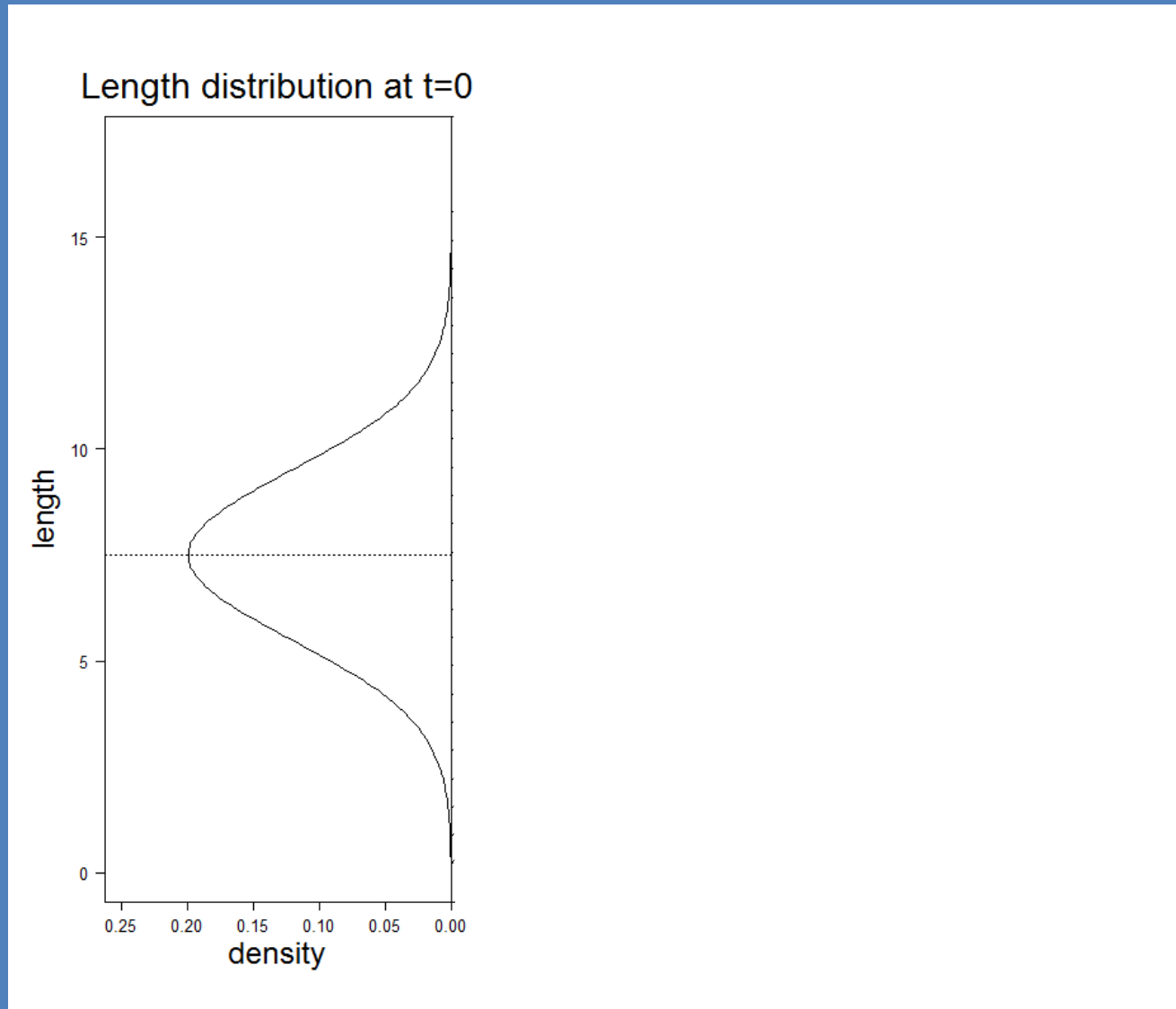
$N(x_t, t)$  is the number of size  $x_t$  fish at time  $t$

$g(x)$  is the growth rate for fish of size  $x$   $\left( \frac{dx}{dt} \right)$

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# Example of Munch formulation

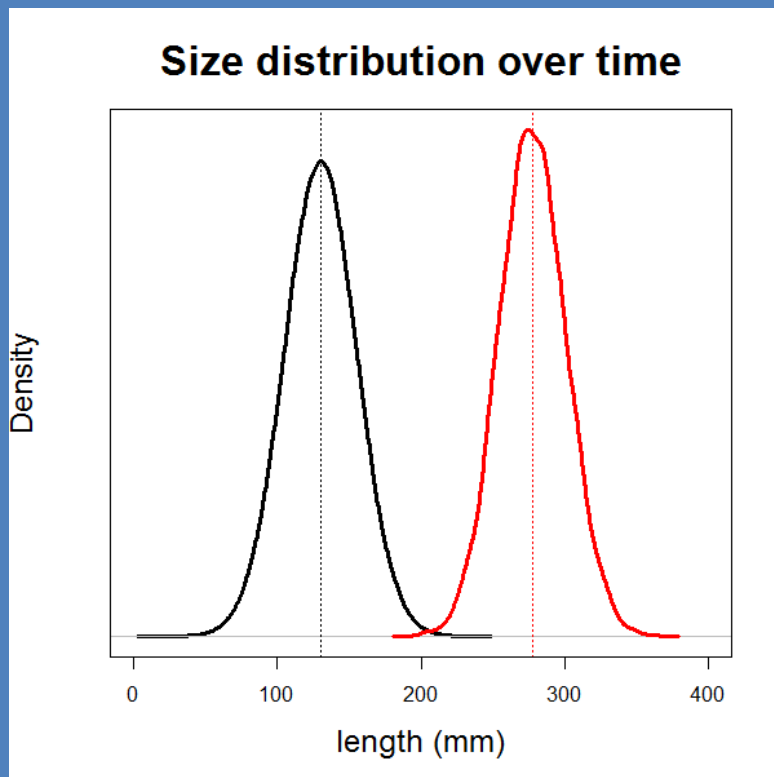


# Growth and Mortality

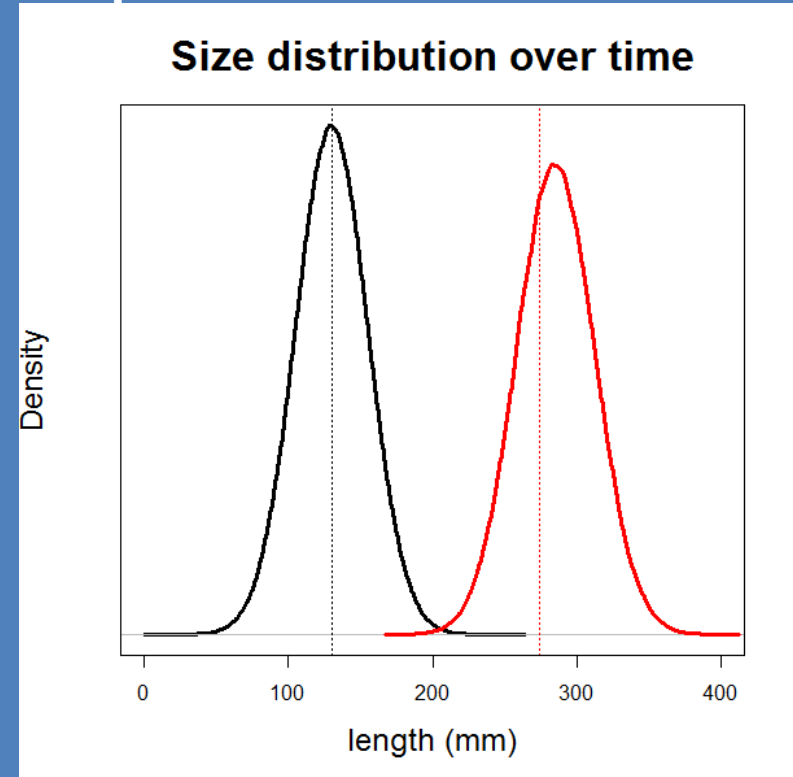
- Background
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# Measuring Growth and the Impact of Size-Selective Culling

- Not size-selective
  - Size distribution translates



- Size selective
  - Size distribution “pushed”



# Estimating Growth

- Samples of size at two times
- Growth  $\neq$  difference in means
- Estimate parameters
  - growth and mortality
- Growth computable
  - Error bounds?

# Growth and Mortality

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# Maturation Biology

- Age – size/growth
  - Critical size at age
  - Most growth is marine
- Initiation
  - 6-12 months prior
  - Hormonal cues detectable in some outmigrants!
- Genetics
  - Faster/slower growers



# Potential Factors influencing jack returns

## Freshwater conditions

- Size at tagging
- Growth index
- Flows
- PNI
- Location
- Water temperatures

## Ocean conditions

- Ocean upwelling
- Copepod
- SST (by season)
- PDO (by season)
- ONI (by season)

# What fraction of returns will be jacks?

## Linear regression model

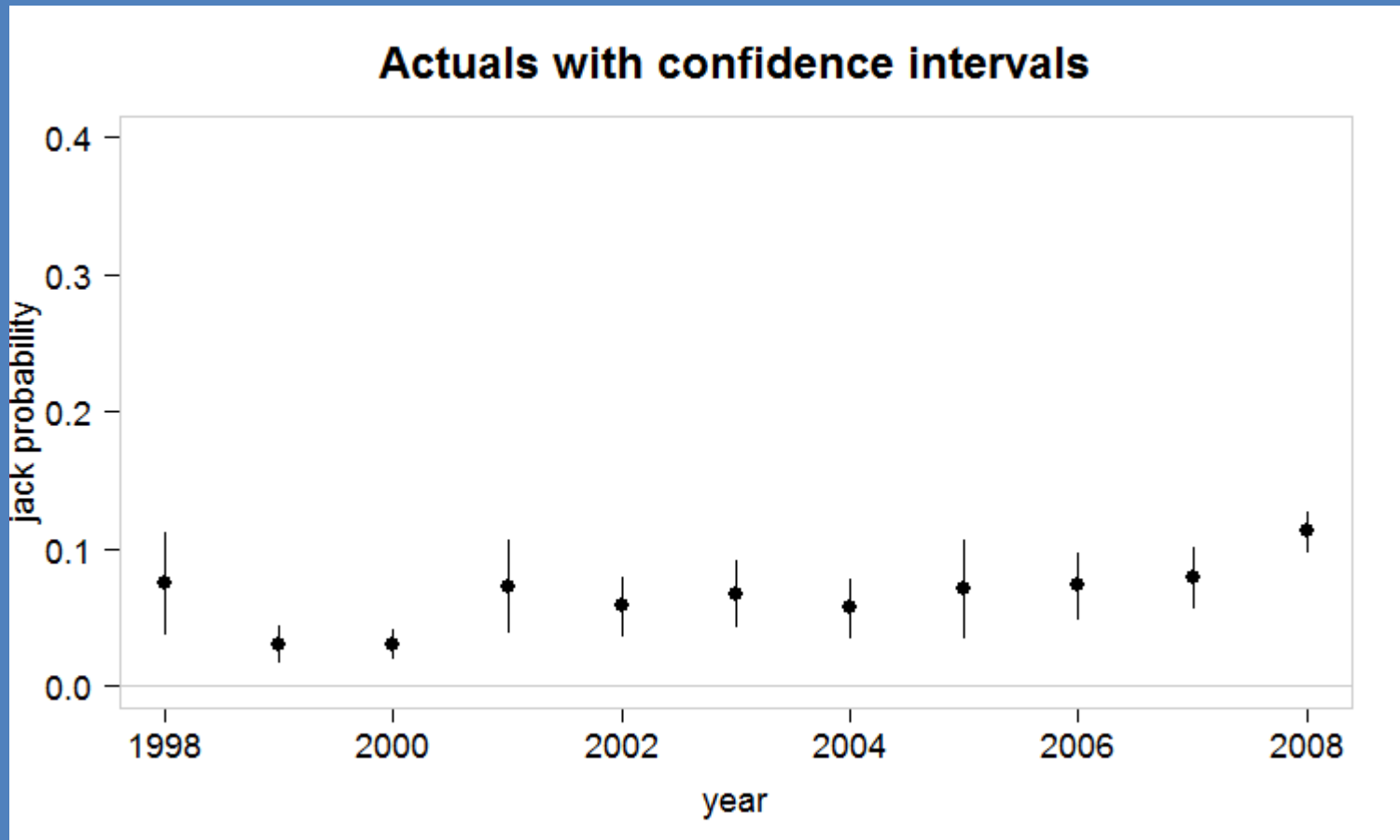
### Freshwater conditions

- Important:
  - Growth index
  - Size at tagging
- Influential:
  - Water temperatures
- Not:
  - Flows
  - PNI
  - location

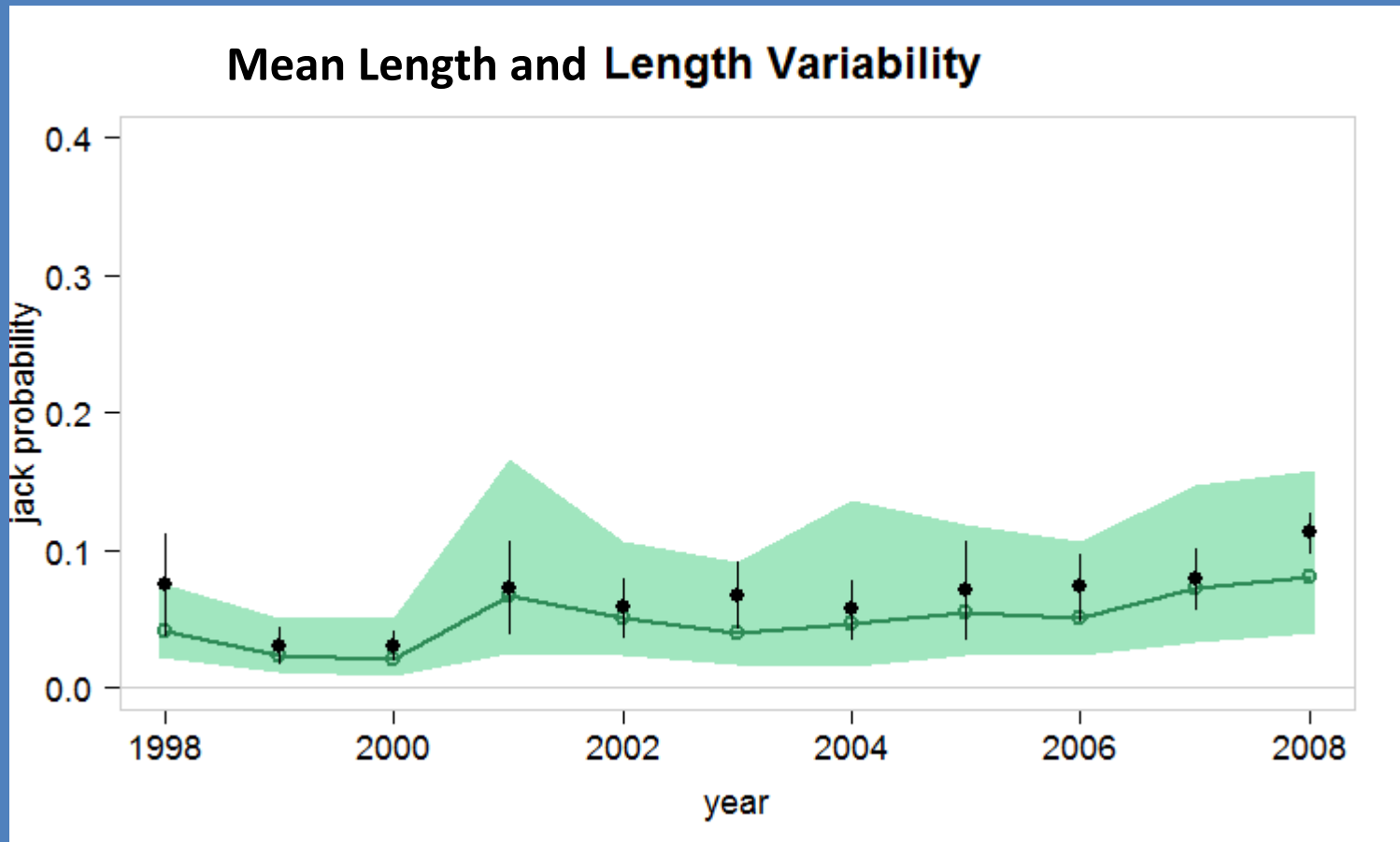
### Ocean conditions

- Important:
  - Ocean upwelling
  - PDO (summer)
- Not:
  - SST
  - PDO (winter, spring, fall)
  - ONI
  - Copepod

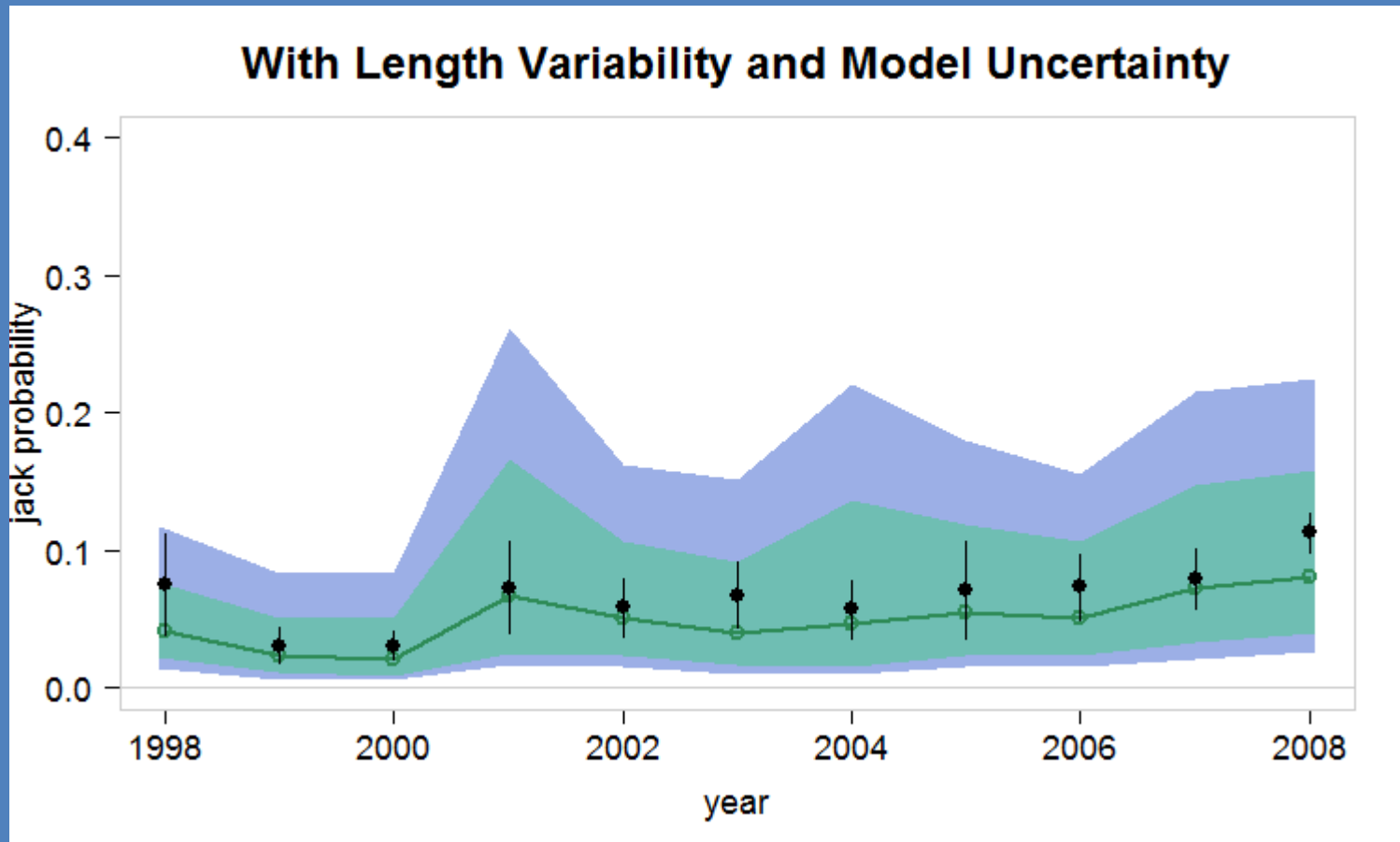
# Model Results



# Model Results



# Model Results



# Summing up & moving on

- Model development
  - Environmental Covariates
  - Interacting Populations
    - Interspecific
    - Wild & hatchery
    - Fast/slow growers
- Growth Measurement
- Jack Returns
  - Freshwater Development
  - Variables Missing?

**Thank  
You  
!**

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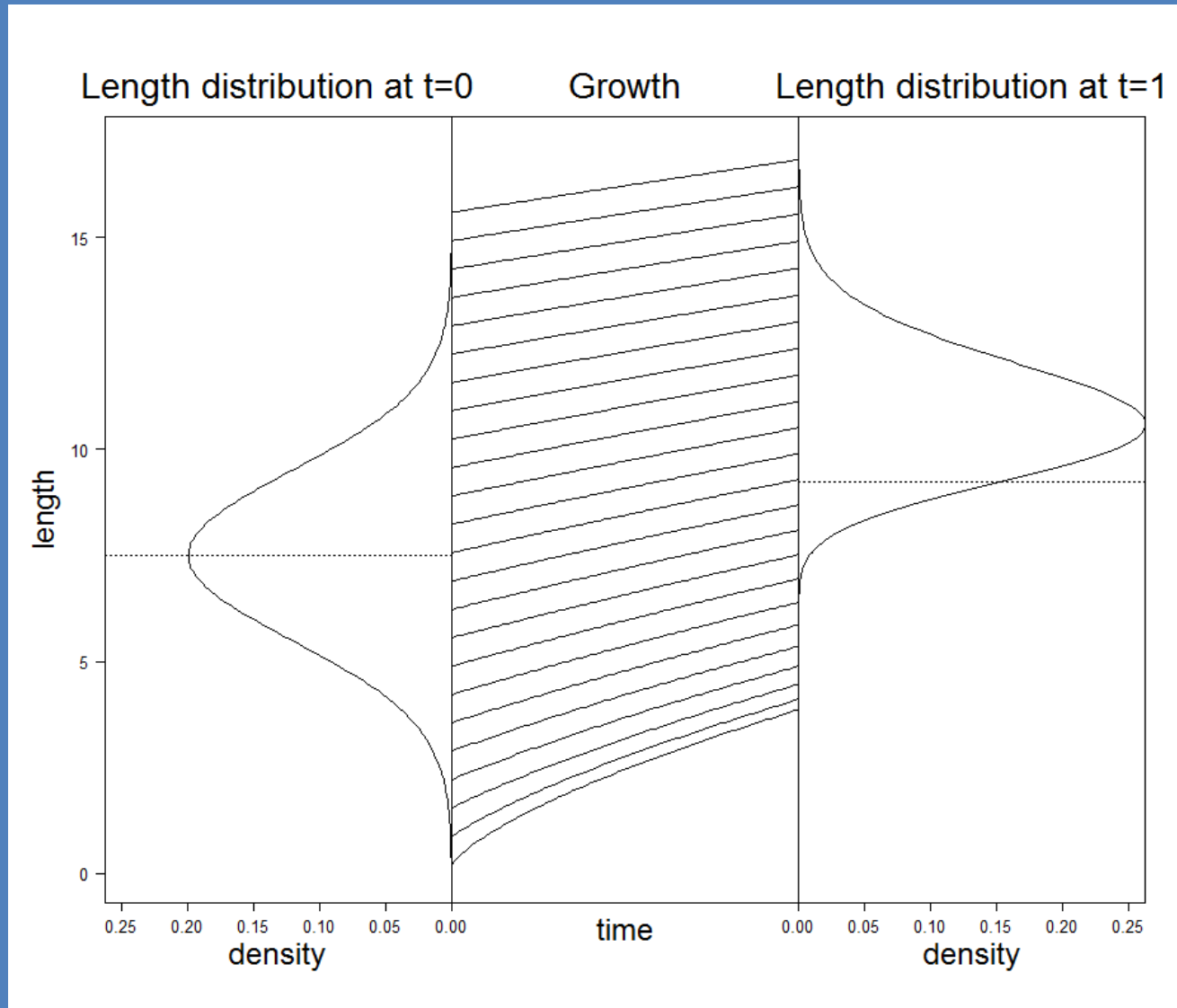
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# Example of Munch formulation



# Estimating params

- Measurements: time 0 &  $t$
- Algorithm
  - guess  $\theta$  (growth & mortality params)
  - construct bins for time 0
  - Repeat until MLE found
    - translate bins to time  $t$  using growth params
    - solve for MLE of nuisance parameters
    - compute likelihood
    - systematically explore parameter space