## Introduction To

## Mathematical Biology II

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## Mathematical Biology

- Ecology and Evolution
- Cell Biology
- Infectious Diseases
- Genomics and Computational Biology
- Neuroscience
- Physiology
- Developmental Biology (Morphogenesis, Cell Growth and Cellular Differentiation)
- etc


## Global Challenges: Complex, Multidisciplinary Questions

- Human population is swelling toward 10 billion. All these people need adequate food, clean water, housing, good health, a secure and pleasant environment. To stay within the planet's carrying capacity, we are going to have to be extraordinarily clever about how we use the Earth's resources.
- What are the impacts of our actions on the environment we depend on?
- How does the natural world function?
- How do we plan for the inevitable changes to come?


## Human Well-being and the Natural Environment

- A basic but challenging need is the ability to quantify how well the ecosystems we depend on are doing, so that we can determine whether they're getting better or worse.
- When we (mathematicians) examine ecosystem health, how do we define it?


## Ecosystem Health and Bio-diversity

- An ecosystem that is more diverse, is more robust and healthier - and the people who depend on it are less vulnerable.


## Examples:

1. Potato blight of Ireland in 1840s (Irish Potato Famine). A third of the population depend on 2 species of potato and both were susceptible to the disease. A million people starved.
2. Rice grassy stunt virus of Asia in 1970s. 6,000 species of rice and only one withstood the virus. By hybridizing that type of rice, rice cultivation could be saved.

## Questions

- What do we mean by biodiversity?
- How do we measure it? A first attempt is to simply use the number of species. More species imply greater diversity.
- How do you effectively count the number of species, particularly when comparing different ecosystems in which species may be easier or harder to find?
- How does the length of time you explore an ecosystem affect the number of species discovered?
- How does the number of species discovered in a day decrease or increase over time?


## Mathematical challenges in area of human-well-being and natural environment

- We need clear, mathematically precise criteria to measure biodiversity that are robust even given the difficulties of gathering data in sometimes harsh environments.
- We need models of animal migration that take climate change and other human disruptions into account. Network theory and others might offer an opportunity for developing richer models than existing ones.
- We need mathematical models that will describe how agriculture both affects and is affected by the availability and quality of fresh water.
- We need improved monitoring methods using statistics, machine learning and remote sensing to allow us to detect changes in the environment much more quickly.


## Managing Human-Environment Systems

Example: Fish don't stop at international boundaries. They swim where they will. This willfulness has created nasty problems for fishery managers (disputes between nations, broken
 agreements and collapse of fisheries). Some of these problems can be solved by mathematicians.

## Mathematical challenges in the area of managing human-environmental systems

- Management problems often involve finding the optimal solution to a set of mathematical equations. For example, we want to know how many fish we can catch per year to get maximum harvest over the long run, or how we minimize the spread of invasive species.
- Methods for finding the optimal solutions in systems with large variability are essential to solving these management problems.


## World's Fish Supply Running Out, Researchers Warn

(Journal of Science) by Juliet Eilperin Washington Post Writer, November 3, 2006

- Economists' and ecologists' warning: No more seafood as of 2048
- Based on 4-year study of
- Catch data
- Effects of fisheries collapses
- Causes
- Overfishing
- Pollution
- Other Environmental Causes
- Loss of Species affects oceans' ability
- Produce seafood
- Filter nutrients
- Resist the spread of disease
- Store $\mathrm{CO}_{2}$


## A Future Without Fish

A new study suggests that overfishing could lead to a catastrophic loss of marine species as soon as the middle of the century.

Percentage of species collapsed (defined as less than 10\% left)


## Overfishing Threatens Food Security

- Fish: A vital source of protein for billions
- Fish provide roughly 40 per cent of the protein consumed by nearly two-thirds of the world's population.
- For example, over a billion people throughout Asia depend on fish and seafood as their major source of animal protein. But, fish have moved into the luxurystyle, high-priced food class.
- The United Nations Educational, Scientific and Cultural Organization (UNESCO) warns that fish, long regarded as the "poor man's protein", is diminishing globally as a result of increasing market demand and overfishing.



## GLOBAL TRENDS IN THE STATE OF MARINE FISHERIES RESOURCES 1974-2004



## World marine catch (million tonnes) by major marine fisheries areas



## Rebuilding Depleted Fish Stocks (challenging necessity)

- Seven of the top ten marine fish species -- which together account for about 30 percent of all capture fisheries production -- are fully exploited or overexploited. This means that major increases in catches cannot be expected from them, and serious biological and economic drawbacks are likely if fishing capacity for these stocks is further increased.
- Regions with fish stocks in greatest need of recovery include the Northeast Atlantic, the Mediterranean Sea and the Black Sea, followed by the Northwest Atlantic, the Southeast Atlantic, the Southeast Pacific and the Southern Ocean.


## Emerging Ocean Diseases

Disease is increasing among most marine organisms (Ward and Lafferty, 2004).

Examples: Recent epizootics (epidemics in animals) of Atlantic Ocean bottlenose dolphins and endangered Florida manatees.

Contributing Factors include
-global warming
-habitat destruction
-human overfishing
-etc


## Overfishing Implicated in Sea Urchin Epidemics



- Sea urchin epidemics have risen over the last 30 years, and diseases have decimated urchin populations in many parts of the world.
- In the early 1980s, an epidemic killed more than 95 percent of the long-spined sea urchins (Diadema antillarum) in the Caribbean. After the urchins died, prevalence of seaweeds increased dramatically; today, many coral reefs there are dead.
- Biologists have suggested that overfishing urchin predators such as toadfish (Opsanus sp.) and queen triggerfish (Balistes vetula) may have played a role in this epidemic.


## Fish Population Models

- Stock-recruit relations have been used in fisheries modeling and management since the 1950's.
- At generation t ,
- $x(t)=$ Parents or spawner stock
- $x(t+1)=$ Offspring or


Stock recruits.

## Parametric Models

## Stock-Recruit Relationships

3. Deriso's Generalized Model $R=\alpha S(1-\beta \gamma S)^{1 / \gamma} \quad$| $R=$ recruitment |
| :--- |
| $S=$ spawner stock |
| $\alpha, \beta, \gamma=$ parameters |



## Modified Beverton-Holt Model



## Total Allowable Catch (TAC)

- Many fisheries are regulated using TAC.
- A TAC within a system of individual transferable quotas (ITQs) is currently used to manage the Alaskan halibut fishery.
- The Alaskan halibut is one of the few success stories in the book on US fisheries management. The TAC did a reasonable good job of preventing overfishing, but created another set of problems.
- Regulated open access: If TAC is imposed on a fishery where access to the resource is free or of minimal cost, fishers have an incentive to "race for the fish," trying to capture as large a share of the TAC for themselves before the cumulative harvest reaches the TAC and the season is ended.
- Regulated open access may result in a severely compressed fishing season where vast amounts of "fishing effort" are expended in a few day (halibut derby...Prior to 1995...one or two day season).
- fishers sit idle or re-gear and cause overfishing in other fisheries.


## Periodic Proportion Policy (PPP)

```
At start of year \(t\) :
    \(\boldsymbol{x}(\boldsymbol{t})=\) estimated fish stock (biomass)
    \(\mathrm{y}(\mathrm{t})=\) total allowable catch (TAC)
    \(\mathrm{y}(\mathrm{t})=\boldsymbol{a}(\boldsymbol{t}) \boldsymbol{x}(\boldsymbol{t}) \quad\) (PPP)
    \(\mathrm{a}(\mathrm{t})=\boldsymbol{G}(\boldsymbol{F}(\boldsymbol{t}), \boldsymbol{m})\)
    \(\mathrm{F}(\mathrm{t})=\) fishing mortality
    \(\mathrm{m}=\) natural mortality
Under Periodic (rotation) Fishing :
    Fishing mortality is periodic and \(\mathrm{F}(\mathrm{t}+\mathrm{p})=\mathrm{F}(\mathrm{t})\).
Therefore:
    \(\mathrm{a}(\mathrm{t}+\mathrm{p})=\mathrm{a}(\mathrm{t})\).
```


## Periodic Proportion Policy

- Under PPP, fishing mortality in a given area is varied periodically. Typically, the area is closed for a period of time, then fished, and then closed again. The openings of the different areas are timed so that at least one area is open to fishing each year.
- PPP is actually being used in the management of the Atlantic sea scallops, corals, sea urchins, etc.


## Pulse Rotation

The area is closed for ( $p-1$ ) years, then the area is pulse fished for one year, then closed again for additional ( $\mathrm{p}-1$ ) years, then pulse fished again for one year, etc.

## Symmetric Rotation

The area is closed for $p / 2$ years ( $p$ even) and then fished at a constant rate for the next $\mathrm{p} / 2$ years.

## Constant Proportion Policy (CPP)

- $y(t)=a x(t)$
- $a=G(F, m)$, where $F$ is constant.
- CPP is transparent, easy to implement and acceptable to fishers.


## Harvested Fish Stock Model

- Escapement

$$
S(t)=x(t)-y(t)=(1-a(t)) x(t)
$$

- Model

$$
\begin{aligned}
& x(t+1)=f(S(t))=(1-m) S(t)+S(t) g(S(t)) \\
& \text { or } \\
& x(t+1)=(1-a(t)) x(t)((1-m)+g((1-a(t)) x(t)))
\end{aligned}
$$

## CPP and Asymptotically Constant Population Dynamics

$$
f(x)=(1-a) x((1-m)+\boldsymbol{g}((1-a) x)),
$$

where

$$
g:[0, \infty) \rightarrow[0, \infty)
$$

is a strictly decreasing smooth function,

$$
\begin{gathered}
\text { and } \\
\boldsymbol{a}=\boldsymbol{G}(\boldsymbol{F}, \boldsymbol{m}) .
\end{gathered}
$$

## CPP \& Stock Steady State

If $a>\frac{g(0)-m}{1+g(0)-m}$,
then the stock size approaches zero for any initial stock level.

If $a<\frac{g(0)-m}{1+g(0)-m}$ and the dynamics is compensatory,
then the steady state biomass is the fixed point

$$
x^{\infty}=x^{\infty}(a)=\frac{1}{(1-\mathrm{a})} g^{-1}\left(\frac{1}{(1-\mathrm{a})}-(1-\mathrm{m})\right)
$$

## CPP \& Beverton-Holt Model

$$
f(x)=(1-a) x\left((1-m)+\frac{\alpha}{1+\beta(1-a) x}\right)
$$

where $1-m+\alpha>1$.

The stock is depleted when $a>\frac{\alpha-m}{1-m+\alpha}$.


The stock persists on a globally attracting fixed point at

$$
\begin{aligned}
& x^{\infty}=\frac{(1-a)(\alpha+1-m)-1}{\beta(1-a)(1-(1-a)(1-m))} \\
& \text { whenever } a<\frac{\alpha-m}{1-m+\alpha}
\end{aligned}
$$

Alaskan Halibut $\mathrm{m}=0.15$


## CPP \& Modified Beverton-Holt Model

$$
f(a, x)=(1-a) x\left((1-m)+\frac{\alpha(1-a) x}{1+\beta((1-a) x)^{2}}\right) \text { exhibits the fold bifurcation. }
$$

stable fixed point $\quad$| a harvesting |
| :--- |
| a |
| 0.3 |

A. -A. Yakubu, M. Li, J. Conrad and M. L. Zeeman, Mathematical Biosciences, 2011.

## CPP \& Ricker Model

- Ricker Model:

$$
\begin{aligned}
& x(t+1)=(1-a) x(t)\left(1-m+e^{r-(1-a) x(t)}\right), \\
& m=0.2 \text { (salmon) }
\end{aligned}
$$



## CPP \& Ricker Model



Under Ricker stock recruitment and CPP, the stock size decreases smoothly to zero with increasing levels of harvesting.
Period-doubling reversals L. Stone, Nature 1993.

## CPP \& Modified Ricker Model

$$
\begin{array}{|l|l|}
\hline \top \quad: \\
f(a, x)=(1-a) x\left(1-m+(1-a) x e^{r-(1-a) x}\right) \text { exhibits the fold bifurcation. } \\
\hline
\end{array}
$$


A. -A. Yakubu, M. Li, J. Conrad and M. L. Zeeman, Mathematical Biosciences, 2011.

## Periodic Proportion Policy (PPP)

We assume a $k$-periodic fishing mortality $(F(t+k)=F(t))$, so that

$$
f(t, x)=(1-a(t)) x((1-m)+g((1-a(t) x))
$$

where

$$
a(t+k)=a(t)
$$

## PPP \& Asymptotically Constant Dynamics

```
T :
For each j\in{0,1,2,\ldots,k-1}, let f}\mp@subsup{f}{j}{}(x)=(1-a(j))x((1-m)+g((1-a(j))x)
be an increasing concave down map under compensatory dynamics in (0,\infty),
where a(j+k)=a(j).
Then the stock population under period-k harvesting exhibits a globally
asymptotically stable r-cycle, where r divides k.
```

Proof :Use the general result of Elaydi-Sac ker (JDEA'05), a period-k extension of the result of Cushing-Henson (JDEA'01).

## PPP \& Beverton-Holt Model

$$
\begin{aligned}
& \text { C } \quad: \\
& \text { For each } j \in\{0,1,2, \ldots k-1\} \text {, let } \quad f_{j}(x)=(1-a(j)) x\left((1-m)+\frac{\alpha}{1+\beta(1-a(j)) x}\right), \\
& \text { where }(1-a(j))(1-m+\alpha)>1, \beta>0 \text { and } a(j+k)=a(j) . \\
& \text { Then, the stock population under period- } k \text { harvesting exhibits } a \\
& \text { globally asymptotically stable } k \text {-cycle. }
\end{aligned}
$$



PPP \& Modified Ricker Model


## Alaskan Halibut

## IPHC Regulatory Areas



## Halibut Data

| Year | $X_{t}$ | $Y_{t}$ | $E_{t}$ | Year | $X_{t}$ | $Y_{t}$ | $E_{t}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1975 | 90.989 | 10.6 | 192 | 1992 | 190.776 | 26.782 | 69.093 |
| 1976 | 89.339 | 11.044 | 154.848 | 1993 | 188.782 | 22.738 | 58.728 |
| 1977 | 89.484 | 8.641 | 141.639 | 1994 | 192.548 | 24.844 | 72.776 |
| 1978 | 96.987 | 10.295 | 132.051 | 1995 | 196.91 | 18.342 | 44.375 |
| 1979 | 106.831 | 11.335 | 131.86 | 1996 | 209.634 | 19.696 | 42.008 |
| 1980 | 116.954 | 11.966 | 101.441 | 1997 | 219.196 | 24.628 | 53.93 |
| 1981 | 129.693 | 14.225 | 100.211 | 1998 | 223.962 | 25.703 | 57.317 |
| 1982 | 142.881 | 13.53 | 79.529 | 1999 | 223.847 | 25.292 | 58.192 |
| 1983 | 159.637 | 14.112 | 58.629 | 2000 | 216.138 | 19.288 | 43.634 |
| 1984 | 173.717 | 19.971 | 37.729 | 2001 | 208.928 | 21.541 | 46.055 |
| 1985 | 184.207 | 20.852 | 40.54 | 2002 | 195.243 | 23.131 | 45.897 |
| 1986 | 194.695 | 32.79 | 66.398 | 2003 | 188.546 | 22.748 | 46.858 |
| 1987 | 194.991 | 31.316 | 65.258 | 2004 | 171.794 | 25.168 | 52.041 |
| 1988 | 198.127 | 37.862 | 78.25 | 2005 | 143.105 | 26.033 | 58.543 |
| 1989 | 193.12 | 33.734 | 77.341 | 2006 | 125.32 | 25.714 | 63.921 |
| 1990 | 189.684 | 28.848 | 84.873 | 2007 | 136.344 | 26.2 | 64.024 |
| 1991 | 189.582 | 22.926 | 75.455 | 2008 | - | - | - |

TABLE
Pacific Halibut Biomass ( $\times 10^{6}$ pounds) and Harvest ( $\times 10^{6}$ pounds) in Gulf of Alaska.

## Pacific Halibut



## Parameter Estimation

| Model | $\mathrm{g}(\mathrm{s})$ | Parameters | $\mathrm{c}^{2} \chi^{2}$ |
| :--- | :--- | :--- | :--- |
| 1. Beverton-Holt | $\frac{a}{1+\beta_{s}}$ | $\alpha=0.4455, \beta=3.240 \times 10^{-3}$ | 0.1203 |
| 2. Ricker | $\alpha e^{-\beta s}$ | $\alpha=0.4273, \beta=2.343 \times 10^{-3}$ | 0.1197 |
| 3. Modified Beverton-Holt | $\frac{a s}{1+\beta_{s} s^{2}}$ | $\alpha=7.474 \times 10^{-3}, \beta=1.180 \times 10^{-4}$ | 0.1158 |
| 4. Modified Ricker | $\alpha s e^{-\beta s}$ | $\alpha=9.504 \times 10^{-3}, \beta=1.013 \times 10^{-2}$ | 0.1152 |
| 5. Logistic | $r\left(1-\frac{s}{K}\right)$ | $r=0.4145, K=551.6$ | 0.1191 |

TABLE Parameter estimates for the Logistic, Beverton-Holt and Ricker models fit to stock $(x)$ and harvest rate (a) data for the Alaskan halibut Using AIC.

## "Fitted" Modified Ricker Model Vrs Halibut Data



## Halibut's Future \& Fishing Pressure



FIGURE 11: Modified Ricker model predictions of halibut stock size (in millions of pounds) after 2007 at the constant harvest values $a=0.1277,0.16,0.17$ and $a(t)=0.192$, where $\alpha=0.0102$ and $\beta=0.0104$ and intial population size $x(0) \equiv x(2007)$.

## Stochastic Model (Random Environment and Fisheries)

Let $\zeta(t) \sim U(1-\sigma, 1+\sigma)$ be a "mean - preserving spread" uniformly distributed random variable.
Stochastic Model:
$x(t+1)=(1-a(t)) x(t)((1-m)+\zeta(t) g((1-a(t)) x(t)))$

## Unstructured Populations in Random Environments

$x(t+1)=x(t) G(\zeta(t), x(t))$
where
$G(\zeta(t), x(t))=(1-a(t))(1-m+\zeta(t)) g((1-a(t)) x(t)))$

* Lewinton and Cohen (1969)
* Birkhoff Ergodic Theorem
* Chesson (1982), Ellner (1984), Hardin et al (1988) etc

Let $\gamma=\operatorname{Expected}\{\ln \mathrm{G}(\zeta(1), 0)\}$.
If $\gamma<0$ the population goes extinct with probability 1 .
If $\gamma>0$ the population has a low probability of reaching low abundances in the long-term.

## Stochastic Halibut Extinctions



FIGURE 12: Stochastic modified Ricker model predictions of halibut stock size (in millions of pounds) in 2100 at the constant harvest value $a=0.16$, for $\delta \in\{0.1,0.2,0.3,0.4\}$ where $\alpha=9.504 \times 10^{-3}$ and $\beta=1.013 \times 10^{-2}$.

## Cod Fishery

The Atlantic cod has, for many centuries, sustained major fisheries on both sides of the Atlantic.

However, the North
American fisheries have now largely collapsed.


## Georges Bank Atlantic Cod



## Cod Data From Georges Bank

| $X_{t}$ |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Year | $X_{t}$ | $h_{t}$ | Year | $X_{t}$ | $h_{t}$ |
| 1978 | 72148 | 0.18847 | 1994 | 21980 | 0.282701 |
| 1979 | 73793 | 0.149741 | 1995 | 17463 | 0.199275 |
| 1980 | 74082 | 0.219209 | 1996 | 18057 | 0.18781 |
| 1981 | 92912 | 0.176781 | 1997 | 22681 | 0.193574 |
| 1982 | 82323 | 0.282033 | 1998 | 20196 | 0.189526 |
| 1983 | 59073 | 0.34528 | 1999 | 25776 | 0.170108 |
| 1984 | 59920 | 0.206545 | 2000 | 23796 | 0.156601 |
| 1985 | 48789 | 0.338185 | 2001 | 19240 | 0.281787 |
| 1986 | 70638 | 0.147236 | 2002 | 16495 | 0.252869 |
| 1987 | 67462 | 0.19757 | 2003 | 12167 | 0.255417 |
| 1988 | 68702 | 0.231541 | 2004 | 21104 | 0.081034 |
| 1989 | 61191 | 0.208597 | 2005 | 18871 | 0.0873972 |
| 1990 | 49599 | 0.335648 | 2006 | 21241 | 0.0819517 |
| 1991 | 46266 | 0.295344 | 2007 | 22962 | 0.105181 |
| 1992 | 34877 | 0.331848 | 2008 | 21848 | unknown |
| 1993 | 28827 | 0.350394 | 2009 | - | - |
|  |  |  |  |  |  |

TABLE A3: intic cod biomass (in metric tons) and harvest rate in Georges Bank.

## Parameter Estimation

| Model | $\mathbf{g}(\mathbf{s})$ | Parameters | $\mathbf{c}^{2} \chi^{2}$ |
| :--- | :--- | :--- | :--- |
| 1. Beverton-Holt | $\frac{\alpha}{1+\beta s}$ | $\alpha=0.3949$ and $\beta=2.179 \times 10^{-6}$ | 1.00362 |
| 2. Ricker | $\alpha e^{-\beta s}$ | $\alpha=0.3940$ and $\beta=2.014 \times 10^{-6}$ | 1.00360 |
| 3. Modified Beverton-Holt | $\frac{\alpha s}{1+\beta s^{2}}$ | $\alpha=2.860 \times 10^{-5}$ and $\beta=1.141 \times 10^{-6}$ | 1.06790 |
| 4. Modified Ricker | $\alpha s e^{-\beta s}$ | $\alpha=3.597 \times 10^{-5}$ and $\beta=3.096 \times 10^{-6}$ | 1.0594 |
| 5. Logistic | $r\left(1-\frac{s}{K}\right)$ | $r=0.5999$ and $K=170014$ | 1.00356 |

TABLE Parameter estimates for the Logistics, Beverton-Holt and Ricker models fit to stock $(x)$ and harvest rate (a) data for Georges Bank Cod.

## "Fitted" Ricker Model Vrs Cod Data



## Cod's Future \& Fishing Pressure



FIGURE $\ldots$. The Ricker model predictions of cod stock size (in metric tons) after 2007 at the harvest values $a \in\{0.105,0.15,0.19,0.2106\}$, where $\alpha=3.94 \times 10^{-1}$ and

$$
\beta=2.014 \times 10^{-6} \text { and initial population size } x(0) \equiv x(2008) .
$$

## Stochastic Cod Extinctions






FIGURE
Stochastic Ricker model predictions of cod stock size (in metric tons) in 2100 at the constant harvest value $a=0.2106$, for $\delta \in\{0.1,0.2,0.3,0.4\}$ where

$$
\alpha=3.94 \times 10^{-1} \text { and } \beta=2.014 \times 10^{-6} .
$$

## Halibut and Cod Sustainability

- Under high fishing mortality, halibut is vulnerable to sudden population collapse while cod is vulnerable to a steady decline to zero.
- Under harvesting levels from the last 30 years, CPP did a reasonable job of preventing collapse of halibut, but left Atlantic cod at risk of collapse.
- Under increased uncertainty, such as more severe weather extremes as predicted by models of climate change, fisheries managed by CPP may be more susceptible to collapse.


## Per Capita Growth Rate <br> (Negative and Positive Density-Dependent Factors)

- Negative density-dependent factors
- Resource depletion due to competition
- Environment modification
- Mutual interference
- Cannibalism, etc
- Positive density-dependent factors
- Predator saturation
- Cooperative predation
- Increased availability of mates
- Conspecific enhancement of reproduction, etc


## Allee Effect

- An Allee effect occurs when the per-capita growth rate increases at low stock size.
- A strong Allee effect occurs when there is a positive equilibrium stock size A, the Allee threshold, such that the per-capita growth rate is less than one for lower densities (that is, $g(z)<1$ for $z<A)$ and is greater than one for some densities greater than $A$.


## Allee Effect In Harvested Fish Stock Model

```
x(t+1)=f(S(t))=(1-m)S(t)+S(t)g(S(t))I(S(t))
or
x(t+1)=(1-a(t))x(t)((1-m)+g((1-a(t))x(t))I((1-a(t))x(t))
```

S. J. Schreiber, Theor. Pop. Biol. 2003

## Predator Saturation Induced <br> Allee Effect

- The Allee effect is known to occur in populations that are subject to predation by a generalist predator with a saturating functional response.
- Many fish populations prey on cod larva and juvenile, but cod adults are so large that they have few predators; typically sharks only.
- Unlike cod, halibut is close to the top of the food chain of most marine ecosystems. In the northern Pacific, its known predators are the orca whale, sea lion and salmon shark.

$$
I(z)=e^{-\frac{\eta}{1+1}+z}
$$

Let
be the probability of escaping predation due to a predator with a saturating functional response, where the positive constant $\eta$ represents predation intensity and $\mu>0$ is the proportionality constant to the handling time.

## Mate Limitation Induced Allee Effect

- Another mechanism that can force an Allee effect to occur in populations is mating limitations.
- A field experiment of Levin et al. reported that 0\% of a small dispersed group of sea urchins Strongylocentrotus franciscanus were fertilized, while a fertilization rate of $82.2 \%$ was found in the center of a large aggregated group of sea urchins.

Let

$$
I(z)=\frac{\lambda z}{1+\lambda z}
$$

be the probability of finding a mate, where the positive constant $\lambda$ is the searching efficiency
of each fish.

## Double Allee Effects

- Two or more Allee effects are known to occur in fish populations. For example, in cod Gadus Morhua stock populations, indivduals in smallsized populations experience both reduced fertilization efficiency and reduced juvenile survival due to a cultivation effect.
L. Berec, E. Angulo and F. Courchamp, Trends in Ecology and Evolution, 2006


## Parameter Estimation

Table 1: Parameter estimates for the Beverton-Holt and Ricker models with and without the induced Allee effects fit to stock $(x)$ and harvest rate $(a)$ data for the Alaskan halibut Using AIC.

| Model | AIC $_{\chi^{2}}$ | Parameters |
| :--- | :--- | :--- |
| Beverton-Holt | 5.337 | $\alpha=0.4455, \beta=0.0032$ |
| Beverton-Holt - P | 9.3370 | $\alpha=0.465, \beta=0.0033, \eta=0.0031, \mu=0.0005$ |
| Beverton-Holt - M | 7.3149 | $\alpha=1.397, \beta=0.014, \lambda=0.014$ |
| Beverton-Holt - M \& P | 11.3149 | $\alpha=1.397, \beta=0.0144, \lambda=0.0143, \eta \approx 0, \mu=0.0148$ |
| Ricker | 5.330 | $\alpha=0.4274, \beta=0.0023$ |
| Ricker - P | 9.3300 | $\alpha=0.4273, \beta=0.0023, \eta=0.00087, \mu=0.0101$ |
| Ricker - M | 7.2804 | $\alpha=6.81, \beta=0.0089, \lambda=0.014$ |
| Ricker - M \& P | 11.2813 | $\alpha=2.28, \beta=0.0073, \lambda=0.0045, \eta=0.0053, \mu=0.092$ |

## Fitted Ricker Model Vrs Data



FIGURE
Best "fit" Ricker Model versus Pacific halibut data.

## Ricker Vrs Modified Ricker




## Fitted Ricker Model Predictions



Table Estimates of Lyapunov Exponents for $a=0.21$ and $a=0.24$.

| $\delta$ | $\gamma(\delta)$ when $\mathrm{a}=0.21$ | $\gamma(\delta)$ when $\mathrm{a}=0.24$ |
| :--- | :---: | :---: |
| 0.1 | 0.00895 | -0.0298 |
| 0.2 | 0.00883 | -0.0303 |
| 0.3 | 0.00727 | -0.0312 |
| 0.4 | 0.00715 | -0.0324 |

Figure : Ricker model predictions of halibut stock size (in millions of pounds) after 2007 at the constant harvest values $a=0.1277,0.192,0.21$ and 0.24 , where $\alpha=0.4274$ and $\beta=0.0023$ and intial population size $x(0) \equiv x(2007)$.

## Sea Scallop



- The Atlantic sea scallop resource is healthy and is harvested at sustainable levels.
- Fishing effort has been reduced in order to keep the sea scallop fishery sustainable.
- Areas where scallops can be harvested are rotated to maximize scallop yields and protect beds of young scallops as they grow.
- Scallops are a good low-fat source of protein and are high in selenium and B vitamins (USDA).
- The U.S. sea scallop fishery is extremely important to our economy and is the largest wild scallop fishery in the world.
- In 2009, U.S. fishermen harvested 58 million pounds of sea scallop meats worth over $\$ 382$ million.
- Massachusetts and New Jersey are responsible for the majority of the U.S. harvest


## Georges Bank \& Mid-Atlantic Scallop



Figure 5: Map of NEFSC sea scallop survey areas (yellow, with stratum boundaries shown) and the closed or rotational access areas (bounded by dark red lines).

## Sea Scallop Data

|  |  | Georges Bank |  |  | $\begin{aligned} & \text { Biomass } \\ & \text { (mr meats) } \end{aligned}$ | SE | Full F | MidArlantic |  |  | Biomass (nut meats) | SE | Full F | SE | Total <br> Abmdance (milions) | SE |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Year | Full F | SE | Abuniance (milhons) | SE |  |  |  | SE | Aburdiance (milions) | SE |  |  |  |  |  |  |
| 1975 | 0.11 | 0.02 | 1148 | 56 | 20780 | 1038 | 0.59 | 0.09 | 591 | 34 | 6503 | 386 | 0.21 | 0.09 | 1739 | 66 |
| 1976 | 0.20 | 0.04 | 1419 | 60 | 24705 | 1112 | 1.00 | 0.16 | 787 | 33 | 7931 | 491 | 0.38 | 0.16 | 2205 | 69 |
| 1977 | 0.33 | 0.05 | 1115 | 52 | 24522 | 1056 | 0.53 | 0.07 | 772 | 30 | 9933 | 487 | 0.39 | 0.23 | 1886 | 60 |
| 1978 | 0.39 | 0.06 | 1260 | 51 | 21973 | 920 | 1.05 | 0.15 | 567 | 21 | 9690 | 443 | 0.57 | 0.3 | 1827 | 55 |
| 1979 | 0.53 | 0.08 | 878 | 40 | 17822 | 762 | 1.07 | 0.20 | 364 | 15 | 7678 | 364 | 0.63 | 0.44 | 1242 | 43 |
| 1980 | 0.47 | 0.08 | 1060 | 43 | 14970 | 628 | 0.35 | 0.05 | 343 | 16 | 6365 | 347 | 0.44 | 0.34 | 1403 | 45 |
| 1981 | 0.62 | 0.09 | 747 | 34 | 12579 | 533 | 0.13 | 0.03 | 403 | 18 | 6754 | 364 | 0.48 | 0.44 | 1151 | 38 |
| 1982 | 0.83 | 0.13 | 808 | 35 | 9505 | 425 | 0.25 | 0.04 | 442 | 21 | 7401 | 386 | 0.58 | 0.46 | 1250 | 41 |
| 1983 | 0.71 | 0.11 | 573 | 30 | 7680 | 393 | 0.53 | 0.07 | 497 | 25 | 6987 | 417 | 0.64 | 0.41 | 1070 | 39 |
| 1984 | 0.42 | 0.08 | 565 | 34 | 7364 | 442 | 0.80 | 0.12 | 536 | 31 | 6062 | 459 | 0.58 | 0.25 | 1101 | 46 |
| 1985 | 0.51 | 0.10 | 610 | 42 | 7840 | 528 | 0.75 | 0.13 | 744 | 40 | 6346 | 506 | 0.61 | 0.3 | 1354 | 58 |
| 1986 | 0.88 | 0.21 | 984 | 60 | 8481 | 542 | 0.57 | 0.09 | 977 | 47 | 8704 | 556 | 0.72 | 0.41 | 1962 | 76 |
| 1987 | 0.76 | 016 | 1096 | 66 | 9988 | 596 | 1.20 | 0.17 | 1171 | 49 | 9340 | 585 | 0.96 | 0.43 | 2267 | 82 |
| 1988 | 0.83 | 0.18 | 1251 | 77 | 11321 | 686 | 0.90 | 0.12 |  | 49 | 10365 | 558 | 0.86 | 0.44 | 2399 | 91 |
| 1989 | 0.64 | 0.13 | 1415 | 81 | 13453 | 736 | 114 | 0.15 | 1147 | 42 | 9852 | 534 | 0.85 | 0.39 | 2562 | 91 |
| 1990 | 1.11 | 0.21 | 1369 | 74 | 12791 | 678 | 0.96 | 0.11 | 1018 | 36 | 9747 | 418 | 1.05 | 0.63 | 2387 | 82 |
| 1991 | 1.53 | 0.28 | 1486 | 68 | 10725 | 475 | 1.07 | 0.10 | 705 | 26 | 8026 | 327 | 1.32 | 0.8 | 2191 | 73 |
| 1992 | 1.72 | 0.25 | 783 | 36 | 7056 | 303 | 1.10 | 0.12 | 468 | 24 | 5426 | 298 | 1.47 | 1.01 | 1251 | 43 |
| 1993 | 1.19 | 0.21 | 553 | 32 | 4868 | 279 | 0.86 | 0.14 | 894 | 38 | 5634 | 319 | 1.05 | 0.66 | 1448 | 49 |
| 1994 | 0.31 | 0.07 | 531 | 36 | 5719 | 394 | 137 | 0.18 | 1137 | 40 | 8027 | 360 | 0.87 | 0.18 | 1668 | 53 |
| 1995 | 0.16 | 0.03 | 1003 | 48 | 9878 | 553 | 1.08 | 0.11 | 965 | 34 | 8785 | 361 | 0.62 | 0.1 | 1968 | 59 |
| 1996 | 0.33 | 0.07 | 1201 | 53 | 15406 | 727 | 0.74 | 0.08 | 647 | 31 | 8167 | 411 | 0.53 | 0.18 | 1849 | 62 |
| 1997 | 0.28 | 0.07 | 1305 | 62 | 20141 | 885 | 0.47 | 0.06 | 690 | 44 | 7850 | 528 | 0.35 | 0.18 | 1995 | 76 |
| 1998 | 0.22 | 0.06 | 1924 | 82 | 27276 | 1022 | 0.53 | 0.10 | 1695 | 82 | 11858 | 716 | 0.31 | 0.16 | 3619 | 116 |
| 1999 | 0.54 | 0.13 | 2008 | 87 | 33163 | 1211 | 0.49 | 0.09 | 2872 | 106 | 23689 | 1043 | 0.51 | 0.23 | 4881 | 137 |
| 2000 | 0.48 | 0.12 | 3129 | 99 | 41066 | 1410 | 0.48 | 0.08 | 3523 | 112 | 37324 | 1326 | 0.48 | 0.14 | 6652 | 149 |
| 2001 | 0.26 | 0.05 | 3294 | 95 | 53064 | 1704 | 0.54 | 0.07 | 3766 | 107 | 45795 | 1433 | 0.43 | 0.11 | 7061 | 143 |
| 2002 | 0.23 | 0.05 | 2819 | 88 | 62370 | 1994 | 0.61 | 0.08 | 3427 | 100 | 48798 | 1449 | 0.41 | 0.12 | 6246 | 133 |
| 2003 | 0.17 | 0.04 | 2945 | 96 | 69416 | 2294 | 0.68 | 0.08 | 4174 | 115 | 48756 | 1397 | 0.42 | 0.1 | 7119 | 150 |
| 2004 | 0.10 | 0.02 | 2708 | 96 | 74629 | 2603 | 0.87 | 0.09 | 3703 | 112 | 50029 | 1468 | 0.38 | 0.07 | 6411 | 147 |
| 2005 | 0.18 | 0.03 | 2571 | 103 | 73828 | 2862 | 0.84 | 0.14 | 3609 | 131 | 49027 | 1728 | 0.37 | 0.13 | 6180 | 167 |
| 2006 | 0.38 | 0.06 | 2128 | 108 | 62768 | 3090 | 035 | 0.06 | 3805 | 166 | 56405 | 2377 | 0.37 | 0.23 | 5933 | 198 |
| 2007 | 0.25 | 0.05 | 2364 | 151 | 53650 | 3472 | 0.55 | 0.09 | 3853 | 209 | 61784 | 3260 | 0.40 | 0.14 | 6217 | 258 |
| 2008 | 0.19 | 0.04 | 2769 | 204 | 55508 | 4234 | 0.54 | 0.10 | 4509 | 313 | 63983 | 4518 | 0.37 | 0.11 | 7278 | 374 |
| 2009 | 0.18 | 0.05 | 3453 | 294 | 62470 | 5341 | 0.60 | 0.13 | 3993 | 352 | 67233 | 6460 | 0.38 | 0.11 | 7446 | 458 |

Figure CASA model estimates and standard errors for fully recruited sea scallop fishing mortality, July 1 abundance $40+\mathrm{mm}$ SH, and July 1 biomass $40+\mathrm{mm} \mathrm{SH}$.

## Parameter Estimation

Table Parameter estimates Geroges Bank sea scallop with 4-patch model.

| Model | $c^{2} \chi^{2}$ | AIC | Parameters |
| :--- | :--- | :--- | :--- |
| Beverton-Holt | 1.9026 | 769.7 | $\alpha=5.64, \beta=0.0425$ |
| Beverton-Holt -M | 1.9026 | 771.7 | $\alpha=5.64, \beta=0.0425, \lambda=1.34 \times 10^{10}$ |
| Beverton-Holt -P | 1.8643 | 758.3 | $\alpha=326.3, \beta=0.318, \eta=2.39, \mu=0.00052$ |
| Beverton-Holt P\&M | 1.8721 | 763.4 | $\alpha=37.6, \beta=0.115, \lambda=1.37, \eta=1.16, \mu=0.00095$ |
| Ricker | 2.2032 | 890.7 | $\alpha=1.56, \beta=0.00409$ |
| Ricker -M | 2.2032 | 892.7 | $\alpha=1.56, \beta=0.00409, \lambda=1.28 \times 10^{8}$ |
| Ricker -P | 2.2032 | 894.7 | $\alpha=1.56, \beta=0.00409, \eta=0.00015, \mu=0.00109$ |
| Ricker P\&M | 2.2040 | 897.0 | $\alpha=5.5, \beta=0.0041, \lambda=1.26, \eta=5.93 \times 10^{-6}, \mu=10.97$ |

Table Parameter estimates Geroges Bank sea scallop with 6-patch model.

| Model | $c^{2} \chi^{2}$ | AIC | Parameters |
| :--- | :--- | :--- | :--- |
| Beverton-Holt | 1.9026 | 769.7 | $\alpha=5.64, \beta=0.0638$ |
| Beverton-Holt -M | 1.9026 | 769.7 | $\alpha=5.64, \beta=0.064, \lambda=3.34 \times 10^{9}$ |
| Beverton-Holt -P | 1.8635 | 758.0 | $\alpha=2415, \beta=1.011, \eta=3.659, \mu=0.000495$ |
| Beverton-Holt P\&M | 1.873 | 761.0 | $\alpha=174.3, \beta=1.339, \lambda=13.94, \eta=0.826, \mu=0.0004795$ |
| Ricker | 2.2032 | 890.7 | $\alpha=1.56, \beta=0.00613$ |
| Ricker -M | 2.2032 | 892.7 | $\alpha=1.56, \beta=0.00613, \lambda=1.28 \times 10^{8}$ |
| Ricker -P | 2.2032 | 894.7 | $\alpha=1.56, \beta=0.00613, \eta=0.000096, \mu=0.00077$ |
| Ricker P\&M | - | - | $\alpha=-, \beta=-, \lambda=-, \eta=-, \mu=-$ |

## Pulse Versus Symmetric Rotations






## Conclusion

- Under harvesting levels from the last 30 years, the CPP did a reasonable job of preventing the collapse of the halibut, but left the Atlantic cod at risk of collapse. Using Lyapunov exponents, we obtain that under increased uncertainty, such as more severe weather extremes as predicted by models of global climate change, fisheries managed using CPP may be more susceptible to collapse.
- At high fishing mortalities, pulse PPP leads to both highest sea scallop yield and sea scallop steady state biomass.
- At low fishing mortalities, CPP can lead to highest scallop yield with lowest steady state biomass.


## Acknowledgements

- MBI
- Nianpeng Li, Howard University
- Shari Wiley, Howard University
- Jon Conrad, Cornell University
- Mary Lou Zeeman, Bowdoin College
- Michael Fogarty, NEFSC, Woods Hole
- NSF Funded Project on Computational Sustainability


## Thank You!



