Simulation and R

Fish 559; Lecture 12



Problem Statement-I

- Compare alternative harvest strategies using simulation.
- The true dynamics are governed by the Pella-Tomlinson model, the parameters of which are uncertain.
- The output statistic of interest is the percentage increase in the time to recover to 80% of the carrying capacity under a harvest compared to under no harvest, i.e: starting sims in year 15:

$$V = 100 \sum_{i} L_{i} \frac{Y_{i}^{h} - Y_{i}^{0}}{Y_{i}^{0} - 15} / \sum_{j} L_{j}$$

 Y_i^0 – time to recover to 0.8K in the absence of exploitation (simulation i);

 Y_i^h – time to recover to 0.8K for harvest strategy h (simulation i); and L_i – likelihood for simulation i.

Problem Statement-II N_MPL



The true dynamics of the population are governed by: z=1 is a Schaeffer model. z can change shape of production fxn.

0.6 for Nmsy/K is magic # for cetaceans. The MSY/Nmsy is production and is very low. You shouldn't have more priors than params

 N_t – population size at the start of year t;

r –intrinsic rate of growth;

K – carrying capacity;

$$N_{t+1} = N_t + rN_t(1 - (N_t / K)^z) - C_t$$

z – degree of compensation; and

 C_t – catch during yeart.

$$K \sim U[1000, 2000];$$
 $N_1 = N(500, 50^2)$
 $N_{MSY} / K \sim U[0.5, 0.7];$ $MSY / N_{MSY} \sim U[0.01, 0.05]$



Problem Statement-III

- The harvest strategies:
 - Constant catch of 1 animal each year
 - Catch of 1 then 2 animals each year
 - Catch of 1 animal for ten years then 2 thereafter.
 - Use of the PBR (potential biological removal) catch control rule.
- The catch for years 1 to 15 (when the harvest strategies are first applied) is assumed to be 1 animal and the projections are continued for 100 years.



The PBR-I

- The basic formulation:
- N_{MIN} Minimum population estimate. Uncertainty adjusted population estimate
- R_{MAX} Maximum theoretical (or estimated) net productivity rate.
- F_R A recovery factor (between 0.1 and 1). "fiddle factor".
 Without F_r this is the F_msy under a Schaeffer model)
- If N > N_msy & < K is OSP Optimum Sustained Population</p>



The PBR-II

• N_{MIN} – accounts for imprecision in abundance estimation (the lower 20^{th} percentile of the estimate).

$$N_{\min} = \hat{N} \exp(-0.84 \, CV_N)$$

- V_2R_{MAX} an approximation to the harvest rate at N_{MSY} (assumed to be 0.01, i.e. R_{MAX} =0.02)
- F_R addresses factors such as biases when estimating abundance (assumed to be 0.5).



The PBR-III

It is necessary to generate future survey estimates to apply the PBR. We assume that survey estimates of abundance are available every 5th year (starting in year 1) with a CV of 0.2, i.e.:

$$\hat{N}_y = N_y \exp(\varepsilon_y);$$
 $\varepsilon_y \sim N(0; 0.2^2)$

The PBR catch limit for year y is "carried over" to year y+1 if there is no abundance estimate for year y+1.



Problem Statement-IV

Information is available on the population size at the start of year 15 in the form of a normally distributed estimate with a mean of 625 (s.d. 75).

Notes:

- This is essentially a Bayesian problem because we have a model and a set of priors and some data which will update these priors.
- We are interested in the posteriors for the parameters and for the increase in the time to recover to 80% of the carrying capacity under a harvest compared to under no harvest.



Parameterization of The Model-I

Distributions are placed on N_{MSY}/K and MSY/N_{MSY} . It is therefore necessary to convert from N_{MSY}/K and MSY/N_{MSY} to r and z.

The relationship between catch and population in equilibrium is given by $C = rN(1 - (N/K)^z)$

i.e.:
$$MSY = r N_{MSY} (1 - (N_{MSY} / K)^{z})$$

Differentiating with respect to N gives:

$$\frac{dC}{dN}\Big|_{N=N_{MSY}} = r(1-(z+1)(N_{MSY}/K)^z)$$
 We solve this using uniroot



Parameterization of The Model-II

The process of setting up a simulation is therefore:

- 1. Generate the parameters from their prior distributions.
- 2. Compute r and z from the equations that relate them to N_{MSY} / K and MSY / N_{MSY} .
- 3. Project the model from year 1 to year 15 under a catch of 1 animal.
- 4. Calculate the likelihood of the current set of parameters and find the normalized likelihood.

$$L_i = C \exp\left(-\frac{(N_{15,i} - 625)^2}{2(75)^2}\right)$$



Solution-I

- Setting up the simulation:
 - generate values for the parameters from their priors;
 - compute the values for r and z,
 - project ahead 15 years under zero harvest; and
 - compute the normalized likelihood
- We will make this code fairly generic.



Solution-II

- Projecting the strategies ahead 100 years:
 - project from year -14 to year 1 under a harvest of 1 animal each year;
 - project from year 1 to year 101 under the prespecified harvest strategy;
 - identify the year in which the population (first) reaches 0.8 K and store it; and
 - for the PBR harvest strategy it is necessary to generate future survey estimates of abundance (years 1, 6, ..).
- Compute the change in the time to recovery.

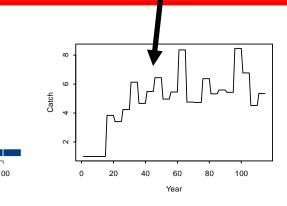


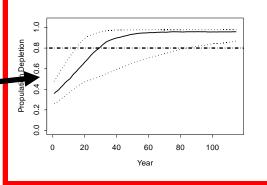
Solution III



5th, median and 95th percentiles of population size







Recovery Year



Extensions

- Compute a distribution for the ratio of the recovery time with a harvest to that without a harvest.
- See how the output statistics change with increased numbers of simulations.
- Plot the posteriors for the model parameters (and the corresponding priors).
- What happens when you change the CV