Developing and running data-limited MSEs using FLR

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FLR, Fisheries Library in R

A collection of packages in the R statistical language providing a domain-specific programming language for quantitative fisheries science.

Goals

- 1. Provide tools for effective and reliable implementation of simulation models of the fishery system.
- 2. Encourage the use of Management Strategy Evaluation for designing robust fisheries management plans.
- 3. Facilitate the exchange of ideas and algorithms through the establishment of a *lingua franca* for quantitative fisheries science.
- 4. To do so under the Free/Open Source ethos of transparency, reproducibility and free exchange of ideas and algorithms.



Computational platform



C++
using std::cpp;

CppAD



HPC

■ From CPU cores to HPC clusters





Design principles

- Object-oriented S4 classes for system elements
 - Same methods work on multiple classes, e.g. plot vs. plotObjectType
- Modularity
 - MP as a series of modules to be called sequentially
- Flexibility and extendability
 - Write your own MP modules (e.g. HCR, indicator)
- Limited use of default values
 - Choices to be explicit in code
- Adherence to R language conventions
 - e.g. formulas



MSE steps in FLR syntax

1. Identify objectives and performance statistics

```
stats <- list(FMSY=list(~yearMeans(F/FMSY), name="F/F[MSY]"
performance(run, statistics, years=2030:2039)</pre>
```

- 2. Specify uncertainties and operating models
- Life history + priors
- 3. Identify and define management procedures

```
mpcontrol <- mpCtrl(list(
   est = mseCtrl(method=sam.sa),
   hcr = mseCtrl(method=hockeystick.hcr,
        args=list(lim=3e5, trigger=4e5, target=0.25))))</pre>
```



MSE steps in FLR syntax

4. Simulate application of management procedure

```
run <- mp(om, oem=oem, ctrl=control, args=list(iy=2017))</pre>
```

5. Tune management procedure to objective(s)

```
tuned <- tunebisect(om, oem=oem, control=control,
  args=mseargs, statistic=statistics["green"],
  years=2030:2039, tune=list(target=c(0.1, 0.5)), prob=0.5)</pre>
```

6. Present results

```
plotBPs(tuned, statistics)
```



Running an MSE

```
# LOAD om, oem
data(ple4om)
# DEFINE MP
control <- mpCtrl(list(</pre>
  est = mseCtrl(method=perfect.sa),
  hcr = mseCtrl(method=hockeystick.hcr,
    args=list(lim=3e5, trigger=4e5, target=0.25))))
# R.UN
run <- mp(om, oem=oem, ctrl=control, args=list(iy=2017))
run3 <- mp(om, oem=oem, ctrl=control, args=list(iy=2017, fr
```





Running an MSE



Presenting results

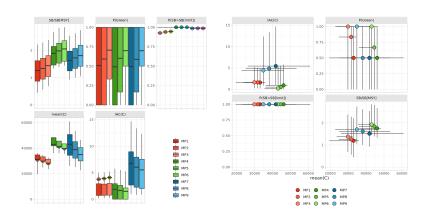
```
# COMPUTE performance statistics
perf <- performance(run3,
    statistics=statistics[c('FMSY', 'BMSY')])

# PLOT performance
plotBPs(perf)

# PLOT trade-offs
plotTOs(perf)</pre>
```



Presenting results





Operating Model

FLom class

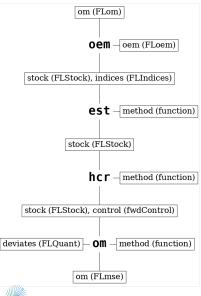
- Stock
 - N-at-age, weight-at-age, maturity, fecundity, SRR
- Fishery or fisheries
 - · Landings and discards, selectivities, prices
- Reference points

FLoem class

- Observations: stock, indices.
- Deviances: catch,



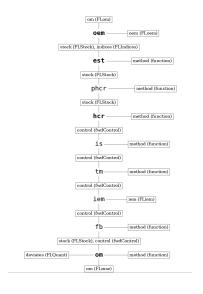
MSE basic modules







MSE modules







Length-based indicators

- Length-based indicators len.ind
 - observation (catch-at-age), Von Bertalanffy model
 - indicator
 - number of years, CV ALK

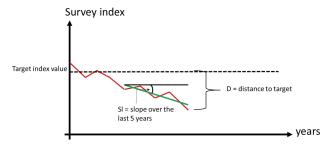
LBIs

- Length at 50% of modal abundance, *Lc*
- Mean length, *Lbar*
- Mean length of individuals, *Lmean*
- Mean length of largest 5%, Lmax5%



CPUE / survey trends

- CPUE trends cpue.ind + cpue.hcr
 - observation (index)
 - number of years





OM conditioning

Life-history

- Correlations among life history traits: Linf to OM
- Add data to substitute correlations
- Uncertainties and priors defined for any value

Feasible trajectories

- Priors for steepness (h), carrying capacity (K) and initial depletion (d).
- Simulate initial population, project for catch or survey/CPUE biomass.
- Accept trajectories based on catch, cohort and SSB trends.

ABC

- Approximate Bayesian Computation
- Distance metrics for any data source (catch, lengths, CPUE, effort)







Evaluation of the skill of length-based indicators to identify stock status and trends

Laurence T. Kell 61,*, Cóilín Minto 62 and Hans D. Gerritsen3

https://doi.org/10.1093/icesjms/fsac043





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Relevant examples



TENTH WORKSHOP ON THE DEVELOPMENT OF QUANTITATIVE ASSESSMENT METHODOLOGIES BASED ON LIFE-HISTORY TRAITS, EXPLOITATION CHARACTERISTICS, AND OTHER RELEVANT PARAMETERS FOR DATA-LIMITED STOCKS (WKLIFE X) VOLUME 2 | ISSUE 98

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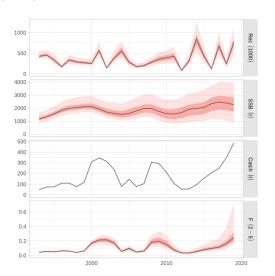


Example: MPs for stocks in the IJsselmeer, NL

- Stocks of pikeperch, perch, bream and roach.
- Data: total catch, catch at length, survey.
- Issues: short time series, data uncertainty.
- MPs
 - LBSPR + hockey-stick 40/10 HCR
 - Survey biomass + trend HCR
 - Mean length in catch + 40/10 HCR
- MP considers bird food needs.
- Tuning for 60% FMSY or 5% Blim.

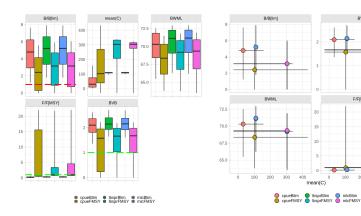


IJsselmeer pikeperch OM





IJsselmeer pikeperch MP performance



BVB

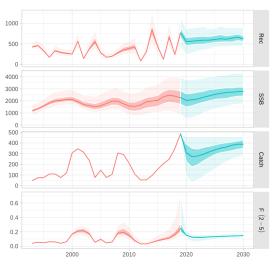
F/F[MSY]

100 200 300 400





IJsselmeer pikeperch value of information

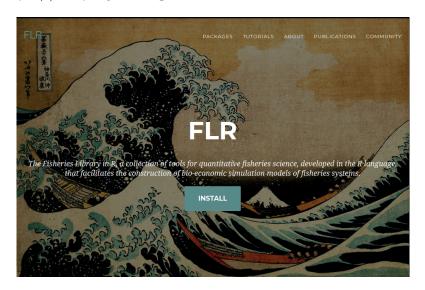








https://flr-project.org





https://flr-project.org/doc

FLR Home Intro • Input • Modeling • Advice • MSE • FLBEIA • Plotting • Internals •

FLR Tutorials

Introduction

- A quick introduction to FLR
- . An overview of the FLCore classes

Input

Loading your data into FLR

Fisheries Modelling

- Modelling stock recruitment with FLSR
- Using information on Life History relationships
 Statistical catch at age models in FLa4a
- Modelling growth and its uncertainty in FLa4:
- Natural mortality modelling in FLa4a
- . Stock assessment using eXtended Survivors Analysis with FLXSA
- Modelling Life History Relationships

Management Advice

- Running Medium Term Forecasts with FLash
- Short Term Forecasting for advice using FLash
- Forecasting on the Medium Term for advice using FLasher
 Reference points for fisheries management with FLBRP

Management Strategy Evaluation

. An introduction to MSE using FLR

Management Strategy Evaluation using FLBEIA

- Conditioning FLBEIA using Smart Conditioning Functions
- A simple example on how to use FLBEIA
- · A simple example with multiple dimensions in FLBEIA
- Using Stock Assessment models in the Managemnt procedure of FLBEIA
- Testing different Management Strategies in FLBEIA
- Data Limited MSE in FLBEIA

Visualization

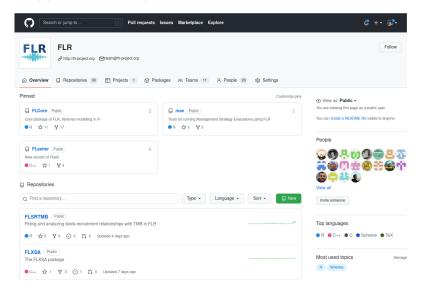
- ggplotFL plotting FLR objects with ggplot2
- Plotting FLR objects using lattice

Internals





https://github.com/flr

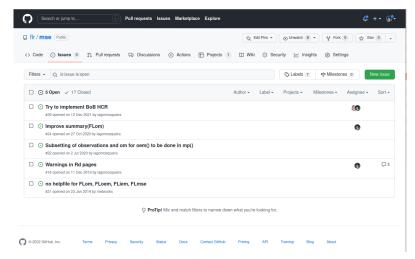






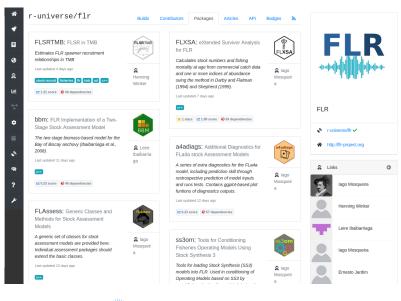
Github issues

■ To report bugs, share ideas, ask questions





r-universe.org/flr







To explore the potential of nature to improve the quality of life

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