FLash:::fwd for stock projection Laurence Kell August 13th, 2014

Introduction

THE PRECAUTIONARY APPROACH[^books\_be] requires harvest control rules (HCRs) to trigger pre-agreed conservation and management action. This requires limit reference points to set boundaries that constrain harvesting within safe biological limits within which stocks can produce the maximum sustainable yield (MSY) and targets to ensure that management objectives are met.

The performance of HCRs, i.e. how well they meet management objectives should be evaluated, ideally using Management Strategy Evaluation (MSE) where the HCRs is tested as part of a Management Procedure (MP). Where an MP is the combination of the data collection regime stock assessment procedure and the setting of management regulations. HCRs can be modelled using the fwd method of FLR; see the MSE document for examples of simulation testing.

Simulating the evolution of a stock or population (i.e. a projection) may be required after an assessment for a range of catches to allow managers to decide upon a TAC or within an MSE for a management measure set by an MP.

fwd takes objects descibing historical stock status and assumptions about future dynamics(e.g. growth, maturity, natural mortality and recruitment dynamics), then performs a projection for future options e.g. for catches, fishing mortality.

#### Introduction

### library(FLCore)

```
## Loading required package: grid
## Loading required package: lattice
## Loading required package: MASS
## FLCore (Version 2.5.20140919, packaged: 2014-09-19 13:22:54 UTC)
##
## Attaching package: 'FLCore'
##
## The following objects are masked from 'package:base':
##
## cbind, rbind
```

```
library(FLash)
library(FLBRP)
## Loading required package: ggplotFL
## Loading required package: ggplot2
##
## Attaching package: 'ggplot2'
##
## The following object is masked from 'package:FLCore':
##
##
       %+%
##
## Loading required package: gridExtra
## Loading required package: reshape2
## Loading required package: plyr
##
## Attaching package: 'plyr'
##
## The following object is masked from 'package:FLCore':
##
##
       desc
library(ggplotFL)
```

fwd is used to make future projections, e.g. to evaluate different management options such as Total Allowable Catches (TACs) once a stock assessment has been conducted or for simulating a Harvest Control Rule (HCR) as part of a Management Strategy Evaluation (MSE).

In this examples we use the ple4 FLSock object

### data(ple4)

# *The future*

To perform a projection requires assumptions about future processes such as growth and recruitment and the effect of management on selectivity.

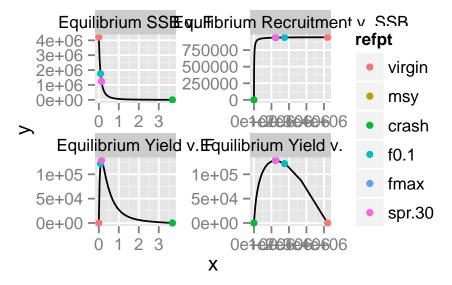
Recruit is based on a stock recruitment relationship, which can be fitted to the historic time series

```
#### SRR
sr = as.FLSR(ple4, model = "bevholt")
sr = fmle(sr, control = list(silent = TRUE))
## Warning: unknown names in control: silent
```

While future growth and selectivity is often assummed to be an average of recent values. In which case these can be estimated using FLBRP. An advantage of using FLBRP is then the projections and reference points will be consistent.

```
#### BRPs
eql = FLBRP(ple4, sr = sr)
computeRefpts(eql)
## An object of class "FLPar"
##
           quantity
## refpt
            harvest
                        yield
                                   rec
     virgin 0.0000e+00 0.0000e+00 9.4337e+05
##
##
            1.3378e-01 1.2850e+05 9.3821e+05
##
     crash 3.6812e+00 1.7711e-06 3.7194e-04
     f0.1
            8.7602e-02 1.2185e+05 9.4036e+05
##
##
     fmax
            1.3538e-01 1.2849e+05 9.3813e+05
     spr.30 1.3157e-01 1.2848e+05 9.3832e+05
##
##
     mey
                    NA
                                NA
                                           NA
##
           quantity
                        biomass
## refpt
            ssb
                                   revenue
     virgin 4.2043e+06 4.3812e+06
                                           NA
##
            1.2351e+06 1.3923e+06
                                            NA
##
     msy
##
     crash 3.7903e-06 2.6298e-05
                                           NA
     f0.1
            1.7536e+06 1.9172e+06
##
                                            NA
##
     fmax
            1.2213e+06 1.3782e+06
                                           NA
     spr.30 1.2546e+06 1.4120e+06
                                           NA
##
##
     mey
                    NA
                                            NA
##
           quantity
## refpt
            cost
                        profit
##
     virgin
                    NA
                                NA
##
     msy
                    NA
                                NA
##
     crash
                    NA
                                NA
     f0.1
##
                    NA
                                NA
##
     fmax
                    NA
                                NA
##
     spr.30
                    NA
                                NA
##
                    NA
                                NA
     mey
## units: NA
eql = brp(eql)
plot(eql)
## Warning: using a local copy of '[[' which will be removed in later versions of FLCore
## Warning: using a local copy of '[[' which will be removed in later versions of FLCore
## Warning: using a local copy of '[[' which will be removed in later versions of FLCore
```

```
## Warning: using a local copy of '[[' which will be removed in later versions of FLCore
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## Warning: using a local copy of '[[' which will be removed in later versions of FLCore
## Warning: using a local copy of '[[' which will be removed in later versions of FLCore
## Warning: using a local copy of '[[' which will be removed in later versions of FLCore
```

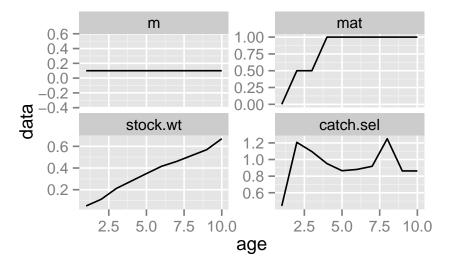


Expected parameters in the future

```
ggplot(FLQuants(eql, "m", "mat", "stock.wt", "catch.sel")) +
    geom_line(aes(age, data)) + facet_wrap(~qname,
    scale = "free_y")
```

Setting up the projection years can then be done by extending an FLStock uisng fwdWindow and passing the FLBRP object

```
stk = fwdWindow(ple4, end = 2020, eql)
## Warning: using a local copy of '[[<-' which
## will be removed in later versions of FLCore
unlist(dims(stk))
##
       quant
                    age
                               min
                                          max
                   "10"
                               "1"
                                         "10"
##
        "age"
##
        year
                minyear
                           maxyear plusgroup
##
        "64"
                 "1957"
                            "2020"
                                         "10"
##
        unit
                 season
                              area
                                         iter
         "1"
                     "1"
                               "1"
                                          "1"
##
```



# **Projections**

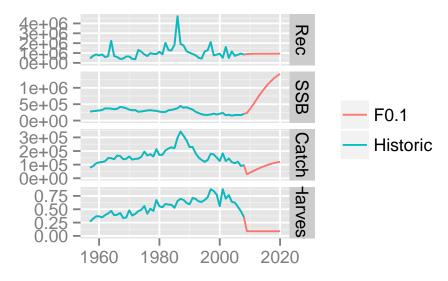
We first show how simple projections (e.g. for F and catch) can be performed. Later we show how a variety of HCRs can be simulated. Simulate fishing at  $F_{0.1}$ , first create an FLQuant with the target Fs

```
F0.1 = FLQuant(refpts(eql)["f0.1", "harvest",
    drop = T], dimnames = list(year = 2009:2020))
```

Then project forward, note that sr is also required

```
stk = fwd(stk, f = F0.1, sr = sr)
```

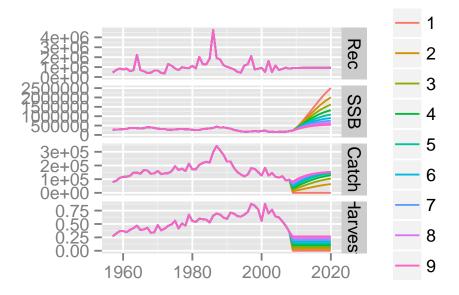
plot(FLStocks(Historic = ple4, F0.1 = stk))



It is possible to project for different Fs i.e. alternative reference points

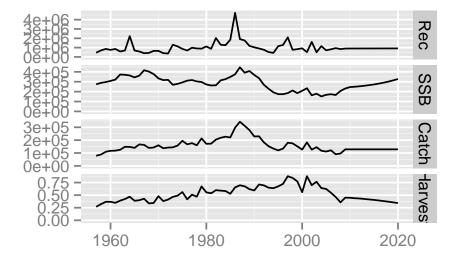
```
library(plyr)
```

```
dimnames(refpts(eql))$refpt
## [1] "virgin" "msy"
                          "crash" "f0.1"
                "spr.30" "mey"
## [5] "fmax"
refs = refpts(eql)[c("msy", "f0.1", "fmax", "spr.30"),
    "harvest", drop = T]
targetF = FLQuants(mlply(data.frame(refs), function(refs) FLQuant(refs,
    dimnames = list(year = 2009:2020))))
names(targetF) = names(refs)
names(targetF)[] = "f"
stks = fwd(stk, targetF, sr = sr)
plot(stks)
                                                  Rec
1e+06 -
5e+05
0e + 00
3e+05
2e+05
1e+05
0e+00
                                                  Catch
                                                  Harves
          1960
                      1980
                                 2000
                                             2020
  or different multipliers of F_{MSY}
msyTargets = FLQuants(mlply(seq(0, 2, 0.25), function(x) FLQuant(x *
    refs["msy"], dimnames = list(year = 2009:2020))))
names(msyTargets)[] = "f"
stks = fwd(stk, msyTargets, sr = sr)
plot(stks)
```



Catch projections are done in a similar way e.g. for MSY

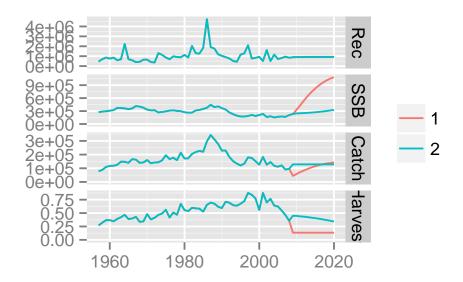
```
refpts(eql)["msy"]
## An object of class "FLPar"
##
        quantity
## refpt harvest
                    yield
                                rec
     msy 1.3378e-01 1.2850e+05 9.3821e+05
##
##
        quantity
## refpt ssb
                    biomass
                                revenue
##
     msy 1.2351e+06 1.3923e+06
                                        NA
##
        quantity
## refpt cost
                    profit
##
                 NA
                            NA
     msy
## units: NA
refpts(eql)["msy", c("harvest", "yield")]
## An object of class "FLPar"
##
        quantity
## refpt harvest
                    yield
     msy 1.3378e-01 1.2850e+05
## units: NA
msy = FLQuant(c(refpts(eql)["msy", "yield"]),
    dimnames = list(year = 2009:2020))
stks = fwd(stk, catch = msy, sr = sr)
plot(stks)
```



Compare F and Catch projections, e.g. for MSY and  $F_{MSY}$ 

```
msys = FLQuants(f = targetF[[1]], catch = msy)
stks = fwd(stk, msys, sr = sr)
```

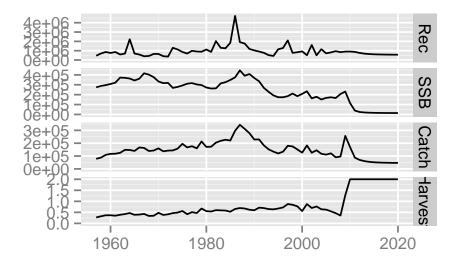
## plot(stks)



If the projected catch is high you could simulate high Fs, however, there will be a cap of effort and capacity so in practice such high Fs may not be realised. Therefore there is a constraint on F.

```
catch = FLQuant(c(refpts(eql)["msy", "yield"]) *
    2, dimnames = list(year = 2009:2020))
stk = fwd(stk, catch = catch, sr = sr)
```

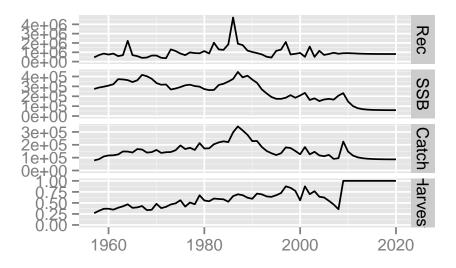
## plot(stk)



i.e. maxF, this allows an upper limit to be set on F

```
stk = fwd(stk, catch = catch, sr = sr, maxF = 1)
```

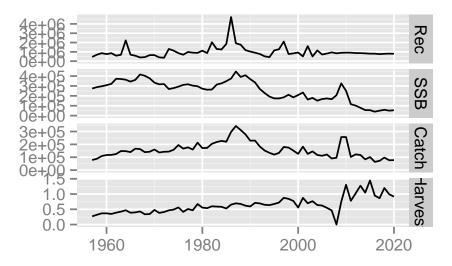
## plot(stk)



This can also be used to model capacity

```
capacity = FLQuant(1, dimnames = list(year = 2009:2020))
q = rlnorm(1, FLQuant(0, dimnames = list(year = 2009:2020)),
    0.2)
maxF = q * capacity
```

```
stk = fwd(stk, catch = catch, sr = sr, maxF = maxF)
plot(stk)
```



Other quantities can be considered in projections as well as catch and F, i.e. ssb, biomass, landings, discards, f, f.catch, f.landings, f.discards, effort, costs, revenue, profit, mnsz.

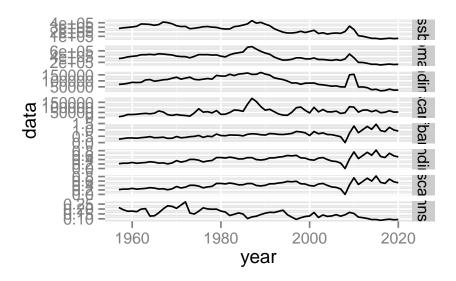
```
f.landings = function(x) \ apply((harvest(x) * landings.n(x)/catch.n(x))[ac(range(stk)["minfbar"]:range(stk)]) \ f.landings = function(x) \ apply((harvest(x) * landings.n(x)/catch.n(x))[ac(range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"]:range(stk)["minfbar"
                    2, mean)
f.discards = function(x) apply((harvest(x) * landings.n(x)/catch.n(x))[ac(range(stk)["minfbar"]:range(stk)]
                    2, mean)
mnsz = function(x) apply(stock.n(x) * stock.wt(x),
                    2, sum)/apply(stock.n(x), 2, sum)
flqs = FLQuants(stk, "ssb", biomass = stock, "landings",
                     "discards", "fbar", "f.landings", "f.discards",
                     "mnsz")
# effort, costs, revenue, profit, .
```

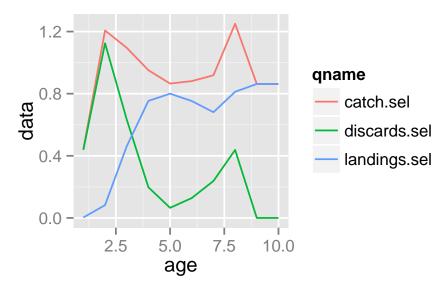
Management has two main options, i.e. setting effort (as in the examples above) or relative F-at-age by changing the selection pattern. The selection pattern-at-age of landings is that of the catch less discards e.g.

ggplot(flqs) + geom\_line(aes(year, data)) + facet\_grid(qname ~

```
ggplot(FLQuants(eql, "catch.sel", "discards.sel",
    "landings.sel")) + geom_line(aes(age, data,
    col = qname))
```

., scale = "free\_y")





In the FLStock object there are therefore 3 selection pattern components, and unfortunate three ways of calculating each. fwd uses computeCatch to re-estimate the catch.n, landings.n and discards.n before calculating future selection patterns.

```
catch(stk) <- computeCatch(stk)</pre>
```

In fwd the selection patterns are then calculated as harvest discards.n/catch.n, harvestlandings.n/catch.n and discards.sel+landings.sel

Simulation of gears that get rid of discarding can be done by

```
noDiscards = stk
discards.n(noDiscards)[, ac(2009:2020)] = 0
catch.n(noDiscards)[, ac(2009:2020)] <- landings.n(noDiscards)[,</pre>
```

```
ac(2009:2020)]
catch(noDiscards) <- computeCatch(noDiscards)</pre>
## Note adjustment of harvest
harvest(noDiscards)[, ac(2009:2020)] = harvest(stk)[,
    ac(2009:2020)] * landings.n(stk)[, ac(2009:2020)]/catch.n(stk)[,
    ac(2009:2020)]
noDiscards = fwd(noDiscards, f = F0.1, sr = sr)
stk = fwd(stk, f = F0.1, sr = sr)
plot(FLStocks('No Discards' = noDiscards, F0.1 = stk))
 500000
                                                 F<sub>0.1</sub>
         ()
      +05
                                                 No Discards
```

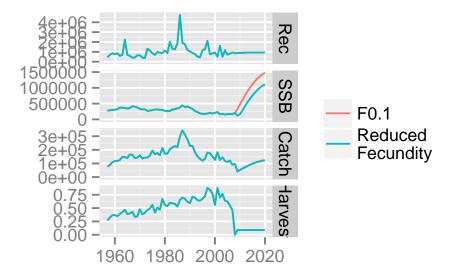
Non stationarity is seen in many biological processes, what happens if future fecundity decreases?

```
poorFec = stk
mat(poorFec)[1:5, ac(2009:2020)] = c(0, 0, 0,
    0, 0.5)
poorFec = fwd(poorFec, f = F0.1, sr = sr)
plot(FLStocks('Reduced \nFecundity' = poorFec,
    F0.1 = stk)
```

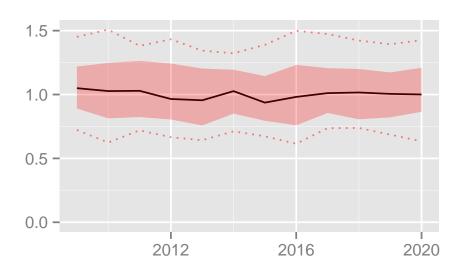
1960 1980 2000 2020

## Stochasticity

Monte Carlo simulations based on future recruitment



```
srDev = rlnorm(100, FLQuant(0, dimnames = list(year = 2009:2020)),
    0.3)
plot(srDev)
```



stk = fwd(stk, f = F0.1, sr = sr, sr.residuals = srDev)

# fwdControl

fwdControl is a more flexible but fiddly way of setting up projections. For example to replicate the  $F_{0.1}$  projection above requires setting up a fwdControl object.

This can be done using a constructor and a data.frame

```
ctrl = fwdControl(data.frame(year = 2009:2018,
    val = c(refpts(eql)["f0.1", "harvest"]), quantity = "f"))
```

fwdControl is a class with 5 slots

```
slotNames(ctrl)
## [1] "target"
                    "effort"
                                "trgtArray"
## [4] "effArray"
                   "block"
  For now we will concerntrate on just the target and trgtArray slots.
slotNames(ctrl)
## [1] "target"
                   "effort"
                                "trgtArray"
## [4] "effArray"
                   "block"
ctrl
##
## Target
##
      year quantity min
                            val max
     2009
## 1
                     NA 0.0876
                                 NA
## 2 2010
                     NA 0.0876
## 3 2011
                     NA 0.0876
                  f
                                 NA
## 4 2012
                     NA 0.0876
                  f
                                NA
## 5
    2013
                     NA 0.0876
## 6 2014
                  f
                     NA 0.0876
                                 NA
## 7 2015
                  f
                     NA 0.0876 NA
## 8 2016
                  f
                     NA 0.0876
                                 NA
## 9 2017
                  f
                     NA 0.0876
## 10 2018
                     NA 0.0876 NA
                  f
##
##
##
        min
                 val
                           max
##
              NA 0.087602
     1
                                 NA
     2
              NA 0.087602
                                 NA
##
##
     3
              NA 0.087602
                                 NA
              NA 0.087602
##
     4
                                 NA
     5
              NA 0.087602
                                 NA
##
```

NA 0.087602

NA 0.087602

NA 0.087602

NA 0.087602

NA 0.087602

6

7

8

9

10

##

##

## ##

##

target specifies the quantity for the projection (e.g. "f", "catch", "ssb", ...) and the projection year. The projection can be a target by specifying it in val. While min and max specify bounds. For example

NA

NA

NA

NA

NA

if you want to project for a target F but also to check that SSB does not fall below an SSB limit.

An example with high F that decreases SSB a lot

```
target = fwdControl(data.frame(year = 2009, val = 0.8,
    quantity = "f"))
stk = fwdWindow(ple4, end = 2010, eql)
## Warning: using a local copy of '[[<-' which
## will be removed in later versions of FLCore
stk = fwd(stk, ctrl = target, sr = eql)
fbar(stk)[, "2009"]
## An object of class "FLQuant"
## , , unit = unique, season = all, area = unique
##
##
        year
## age
         2009
    all 0.8
##
##
## units: f
ssb(stk)[, "2010"]
## An object of class "FLQuant"
## , , unit = unique, season = all, area = unique
##
##
        year
## age
         2010
##
    all 177289
##
## units: NA
```

Note that it is the end of year biomass that is constrained as in this case spawning is at Jan 1st and so fishing only has an effect of SSB

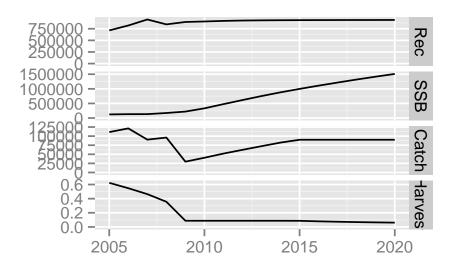
Constrain SSB so that it doesnt fall below 250000

```
target <- fwdControl(data.frame(year = c(2009,</pre>
    2009), val = c(0.8, NA), min = c(NA, 230000),
    quantity = c("f", "ssb")))
stk = fwd(stk, ctrl = target, sr = sr)
fbar(stk)[, "2009"]
```

```
## An object of class "FLQuant"
## , , unit = unique, season = all, area = unique
##
##
        year
## age
        2009
     all 0.52058
##
##
## units: f
ssb(stk)[, "2010"]
## An object of class "FLQuant"
## , , unit = unique, season = all, area = unique
##
##
        year
## age
         2010
     all 230000
##
##
## units: NA
  If a stock spawns mid year so the adult population is affected by
fishing then the SSB constraint is within year, e.g.
harvest.spwn(stk)[] = 0.5
stk = fwd(stk, ctrl = target, sr = sr)
fbar(stk)[, "2009"]
## An object of class "FLQuant"
## , , unit = unique, season = all, area = unique
##
##
        year
## age
         2009
##
     all 0.01302
##
## units: f
ssb(stk)[, c("2009", "2010")]
## An object of class "FLQuant"
## , , unit = unique, season = all, area = unique
##
##
        year
         2009
                2010
## age
##
     all 230000 228391
##
## units: NA
```

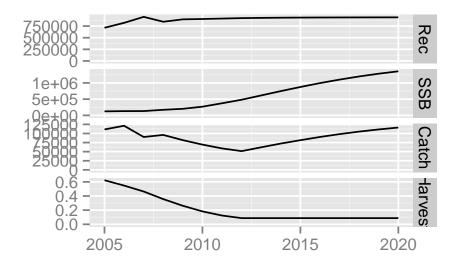
### Harvest Control Rules

```
msy = refpts(eql)["msy", "yield"]
bmsy = refpts(eql)["msy", "ssb"]
f0.1 = refpts(eql)["f0.1", "harvest"]
stk = fwdWindow(stk, end = 2020, eql)
## Warning: using a local copy of '[[<-' which
## will be removed in later versions of FLCore
#### constant catch with an upper F bound
ctrl = fwdControl(data.frame(year = rep(2009:2020,
    each = 2), val = rep(c(msy * 0.7, NA), 12),
    max = rep(c(NA, f0.1), 12), quantity = rep(c("catch",
        "f"), 12)))
stk = fwd(stk, ctrl = ctrl, sr = sr)
plot(stk[, ac(2005:2020)])
```



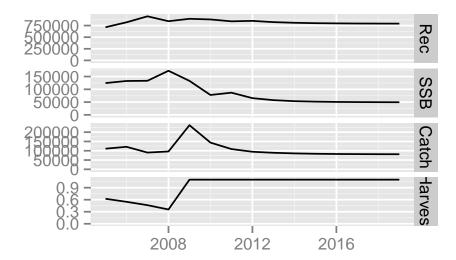
Reduce F to Fo.1 but only let catch change by 15% a year

```
ctrl = fwdControl(data.frame(year = rep(2009:2020,
    each = 2), rel.year = c(t(array(c(rep(NA,
    12), 2008:2019), c(12, 2)))), val = rep(c(f0.1, 2)))
    NA), 12), min = rep(c(NA, 0.85), 12), quantity = rep(c("f", 12))
    "catch"), 12)))
stk = fwd(stk, ctrl = ctrl, sr = sr)
plot(stk[, ac(2005:2020)])
  10% SSB increase
```



```
ctrl = fwdControl(data.frame(year = rep(2009:2020,
    each = 2), rel.year = c(t(array(c(2008:2019,
    rep(NA, 12)), c(12, 2)))), max = rep(c(f0.1,
    NA), 12), val = rep(c(NA, 1.1), 12), quantity = rep(c("ssb", 1.1), 12)
    "f"), 12)))
stk = fwd(stk, ctrl = ctrl, sr = sr)
```

### plot(stk[, ac(2005:2019)])



```
hcrF = function(iYr, SSB, Bpa, Blim, Fmin, Fmax) {
    val = pmin(Fmax, Fmax - (Fmax - Fmin) * (Bpa -
        SSB)/(Bpa - Blim))
    trgt = fwdTarget(year = iYr + 1, quantity = "f",
        valueval)
```

```
return(trgt)
}
  Recover stock to target SSB level corresponding to the 1980s in
2020 with a constant F strategy
load("/tmp/flash.RData")
stk = fwdWindow(stk, end = 2020, eql)
## Warning: using a local copy of '[[<-' which
## will be removed in later versions of FLCore
ssbTarget = mean(ssb(stk)[, ac(1970:1989)])
## function to minimise
f <- function(x, stk, ssbTarget, ctrl, sr) {</pre>
    # set target F for all years
    ctrl@target[, "val"] = x
    ctrl@trgtArray[, "val", ] = x
    # project
    stk = fwd(stk, ctrl = ctrl, sr = sr)
    # Squared Difference
    return((ssb(stk)[, ac(range(stk)["maxyear"])] -
        ssbTarget)^2)
}
## control object
ctrl = fwdControl(data.frame(year = 2009:2020,
    val = 0.5, rel = 2008, quantity = "f"))
xmin = optimize(f, c(0.1, 1), tol = 1e-07, stk = stk,
    ssbTarget = ssbTarget, ctrl = ctrl, sr = eql)
ctrl = fwdControl(data.frame(year = 2009:2020,
    val = xmin$minimum, rel = 2008, quantity = "f"))
stk = fwd(stk, ctrl = ctrl, sr = eql)
# update catch slot
catch(stk) = computeCatch(stk)
# Have we reached the target?
ssbTarget
```

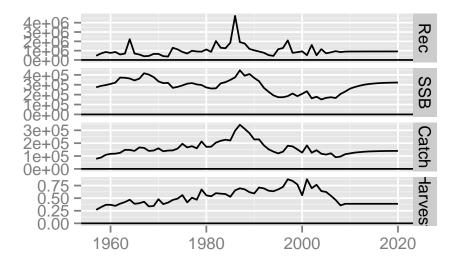
#### ## [1] 322339

### ssb(stk)

```
## An object of class "FLQuant"
## , , unit = unique, season = all, area = unique
##
##
       year
        1957
               1958
                     1959
                              1960
                                     1961
## age
##
    all 274205 288540 296825 308164 321354
##
        year
                1963
       1962
                     1964
                              1965
## age
                                     1966
##
    all 372863 370373 363077 344013 361549
##
        year
       1967
                1968
                     1969
                              1970
                                     1971
## age
    all 416563 402521 377432 333933 316343
##
##
        year
                1973
                              1975
## age
        1972
                     1974
                                     1976
    all 319062 268714 278648 293136 310954
##
##
        year
## age
        1977
                1978
                     1979
                              1980
                                     1981
##
    all 316929 303433 297122 272416 262061
       year
##
## age
       1982
                1983 1984
                              1985
                                     1986
##
     all 263998 314021 326341 348675 375392
##
        year
                      1989
                              1990
## age
       1987
                1988
                                     1991
##
    all 445855 391254 408489 368969 335747
##
        year
       1992
                1993
                     1994
                              1995
                                     1996
## age
    all 269528 228668 193093 174408 173903
##
##
        year
       1997
               1998
                      1999
                              2000
                                     2001
## age
    all 185308 211327 184733 208393 234078
##
##
        year
## age
        2002
                2003
                      2004
                              2005
                                     2006
##
     all 162725 179158 151508 167531 173783
##
        year
                       2009
                              2010
## age
         2007
                2008
                                     2011
    all 166061 206480 231522 260641 277268
##
##
        year
         2012
                2013
                       2014
                              2015
                                     2016
## age
    all 290401 300924 308029 312489 316464
##
##
        year
## age
         2017
                2018
                      2019
                              2020
```

```
all 318754 320424 321560 322339
##
##
## units: NA
# At what level of constant F
fbar(stk)
## An object of class "FLQuant"
## , , unit = unique, season = all, area = unique
##
##
       year
## age
       1957
                 1958
                         1959
                                 1960
##
    all 0.26857 0.32106 0.36734 0.36796
##
       year
## age
       1961
                 1962
                         1963
                                 1964
##
    all 0.34756 0.39012 0.42276 0.46878
##
        year
                         1967
                                 1968
## age
       1965
                 1966
    all 0.38796 0.39896 0.42923 0.33621
##
##
        year
## age
       1969
                 1970
                         1971
                                 1972
##
    all 0.34457 0.47965 0.38206 0.41158
##
        year
## age
       1973
                 1974
                         1975
                                 1976
    all 0.46551 0.49072 0.56113 0.41641
##
##
        year
       1977
                 1978
                         1979
                                 1980
## age
    all 0.51007 0.46862 0.67312 0.55555
##
##
        year
       1981
                 1982
                         1983
                                 1984
## age
    all 0.53705 0.59912 0.58934 0.58159
##
##
        year
       1985
                 1986
                         1987
                                 1988
## age
    all 0.52695 0.65386 0.69596 0.67530
##
##
        year
## age
       1989
                 1990
                         1991
                                 1992
##
     all 0.61895 0.59361 0.71195 0.69443
##
        year
                 1994
                         1995
                                 1996
## age
        1993
    all 0.64752 0.63741 0.67444 0.72301
##
##
        year
        1997
                 1998
                         1999
                                 2000
## age
##
    all 0.87588 0.84233 0.77264 0.55795
##
        year
## age
                                 2004
         2001
                 2002
                         2003
```

```
##
     all 0.87567 0.69763 0.76597 0.64015
##
        year
                                   2008
         2005
                  2006
                          2007
## age
     all 0.62343 0.54764 0.46392 0.35631
##
##
        year
         2009
                  2010
                          2011
                                   2012
## age
     all 0.38813 0.38813 0.38813 0.38813
##
##
        year
## age
         2013
                  2014
                          2015
                                   2016
     all 0.38813 0.38813 0.38813 0.38813
##
##
        year
## age
         2017
                  2018
                          2019
                                   2020
##
     all 0.38813 0.38813 0.38813 0.38813
##
## units: f
plot(stk) + geom_hline(aes())
```



Recover stock to the desired SSB in 2006 with a constant Catch strategy Here val can be anything in the ctrl because it is overwritten in the optimisation loop

```
ctrl = fwdControl(data.frame(year = 2009:2020,
    val = c(catch(stk)[, "2001"]), quantity = "catch"))
xmin = optimize(f, c(100, 1e+05), tol = 1e-07,
    stk = stk, ssbTarget = ssbTarget, ctrl = ctrl,
    sr = sr)
ctrl = fwdControl(data.frame(year = 2009:2020,
    val = xmin$minimum, quantity = "catch"))
```

```
stkC = fwd(stk, ctrl = ctrl, sr = sr)
# Have we reached the target?
ssbTarget
ssb(stkC)[, ac(2002:2020)]
# At what level of constant catch
computeCatch(stkC)[, ac(2002:2020)]
# And at what level of F
fbar(stkC)[, ac(2002:2006)]
# Update the catch slot
catch(stkC) = computeCatch(stkC)
# 'ave a butchers
plot(stkC[, ac(1957:2006)])
# Assessment up to and including 2001
data(ple4)
black.bird = stf(stk, nyrs = 2)
# set courtship and egg laying in Autumn
black.bird@m.spwn[] = 0.66
black.bird@harvest.spwn[] = 0.66
# assessment is in year 2002, set catch
# constraint in 2002 and a first guess for F
# in 2003
ctrl = fwdControl(data.frame(year = 2002:2003,
    val = c(85000, 0.5), quantity = c("catch",
        "f")))
black.bird = fwd(black.bird, ctrl = ctrl, sr = list(model = "mean",
    params = FLPar(25000))
# HCR specifies F=0.1 if ssb<100000, F=0.5 if
# ssb>300000 otherwise linear increase as SSB
# increases
min.ssb = 1e+05
max.ssb = 3e+05
min.f = 0.1
max.f = 0.5
# slope of HCR
a. = (max.f - min.f)/(max.ssb - min.ssb)
b. = min.f - a. * min.ssb
# plot of HCR
```

```
plot(c(0, min.ssb, max.ssb, max.ssb * 2), c(min.f,
    min.f, max.f, max.f), type = "l", ylim = c(0,
    \max.f * 1.25), xlim = c(0, \max.ssb * 2))
## find F through iteration
t. = 999
i = 0
while (abs(ctrl@target[2, "val"] - t.) > 1e-05 &
    i < 50) {
    t. = ctrl@target[2, "val"] ## save last val of F
    # calculate new F based on SSB last iter
    ctrl@target[2, "val"] = a. * c(ssb(black.bird)[,
        "2003"]) + b.
    ctrl@trgtArray[2, "val", ] = a. * c(ssb(black.bird)[,
        "2003"1) + b.
    black.bird = fwd(black.bird, ctrl = ctrl,
        sr = list(model = "mean", params = FLPar(25000)))
    # 'av a gander
    points(c(ssb(black.bird)[, "2003"]), c(ctrl@target[2,
        "val"]), cex = 1.25, pch = 19, col = i)
    print(c(ssb(black.bird)[, "2003"]))
    print(c(ctrl@target[2, "val"]))
    i = i + 1
}
# F bounds
black.bird = fwd(black.bird, ctrl = ctrl, sr = list(model = "mean",
    params = FLPar(25000))
plot(FLStocks(black.bird))
#### Create a random variable for M
albM = stk
m(albM) = propagate(m(albM), 100)
mDev = rlnorm(prod(dim(m(albM))), 0, 0.3)
mean(mDev)
var(mDev)^0.5
m(albM) = m(albM) * FLQuant(mDev, dimnames = dimnames(m(albM)))
plot(m(albM))
harvest(albM) = computeHarvest(albM)
```

```
catch(albM) = computeCatch(albM, "all")
plot(FLStocks(albM, stk28))
ctrl = fwdControl(data.frame(year = 2009:2020,
    val = ctch, quantity = "catch"))
albM = fwd(albM, ctrl = ctrl, sr = sr)
plot(albM)
#### Create a random variable for M
albM1 = albM
m(albM1)[1:3, ] = m(albM)[1:3, ] * 2
harvest(albM1) = computeHarvest(albM1)
catch(albM1) = computeCatch(albM1, "all")
albM1 = fwd(albM1, ctrl = ctrl, sr = sr)
albM2 = albM
m(albM2)[, ac(2000:2020)] = m(albM)[, ac(2000:2020)] *
harvest(albM2) = computeHarvest(albM2)
catch(albM2) = computeCatch(albM2, "all")
albM2 = fwd(albM2, ctrl = ctrl, sr = sr)
plot(FLStocks(albM, albM1, albM2))
#### process error in recruitment
srDev = FLQuant(rlnorm(20 * 100, 0, 0.3), dimnames = list(year = 2008:2020,
    iter = 1:100))
sr = fwd(albM, ctrl = ctrl, sr = sr, sr.residuals = srDev)
plot(sr)
#### SRR regime shifts
albSV = as.FLSR(albNEA)
model(sr) = bevholtSV()
albSV = fmle(albSV, fixed = list(spr0(albNEA)))
albSV1 = fmle(albSV, fixed = list(spr0 = spr0(albNEA),
    s = 0.75)
albSV2 = fmle(albSV, fixed = list(spr0 = spr0(albNEA),
    v = 0.75 * params(albSV)["v"]))
#### Prior for steepness
albSV3 = fmle(albSV, fixed = list(s = qnorm(seq(0.01,
```

```
0.99, length.out = 101), 0.75, 0.1))
albSV3 = fwd(albSV3, ctrl = ctrl, sr = sr, sr.residuals = srDev)
plot(albSV1, albSV2, albSV3)
#### SRR regime shifts
albBRP = brp(FLBRP(albM))
refpts(albBRP)
albSV3 = fmle(albSV, fixed = list(s = qnorm(seq(0.01,
    0.99, length.out = 101), 0.75, 0.1)))
albSV3 = fwd(albSV3, ctrl = ctrl, sr = sr, sr.residuals = srDev)
plot(albSV1, albSV2, albSV3)
# F bounds
black.bird = fwd(black.bird, ctrl = ctrl, sr = list(model = "mean",
    params = FLPar(25000))
plot(FLStocks(black.bird))
library(FLash)
library(FLAssess)
#### Set up a short term forecast for an FLStock
#### object by adding extra years The default
#### forecast is 3 years,
alb3 = stf(alb)
## Check what?s happened
summary(alb)
summary(alb3)
## by default future F is the mean of last 3
## years
mean(fbar(alb)[, ac(2007 - (0:2))])
fbar(alb3)[, ac(2007 + (1:3))]
## by default future F is the mean of last 3
## years
mean(fbar(alb)[, ac(2007 - (0:2))])
fbar(alb3)[, ac(2007 + (1:3))]
## Constant F Projection for a 20 year
## projection
stk = stf(alb, nyear = 20)
```

```
#### SRR
sr = as.FLSR(alb)
model(sr) = bevholt()
sr = fmle(sr)
#### BRPs
albBRP = FLBRP(alb, sr = sr)
computeRefpts(albBRP)
albBRP = brp(albBRP)
# Use F0.1 as fishing mortality target
F0.1 = refpts(albBRP)["f0.1", "harvest", drop = T]
ctrl = fwdControl(data.frame(year = 2008:2027,
    val = F0.1, quantity = "f"))
albF1 = fwd(stk, ctrl = ctrl, sr = sr)
plot(albF1)
ctrl = fwdControl(data.frame(year = 2008:2027,
    val = F0.1 * 0.5, quantity = "f"))
albF2 = fwd(stk, ctrl = ctrl, sr = sr)
ctrl = fwdControl(data.frame(year = 2008:2027,
    val = F0.1 * 2, quantity = "f"))
albF3 = fwd(stk, ctrl = ctrl, sr = sr)
## Create an FlStock object
albF0.1 = FLStocks(F0.1 = albF1, half = albF2,
    double = albF3)
plot(albF0.1)
## Cut the plots
plot(lapply(albF0.1, window, start = 1990))
## Compare alternatives
lapply(lapply(albF0.1, window, start = 2008),
    computeCatch)
#### Total catch
```

```
lapply(lapply(lapply(albF0.1, window, start = 2008),
    computeCatch), sum)
#### Short-term
unlist(lapply(lapply(lapply(albF0.1, window, start = 2008,
    end = 2013), computeCatch), sum))
#### Medium-term
unlist(lapply(lapply(lapply(albF0.1, window, start = 2016,
    end = 2020), computeCatch), sum))
#### Long-term
unlist(lapply(lapply(lapply(albF0.1, window, start = 2023,
    end = 2027), computeCatch), sum))
#### constant catch startegies
ctch = mean(computeCatch(alb)[, ac(2003:2007)])
albC = FLStocks()
ctrl = fwdControl(data.frame(year = 2008:2027,
    val = ctch, quantity = "catch"))
albC[["1.0"]] = fwd(stk, ctrl = ctrl, sr = sr)
ctrl = fwdControl(data.frame(year = 2008:2027,
    val = 0.5 * ctch, quantity = "catch"))
albC[["0.5"]] = fwd(stk, ctrl = ctrl, sr = sr)
ctrl = fwdControl(data.frame(year = 2008:2027,
    val = 1.5 * ctch, quantity = "catch"))
albC[["1.5"]] = fwd(stk, ctrl = ctrl, sr = sr)
plot(albC)
#### compare startegies
plot(FLStocks(albC[[1]], albF0.1[[1]]))
#### constant catch with an upper F bound
ctrl = fwdControl(data.frame(year = rep(2008:2027,
    each = 20), val = rep(c(ctch * 1.5, NA), 20),
    max = rep(c(NA, F0.1), 20), quantity = rep(c("catch",
        "f"), 20)))
albFC = fwd(stk, ctrl = ctrl, sr = sr)
plot(albFC)
#### 5% F reduction
ctrl = fwdControl(data.frame(year = rep(2008:2027,
    each = 2), rel.year = c(t(array(c(2007:2026,
    rep(NA, 20)), c(20, 2)))), val = rep(c(0.95,
```

```
NA), 20), \min = \text{rep}(c(NA, F0.1 * 0.5), 20),
    quantity = rep(c("catch", "f"), 20)))
albFC = fwd(stk, ctrl = ctrl, sr = sr)
plot(albFC)
#### 10% SSB increase
ctrl = fwdControl(data.frame(year = 2008:2027,
    rel.year = 2007:2026, min = 1.1, quantity = "ssb"))
albSSB = fwd(stk, ctrl = ctrl, sr = sr)
plot(albSSB)
hcrF = function(iYr, SSB, Bpa, Blim, Fmin, Fmax) {
    val = pmin(Fmax, Fmax - (Fmax - Fmin) * (Bpa -
        SSB)/(Bpa - Blim))
    trgt = fwdTarget(year = iYr + 1, quantity = "f",
    return(trgt)
}
## Ogives
dnormal = function(x, a, sL, sR) {
    pow = function(a, b) a^b
    func = function(x, a, sL, sR) {
        if (x < a)
            return(pow(2, -((x - a)/sL * (x -
                a)/sL))) else return(pow(2, -((x - a)/sR * (x -
            a)/sR)))
    }
    sapply(x, func, a, sL, sR)
}
logistic = function(x, a50, ato95) {
    pow = function(a, b) a^b
    func = function(x, a50, ato95) {
        if ((a50 - x)/ato95 > 5)
            return(0)
        if ((a50 - x)/ato95 < -5)
            return(1)
        return(1/(1 + pow(19, (a50 - x)/ato95)))
    }
```

```
sapply(x, func, a50, ato95)
}
prices = data.frame(rbind(cbind(Age = 1:10, Price = dnormal(1:10,
    3, 10, 20), Type = "Peaking"), cbind(age = 1:10,
    Price = logistic(1:10, 2, 3), Type = "Increasing")))
prices$Age = as.numeric(ac(prices$Age))
p = ggplot(prices, aes(x = Age, y = Price, group = Type))
p = p + geom_line(aes(colour = Type))
refIPrice = brp(FLBRP(alb, fbar = seq(0, 1, length.out = 101)))
refPPrice = refIPrice
price(refIPrice) = logistic(1:15, 4, 3)
price(refPPrice) = dnormal(1:15, 5, 1, 5)
refIPrice = brp(refIPrice)
refPPrice = brp(refPPrice)
breakEven = refIPrice
#### bug why not no recycling
refpts(breakEven) = refpts(as.numeric(c(refpts(refIPrice)["fmax",
    "revenue"] * 2, rep(NA, 7)), refpt = c("breakEven"))
computeRefpts(breakEven)[, "revenue"]
vcost(refIPrice) = c(computeRefpts(breakEven)[,
    "revenue" 1 * 0.2
fcost(refIPrice) = vcost(refIPrice) * 4
vcost(refPPrice) = vcost(refIPrice)
fcost(refPPrice) = fcost(refIPrice)
refIPrice = brp(refIPrice)
refPPrice = brp(refPPrice)
price(refIPrice) = price(refIPrice)/c(refpts(refIPrice)["mey",
price(refPPrice) = price(refPPrice)/c(refpts(refPPrice)["mey",
    "profit"])
refIPrice = brp(refIPrice)
```

```
refPPrice = brp(refPPrice)
plot(refPPrice)
plot(refIPrice)
data(ple4)
# Set up the stock for the next 6 years
stk = stf(ple4, 6)
# Set a constant recruitment based on the
# geometric mean of last 10 years
mnRec = FLPar(exp(mean(log(rec(ple4)[, ac(1992:2001)]))))
# Set ssb target to level 19 years ago
ssbTarget = ssb(ple4)[, "1992"]
## function to minimise
f = function(x, stk, ssbTarget, ctrl, sr) {
    ctrl@target[, "val"] = x
    ctrl@trgtArray[, "val", ] = x
    ssb. = c(ssb(fwd(stk, ctrl = ctrl, sr = sr))[,
        "2006"])
    return((ssb. - ssbTarget)^2)
}
## Recover stock to BMY in 2006 with a constant
## F strategy
ctrl = fwdControl(data.frame(year = 2002:2006,
    val = 0.5, rel = 2001, quantity = "f"))
xmin = optimize(f, c(0.1, 1), tol = 1e-07, stk = stk,
    ssbTarget = ssbTarget, ctrl = ctrl, sr = list(model = "mean",
        params = mnRec))
ctrl = fwdControl(data.frame(year = 2002:2006,
    val = xmin$minimum, rel = 2001, quantity = "f"))
stkF = fwd(stk, ctrl = ctrl, sr = list(model = "mean",
    params = mnRec))
# update catch slot
catch(stkF) = computeCatch(stkF)
# Have we reached the target?
```

```
ssbTarget
ssb(stkF)[, ac(2002:2006)]
# At what level of constant F
fbar(stkF)[, ac(2002:2006)]
# 'ave a butchers
plot(stkF[, ac(1957:2006)])
plot(albSSB)
data(ple4)
stk = stf(ple4, 6)
## Recover stock to the desired SSB in 2006
## with a constant Catch strategy Here val can
## be anything in the ctrl because it is
## overwritten in the optimisation loop
ctrl = fwdControl(data.frame(year = 2002:2006,
    val = c(catch(stk)[, "2001"]), quantity = "catch"))
xmin = optimize(f, c(100, 1e+05), tol = 1e-07,
    stk = stk, ssbTarget = ssbTarget, ctrl = ctrl,
    sr = list(model = "mean", params = mnRec))
ctrl = fwdControl(data.frame(year = 2002:2006,
    val = xmin$minimum, quantity = "catch"))
stkC = fwd(stk, ctrl = ctrl, sr = list(model = "mean",
    params = mnRec))
# Have we reached the target?
ssbTarget
ssb(stkC)[, ac(2002:2006)]
# At what level of constant catch
computeCatch(stkC)[, ac(2002:2006)]
# And at what level of F
fbar(stkC)[, ac(2002:2006)]
# Update the catch slot
catch(stkC) = computeCatch(stkC)
plot(stkC[, ac(1957:2006)])
# Assessment upto and including 2001
data(ple4)
black.bird = stf(stk, nyear = 2)
# set courtship and egg laying in Autumn
black.bird@m.spwn[] = 0.66
```

```
black.bird@harvest.spwn[] = 0.66
# assessment is in year 2002, set catch
# constraint in 2002 and a first guess for F
# in 2003
ctrl = fwdControl(data.frame(year = 2002:2003,
    val = c(85000, 0.5), quantity = c("catch",
        "f")))
black.bird = fwd(black.bird, ctrl = ctrl, sr = list(model = "mean",
    params = FLPar(25000))
# HCR specifies F=0.1 if ssb<100000, F=0.5 if
# ssb>300000 otherwise linear increase as SSB
# increases
min.ssb = 1e+05
max.ssb = 3e+05
min.f = 0.1
max.f = 0.5
# slope of HCR
a. = (max.f - min.f)/(max.ssb - min.ssb)
b. = min.f - a. * min.ssb
# plot of HCR
plot(c(0, min.ssb, max.ssb, max.ssb * 2), c(min.f,
    min.f, max.f, max.f), type = "l", ylim = c(0,
    \max.f * 1.25), x\lim = c(0, \max.ssb * 2))
## find F through iteration
t. = 999
i = 0
while (abs(ctrl@target[2, "val"] - t.) > 1e-05 &
    i < 50) {
    t. = ctrl@target[2, "val"] ## save last val of F
    # calculate new F based on SSB last iter
    ctrl@target[2, "val"] = a. * c(ssb(black.bird)[,
        "2003"]) + b.
    ctrl@trgtArray[2, "val", ] = a. * c(ssb(black.bird)[,
        "2003"]) + b.
    black.bird = fwd(black.bird, ctrl = ctrl,
        sr = list(model = "mean", params = FLPar(25000)))
    # 'av a gander
```

```
points(c(ssb(black.bird)[, "2003"]), c(ctrl@target[2,
        "val"]), cex = 1.25, pch = 19, col = i)
    print(c(ssb(black.bird)[, "2003"]))
    print(c(ctrl@target[2, "val"]))
    i = i + 1
}
# F bounds
black.bird = fwd(black.bird, ctrl = ctrl, sr = list(model = "mean",
    params = FLPar(25000))
plot(FLStocks(black.bird))
#### Create a random variable for M
albM = albF1
m(albM) = propagate(m(albM), 100)
mDev = rlnorm(prod(dim(m(albM))), 0, 0.3)
mean(mDev)
var(mDev)^0.5
m(albM) = m(albM) * FLQuant(mDev, dimnames = dimnames(m(albM)))
plot(m(albM))
harvest(albM) = computeHarvest(albM)
catch(albM) = computeCatch(albM, "all")
ctrl = fwdControl(data.frame(year = 2008:2027,
    val = c(fbar(albF1)[, ac(2008:2027)]), quantity = "f"))
albM = fwd(albM, ctrl = ctrl, sr = sr)
plot(FLStocks(albM, albF1))
#### Create a random variable for M
albM1 = albM
m(albM1)[1:3, ] = m(albM)[1:3, ] * 2
harvest(albM1) = computeHarvest(albM1)
catch(albM1) = computeCatch(albM1, "all")
albM1 = fwd(albM1, ctrl = ctrl, sr = sr)
albM2 = albM
m(albM2)[, ac(2000:2027)] = m(albM)[, ac(2000:2027)] *
harvest(albM2) = computeHarvest(albM2)
```

```
catch(albM2) = computeCatch(albM2, "all")
albM2 = fwd(albM2, ctrl = ctrl, sr = sr)
plot(FLStocks(albM, albM1, albM2))
#### process error in recruitment
srDev = FLQuant(rlnorm(20 * 100, 0, 0.3), dimnames = list(year = 2008:2027,
    iter = 1:100))
sr = fwd(albM, ctrl = ctrl, sr = sr, sr.residuals = srDev)
plot(sr)
sr = as.FLSR(alb, model = "bevholtSV")
sr1 = fmle(sr, fixed = list(spr0 = spr0(alb)))
#### SRR regime shifts
sr2 = fmle(sr, fixed = list(spr0 = spr0(alb),
    v = 0.75 * params(sr)["v"]))
alb2 = fwd(sr3, ctrl = ctrl, sr = sr2, sr.residuals = srDev)
plot(FLStocks(sr, sr2))
```

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