Applying SPiCT to anchovy (*Engraulis encrasicolus*) in Division 9a South (Atlantic Iberian waters)

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Introduction

Small and mid-size pelagic fish occupy intermediate levels in the marine trophic webs where they play an essential role (Cury et al., 2000). These fish act as links between the upper and lower trophic levels, capturing energy from lower levels and making it available to higher trophic levels (Morello & Arneri, 2009). Global captures of finfish, the taxon where small and mid-size pelagic fish are included, account for the 85% of the marine captures, with small pelagics as the main group (FAO, 2024a).

According to the economic importance of *Engraulis encrasicolus*, the species under study, it accounted for approximately 4% of the total european countries fisheries in 2022 (FAO, 2024b). Concerning Spain and Portugal, *Engraulis encrasicolus* covers more than 5% and 2% of the total fisheries, respectively (FAO, 2024b). Therefore, the knowledge and correct management of the *Engraulis encrasicolus* fishery is of utmost importance for the fishing sector of both countries.

In this study we apply the Stocastic Surplus Production Model in Continuous Time (SPiCT) with 4 different model configurations to evaluate the *Engraulis encrasicolus* stock status in ICES Division 9a South. Model results allow us to establish reference points for Maximum Sustainable Yield, Biomass at Maximum Sustainable Yield and Fishing Mortality at Maximum Sustainable Yield as well as to determine how model configuration could affect the estimates and model robustness.

Material & Methods

Data

We used data from commercial landings as catch obervations and independent scientific survey data as exploitable biomass indices. In this sense, we used quarterly commercial landings data comprised from 1989 to 2023 and yearly data from PELAGO (1999-2023), ECOCADIZ (2004-2023), ECOCADIZ-RECLUTAS (2012-2023) and BOCADEVA (2005-2023) surveys. We obtained the corresponding exploitable biomass index for each period and survey considering the minimum length observed in the landings during that period. In addition, we added as much uncertainty as possible, without compromising the stability of the model, to the 2012 estimate of the ECOCADIZ-RECLUTAS survey since it was only sampled in Spanish waters.

SPiCT

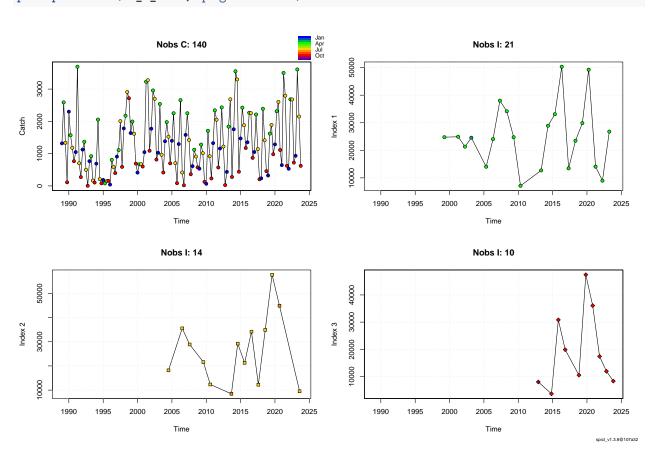
Stocastic Surplus Production Model in Continuos Time (Pedersen & Berg, 2017) is a model that has been widely used in data-limited situations (i.e. Bluemel et al., 2021; González Herraiz et al., 2023; Soto et al., 2023). This stochastic state-space model aggregates biomass across size and age groups, using the equations reported by Pella and Tomlinson (1969), providing stock status estimates and reproducing population dynamics (Derhy et al., 2022). By relaxing the common assumption that catches are known without error, SPiCT permits to assess fish stock status with a more realistic quantification of uncertainty (Pedersen & Berg, 2017), allowing for a broader perspective of the stock situation and a better understanding of the risks associated with management decisions.

Scenarios

We tested the SPiCT model with 4 different configurations of the input data:

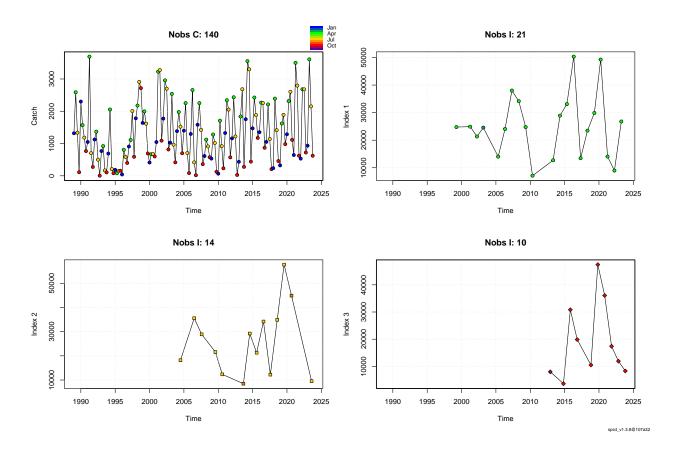
• Scenario 1: commercial landings data and exploitable biomass indices from PELAGO, ECOCADIZ and ECOCADIZ-RECLUTAS.

plotspict.data(sc_1_data, qlegend = TRUE)



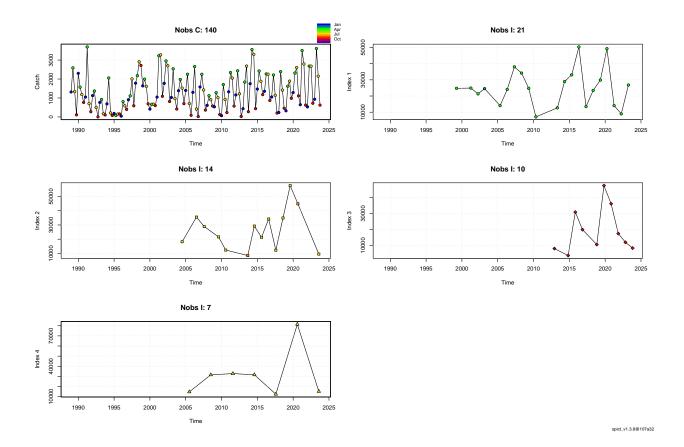
• Scenario 2: identical to Scenario 1 but adding uncertainty to the 2012 ECOCADIZ-RECLUTAS exploitable biomass estimate.

plotspict.data(sc_2_data, qlegend = TRUE)



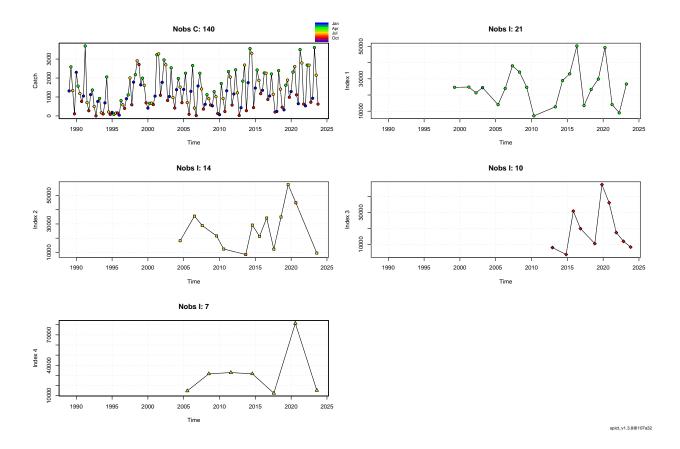
• Scenario 3: commercial landings data and exploitable biomass indices from PELAGO, ECOCADIZ, ECOCADIZ-RECLUTAS and BOCADEVA.

plotspict.data(sc_3_data, qlegend = TRUE)



 \bullet Scenario 4: identical to Scenario 3 but adding the uncertainy to the 2012 ECOCADIZ-RECLUTAS exploitable biomass estimate and to the BOCADEVA estimates.

plotspict.data(sc_4_data, qlegend = TRUE)



Implementation

We implemented the model and scenarios using the SPiCT package (Pedersen & Berg, 2017) from R (R Core Team, 2024) and the default priors.

Results

We obtained two types of results: a) model parameter estimates, reference points & state estimations and b) model diagnostics for model acceptance.

Scenario 1

Model Fit

The model obtained acceptable uncertainty levels and an estimated exploitable biomass of 2219.43 tonnes and a fising mortality of 3.25 in 2023. Predicted catchabilities were 6.29, 8.75 and 5.31 for PELAGO, ECOCADIZ and ECOCADIZ-RECLUTAS, respectively. Additionally, Kobe plot shows that the stock has suboptimal biomass estimates as well as lower fishing mortality than fishing mortality at Maximum Sustainable Yield (MSY).

```
res_sc_1 <- fit.spict(sc_1_data)
summary(res_sc_1)</pre>
```

```
Convergence: 0 MSG: relative convergence (4)
Objective function at optimum: 217.9455143
Euler time step (years): 1/16 or 0.0625
Nobs C: 140, Nobs I1: 21, Nobs I2: 14, Nobs I3: 10
Priors
     logn \sim dnorm[log(2), 2^2]
logalpha ~
             dnorm[log(1), 2^2]
  logbeta ~
             dnorm[log(1), 2^2]
Model parameter estimates w 95% CI
           estimate
                            cilow
                                         ciupp
                                                  log.est
                        0.0251668 8.613235e-01 -1.9157567
 alpha1
          0.1472304
 alpha2
          0.1707301
                        0.0319501 9.123218e-01 -1.7676714
 alpha3
          0.3986602
                        0.1161241 1.368622e+00 -0.9196458
 beta
           1.6935246
                        0.8889400 3.226343e+00 0.5268119
                        1.1869716 1.513004e+01 1.4440435
          4.2377969
r
          5.9281435
                        2.5109657 1.399577e+01 1.7797111
rc
rold
          9.8617303
                        3.7699535 2.579706e+01 2.2886616
       7830.0805345 5311.6801952 1.154252e+04 8.9657281
K
       6069.6185357 2297.6358114 1.603399e+04 8.7110510
          6.2913041
                        2.3604551 1.676817e+01 1.8391684
 q1
 q2
          8.7530111
                        2.3391956 3.275280e+01 2.1693978
          5.3056998
                        1.5223404 1.849156e+01 1.6687817
 q3
                        0.8350964 2.447745e+00 0.3574796
 n
          1.4297214
 sdb
          1.1780900
                        0.6023364 2.304188e+00 0.1638945
 sdf
          0.3449096
                        0.1755653 6.775977e-01 -1.0644729
 sdi1
                        0.0387140 7.771132e-01 -1.7518622
          0.1734506
 sdi2
          0.2011354
                        0.0431693 9.371339e-01 -1.6037769
 sdi3
          0.4696576
                        0.2032237 1.085397e+00 -0.7557513
 sdc
          0.5841129
                        0.4477046 7.620825e-01 -0.5376610
 phi1
          3.8831595
                        1.8088397 8.336243e+00 1.3566491
phi2
          11.3419666
                        6.3157292 2.036823e+01 2.4285097
          11.4554653
                        5.8256527 2.252583e+01 2.4384669
phi3
Deterministic reference points (Drp)
          estimate
                        cilow
                                      ciupp log.est
Bmsyd 2641.663622 1134.936110 6148.704437 7.879164
Fmsyd
          2.964072
                      1.255483
                                   6.997883 1.086564
MSYd 7830.080534 5311.680195 11542.517419 8.965728
Stochastic reference points (Srp)
                                       ciupp log.est rel.diff.Drp
           estimate
                          cilow
Bmsvs 2435.613471 1380.317367 4297.716688 7.797954 -0.08459887
                                    6.666552 1.440876
                                                        0.29834440
Fmsys
           4.224397
                       2.676875
MSYs 10548.688285 5533.814449 20108.159670 9.263757
                                                        0.25771998
States w 95% CI (inp$msytype: s)
                    estimate
                                   cilow
                                               ciupp
                                                        log.est
B_2023.94
                2219.4307185 623.5240116 7900.052961
                                                     7.7050060
F_2023.94
                   3.2466487
                               1.0825588
                                            9.736864
                                                     1.1776233
```

Predictions w 95% CI (inp\$msytype: s)

0.9112409

0.7685473

B_2023.94/Bmsy

F 2023.94/Fmsy

2.908919 -0.0929479

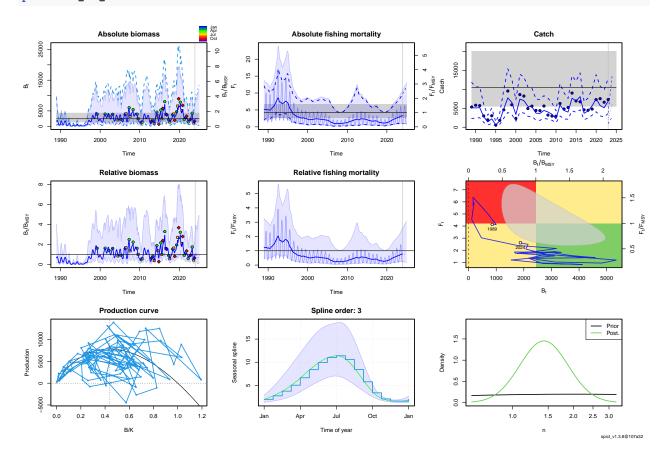
2.557953 -0.2632532

0.2854531

0.2309132

```
prediction
                                    cilow
                                                 ciupp
                                                          log.est
B_2025.00
               2280.2387517
                             396.1363036 13125.504321
                                                       7.7320354
F_2025.00
                  3.2466502
                               0.8842016
                                             11.921192
                                                       1.1776238
B_2025.00/Bmsy
                  0.9362072
                               0.1787497
                                              4.903415 -0.0659185
F_2025.00/Fmsy
                  0.7685476
                               0.1914702
                                              3.084895 -0.2632528
Catch_2024.00 6151.1230310 2718.4802992 13918.186037
                                                        8.7243900
E(B_inf)
               3001.0968823
                                                        8.0067331
```

plot(res_sc_1)



Model Diagnostics

According to the diagnostic checklist for model acceptance, the model meets all requirements except normality of catch residuals.

• 1- The assessment converged:

```
# if 0 => OK
res_sc_1$opt$convergence
```

[1] 0

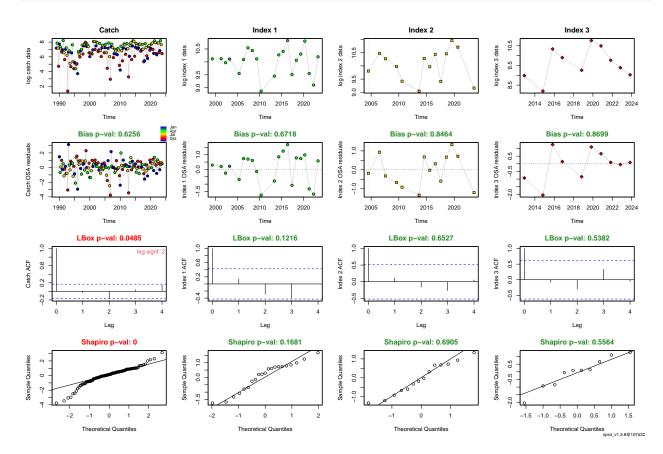
• 2- All variance parameters of the model parameters are finite:

```
# if TRUE => OK
all(is.finite(res_sc_1$sd))
```

[1] TRUE

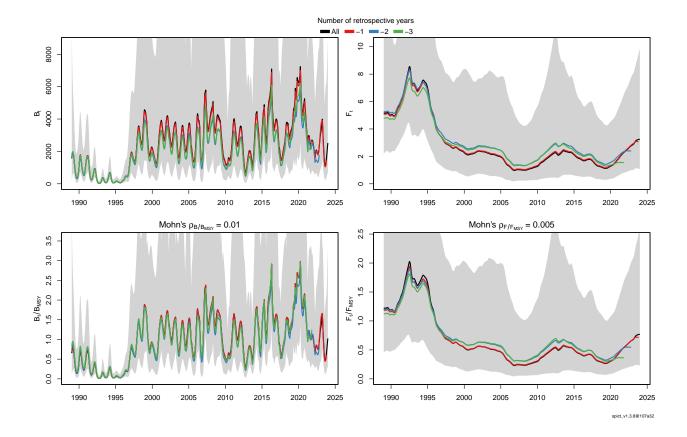
• 3- No violation of model assumptions:

```
res_sc_1 <- calc.osa.resid(res_sc_1)
plotspict.diagnostic(res_sc_1)</pre>
```



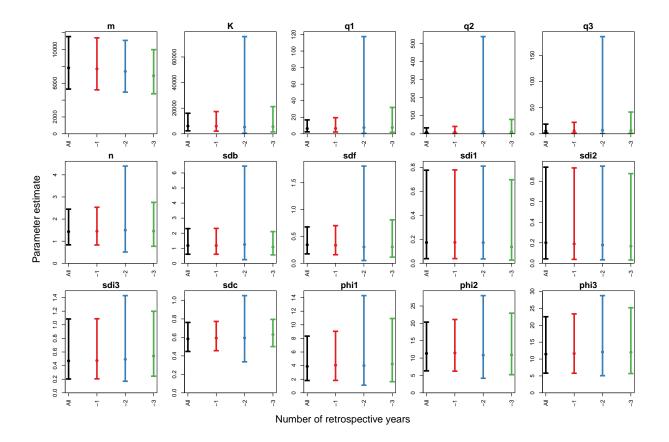
• 4- Consistent patterns in the retrospective analysis:

```
# if -0.2 < mohns_rho < 0.2 => OK
retro_sc_1 <- retro(res_sc_1, nretroyear = 3)
plotspict.retro(retro_sc_1)</pre>
```



FFmsy BBmsy 0.004889144 0.010451340

plotspict.retro.fixed(retro_sc_1)



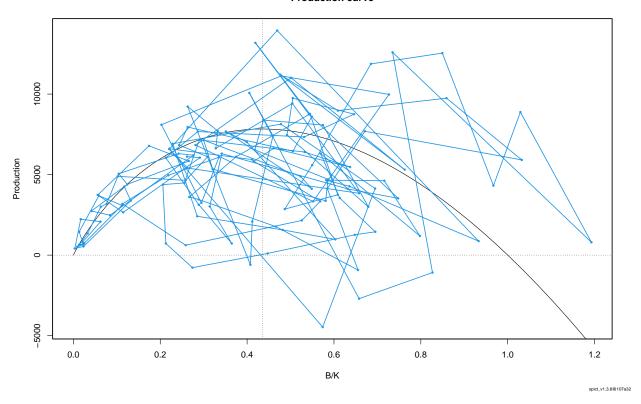
• 5- Realistic production curve:

```
# if between 0.1 and 0.9 => OK
calc.bmsyk(res_sc_1)
```

[1] 0.4352273

```
plotspict.production(res_sc_1)
```

Production curve



• 6- High assessment uncertainty:

est

logsdf -1.739744 -1.064473 -0.3892015 0.3445326 -0.3236649

```
# Main variance paramterers (logsdb, logsdc, logsdi, logsdf) should not be unreallistically high:
get.par("logsdb", res_sc_1)
               11
                        est
                                   ul
                                             sd
logsdb -0.5069392 0.1638945 0.8347282 0.3422684 2.088346
get.par("logsdc", res_sc_1)
                                    ul
                        est
                                              sd
logsdc -0.8036216 -0.537661 -0.2717005 0.1356966 -0.2523832
get.par("logsdi", res_sc_1)
                        est
                                     ul
                                               sd
logsdi -3.251555 -1.7518622 -0.25216928 0.7651635 -0.4367715
logsdi -3.142625 -1.6037769 -0.06492909 0.7851409 -0.4895574
logsdi -1.593448 -0.7557513 0.08194539 0.4274041 -0.5655354
get.par("logsdf", res_sc_1)
```

ul

calc.om(res_sc_1) # if order of magnitude < 2 => OK)

```
lower est upper CI range order magnitude
B/Bmsy 0.29 0.91 2.91 2.62 1
F/Fmsy 0.06 0.21 0.73 0.67 1
```

• 7- Initial values do not influence the parameter estimates:

check_sc_1\$check.ini\$resmat # Trials that converged should have same or similar estimates.

```
Distance
                                 K
                                                      n sdb sdf
                                                                    sdi sdi
                         m
                                       q
                                            q
                                                 q
             0.00 7830.08 6069.62 6.29 8.75 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Basevec
Trial 1
             0.00
                        NA
                                NA
                                     NA
                                           NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
Trial 2
             0.05 7830.08 6069.67 6.29 8.75 5.31 1.43 1.18 0.34 0.17 0.2 0.47
             0.02 7830.08 6069.64 6.29 8.75 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 3
Trial 4
             0.13 7830.07 6069.75 6.29 8.75 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 5
             0.02 7830.08 6069.64 6.29 8.75 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 6
             0.00
                        NA
                                NA
                                     NA
                                           NA
                                                NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                         NA
                                                                               NΑ
Trial 7
             0.00
                                                                     NA
                                                                         NA
                        NA
                                NA
                                     NA
                                           NA
                                                NA
                                                      NA
                                                           NA
                                                                NA
                                                                               NA
Trial 8
             0.00
                        NA
                                NA
                                     NA
                                           NA
                                                NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                         NA
                                                                               NA
Trial 9
             0.00
                        NA
                                NA
                                     NA
                                           NA
                                                           NA
                                                                NA
                                                                     NA
                                                                         NA
                                                                               NA
                                                NA
                                                     NA
Trial 10
             0.00
                                                                               NA
                        NA
                                NA
                                     NA
                                           NA
                                                NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                         NA
Trial 11
             0.00
                        NA
                                NA
                                     NA
                                           NA
                                                NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                         NA
Trial 12
             0.11 7830.09 6069.51 6.29 8.75 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 13
             0.08 7830.11 6069.69 6.29 8.75 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 14
             0.00
                                NA
                                      NA
                                           NA
                                                NA
                                                      NA
                                                                ΝA
                        NA
                                                           NA
                                                                     NA NA
Trial 15
             0.03 7830.08 6069.65 6.29 8.75 5.31 1.43 1.18 0.34 0.17 0.2 0.47
             0.01 7830.08 6069.63 6.29 8.75 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 16
Trial 17
             0.05 7830.06 6069.66 6.29 8.75 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 18
             0.02 7830.10 6069.61 6.29 8.75 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 19
             0.00
                        NA
                                NA
                                           NA
                                                NA
                                                     NA
                                                                     NΑ
                                                                         NΑ
                                     NA
                                                           NA
                                                                NA
Trial 20
             0.00
                        NA
                                NA
                                     NA
                                           NA
                                                NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                         NA
Trial 21
             0.00
                                NA
                                                     NA
                                                                     NA
                                                                         NA
                                                                               NA
                        NA
                                     NA
                                           NA
                                                NA
                                                           NA
                                                                NA
Trial 22
             0.00
                        NA
                                NA
                                     NA
                                           NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                     NA
                                                                         NA
                                                                               NA
Trial 23
             0.00
                                NA
                                     NA
                                           NA
                                                                NA
                                                                         NA
                                                                               NA
                        NA
                                                NA
                                                      NA
                                                           NA
                                                                     NA
Trial 24
             0.00
                        NA
                                NA
                                     NA
                                           NA
                                                NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                         NA
Trial 25
             0.00
                                      NA
                                           NA
                                                NA
                                                                NA
                                                                     NA
                                                                         NA
                                                                               NA
                        NA
                                NA
                                                      NA
                                                           NA
Trial 26
             0.03 7830.08 6069.64 6.29 8.75 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 27
             0.00
                        NA
                                NA
                                     NA
                                           NA
                                                NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                         NA
Trial 28
             0.00
                        NA
                                NA
                                     NA
                                           NA
                                                NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                         NA
                                                                               NA
Trial 29
             0.01 7830.08 6069.63 6.29 8.75 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 30
             0.00
                        NA
                                NA
                                      NA
                                           NΑ
                                                NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                         NA
          sdc phi
                      phi
Basevec 0.58 3.88 11.34 11.46
Trial 1
           NA
                NA
                       NA
Trial 2 0.58 3.88 11.34 11.46
Trial 3 0.58 3.88 11.34 11.46
Trial 4 0.58 3.88 11.34 11.46
Trial 5 0.58 3.88 11.34 11.46
Trial 6
           NA
                NA
                       NA
                             NA
Trial 7
                NA
                             NA
           NA
Trial 8
           NA
                NA
                       NA
                             NA
```

```
Trial 9
           NA
                 NA
                       NA
                              NA
Trial 10
                 NΑ
                       NΑ
                              NΑ
           NA
Trial 11
           NA
                 NA
                       NA
                              NA
Trial 12 0.58 3.88 11.34 11.46
Trial 13 0.58 3.88 11.34 11.46
Trial 14
           NA
                 NA
                       NA
Trial 15 0.58 3.88 11.34 11.46
Trial 16 0.58 3.88 11.34 11.46
Trial 17 0.58 3.88 11.34 11.46
Trial 18 0.58 3.88 11.34 11.46
Trial 19
           NA
                 NA
                       NA
                              NA
Trial 20
                       NA
                              NA
           NA
                 NA
Trial 21
           NA
                 NA
                       NA
                              NA
Trial 22
           NA
                 NA
                       NA
                              NA
Trial 23
                       NA
                              NA
           NA
                 NA
Trial 24
           NA
                 NA
                       NA
                              NA
Trial 25
                              NA
           NA
                 NA
                       NA
Trial 26 0.58 3.88 11.34 11.46
Trial 27
           NA
                 NΑ
                       NΑ
                              NΑ
Trial 28
           NA
                 NA
                       NA
                              NA
Trial 29 0.58 3.88 11.34 11.46
Trial 30
           NA
                 NA
                       NA
```

Scenario 2

Model Fit

In this second configuration of the model, the uncertainty levels were also acceptable and the estimated exploitable biomass was 2217.19 tonnes and the fishing mortality was 3.25 for 2023. Predicted catchabilities were estimated at 6.30, 8.77 and 5.31 for PELAGO, ECOCADIZ and ECOCADIZ-RECLUTAS, respectively. Additionally, Kobe plot also shows that the stock has suboptimal biomass estimates as well as lower fishing mortality than fishing mortality at MSY.

```
res_sc_2 <- fit.spict(sc_2_data)
summary(res_sc_2)

Convergence: 0 MSG: relative convergence (4)
Objective function at optimum: 217.9459292
Euler time step (years): 1/16 or 0.0625
```

Priors

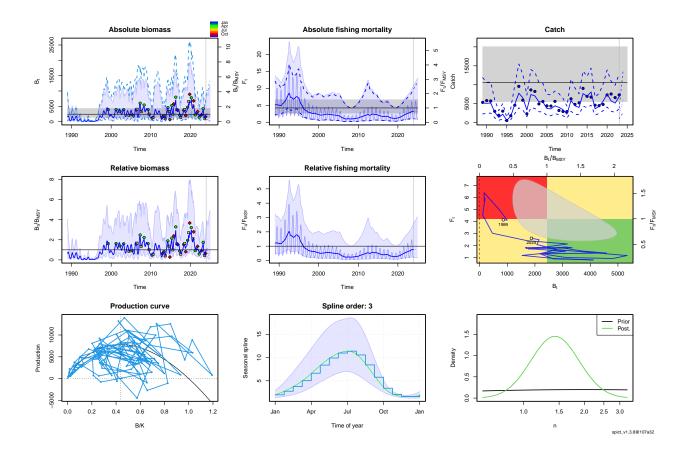
```
logn ~ dnorm[log(2), 2^2]
logalpha ~ dnorm[log(1), 2^2]
logbeta ~ dnorm[log(1), 2^2]
```

Nobs C: 140, Nobs I1: 21, Nobs I2: 14,

Model parameter estimates w 95% CI

```
cilow
           estimate
                                         ciupp
                                                  log.est
alpha1
          0.1469549
                       0.0250799 8.610786e-01 -1.9176298
alpha2
          0.1704595
                       0.0318803 9.114243e-01 -1.7692575
alpha3
          0.3977649
                       0.1155602 1.369130e+00 -0.9218942
beta
          1.6934230
                       0.8885506 3.227370e+00 0.5267520
                       1.1853627 1.521391e+01 1.4461294
          4.2466456
r
```

```
2.5087730 1.404950e+01 1.7811903
          5.9369191
rc
rold
          9.8624104
                       3.7767789 2.575399e+01 2.2887306
       7831.8636127 5312.1014581 1.154686e+04 8.9659558
m
K
       6060.4068303 2290.4188151 1.603573e+04 8.7095322
q1
          6.3010912
                       2.3609741 1.681668e+01 1.8407228
          8.7714196
                       2.3392162 3.289042e+01 2.1714987
q2
          5.3134927
                     1.5229434 1.853858e+01 1.6702494
q3
                       0.8348883 2.451328e+00 0.3580863
n
          1.4305890
 sdb
          1.1795620
                       0.6017959 2.312024e+00 0.1651432
sdf
                       0.1752830 6.781157e-01 -1.0648955
          0.3447639
sdi1
          0.1733424
                       0.0386606 7.772137e-01 -1.7524866
                       0.0431220 9.375297e-01 -1.6041144
sdi2
          0.2010675
 sdi3
          0.4691883
                       0.2028282 1.085341e+00 -0.7567511
sdc
          0.5838311
                       0.4469616 7.626130e-01 -0.5381435
          3.8811312
                     1.8075853 8.333316e+00 1.3561267
phi1
phi2
         11.3374494
                       6.3114390 2.036584e+01 2.4281114
         11.4590398
                       5.8278906 2.253124e+01 2.4387789
phi3
Deterministic reference points (Drp)
         estimate
                       cilow
                                   ciupp log.est
Bmsyd 2638.359567 1132.275821 6147.74340 7.877913
         2.968459
                     1.254387
                                  7.02475 1.088043
MSYd 7831.863613 5312.101458 11546.85921 8.965956
Stochastic reference points (Srp)
          estimate
                         cilow
                                      ciupp log.est rel.diff.Drp
Bmsys 2434.171731 1376.685553 4303.954524 7.797362 -0.08388391
Fmsys
          4.225844
                      2.677389
                                   6.669839 1.441219
                                                      0.29754632
MSYs 10543.172099 5544.367419 20048.901799 9.263234
                                                      0.25716250
States w 95% CI (inp$msytype: s)
                   estimate
                                  cilow
                                              ciupp
                                                       log.est
B_2023.94
               2217.1929789 622.8802453 7892.279043 7.7039973
F_2023.94
                  3.2509177
                            1.0836816
                                         9.752372 1.1789373
                  0.9108614
                              0.2860864
                                           2.900063 -0.0933646
B_2023.94/Bmsy
F 2023.94/Fmsv
                  0.7692943
                             0.2321613
                                           2.549149 -0.2622816
Predictions w 95% CI (inp$msytype: s)
                 prediction
                                   cilow
                                                ciupp
                                                         log.est
               2277.6312923 395.5390189 13115.278281 7.7308913
B 2025.00
                  3.2509192
F_2025.00
                               0.8852964
                                            11.937782 1.1789378
B 2025.00/Bmsy
                  0.9356905
                               0.1789278
                                             4.893129 -0.0664706
F 2025.00/Fmsy
                  0.7692947
                               0.1924187
                                             3.075660 -0.2622812
Catch 2024.00 6150.3446013 2717.8426494 13917.928149 8.7242634
E(B_inf)
               2993.6033459
                                      NA
                                                   NA 8.0042331
plot(res_sc_2)
```



Model Diagnostics

According to the diagnostic checklist, the model meets all requirements except normality of catch residuals, as in Scenario 1.

• 1- The assessment converged:

```
# if 0 => OK
res_sc_2$opt$convergence
```

[1] 0

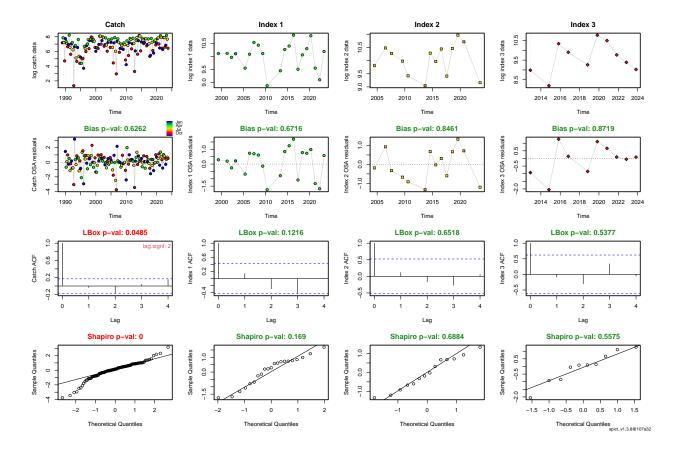
• 2- All variance parameters of the model parameters are finite:

```
# if TRUE => OK
all(is.finite(res_sc_2$sd))
```

[1] TRUE

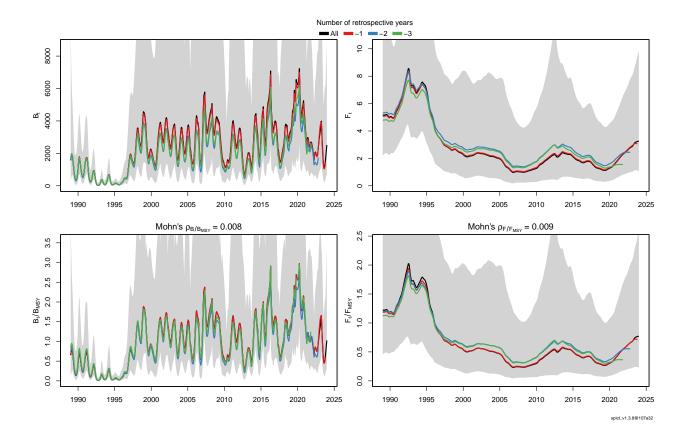
 $\bullet\,$ 3- No violation of model assumptions:

```
res_sc_2 <- calc.osa.resid(res_sc_2)
plotspict.diagnostic(res_sc_2)</pre>
```



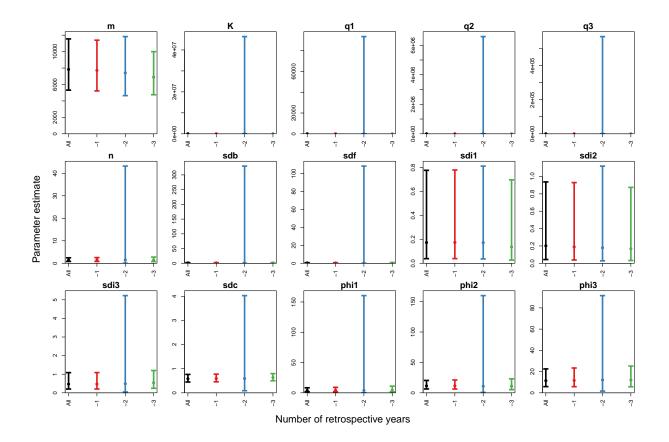
• 4- Consistent patterns in the retrospective analysis:

```
# if -0.2 < mohns_rho < 0.2 => OK
retro_sc_2 <- retro(res_sc_2, nretroyear = 3)
plotspict.retro(retro_sc_2)</pre>
```



FFmsy BBmsy 0.009121556 0.008218423

plotspict.retro.fixed(retro_sc_2)



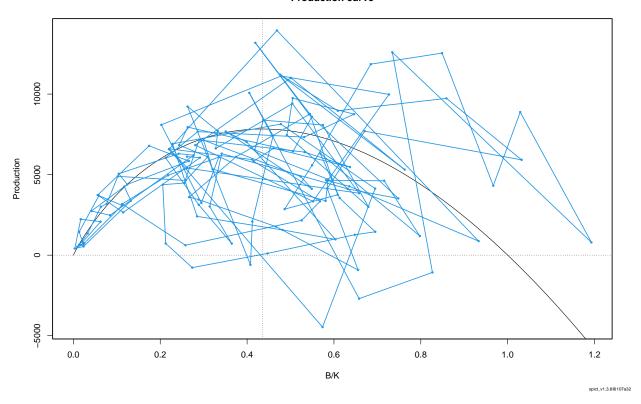
• 5- Realistic production curve:

```
# if between 0.1 and 0.9 => OK
calc.bmsyk(res_sc_2)
```

[1] 0.4353436

plotspict.production(res_sc_2)

Production curve



• 6- High assessment uncertainty:

```
\begin{tabular}{ll} \# \ Main \ variance \ parameters \ (logsdb, \ logsdc, \ logsdi, \ logsdf) \ should \ not \ be \ unreallistically \ high: \\ \begin{tabular}{ll} \verb{get.par("logsdb", res_sc_2)} \ \end{tabular}
```

ll est ul sd cv logsdb -0.5078369 0.1651432 0.8381233 0.3433635 2.079187

```
get.par("logsdc", res_sc_2)
```

ll est ul sd cv logsdc -0.8052825 -0.5381435 -0.2710046 0.1362979 -0.2532742

get.par("logsdi", res_sc_2)

ll est ul sd cv logsdi -3.252933 -1.7524866 -0.25203991 0.7655481 -0.4368353 logsdi -3.143722 -1.6041144 -0.06450683 0.7855285 -0.4896961 logsdi -1.595396 -0.7567511 0.08189393 0.4278880 -0.5654276

get.par("logsdf", res_sc_2)

ll est ul sd cv logsdf -1.741354 -1.064895 -0.3884374 0.345138 -0.3241051

calc.om(res_sc_2) # if order of magnitude < 2 => OK)

```
lower est upper CI range order magnitude
B/Bmsy 0.29 0.91 2.90 2.61 1
F/Fmsy 0.06 0.21 0.73 0.67 1
```

• 7- Initial values do not influence the parameter estimates:

check_sc_2\$check.ini\$resmat # Trials that converged should have same or similar estimates.

```
Distance
                                  K
                                                      n sdb sdf sdi sdi
                         \mathbf{m}
                                      q
                                            q
                                                 q
             0.00 7831.86 6060.41 6.3 8.77 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Basevec
Trial 1
             0.00
                        NA
                                 NA
                                     NA
                                          NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                      NA
Trial 2
             0.13 7831.78 6060.50 6.3 8.77 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 3
             0.00
                        NA
                                 NA
                                     NA
                                           NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                      NA
                                                                         NA
Trial 4
             0.15 7831.77 6060.52 6.3 8.77 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 5
             0.00
                        NA
                                     NA
                                          NA
                                                NA
                                                     NA
                                                           NA
                                                                      NA
                                 NA
                                                                NA
Trial 6
             0.00
                        NA
                                 NA
                                     NA
                                           NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                      NA
                                                                          NA
                                                                               NΑ
Trial 7
             0.13 7831.77 6060.51 6.3 8.77 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 8
             0.00
                        NA
                                 NA
                                     NA
                                           NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                      NA
                                                                          NA
Trial 9
             0.00
                        NA
                                 NA
                                     NA
                                          NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                      NA
                                                                          NA
                                                                               NA
Trial 10
             0.16 7831.76 6060.53 6.3 8.77 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 11
             0.00
                        NA
                                 NA
                                     NA
                                           NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                      NA
                                                                          NA
Trial 12
             0.32 7831.73 6060.70 6.3 8.77 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 13
             0.00
                        NA
                                 NA
                                     NA
                                          NΑ
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                     NA
                                                                          NA
                                                                               NΑ
Trial 14
             0.00
                        NA
                                 NA
                                     NA
                                           NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                      NA
                                                                          NA
                                                                               NA
Trial 15
             0.00
                        NA
                                 NA
                                     NA
                                           NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                     NA
                                                                          NA
                                                                               NΑ
             0.00
Trial 16
                        NA
                                 NA
                                     NA
                                           NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                      NA
Trial 17
             0.14 7831.77 6060.50 6.3 8.77 5.31 1.43 1.18 0.34 0.17 0.2 0.47
             0.13 7831.77 6060.49 6.3 8.77 5.31 1.43
Trial 18
                                                         1.18 0.34 0.17
                                                                         0.2 0.47
Trial 19
             0.00
                        NA
                                 NA
                                     NA
                                          NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                     NA
                                                                          NA
                                                                               MΔ
Trial 20
             0.00
                        NA
                                 NA
                                     NA
                                           NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                      NA
                                                                          NA
Trial 21
             0.00
                        NA
                                 NA
                                     NA
                                          NA
                                                                     NA
                                                                          NA
                                                                               NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
Trial 22
             0.00
                        NA
                                 NA
                                     NA
                                          NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                     NA
                                                                          NA
                                                                               NA
Trial 23
             0.00
                        NA
                                 NA
                                     NA
                                           NA
                                                                     NA
                                                                          NA
                                                                               NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
Trial 24
             0.00
                        NA
                                 NA
                                     NA
                                          NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                     NA
                                                                          NA
                                                                               NA
Trial 25
             0.00
                        NA
                                 NA
                                     NA
                                                                          NA
                                           NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                      NA
                                                                               NΑ
Trial 26
             0.00
                        NA
                                 NA
                                     NA
                                          NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                     NA
                                                                          NA
                                                                               NA
Trial 27
             0.00
                        NA
                                 NA
                                     NA
                                           NA
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                      NA
                                                                         NA
Trial 28
             0.14 7831.77 6060.50 6.3 8.77 5.31 1.43 1.18 0.34 0.17 0.2 0.47
             0.14 7831.77 6060.52 6.3 8.77 5.31 1.43 1.18 0.34 0.17 0.2 0.47
Trial 29
             0.00
Trial 30
                        NA
                                 NA NA
                                          NΑ
                                                NA
                                                     NA
                                                           NA
                                                                NA
                                                                      NΑ
                                                                         NA
          sdc phi
                      phi
                             phi
Basevec
         0.58 3.88 11.34 11.46
Trial 1
           NA
                 NA
                       NA
Trial 2 0.58 3.88 11.34 11.46
Trial 3
           NA
                 NA
Trial 4 0.58 3.88 11.34 11.46
Trial 5
           NA
                 NA
                       NA
Trial 6
           NA
                 NA
                       NA
Trial 7 0.58 3.88 11.34 11.46
Trial 8
           NA
                 NA
                       NA
                              NA
```

```
Trial 9
           NA
                 NA
                              NA
Trial 10 0.58 3.88 11.34 11.46
Trial 11
           NA
                 NA
                       NA
                              NA
Trial 12 0.58 3.88 11.34 11.46
Trial 13
           NA
                 NA
                       NA
                              NA
Trial 14
           NA
                 NA
                       NA
                              NA
Trial 15
           NA
                 NA
                       NA
                              NA
Trial 16
           NA
                 NA
                       NA
                              NA
Trial 17 0.58 3.88 11.34 11.46
Trial 18 0.58 3.88 11.34 11.46
Trial 19
           NA
                 NA
                       NA
                              NA
Trial 20
                       NA
                              NA
           NA
                 NA
Trial 21
           NA
                 NA
                       NA
                              NA
Trial 22
           NA
                 NA
                       NA
                              NA
Trial 23
                              NA
           NA
                 NA
                       NΑ
Trial 24
           NA
                 NA
                       NA
                              NA
Trial 25
           NA
                 NA
                       NA
                              NA
Trial 26
           NA
                 NA
                       NA
                              NA
Trial 27
                              NA
           NA
                 NΑ
                       NΑ
Trial 28 0.58 3.88 11.34 11.46
Trial 29 0.58 3.88 11.34 11.46
Trial 30
                 NA
                       NA
           NA
```

estimate

0.1492717

0.1587590

0.4369255

0.1322751

cilow

Scenario 3

Model Fit

alpha1

alpha2

alpha3

alpha4

Results when BOCADEVA data is included in the model indicate that uncertainty levels are higher. According to the estimated exploitable biomass, the model estimated an exploitable biomass of 2513.81 tonnes and a fishing mortality of 2.75. Predicted catchabilities were 5.52, 7.33, 4.45 and 8.86 for PELAGO, ECOCADIZ, ECOCADIZ-RECLUTAS and BOCADEVA, respectively. Moreover, as in the two previous scenarios, Kobe plot determines that the stock biomass is in suboptimal levels and the fishing mortality is lower than fishing mortality at MSY.

```
res_sc_3 <- fit.spict(sc_3_data)
summary(res_sc_3)

Convergence: 0 MSG: relative convergence (4)
Objective function at optimum: 220.8719401
Euler time step (years): 1/16 or 0.0625
Nobs C: 140, Nobs I1: 21, Nobs I2: 14, Nobs I3: 10, Nobs I4: 7

Priors
    logn ~ dnorm[log(2), 2^2]
logalpha ~ dnorm[log(1), 2^2]
logbeta ~ dnorm[log(1), 2^2]</pre>
Model parameter estimates w 95% CI
```

ciupp

0.0284465 7.832967e-01 -1.9019871

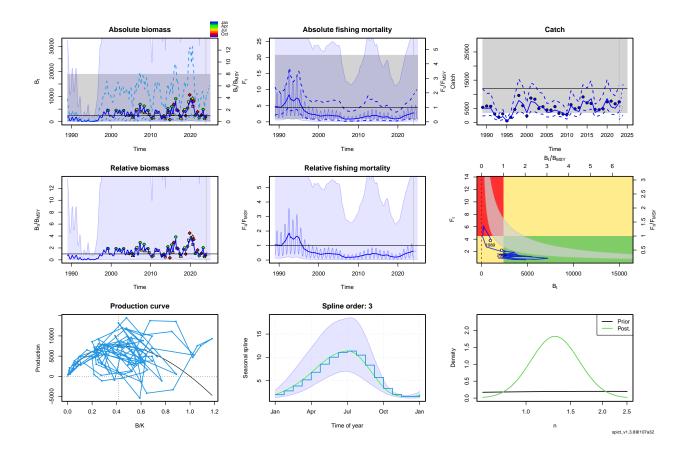
0.0458762 5.494010e-01 -1.8403677

0.1556105 1.226806e+00 -0.8279926

0.0261861 6.681678e-01 -2.0228717

log.est

```
beta
           1.6438885
                        0.9015020 2.997630e+00 0.4970645
           3.2607914
                        1.2203602 8.712805e+00 1.1819699
 r
                        2.5258119 9.960907e+00 1.6126153
rc
           5.0159124
rold
          10.8628311
                        3.2319933 3.651032e+01 2.3853470
        7589.0191643 5237.2155476 1.099691e+04 8.9344576
K
        7255.2039430 3033.3622138 1.735302e+04 8.8894743
                        2.1782544 1.397403e+01 1.7078623
 q1
           5.5171546
                        2.1296352 2.525927e+01 1.9925720
 q2
           7.3343738
 q3
           4.4537980
                        1.3198273 1.502948e+01
                                                1.4937572
 q4
           8.8623509
                        2.5640604 3.063160e+01 2.1818121
 n
           1.3001788
                        0.8470871 1.995621e+00 0.2625018
 sdb
           1.0674449
                        0.6589232 1.729243e+00 0.0652678
 sdf
           0.3632356
                        0.2025167 6.515024e-01 -1.0127036
 sdi1
           0.1593393
                        0.0352388 7.204843e-01 -1.8367192
 sdi2
           0.1694665
                        0.0549095 5.230222e-01 -1.7750998
 sdi3
           0.4663939
                        0.2135365 1.018670e+00 -0.7627247
 sdi4
           0.1411963
                        0.0300516 6.634054e-01 -1.9576039
 sdc
           0.5971188
                        0.4864066 7.330305e-01 -0.5156391
           4.0426228
                        1.9031506 8.587234e+00 1.3968937
phi1
                        6.4915431 2.022105e+01 2.4386122
phi2
          11.4571298
phi3
          11.2542578
                        5.7112408 2.217702e+01 2.4207465
Deterministic reference points (Drp)
                         cilow
          estimate
                                      ciupp
                                              log.est
Bmsyd 3025.977578 1375.735821 6655.740271 8.0149895
          2.507956
                      1.262906
                                   4.980453 0.9194682
MSYd 7589.019164 5237.215548 10996.914554 8.9344576
Stochastic reference points (Srp)
          estimate
                                      ciupp log.est rel.diff.Drp
                          cilow
Bmsys 2373.58976 298.3070405 18886.34053 7.772159
                                                       -0.2748528
Fmsvs
           4.50693
                      0.9803418
                                   20.71973 1.505616
                                                        0.4435334
MSYs 12001.70964 3424.8397796 42057.74390 9.392804
                                                        0.3676718
States w 95% CI (inp$msytype: s)
                    estimate
                                   cilow
                                                        log.est
                                               ciupp
B 2023.94
                2513.8097970 695.7095338 9083.158112 7.8295547
F 2023.94
                   2.7535907
                               0.9059081
                                            8.369791 1.0129058
B_2023.94/Bmsy
                   1.0590751
                               0.0597899
                                           18.759704 0.0573960
F 2023.94/Fmsy
                   0.6109681
                               0.0562845
                                            6.632060 -0.4927105
Predictions w 95% CI (inp$msytype: s)
                  prediction
                                    cilow
                                                 ciupp
                                                          log.est
B 2025.00
                2568.9390262 457.4582694 14426.338228 7.8512483
F_2025.00
                                0.7267465
                   2.7535921
                                             10.433170 1.0129063
 B_2025.00/Bmsy
                                0.0492211
                                             23.798247 0.0790895
                   1.0823012
F_2025.00/Fmsy
                                0.0504034
                                              7.405899 -0.4927100
                   0.6109684
 Catch_2024.00 6120.2249729 2689.7488405 13925.892691
                                                        8.7193541
 E(B_{inf})
                4158.0545086
                                       NA
                                                        8.3328026
plot(res sc 3)
```



Model Diagnostics

In relation to the diagnostic checklist, the model meets all requirements except normality of catch residuals and order of magnitudes of B/BMSY and F/FMSY. In this sense, B/BMSY and F/FMSY orders of magnitude were 3 and 2, respectively. Moreover, the retrospective analysis could not converge with peel -3.

• 1- The assessment converged:

```
# if 0 => OK
res_sc_3$opt$convergence
```

[1] 0

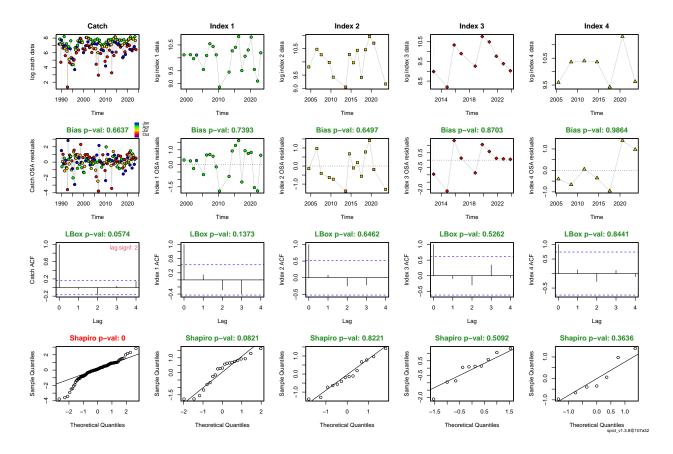
• 2- All variance parameters of the model parameters are finite:

```
# if TRUE => OK
all(is.finite(res_sc_3$sd))
```

[1] TRUE

• 3- No violation of model assumptions:

```
res_sc_3 <- calc.osa.resid(res_sc_3)
plotspict.diagnostic(res_sc_3)</pre>
```



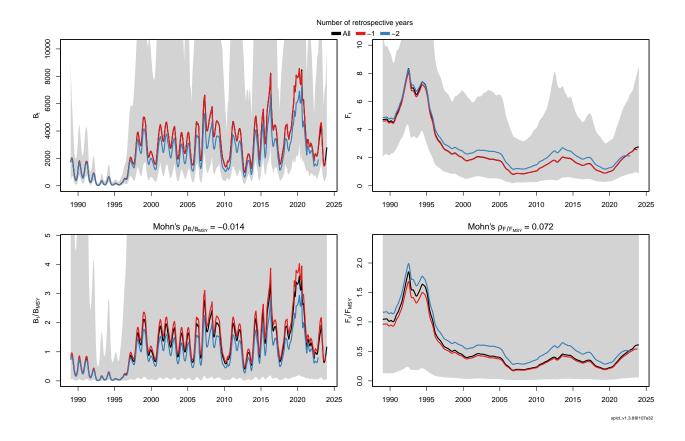
• 4- Consistent patterns in the retrospective analysis:

```
# if -0.2 < mohns_rho < 0.2 => OK
retro_sc_3 <- retro(res_sc_3, nretroyear = 3)</pre>
```

Error in calc.osa.resid(rep) :
 Could not calculate OSA residuals because estimation did not converge.

```
plotspict.retro(retro_sc_3)
```

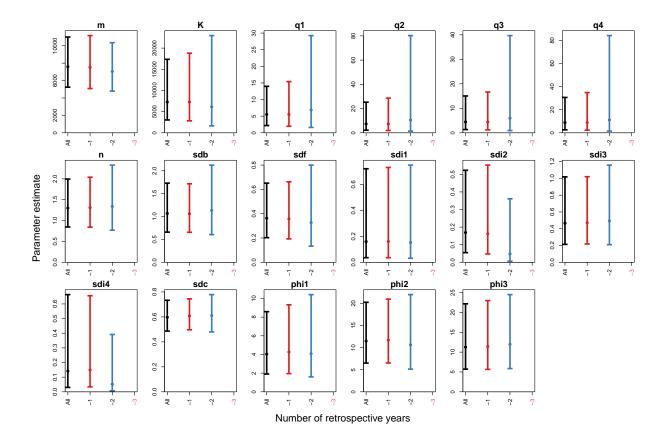
Excluded 1 retrospective runs that was not converged: 3



FFmsy BBmsy 0.07179524 -0.01381742

plotspict.retro.fixed(retro_sc_3)

Excluded 1 retrospective run that was not converged: 3



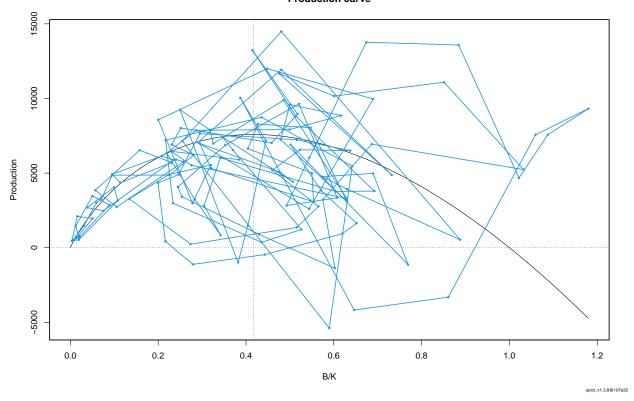
• 5- Realistic production curve:

```
# if between 0.1 and 0.9 => OK
calc.bmsyk(res_sc_3)
```

[1] 0.4170768

```
plotspict.production(res_sc_3)
```

Production curve



• 6- High assessment uncertainty:

```
# Main variance paramterers (logsdb, logsdc, logsdi, logsdf) should not be unreallistically high:
get.par("logsdb", res_sc_3)
```

ll est ul sd cv logsdb -0.4171483 0.06526784 0.547684 0.2461352 3.771156

get.par("logsdc", res_sc_3)

ll est ul sd cv logsdc -0.7207103 -0.5156391 -0.3105679 0.1046301 -0.2029134

get.par("logsdi", res_sc_3)

11 est ul sd cv logsdi -3.345607 -1.8367192 -0.32783169 0.7698547 -0.4191467 logsdi -2.902068 -1.7750998 -0.64813136 0.5749945 -0.3239223 logsdi -1.543948 -0.7627247 0.01849811 0.3985904 -0.5225875 logsdi -3.504839 -1.9576039 -0.41036897 0.7894201 -0.4032583

get.par("logsdf", res_sc_3)

ll est ul sd cv logsdf -1.596933 -1.012704 -0.4284742 0.2980817 -0.2943425

calc.om(res_sc_3) # if order of magnitude < 2 => OK)

```
lower est upper CI range order magnitude
B/Bmsy 0.06 1.06 18.76 18.70 3
F/Fmsy 0.01 0.16 1.87 1.85 2
```

• 7- Initial values do not influence the parameter estimates:

check_sc_3\$check.ini\$resmat # Trials that converged should have same or similar estimates.

```
Distance
                                                                      n sdb sdf
                          m
                                   K
                                                                 q
                                          q
                                                         q
             0.00
                   7589.02 7255.20
                                                             8.86 1.30 1.07 0.36
Basevec
                                       5.52
                                              7.33
                                                      4.45
Trial 1
             0.01
                    7589.02 7255.21
                                       5.52
                                              7.33
                                                      4.45
                                                             8.86 1.30 1.07 0.36
Trial 2
             0.01
                    7589.03 7255.21
                                              7.33
                                                      4.45
                                                             8.86 1.30 1.07 0.36
                                       5.52
Trial 3
             0.02
                    7589.01 7255.22
                                       5.52
                                              7.33
                                                      4.45
                                                             8.86 1.30 1.07 0.36
Trial 4
             0.00
                    7589.02 7255.20
                                       5.52
                                              7.33
                                                      4.45
                                                             8.86 1.30 1.07 0.36
Trial 5
             0.00
                                                               NA
                                                                     NA
                                                                          NA
                         NA
                                  NA
                                         NA
                                                NA
                                                        NA
Trial 6
             0.06
                    7588.97 7255.24
                                       5.52
                                              7.33
                                                      4.45
                                                             8.86 1.30 1.07 0.36
Trial 7
                    7589.02 7255.24
                                              7.33
                                                             8.86 1.30 1.07 0.36
             0.04
                                       5.52
                                                      4.45
Trial 8
             0.00
                                         NA
                                                                NA
                                                                     NA
                                                                          NA
                                                                               NA
                         NA
                                  NA
                                                 NA
                                                        NA
             0.00
Trial 9
                         NA
                                  NA
                                         NA
                                                NA
                                                        NA
                                                               NA
                                                                     NA
                                                                          NA
                                                                               NA
Trial 10
          6747.17 10001.28
                                     119.93 223.10 584.88 232.28 1.12 0.15 0.52
                             989.54
Trial 11
             0.00
                         NA
                                  NA
                                         NA
                                                 NA
                                                        NA
                                                               NA
                                                                     NA
                                                                          NA
Trial 12
             0.00
                                                                     NA
                                                                               NA
                         NA
                                  NA
                                         NA
                                                 NA
                                                        NA
                                                                NA
                                                                          NA
Trial 13
             0.02
                    7589.01 7255.23
                                       5.52
                                              7.33
                                                      4.45
                                                             8.86 1.30 1.07 0.36
Trial 14
                    7589.00 7255.20
                                                             8.86 1.30 1.07 0.36
             0.02
                                       5.52
                                              7.33
                                                      4.45
Trial 15
             0.05
                    7588.98 7255.18
                                       5.52
                                              7.33
                                                      4.45
                                                             8.86 1.30 1.07 0.36
Trial 16
             0.17
                    7589.02 7255.03
                                       5.52
                                              7.33
                                                      4.45
                                                             8.86 1.30 1.07 0.36
Trial 17
             0.00
                         NA
                                         NA
                                                NA
                                                               NA
                                                                     NA
                                                                          NA
                                                                               NA
                                  NA
                                                        NA
Trial 18
             0.00
                         NA
                                         NA
                                                NA
                                                               NA
                                                                     NA
                                                                          NA
                                                                               NA
                                  NA
                                                        NA
Trial 19
             0.00
                                                                     NΑ
                         NA
                                  NA
                                         NA
                                                NA
                                                        NA
                                                               NA
                                                                          NA
                                                                               NΔ
Trial 20
             0.06
                    7589.04 7255.15
                                       5.52
                                              7.33
                                                      4.45
                                                             8.86 1.30 1.07 0.36
Trial 21
             0.00
                         NA
                                                 NA
                                                               NA
                                                                     NA
                                                                          NA
                                  NA
                                         NA
                                                        NA
                                                                               NΑ
                                                             8.86 1.30 1.07 0.36
Trial 22
             0.01
                    7589.03 7255.20
                                       5.52
                                              7.33
                                                      4.45
Trial 23
             0.01
                   7589.03 7255.20
                                              7.33
                                                      4.45
                                                             8.86 1.30 1.07 0.36
                                       5.52
Trial 24
             0.10 7589.04 7255.11
                                                             8.86 1.30 1.07 0.36
                                       5.52
                                              7.33
                                                      4.45
Trial 25
             0.03
                   7589.01 7255.23
                                              7.33
                                                             8.86 1.30 1.07 0.36
                                       5.52
                                                      4.45
Trial 26
                                                             8.86 1.30 1.07 0.36
             0.01
                   7589.02 7255.19
                                       5.52
                                              7.33
                                                      4.45
Trial 27
             0.00
                         NA
                                  NA
                                         NA
                                                NA
                                                        NA
                                                               NA
                                                                     NA
                                                                          NA
Trial 28
             0.00
                         NA
                                  NA
                                         NA
                                                 NA
                                                        NA
                                                               NA
                                                                     NA
                                                                          NA
                                                                               NA
Trial 29
             0.00
                                  NA
                                         NA
                                                        NA
                         NA
                                                 NA
                                                               NA
                                                                     NA
                                                                          NA
                                                                               NA
Trial 30
             0.00
                         NA
                                  NA
                                         NA
                                                 NA
                                                        NA
                                                               NA
                                                                     NA
                                                                          NA
                                                                               NA
          sdi sdi sdi sdc phi
                                           phi
         0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Basevec
Trial 1
        0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Trial 2 0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Trial 3 0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Trial 4 0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Trial 5
           NA
                NA
                      NA
                           NA
                                 NA
                                      NA
                                            NA
Trial 6 0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
        0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Trial 7
Trial 8
                           NA
           NA
                NA
                      NA
                                 NA
                                      NA
                                            NA
                                                   NΑ
```

```
Trial 9
           NA
                 NA
                      NA
                            NA
                                 NA
                                      NA
                                             NA
                                                   NA
                                                 0.96
Trial 10 0.08 0.28 0.60 0.06 0.35 0.62
                                          0.37
Trial 11
           NA
                 NA
                      NA
                            NA
                                 NA
                                      NA
                                             NΑ
                                                   NΑ
Trial 12
                                             NA
           NA
                 NA
                      NA
                            NA
                                 NA
                                      NA
                                                   NA
Trial 13 0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Trial 14 0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Trial 15 0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Trial 16 0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Trial 17
           NA
                 NA
                      NA
                            NA
                                 NA
                                      NA
                                             NA
                                                   NA
Trial 18
           NA
                 NA
                      NA
                            NA
                                 NA
                                      NA
                                             NA
                                                   NA
Trial 19
           NA
                 NA
                      NA
                            NA
                                 NA
                                      NA
                                             NA
                                                   NA
Trial 20 0.16 0.17
                                                11.25
                    0.47 0.14
                               0.60
                                    4.04
                                         11.46
Trial 21
           NA
                 NA
                      NA
                            NA
                                 NA
                                      NA
                                             NA
                                                   NA
Trial 22 0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Trial 23 0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Trial 24 0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Trial 25 0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Trial 26 0.16 0.17 0.47 0.14 0.60 4.04 11.46 11.25
Trial 27
           NA
                 NA
                      NA
                           NA
                                 NA
                                      NΑ
                                             NΑ
                                                   NΑ
Trial 28
           NA
                 NA
                      NA
                            NA
                                 NA
                                      NA
                                             NA
                                                   NA
Trial 29
           NA
                 NA
                      NA
                           NA
                                 NA
                                      NA
                                             NA
                                                   NA
Trial 30
           NA
                 NA
                      NA
                            NA
                                 NA
                                      NA
                                             NA
                                                   NA
```

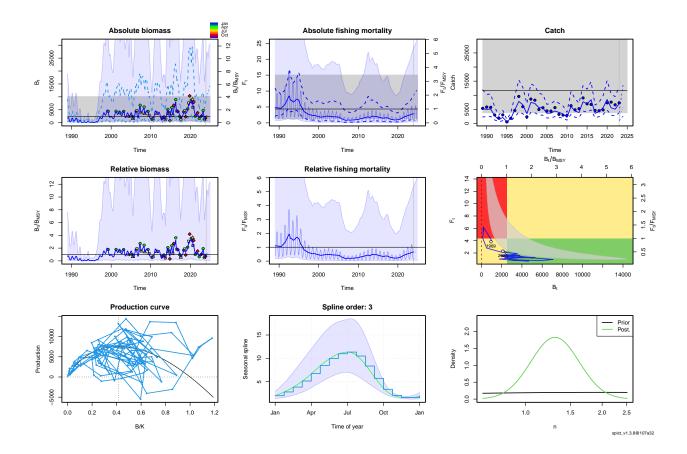
Scenario 4

Model Fit

Results when BOCADEVA data and it's uncertainty levels were included in the model also show high uncertainty levels of model estimations. According to the estimated exploitable biomass, the model estimated an exploitable biomass of 2440.36 tonnes and a fishing mortality of 2.84. Predicted catchabilities were 5.62, 7.55, 4.58 and 9.08 for PELAGO, ECOCADIZ, ECOCADIZ-RECLUTAS and BOCADEVA, respectively. Kobe plot again defines stock biomass in suboptimal levels and the fishing mortality in lower levels than fishing mortality at MSY.

```
res_sc_4 <- fit.spict(sc_4_data)</pre>
summary(res_sc_4)
Convergence: 0 MSG: relative convergence (4)
Objective function at optimum: 220.42738
Euler time step (years): 1/16 or 0.0625
Nobs C: 140, Nobs I1: 21, Nobs I2: 14,
                                           Nobs I3: 10,
                                                         Nobs I4: 7
Priors
              dnorm[log(2), 2^2]
              dnorm[log(1), 2^2]
 logalpha
  logbeta
              dnorm[log(1), 2^2]
Model parameter estimates w 95% CI
            estimate
                                                   log.est
                             cilow
                                          ciupp
 alpha1
           0.1475009
                         0.0280514 7.755940e-01 -1.9139211
 alpha2
           0.1420530
                        0.0348073 5.797358e-01 -1.9515554
 alpha3
                         0.1500109 1.214133e+00 -0.8515084
           0.4267707
 alpha4
                        0.0532823 1.175625e+00 -1.3851760
           0.2502797
```

```
beta
           1.6429756
                        0.9033329 2.988233e+00 0.4965090
           3.3269404
                        1.2402004 8.924794e+00 1.2020531
 r
rc
           5.1036921
                        2.5632432 1.016200e+01 1.6299642
rold
          10.9532980
                        3.3277610 3.605269e+01 2.3936406
        7587.9997108 5250.7683247 1.096558e+04 8.9343233
K
       7120.5758661 2979.0337578 1.701981e+04 8.8707439
           5.6240096
                        2.2269346 1.420315e+01 1.7270449
 q1
                        2.1855796 2.607020e+01 2.0213370
 q2
           7.5484102
 q3
           4.5753142
                        1.3554758 1.544365e+01 1.5206754
 q4
           9.0768836
                        2.6402405 3.120542e+01 2.2057309
n
           1.3037387
                        0.8497476 2.000282e+00 0.2652361
                        0.6654948 1.757090e+00 0.0782173
 sdb
           1.0813576
 sdf
           0.3624569
                        0.2023657 6.491961e-01 -1.0148497
 sdi1
                        0.0352494 7.217332e-01 -1.8357038
           0.1595012
 sdi2
           0.1536100
                        0.0420065 5.617230e-01 -1.8733381
 sdi3
           0.4614917
                        0.2089301 1.019358e+00 -0.7732912
 sdi4
           0.2706419
                        0.0617029 1.187093e+00 -1.3069587
 sdc
           0.5955078
                        0.4836252 7.332735e-01 -0.5183407
                        1.8849893 8.531793e+00 1.3888608
phi1
           4.0102790
                        6.4251603 2.014002e+01 2.4314653
phi2
          11.3755379
phi3
          11.3034089
                        5.7492505 2.222325e+01 2.4251043
Deterministic reference points (Drp)
                         cilow
          estimate
                                      ciupp log.est
Bmsyd 2973.533507 1354.117240 6529.642530 7.997506
          2.551846
                      1.281622
                                   5.080999 0.936817
MSYd 7587.999711 5250.768325 10965.583711 8.934323
Stochastic reference points (Srp)
                                      ciupp log.est rel.diff.Drp
           estimate
                          cilow
Bmsys 2474.098015
                     603.346879 10145.34292 7.813631
                                                       -0.2018657
Fmsvs
           4.361733
                       1.263216
                                   15.06054 1.472870
                                                        0.4149468
MSYs 11695.277848 3760.353370 36374.11447 9.366940
                                                        0.3511912
States w 95% CI (inp$msytype: s)
                    estimate
                                   cilow
                                               ciupp
                                                        log.est
B 2023.94
                2440.3596567 676.2632860 8806.267289
                                                      7.7999007
F 2023.94
                   2.8432254
                               0.9420090
                                            8.581585 1.0449391
B_2023.94/Bmsy
                   0.9863634
                               0.1067080
                                            9.117520 -0.0137305
F 2023.94/Fmsy
                   0.6518568
                               0.0793537
                                            5.354723 -0.4279304
Predictions w 95% CI (inp$msytype: s)
                  prediction
                                    cilow
                                                 ciupp
                                                          log.est
B 2025.00
                2485.4785739 436.3576031 14157.204316 7.8182205
F_2025.00
                                             10.700397 1.0449396
                   2.8432268
                                0.7554802
B_2025.00/Bmsy
                                             12.328024 0.0045893
                   1.0045999
                                0.0818640
F_2025.00/Fmsy
                                0.0701220
                                              6.059692 -0.4279299
                   0.6518571
Catch_2024.00 6097.2496810 2672.7504817 13909.436712
                                                        8.7155931
 E(B_{inf})
                3921.6866360
                                       NA
                                                        8.2742771
plot(res sc 4)
```



Model Diagnostics

Diagnostic checklist determined that model met all requirements except normality of catch residuals and order of magnitude of F/FMSY. In this sense, F/FMSY order of magnitude was 2. Additionally, the retrospective analysis could not converge with peel -3.

• 1- The assessment converged:

```
# if 0 => OK
res_sc_4$opt$convergence
```

[1] 0

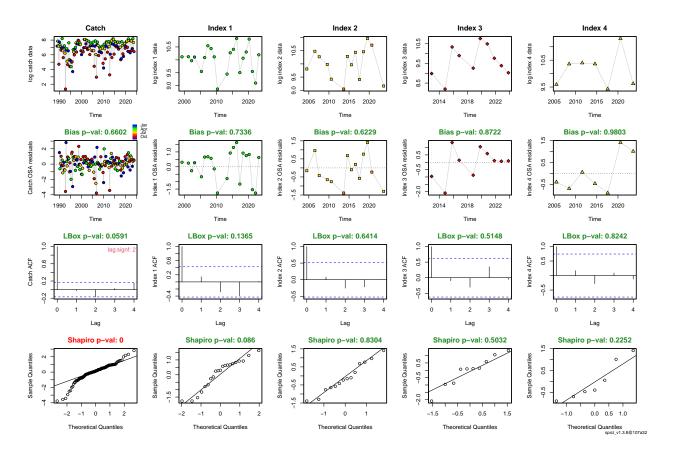
• 2- All variance parameters of the model parameters are finite:

```
# if TRUE => OK
all(is.finite(res_sc_4$sd))
```

[1] TRUE

• 3- No violation of model assumptions:

res_sc_4 <- calc.osa.resid(res_sc_4) plotspict.diagnostic(res_sc_4)</pre>

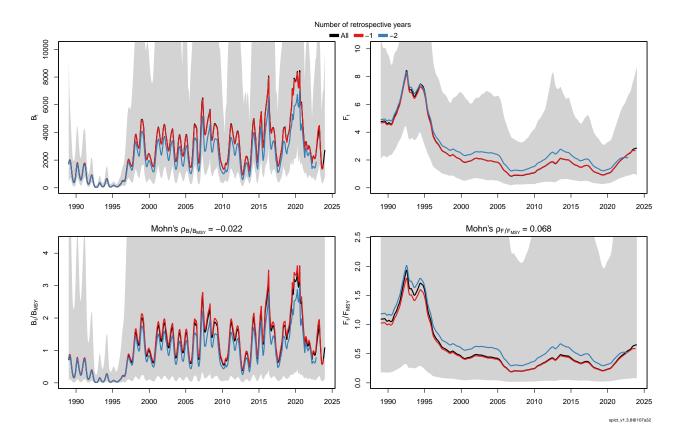


• 4- Consistent patterns in the retrospective analysis:

```
# if -0.2 < mohns_rho < 0.2 => OK
retro_sc_4 <- retro(res_sc_4, nretroyear = 3)</pre>
```

```
plotspict.retro(retro_sc_4)
```

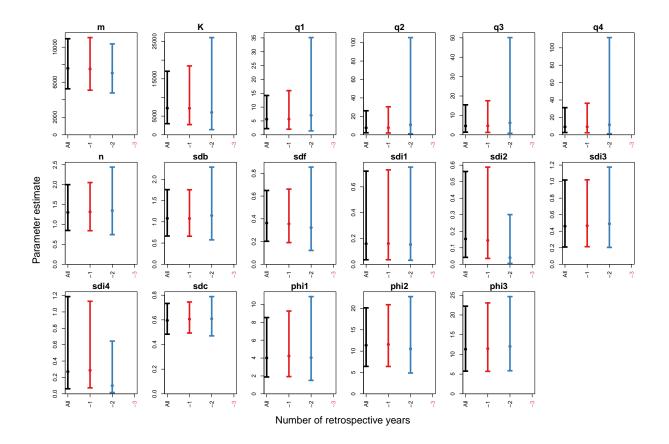
Excluded 1 retrospective runs that was not converged: 3



FFmsy BBmsy 0.06803314 -0.02170606

plotspict.retro.fixed(retro_sc_4)

Excluded 1 retrospective run that was not converged: 3



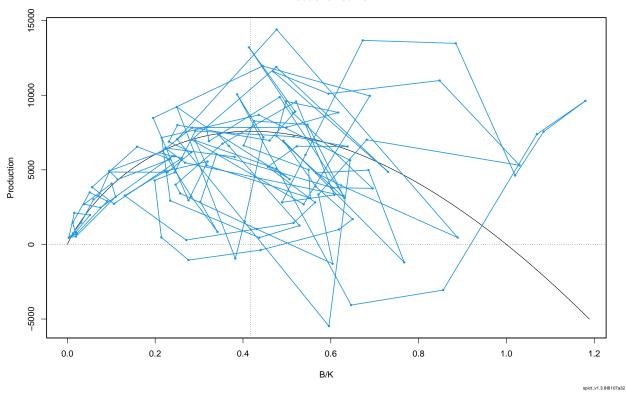
• 5- Realistic production curve:

```
# if between 0.1 and 0.9 => OK
calc.bmsyk(res_sc_4)
```

[1] 0.4175973

plotspict.production(res_sc_4)





• 6- High assessment uncertainty:

```
# Main variance paramterers (logsdb, logsdc, logsdi, logsdf) should not be unreallistically high:
get.par("logsdb", res_sc_4)
```

ll est ul sd cv logsdb -0.4072245 0.07821726 0.563659 0.2476789 3.166551

```
get.par("logsdc", res_sc_4)
```

get.par("logsdi", res_sc_4)

 11
 est
 ul
 sd
 cv

 logsdi
 -3.345308
 -1.8357038
 -0.32609972
 0.7702203
 -0.4195777

 logsdi
 -3.169930
 -1.8733381
 -0.57674647
 0.6615385
 -0.3531335

 logsdi
 -1.565755
 -0.7732912
 0.01917312
 0.4043259
 -0.5228638

 logsdi
 -2.785425
 -1.3069587
 0.17150763
 0.7543334
 -0.5771670

get.par("logsdf", res_sc_4)

ll est ul sd cv logsdf -1.597679 -1.01485 -0.4320205 0.2973673 -0.2930161

calc.om(res_sc_4) # if order of magnitude < 2 => OK)

```
lower est upper CI range order magnitude
B/Bmsy 0.11 0.99 9.12 9.01 1
F/Fmsy 0.02 0.18 1.52 1.50 2
```

• 7- Initial values do not influence the parameter estimates:

check_sc_4\$check.ini\$resmat # Trials that converged should have same or similar estimates.

```
Distance
                                                            n sdb sdf sdi
                         m
                                  K
                                       q
                                            q
                                                  q
                                                       q
                           7120.58 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
Basevec
             0.00
                   7588.00
Trial 1
             0.08
                   7588.02
                           7120.66 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
Trial 2
             0.10 7588.01 7120.67 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
Trial 3
             0.07
                   7588.01 7120.64 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
             0.12 7588.00 7120.70 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
Trial 4
Trial 5
             0.10 7588.03 7120.67 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
Trial 6
             0.10
                   7588.02 7120.67 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
Trial 7
             0.00
                        NA
                                 NA
                                      NA
                                            NA
                                                 NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                           NA
Trial 8
             0.00
                        NA
                                 NA
                                       NA
                                            NA
                                                 NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                           NA
Trial 9
             0.18
                  7588.04
                            7120.75 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
Trial 10
             0.00
                        NA
                                 NA
                                      NA
                                            NA
                                                 NA
                                                      NA
                                                           NA
                                                                NA
                           7120.70 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
Trial 11
             0.12 7588.01
Trial 12
             0.02 7588.02 7120.58 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
Trial 13
             0.10 7588.02 7120.68 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
Trial 14
                   7588.01
                            7120.66 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
             0.08
Trial 15
             0.12 7588.03
                           7120.69 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
             0.00
Trial 16
                        NA
                                 NA
                                       NA
                                            NA
                                                 NA
                                                      NA
                                                           NA
                                                                NA
Trial 17
             0.00
                        NA
                                 NA
                                      NA
                                                           NA
                                                                NA
                                                                           NA
                                            NA
                                                 NA
                                                      NA
                                                                     NA
Trial 18
             0.00
                                  NA
                                      NA
                                            NA
                                                           NA
                                                                NA
                                                                           NA
                        NA
                                                 NA
                                                      NA
             0.10 7588.02
Trial 19
                            7120.67 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
Trial 20
             0.00
                        NA
                                       NA
                                            NA
                                                 NA
                                                           NA
                                  NA
                                                      NA
Trial 21
             0.01 7587.99
                            7120.57 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
Trial 22 11314.52 12366.37 17376.57 2.00 2.14 1.34 2.58 1.68 0.99 0.41 0.15
Trial 23
             0.00
                        NA
                                  NA
                                       NA
                                            NA
                                                 NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
Trial 24
             0.13 7588.04
                            7120.70 5.62 7.55 4.58 9.08 1.30 1.08 0.36 0.16
Trial 25
             0.00
                                      NA
                        NA
                                 NA
                                            NA
                                                 NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                           NΑ
Trial 26
             0.13
                   7588.02
                            7120.71 5.62 7.55 4.58 9.08
                                                         1.30 1.08 0.36 0.16
Trial 27
             0.00
                        NA
                                 NA
                                      NA
                                            NA
                                                 NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                           NA
Trial 28
             0.00
                        NA
                                 NA
                                      NA
                                            NA
                                                 NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                           NA
Trial 29
             0.00
                        NA
                                 NA
                                      NA
                                            NA
                                                 NA
                                                      NA
                                                           NA
                                                                NA
                                                                     NA
                                                                           NA
Trial 30 11314.42 12366.25 17376.52 2.00 2.14 1.34 2.58 1.68 0.99 0.41 0.15
          sdi sdi sdc phi
                                    phi
        0.15 0.46 0.27 0.60 4.01 11.38 11.30
Basevec
Trial 1 0.15 0.46 0.27 0.60 4.01 11.38 11.30
Trial 2 0.15 0.46 0.27 0.60 4.01 11.38 11.30
Trial 3 0.15 0.46 0.27 0.60 4.01 11.38 11.30
Trial 4 0.15 0.46 0.27 0.60 4.01 11.38 11.30
Trial 5 0.15 0.46 0.27 0.60 4.01 11.38 11.30
Trial 6 0.15 0.46 0.27 0.60 4.01 11.38 11.30
Trial 7
           NA
                NA
                     NA
                          NA
                               NA
Trial 8
           NA
                NA
                     NA
                          NA
                               NΑ
                                      NA
                                            NΑ
```

```
0.15 0.46 0.27 0.60 4.01 11.38 11.30
Trial 10
                      NA
           NΑ
                 NΑ
                           NΑ
                                 NA
                                       NA
                                              NΑ
Trial 11 0.15 0.46 0.27 0.60 4.01 11.38 11.30
Trial 12 0.15 0.46 0.27 0.60 4.01 11.38 11.30
Trial 13 0.15 0.46 0.27 0.60 4.01 11.38 11.30
Trial 14 0.15 0.46 0.27 0.60 4.01 11.38 11.30
Trial 15 0.15 0.46 0.27 0.60 4.01 11.38 11.30
Trial 16
           NA
                 NA
                      NA
                            NA
                                 NΑ
                                       NA
                                              NΑ
Trial 17
           NA
                 NA
                      NA
                            NA
                                 NA
                                       NA
                                              NA
Trial 18
           NA
                 NA
                      NA
                            NA
                                 NA
                                       NA
                                              NA
Trial 19 0.15 0.46 0.27 0.60
                              4.01
                                    11.38
                                           11.30
Trial 20
                            NA
           NA
                 NA
                      NA
                                 NA
                                       NA
                                              ΝA
Trial 21 0.15 0.46 0.27 0.60 4.01 11.38 11.30
Trial 22 0.17 0.50 0.25 0.65 5.90 15.00
                                            8.43
Trial 23
           NA
                 NA
                      NA
                            NA
                                 NA
                                       NΑ
                                              NΑ
Trial 24 0.15 0.46 0.27 0.60 4.01
                                    11.38
                                          11.30
Trial 25
           NA
                 NA
                      NA
                            NA
                                 NA
                                       NA
                                              NA
Trial 26 0.15 0.46 0.27
                         0.60
                               4.01
                                    11.38
Trial 27
                 NA
                            NA
                                 NA
                                       NA
           NA
                      NA
                                              NA
Trial 28
           NA
                 NA
                      NA
                            NA
                                 NA
                                       NA
                                              NA
Trial 29
           NA
                 NA
                      NA
                            NA
                                 NΑ
                                       NA
                                              NΑ
Trial 30 0.17 0.50 0.25 0.65 5.90 15.00
```

Conclusions

Results indicate that the most robust scenario was Scenario 2. This scenario obtained better results than Scenario 3 and 4 in the diagnostic checklist and included an uncertainty level in ECOCADIZ-RECLUTAS 2012 estimate, making it more realistic than Scenario 1. The greater robustness shown by Scenario 2 compared to Scenarios 3 and 4 could be due to the number of estimates from the BOCADEVA campaign (7 estimates). The low number of estimates from BOCADEVA index may have negatively affected the model fit introducing some noise or additional uncertainty. Thus, we recommend using the scenario 2 estimates over the other scenarios. Finally, a larger number of estimates in the BOCADEVA survey could improve the model obtained in both scenario 3 and scenario 4. Therefore, in order to define the influence of BOCADEVA estimates in the model, we recommend repeating the same exercise in a few years when more BOCADEVA campaigns have been carried out.

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