

# Can we estimate the abundance of yellowfin tuna?

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# How we estimate the abundance of yellowfin tuna in the EPO?

Current method:

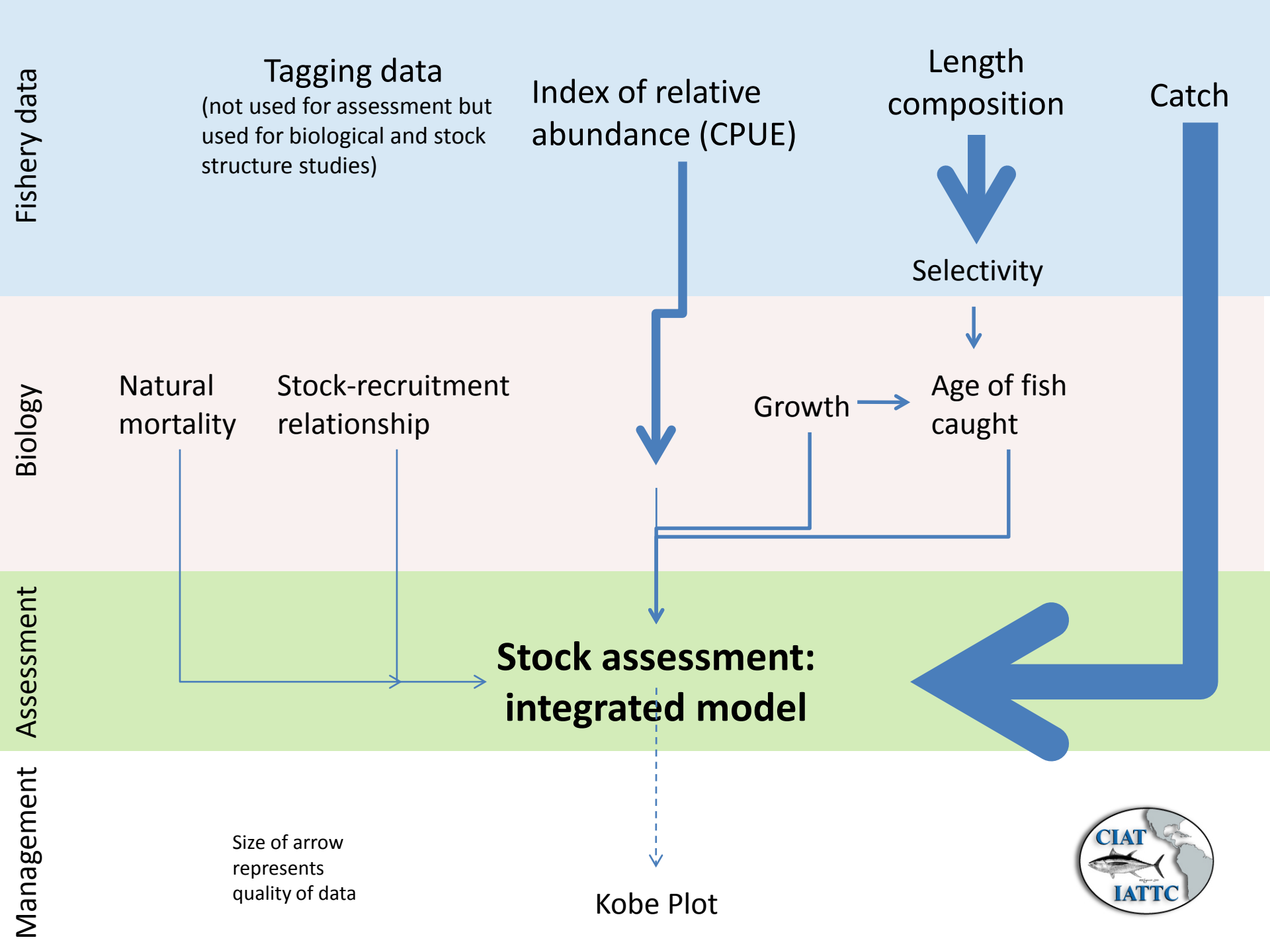
Integrated statistical age-structured population dynamics model

Assumptions:

- one stock in the eastern Pacific Ocean
- 16 fisheries
- Sex-specific natural mortality
- One growth curve
- ...

Fit to indices of relative abundance and length-frequency data

Using likelihood techniques



Tagging data  
(not used for assessment but used for biological and stock structure studies)

Index of relative abundance (CPUE)

Length composition

Catch

Selectivity

Natural mortality

Stock-recruitment relationship

Growth

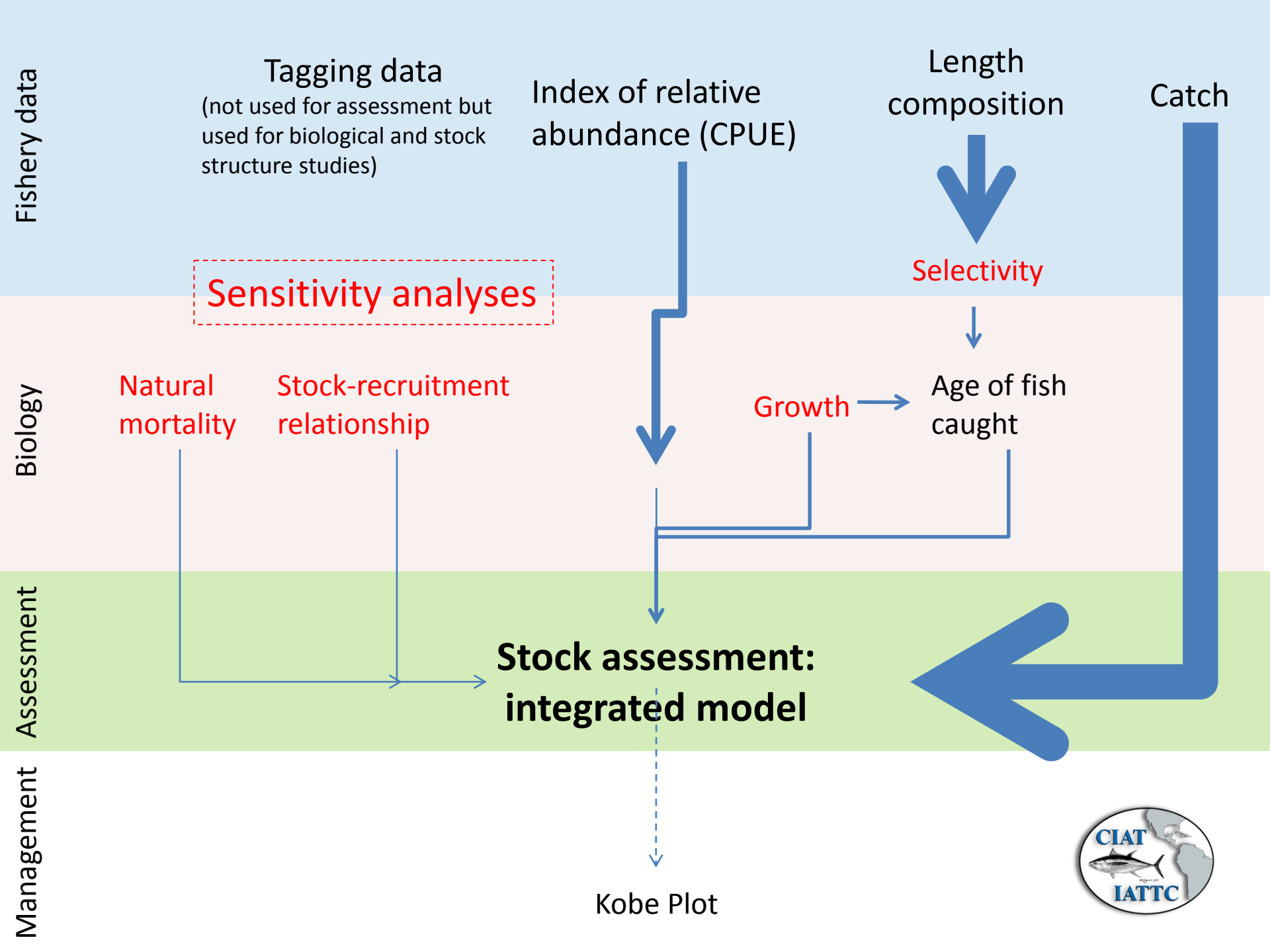
Age of fish caught

**Stock assessment:  
integrated model**

Kobe Plot

Size of arrow represents quality of data





Tagging data  
(not used for assessment but used for biological and stock structure studies)

Index of relative abundance (CPUE)

Length composition

Catch

Sensitivity analyses

Natural mortality

Stock-recruitment relationship

Growth

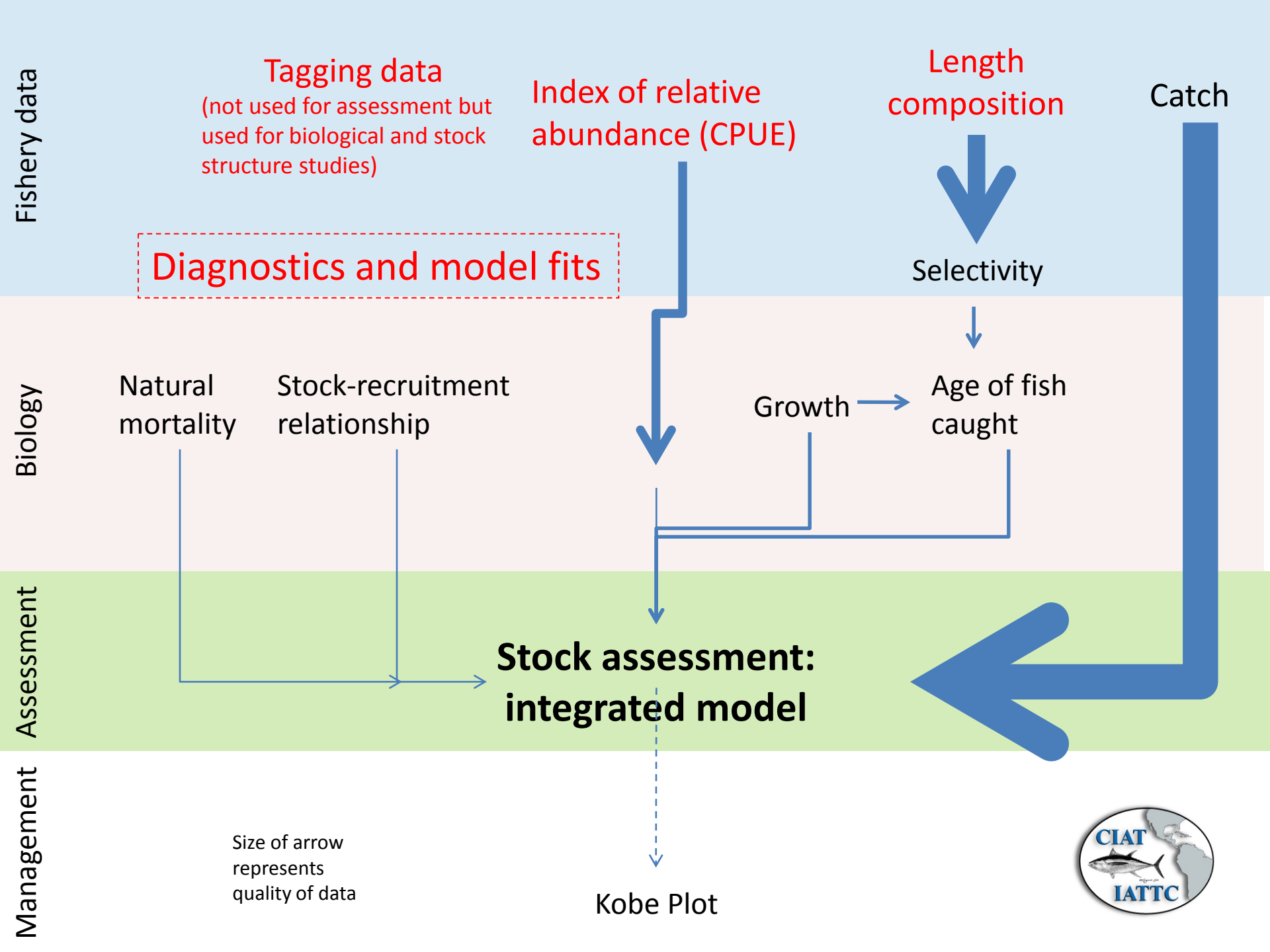
Selectivity

Age of fish caught

Stock assessment: integrated model

Kobe Plot





# Diagnostics for integrated models

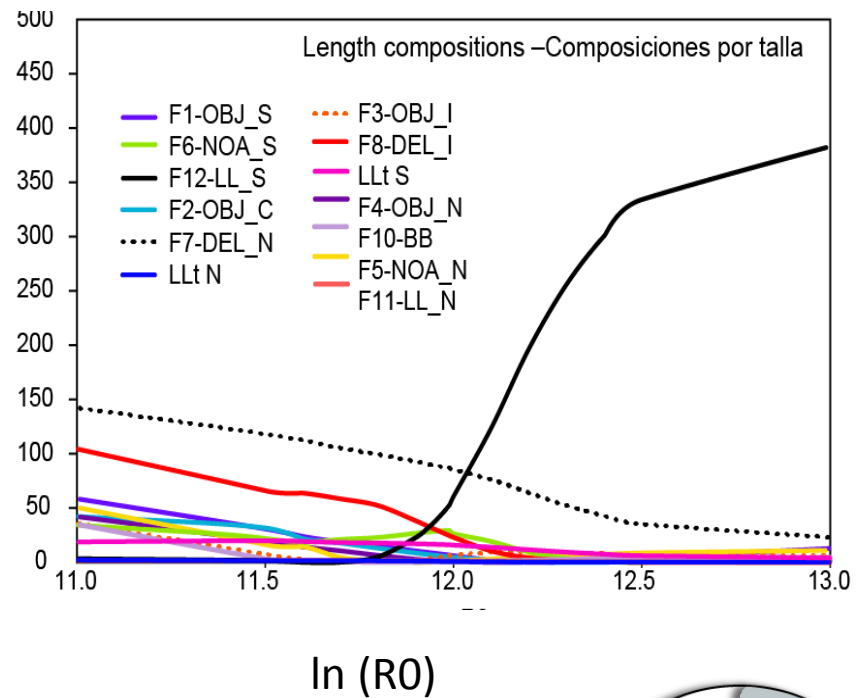
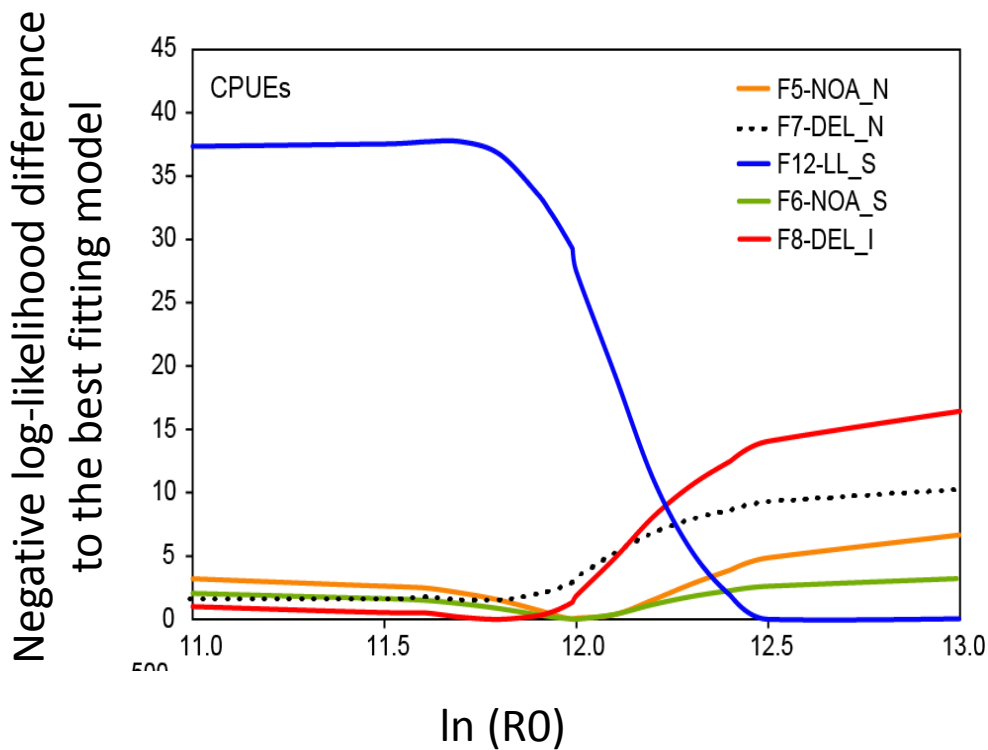
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- Likelihood profile on the scaling parameter
- Age-structure production model – fit only to indices of relative abundance
- Catch curve analysis – fit only to length-frequency data
- Depletion model - simplified population dynamics model, fit only to purse-seine CPUE



# R0 likelihood profile

R0 is the virgin recruitment (the parameter that gives the absolute scale of the model)



# Age-structure production model (ASPM)



# Production and loss in a population

$$B_{t+1} = B_t + \underbrace{(A + G)}_{\text{production}} - \overset{\text{loss (natural mortality)}}{M^*} - \overset{\text{loss (fishing mortality)}}{C}$$

production function

$$B_{t+1} = B_t + f(B_t) - C_t$$

A production model aggregate the production and natural losses in a **production function**

- An age-structure production model takes into account how those processes change with **age** (size at age, natural mortality at age) and assumes a constant recruitment
- If the **production function** is constant, then the changes in biomass **B<sub>t</sub>** are due to **loss to fishing**

# Fit to CPUE as indices of relative abundance

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$$C_t = f (E_t \times B_t )$$

$$C_t / E_t = f (B_t )$$

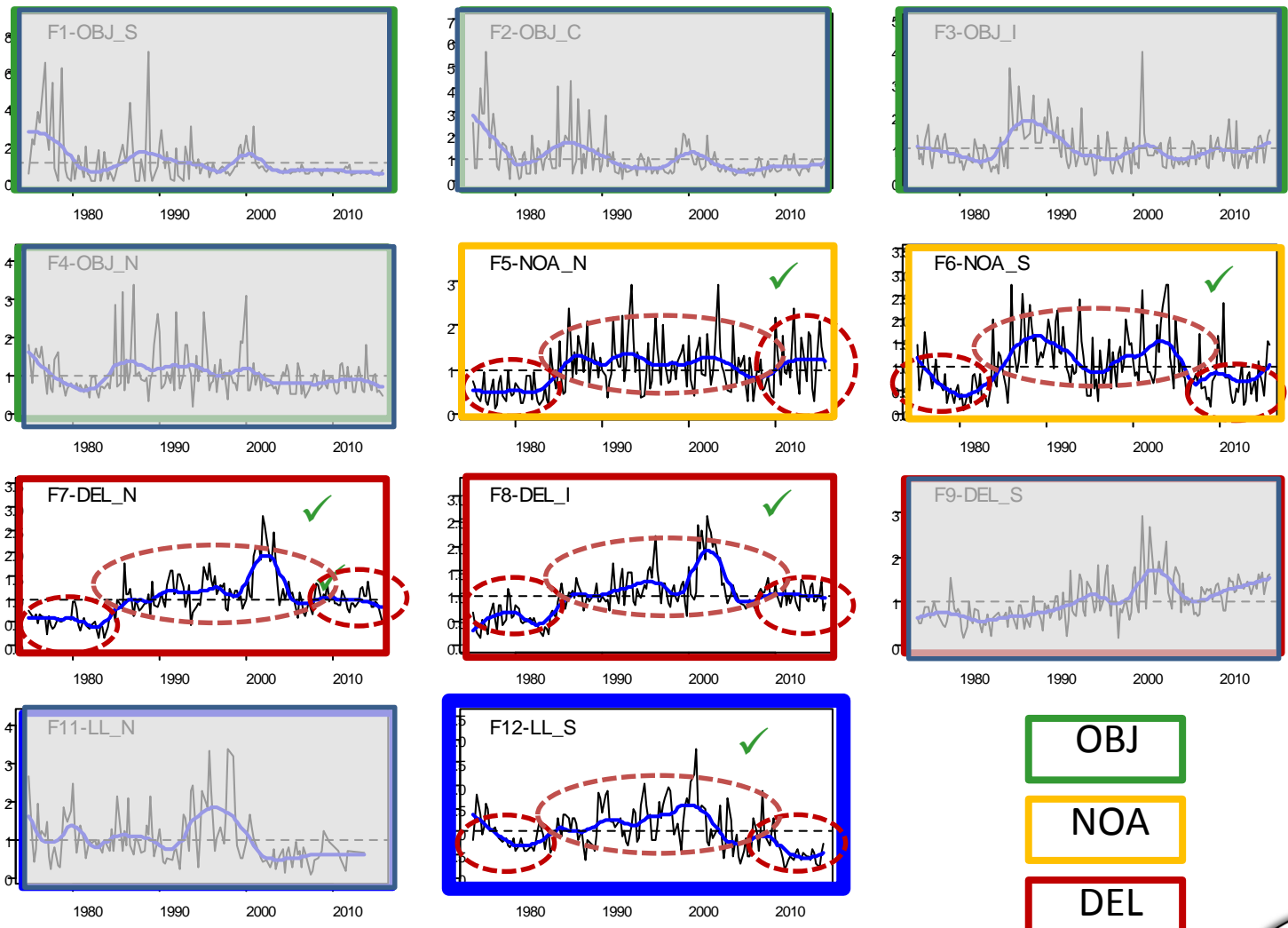
- $C_t / E_t$  is the “catch per unit of effort” (CPUE)
- CPUE is **proportional** to the biomass of the stock  $B_t$





# Fit to 5 CPUE series simultaneously

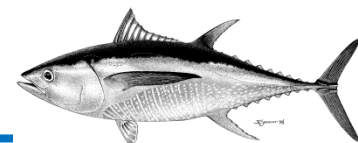
Scaled CPUE-CPUE escalada



- OBJ
- NOA
- DEL
- LL

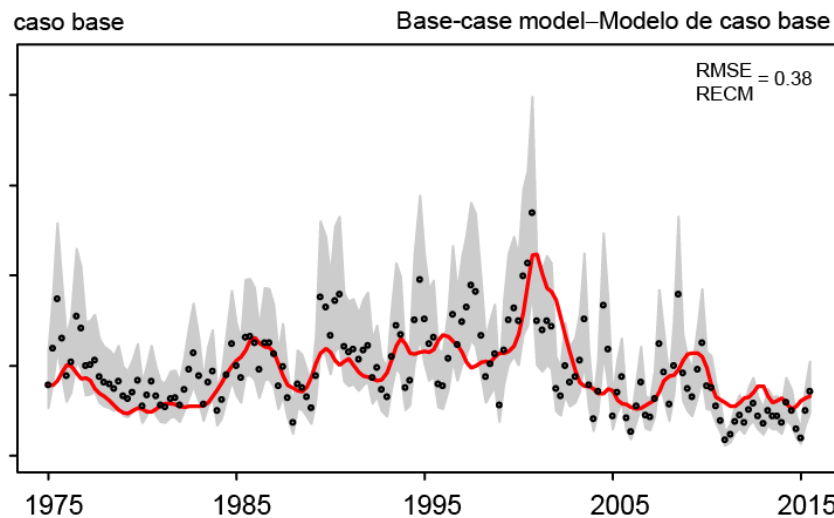
Year-año

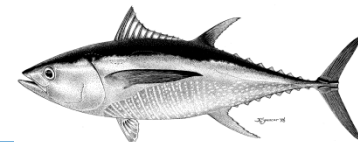




# Age-structured production model

Scaled CPUE-CPUE escalada

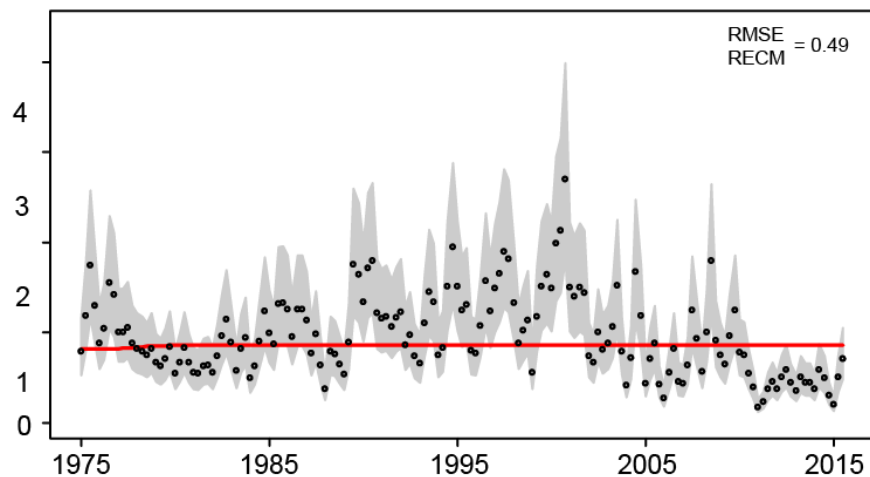




# Age-structured production model

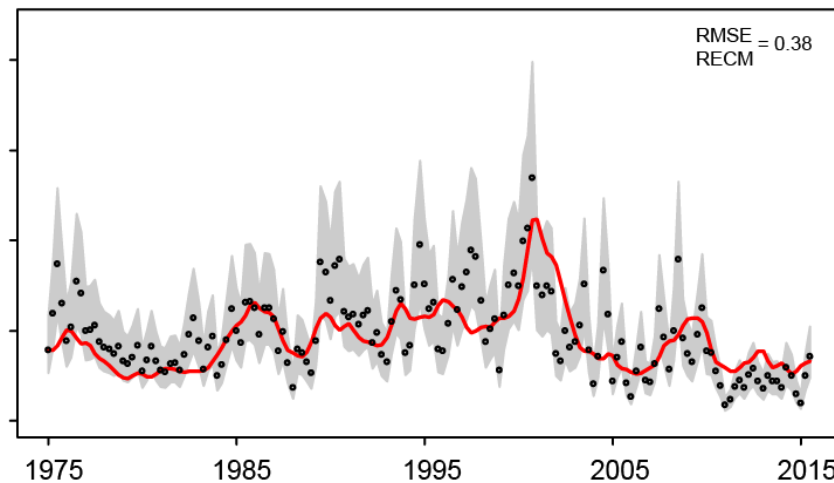
Scaled CPUE-CPUE escalada

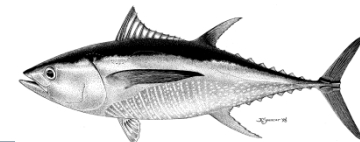
ASPM



caso base

Base-case model-Modelo de caso base

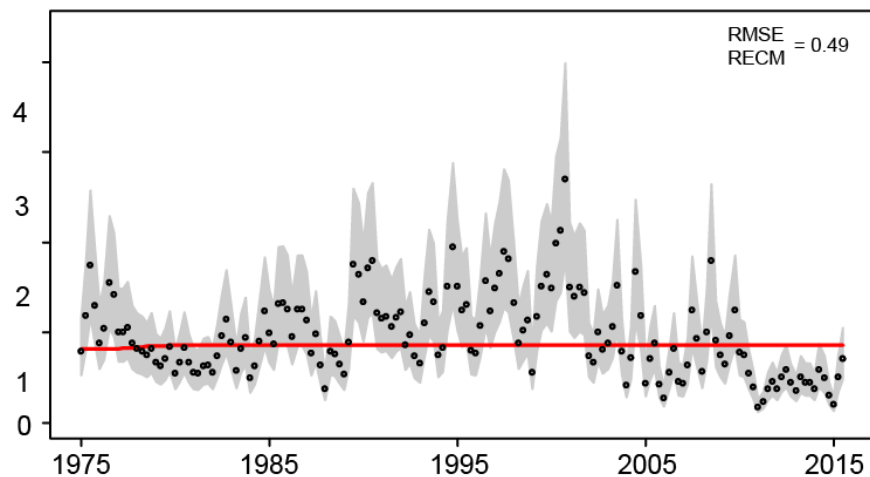




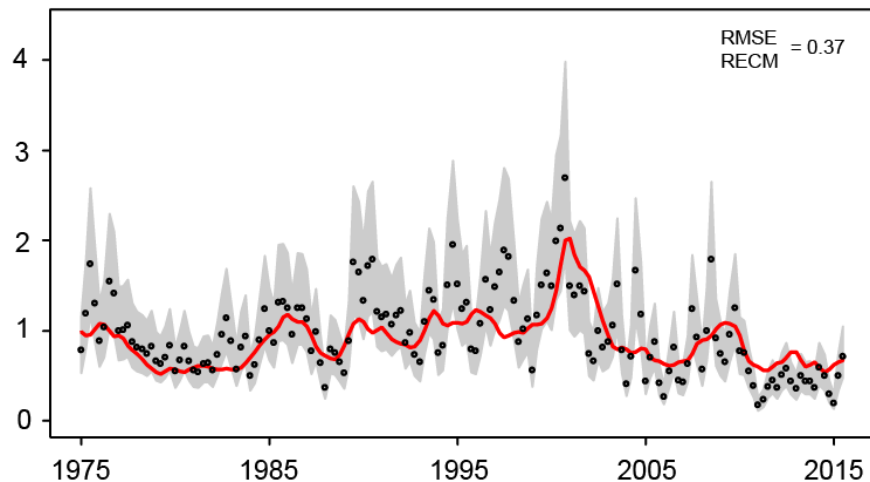
# Age-structured production model

Scaled CPUE-CPUE escalada

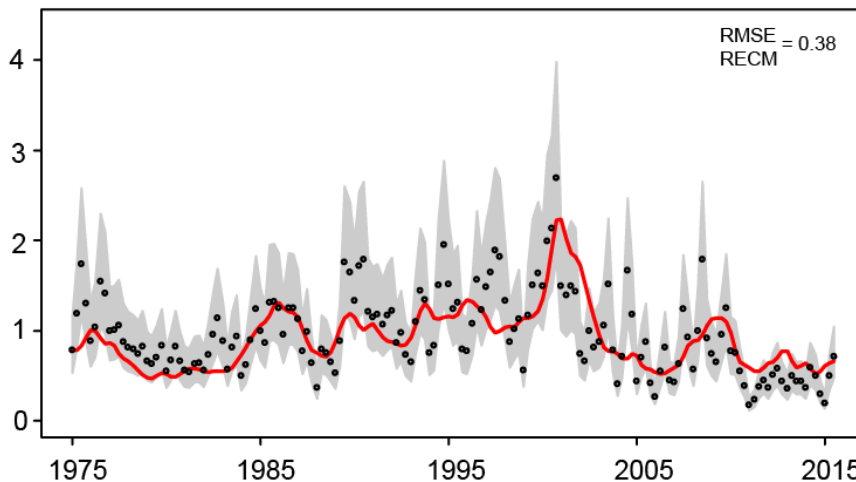
ASPM



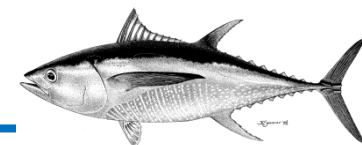
ASPM with recruitment deviations set to the base-case model estimates  
 ASPM con desvíos de reclutamiento fijos a los valores estimados por el modelo de caso base



Base-case model-Modelo de caso base

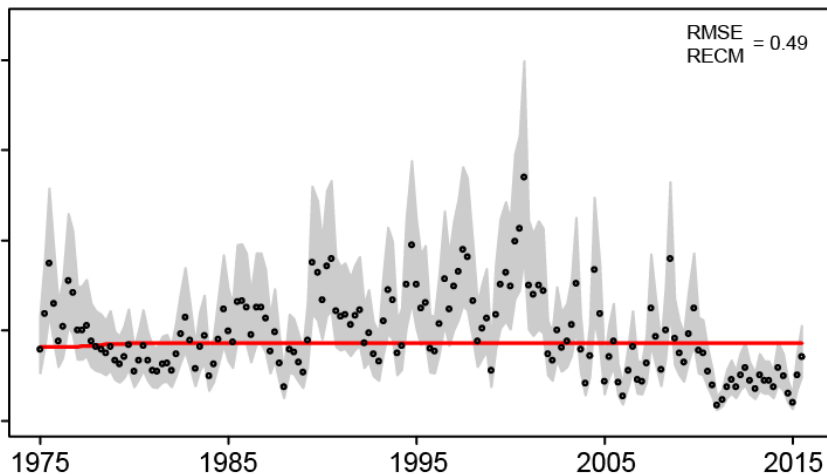


# Age-structured production model

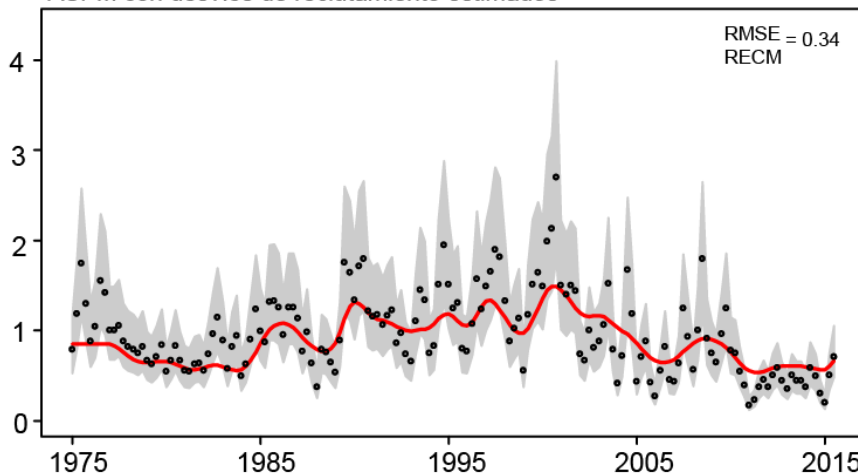


Scaled CPUE-CPUE escalada

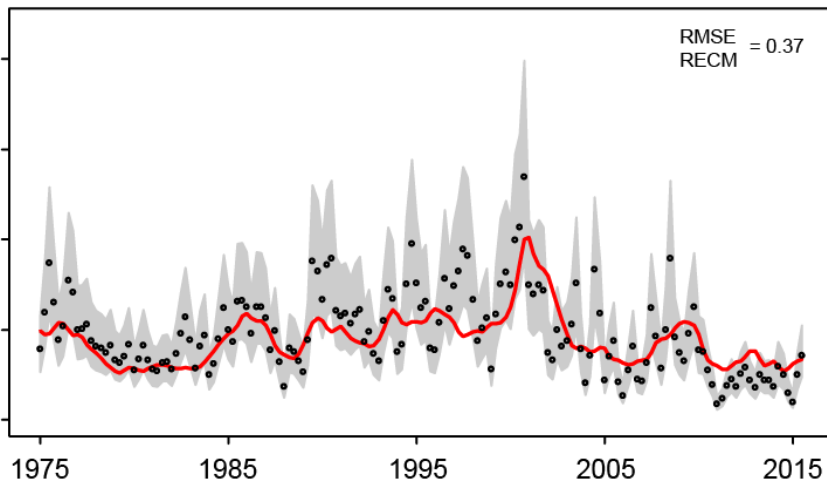
ASPM



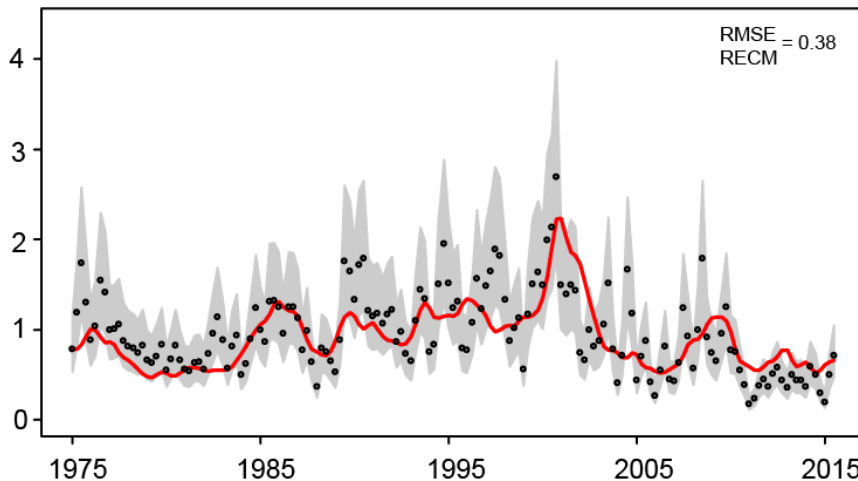
ASPM with recruitments deviations estimated  
ASPM con desvíos de reclutamiento estimados

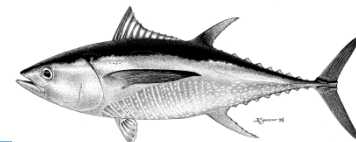


ASPM with recruitment deviations set to the base-case model estimates  
ASPM con desvíos de reclutamiento fijos a los valores estimados por el modelo de caso base

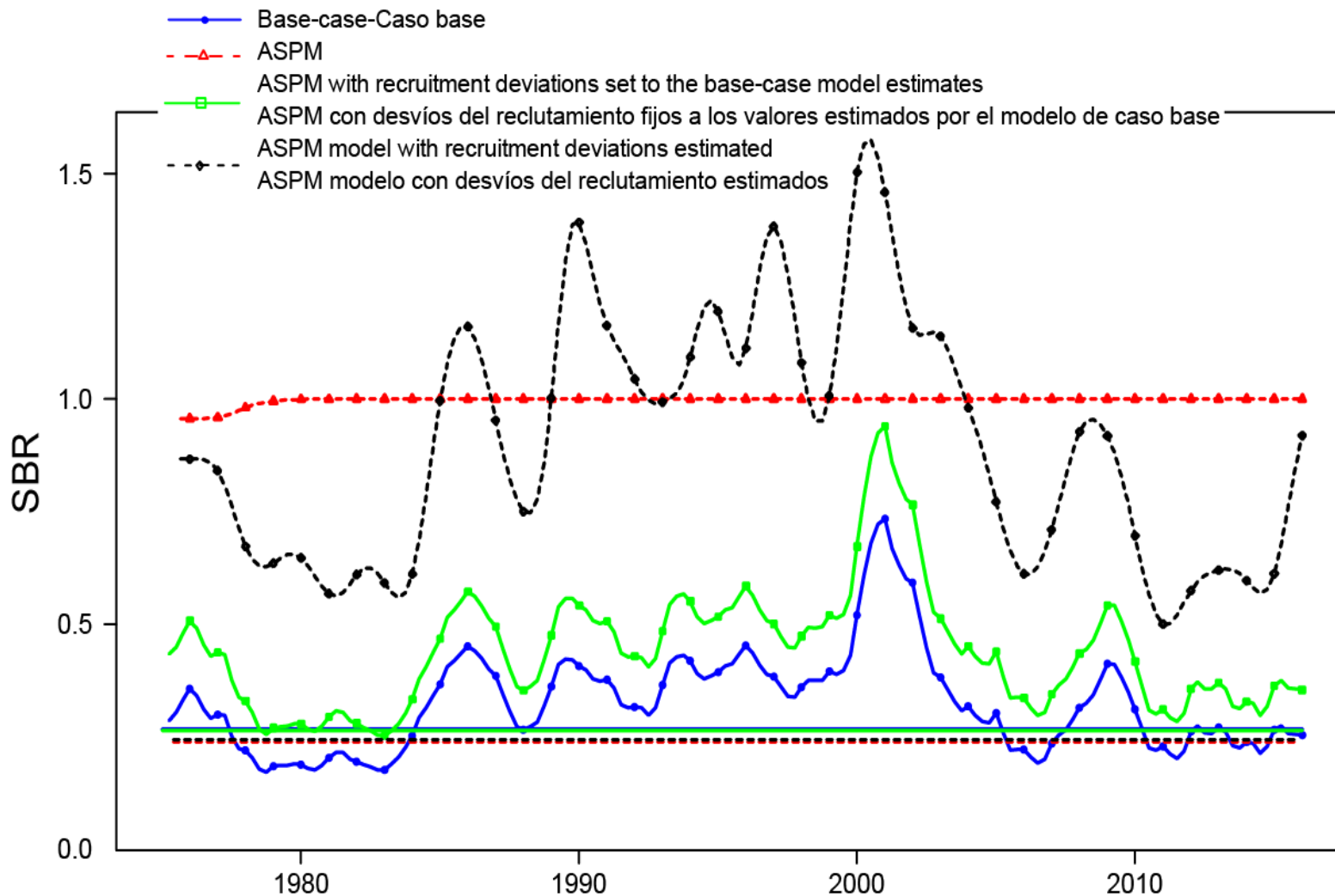


Base-case model-Modelo de caso base

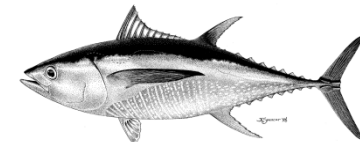




# Age-structured production model

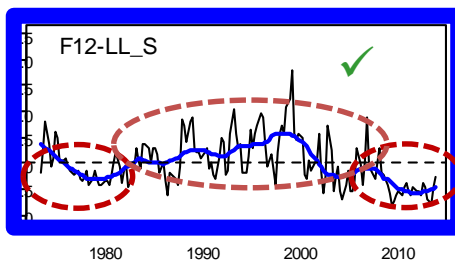
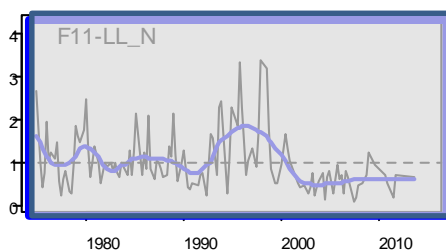
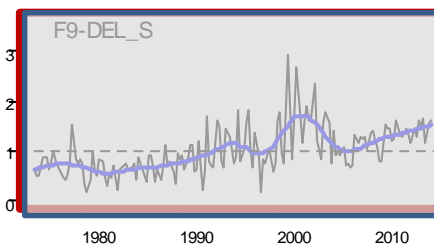
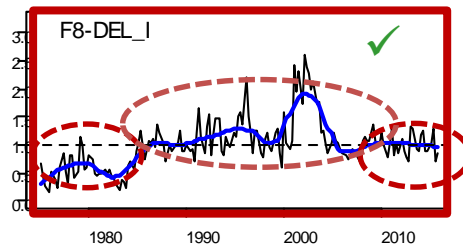
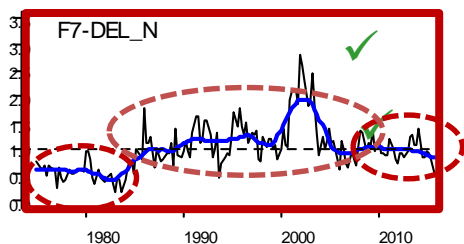






# ASPM with one index only at a time

3



Year-año

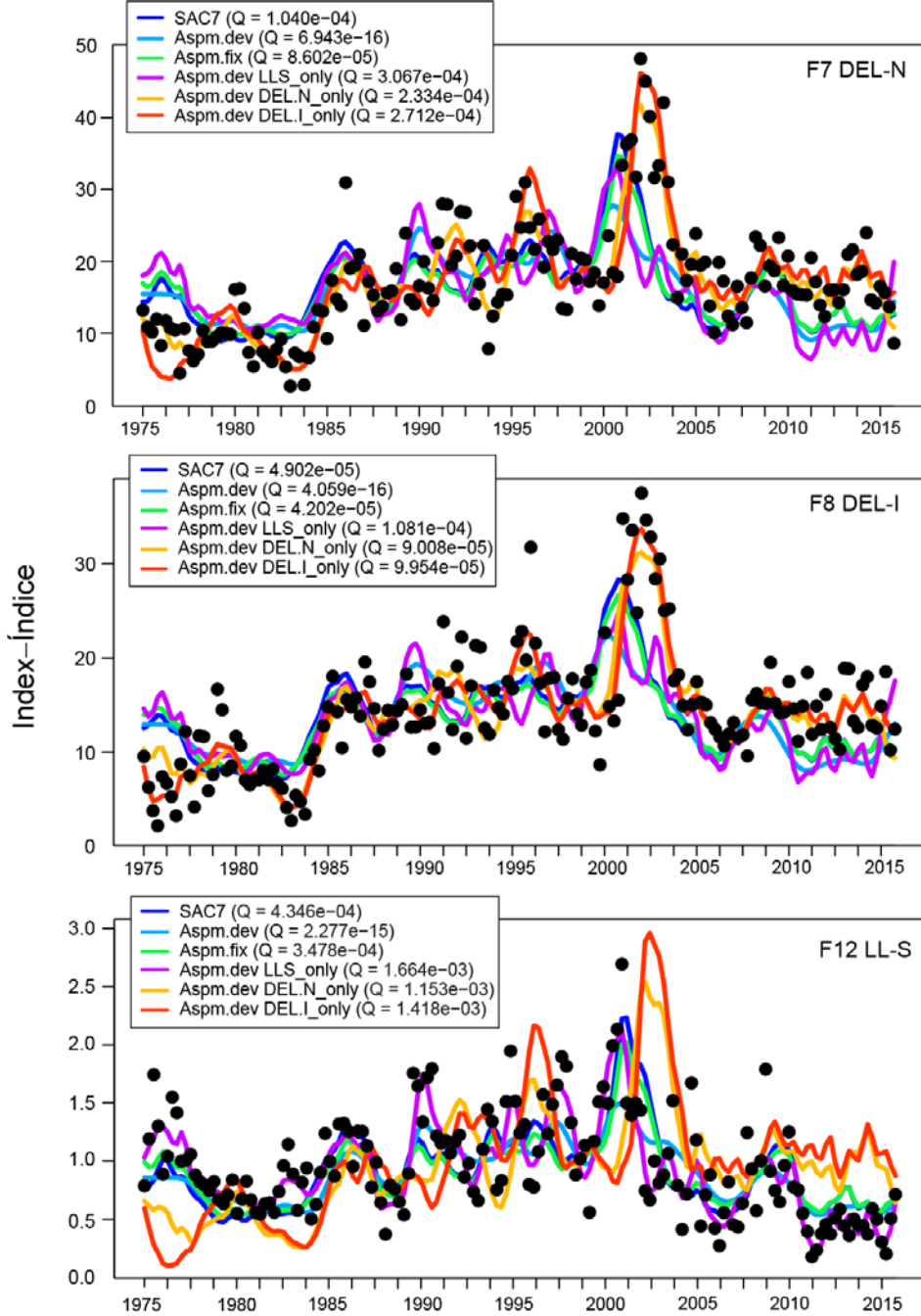
OBJ

NOA

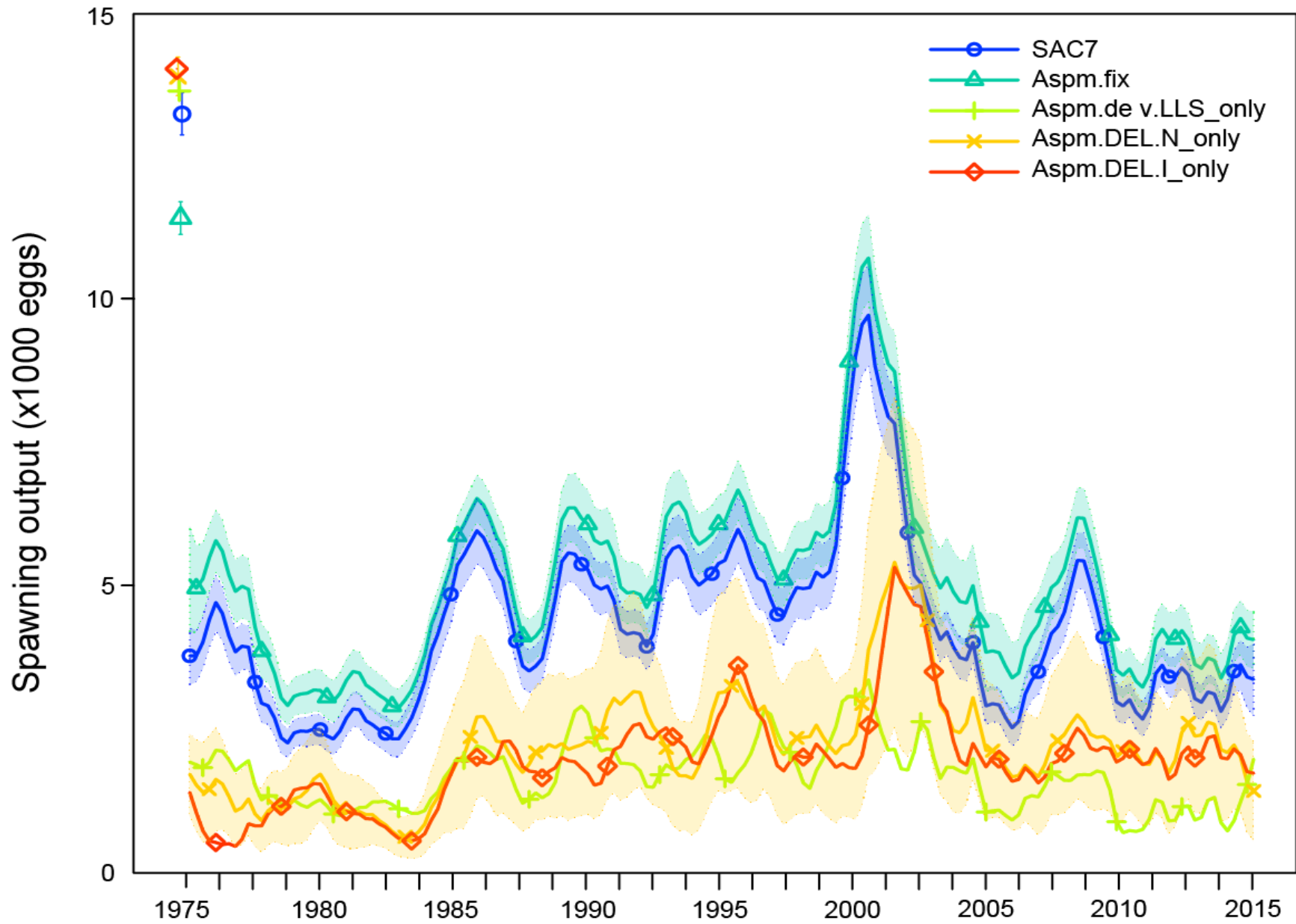
DEL

LL





Fits to three CPUE series of the **SAC7** base case model, the **ASPMdev** and the ASPMdev fit to one cpue series at a time



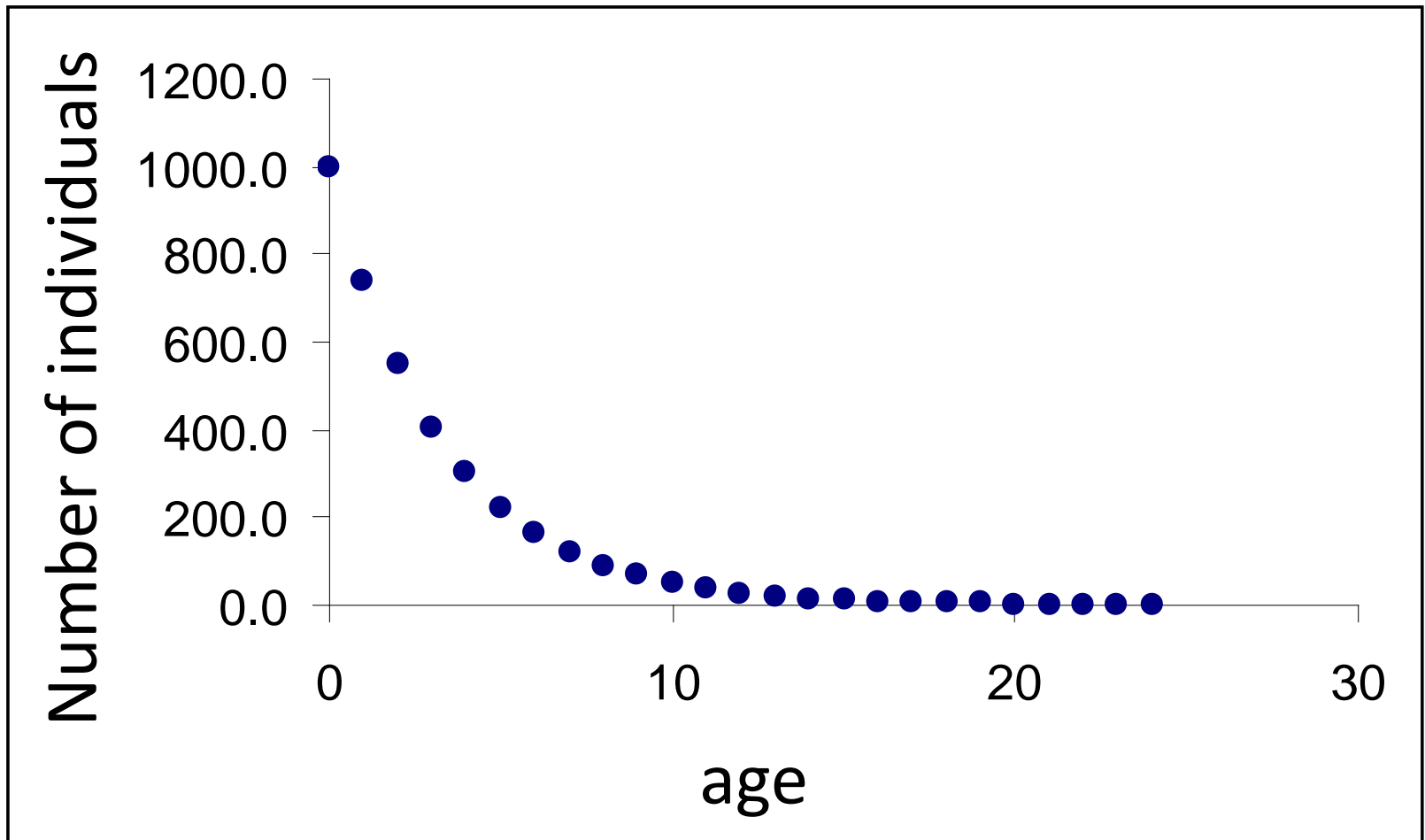
# Results ASPM

- We cannot capture the biomass dynamics unless we take into account the recruitment deviations
  - However ASPMdev is only able to estimate the relative scale
  - Even when the recruitment estimates are provided, the model ASPMfix cannot estimate the same scale as the IM
- Fitting one index at a time allows to estimate a scale when recruitment deviations are estimated (ASPMdev)
  - The biomass is lower than what the IM predict
  - The uncertainty around estimates are high

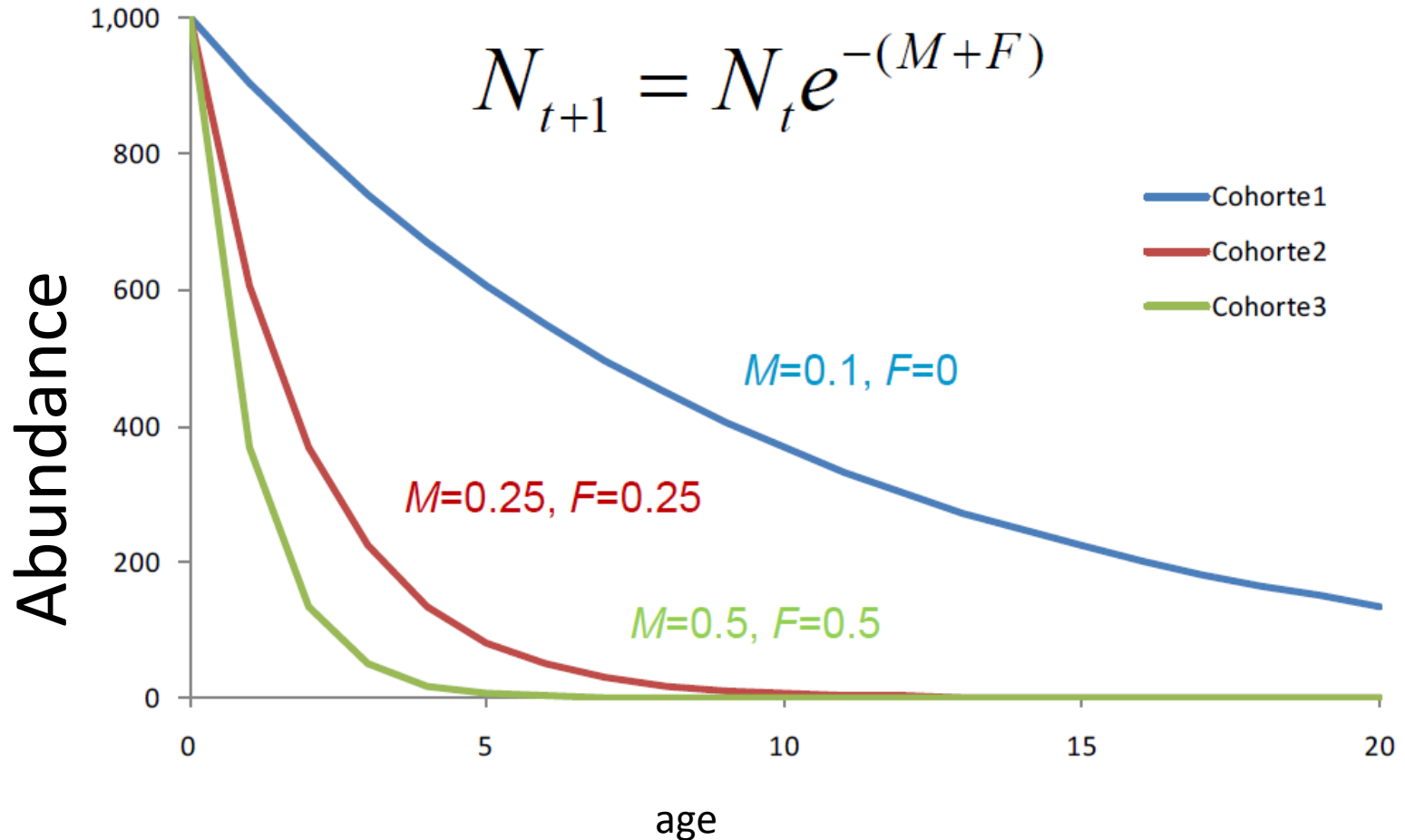
# Catch-curve analysis

# The trajectory of one cohort

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# The trajectory of one cohort



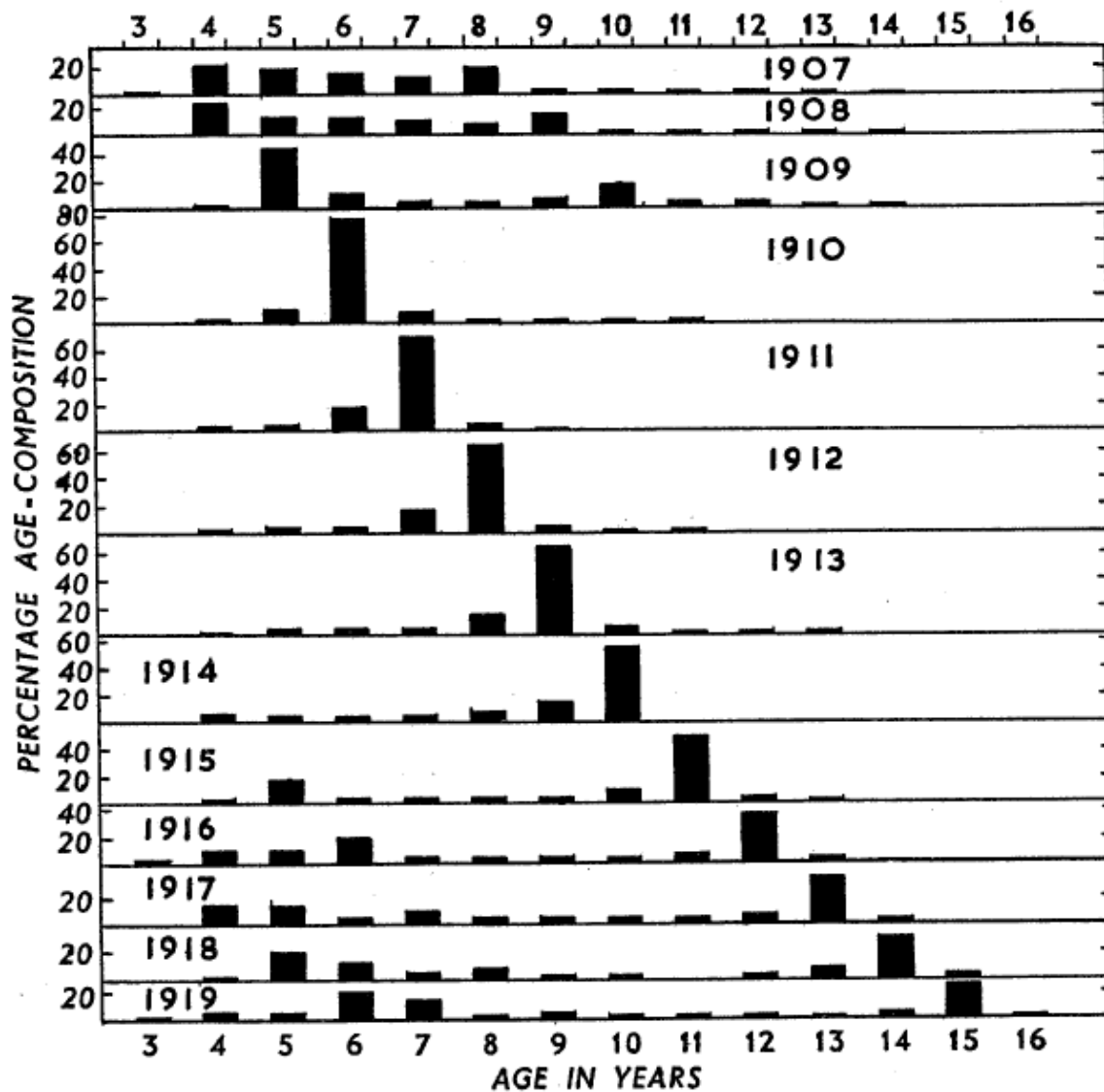


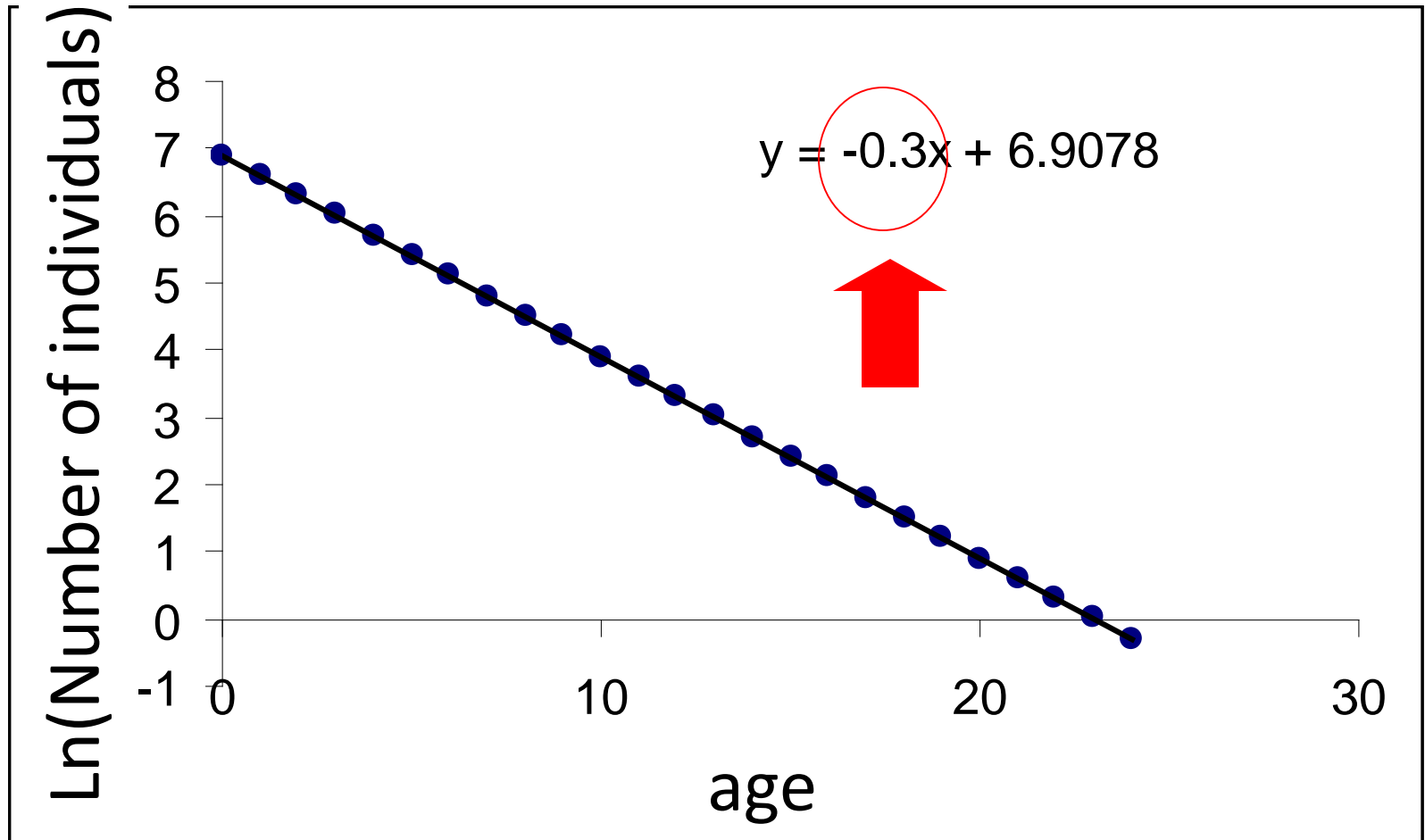
FIG. VI.14.—A PREDOMINANT YEAR-CLASS.

Percentage age composition of Norwegian herring in successive years of observation.

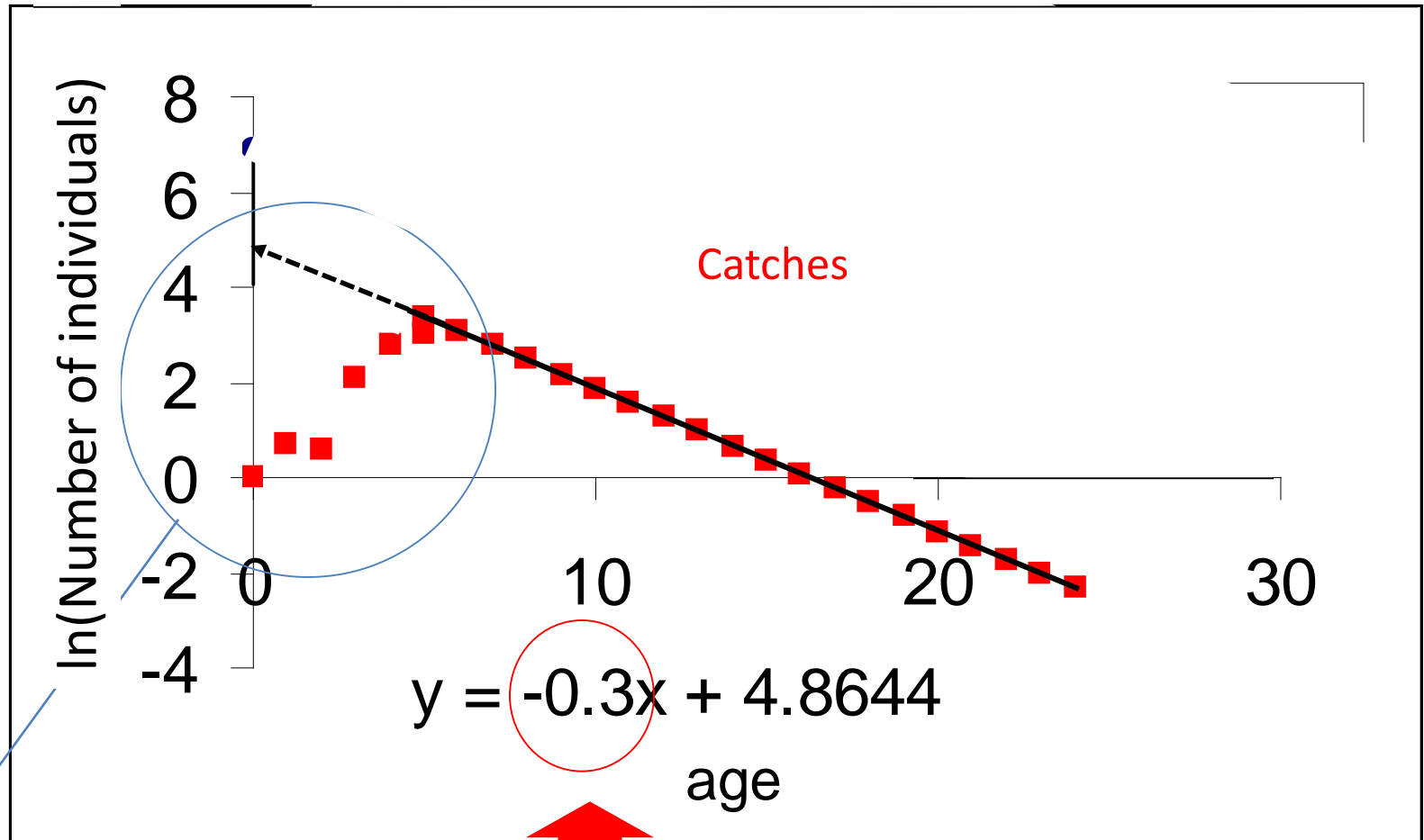
(After Hjort, 1926)



# The trajectory of one cohort

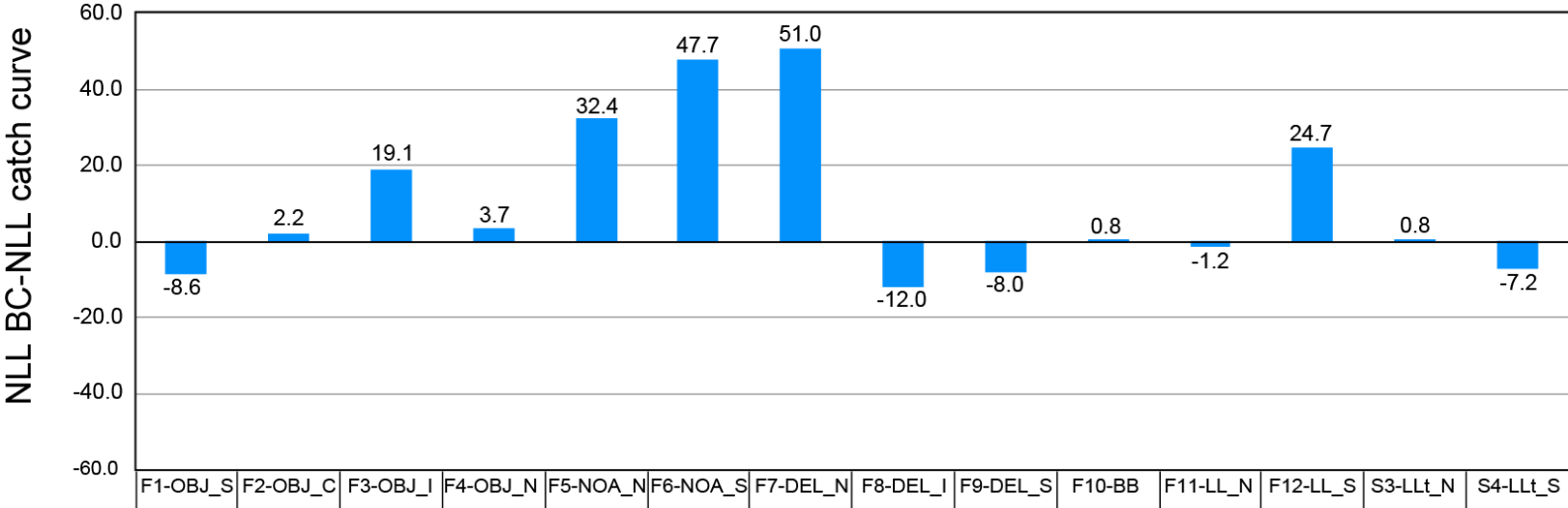


# Catch curves

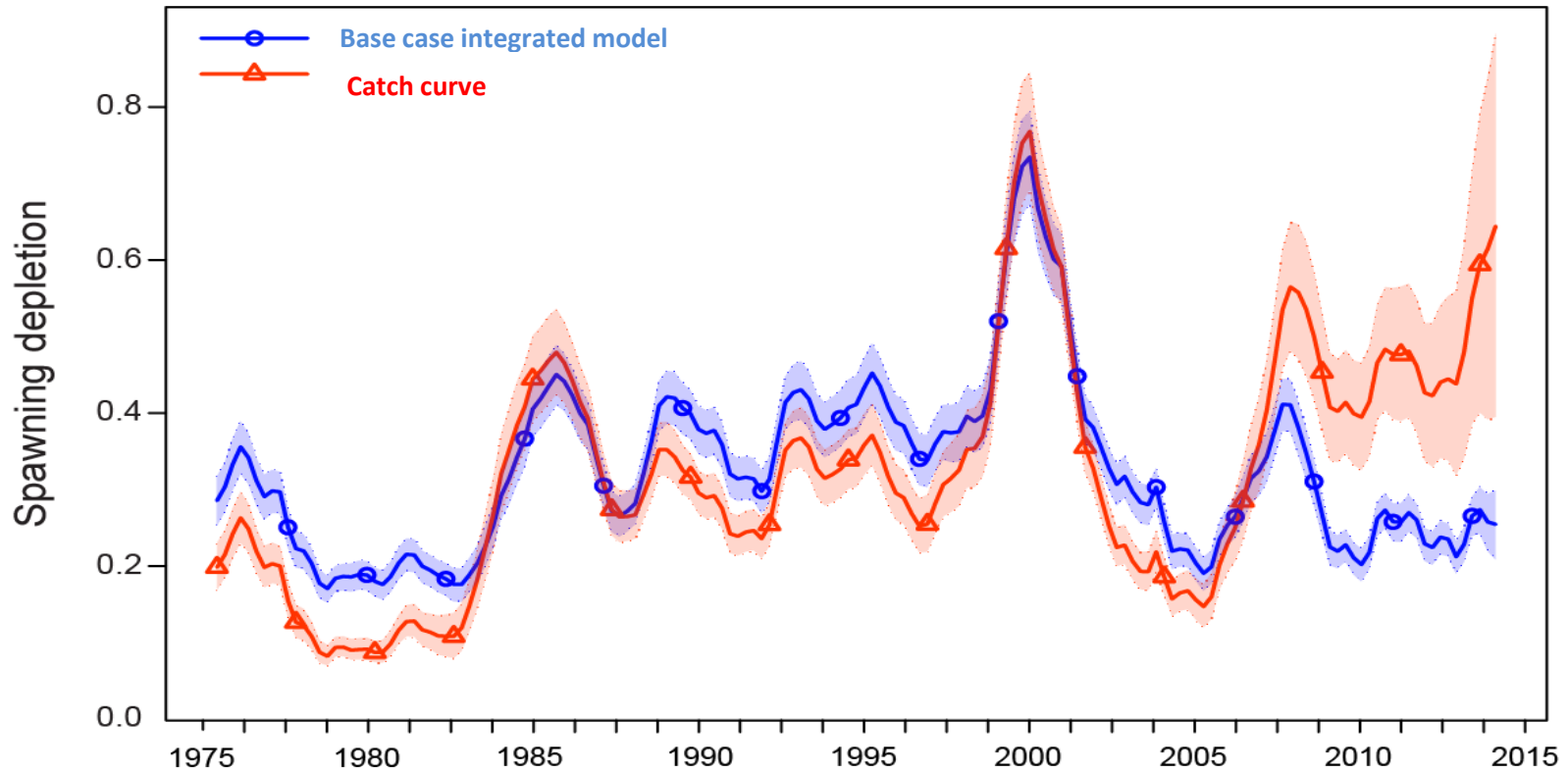


selectivity

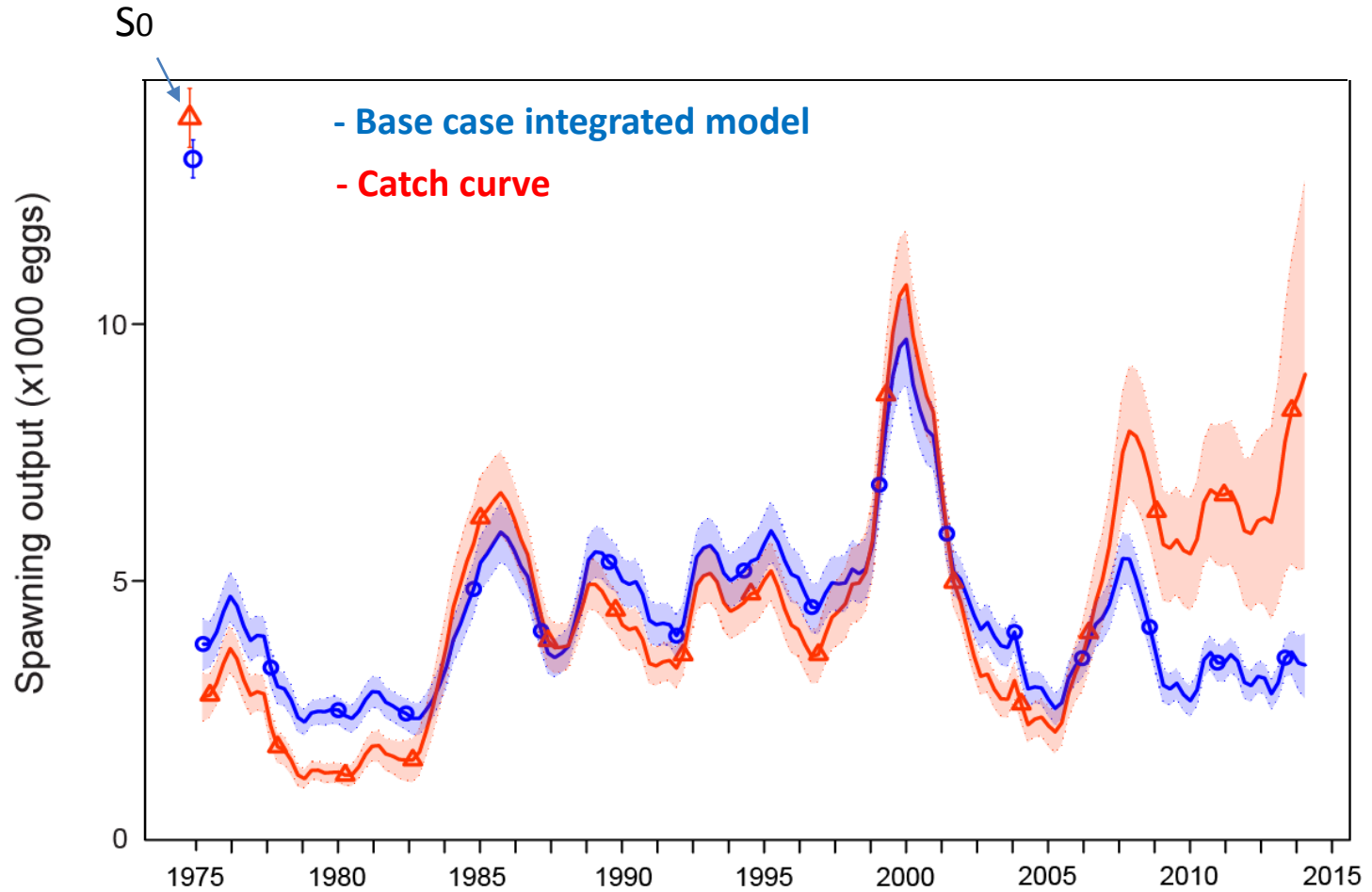
# Results catch curve fits to length-frequency data

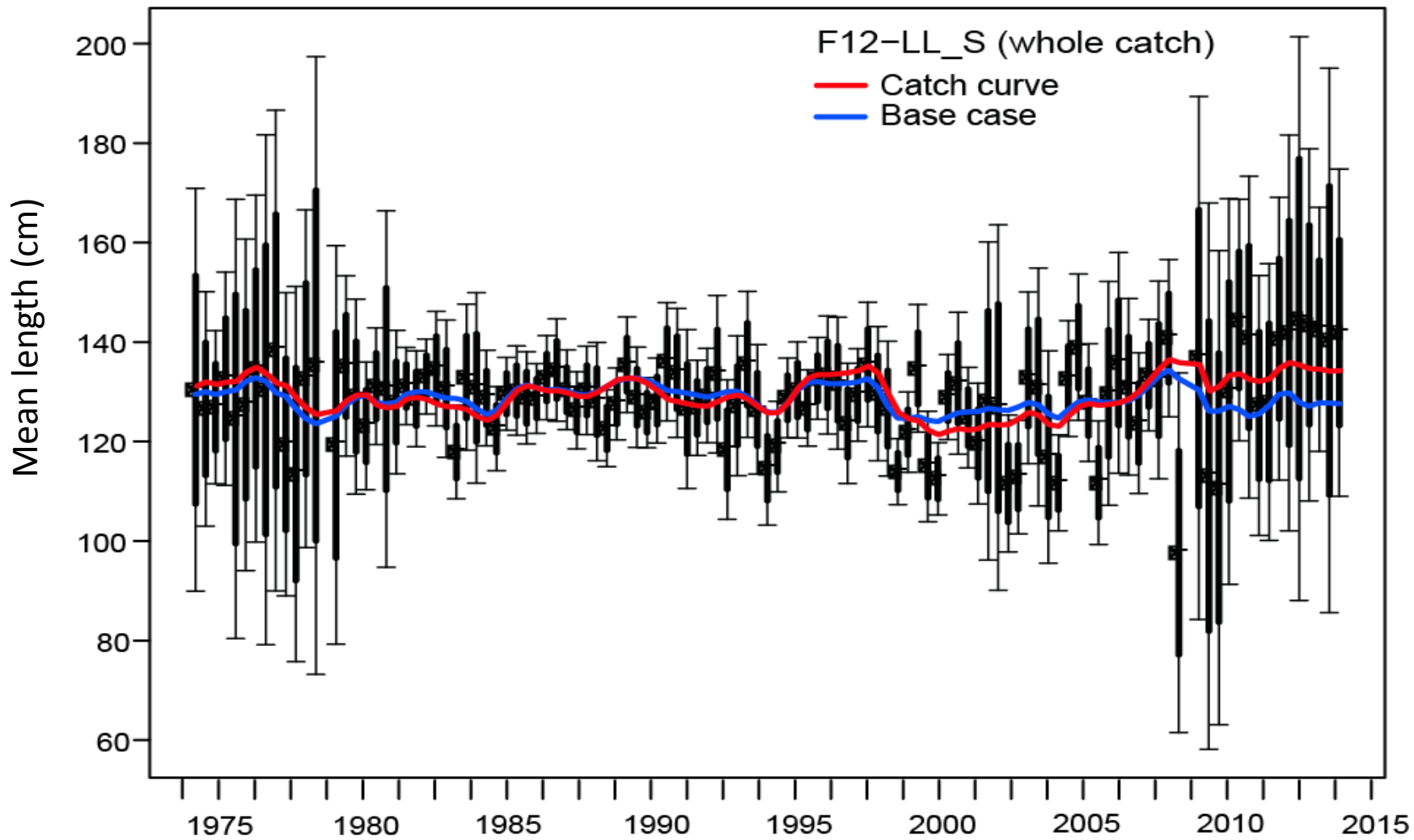


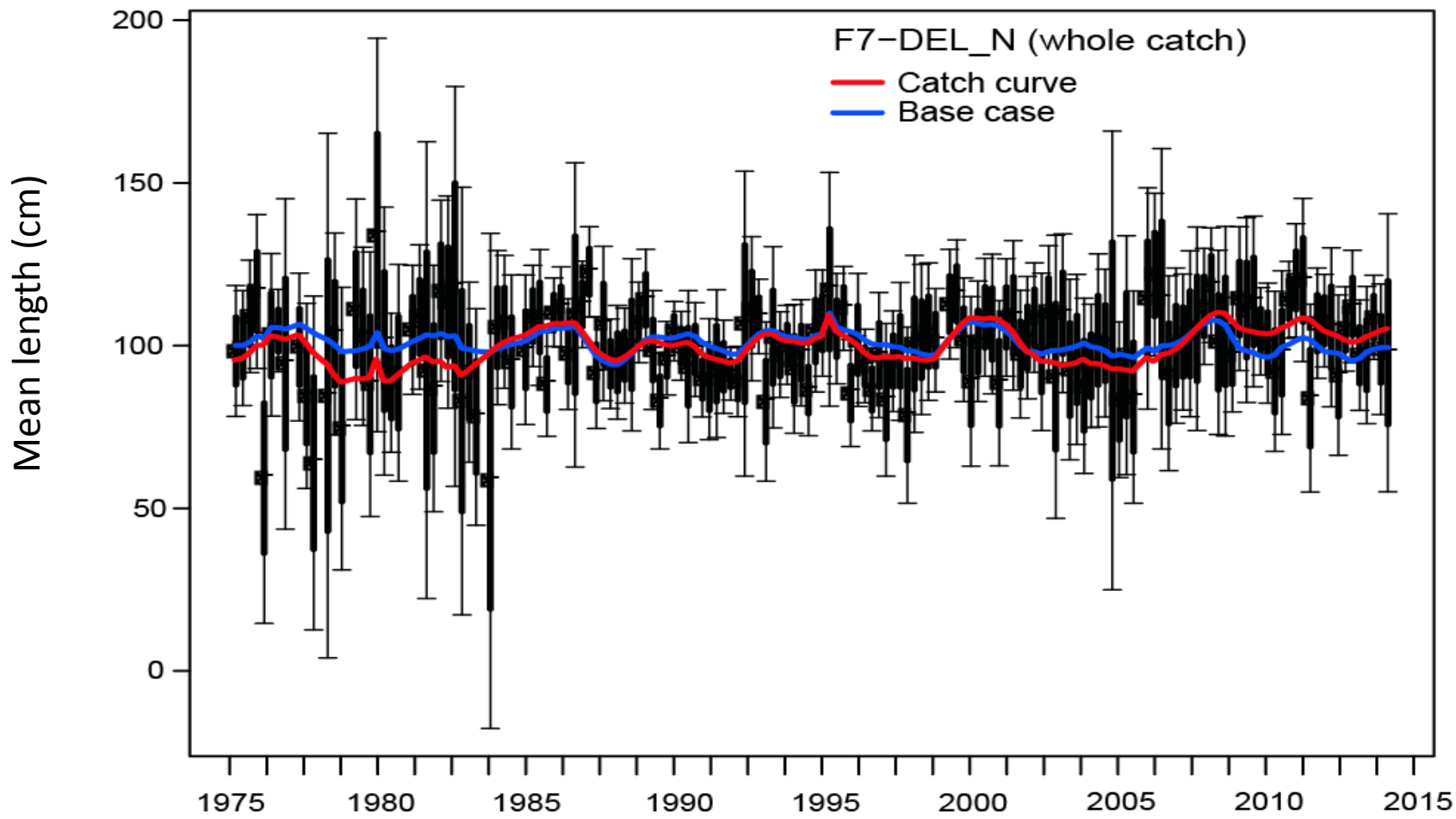
# Results catch curve: relative abundance



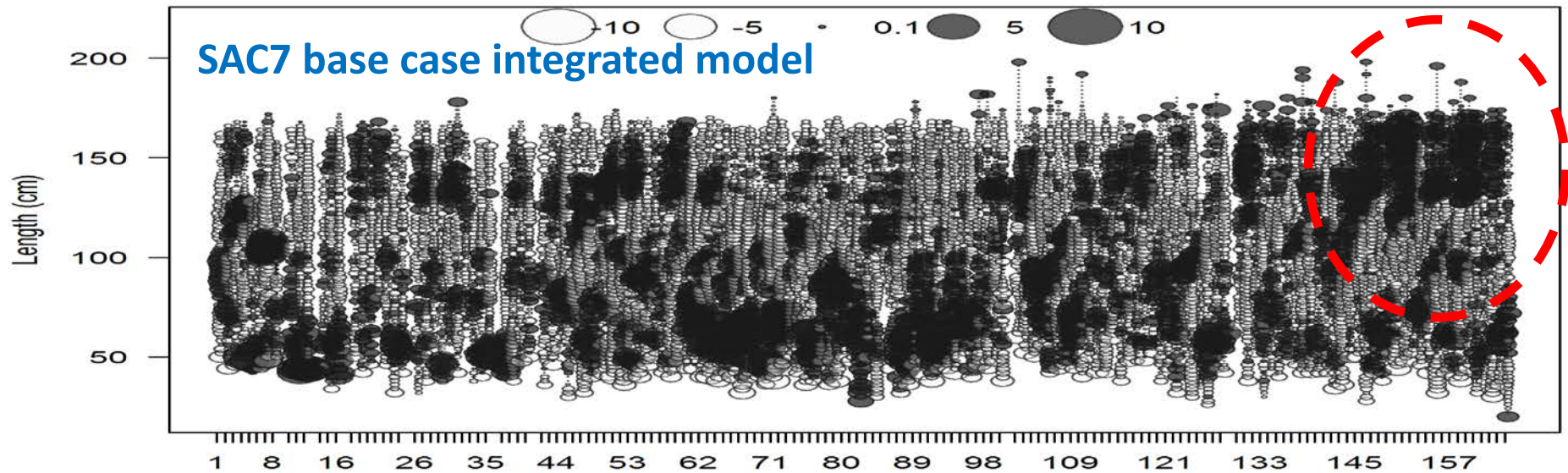
# Results catch curve: absolute abundance



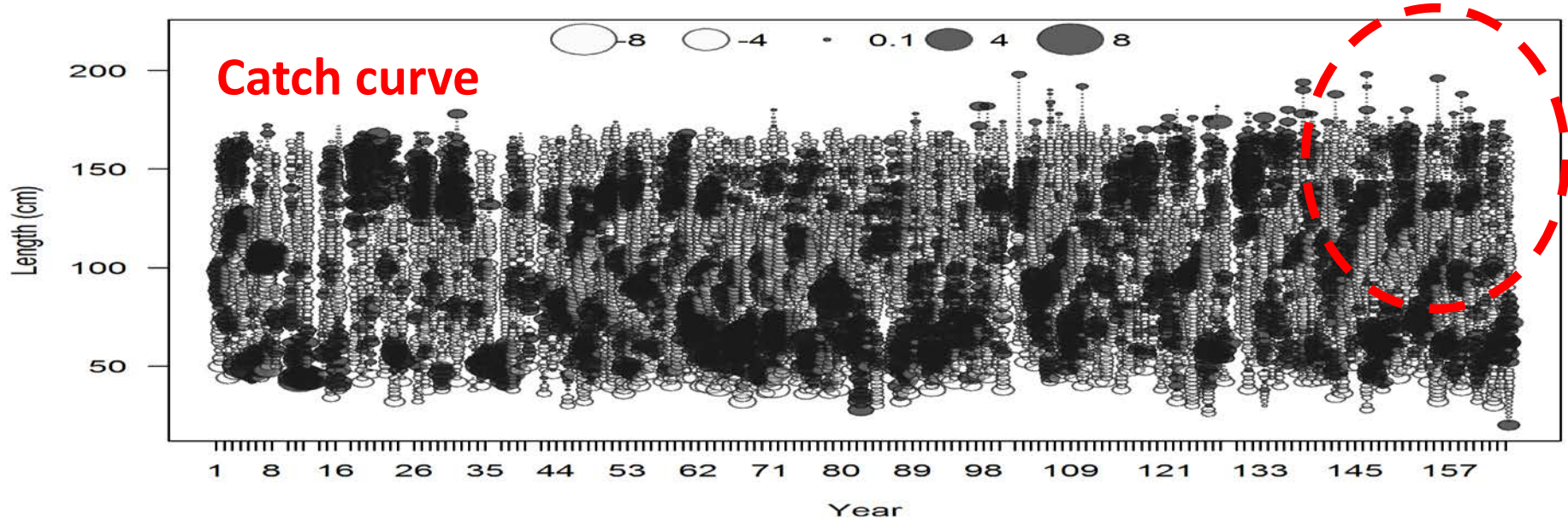




Pearson residuals, whole catch, F7-DEL\_N (max=6.67)

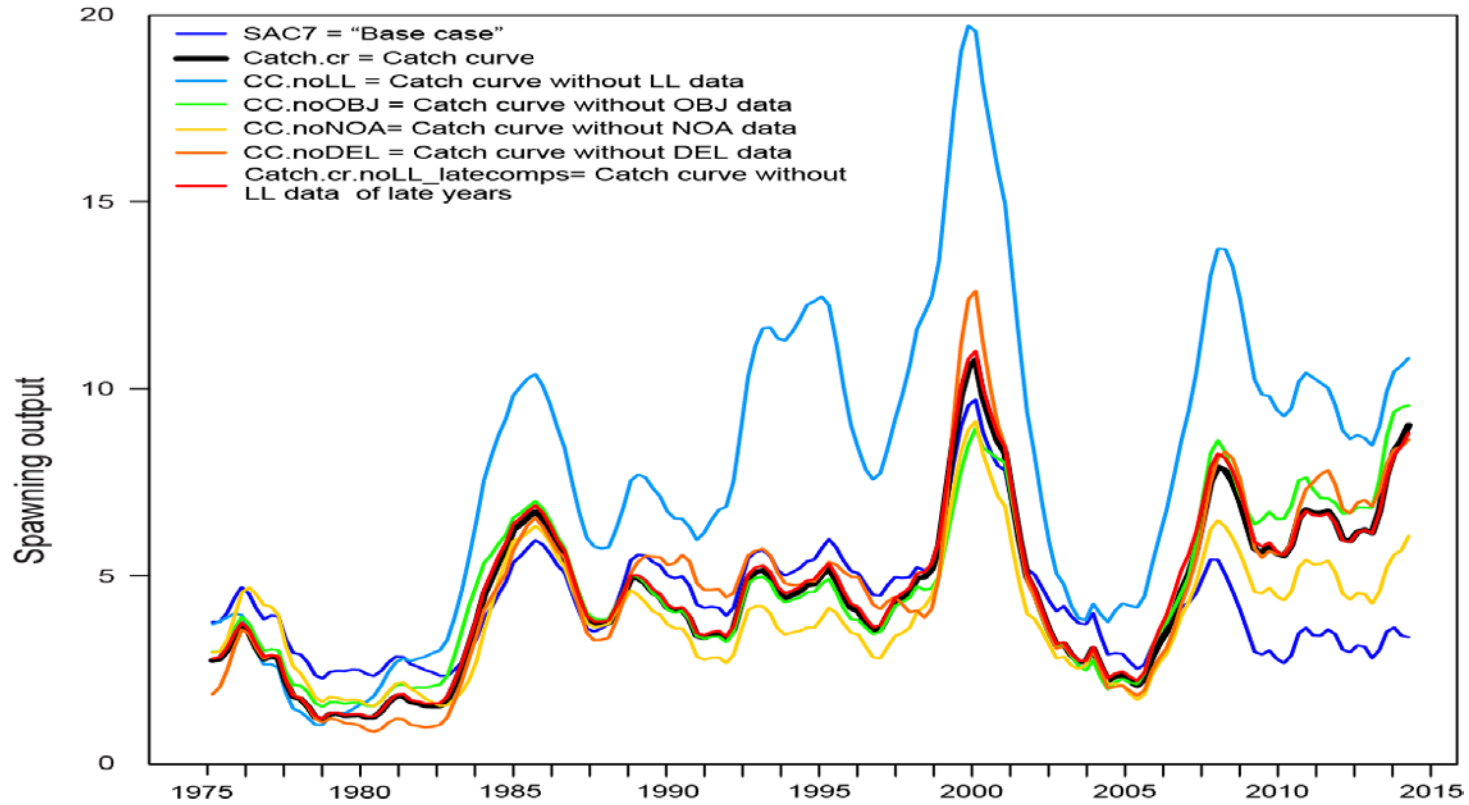


Pearson residuals, whole catch, F7-DEL\_N (max=6.42)





# Catch curve: sensitivity to data sets



# Results catch curve

- The absolute biomass estimates from the catch-curve are similar to those of the base-case model for most of the series
- At the end of the series there is an indication model misspecification at the end of the time-series
- The length-frequency of LL\_S fleet is in the most influent in the catch-curve results

# Depletion model

# CPUE

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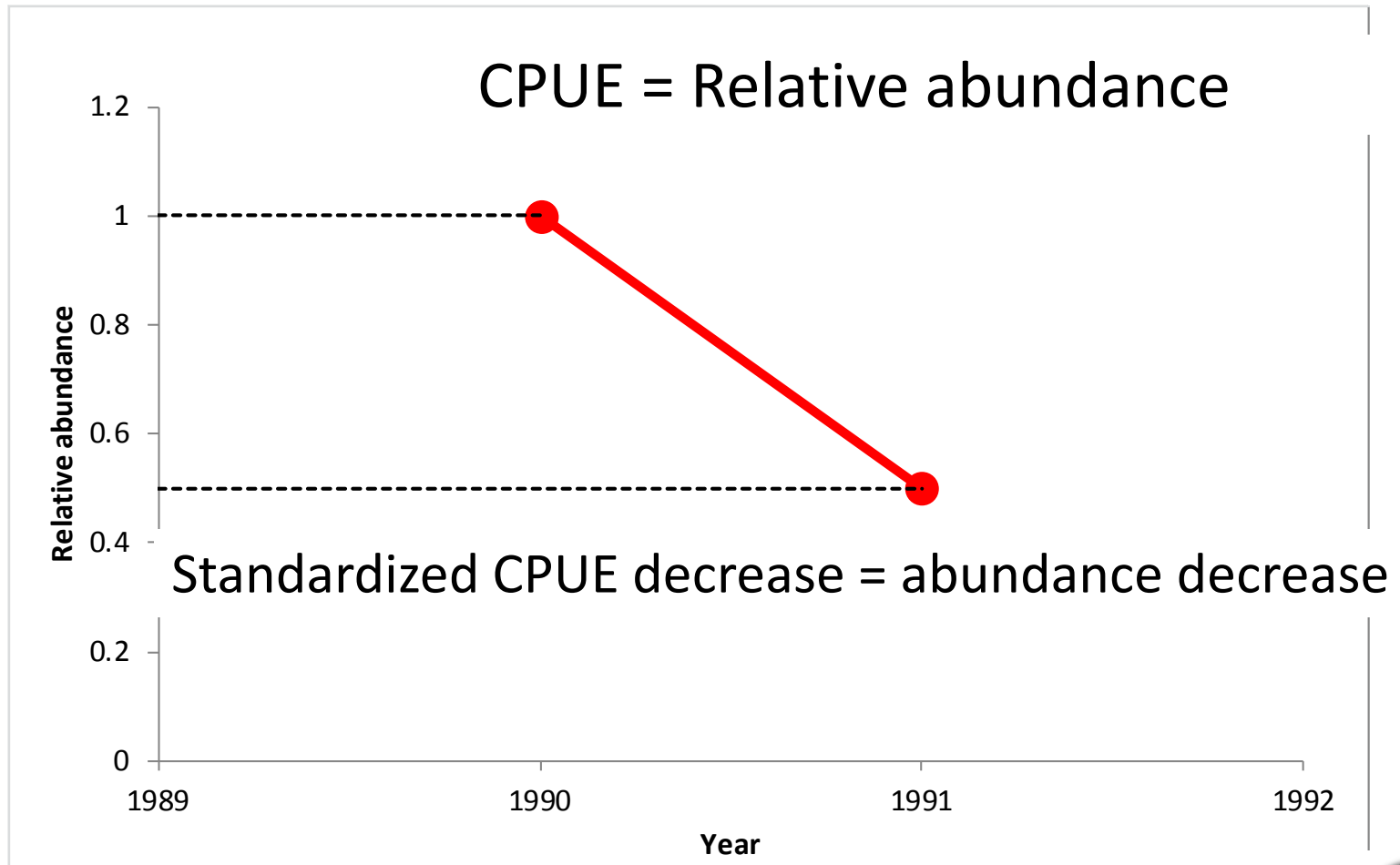
$$C_t = q \times E_t \times B_t$$

$$C_t / E_t = q \times B_t$$

- $C_t / E_t$  is the “catch per unit of effort” (CPUE)
- CPUE is proportional to the biomass of the stock  $B_t$
- The proportionality constant is **q (catchability)**



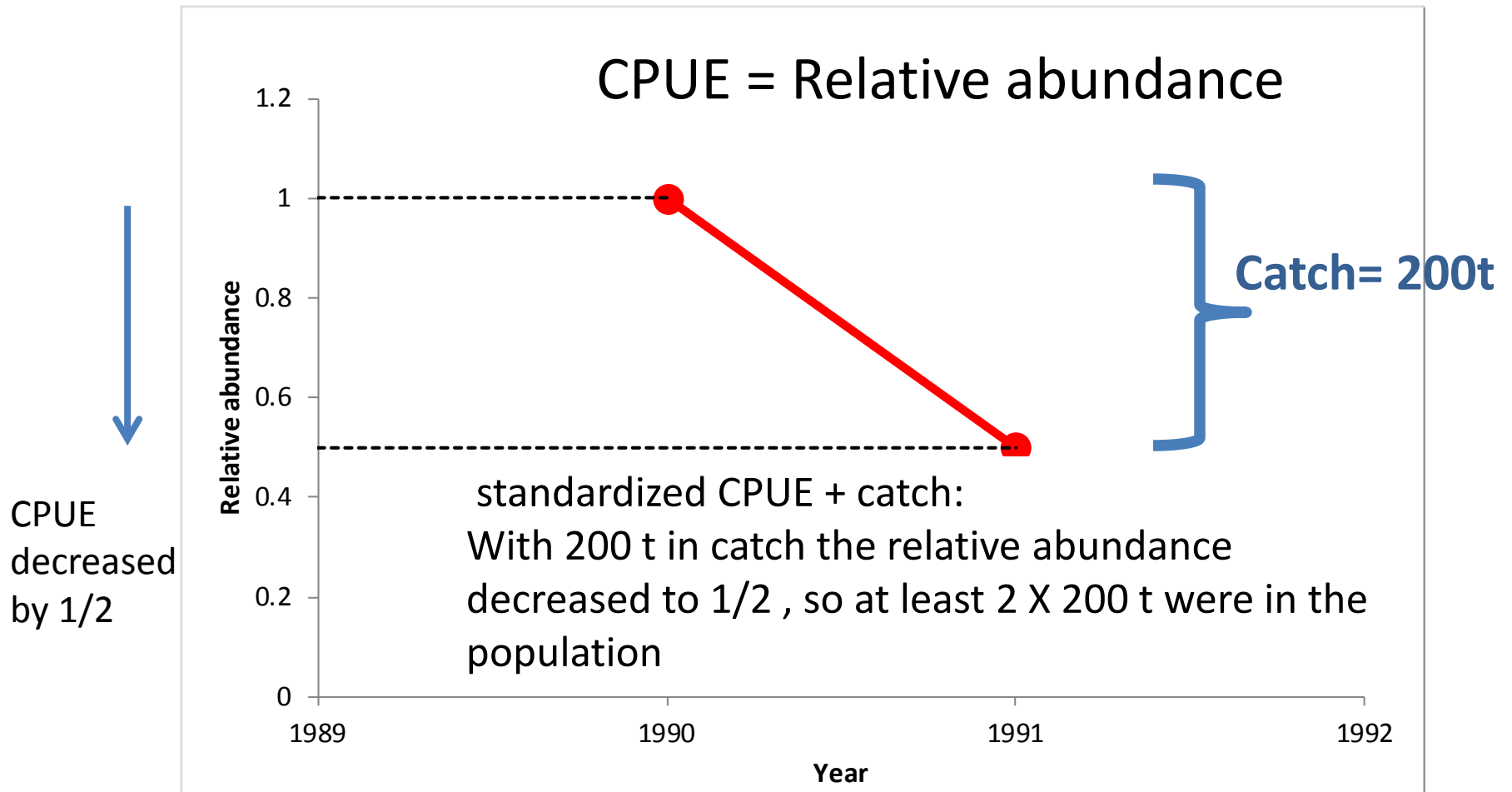
# CPUE: why use it



Maunder (2016)



# CPUE: why use it



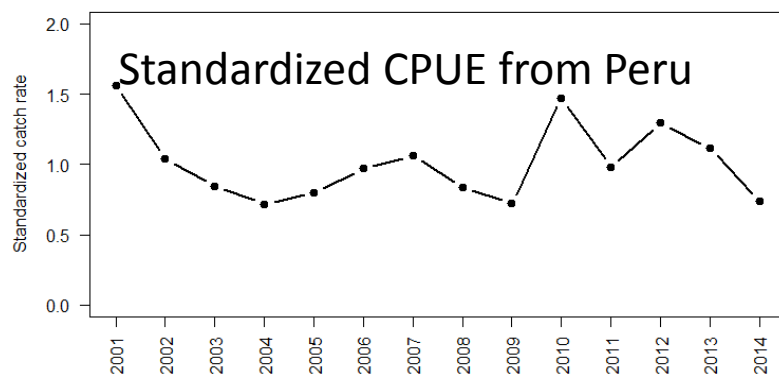
Maunder (2016)



# CPUE: what scale? Dorado work

## Annual cpue

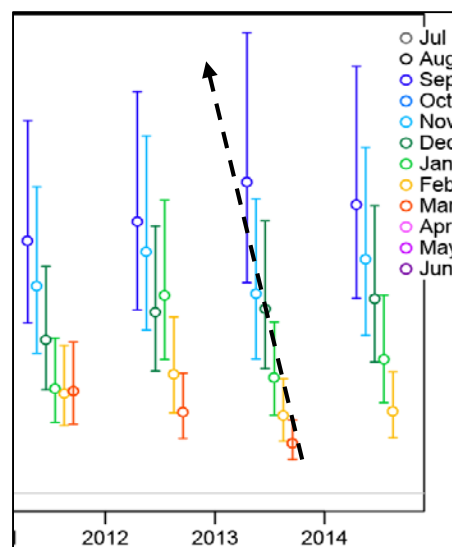
- Low information content
- Constant



Torrejón – Magallanes y Oliveros – Ramos (2015)

## Monthly cpue

- High information content
- Fast growth
- High mortality rate



Aires-da-Silva et al (2016)

Standardized CPUE from Ecuador



## **A Depletion Estimator for Within-Season Management of Yellowfin Tuna**

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La Jolla, CA, 92037-1508, USA  
mmaunder@iattc.org*

$$B_{y,w+1} = B_{y,w} (1 + G)S + R - C_{y,w}$$

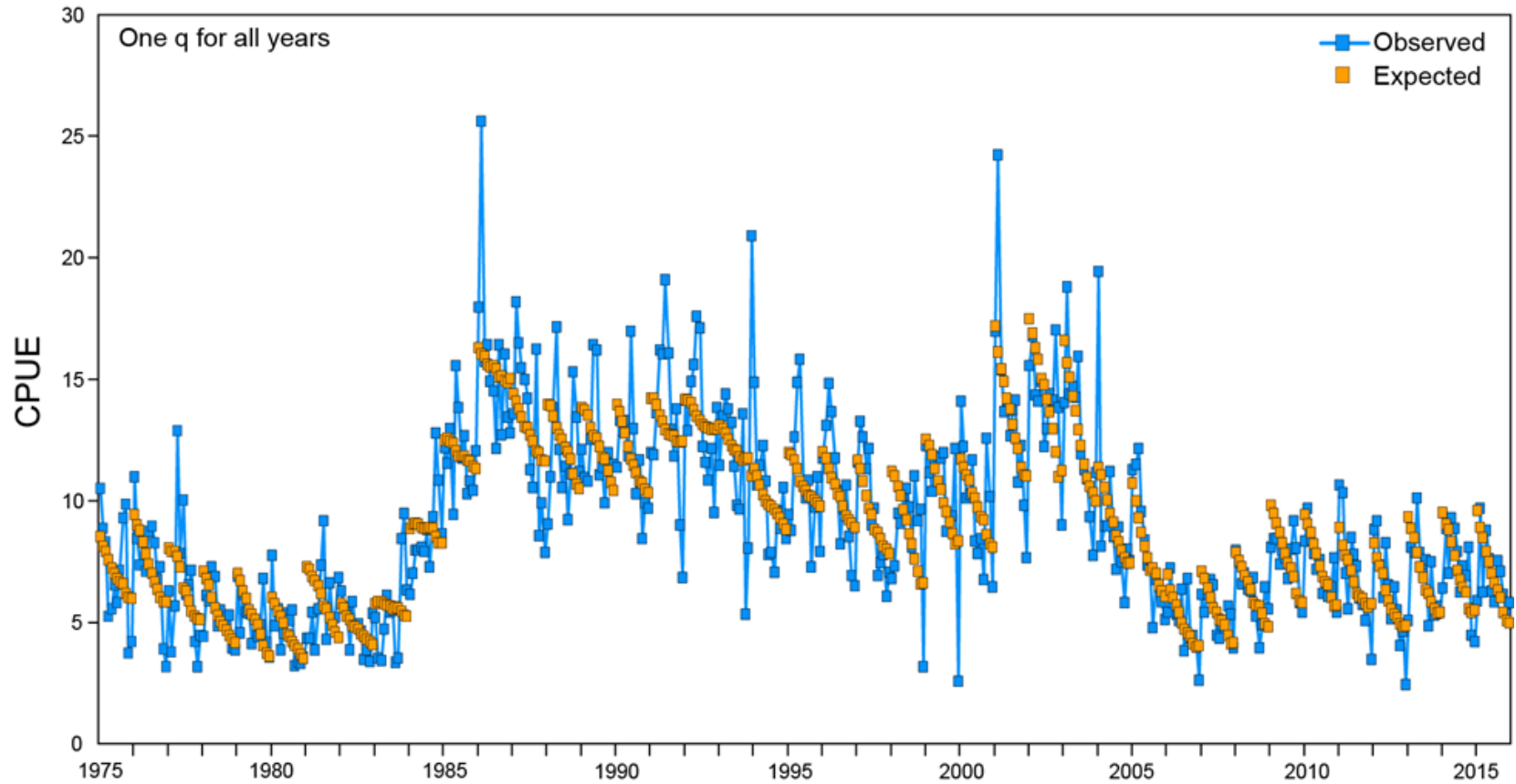
where  $B_{y,w}$  is the biomass in week  $w$  of year  $y$ , and  $C_{y,w}$  is the catch in week  $w$  of year  $y$ .

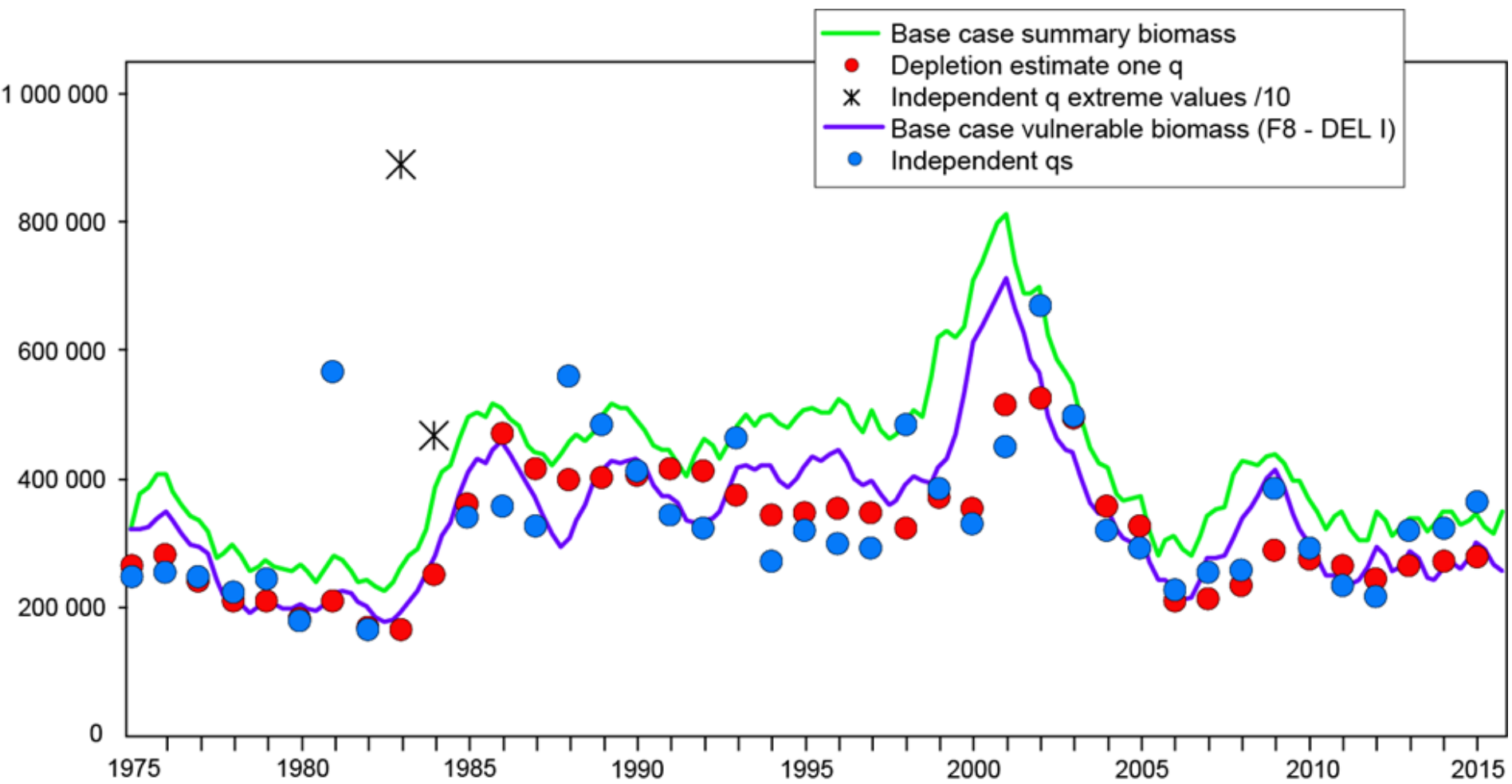
$$\text{CPUE} = q \times B_t$$

In this study we used a monthly time step  
CPUE is purse-seine catch per day fished,  
regardless of set type



# Results: fits to CPUE



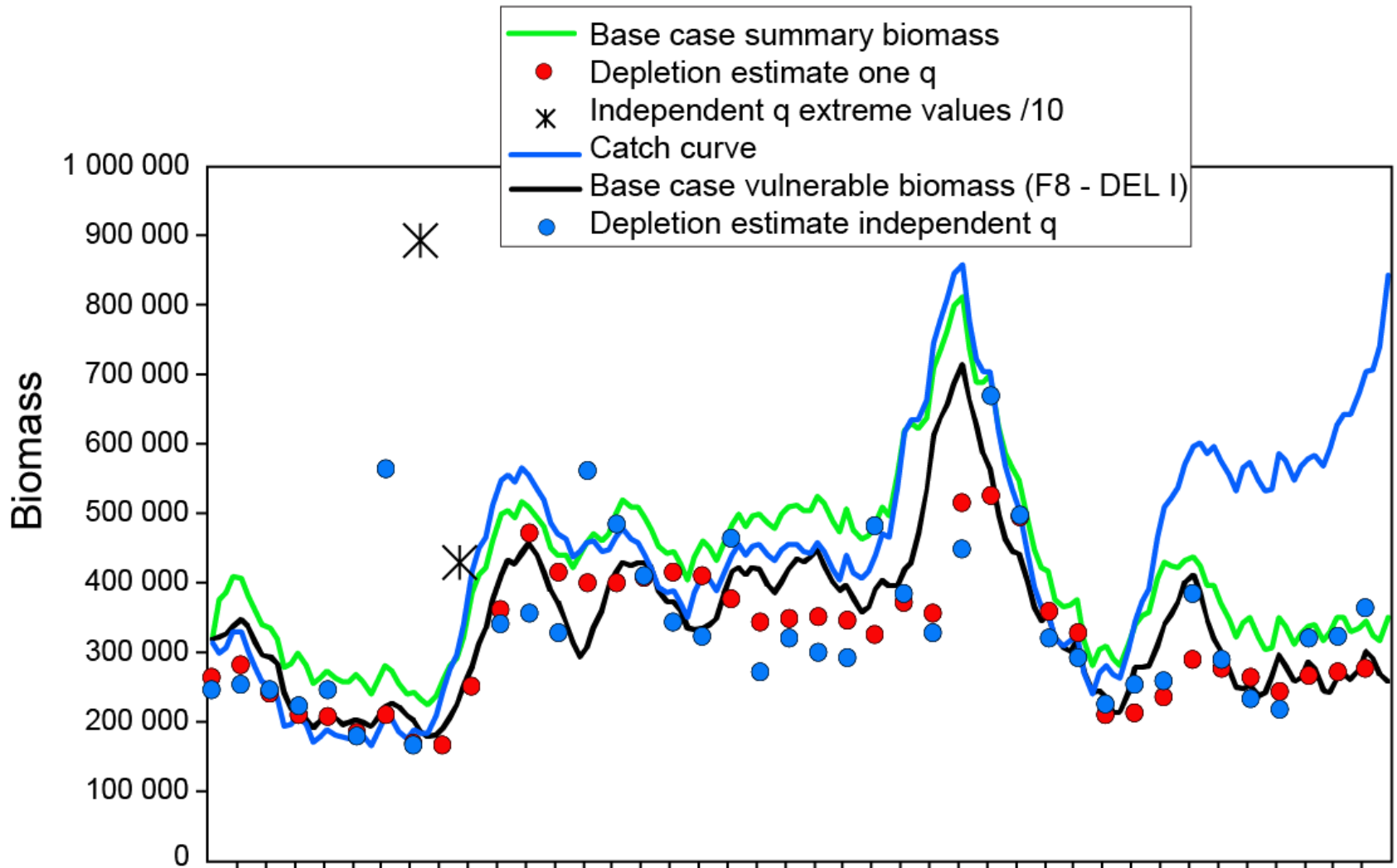


# Results depletion model

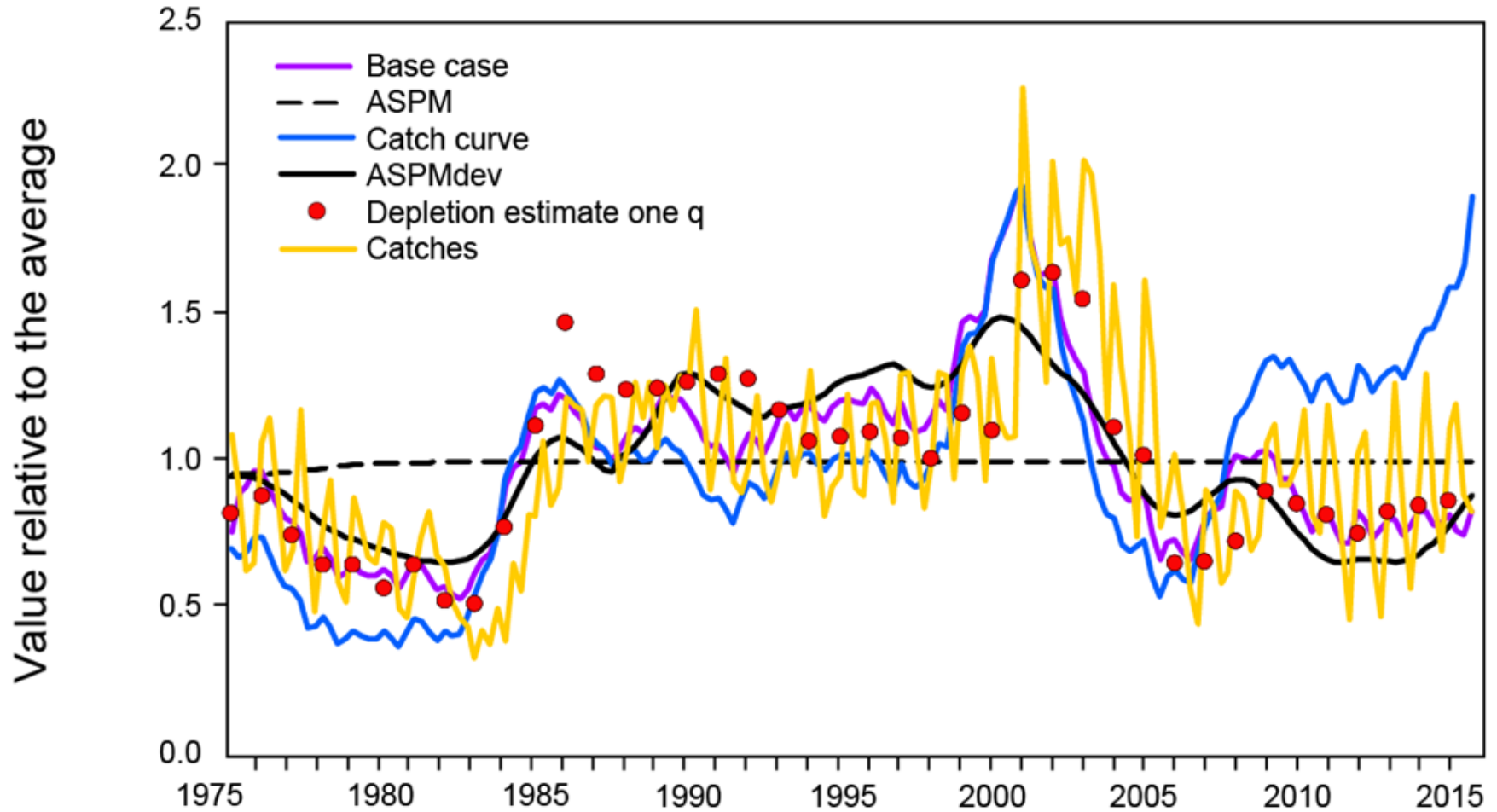
- The depletion estimator provided good fit to the data
- The depletion model was able to provide an estimate of the absolute abundance, which coincided with the base-case model, this increased our confidence on the integrated model
- This approach should be investigated for improving the assessment, for example by changing to a monthly time step

# Summary of results

# Absolute abundance



# Relative abundance



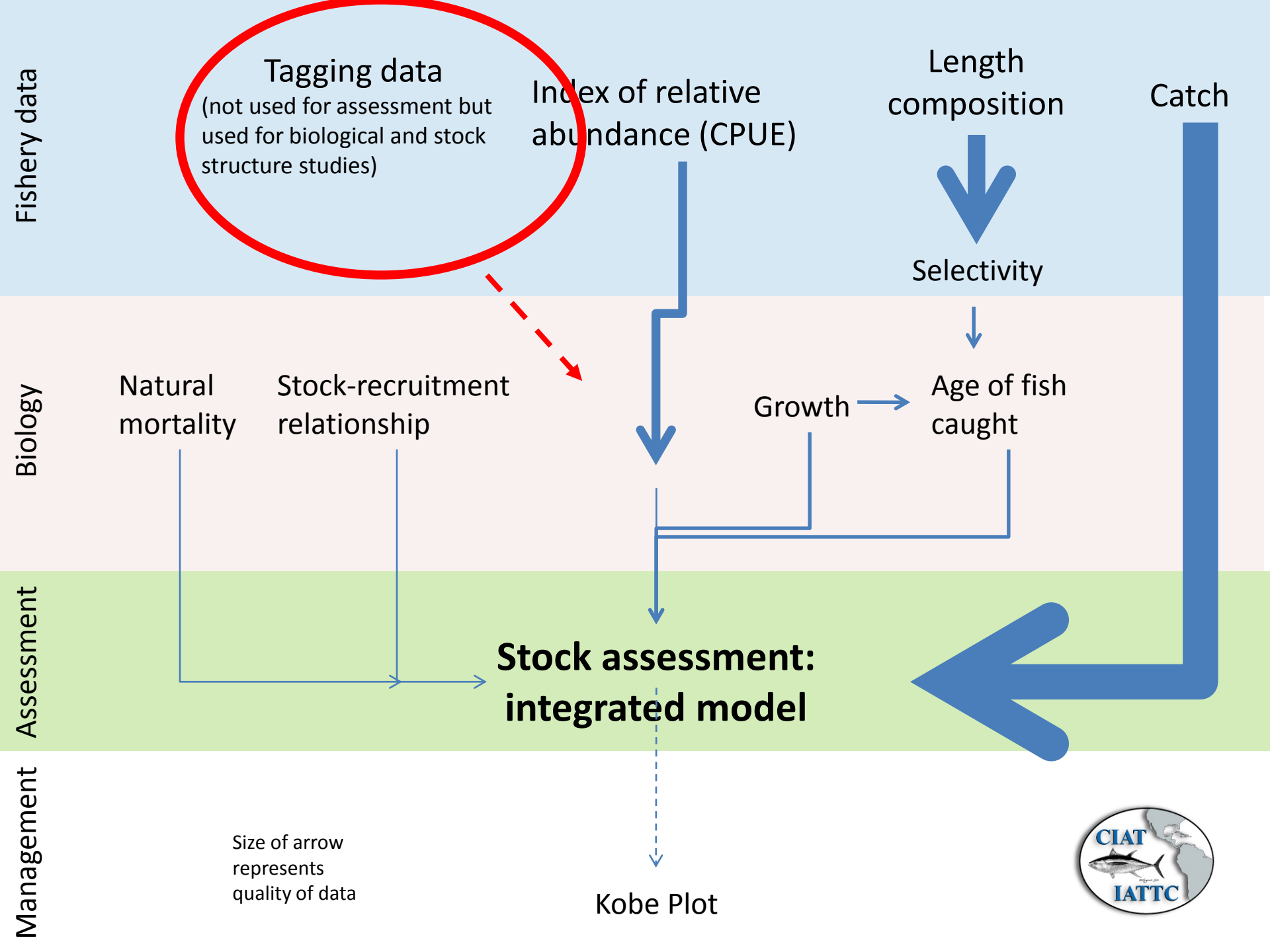
# Conclusions

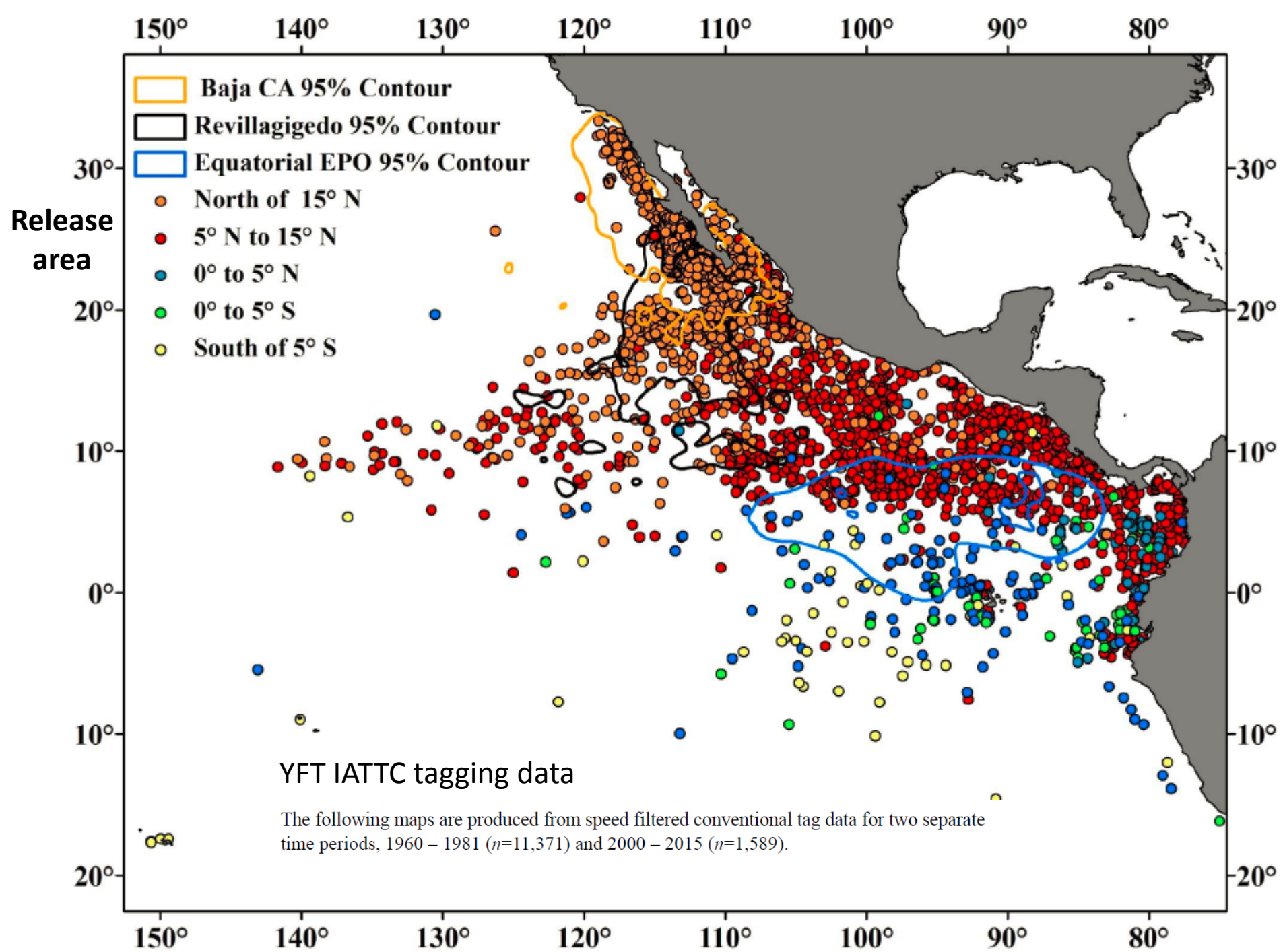
- The absolute scale cannot be estimated from the five indices of relative abundance (CPUE) alone within the age-structure production model, unless precise estimates of recruitment deviations are provided (ASPMfix)
- Only relative changes in abundance can be estimated from the five indices of relative abundance (CPUE) within a ASPMdev model
- The indices of relative abundance from LL are in contradiction to those from PS
- The LL index should be investigated for changes in the fishery that might have influenced its ability to represent relative abundance.

# Conclusions

- The absolute biomass estimates from the catch-curve are similar to those of the base-case model, except at the end of the series, which might be an indication model misspecification at the end of the time-series
- The depletion estimator provided good fit to the data, was able to provide an estimate of the absolute abundance, which coincided with the base-case model, and increase our confidence in the stock assessment model.
- Given the good performance of the depletion model presented here and in Maunder (2010), suggests that the approach should investigated for improving the assessment, for example by changing to a monthly time step
- Also, the depletion model could provide “in-season” abundance estimates, important if catch quotas are used for management







# Conclusions

- Tagging data could be another piece of information to be integrated into the models
- Tagging data provides information on biological (growth, natural mortality, movement and mixing rates) and fisheries process
- A large-scale tagging program can be used to estimate abundance

Thank you