



# Sensitivity of anchovy population to environmental change in the Bay of Biscay using a bioenergetic model

Juan Bueno-Pardo, Pierre Petitgas, Susan Kay, Martin Huret

# Research within the framework of the European project CERES



# Introduction

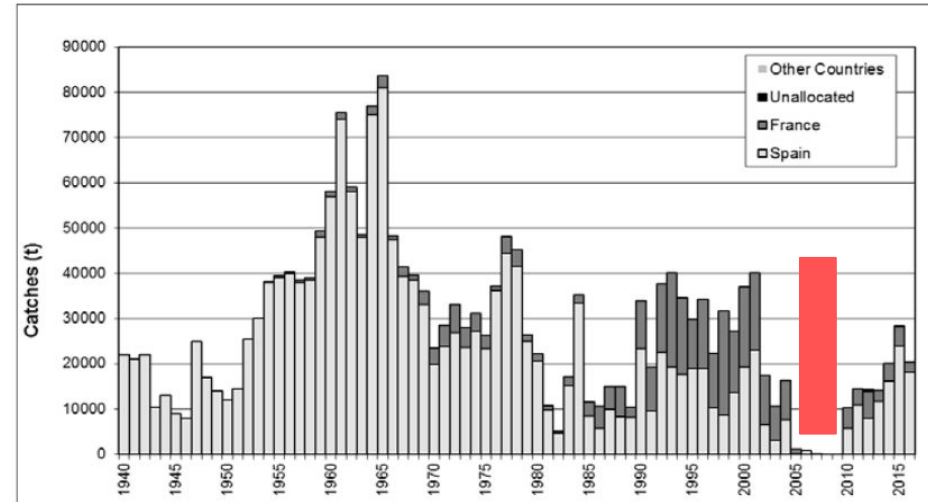
- Study area and species
- Conceptual framework



# Study area and species:

## Bay of Biscay

### *Engraulis encrasicolus*



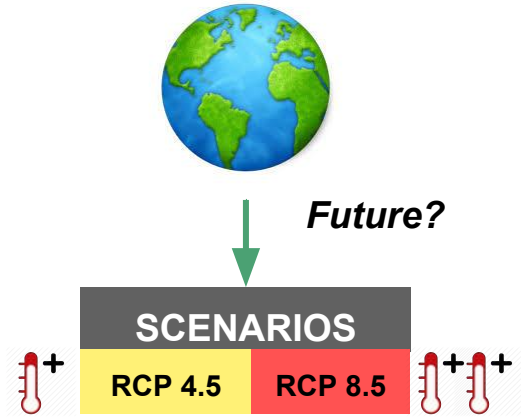
ICES. 2017. Report of the Working Group on Southern Horse Mackerel, Anchovy and Sardine (WGHANSA)

# Conceptual framework

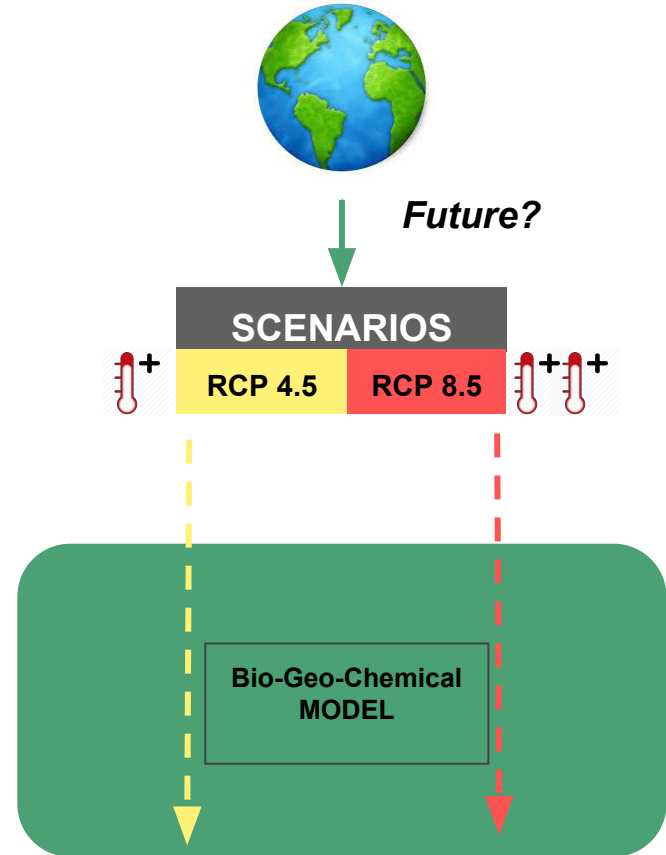


***Future?***

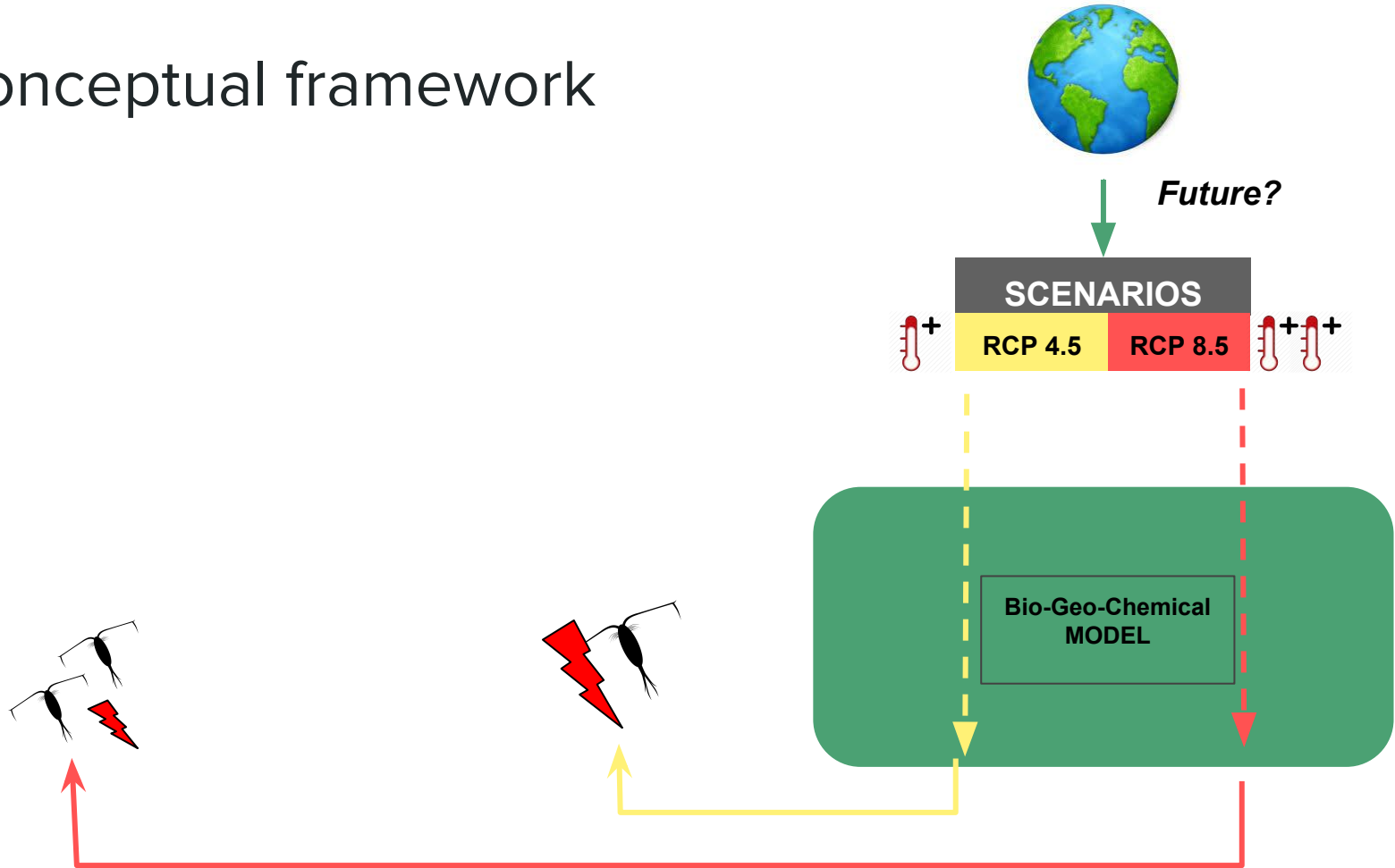
# Conceptual framework



# Conceptual framework

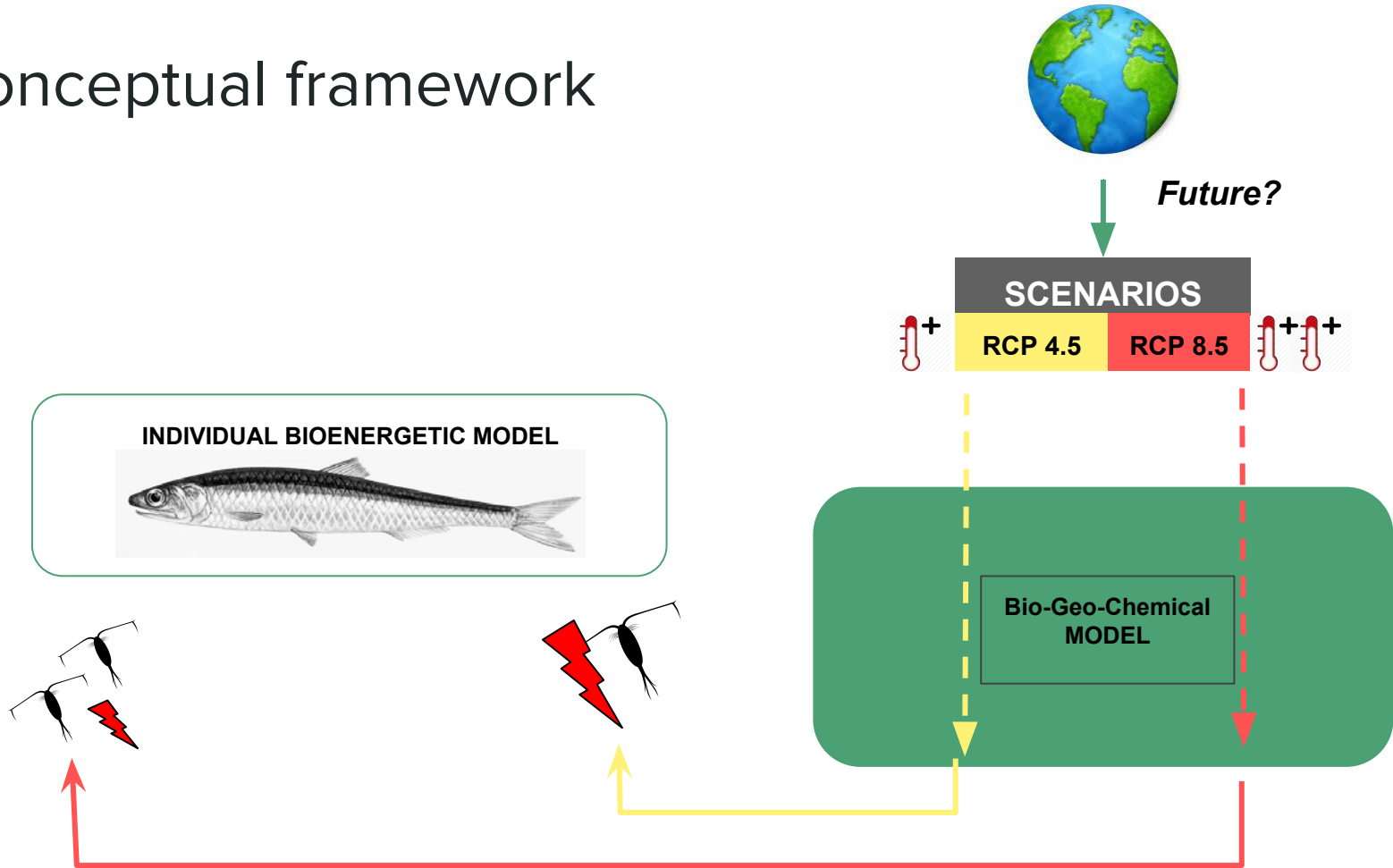


# Conceptual framework

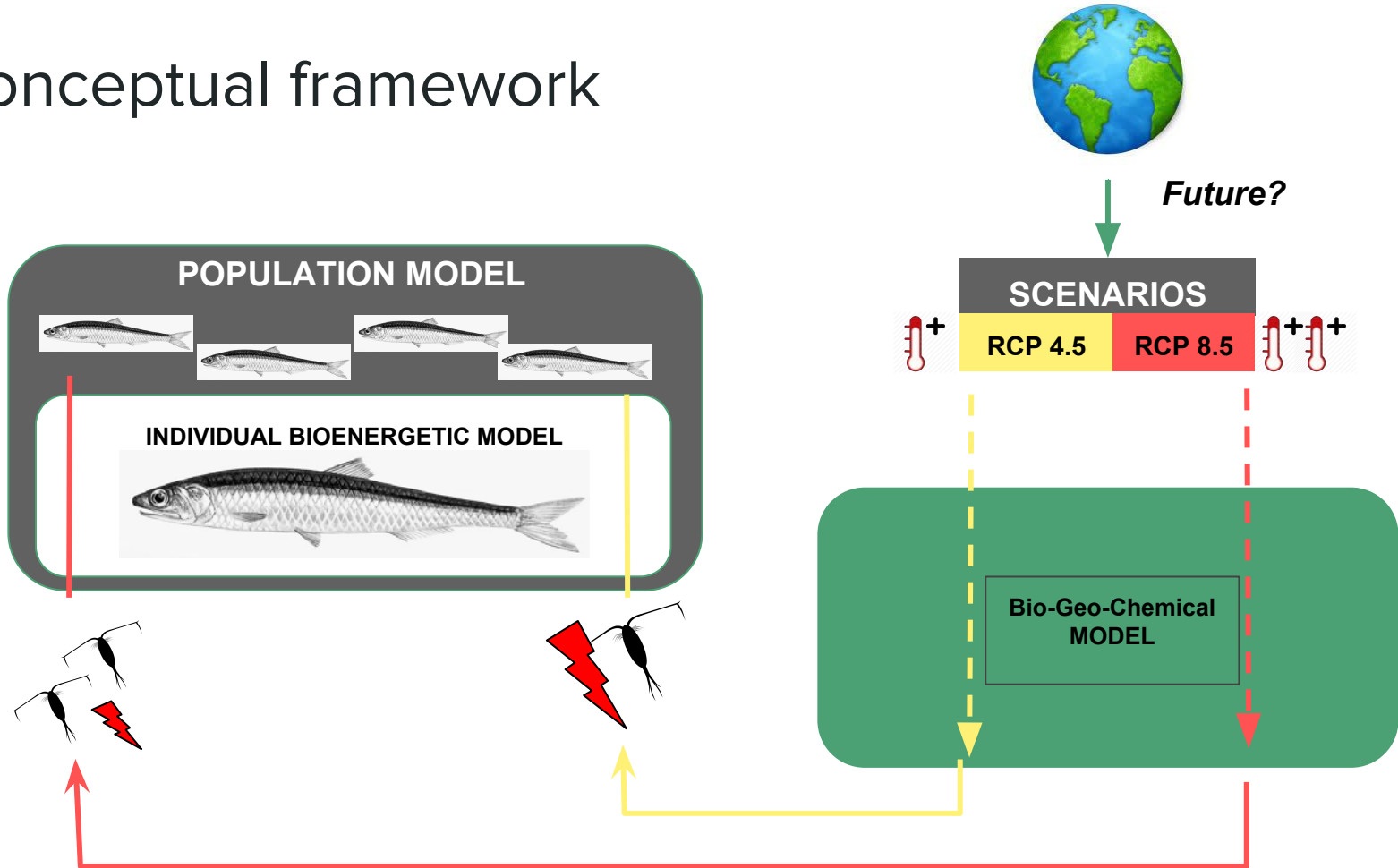


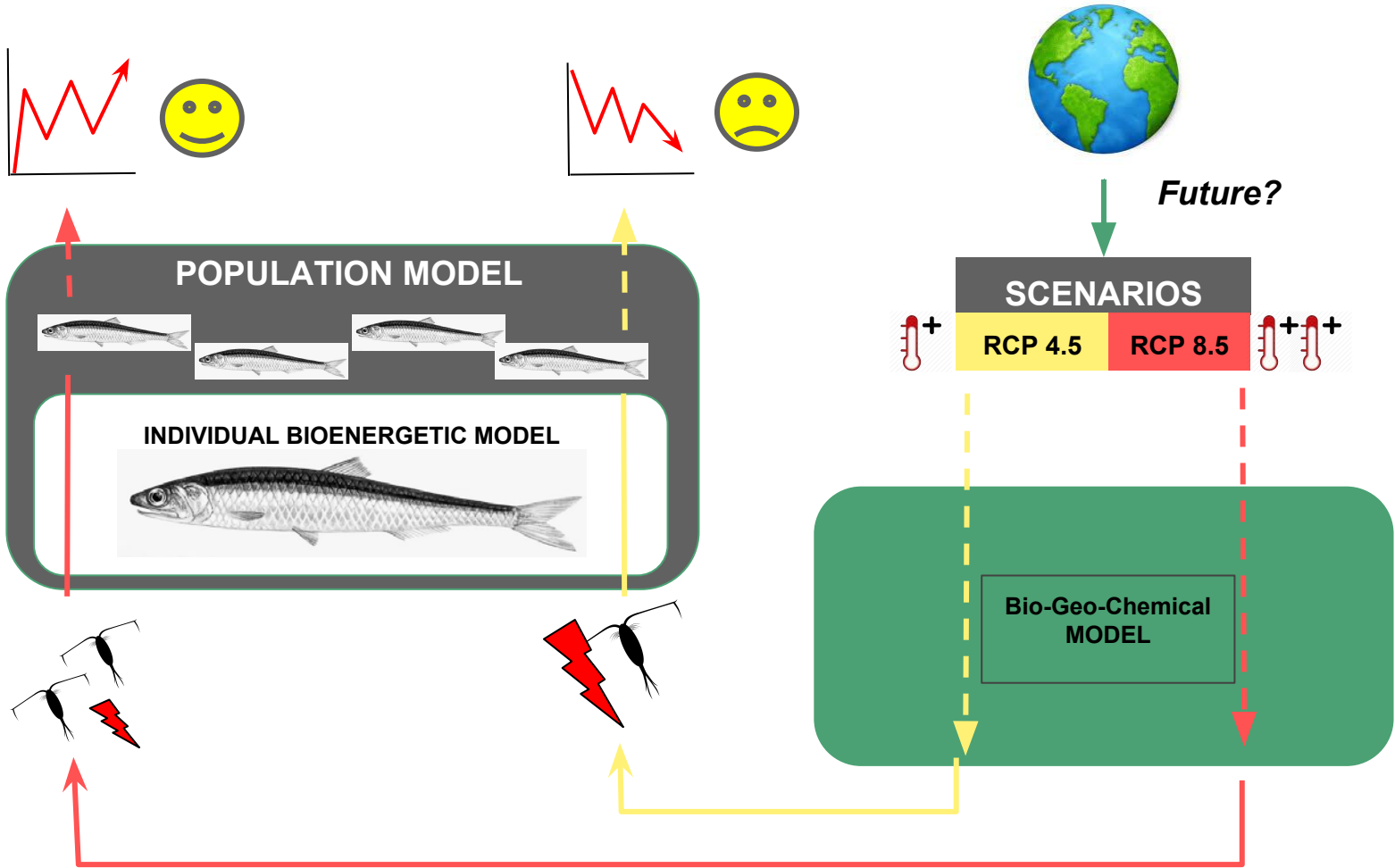


# Conceptual framework



# Conceptual framework





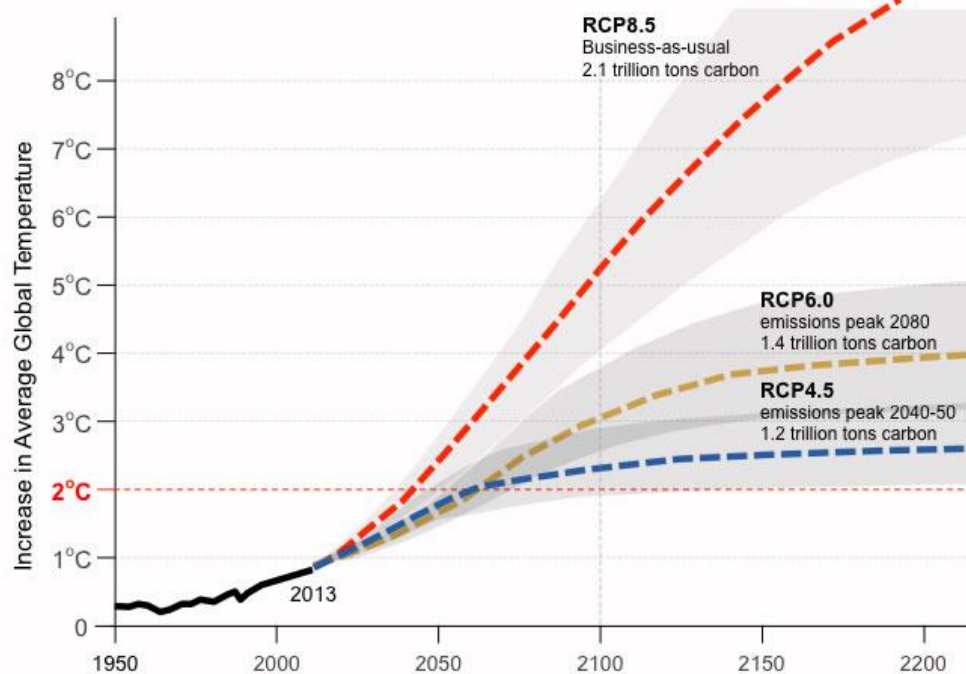
# Methodology

- Climate change scenarios
- Environmental modelling
- Individual bioenergetics model
- Population model

# Climate change scenarios proposed by IPCC

## RCP 4.5 and 8.5

Representative  
Concentration  
Pathways



Global Temperature Projections for various RCP Scenarios

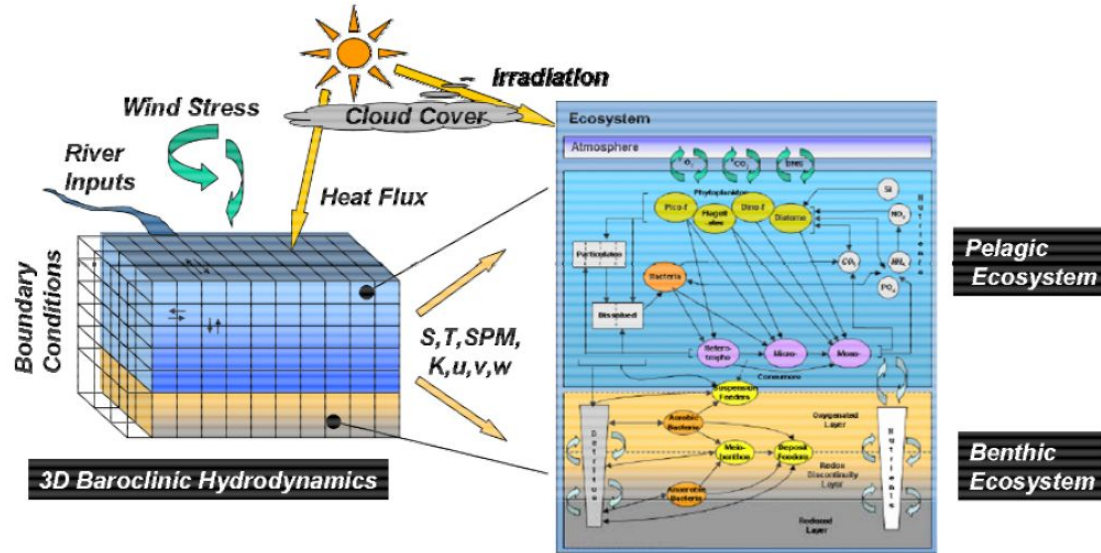
Source: Architecture 2030; Adapted from IPCC Fifth Assessment Report, 2013  
Representative Concentration Pathways (RCP), temperature projections for SRES scenarios and the RCPs.



# Regional bio-geo-chemical model

## POLCOMS-ERSEM (Plymouth Marine Laboratory)

- 2040-2060 / 2080-2100
- Temperature: 30 and 150 m
- Zooplankton: 50 m

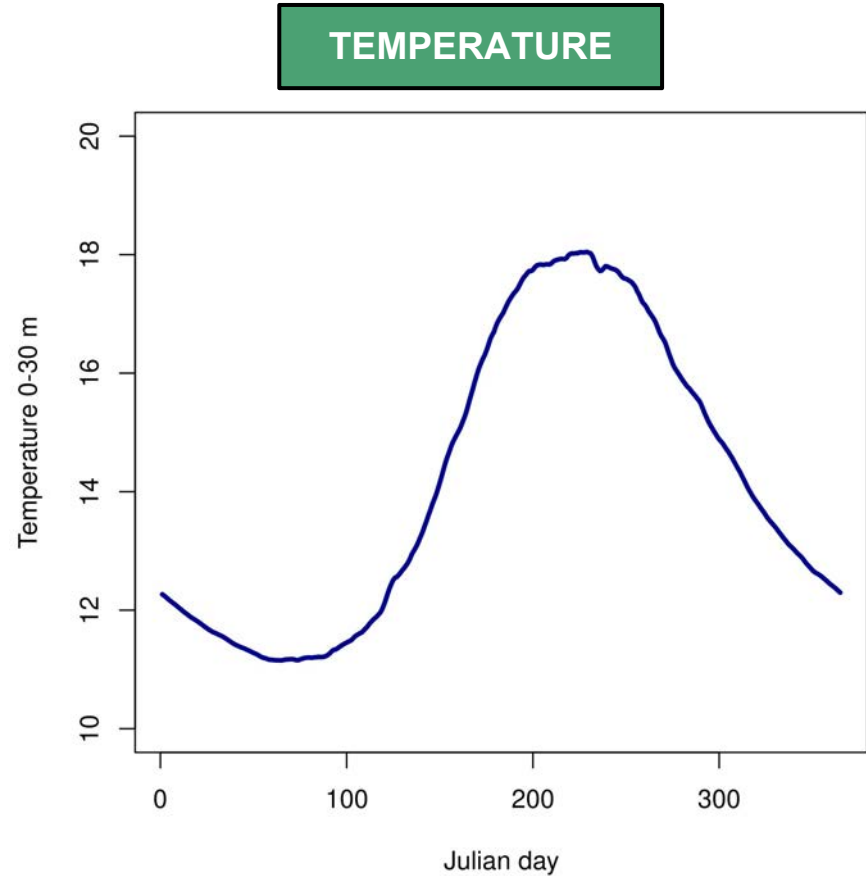


Proctor et al., 2005

# Climatic model

## **POLCOMS-ERSEM**

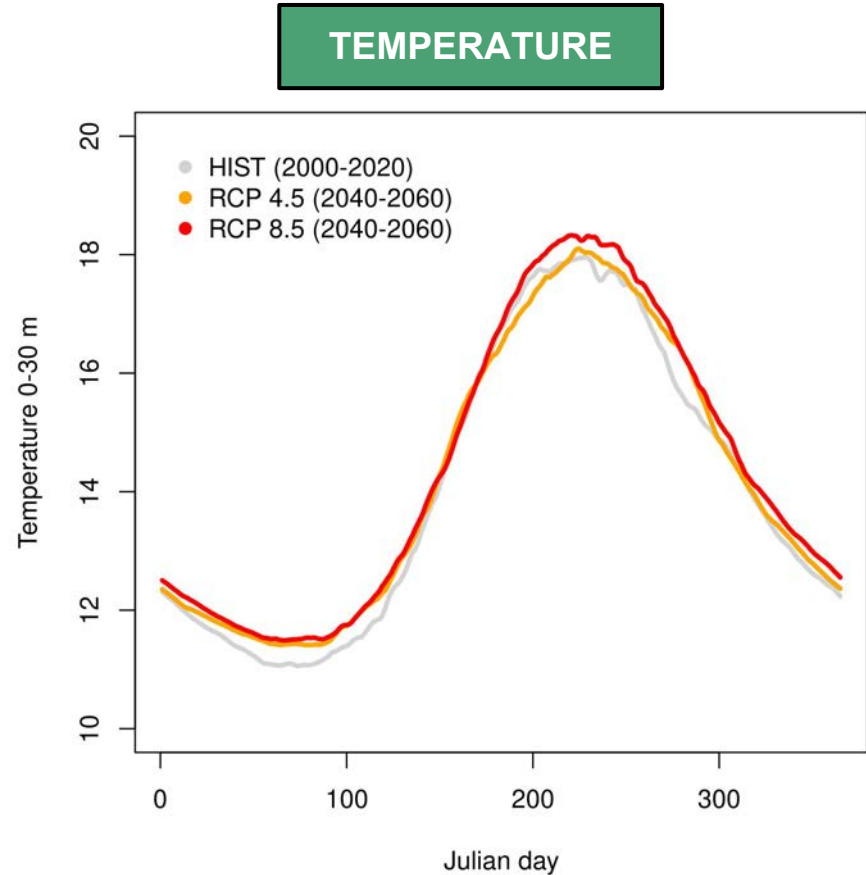
- Historical Run 1996 - 2015  
used for hindcast



# Climatic model

## POLCOMS-ERSEM

- Historical Run 1996 - 2015 used for hindcast
- Climate Run 2040 - 2060
  - a. RCP 4.5
  - b. RCP 8.5

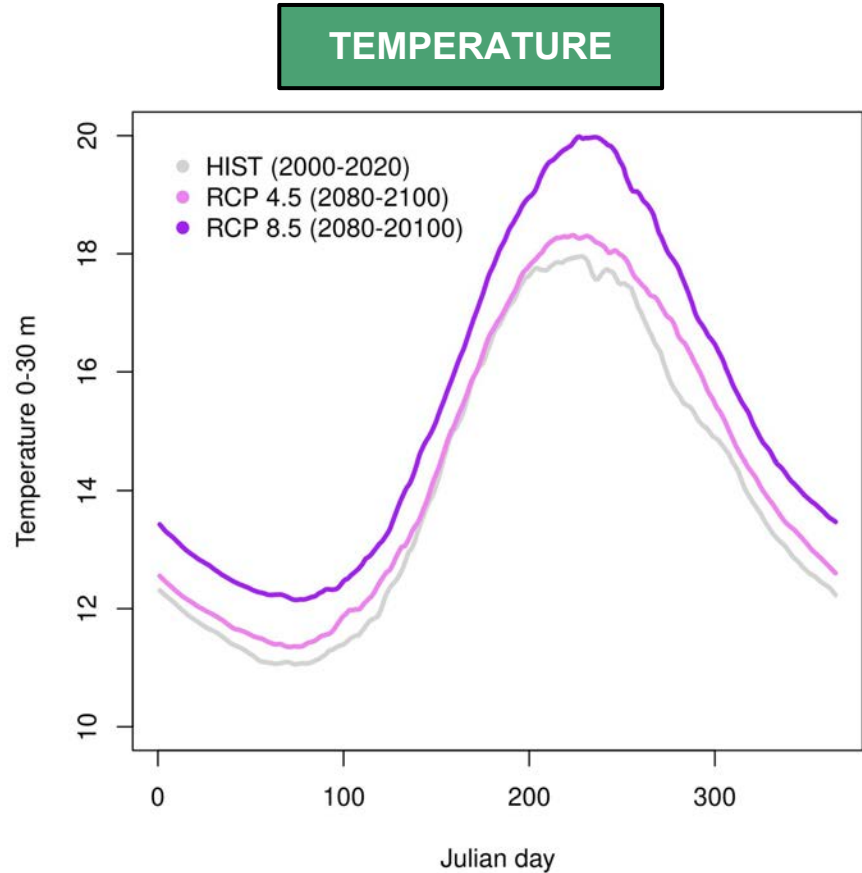




# Climatic model

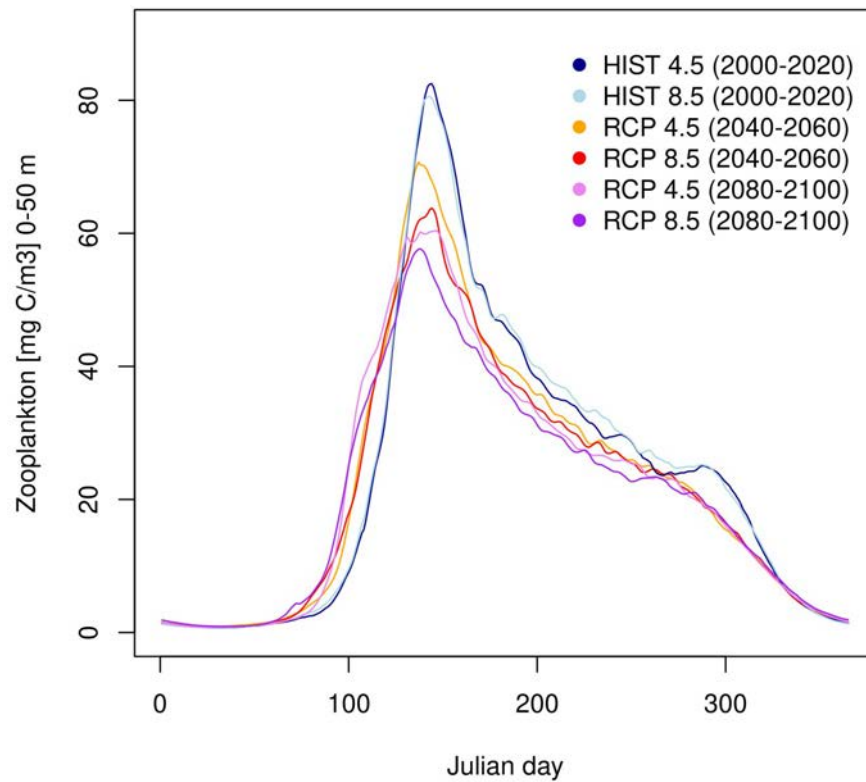
## POLCOMS-ERSEM

- Historical Run 1996 - 2015 used for hindcast
- Climate Run 2080 - 2100
  - a. RCP 4.5
  - b. RCP 8.5



# Climatic model POLCOMS-ERSEM

## ZOOPLANKTON



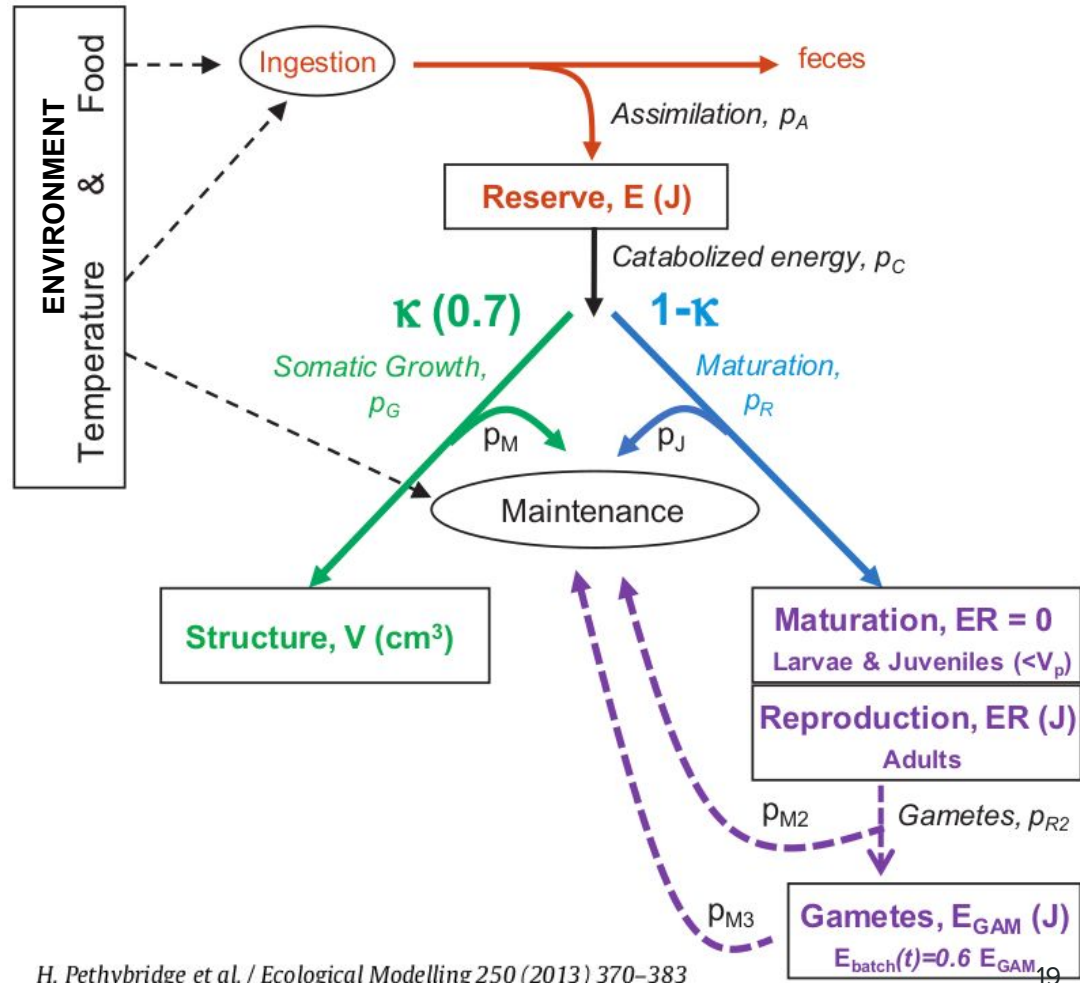
# Individual model: Dynamic Energy Budget

S.A.L.M. Kooijman

One individual is represented by four state variables:

- Reserves ( $E$ )
- Structure ( $V$ )
- Maturation ( $E_H$ )
- Reproduction ( $E_R$ )

Food (zooplankton) and temperature are the forcing variables



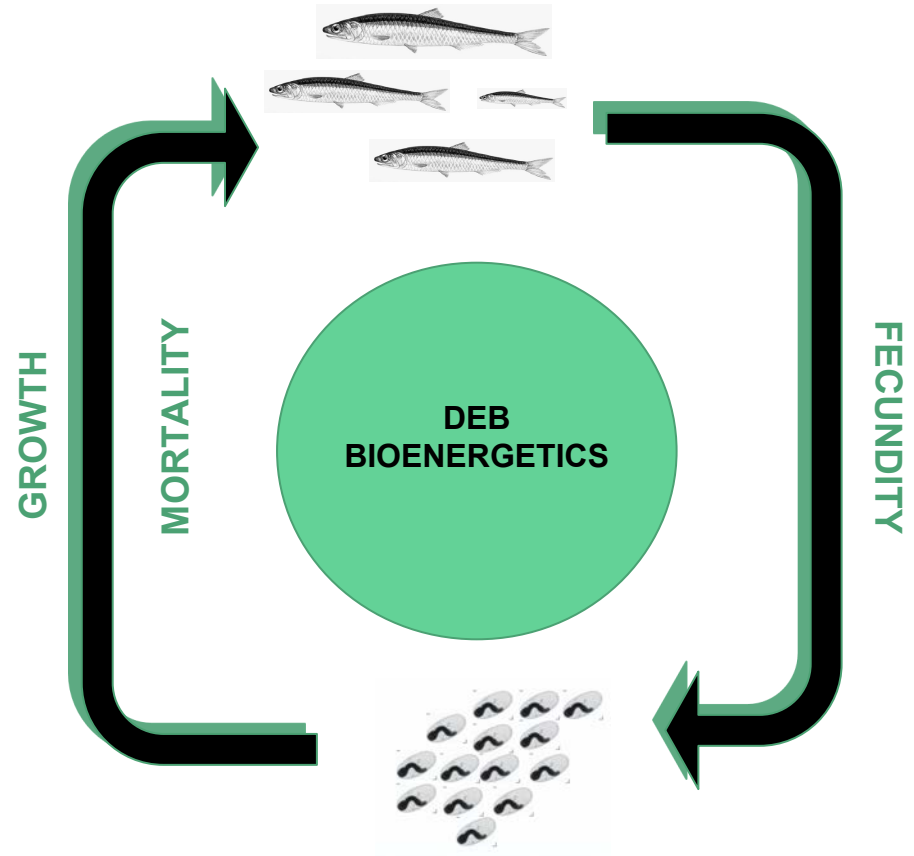
# Population model: Individual Based Model

The model is not spatialized

Super-individuals as modelling units

Mortality at three levels:

- DEB (starving mortality)
- Natural (calibrated)
- Fishing (semestral, ICES)



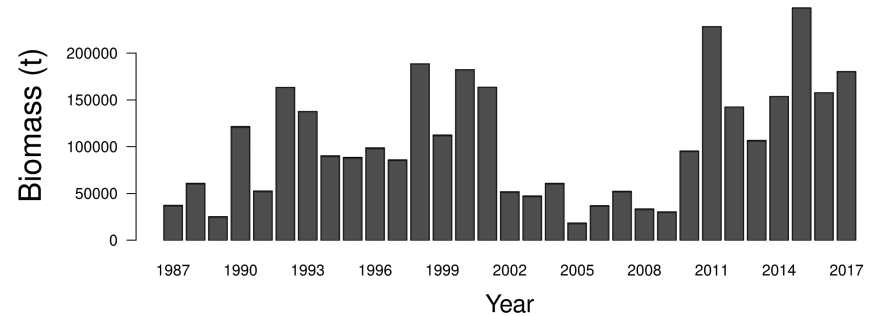
# Results

- Calibration of population model
- Forecast

# Model calibration

## Population level

- Fit to CBBM time series between 1996-2015
- Optimization of mortality parameters by iteration:
  - Egg mortality rate ( $d^{-1}$ )
  - Adult mortality rate ( $d^{-1}$ )
  - Decrease coefficient of natural mortality with size ( $cm^{-1}$ )



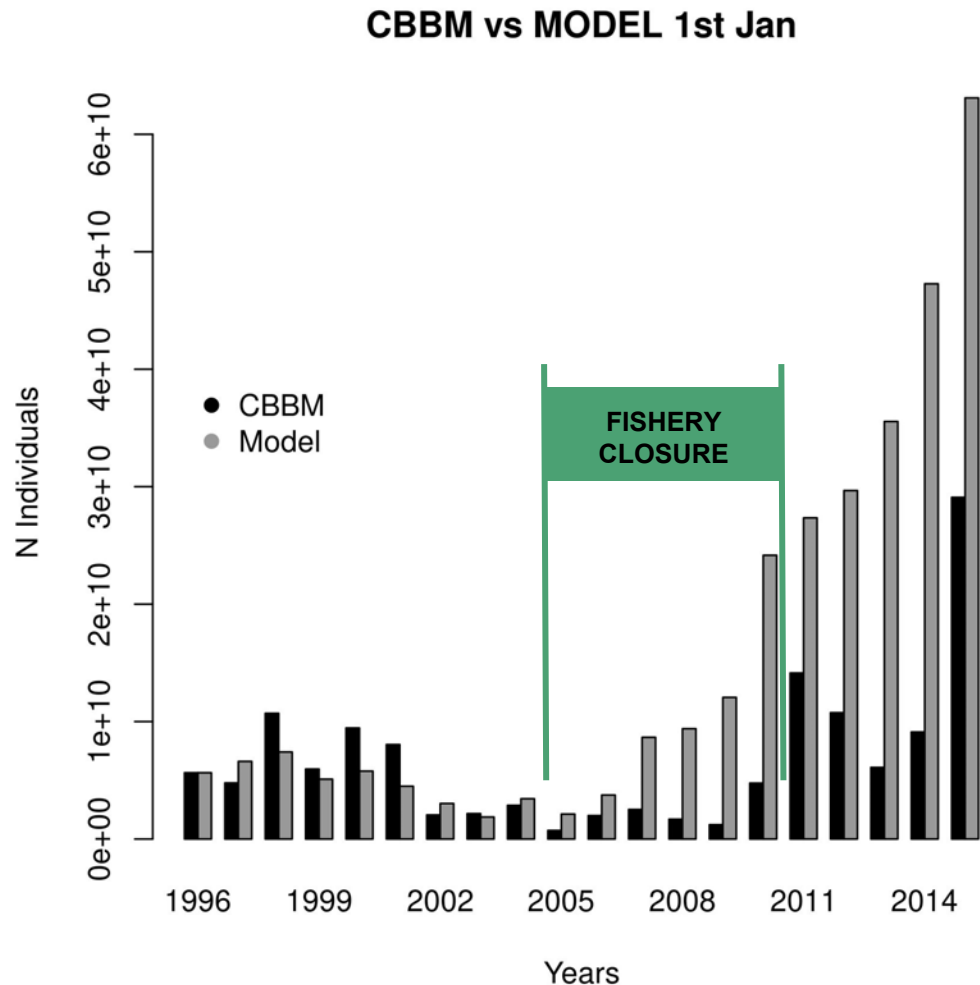
# Model calibration

## Populational level

Optimized parameters:

- Egg mortality:  $0.24 \text{ d}^{-1}$
- Adult mortality:  $0.0002 \text{ d}^{-1}$
- Decrease coefficient:  $0.36 \text{ (cm}^{-1}\text{)}$

Fishing mortality considered: semestral  
from the ICES report

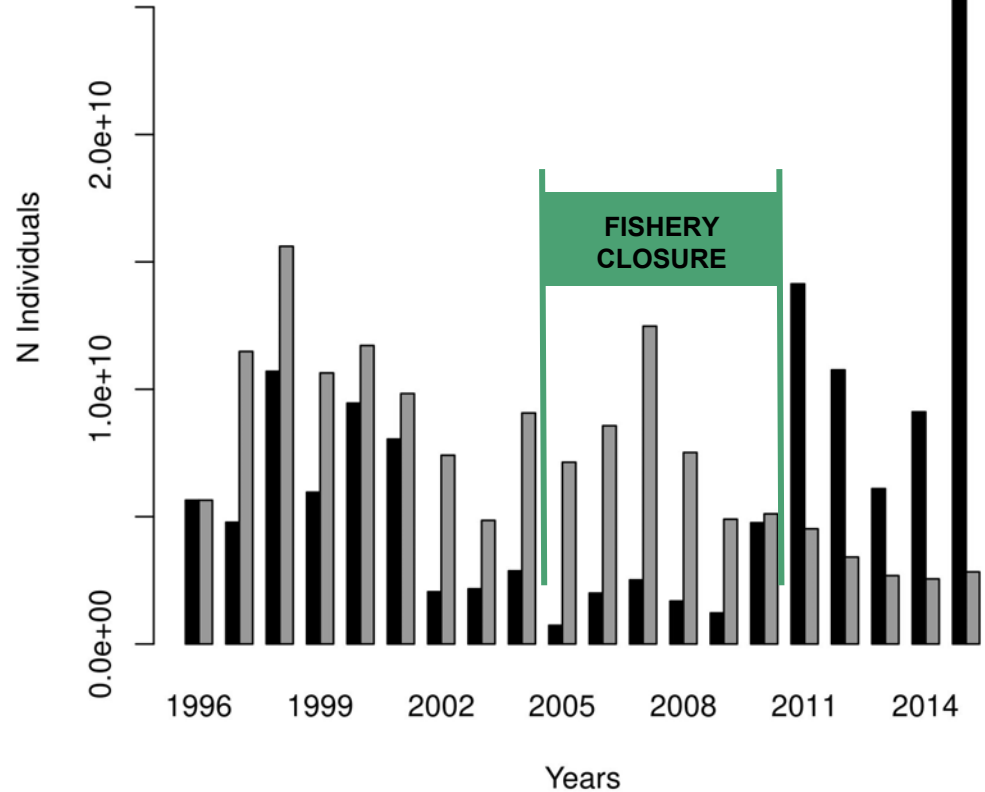


# Model calibration

## Populational level

Constant fishing mortality: 0.026

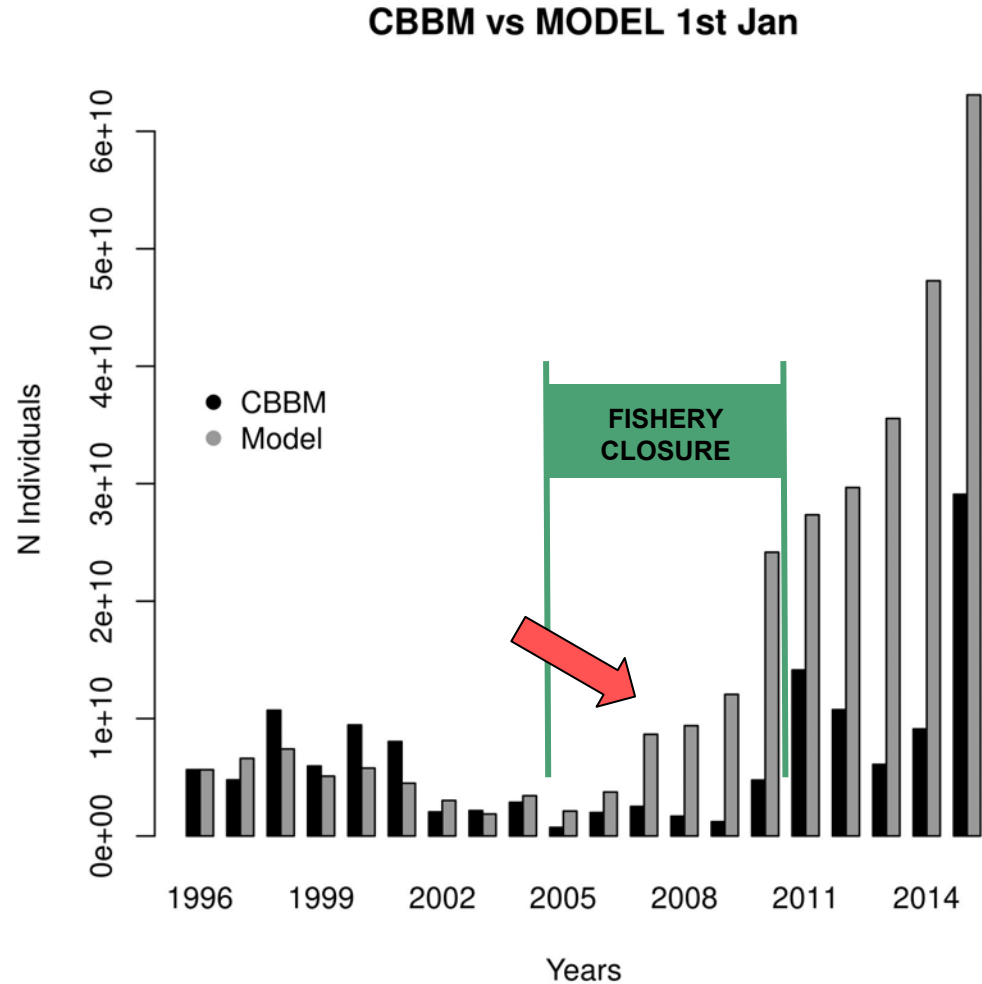
CBBM vs MODEL 1st Jan





# Model calibration

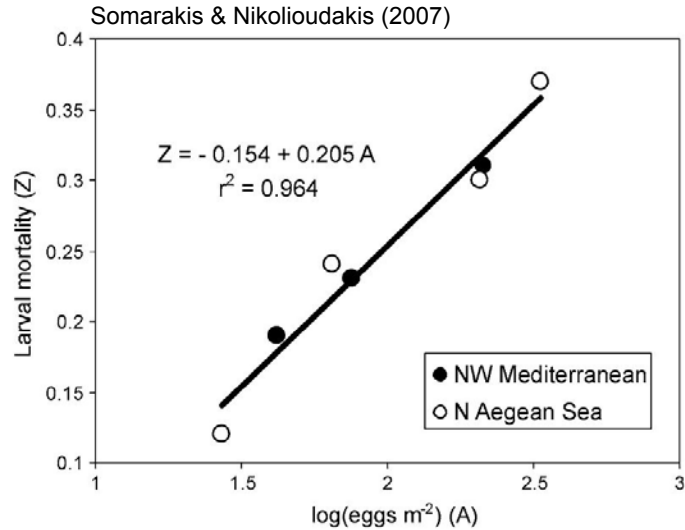
## Populational level



# Model calibration

## Hindcast

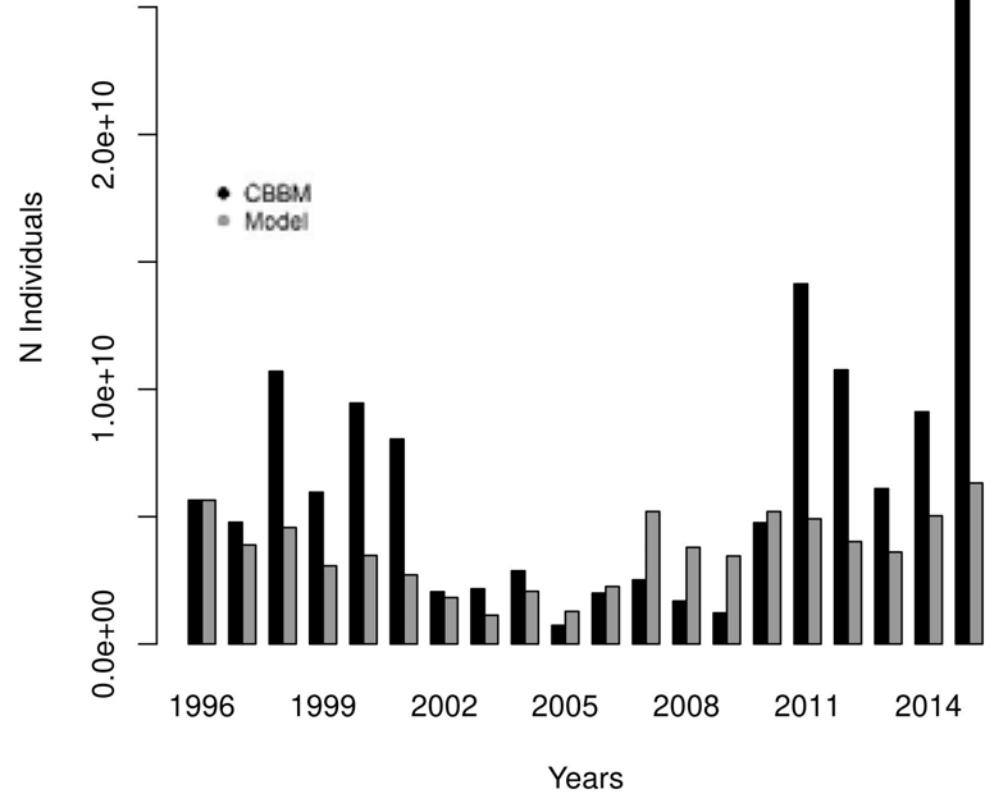
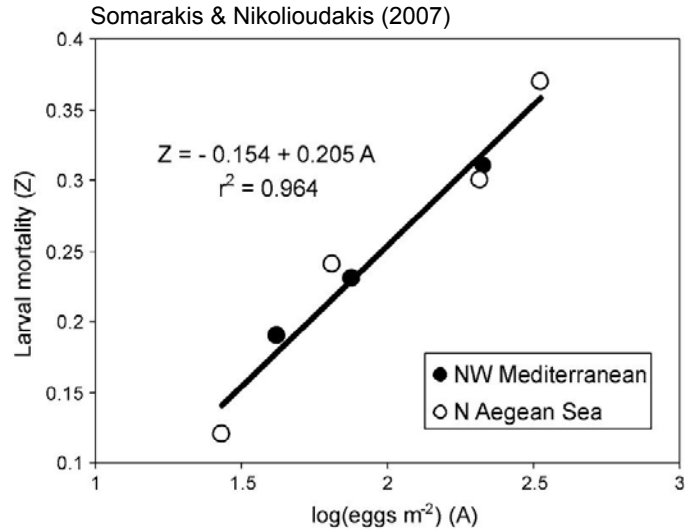
### Density-dependent larval mortality



# Model calibration

## Hindcast

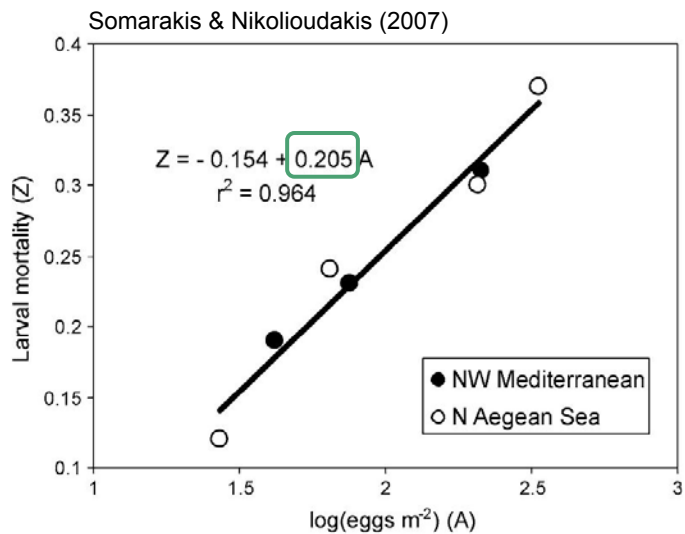
### Density-dependent larval mortality



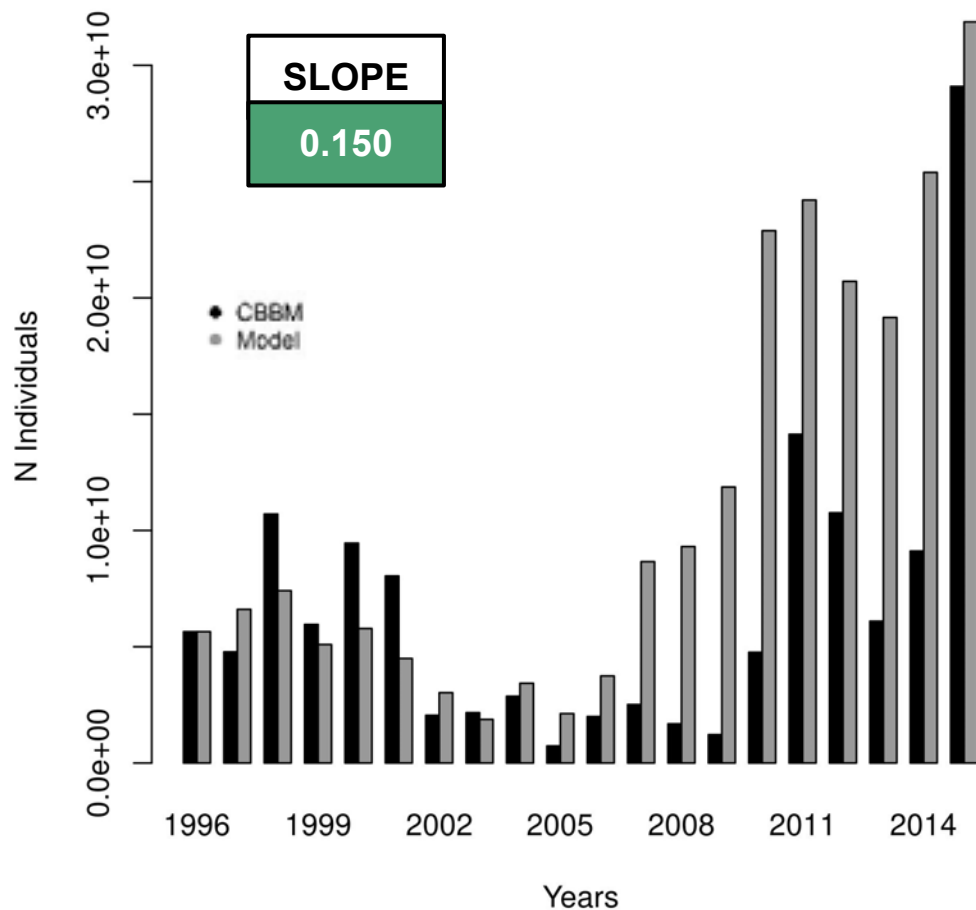
# Model calibration

## Hindcast

### Density-dependent larval mortality



### CBBM vs MODEL 1st Jan



# Forecast

- 2040 - 2060 / 2080 - 2100
  - RCP 4.5 & RCP 8.5
  - 3 fishing scenarios
    - $F^* 1$
    - $F^* \frac{1}{2}$
    - $F^* 0$

2040 - 2060

---

RCP 4.5

2040 - 2060

RCP 8.5

F \* 1

F \* 1/2

F \* 0

2040 2050 2060

2040 2050 2060

RCP 4.5

2040 - 2060

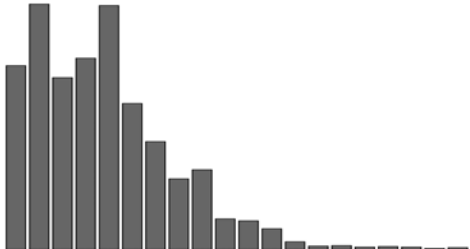
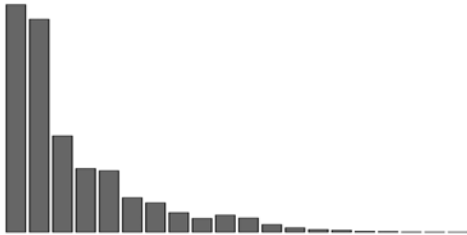
RCP 8.5

$6 \cdot 10^9$

$7 \cdot 10^9$

N

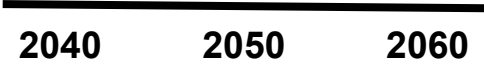
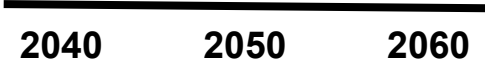
N



F \* 1

F \* 1/2

F \* 0





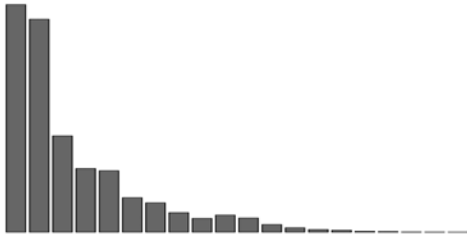
RCP 4.5

2040 - 2060

RCP 8.5

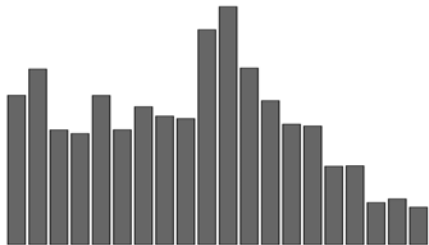
$6 \cdot 10^9$

N



$8 \cdot 10^9$

N



2040 2050 2060

2040 - 2060

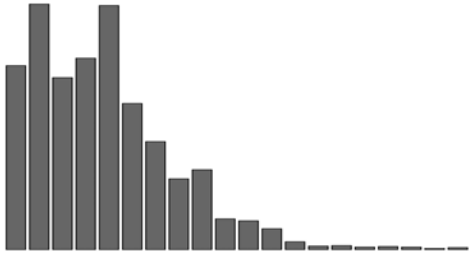
F \* 1

F \* 1/2

F \* 0

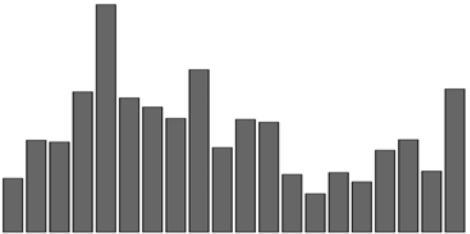
$7 \cdot 10^9$

N



$2 \cdot 10^{10}$

N



2040 2050 2060

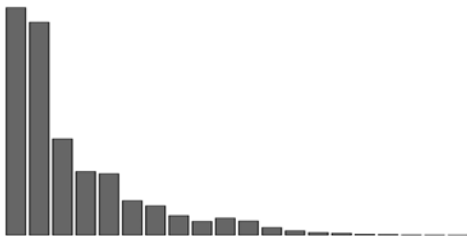
RCP 4.5

2040 - 2060

RCP 8.5

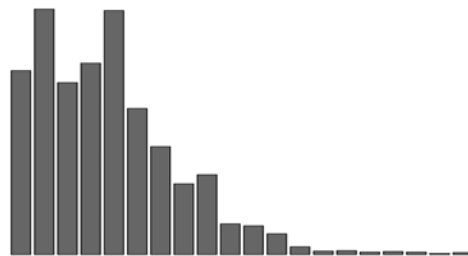
$6 \cdot 10^9$

N



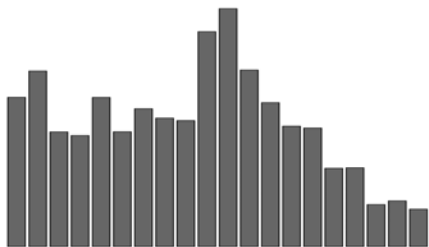
$7 \cdot 10^9$

N



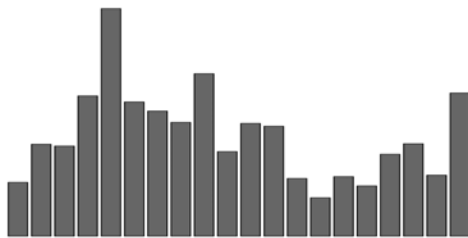
$8 \cdot 10^9$

N



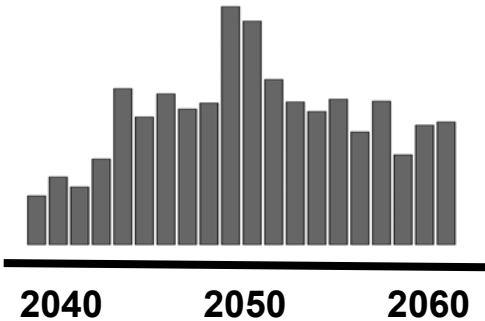
$2 \cdot 10^{10}$

N



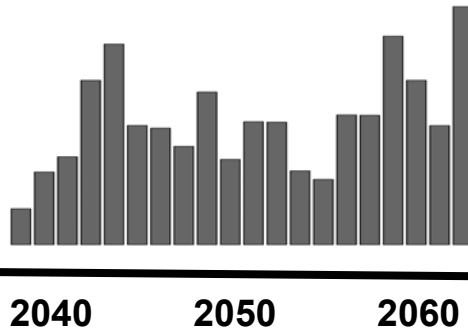
$2.5 \cdot 10^{10}$

N



$3 \cdot 10^{10}$

N



F \* 1

F \* 1/2

F \* 0

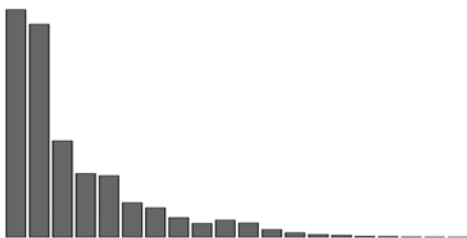
RCP 4.5

2040 - 2060

RCP 8.5

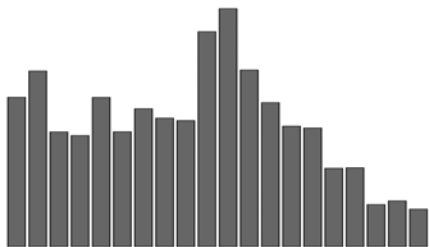
$6 \cdot 10^9$

N



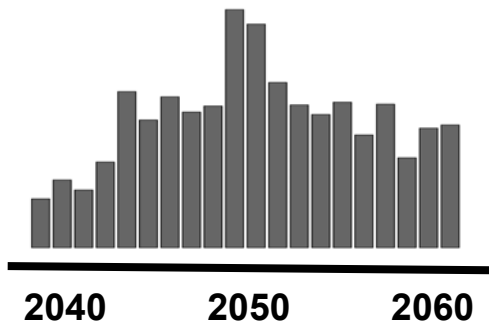
$8 \cdot 10^9$

N



$2.5 \cdot 10^{10}$

N



2040

2050

2060

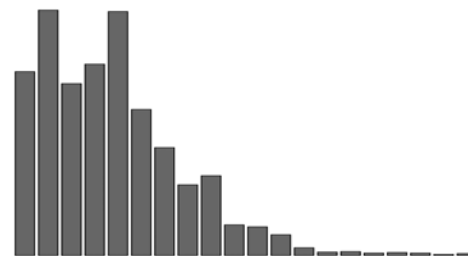
F \* 1

F \* 1/2

F \* 0

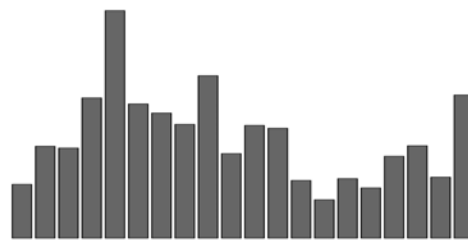
$7 \cdot 10^9$

N



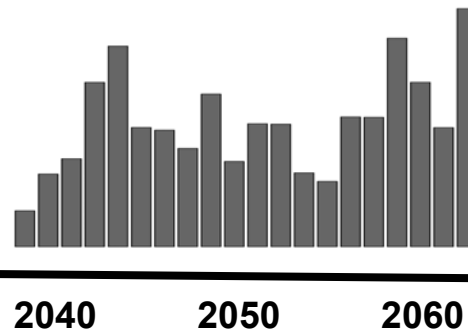
$2 \cdot 10^{10}$

N



$3 \cdot 10^{10}$

N



2040

2050

2060

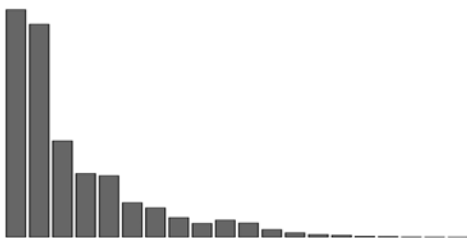
RCP 4.5

2040 - 2060

RCP 8.5

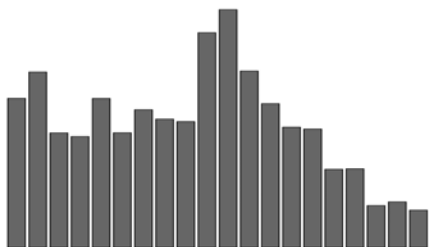
$6 \cdot 10^9$

N



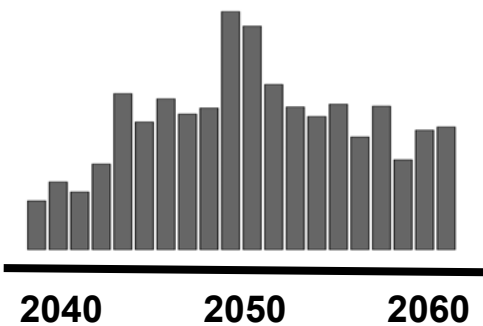
$8 \cdot 10^9$

N



$2.5 \cdot 10^{10}$

N



2040

2050

2060

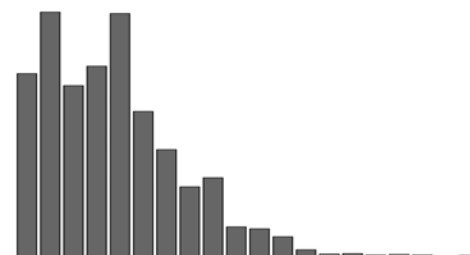
F \* 1

F \* 1/2

F \* 0

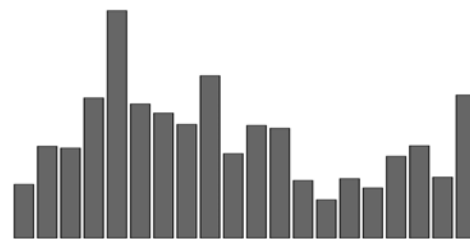
$7 \cdot 10^9$

N



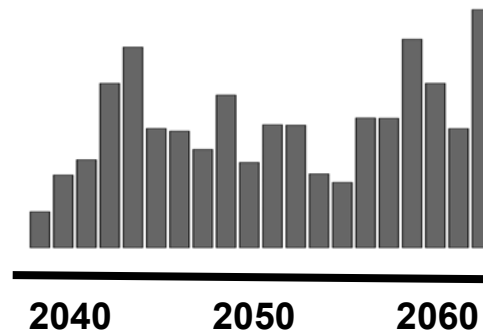
$2 \cdot 10^{10}$

N



$3 \cdot 10^{10}$

N



2040

2050

2060

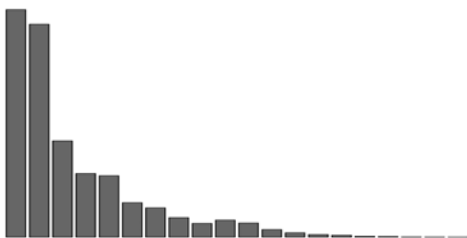
RCP 4.5

2040 - 2060

RCP 8.5

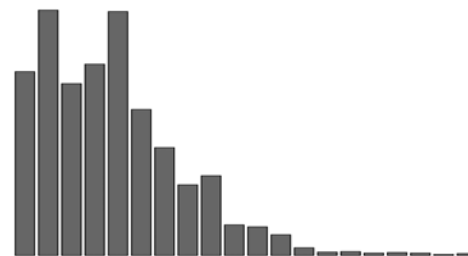
$6 \cdot 10^9$

N



$7 \cdot 10^9$

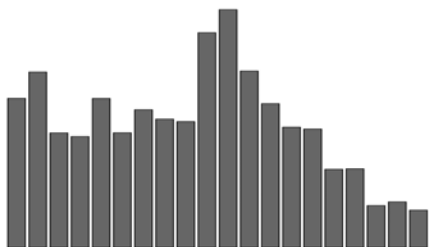
N



F \* 1

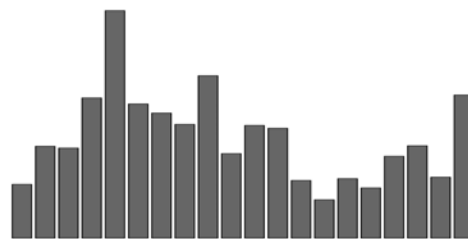
$8 \cdot 10^9$

N



$2 \cdot 10^{10}$

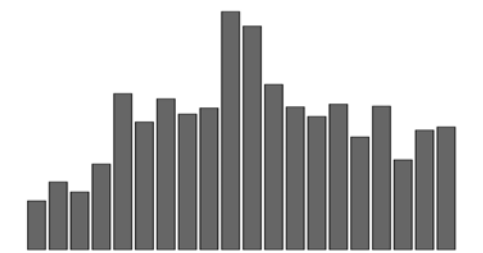
N



F \* 1/2

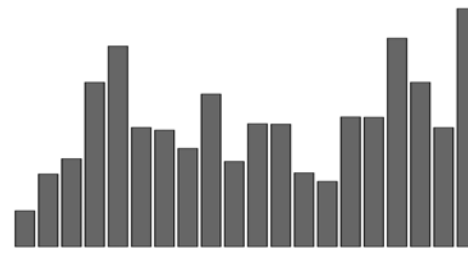
$2.5 \cdot 10^{10}$

N



$3 \cdot 10^{10}$

N



F \* 0

2040

2050

2060

2040

2050

2060

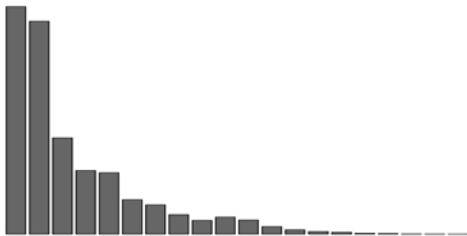
RCP 4.5

2040 - 2060

RCP 8.5

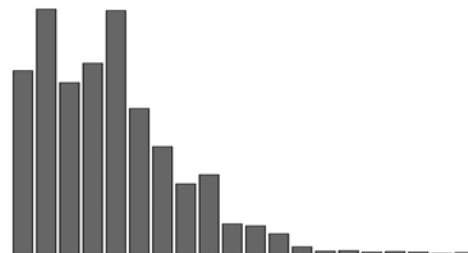
$6 \cdot 10^9$

N



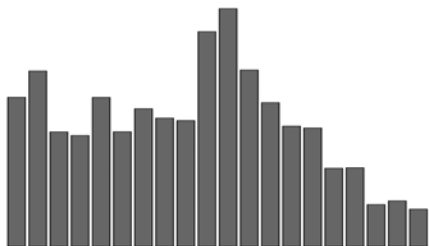
$7 \cdot 10^9$

N



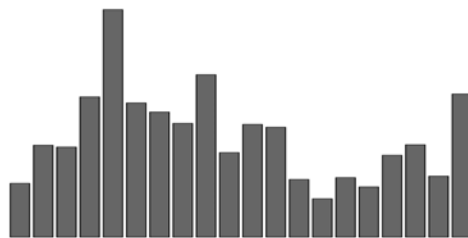
$8 \cdot 10^9$

N



$2 \cdot 10^{10}$

N



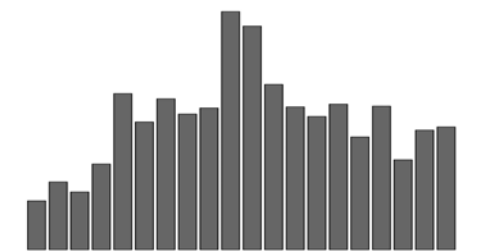
F \* 1

F \* 1/2

F \* 0

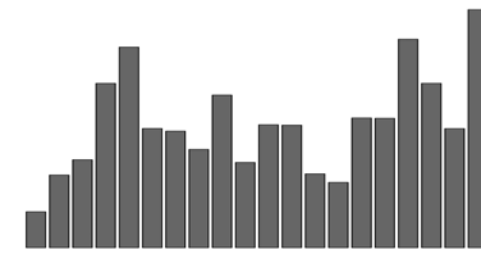
$2.5 \cdot 10^{10}$

N



$3 \cdot 10^{10}$

N



2040

2050

2060

2040

2050

2060

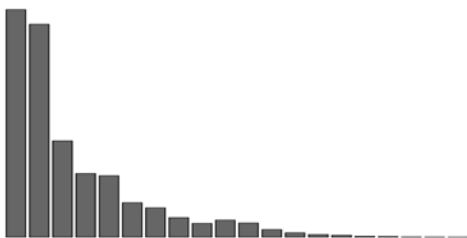
RCP 4.5

2040 - 2060

RCP 8.5

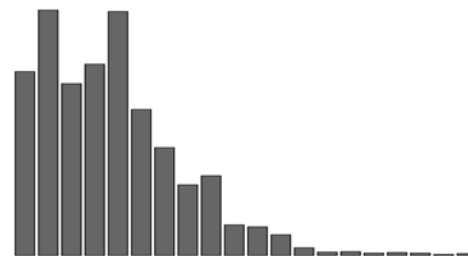
$6 \cdot 10^9$

N



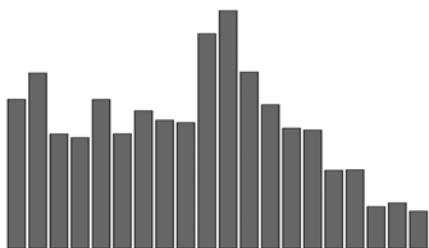
$7 \cdot 10^9$

N



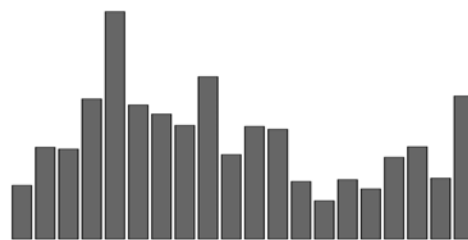
$8 \cdot 10^9$

N



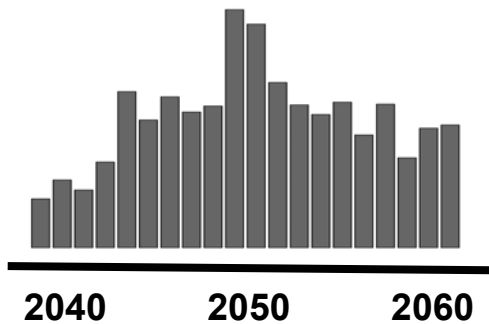
$2 \cdot 10^{10}$

N



$2.5 \cdot 10^{10}$

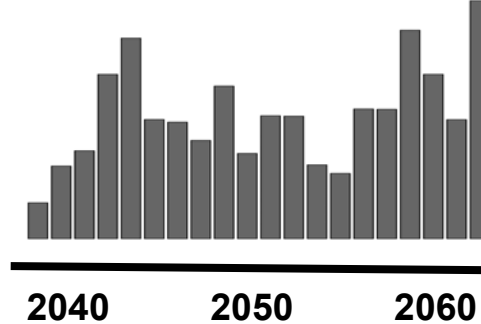
N



F \* 0

$3 \cdot 10^{10}$

N



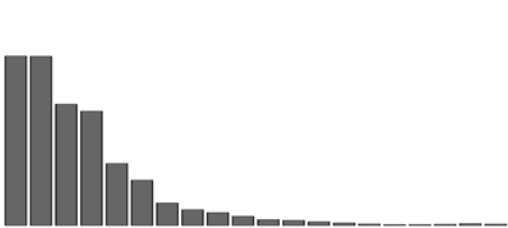
2080 - 2100

---



RCP 4.5

$5 \cdot 10^9$   
N



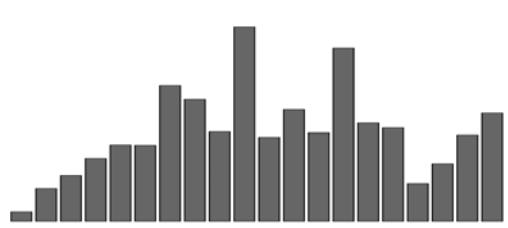
2080 2090 2100

2080 - 2100

F \* 1

RCP 8.5

$1 \cdot 10^{11}$   
N



2080 2090 2100

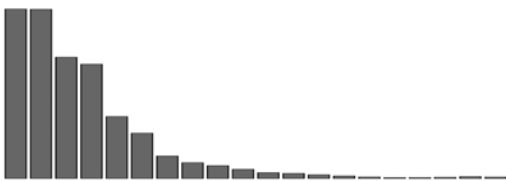
RCP 4.5

2080 - 2100

RCP 8.5

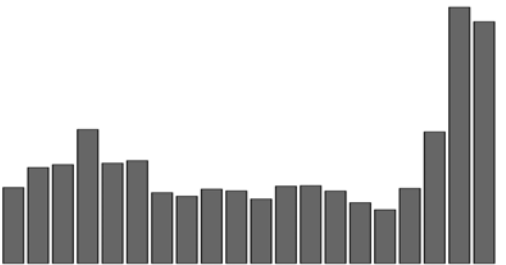
$5 \cdot 10^9$

**N**



$1.5 \cdot 10^{10}$

**N**



2080 2090 2100

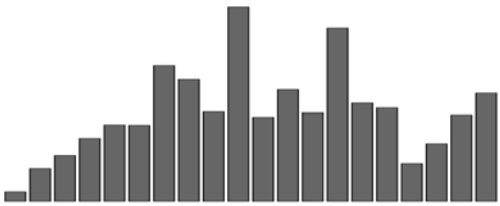
2080 - 2100

**F \* 1**

**F \* 1/2**

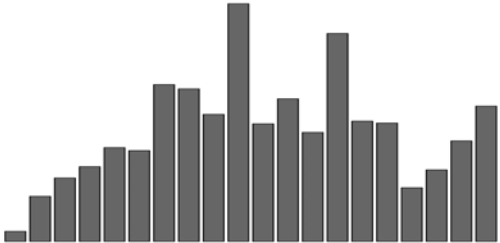
$1 \cdot 10^{11}$

**N**



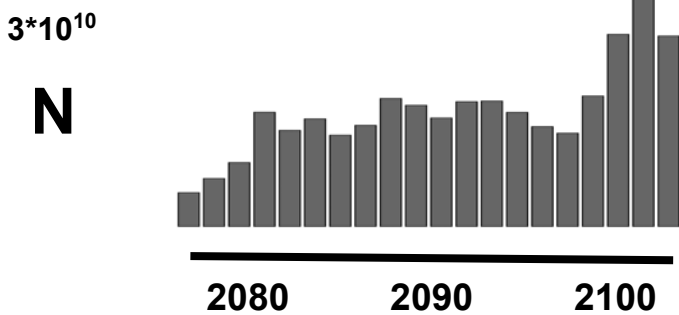
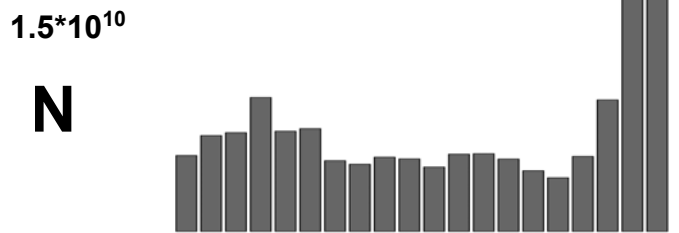
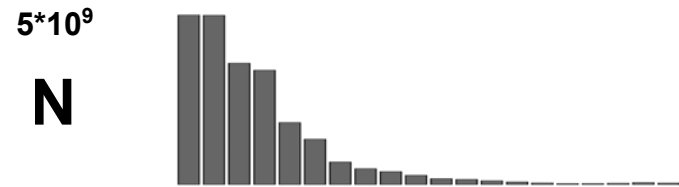
$1.2 \cdot 10^{11}$

**N**



2080 2090 2100

RCP 4.5



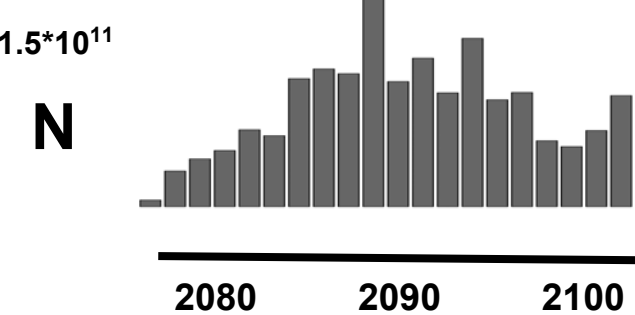
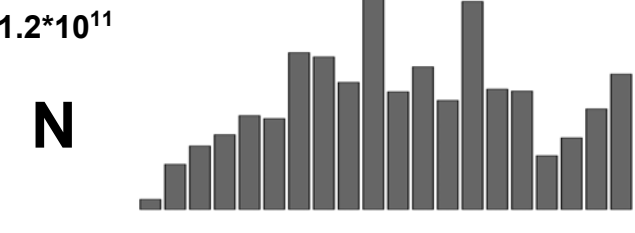
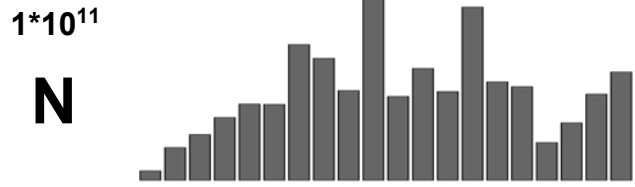
2080 - 2100

F \* 1

F \* 1/2

F \* 0

RCP 8.5



RCP 4.5

2080 - 2100

RCP 8.5

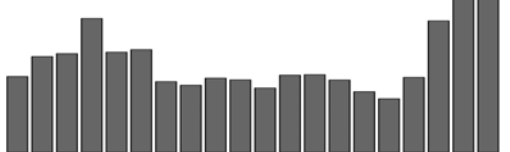
$5 \cdot 10^9$

N



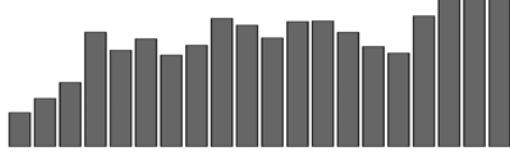
$1.5 \cdot 10^{10}$

N



$3 \cdot 10^{10}$

N



2080

2090

2100

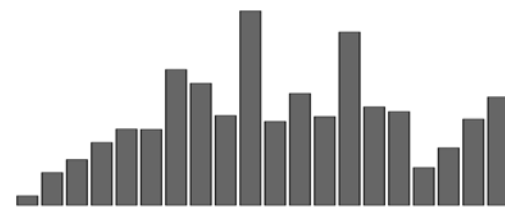
F \* 1

F \* 1/2

F \* 0

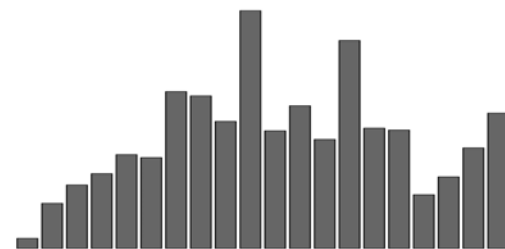
$1 \cdot 10^{11}$

N



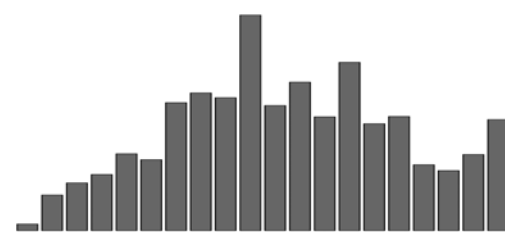
$1.2 \cdot 10^{11}$

N



$1.5 \cdot 10^{11}$

N

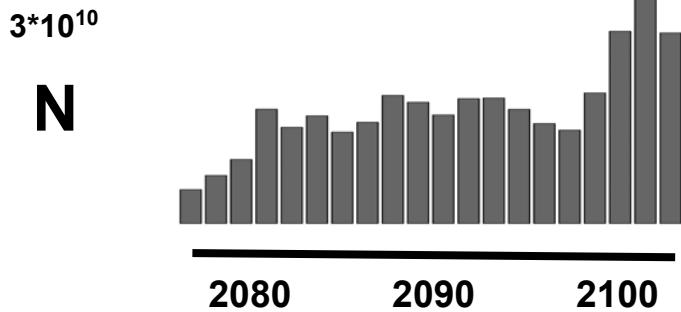
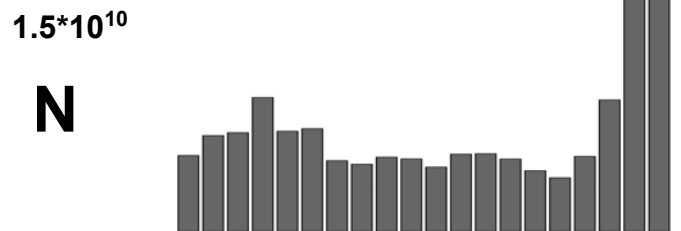
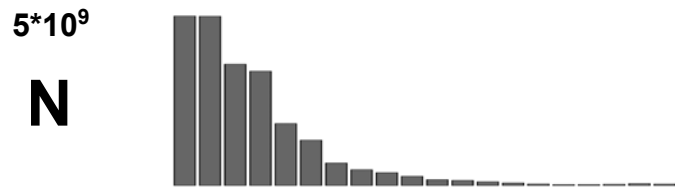


2080

2090

2100

RCP 4.5



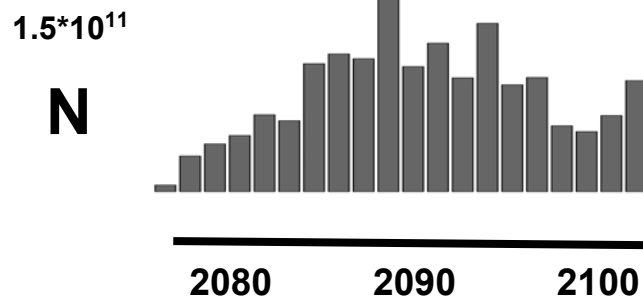
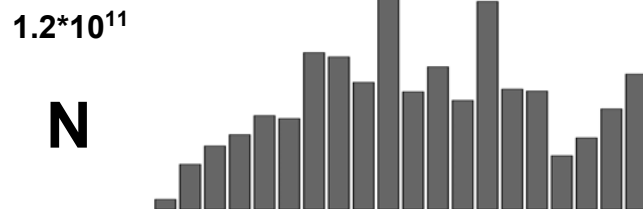
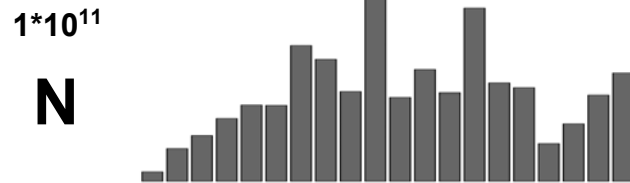
2080 - 2100

$F * 1$

$F * \frac{1}{2}$

$F * 0$

RCP 8.5



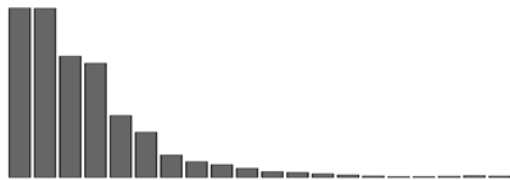
RCP 4.5

2080 - 2100

RCP 8.5

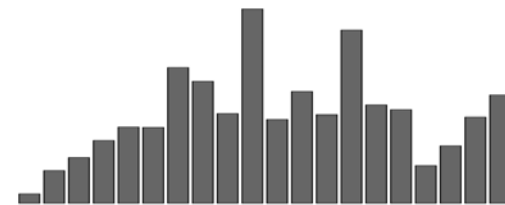
$5 \cdot 10^9$

**N**



$1 \cdot 10^{11}$

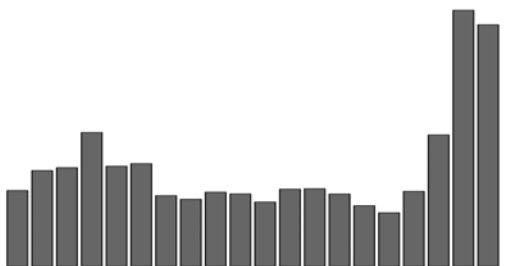
**N**



**F \* 1**

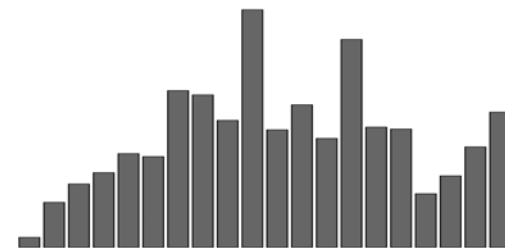
$1.5 \cdot 10^{10}$

**N**



$1.2 \cdot 10^{11}$

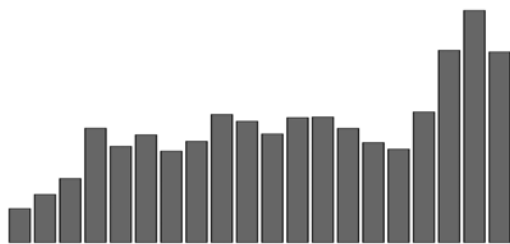
**N**



**F \* 1/2**

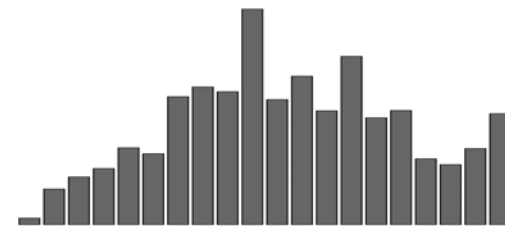
$3 \cdot 10^{10}$

**N**



$1.5 \cdot 10^{11}$

**N**



**F \* 0**

2080

2090

2100

2080

2090

2100

RCP 4.5

2080 - 2100

RCP 8.5

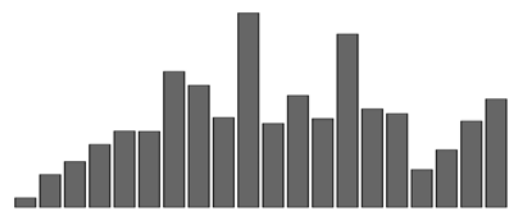
$5 \cdot 10^9$

N



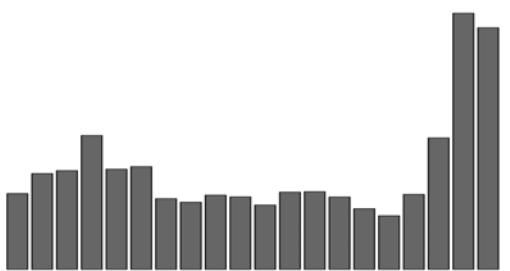
$1 \cdot 10^{11}$

N



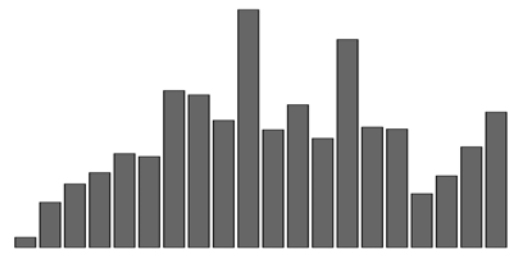
$1.5 \cdot 10^{10}$

N



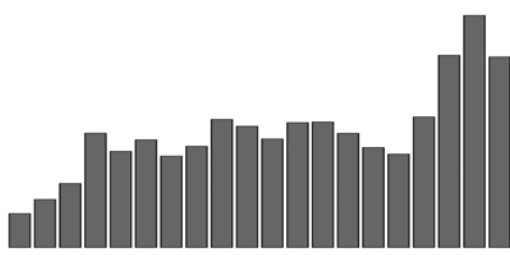
$1.2 \cdot 10^{11}$

N



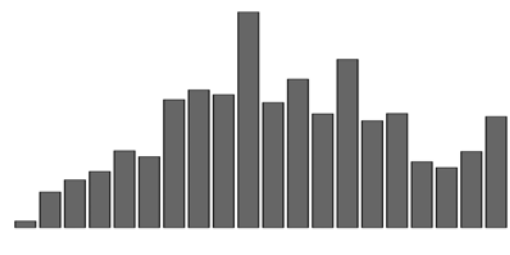
$3 \cdot 10^{10}$

N



$1.5 \cdot 10^{11}$

N



2080

2090

2100

F \* 1

F \* 1/2

F \* 0

2080

2090

2100

RCP 4.5

2080 - 2100

RCP 8.5

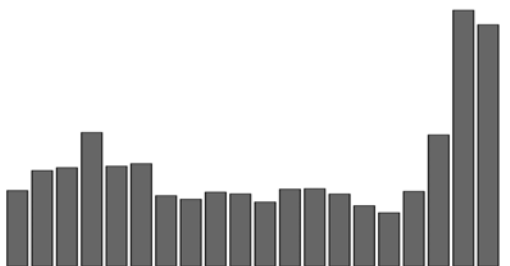
$5 \cdot 10^9$

N



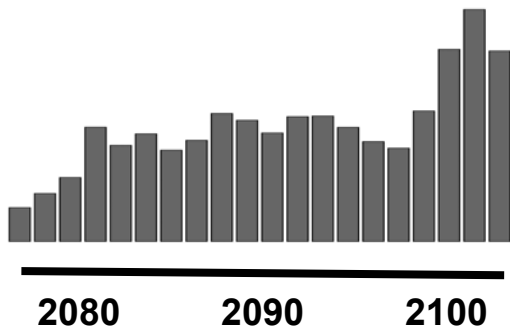
$1.5 \cdot 10^{10}$

N



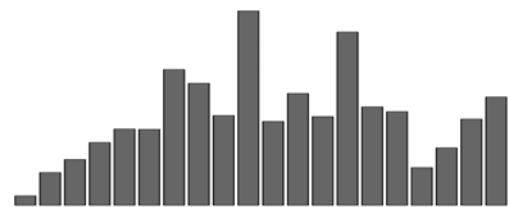
$3 \cdot 10^{10}$

N



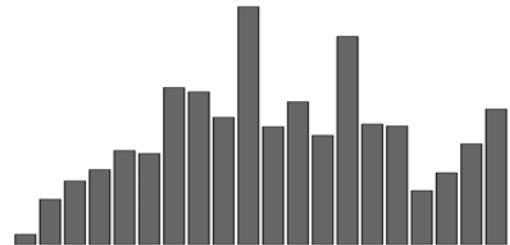
$1 \cdot 10^{11}$

N



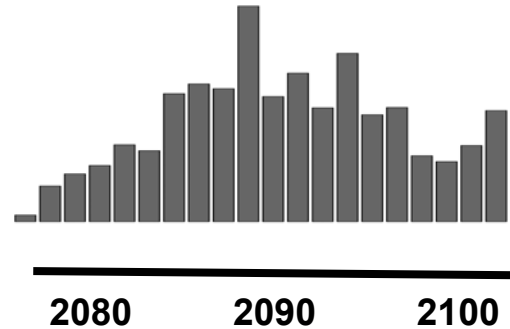
$1.2 \cdot 10^{11}$

N



$1.5 \cdot 10^{11}$

N



F \* 1

F \* 1/2

F \* 0

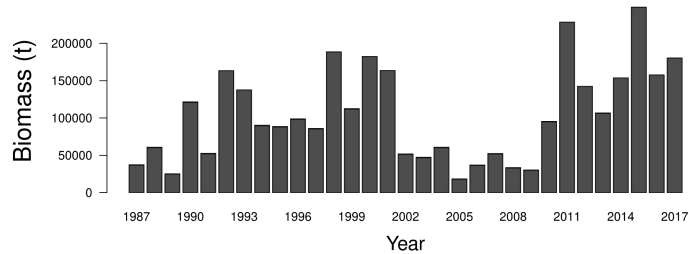


# Further work / Conclusions

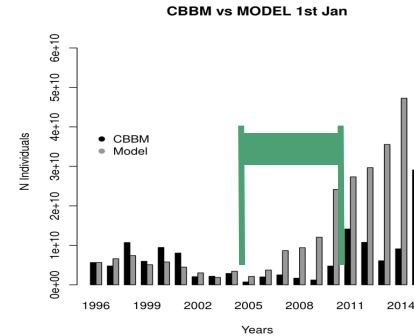
---

# Conclusions

Our population model is able to hindcast the low population between 2005-2010

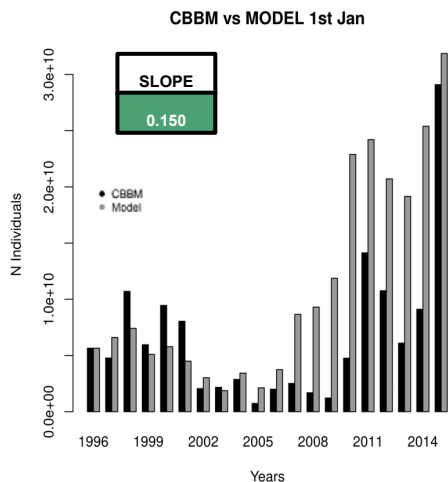


Fishing mortality is an important driving factor for the evolution of the population in our model.

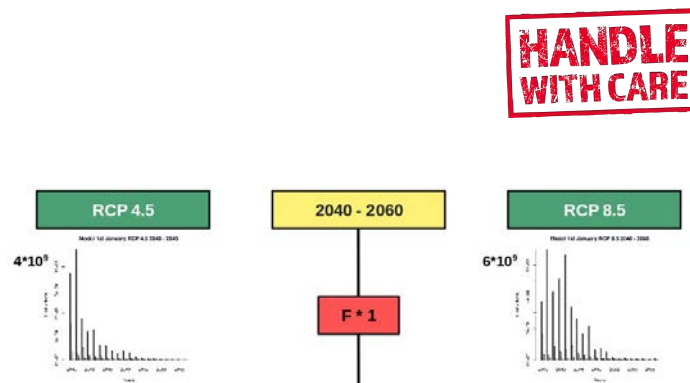


# Conclusions

The inclusion of a density-dependent control of the population improves the fit to observed data



Under scenario 8.5, the population seems to be more resilient to fishing than under scenario 4.5



# Further work

## Better understand:

- **Interannual variability in the forecast**
- **Interactions between physical variables and ind. energetics:**
  - **Zooplankton phenology**
  - **Temperature**
  - **Reproduction**
  - **Growth**
  - **Mortality**

## Improve:

- **Calibration of the model with new variables**
- **The density-dependent control of larval mortality**
- **Scenarios of future fishing**
- **Etc.**

... more time and work needed

# Thanks for your attention!

---

[jbuenopardo@gmail.com](mailto:jbuenopardo@gmail.com)

