

# RESILIENCE | NORTHEAST ATLANTIC MARINE ECOSYSTEMS

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and Evolutionary Synthesis  
University of Oslo



Instituto Español  
de Oceanografía

# OUTLINE | of the talk

## 1. intro

definition

## 2. methods

Integrated Resilience Assessment

## 3. study area & data

4 ecosystems, all main components, several decades

## 4. results

North Sea | Baltic Sea | Barents Sea | Iceland Seas  
trafficlight plots, PCA, landscapes

## 5. conclusions

## **Engineering resilience**

- *The time required for a system to return to an equilibrium or steady state following a perturbation*

Gunderson (2000) *Annu Rev Ecol Syst*

## **Ecological resilience**

- *The capacity of a system to absorb disturbance to stay in the same basin of attraction*

Walker et al. (2004) *Ecology and Society*

- *The magnitude of change that a system can experience without shifting into an alternate stable state*

Gunderson (2004)

# intro | DEFINITION

## Engineering resilience

- The **time** required for a **system** to return to an **equilibrium** or **steady state** following a **perturbation**

Gunderson (2000) *Annu Rev Ecol Syst*

## Ecological resilience

- The **capacity** of a **system** to absorb **disturbance** to stay in the same **basin of attraction**

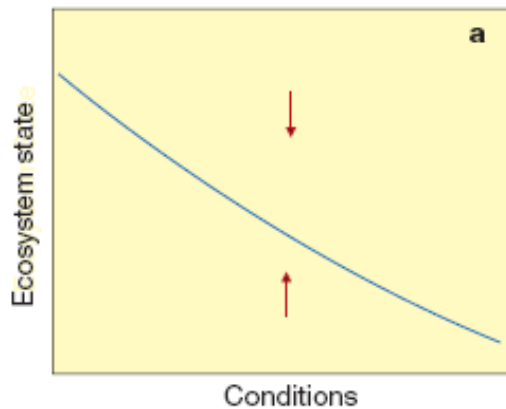
Walker et al. (2004) *Ecology and Society*

- The **magnitude** of **change** that a **system** can experience without shifting into an **alternate stable state**

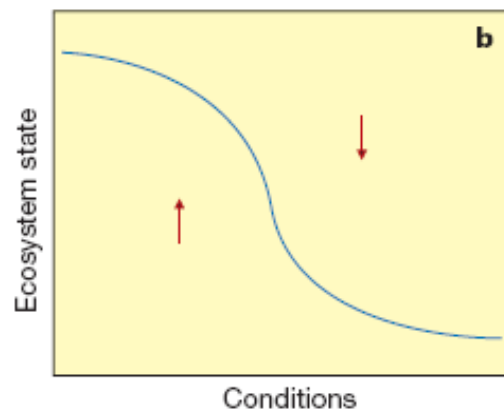
Gunderson (2004)

# ECOSYSTEM RESPONSE TO STRESSORS

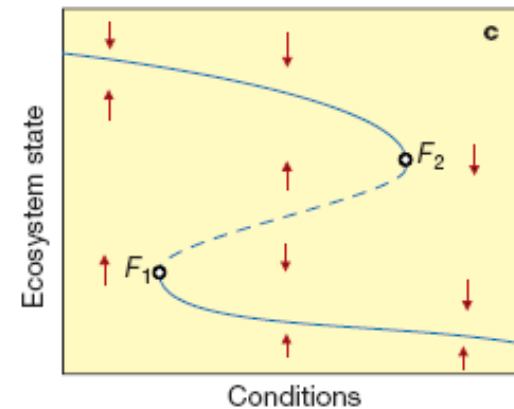
## SMOOTH



## SIGMOID

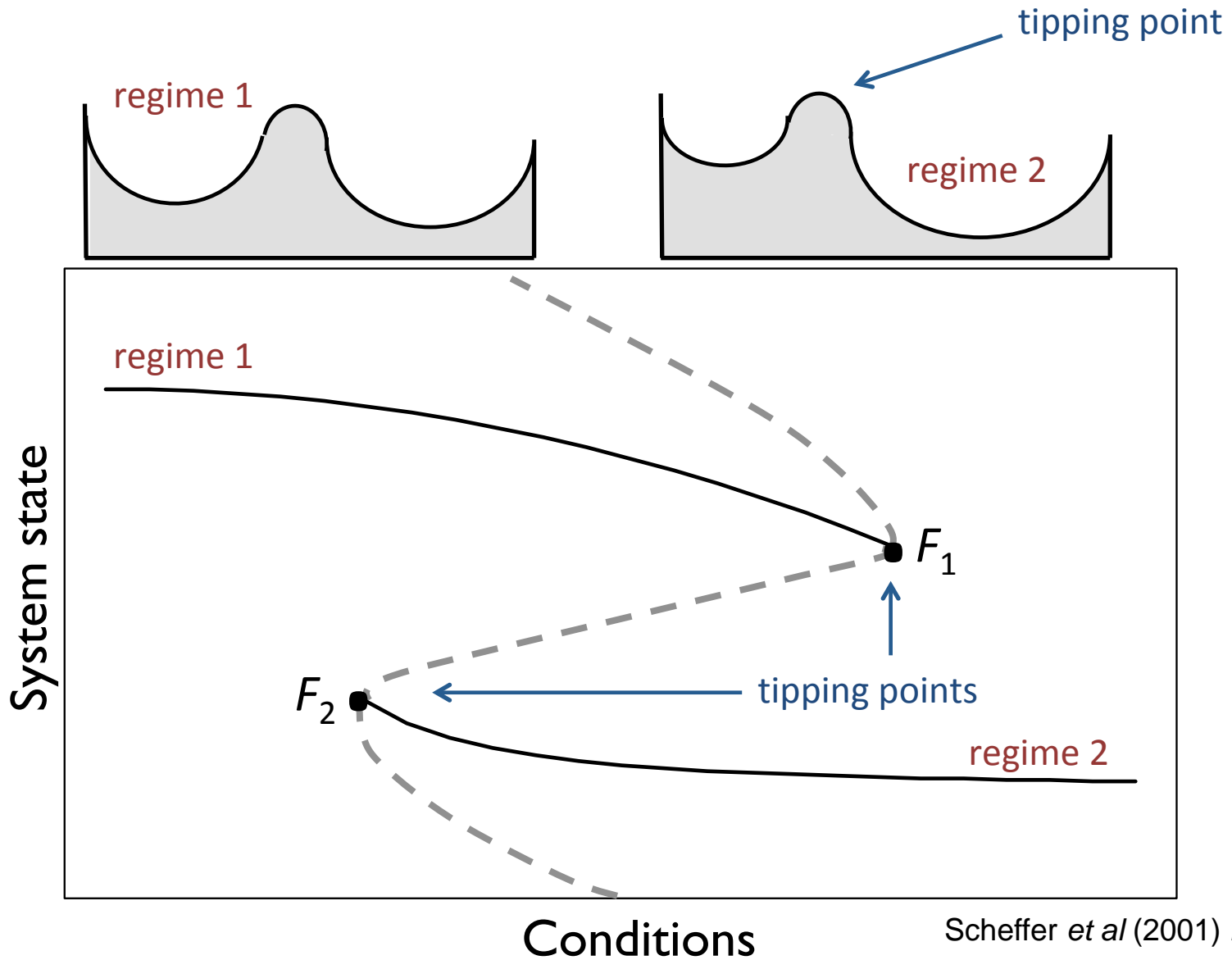


## ABRUPT

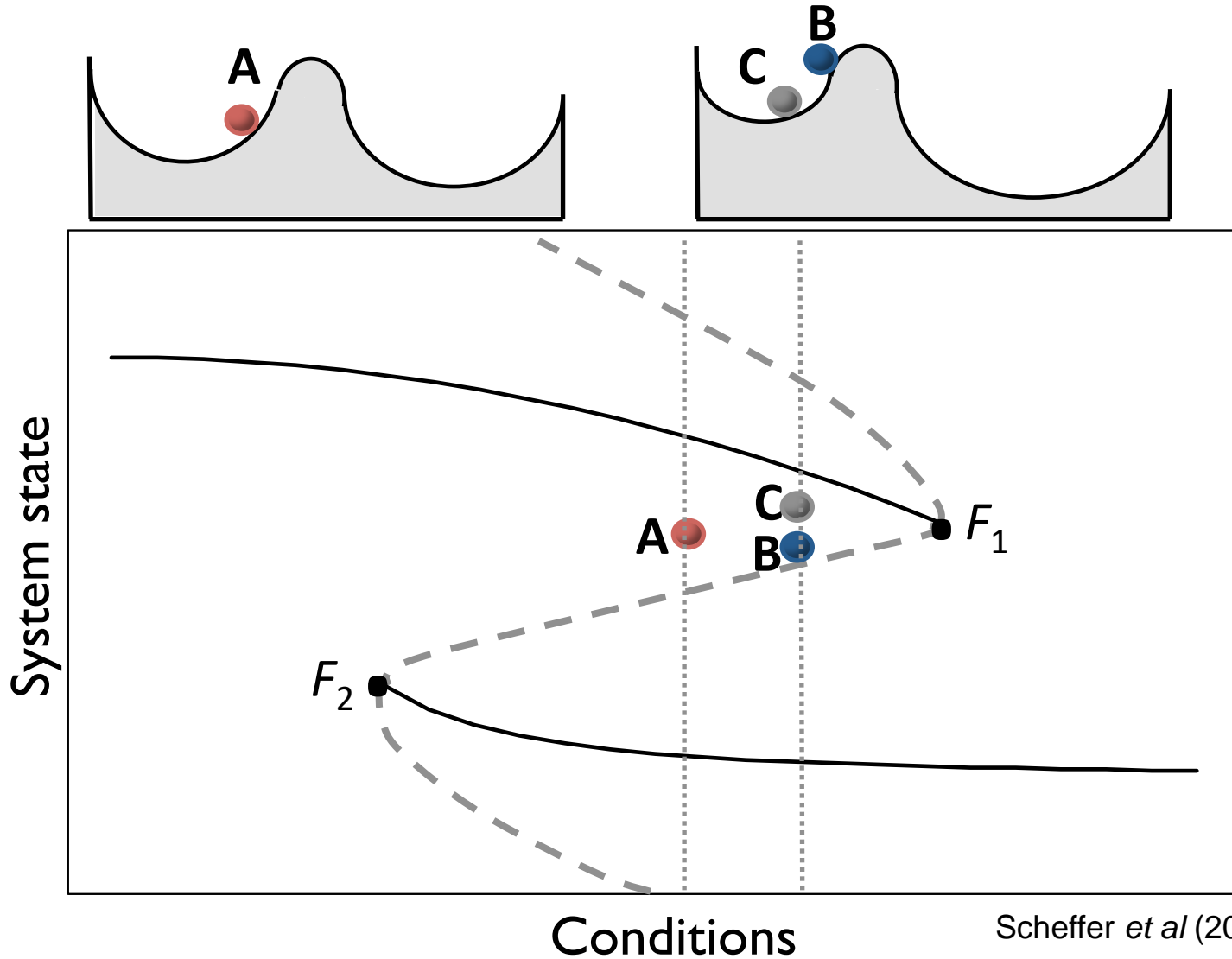


Three main ways in which ecosystems can respond to a gradual change in an external condition: (i) smooth continuous way, (ii) more responsive over certain ranges of conditions and (iii) abrupt changes between alternative stable states separated by an unstable equilibrium.

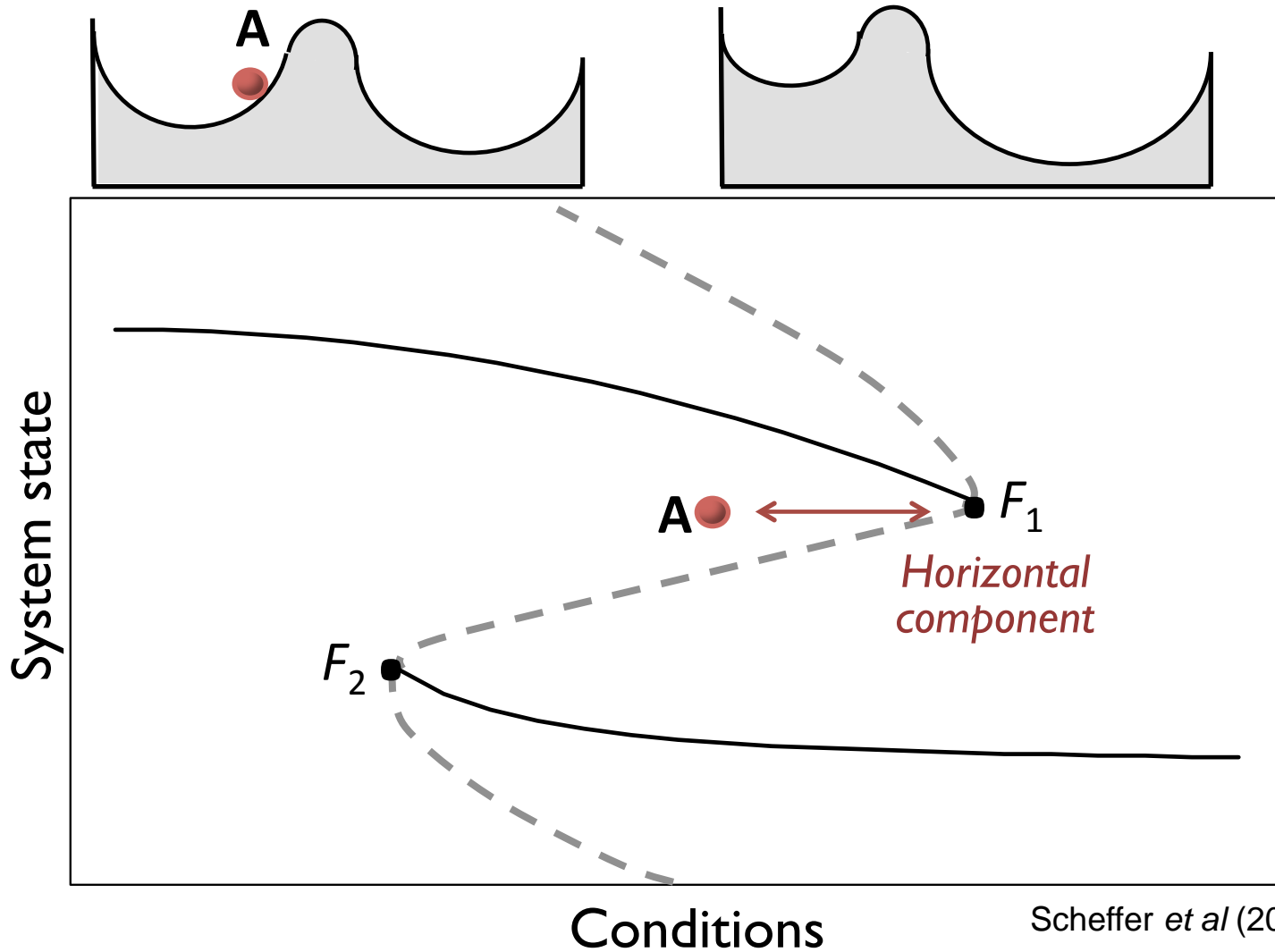
# QUANTIFYING RESILIENCE



# QUANTIFYING RESILIENCE

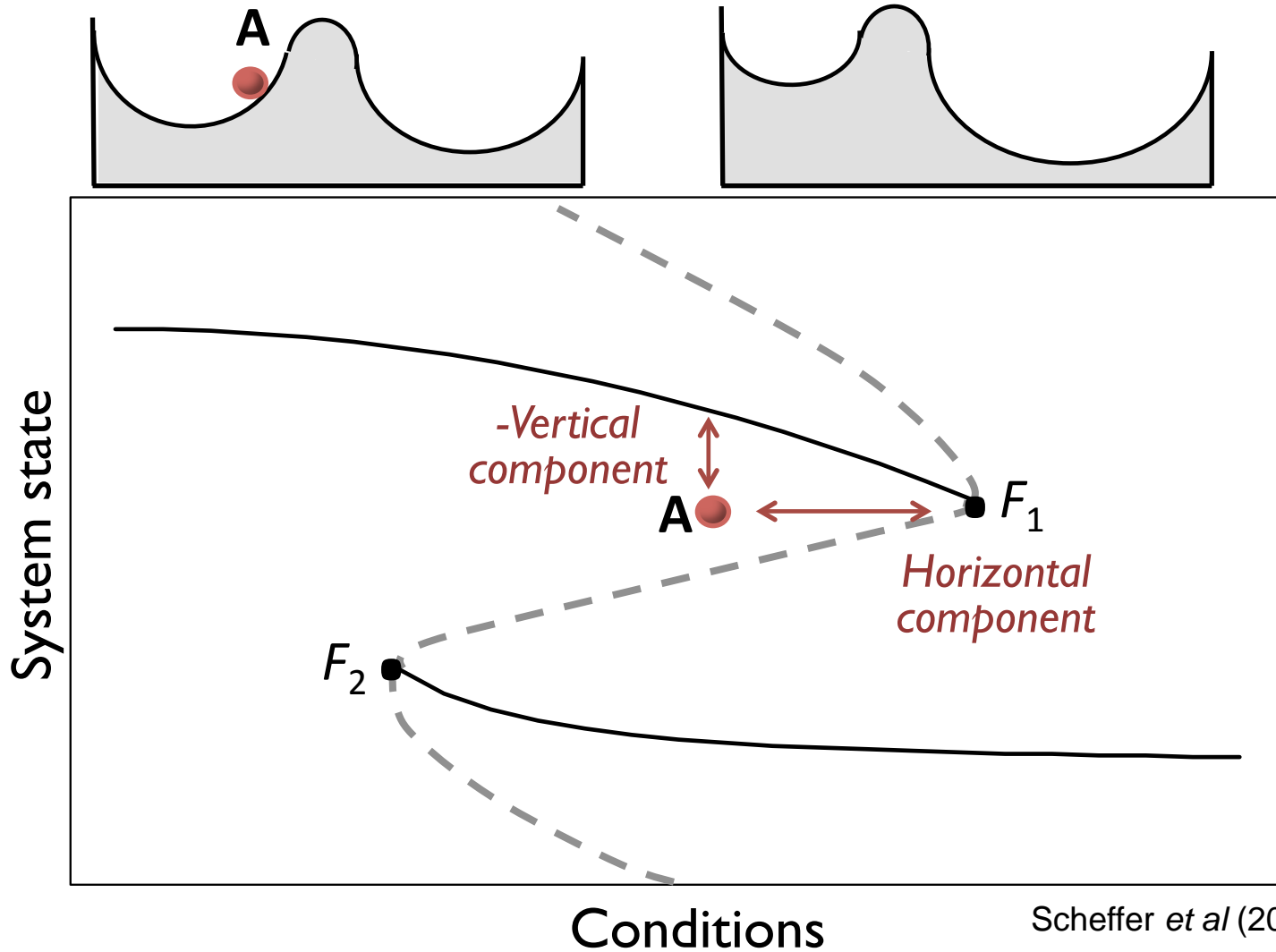


# QUANTIFYING RESILIENCE





# QUANTIFYING RESILIENCE

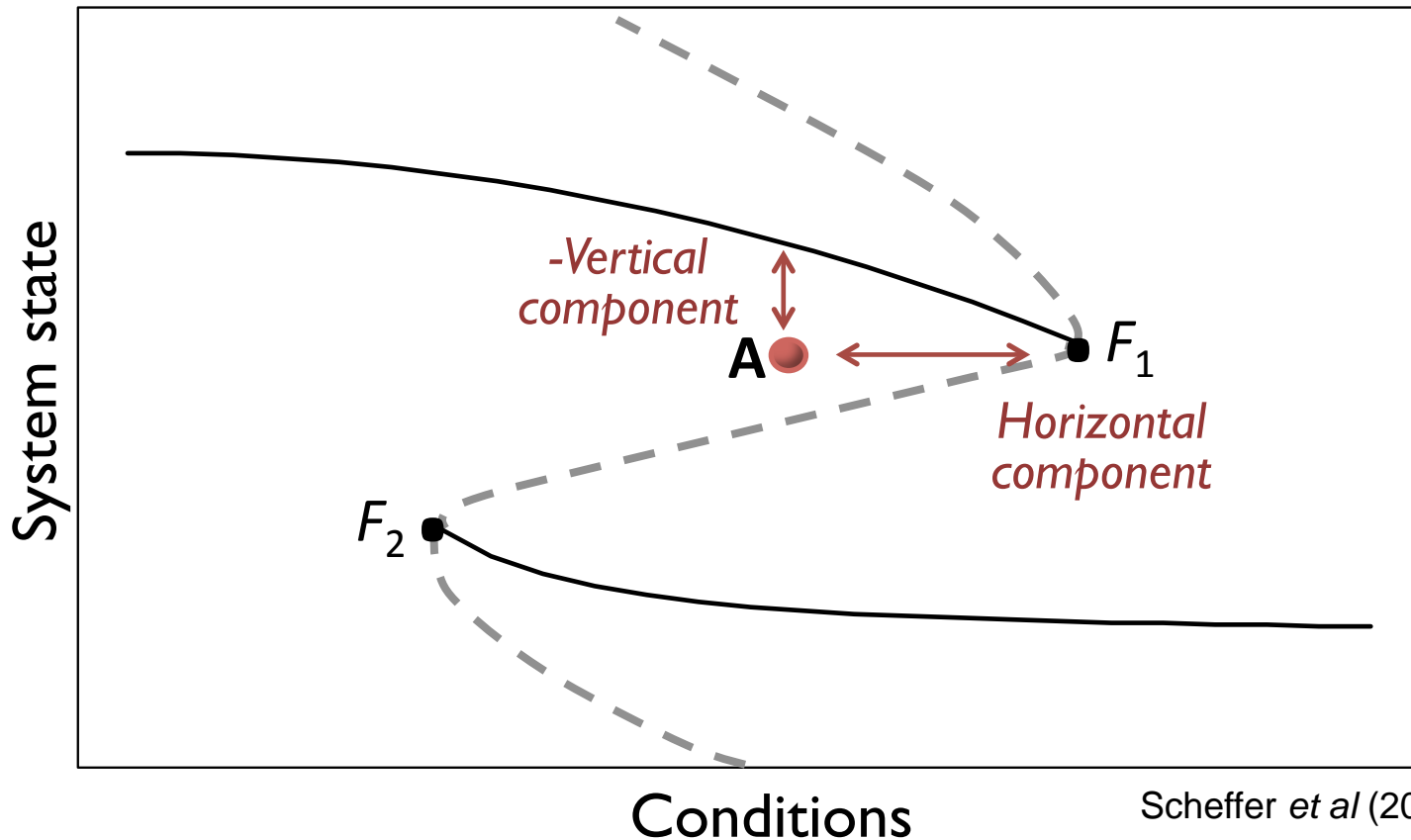


# QUANTIFYING RESILIENCE

**Resilience =**

Horizontal component + Vertical component

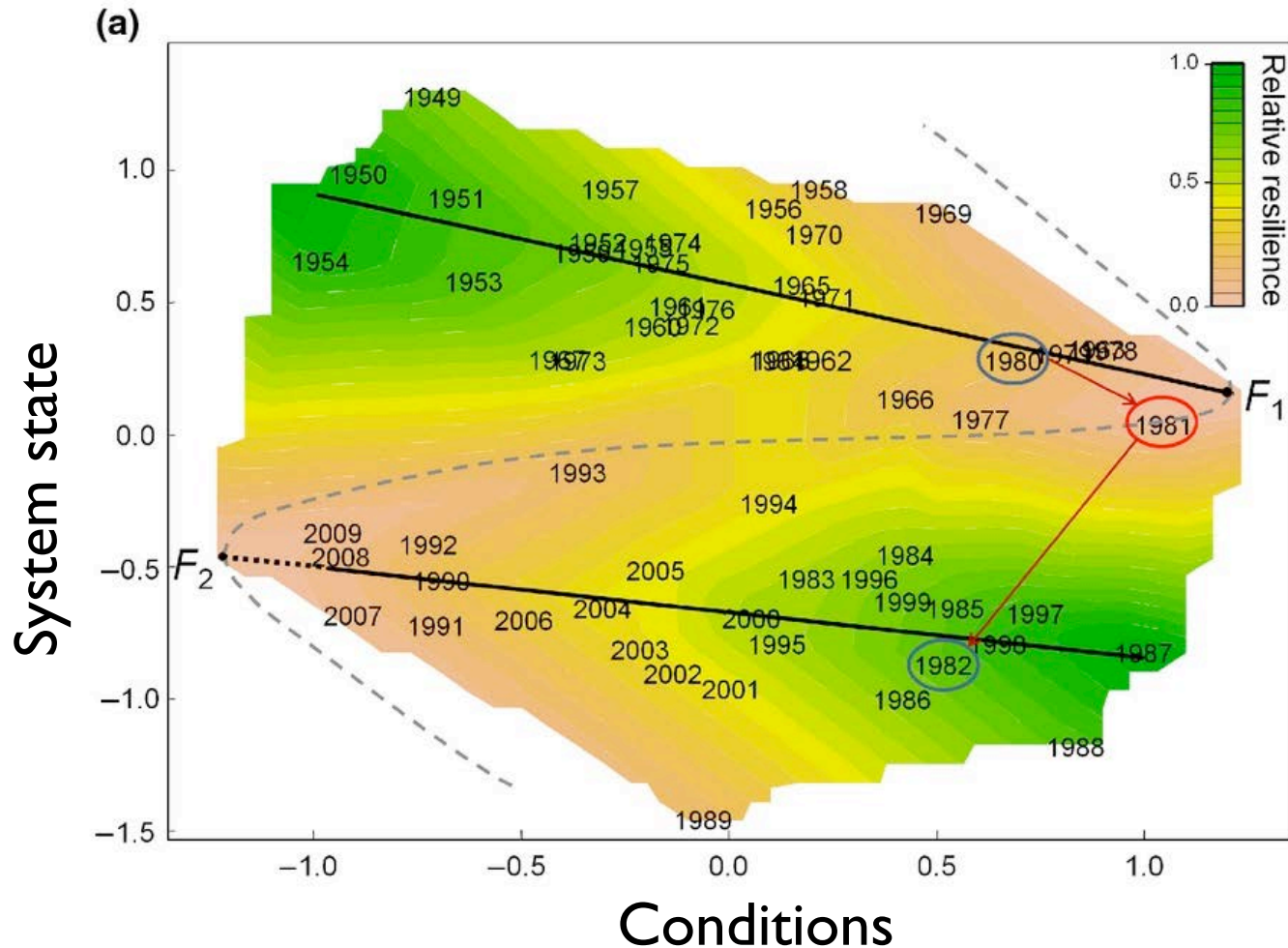
Vasilakopoulos & Marshall (2015) *Global Change Biol*



Scheffer et al (2001) *Nature*

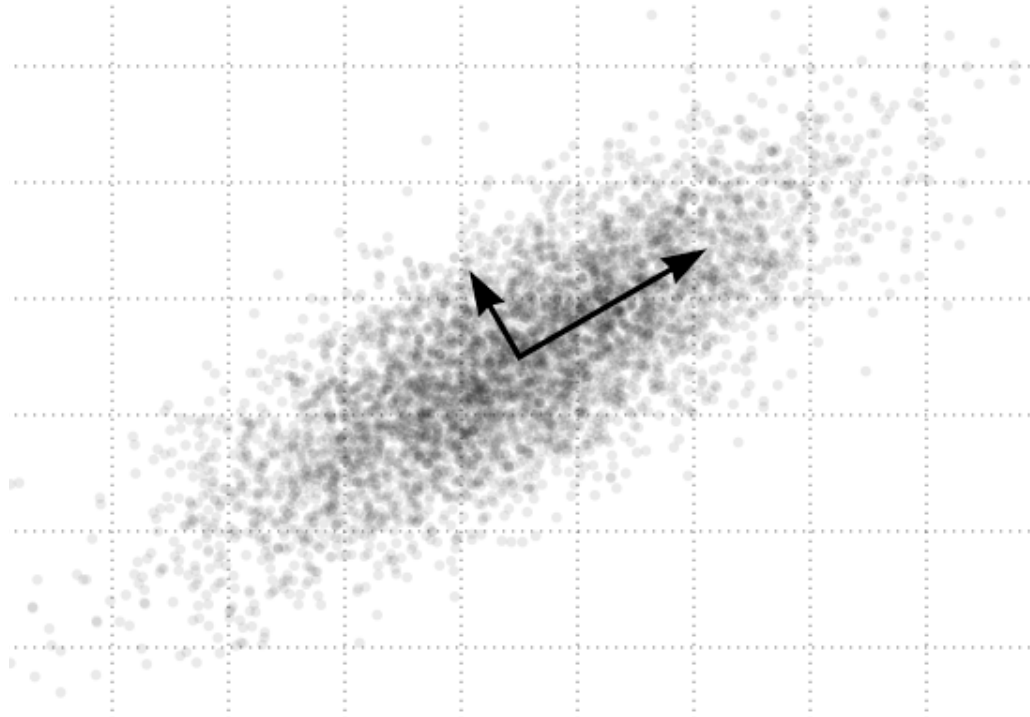
# QUANTIFYING RESILIENCE

*Vasilakopoulos & Marshall (2015) applied this method to Barents Sea cod population. By interpolating the annual resilience values, a folded stability landscape was fit.*



# INTEGRATED RESILIENCE ASSESSMENT

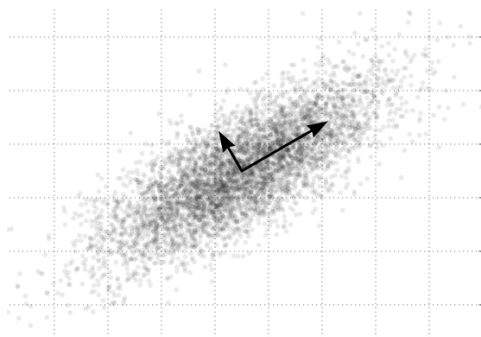
1) Reduce complexity through multivariate analysis (PCAs)



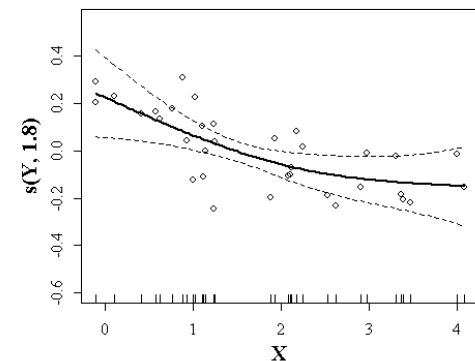
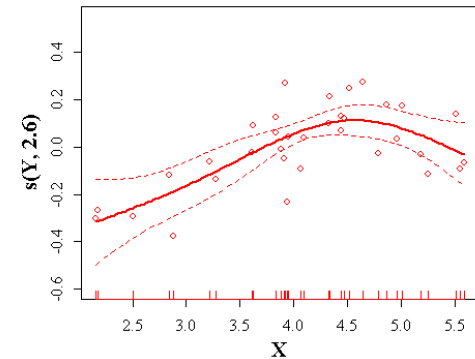
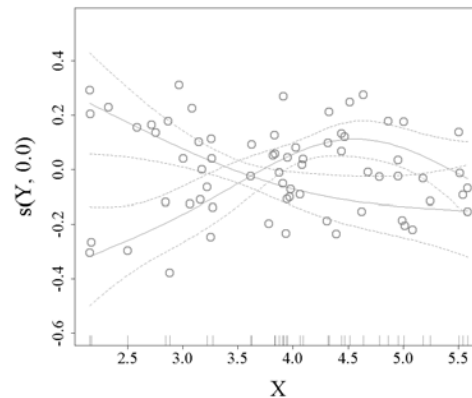
# INTEGRATED RESILIENCE ASSESSMENT

- 1) Reduce complexity through multivariate analysis (PCAs)
- 2) Non-additive modelling to investigate possible nonlinear system-stressor relationships (e.g. tGAMs)

1)



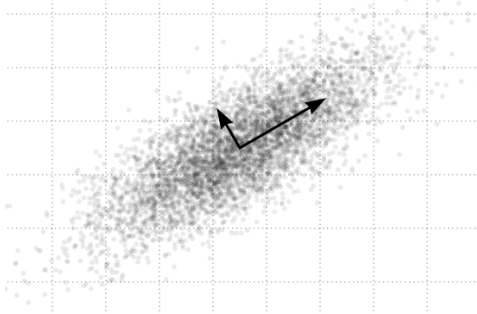
2)



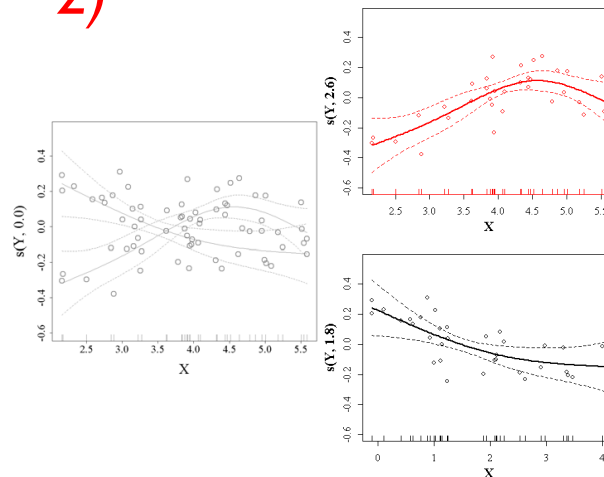
# INTEGRATED RESILIENCE ASSESSMENT

- 1) Reduce complexity through multivariate analysis (PCAs)
- 2) Non-additive modelling to investigate possible nonlinear system-stressor relationships (e.g. tGAMs)
- 3) Resilience assessment to build a folded stability landscape

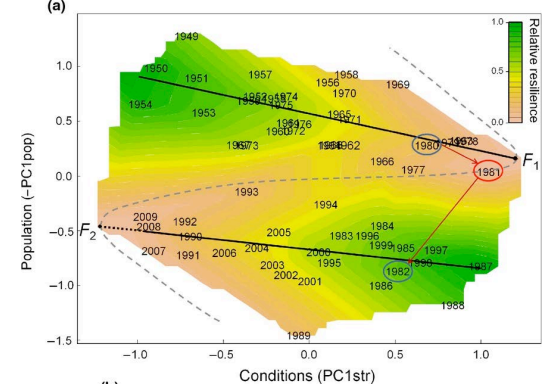
1)



2)



3)



study  
area

# NORTHEAST ATLANTIC

## stressors

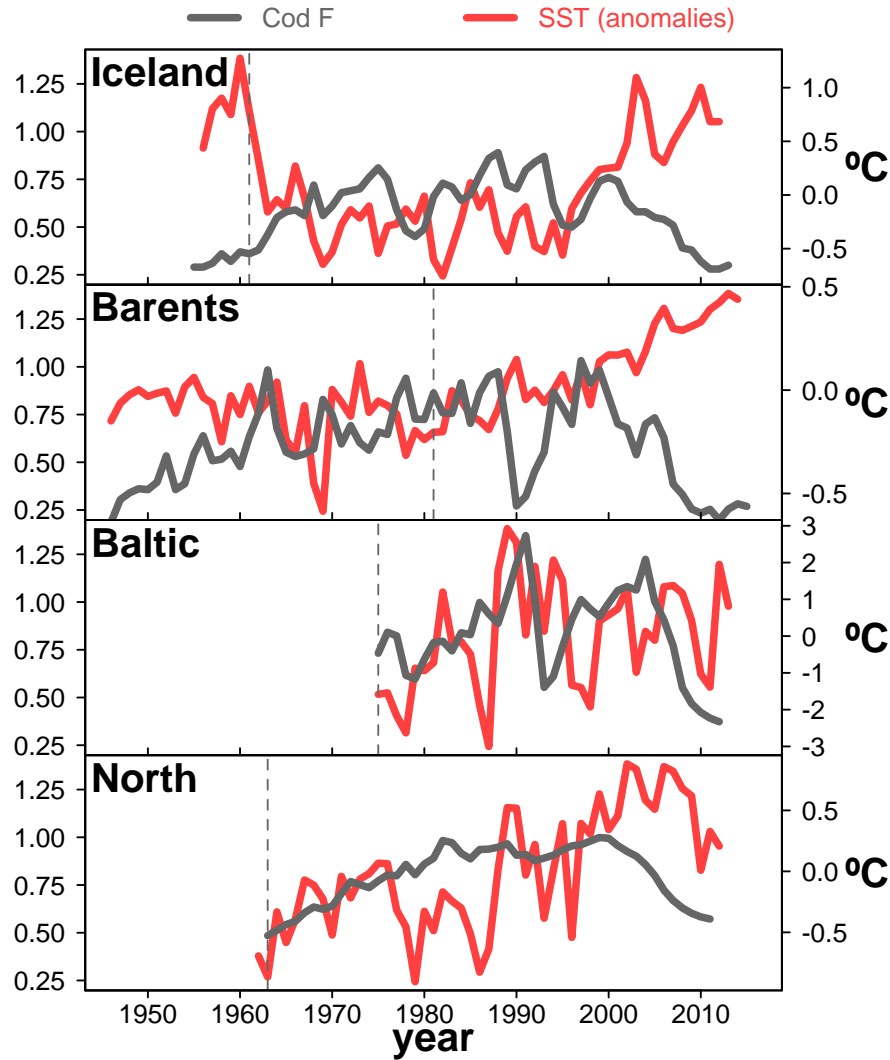
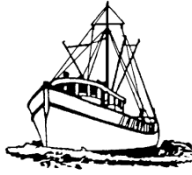
warming  
heavy fishing  
(eutrophication)

## gradients

temperature  
connectivity  
diversity  
(salinity)



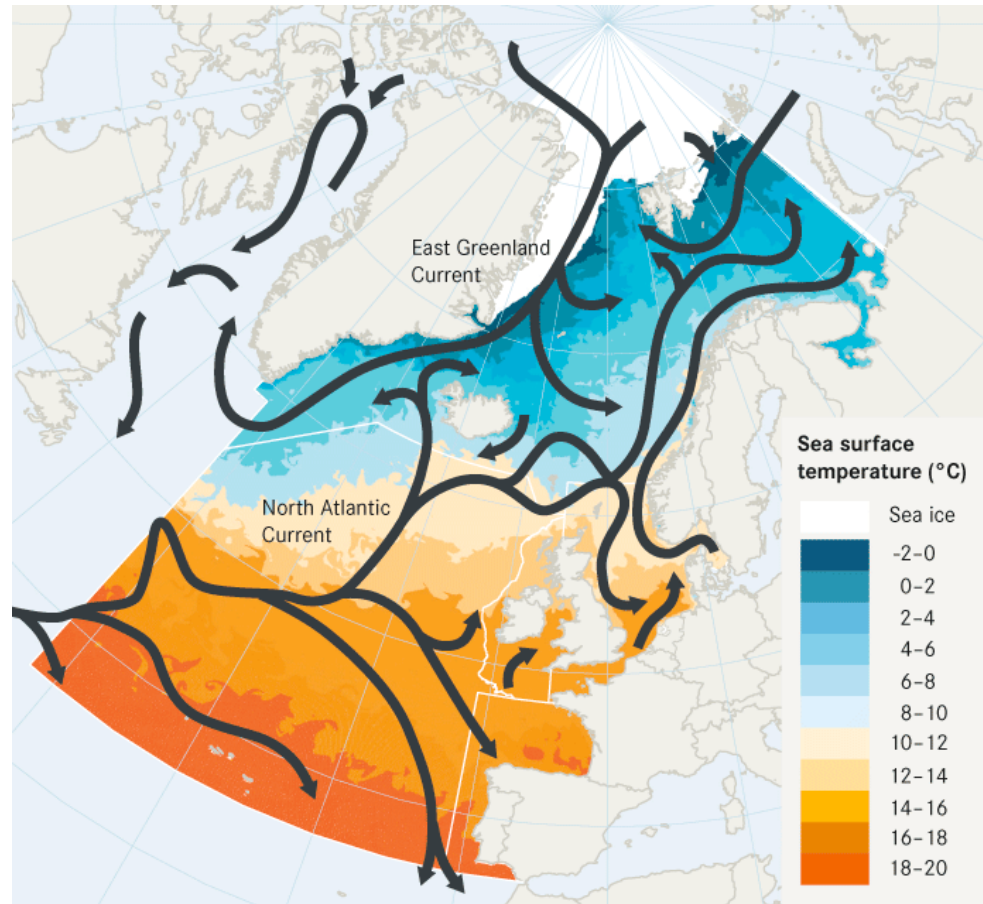
# STRESSORS






study area | **GRADIENTS**

*Overall south-north temperature gradient (except Baltic Sea) and different degree of isolation from the almost enclosed Baltic Sea, partly enclosed North Sea to the open systems of Barents and Iceland Seas.*




**STATE**

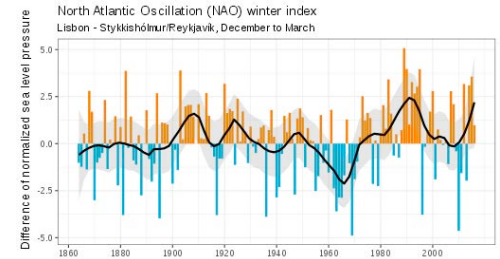
 **fish** | different trophic levels

**plankton** | phytoplankton  
zooplankton  


**STRESSORS**

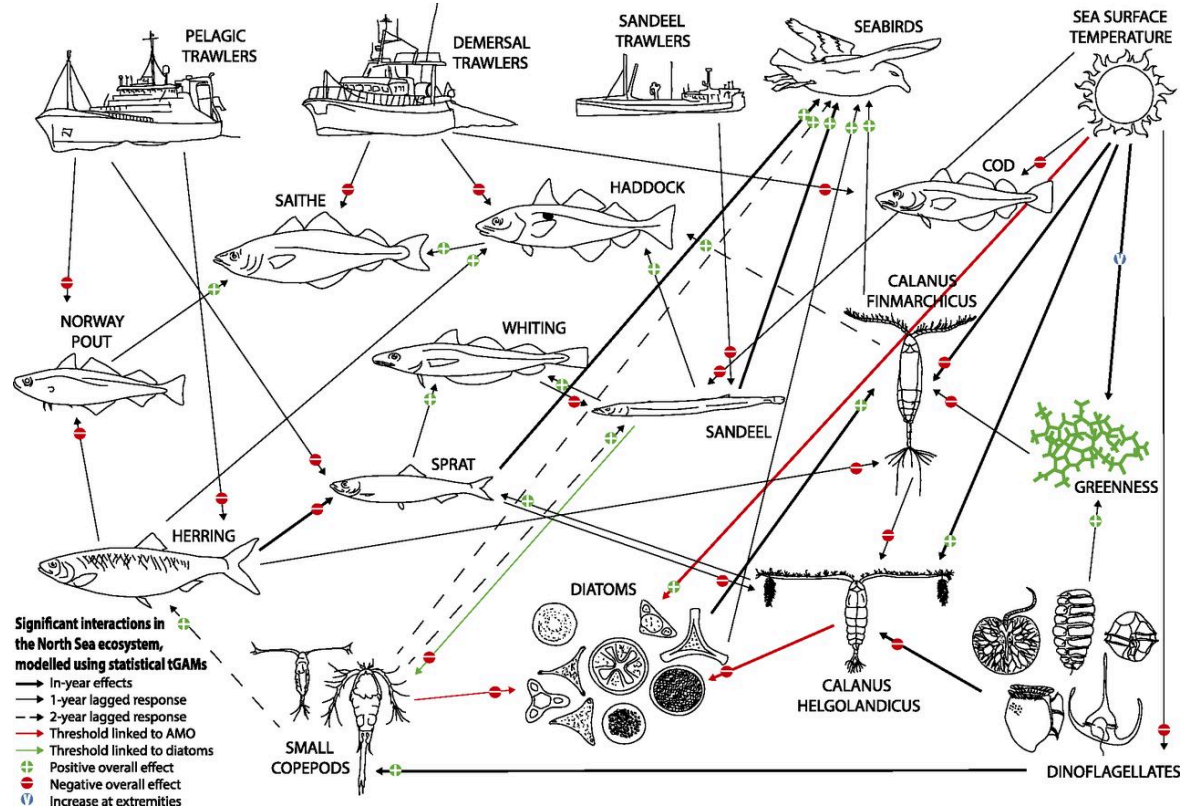
**abiotic** | fishing pressure  
temperature  
climatic indices  
(nutrients)  


**resolution** | > 30 years  
annual



# intro | OBJECTIVE

The aim is to provide a first holistic assessment of ecosystem resilience, including as many trophic levels and stressors as many (and relevant) as possible



## North Sea interaction web

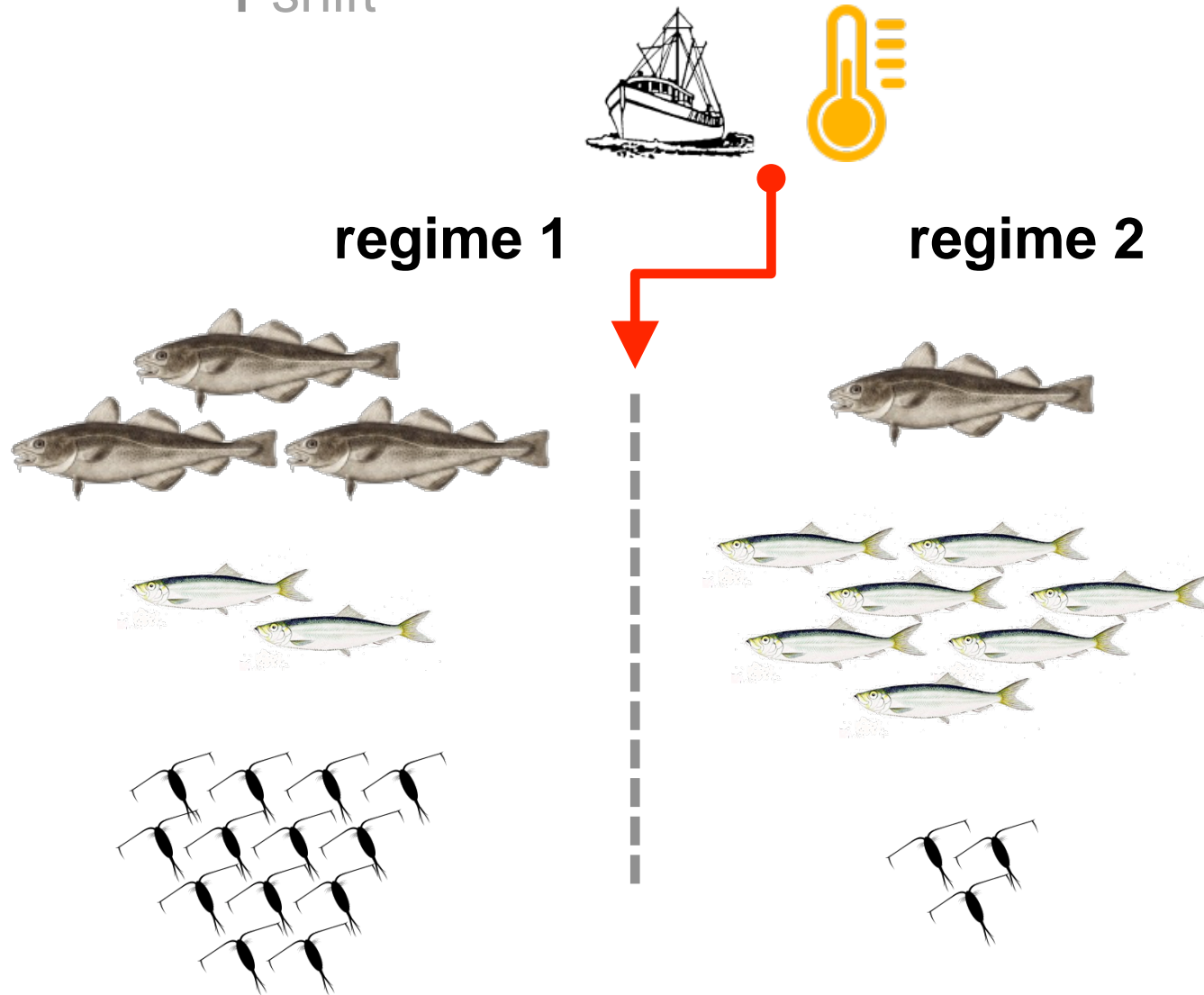
intro | **WHAT DO WE KNOW?**

A satellite-style map of the Baltic Sea region. The sea is a deep blue, and the surrounding landmasses are shown in shades of green and brown. A red circle highlights the Baltic Sea and the surrounding landmasses. The text "BALTIC SEA" is written in white, bold, sans-serif font in the lower-left quadrant of the image.

BALTIC  
SEA

# BALTIC SEA

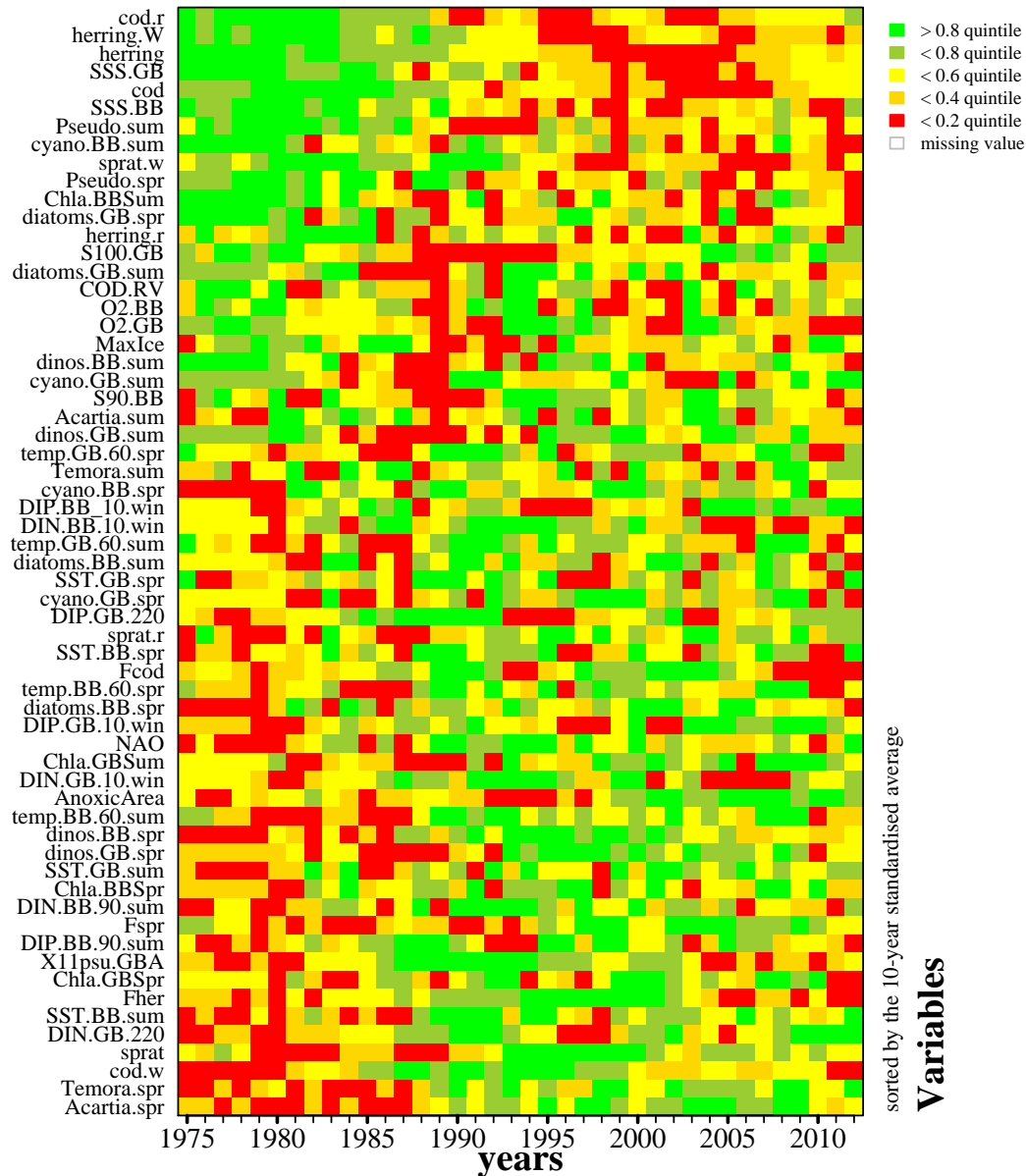
regime  
shift



Möllmann *et al* (2009) *Global Change Biol*  
Blenckner, Llope *et al* (2015) *Proc Royal Soc B*

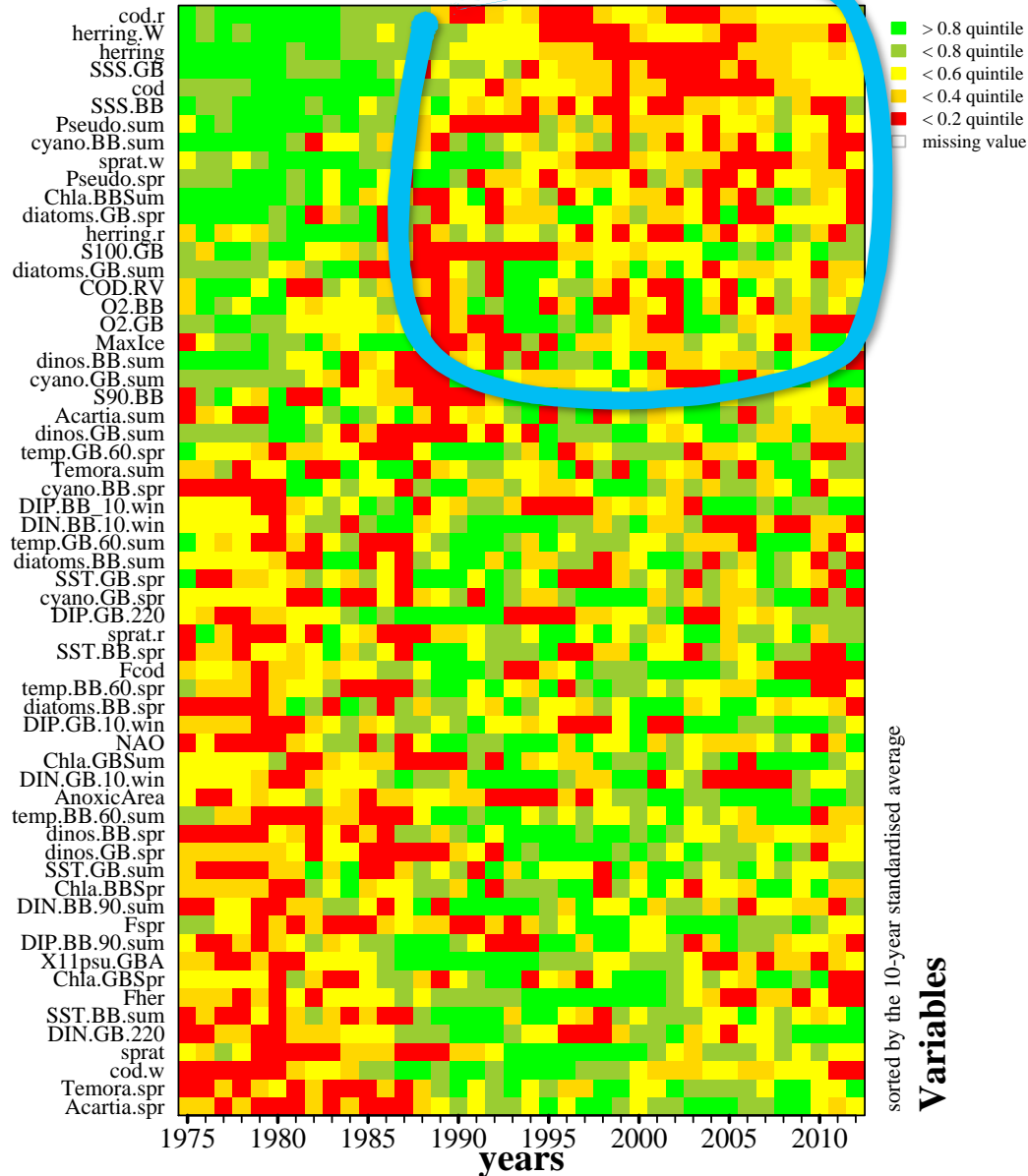
# BALTIC SEA

## trafficlight plots



# BALTIC SEA

## trafficlight plots



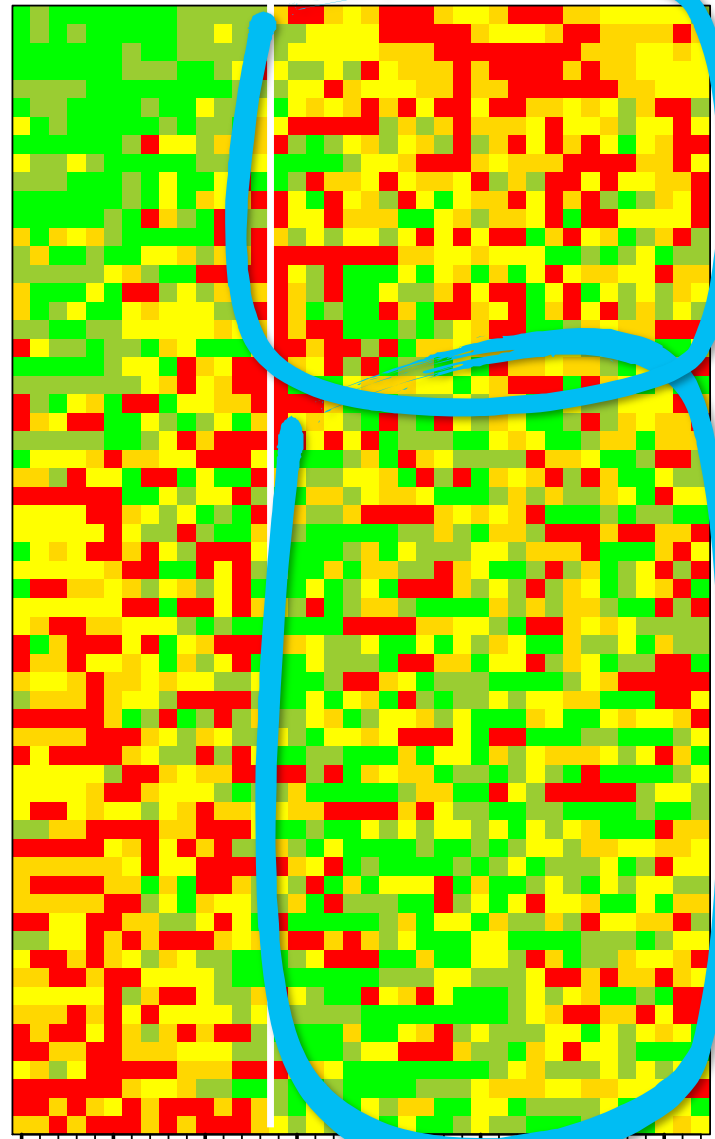


# BALTIC SEA

## trafficlight plot



- cod.r
- herring.W
- herring
- SSS.GB
- cod
- SSS.BB
- Pseudo.sum
- cyano.BB.sum
- sprat.w
- Pseudo.spr
- Chla.BBSum
- diatoms.GB.spr
- herring.r
- S100.GB
- diatoms.GB.sum
- COD.RV
- O2.BB
- O2.GB
- MaxIce
- dinos.BB.sum
- cyano.GB.sum
- S90.BB
- Acartia.sum
- dinos.GB.sum
- temp.GB.60.spr
- Temora.sum
- cyano.BB.spr
- DIP.BB.10.win
- DIN.BB.10.win
- temp.GB.60.sum
- diatoms.BB.sum
- SST.GB.spr
- cyano.GB.spr
- DIP.GB.220
- sprat.r
- SST.BB.spr
- Fcod
- temp.BB.60.spr
- diatoms.BB.spr
- DIP.GB.10.win
- NAO
- Chla.GBSum
- DIN.GB.10.win
- AnoxicArea
- temp.BB.60.sum
- dinos.BB.spr
- dinos.GB.spr
- SST.GB.sum
- Chla.BBSpr
- DIN.BB.90.sum
- Fspr
- DIP.BB.90.sum
- X11psu.GBA
- Chla.GBSpr
- Fher
- SST.BB.sum
- DIN.GB.220
- sprat
- cod.w
- Temora.spr
- Acartia.spr



- > 0.8 quintile
- < 0.8 quintile
- < 0.6 quintile
- < 0.4 quintile
- < 0.2 quintile
- missing value

sorted by the 10-year standardised average

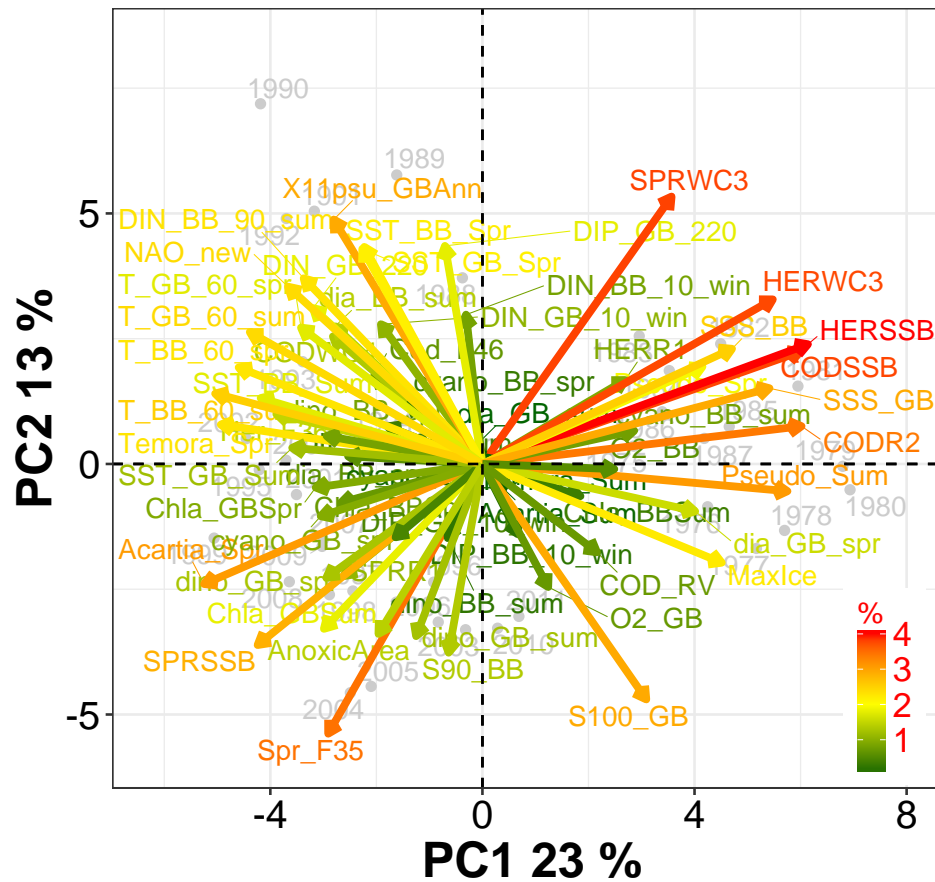
**Variables**



1975 1980 1985 1990 1995 2000 2005 2010

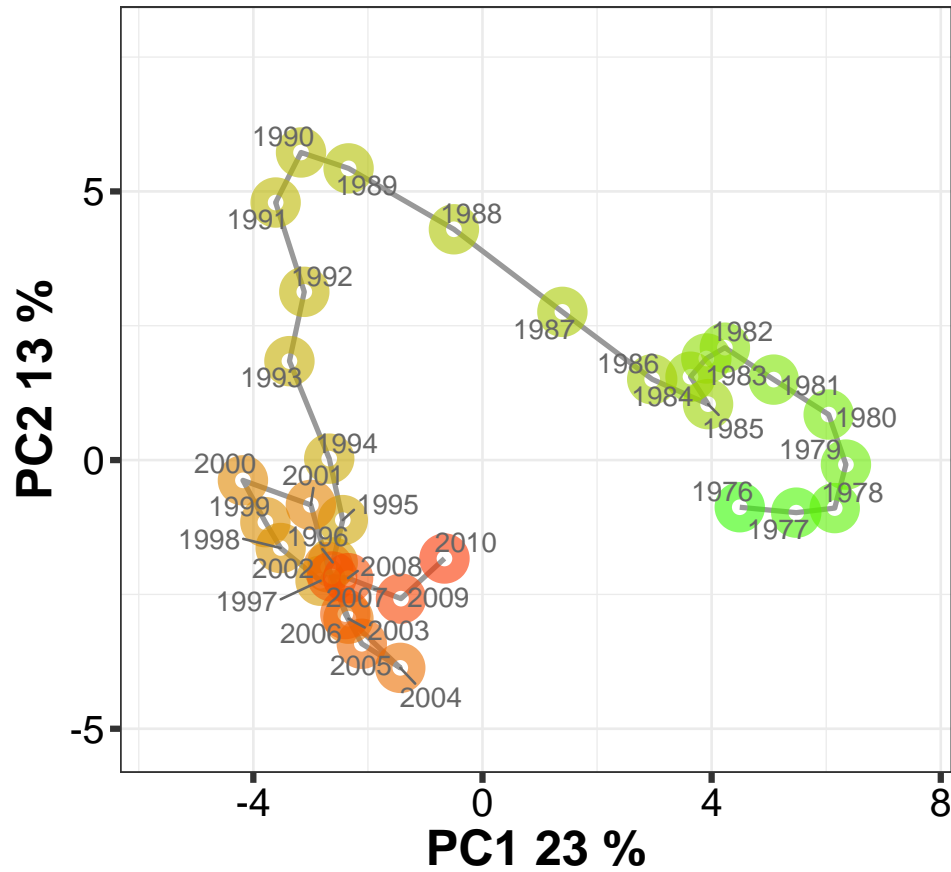
**years**

### PCA biplot PC1 & PC2

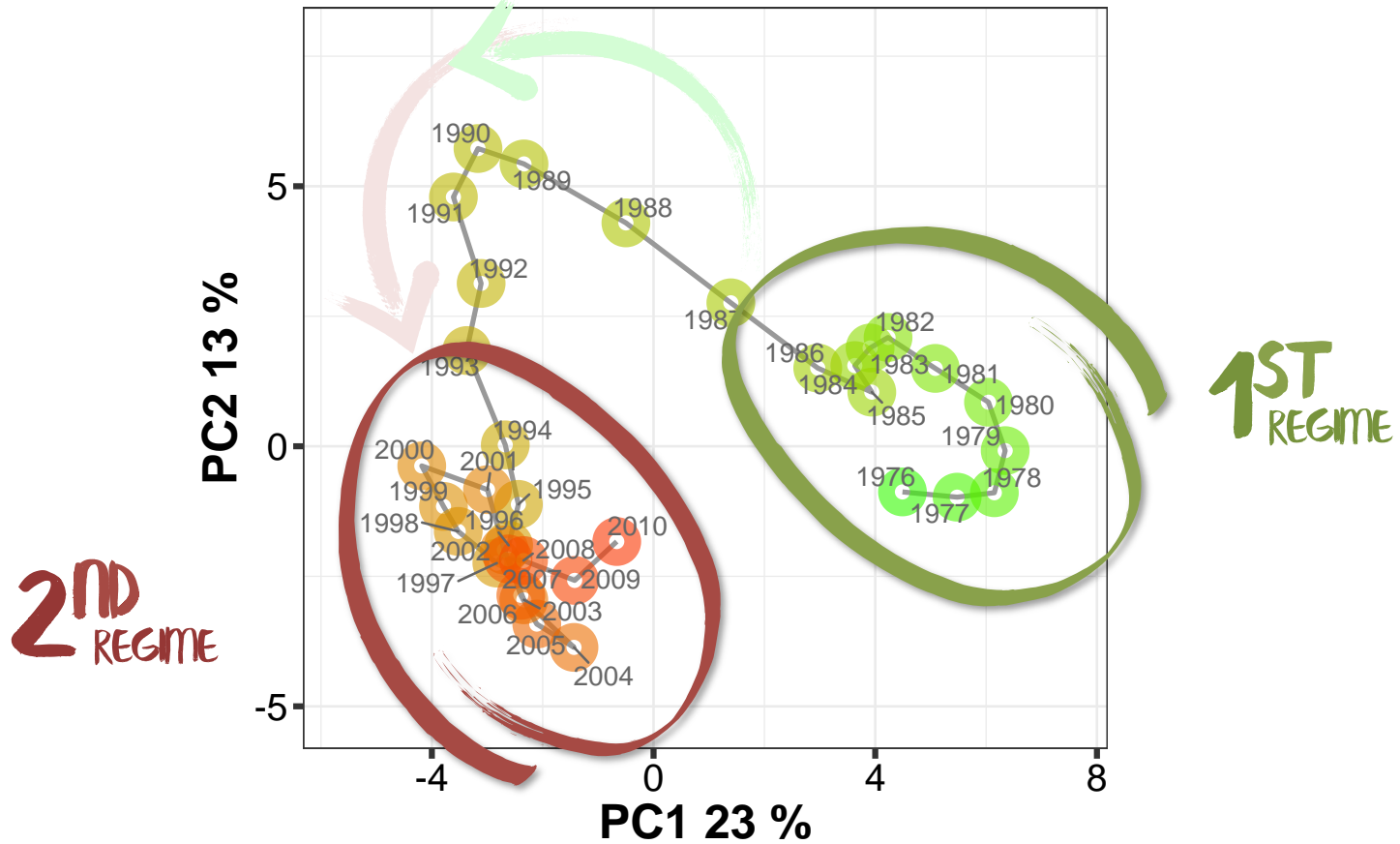




### PCA trajectory moving averages



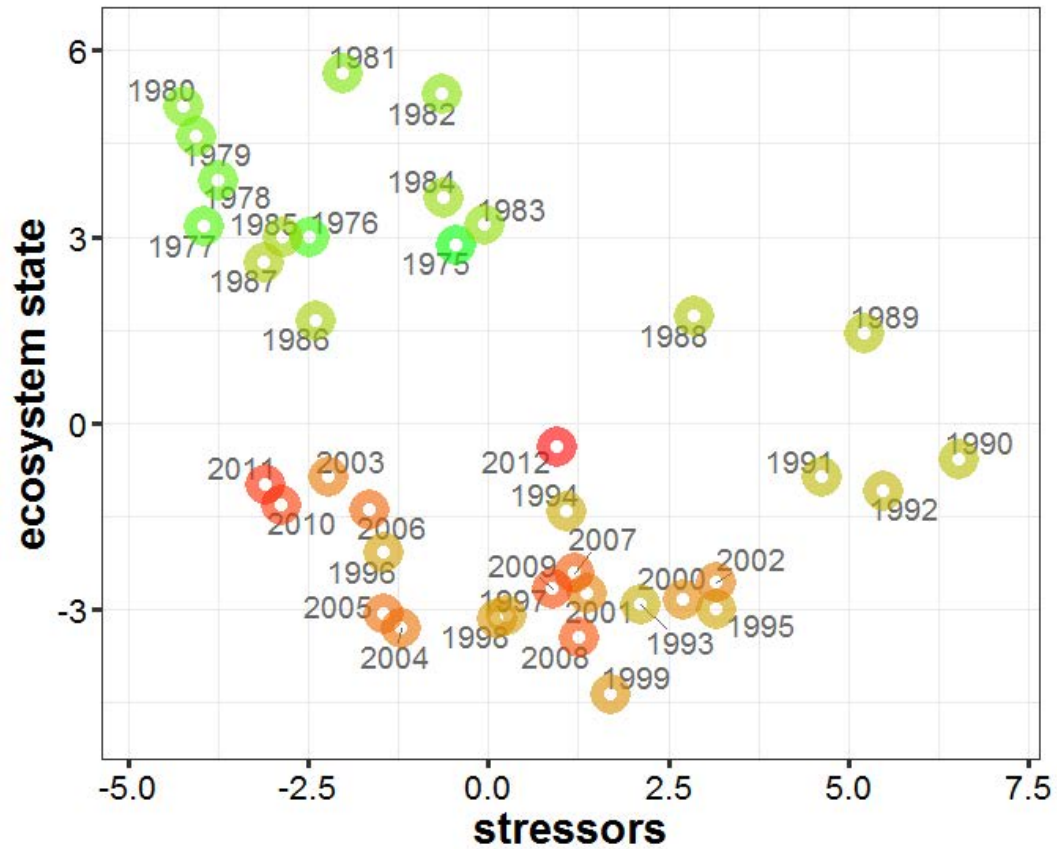
### PCA trajectory moving averages



# BALTIC SEA

PC  
analysis

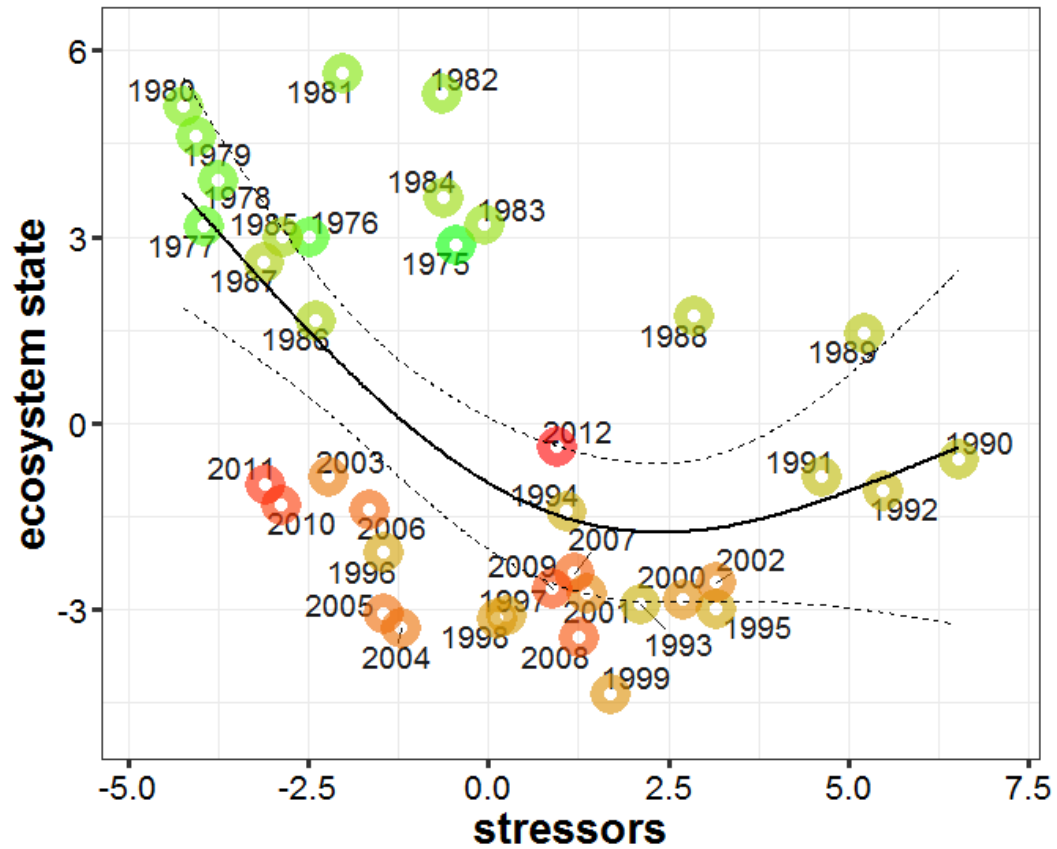
state vs.  
stressors



# BALTIC SEA

GAM  
additive modelling

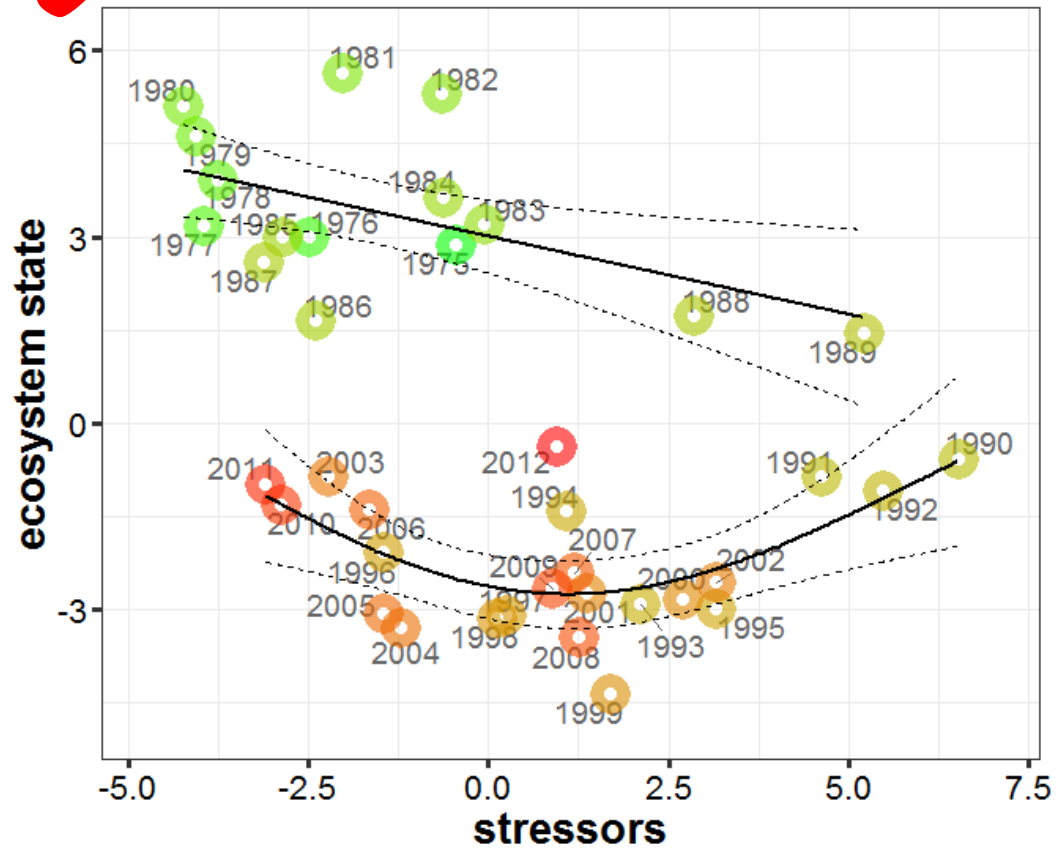
state vs.  
stressors



# BALTIC SEA

tGAM  
non-additive modelling

state vs.  
stressors





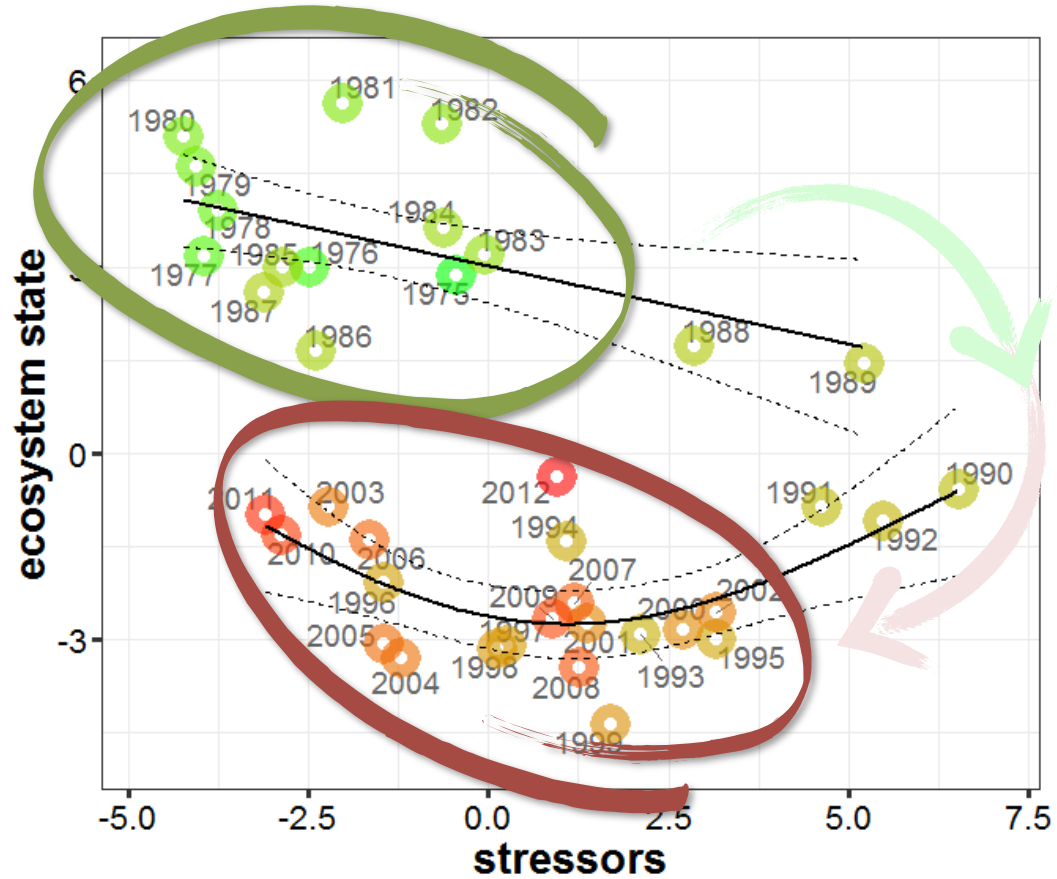
# BALTIC SEA

PC  
analysis

state vs.  
stressors

1<sup>ST</sup>  
REGIME

2<sup>ND</sup>  
REGIME

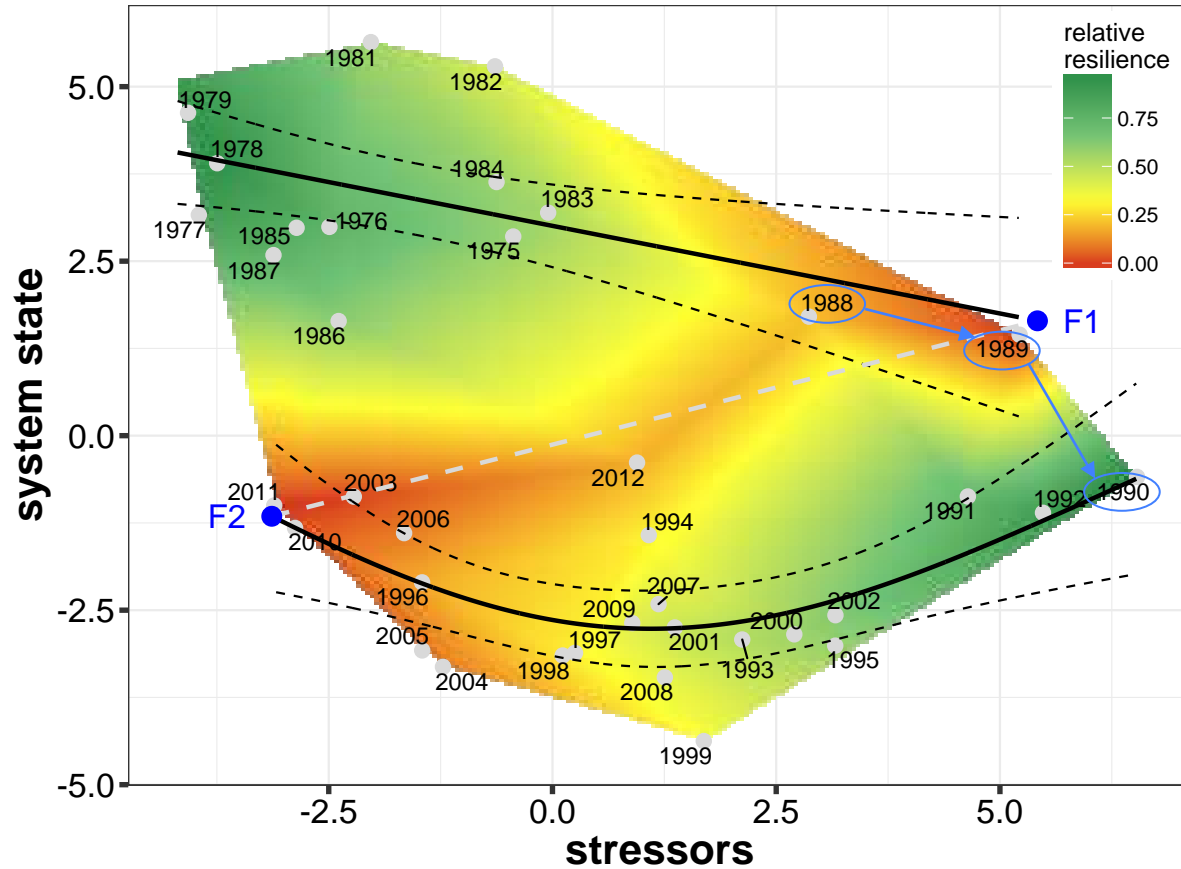


# BALTIC SEA

## stability landscape

1<sup>ST</sup>  
REGIME

2<sup>ND</sup>  
REGIME

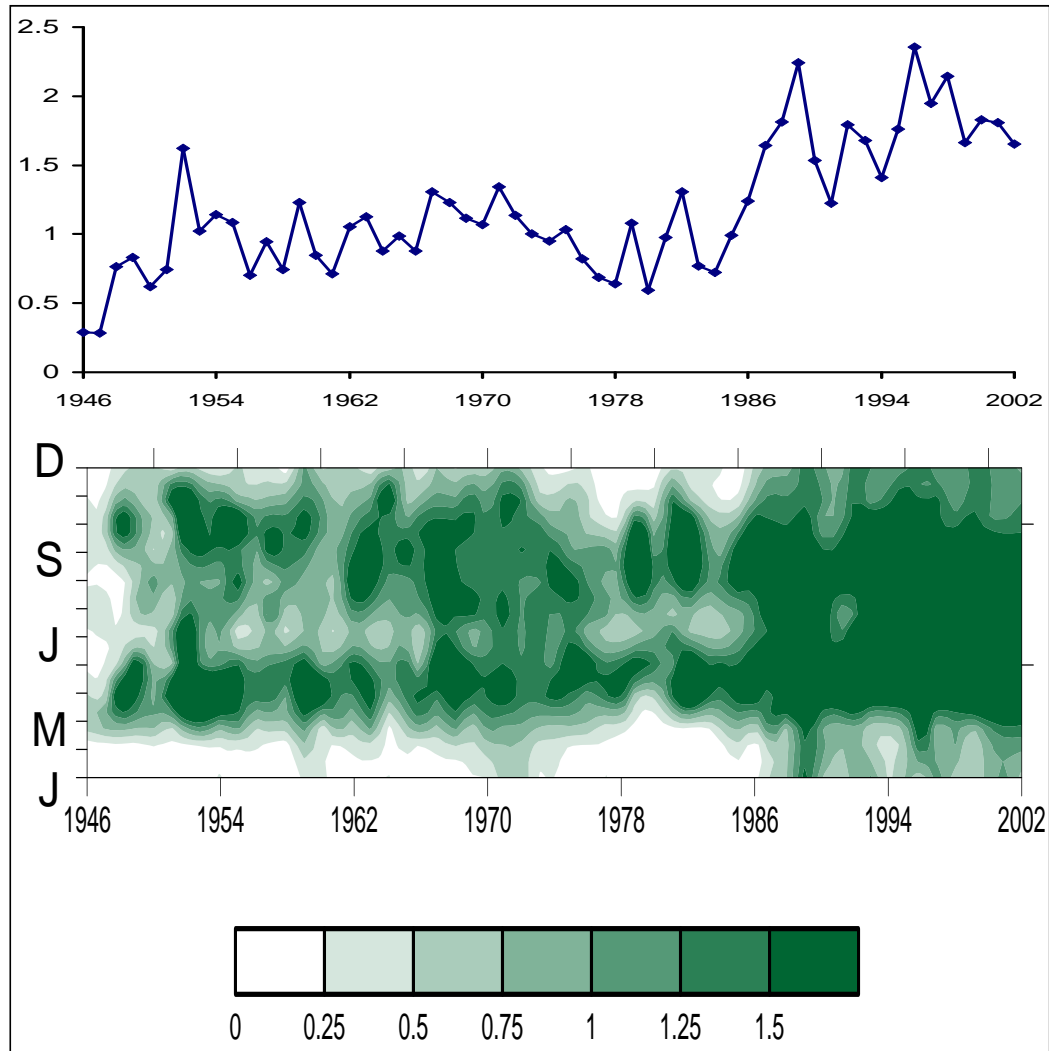


NORTH  
SEA



# NORTH SEA

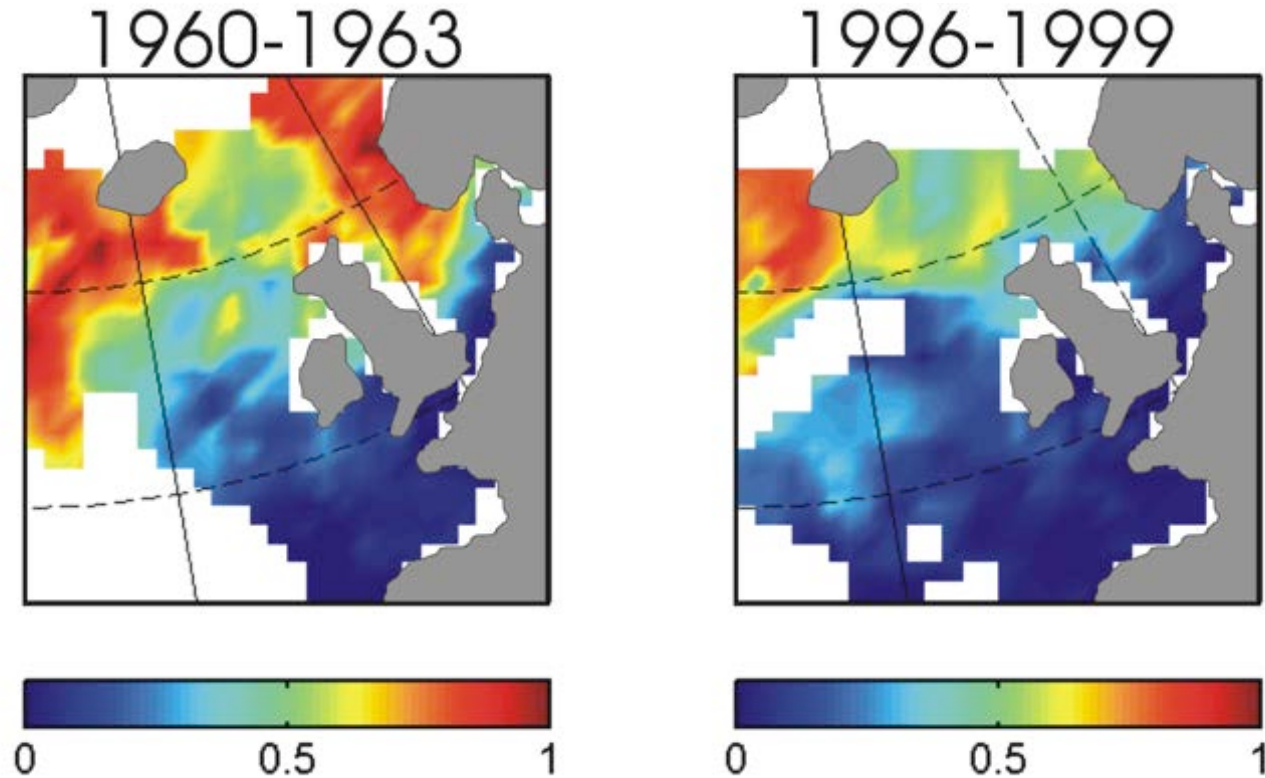
regime  
shift



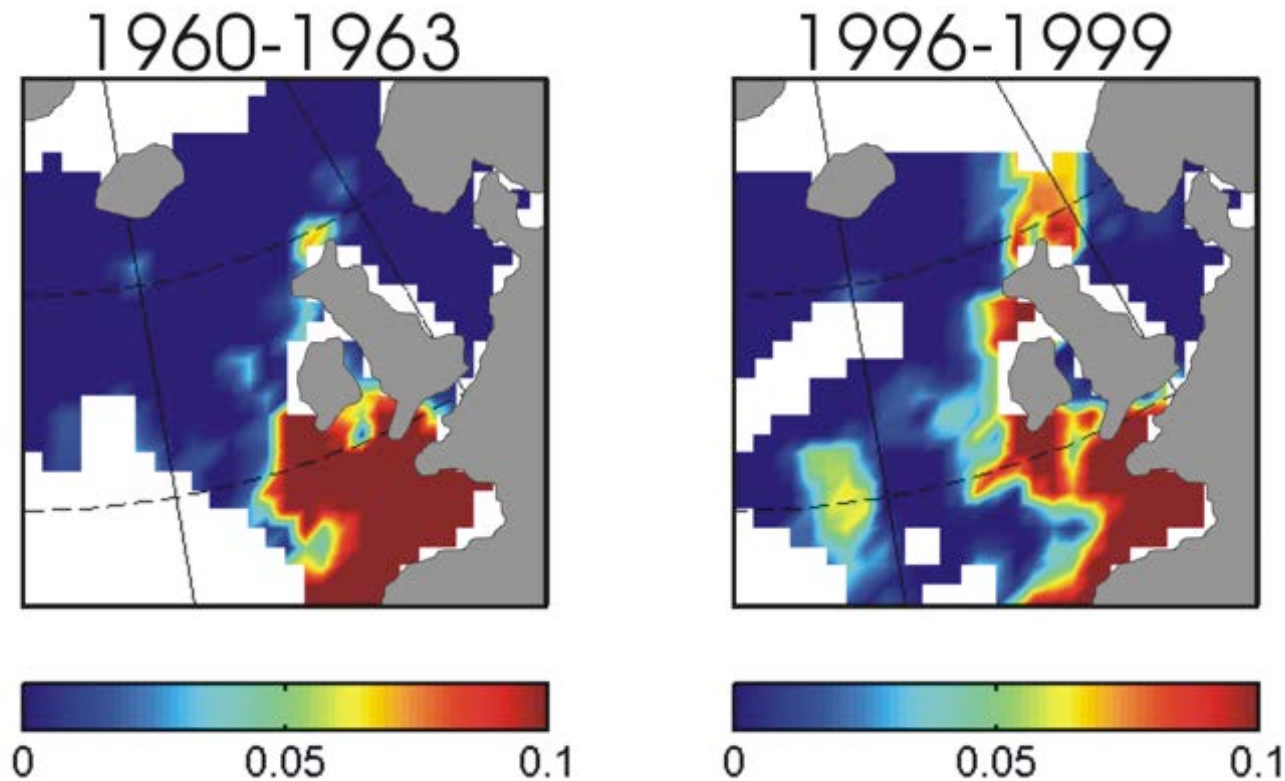
PHYTOPLANKTON  
COLOUR INDEX

continuous plankton recorder - Reid *et al* (1998) Nature

**Subarctic species**

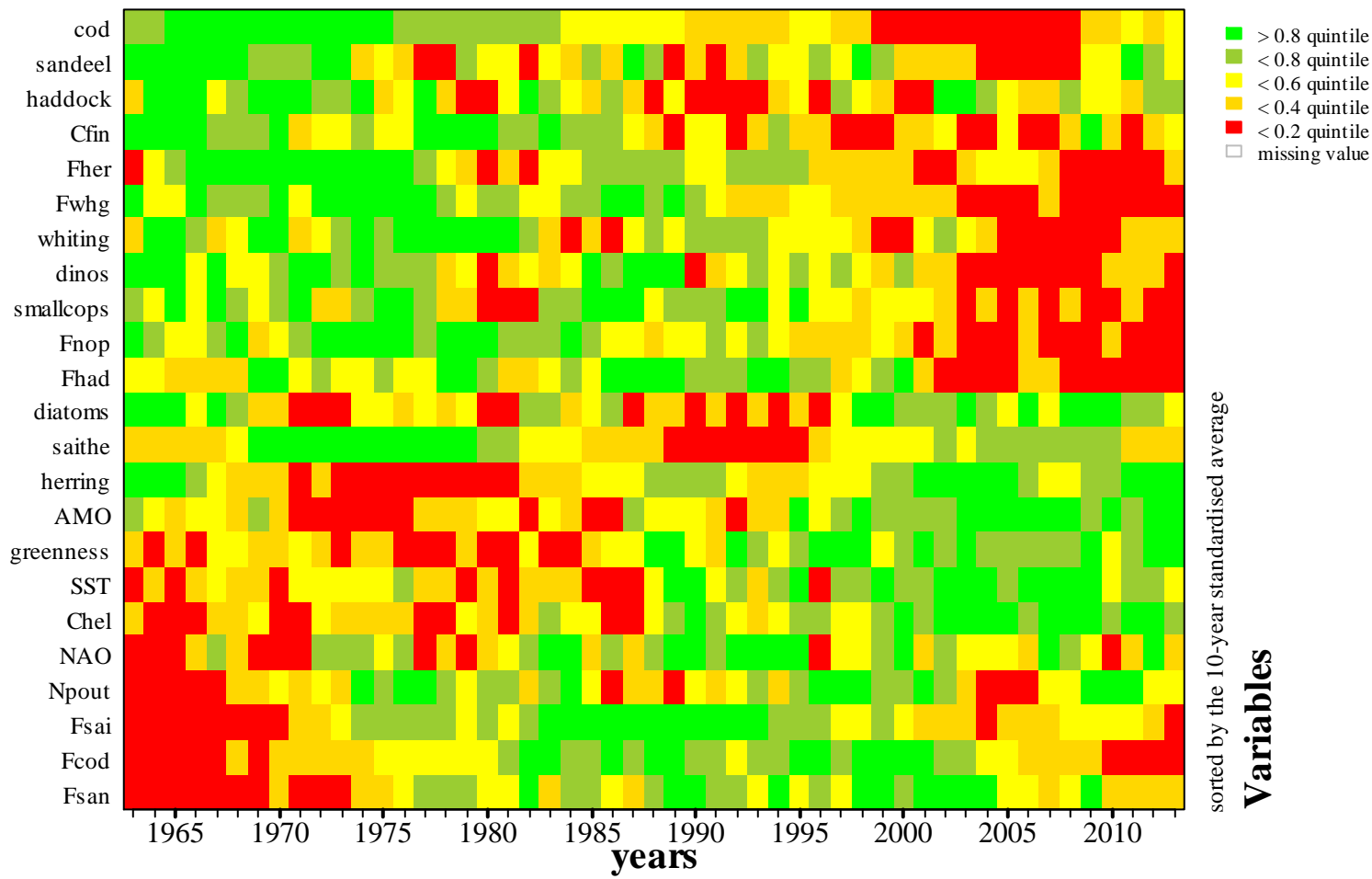


## Warm-temperature species



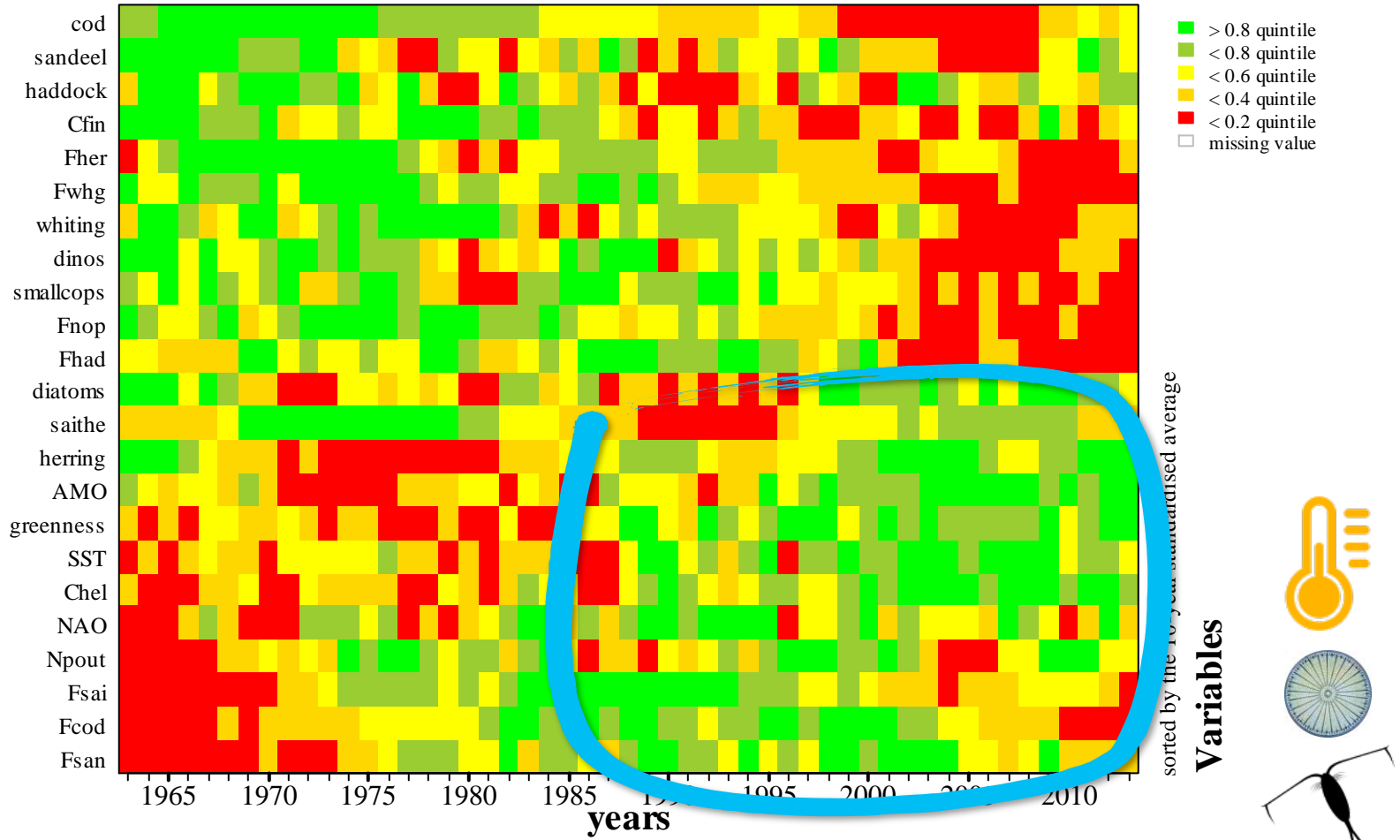
# NORTH SEA

## trafficlight plot



# NORTH SEA

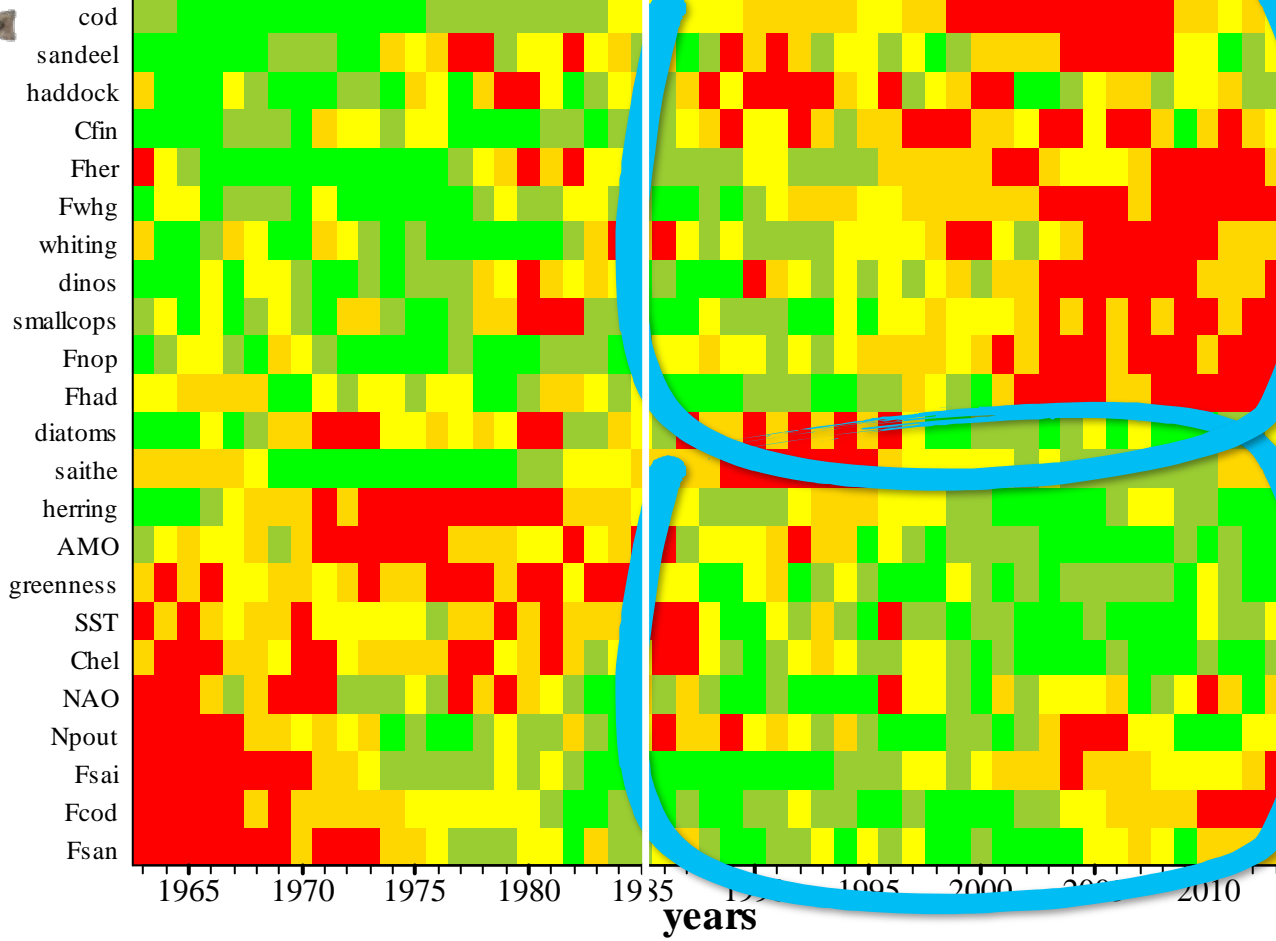
## trafficlight plot





# NORTH SEA

trafficlight  
plot

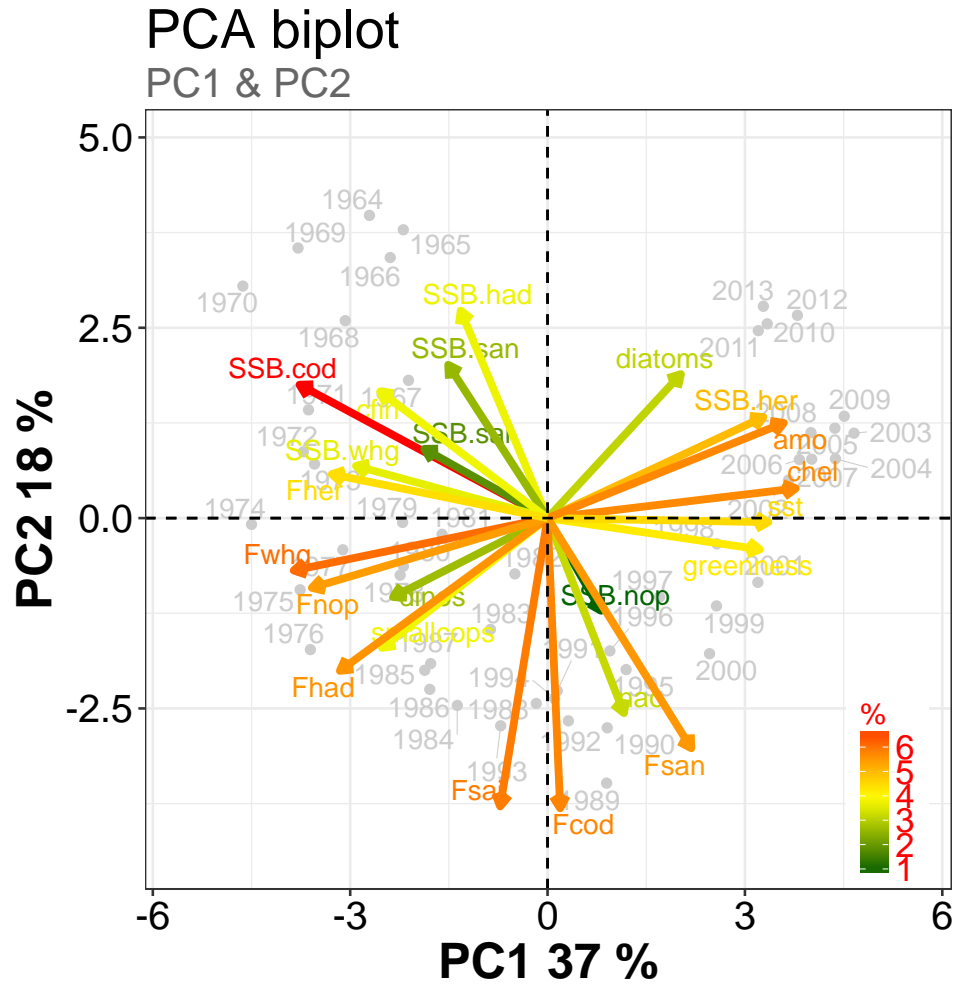


- > 0.8 quintile
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- < 0.6 quintile
- < 0.4 quintile
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- missing value

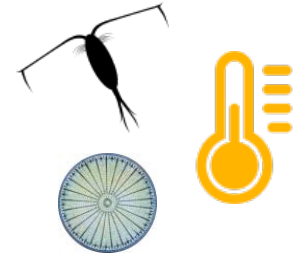
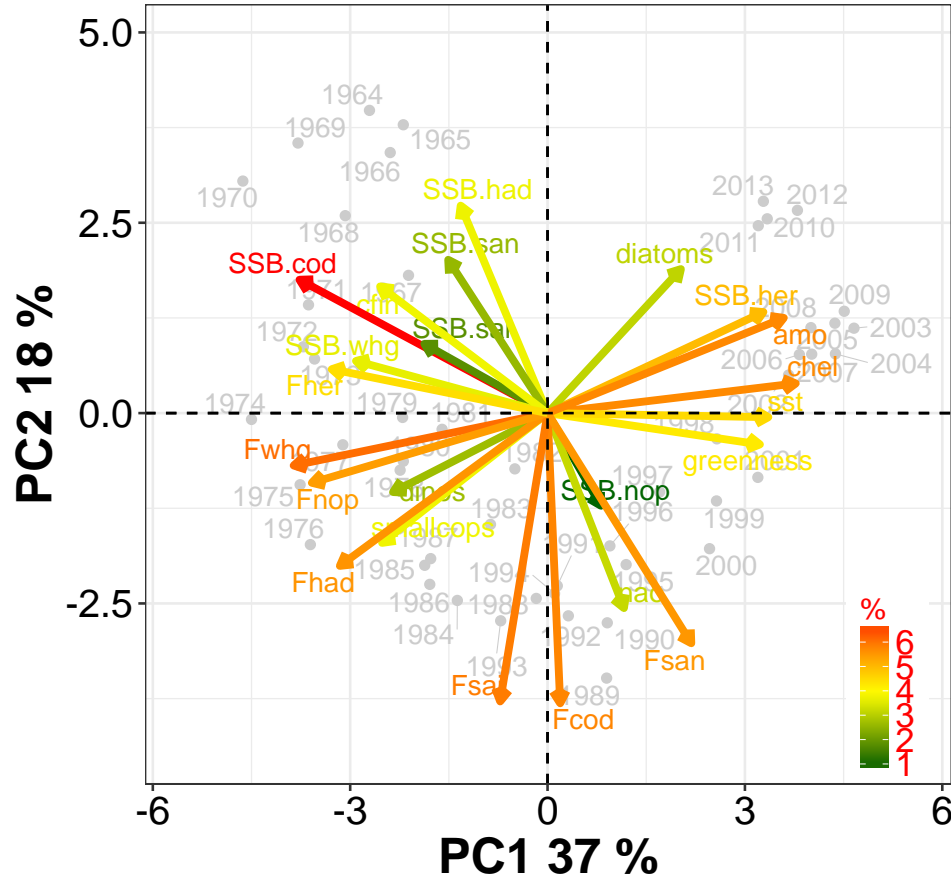
sorted by the 1965-1985 period

Variables

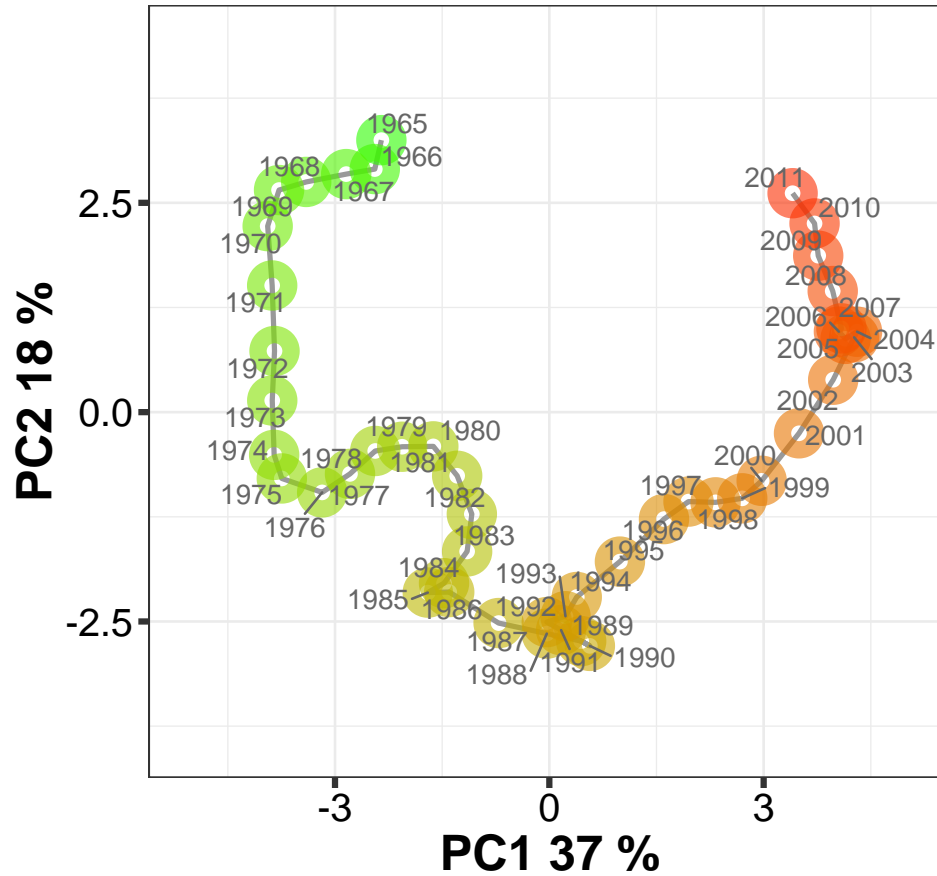




### PCA biplot PC1 & PC2

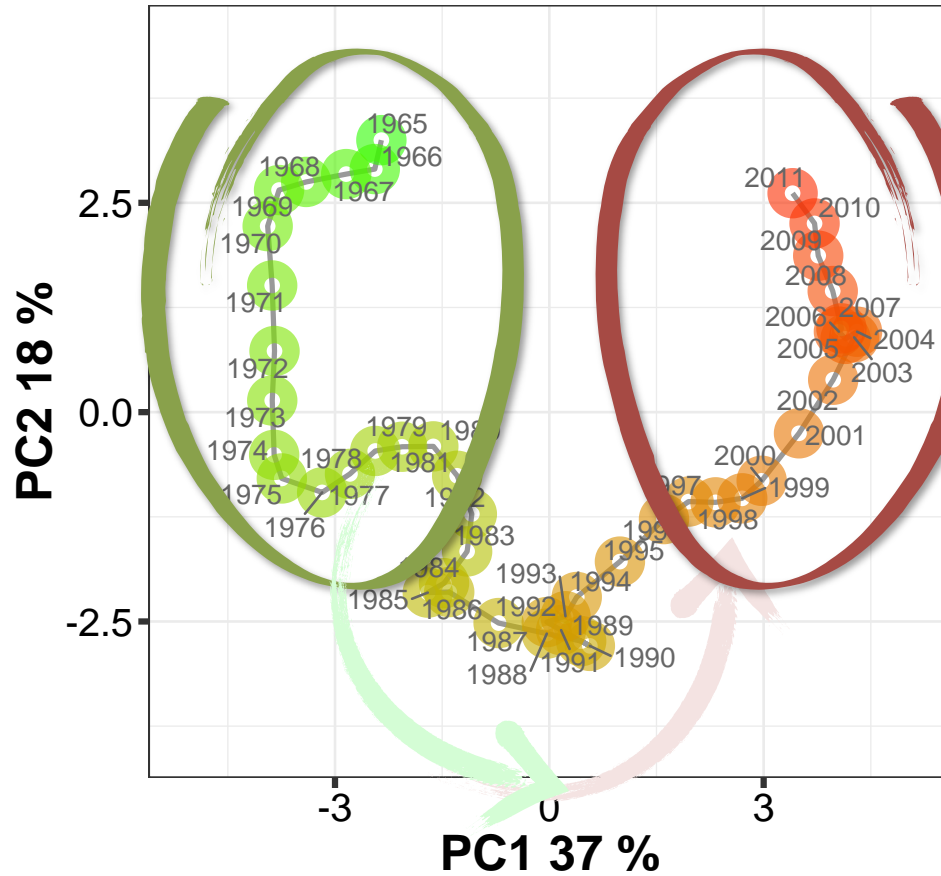


### PCA trajectory moving averages

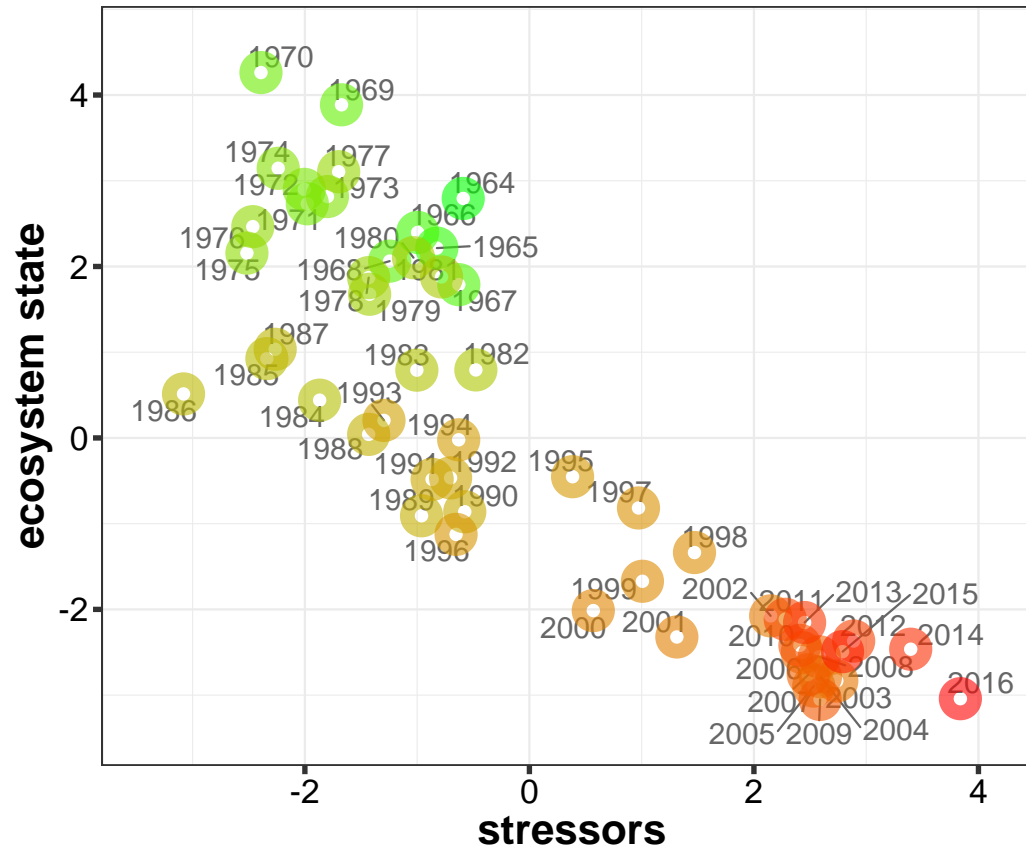


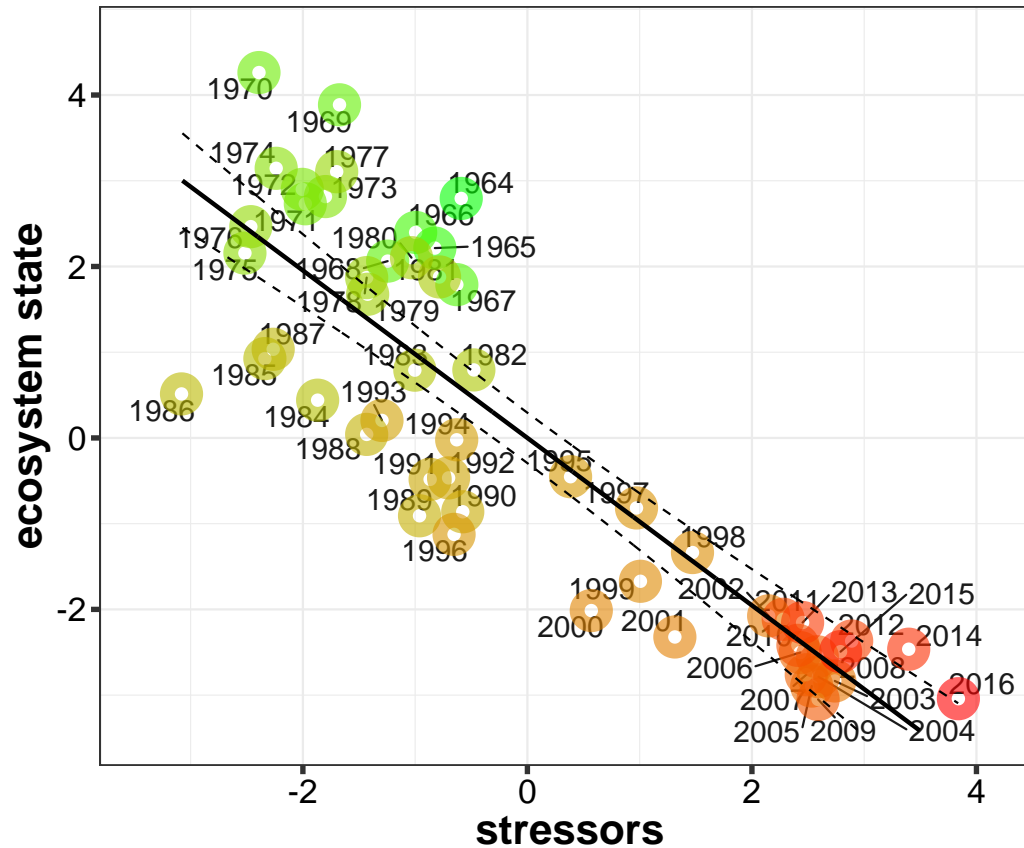
### PCA trajectory moving averages

1ST  
REGIME



2ND  
REGIME

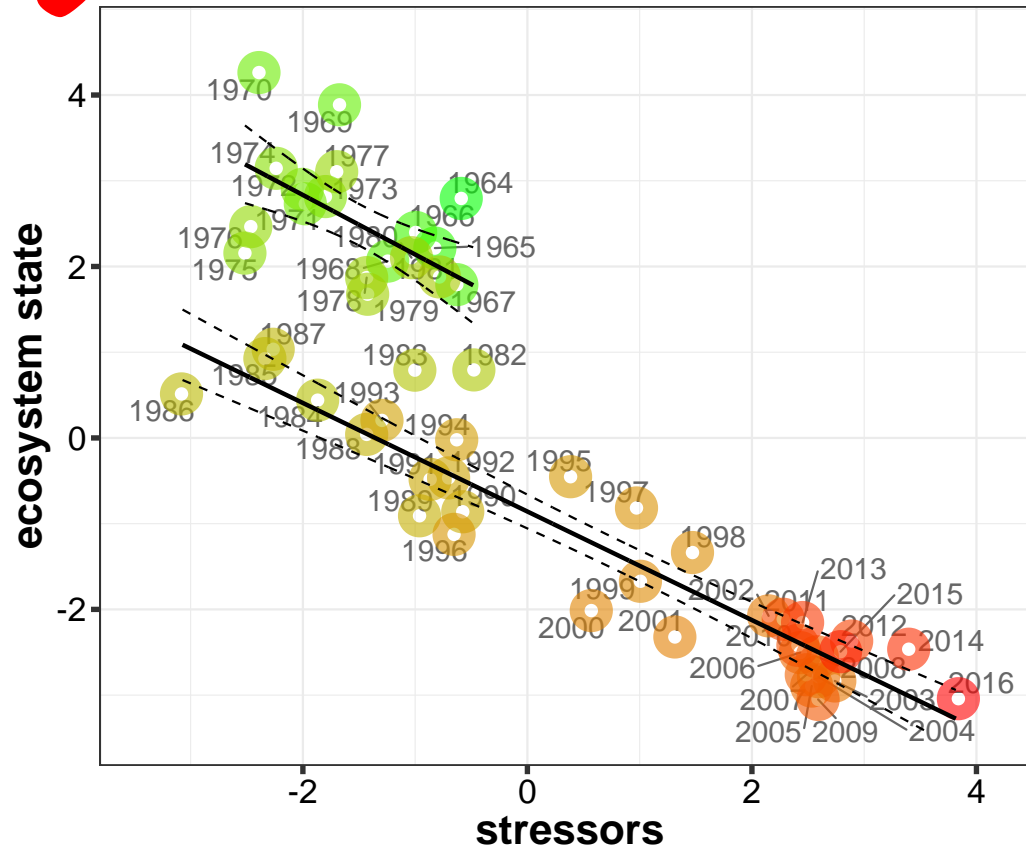




# NORTH SEA

tGAM  
non-additive modelling

state vs.  
stressors





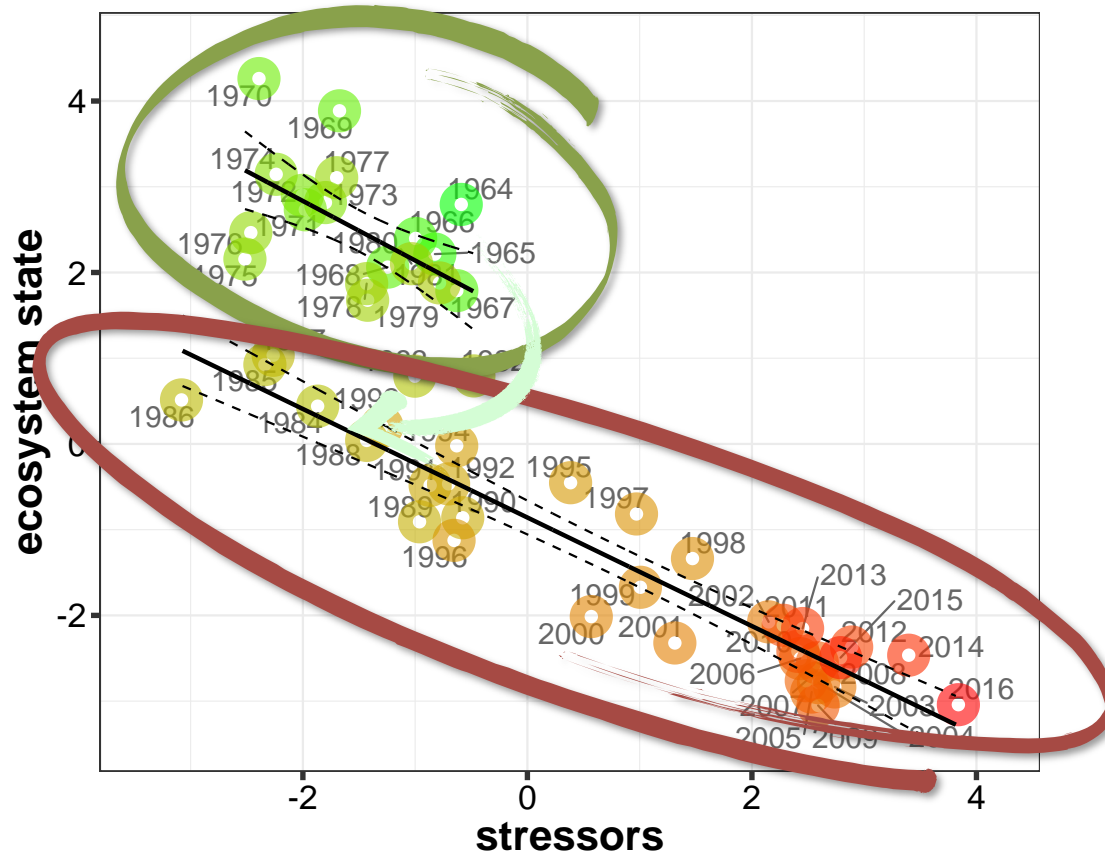
# NORTH SEA

PC  
analysis

state vs.  
stressors

1<sup>ST</sup>  
REGIME

2<sup>ND</sup>  
REGIME

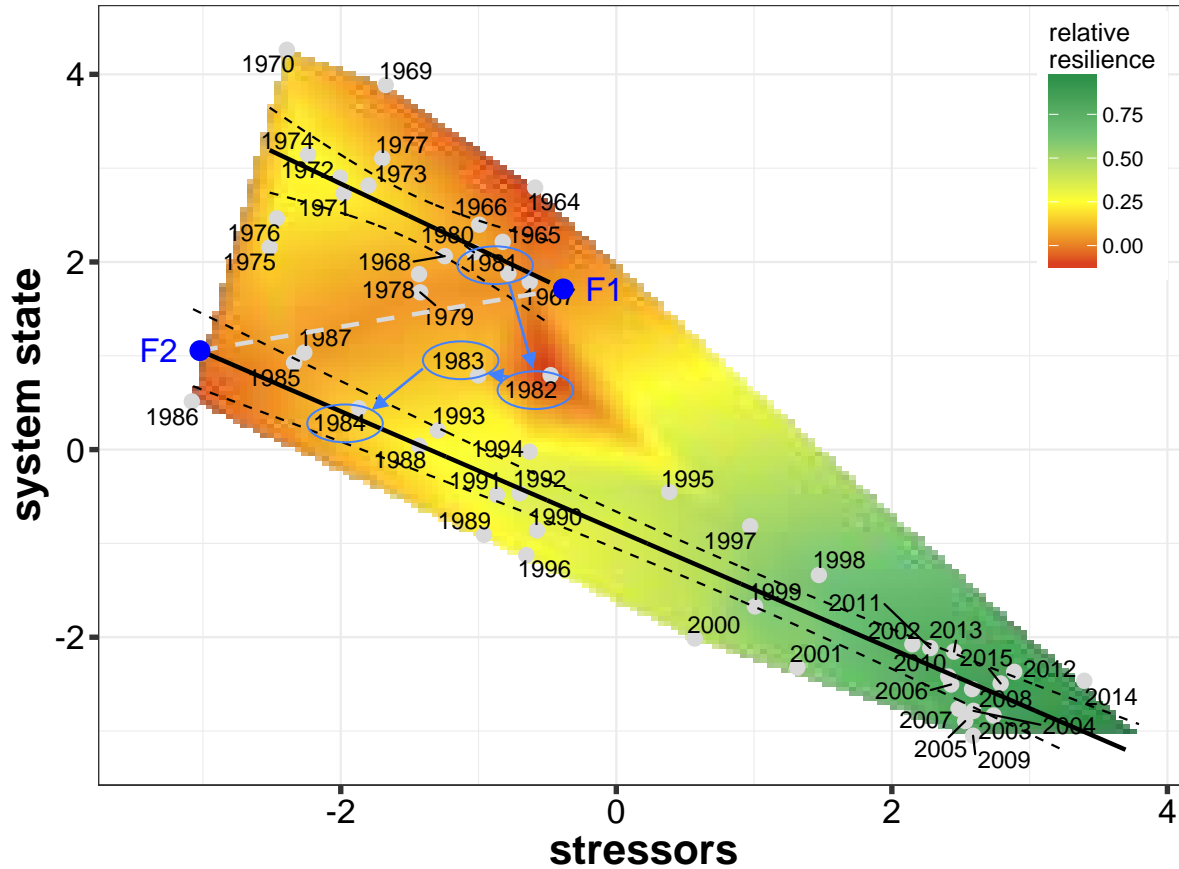


# NORTH SEA

## stability landscape

1<sup>ST</sup>  
REGIME

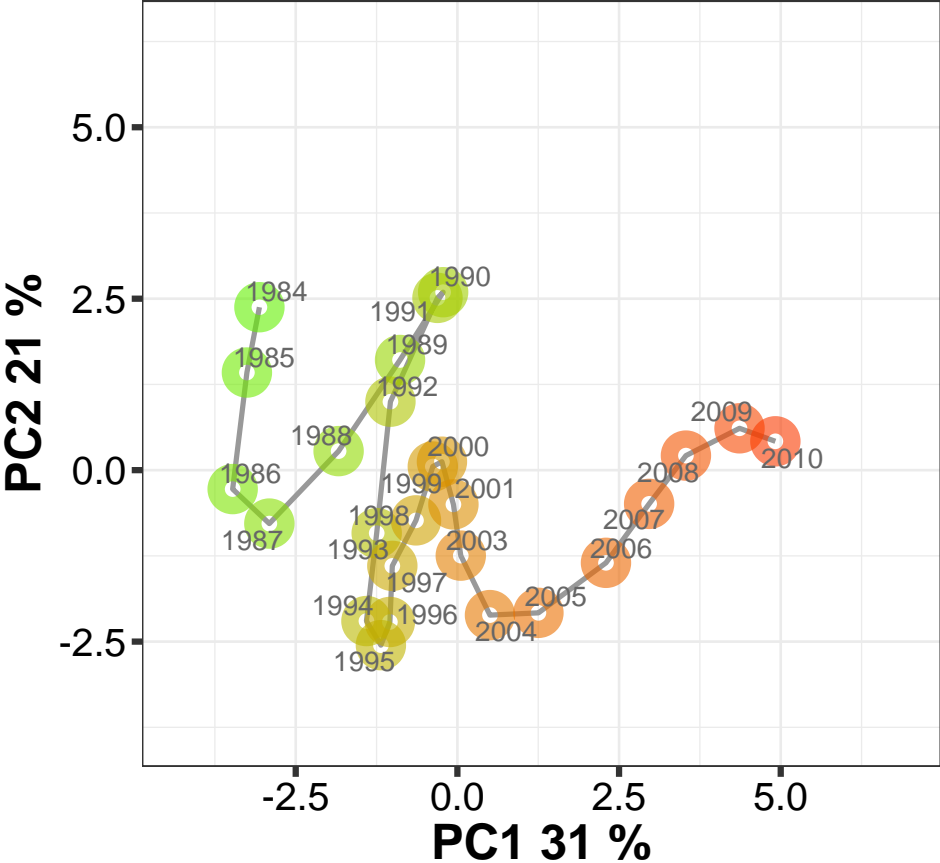
2<sup>ND</sup>  
REGIME



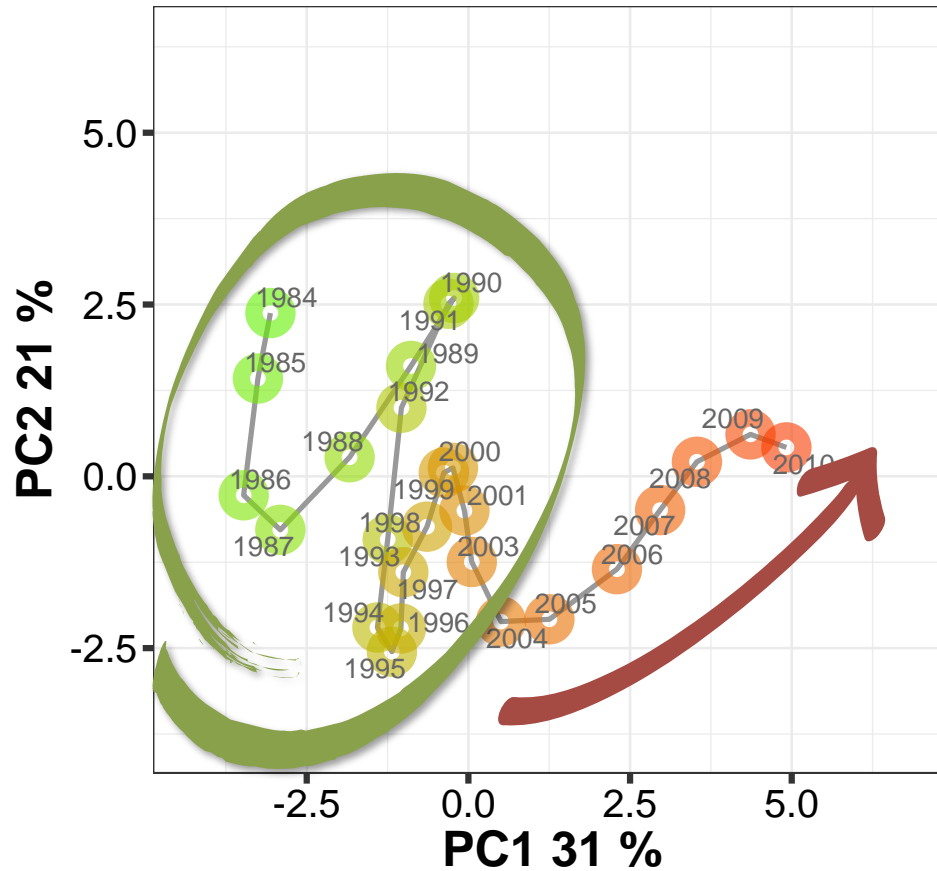
# BARENTS SEA

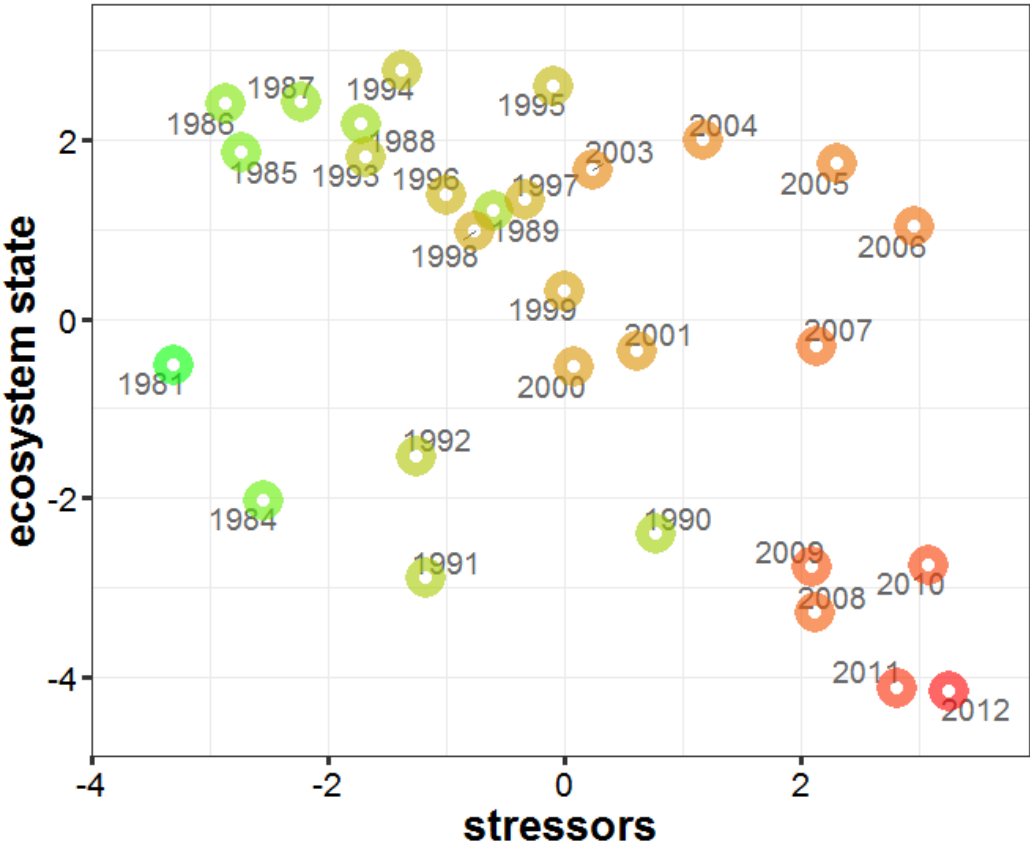


PCA trajectory  
moving averages



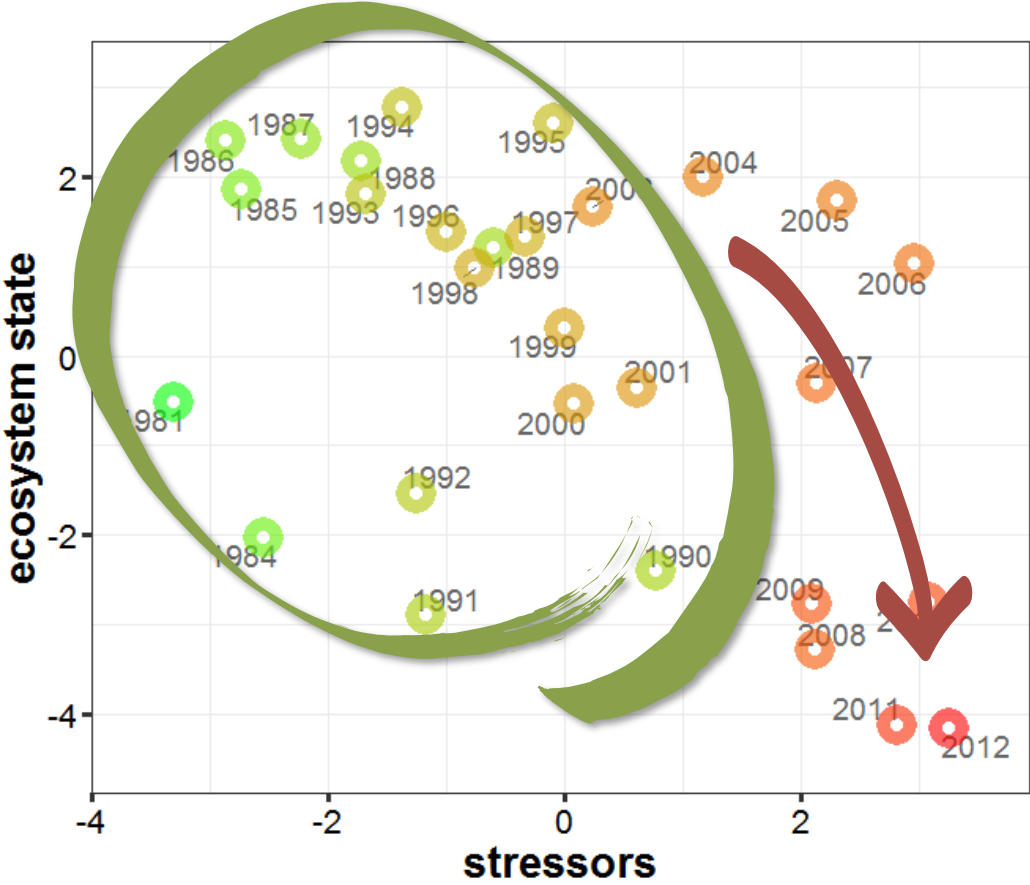
## PCA trajectory moving averages





# BARENTS SEA | PC analysis

state vs. stressors

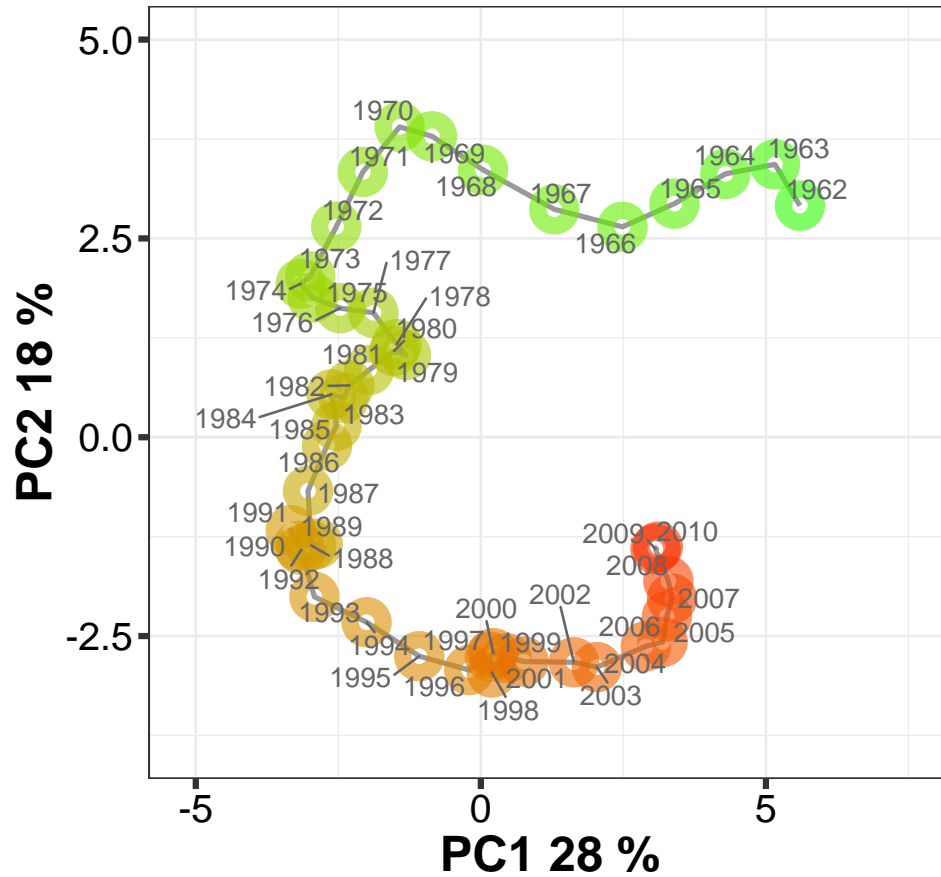




# SEAS OF ICELAND



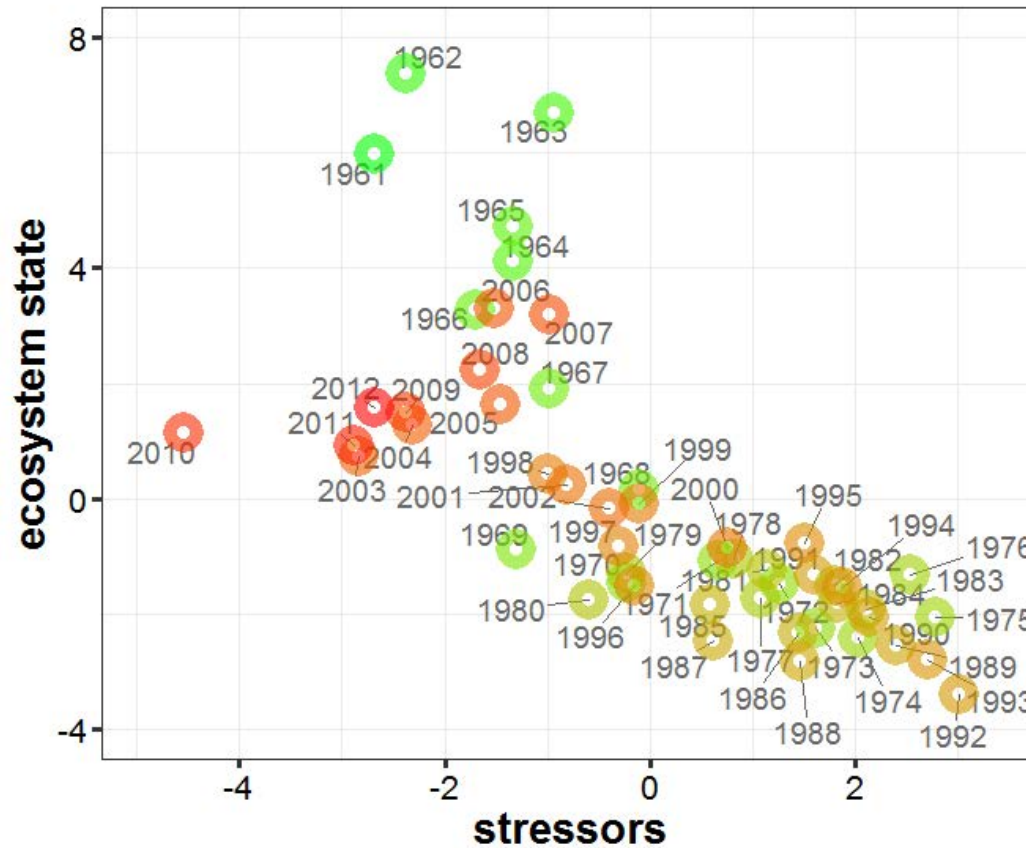
### PCA trajectory moving averages



# ICELAND SEAS

PC  
analysis

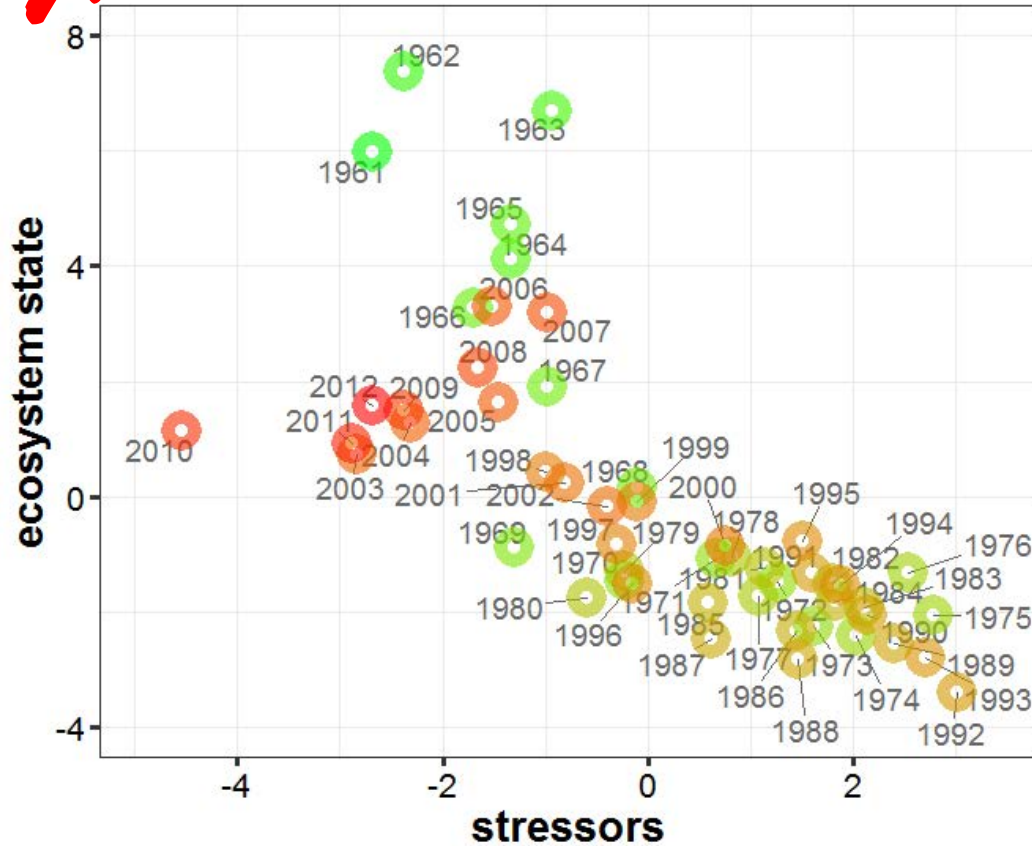
state vs.  
stressors



# ICELAND SEAS

PC  
analysis

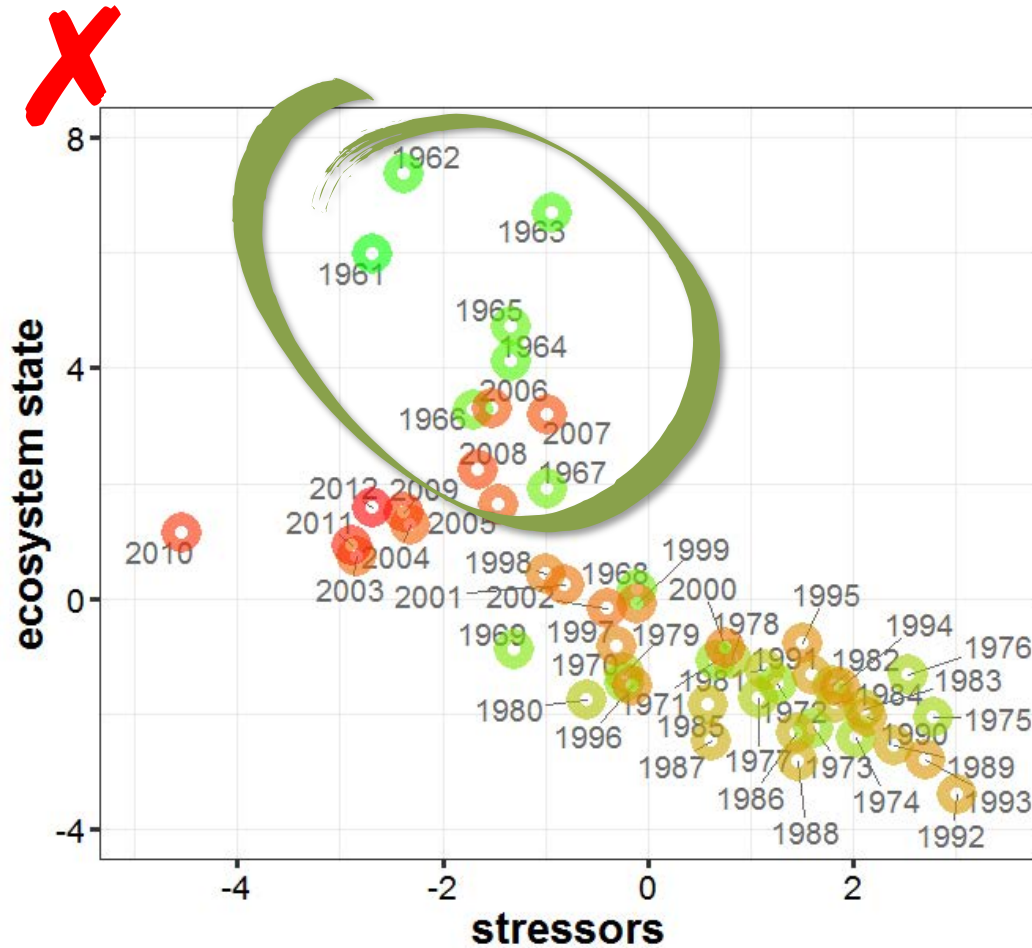
state vs.  
stressors



# ICELAND SEAS

PC analysis

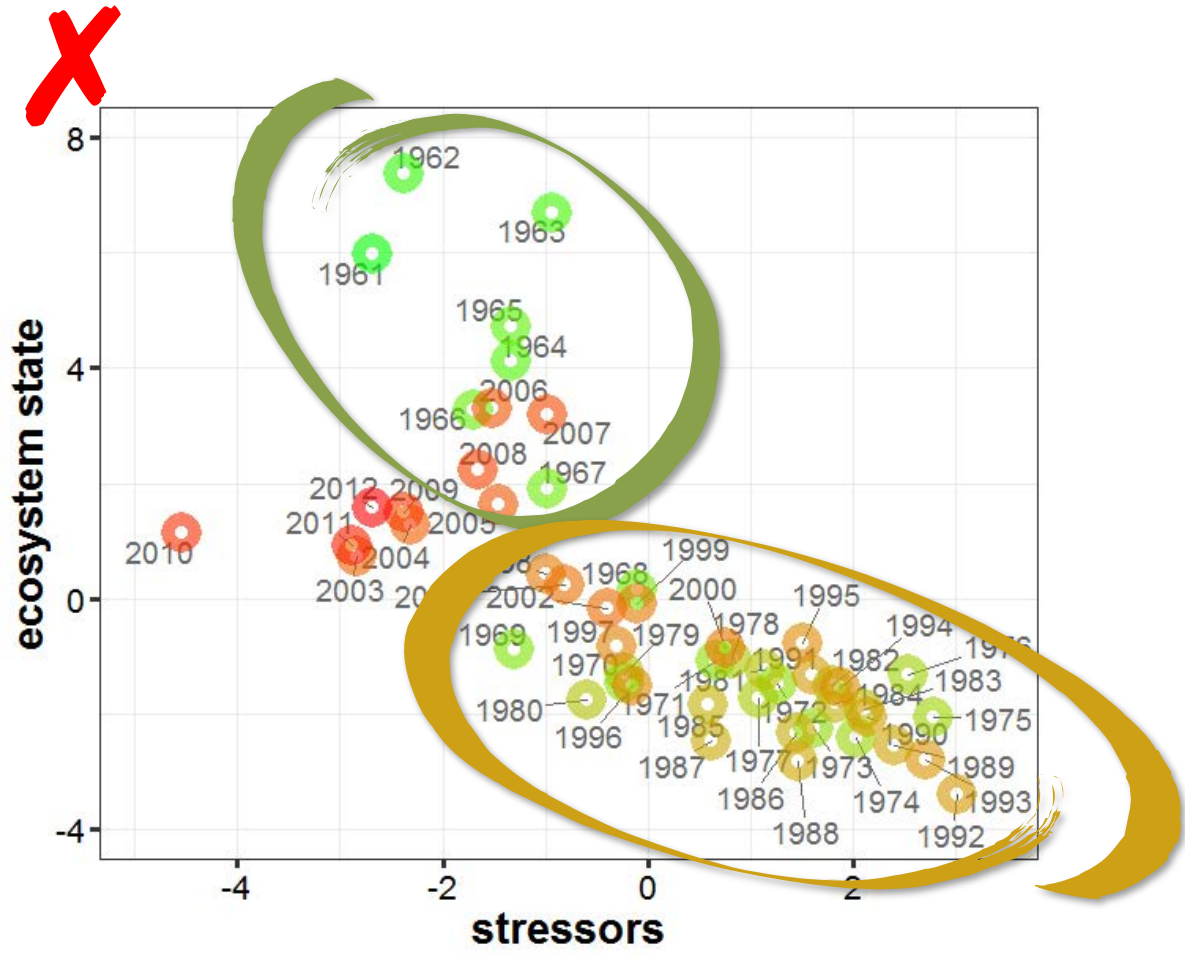
state vs. stressors



# ICELAND SEAS

PC analysis

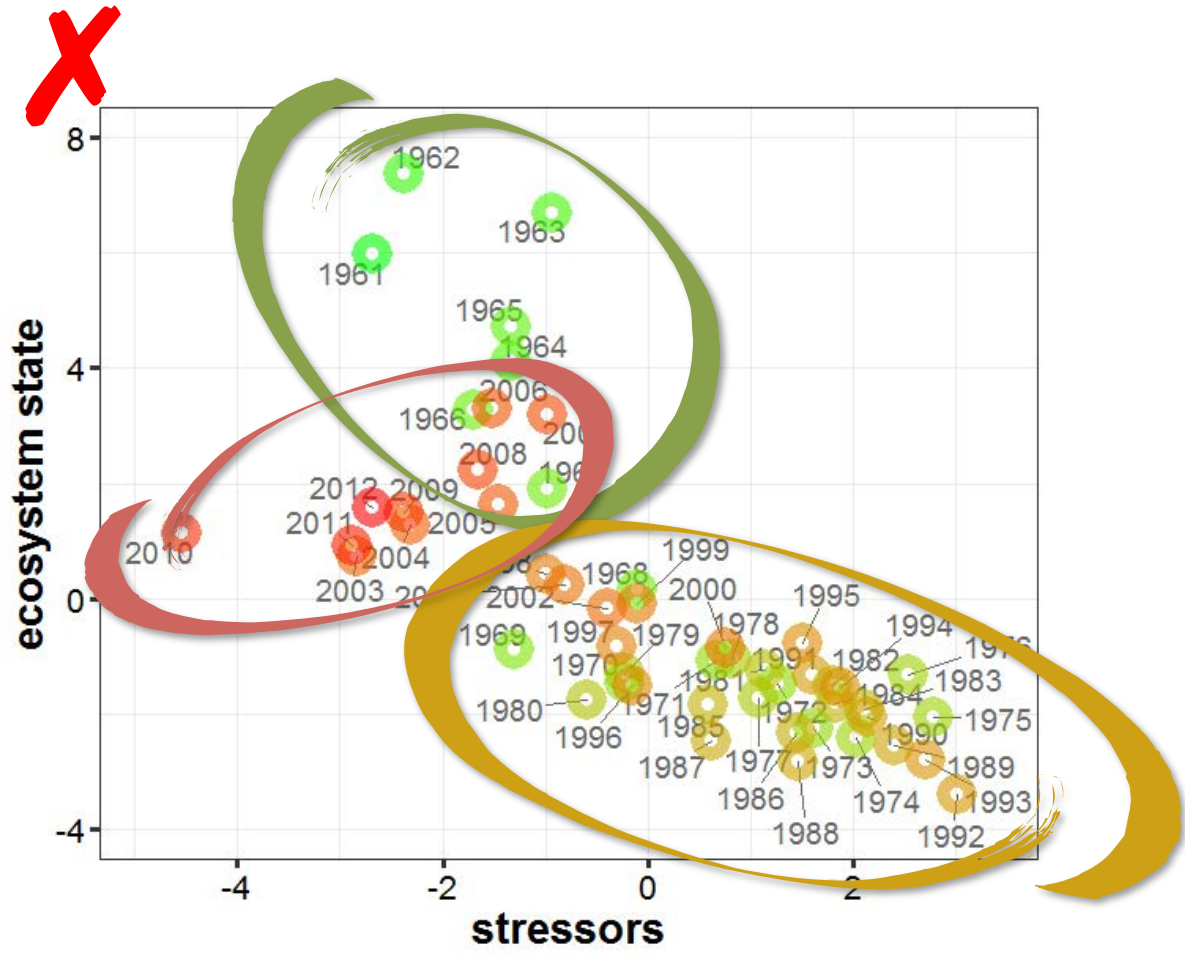
state vs. stressors



# ICELAND SEAS

PC  
analysis

state vs.  
stressors



# CONCLUSIONS | preliminary

**X** ICELAND SEAS  
BARENTS SEA  
*no clear  
stability landscape*

**✓** NORTH SEA  
BALTIC SEAS  
*indication of  
stability landscapes*

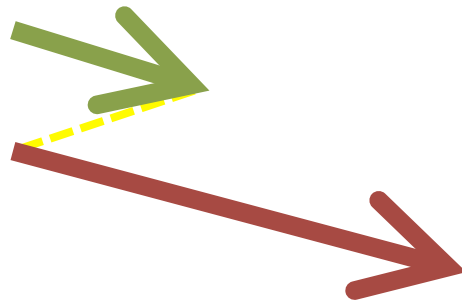


# CONCLUSIONS | preliminary

1<sup>ST</sup>  
REGIME

2<sup>ND</sup>  
REGIME

NORTH SEA



the system entered into a new stressors domain (not previously seen) and seems to have reached high resilience within its present regime

BALTIC SEA

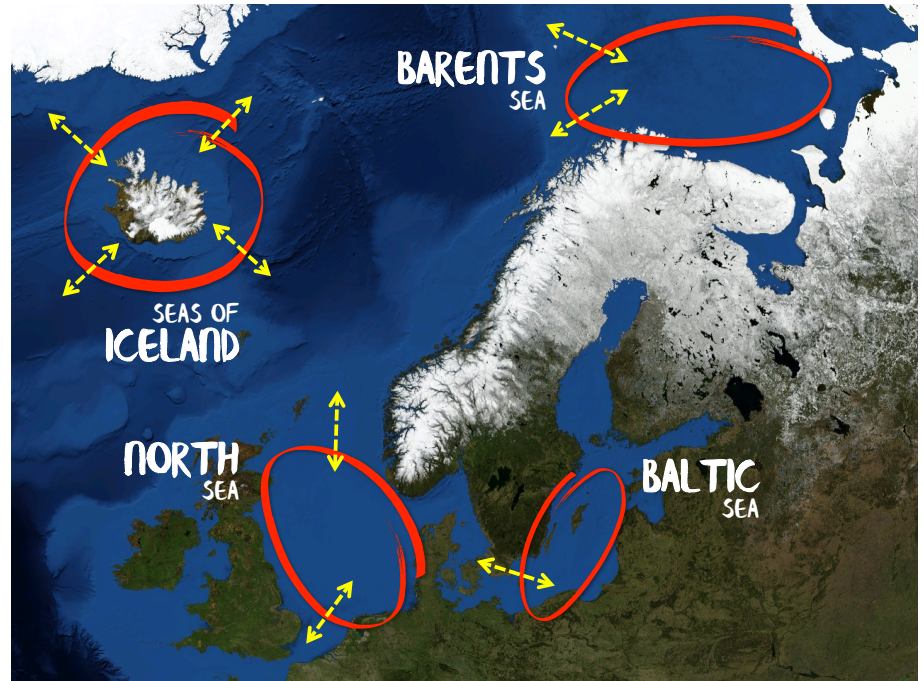


stressors seem to have moved back towards the 70s but this is only part of the story (PC1). Anoxia and eutrophication still important (PC2)



# CONCLUSIONS | and questions ?

*To what extent diversity (highest in the North Sea) and/or level of isolation (Barents Sea and Iceland Sea are open ecosystems, while North and Baltic are semi-enclosed) could be responsible for this gradient in responses to similar stressors?*





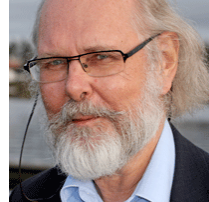
UiO : **Centre for Ecological and Evolutionary Synthesis**  
University of Oslo



Joël Durant



Leif C. Stige



Nils Chr. Stenseth



Niall McGinty



Guðrún Marteinsdóttir



Thorsten Blenckner

**Stockholm Resilience Centre**  
Sustainability Science for Biosphere Stewardship



Chris Lynam



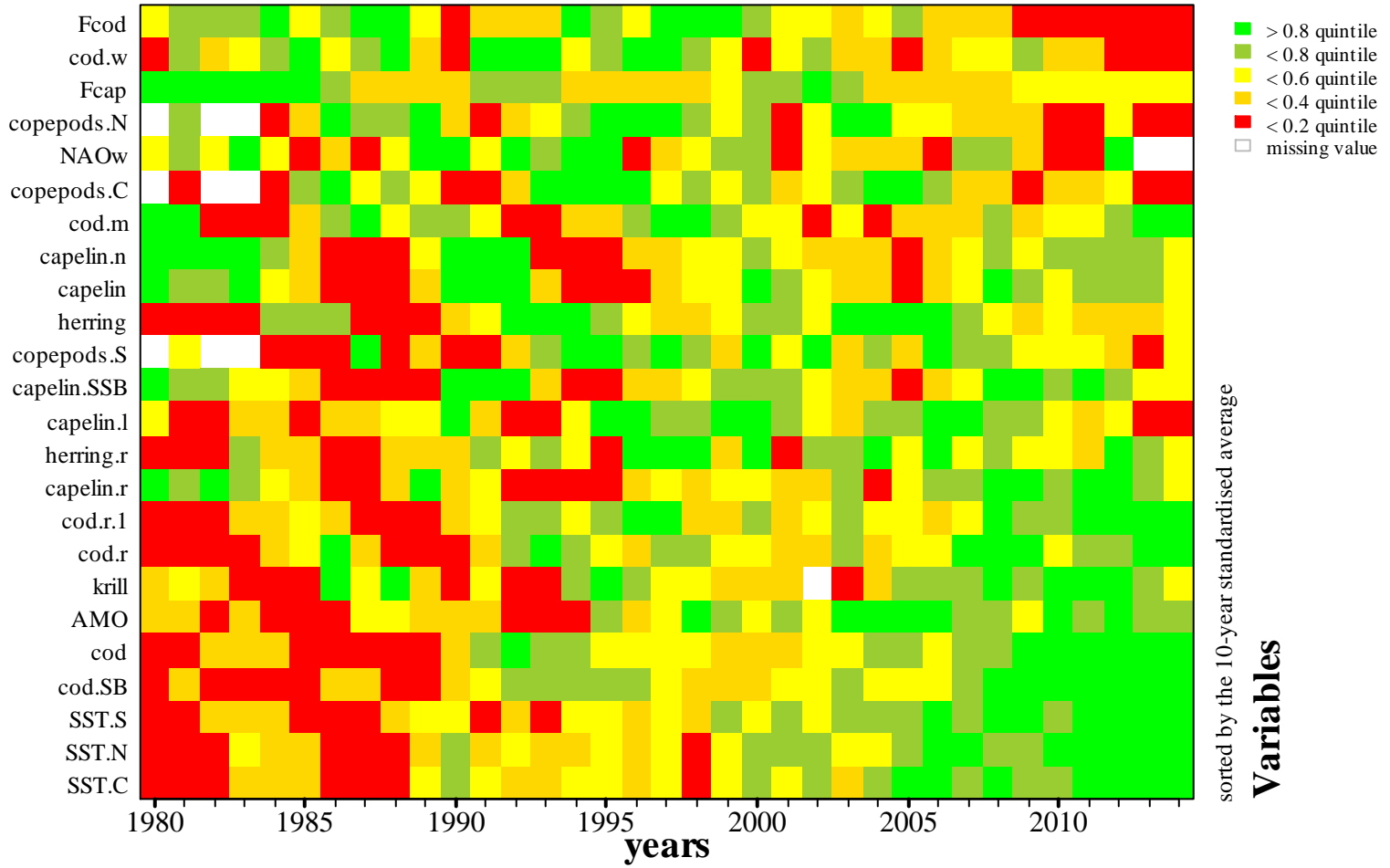
Paris Vasilakopoulos



[marcos.llope@ibv.uio.no](mailto:marcos.llope@ibv.uio.no)  
[marcos.llope@ieo.es](mailto:marcos.llope@ieo.es)



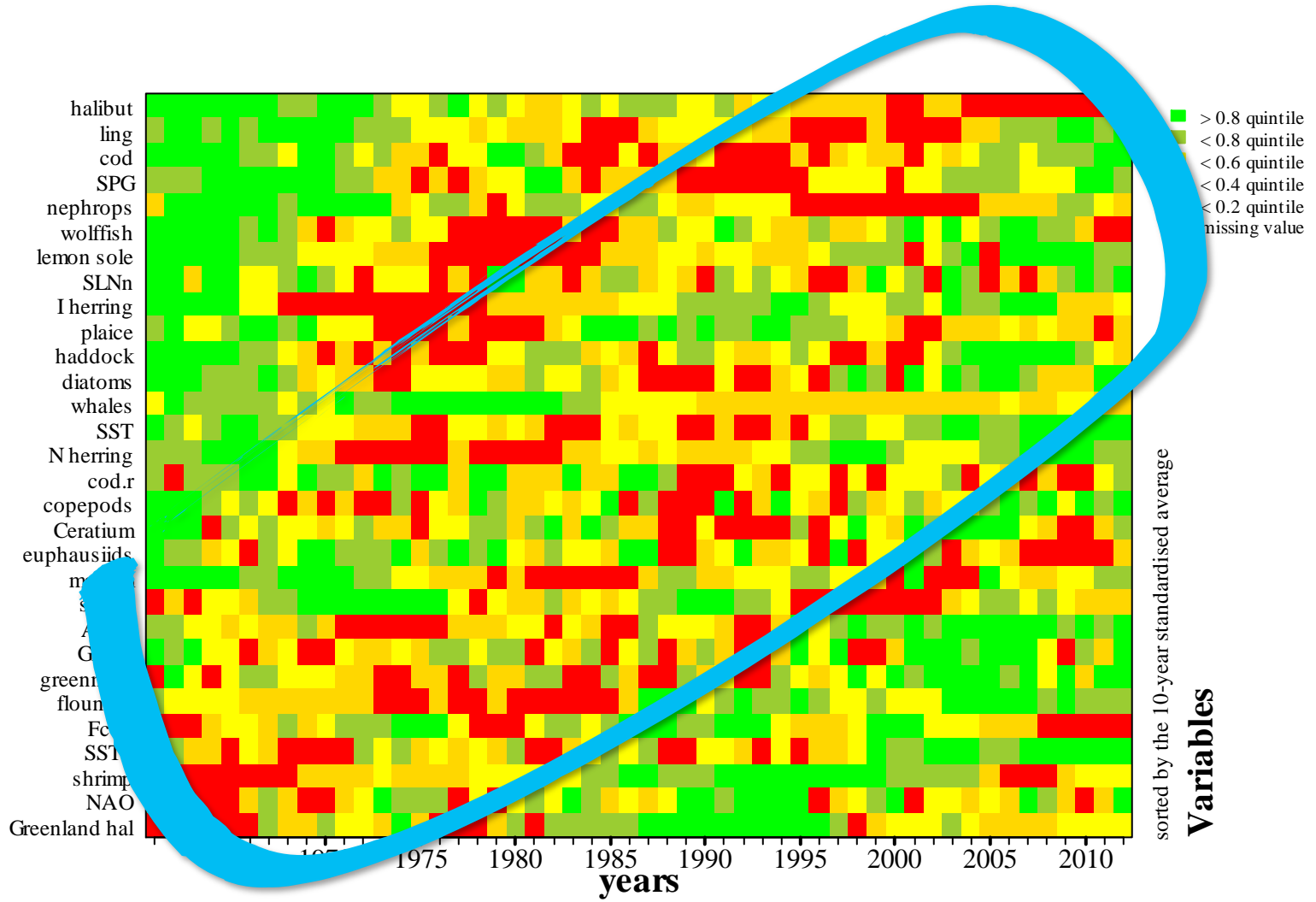
# BARENTS SEA | trafficlight plot





# ICELAND SEAS

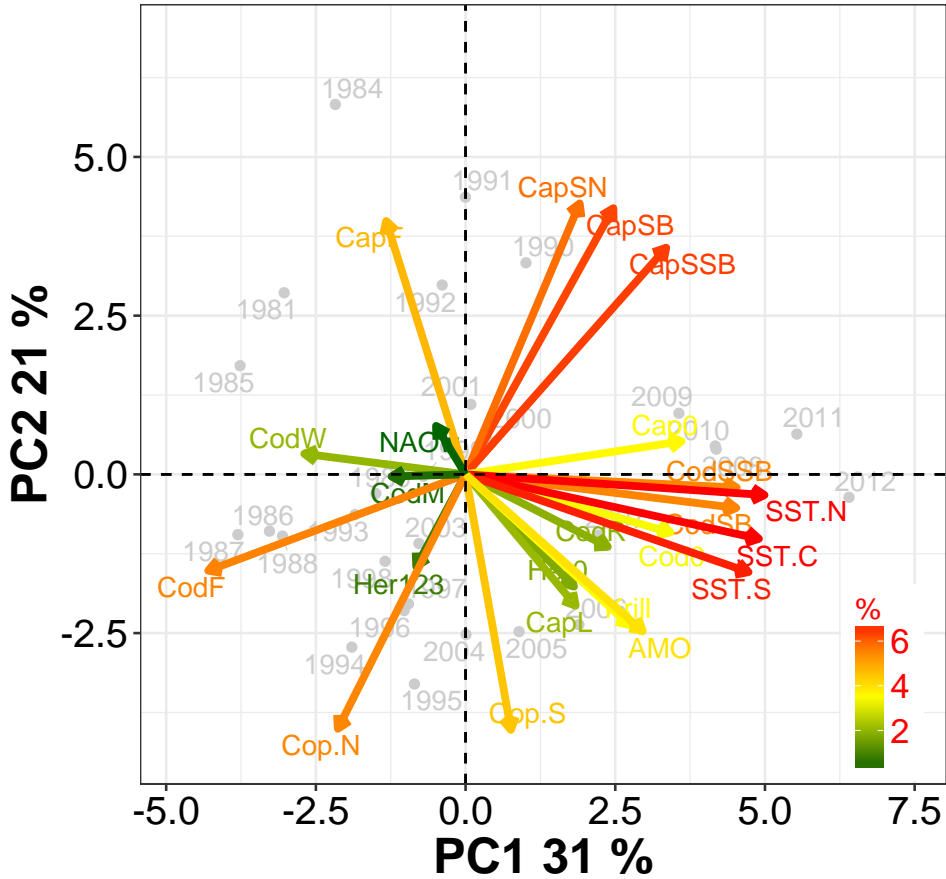
trafficlight  
plot





# BARENTS SEA | PC analysis

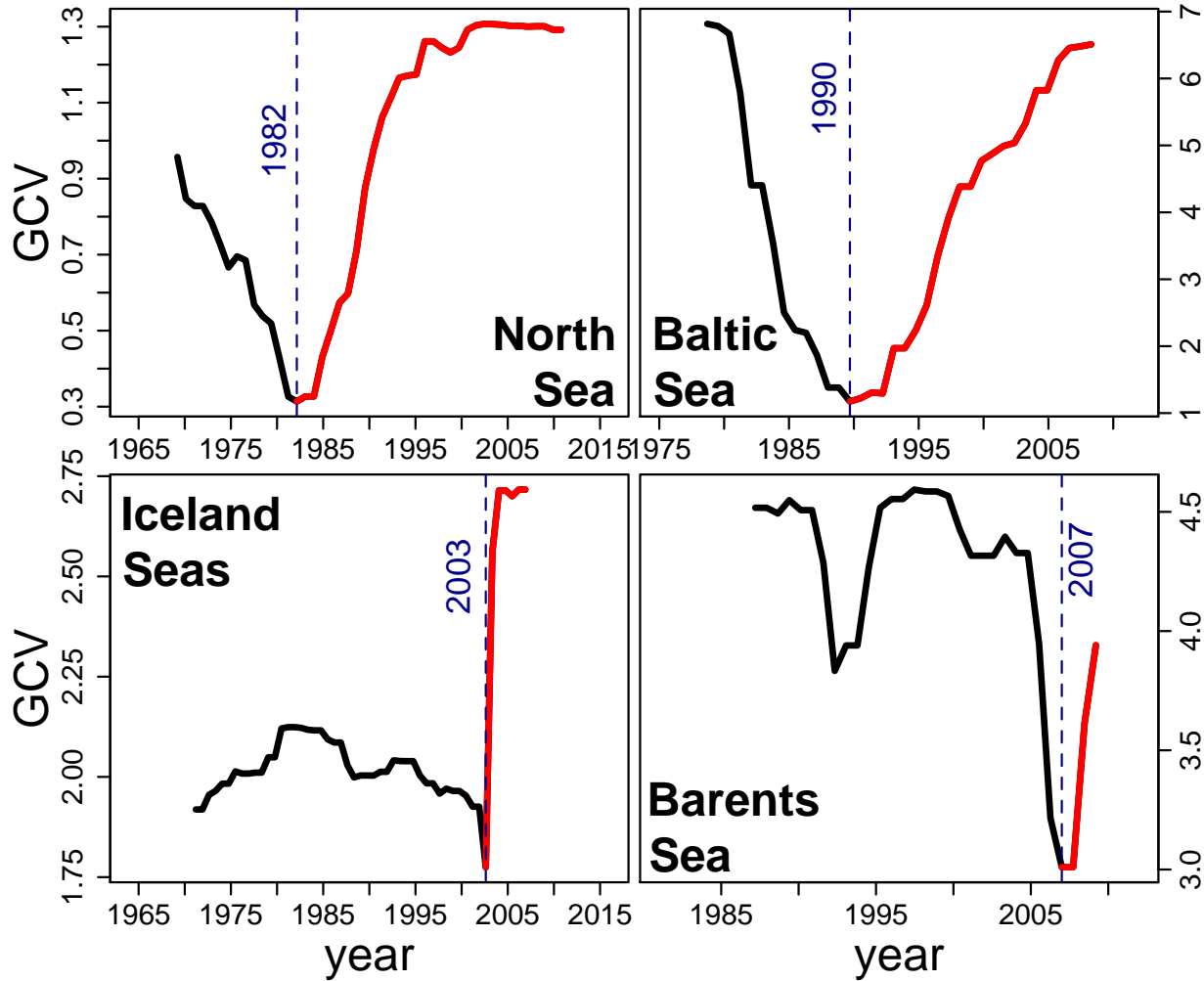
PCA biplot  
PC1 & PC2



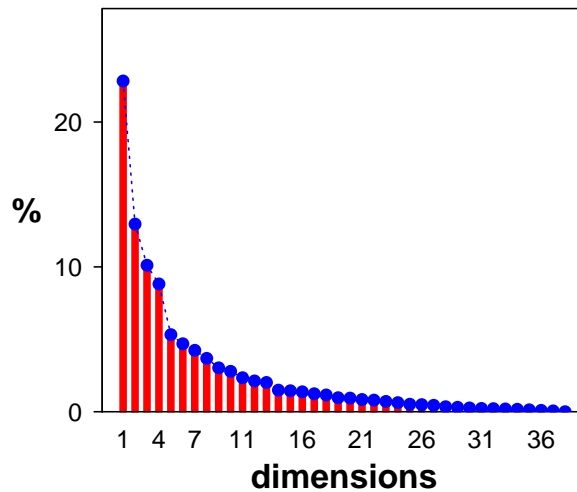


# THRESHOLD

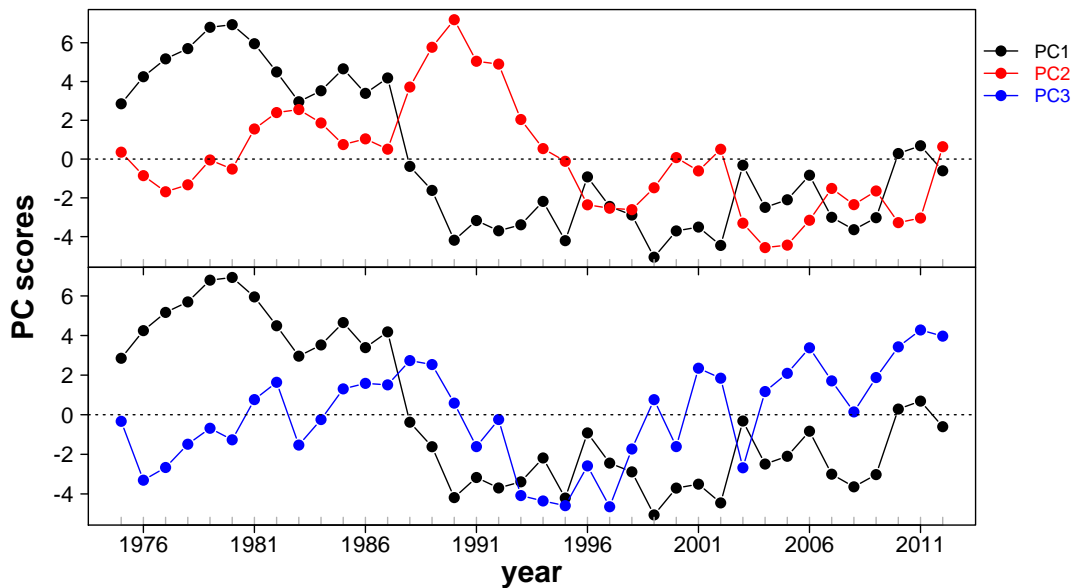
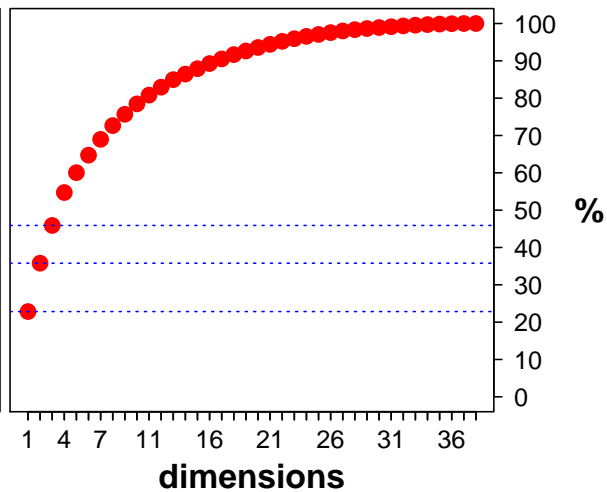
estimation  
tGAM



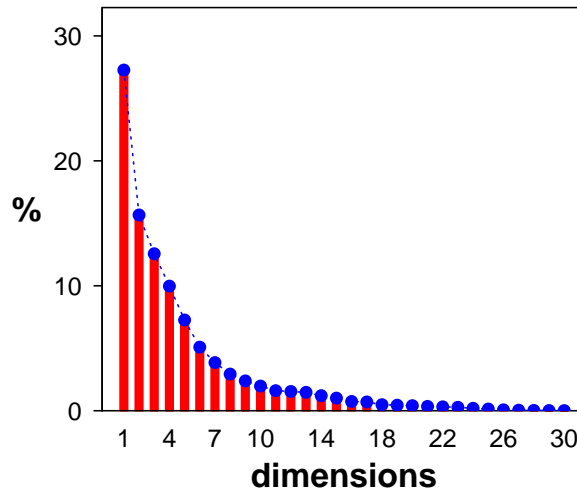
### variance percentage



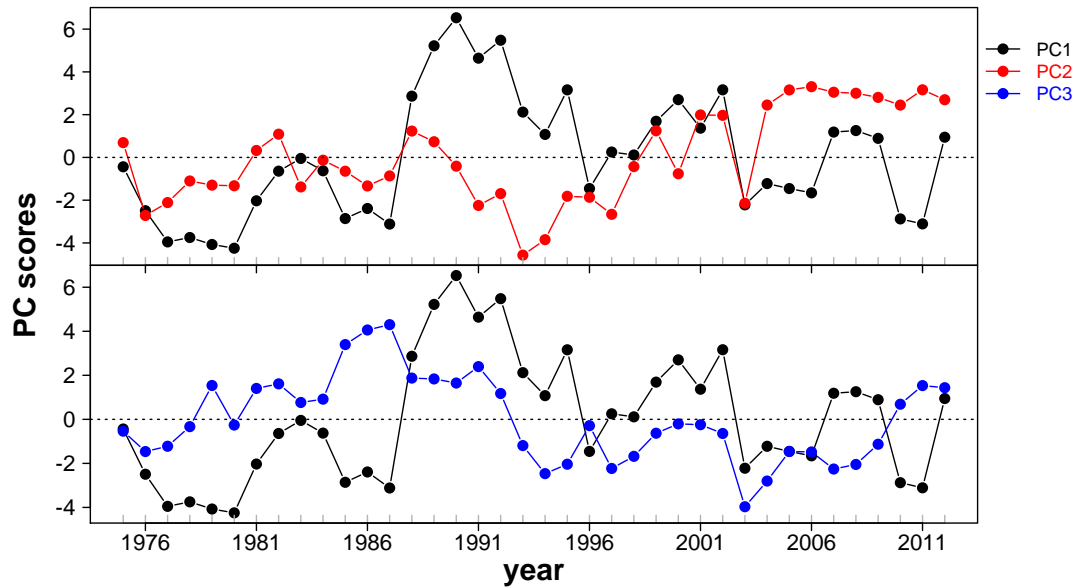
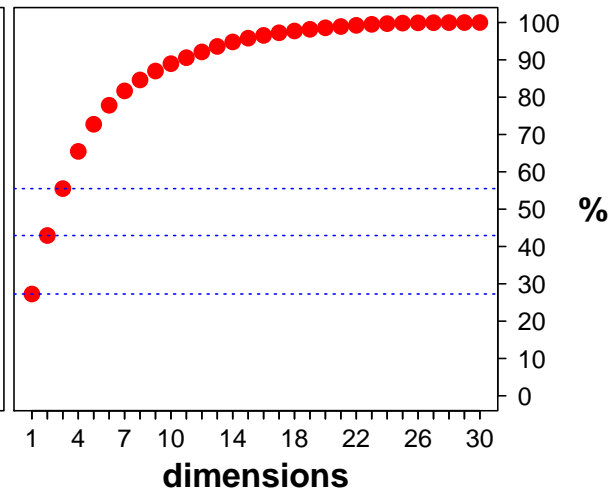
### cumulative variance



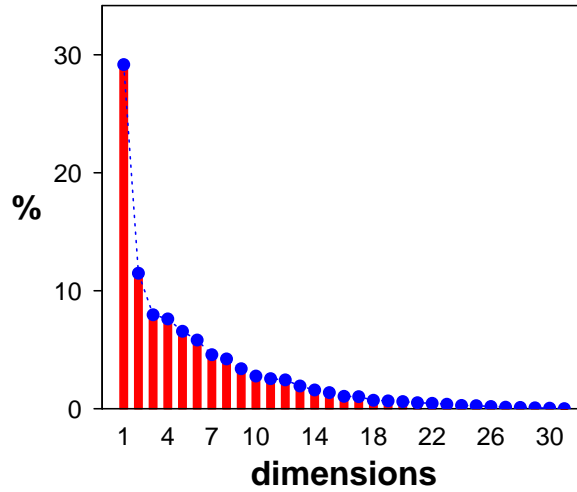
### variance percentage



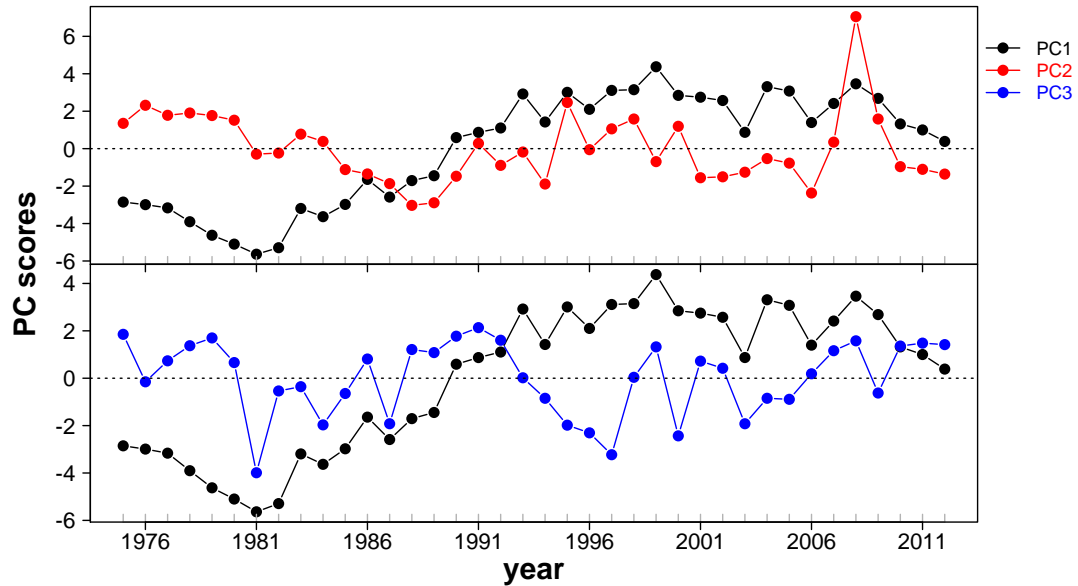
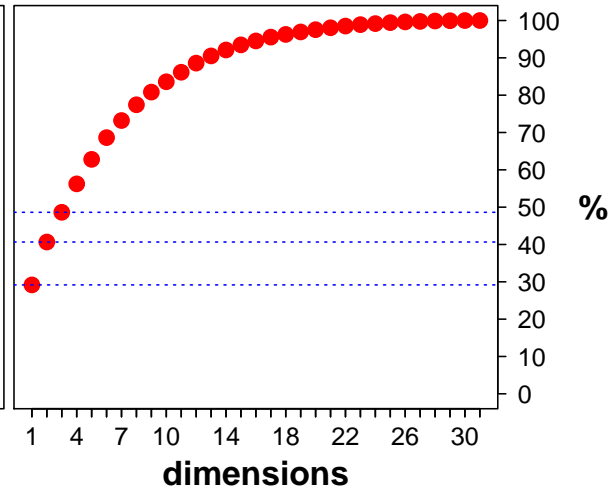
### cumulative variance



### variance percentage

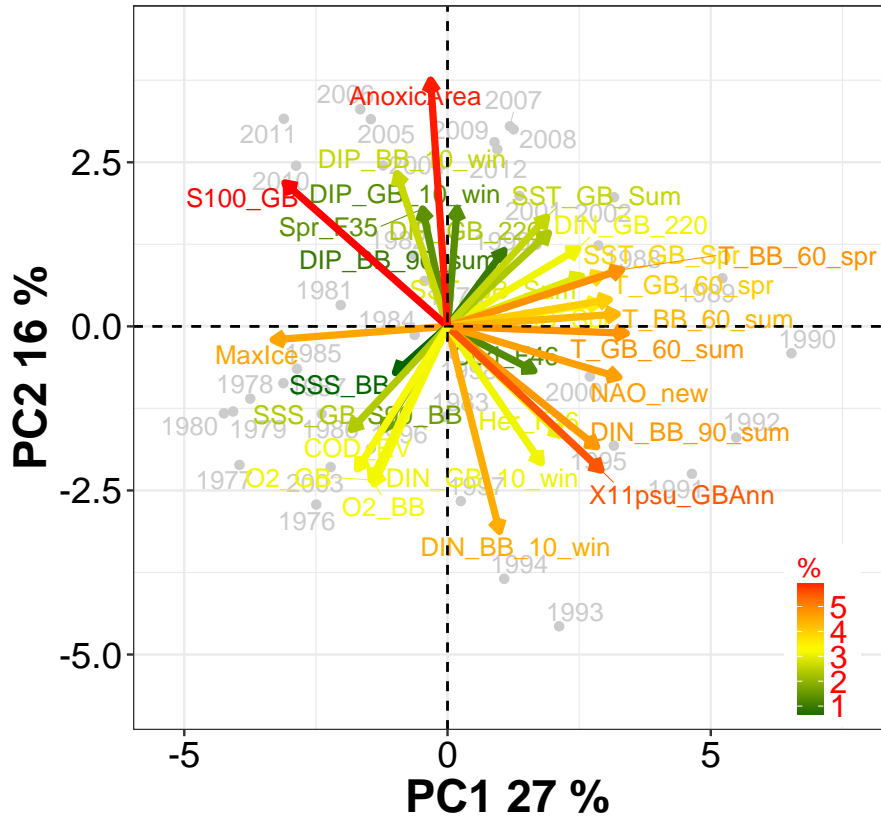


### cumulative variance



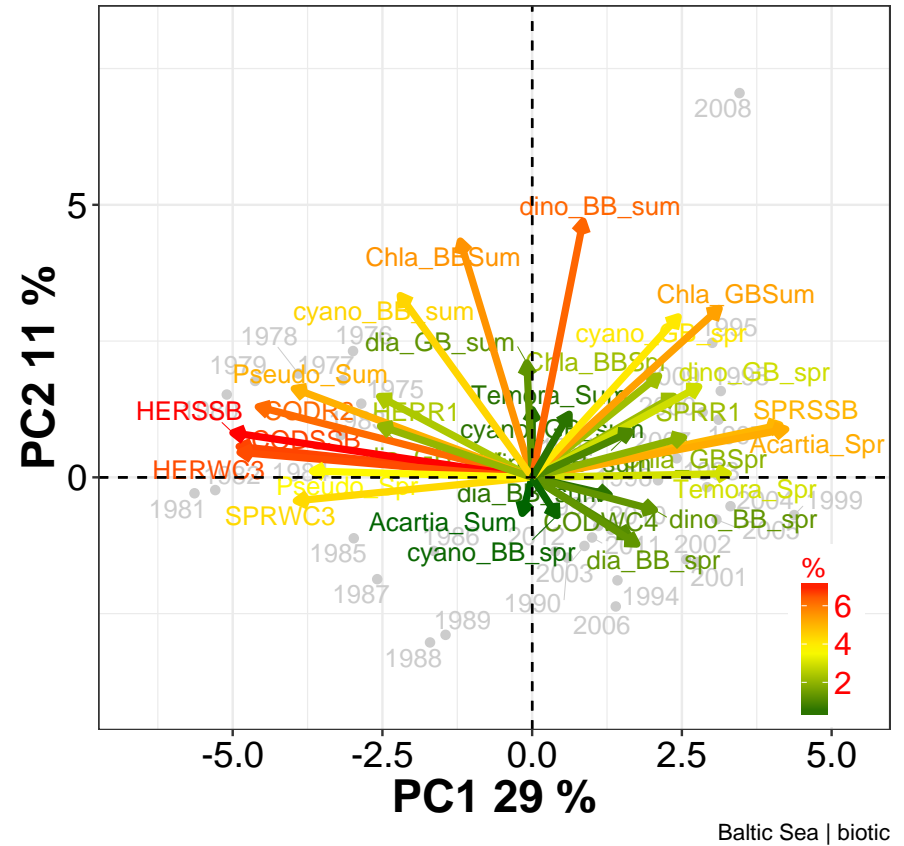
# BALTIC SEA | PCA biplot

PCA biplot  
PC1 & PC2



ABIOTIC

PCA biplot  
PC1 & PC2

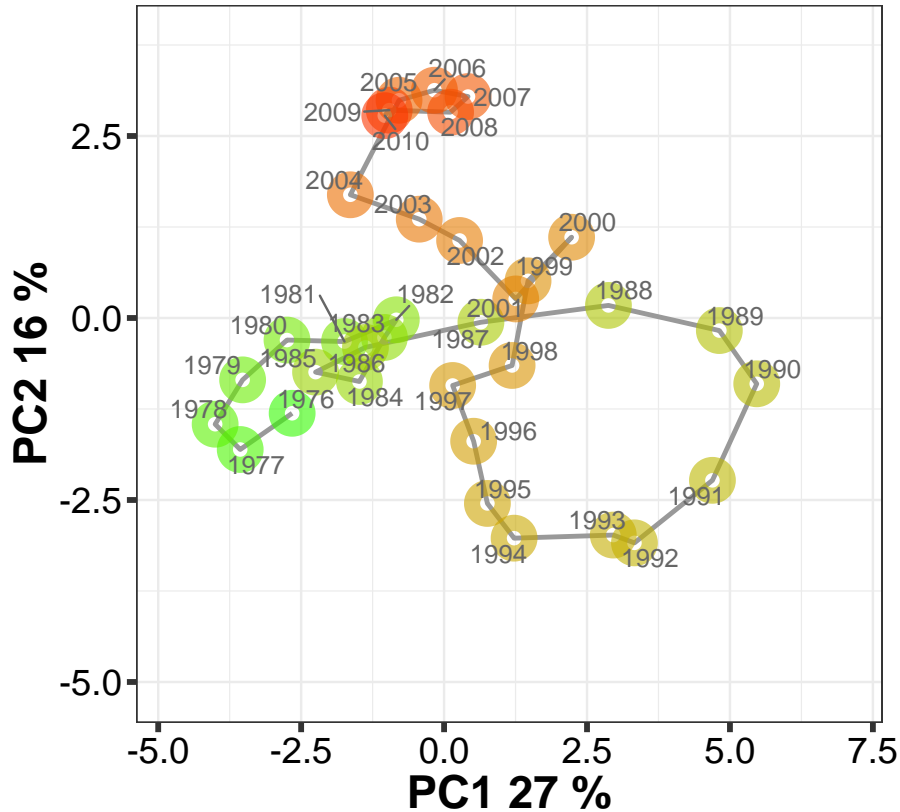


BIOTIC

# BALTIC SEA

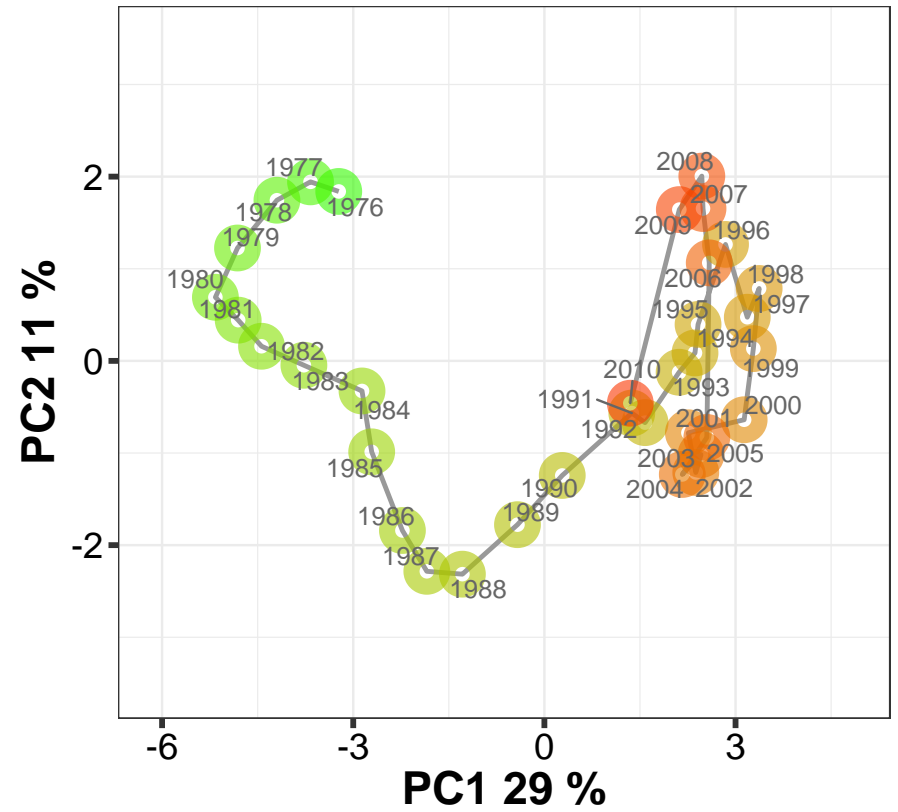
## PCA trajectories

PCA trajectory  
moving averages



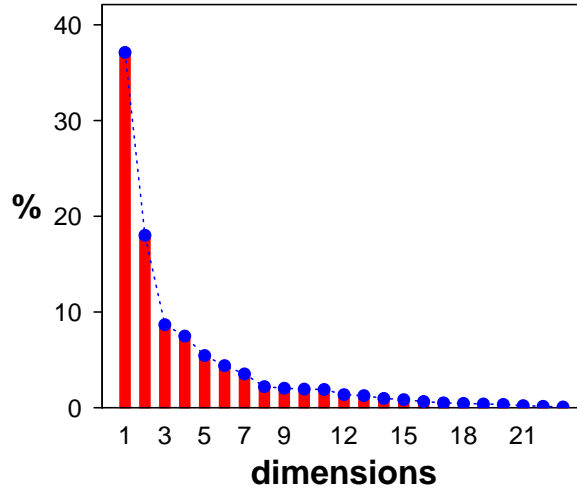
ABIOTIC

PCA trajectory  
moving averages

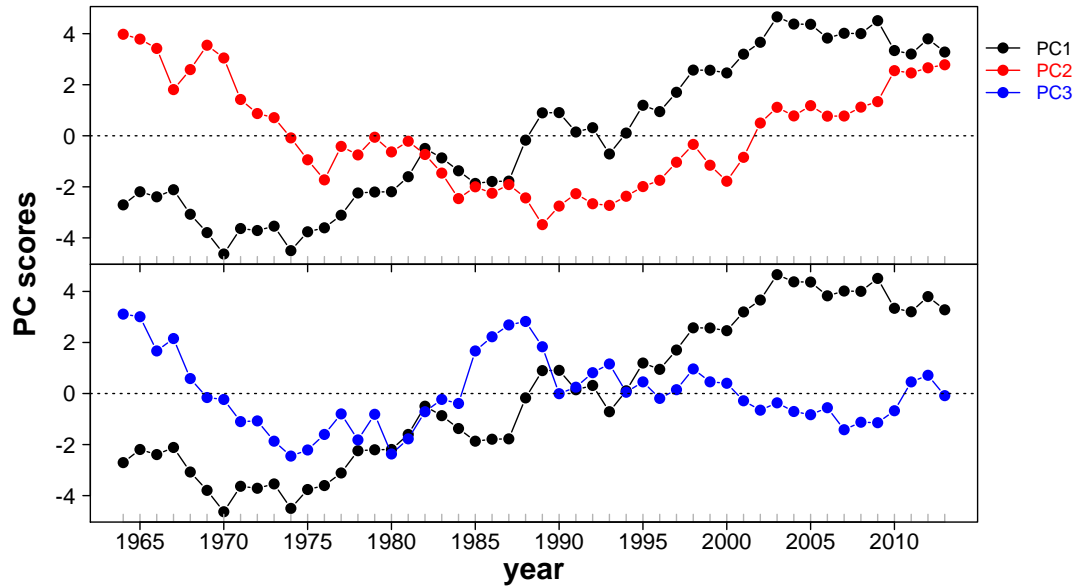
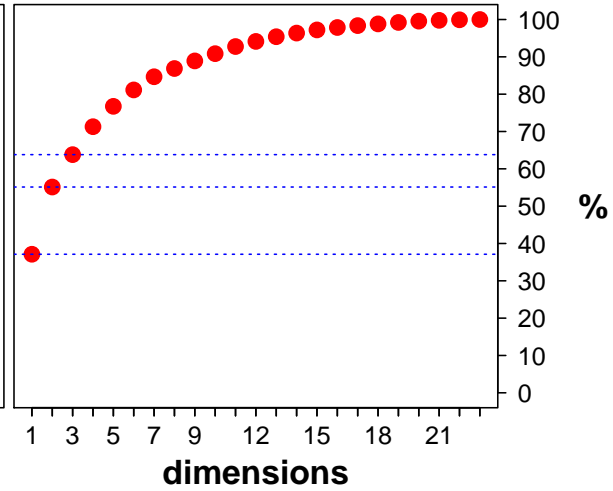


BIOTIC

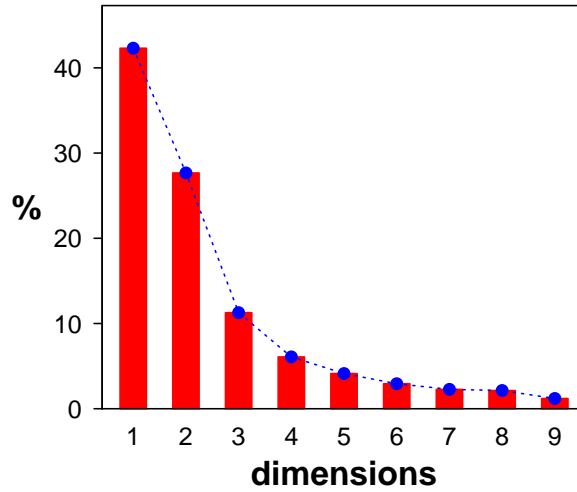
### variance percentage



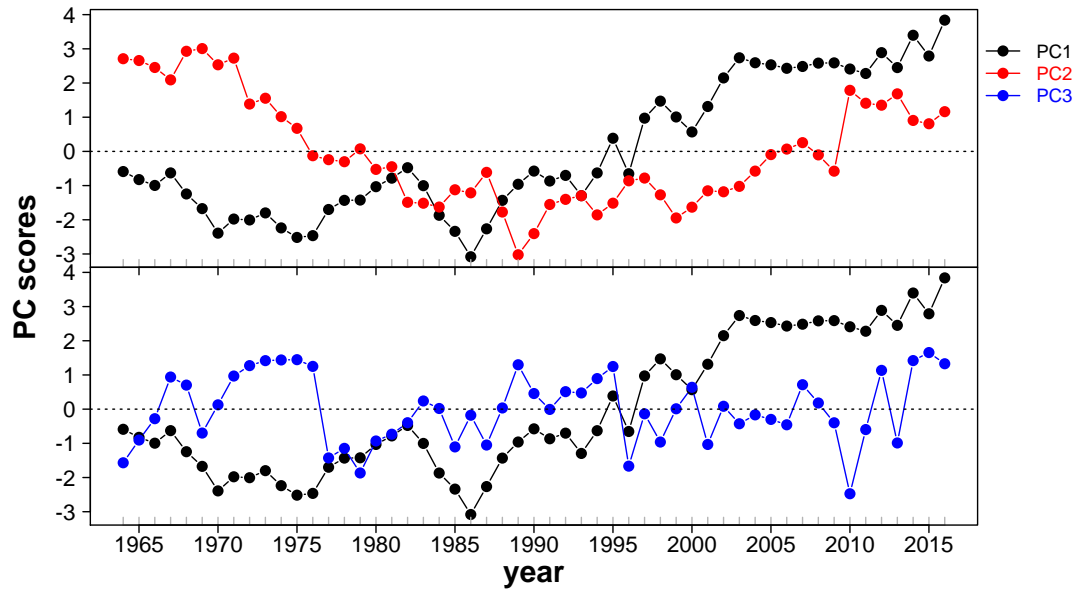
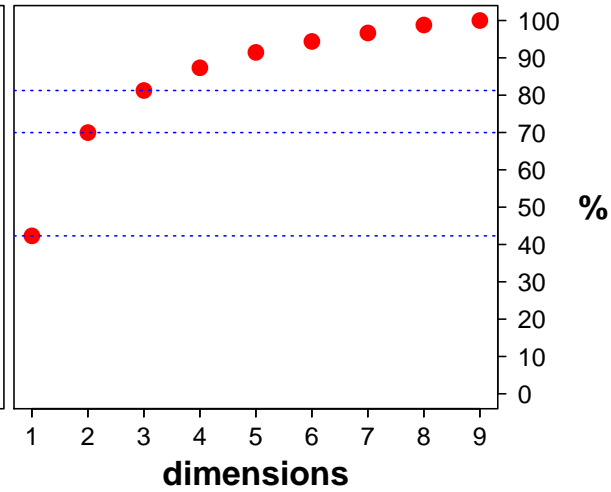
### cumulative variance



### variance percentage

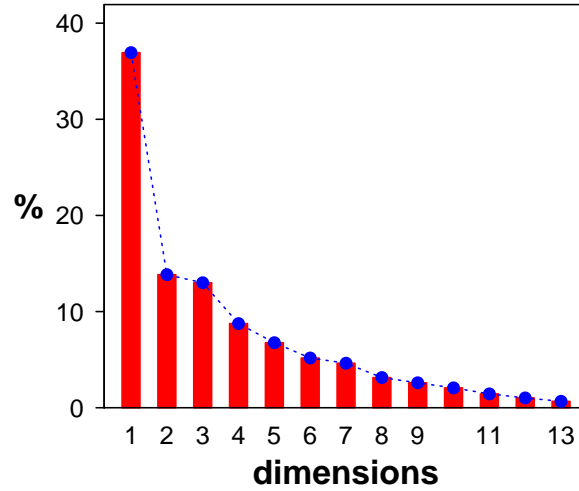


### cumulative variance

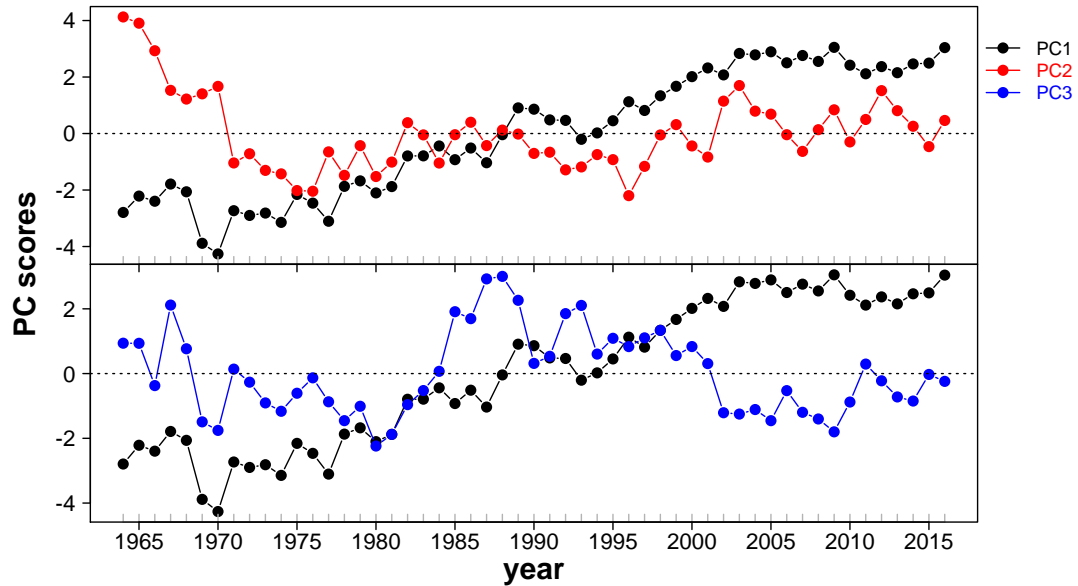
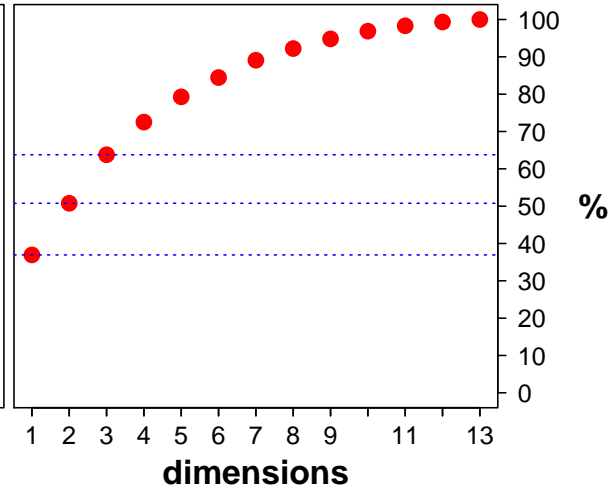




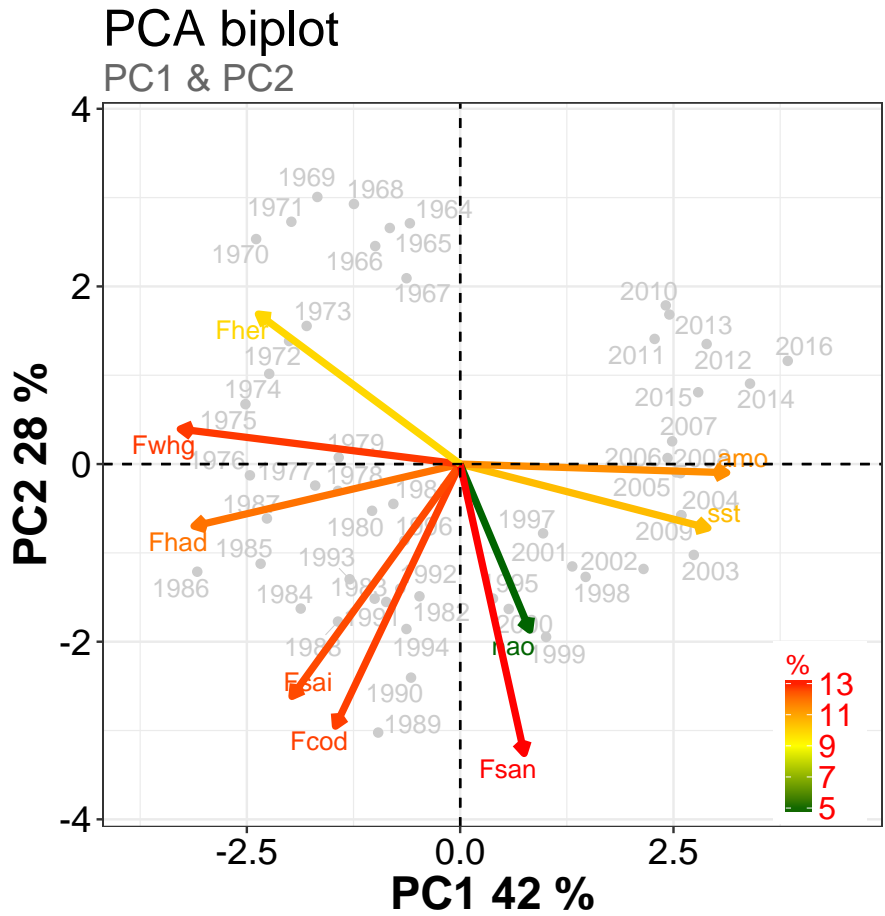
### variance percentage



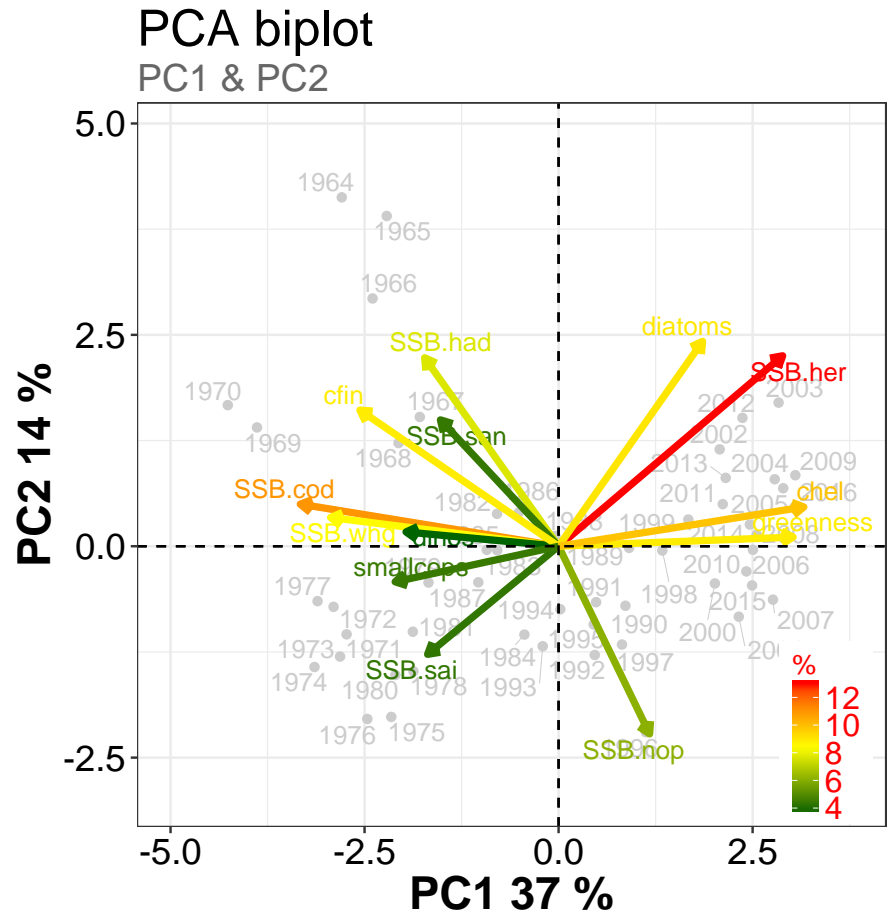
### cumulative variance



# NORTH SEA | PCA biplot



ABIOTIC

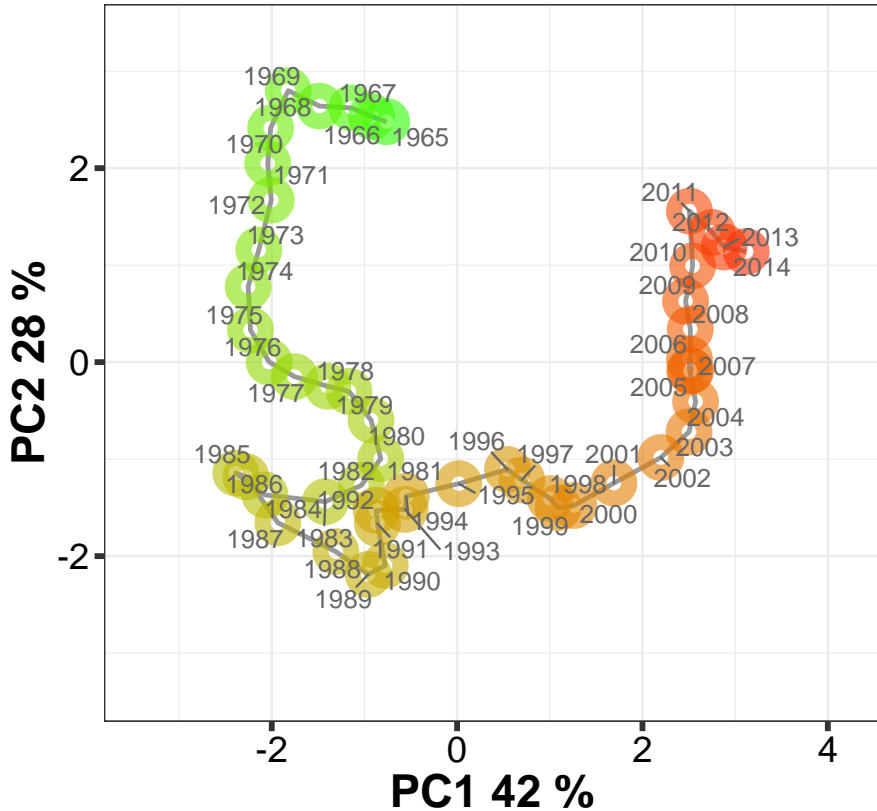


BIOTIC

# NORTH SEA

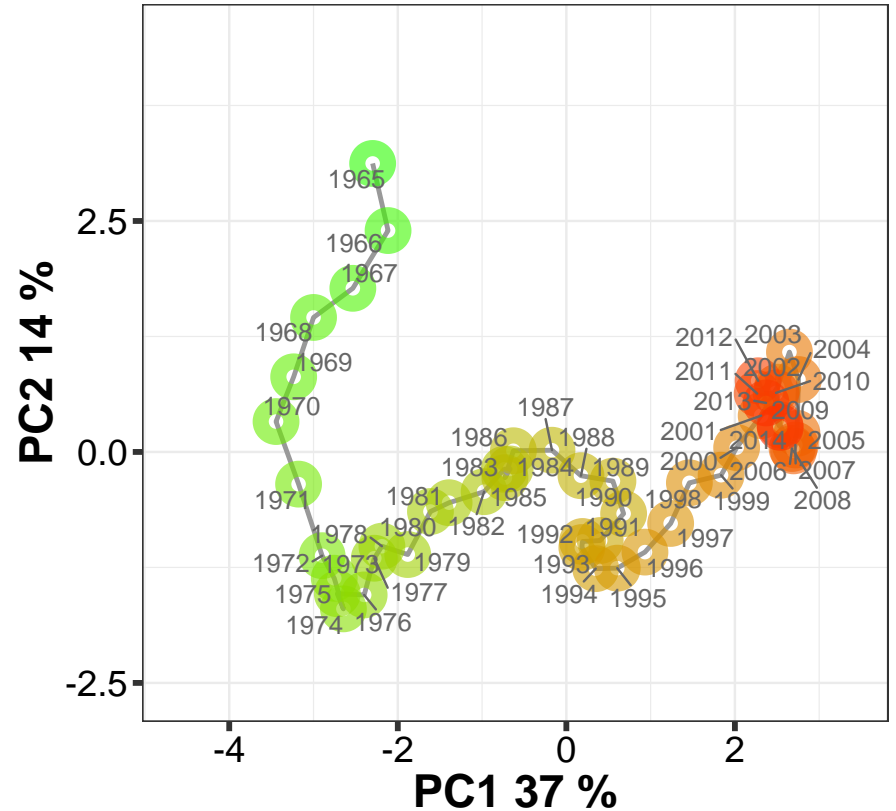
## PCA trajectories

PCA trajectory  
moving averages



ABIOTIC

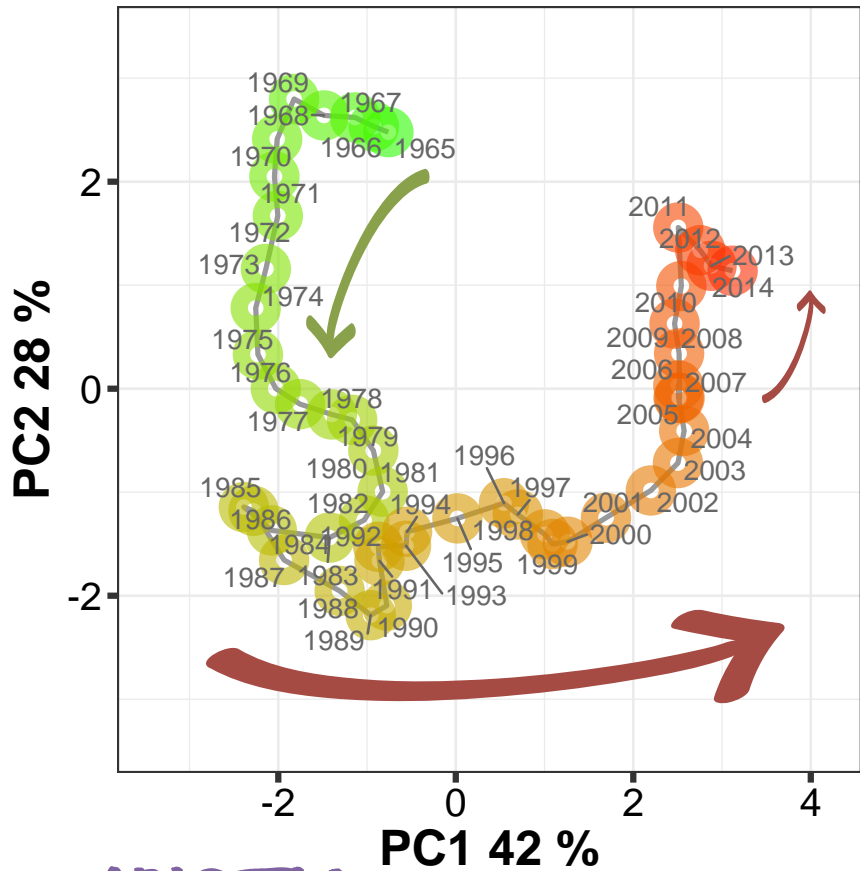
PCA trajectory  
moving averages



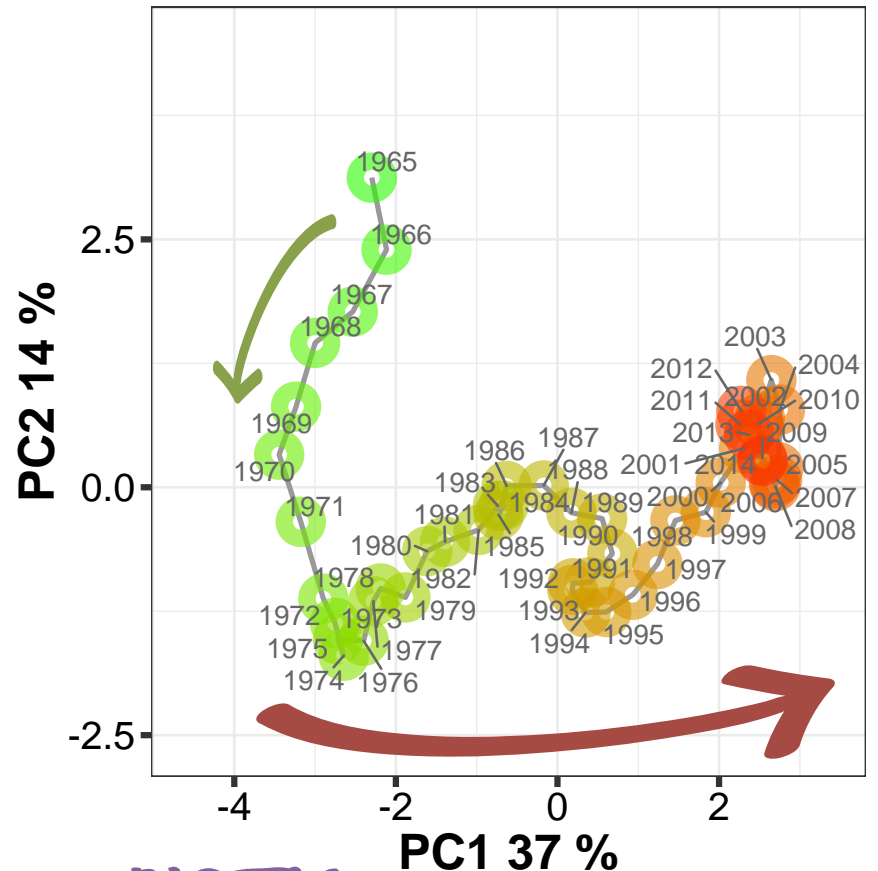
BIOTIC

# NORTH SEA | PC analysis

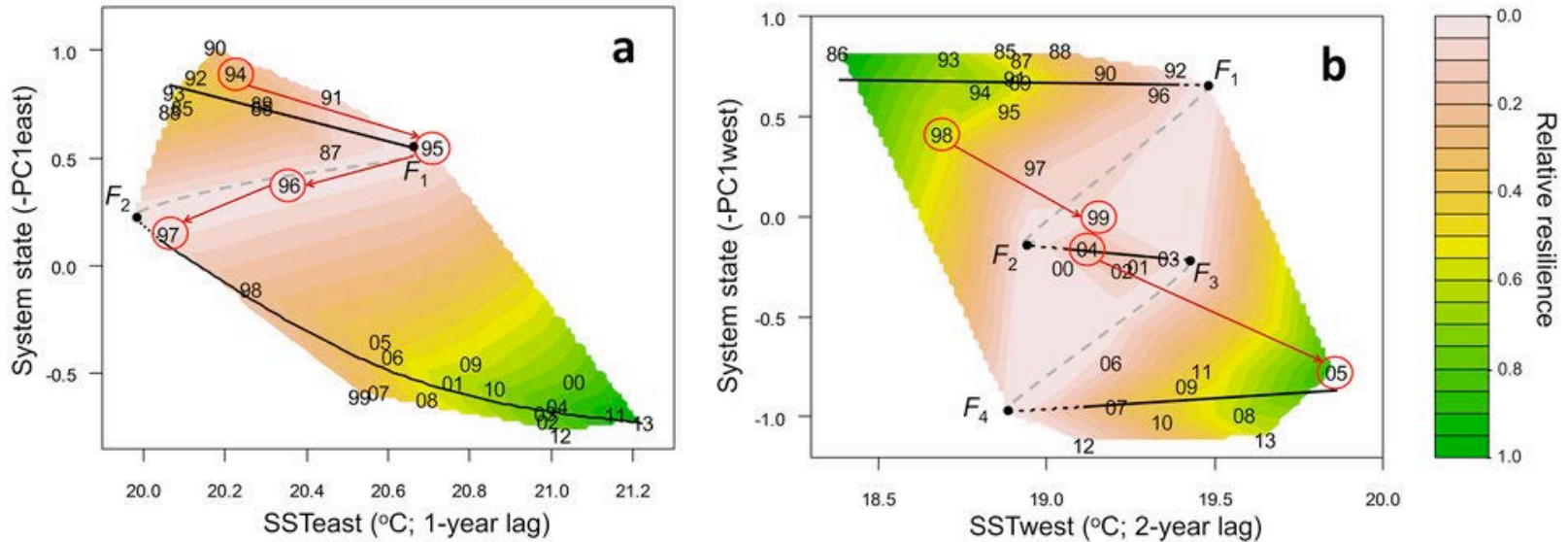
**trajectory**  
moving averages



**trajectory**  
moving averages

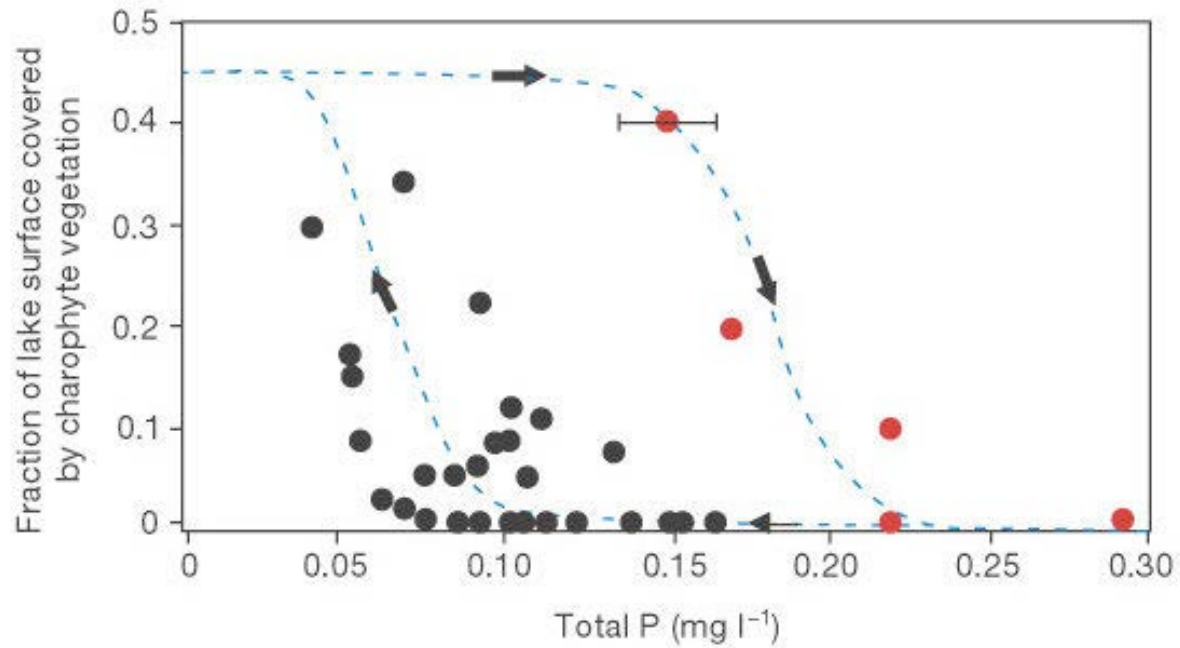


# QUANTIFYING RESILIENCE



and later on Mediterranean fish in what was coined ‘integrated resilience assessment’

# intro | PREVIOUS STUDIES



*Hysteresis have been seen in lakes*

A satellite-style map of the North Atlantic and Baltic regions. The map shows the Arctic Ocean at the top, the North Atlantic Ocean to the west, and the Baltic Sea to the east. Iceland is visible in the center-left. The British Isles and Scandinavia are shown in the lower half. Four red hand-drawn circles highlight specific areas: one around Iceland, one in the Barents Sea, one in the North Sea, and one in the Baltic Sea. The text labels for these areas are placed near their respective circles.

BARENTS  
SEA

SEAS OF  
ICELAND

NORTH  
SEA

BALTIC  
SEA

# 2

## data | cod differences

