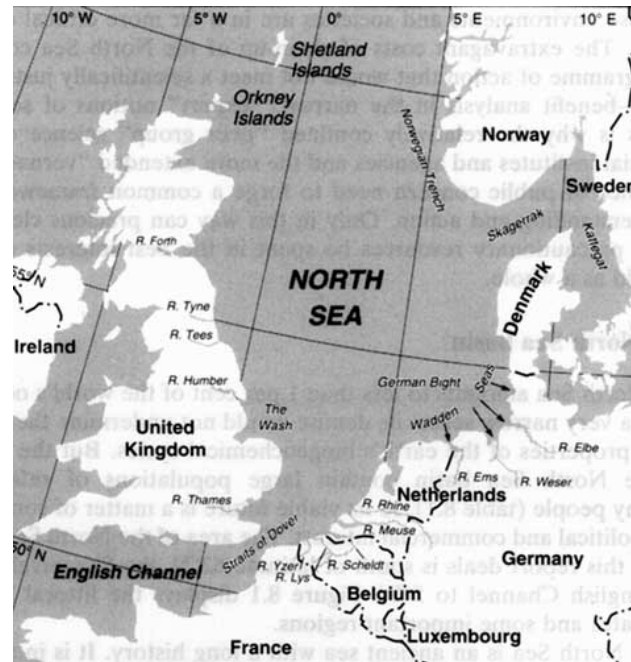


# Climate and anthropogenic effects on structure and functioning of the North Sea ecosystem

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Universität Hamburg

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Drivers of Change in the  
North Sea Ecosystem

# Methods & Analyses

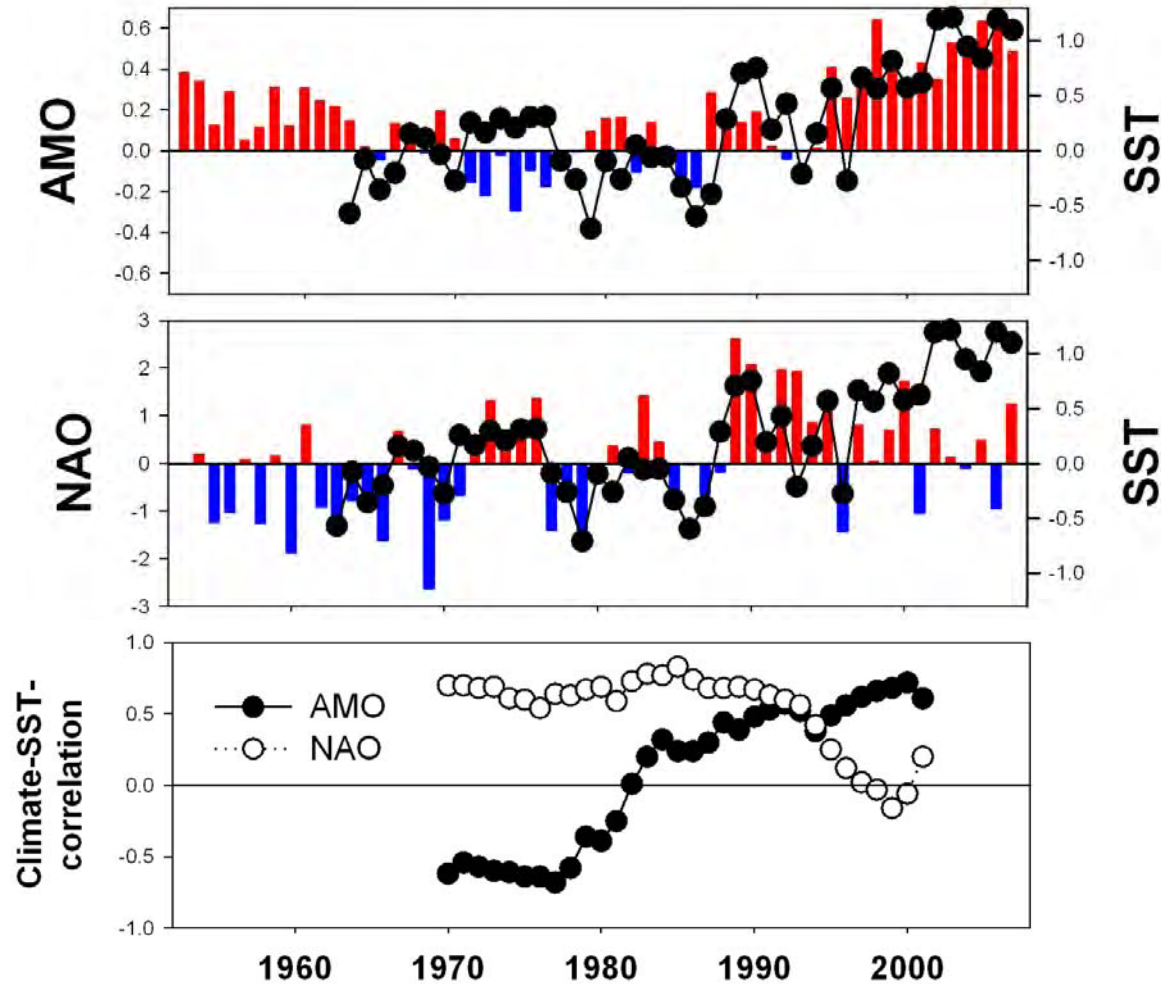
- **Generalized Additive Models (GAMs)**
  - **Non-Additive Threshold-GAMs (T-GAMs; Ciannelli et al. 2004)**
    - Finds periods with and without (or different functional) relationships & and a threshold
- 1. AMO & NAO effect on North Sea SST**
    - Additive models vs. non-additive (effect of NAO relative to AMO)
  - 2. AMO, NAO & SST effects on Trophic Levels**
    - Additive AMO- & NAO-models vs. SST-models
    - Non-additive vs. additive AMO- & NAO-models
  - 3. AMO & Fisheries effects on Trophic Levels**
    - Non-additive vs. additive AMO- & Fishing mortality-models

# Data

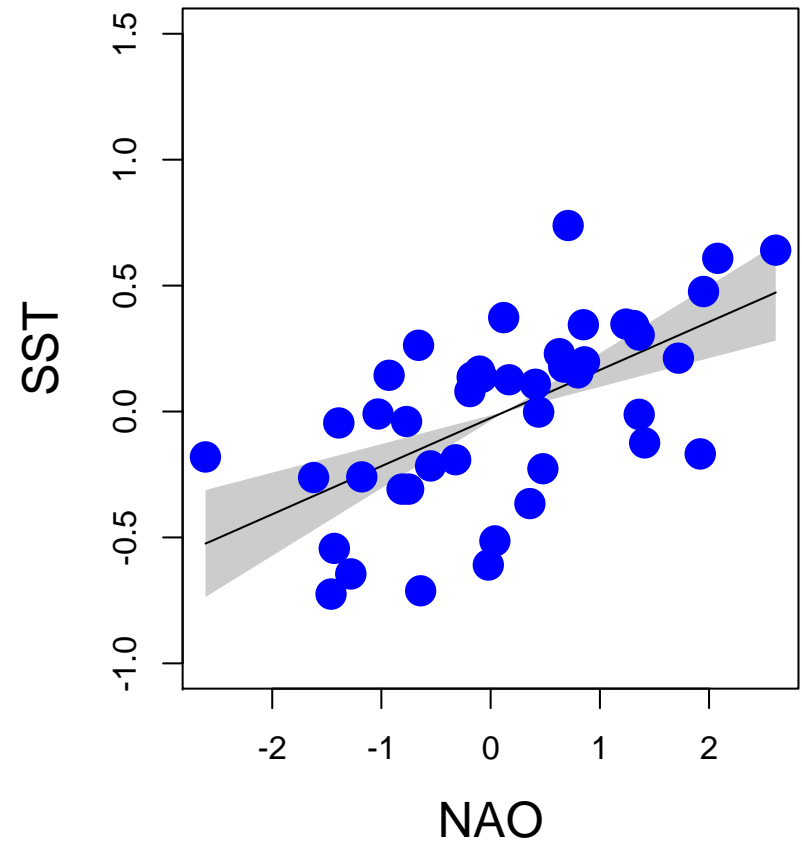
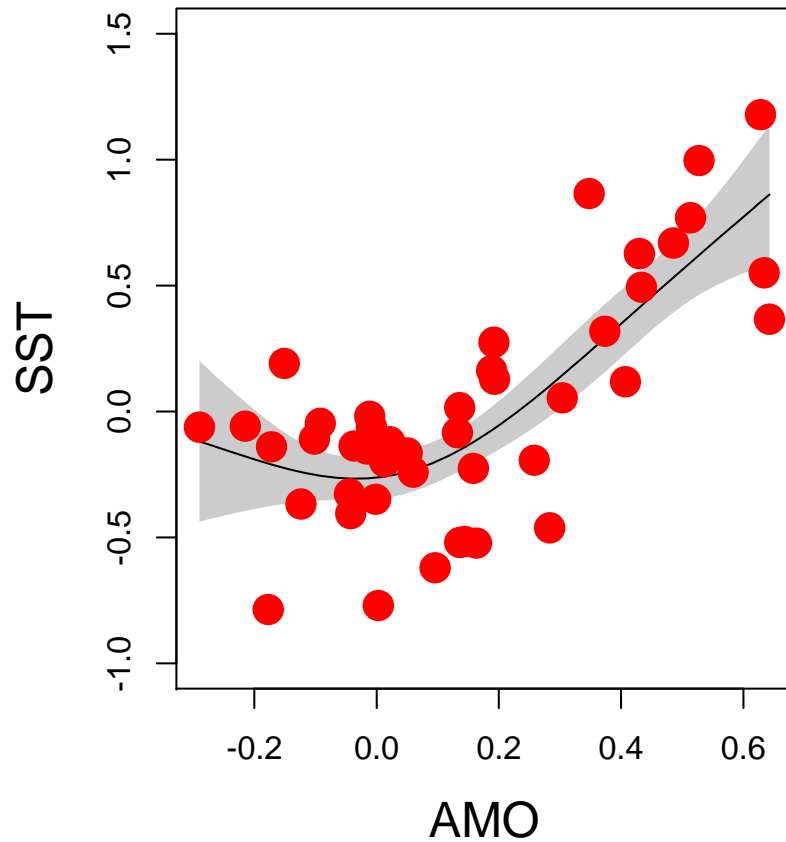
## Data (1963- 2007)

- Plankton – Continuous Plankton Recorder (SAHFOS)
- Fish – multispecies fisheries model output (SMS)
- Trophic Level Indicators
  - Phytoplankton: CPR „phytoplankton colour index“
  - Zooplankton: CPR „total copepods“
  - Planktivores: herring, sandeel, norway pout
  - Piscivores: Cod, haddock, saithe, whiting
- SST (Hadley 3), North Atlantic Oscillation (NAO), Atlantic Multidecadal Oscillation (AMO)

# 1 – Climate effect on North Sea SST



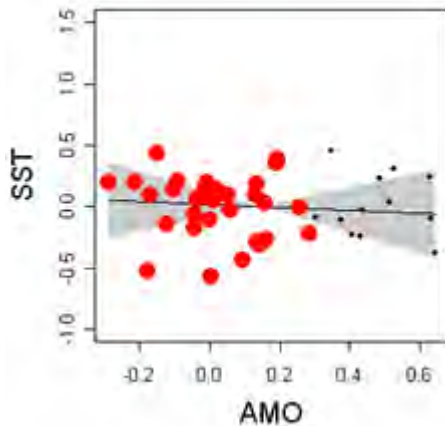
# Additive Climate-SST relationship



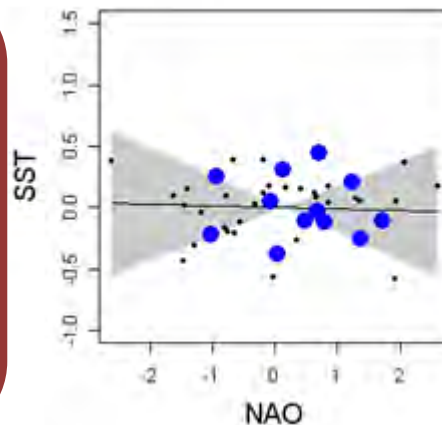
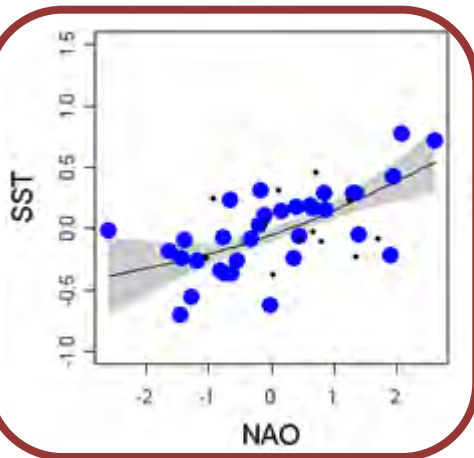
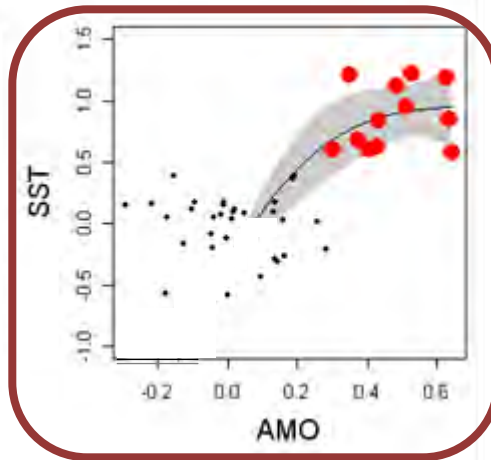
Generalized Additive Model (GAM):  $r^2 = 0.663$ ; both predictors  $p < 0.001$

# Non-Additive Climate-SST relationship

AMO low ( $\leq r$ )



AMO high ( $> r$ )



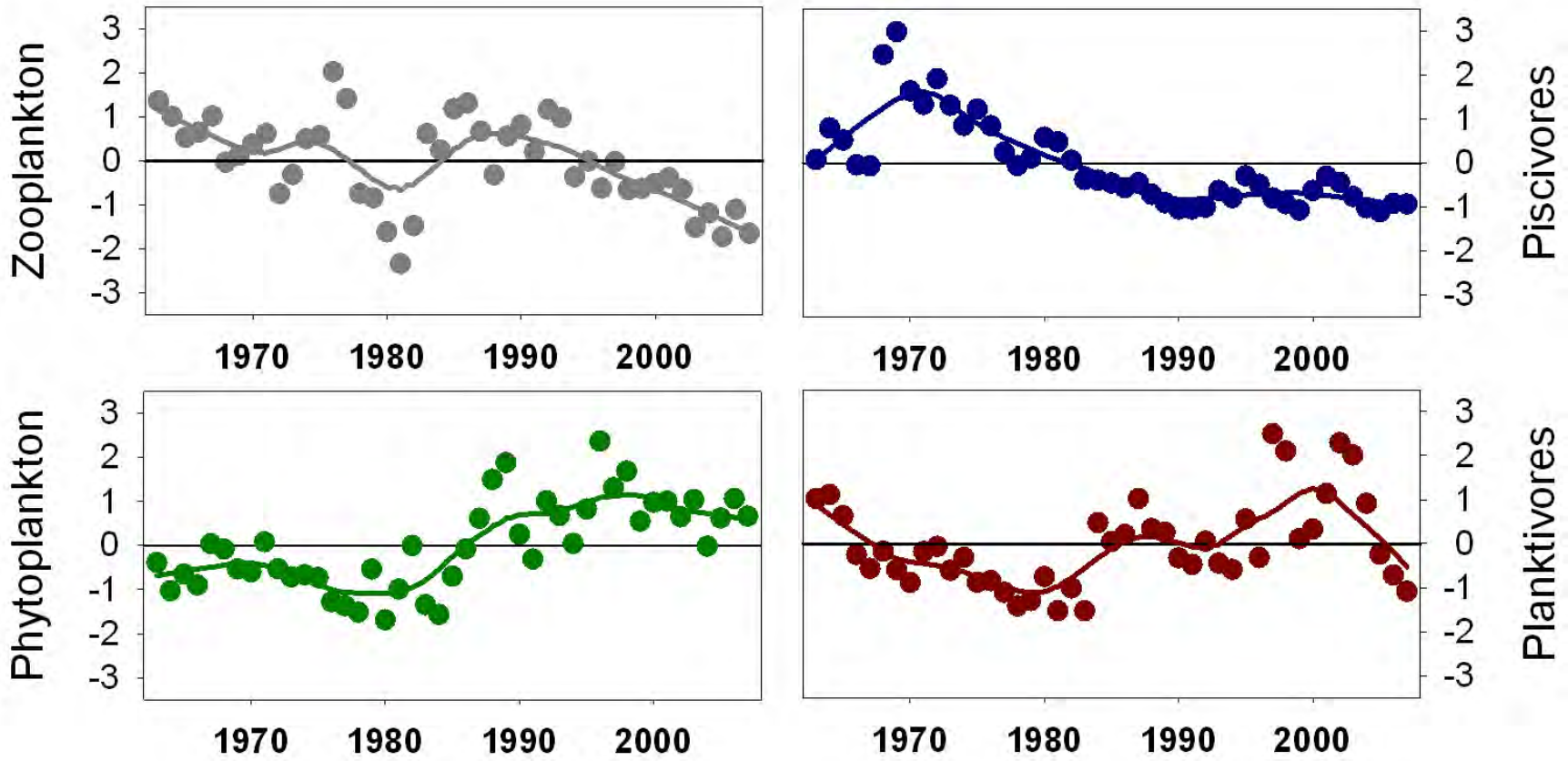
Threshold Generalized Additive Model (TGAM):  $r^2 = 0.723$

Predictor	AMO-state	P - values
AMO	low	0.733
<b>AMO</b>	<b>high</b>	<b>&lt; 0.001</b>
<b>NAO</b>	<b>low</b>	<b>&lt; 0.001</b>
NAO	high	0.904

## Conclusions

- TGAM „better“ than GAM
- AMO has significant effect when in a „high state“
- NAO has ONLY a significant effect when AMO is low !**

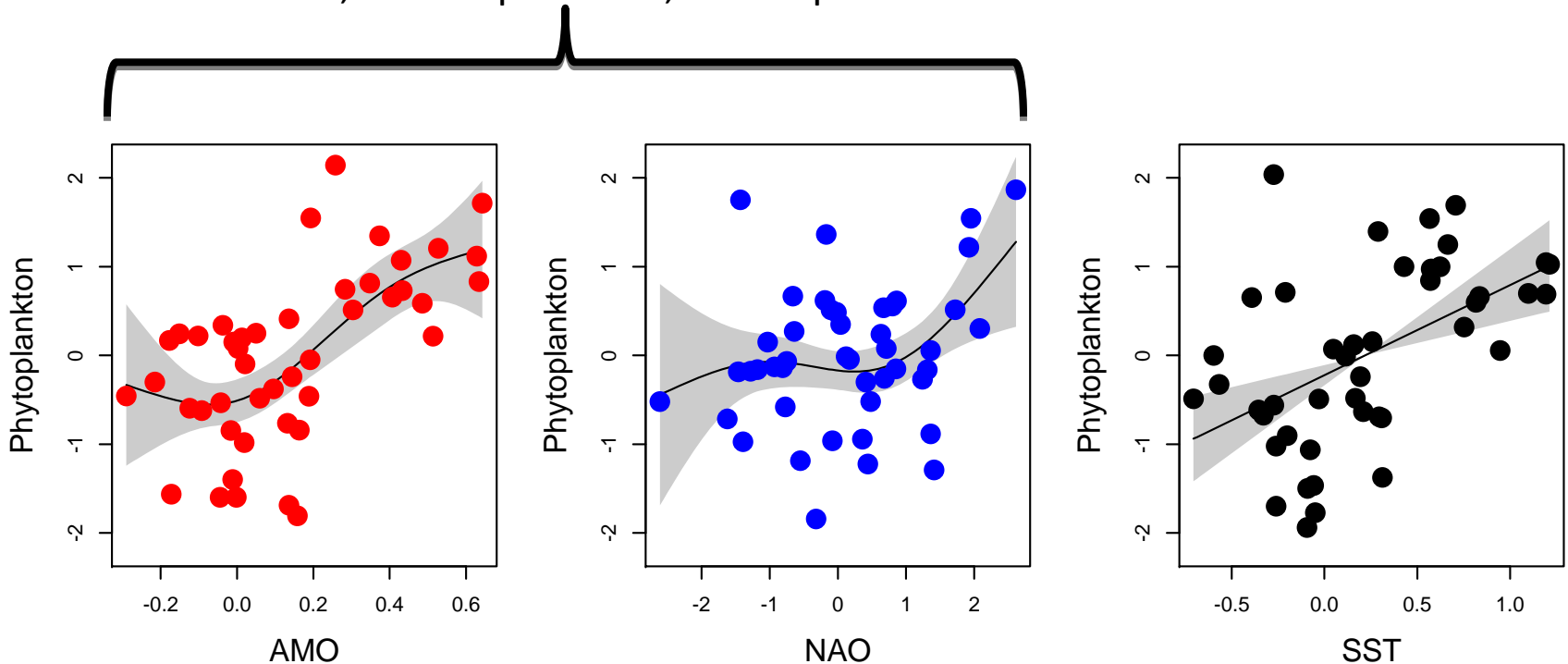
## 2 – Climate/SST effect on North Sea ecosystem



# Phytoplankton vs. Climate – Additive

Generalized Additive Model (GAM):

$r^2 = 0.404$ ; AMO –  $p < 0.001$ ; NAO –  $p < 0.05$



Univariate Model:

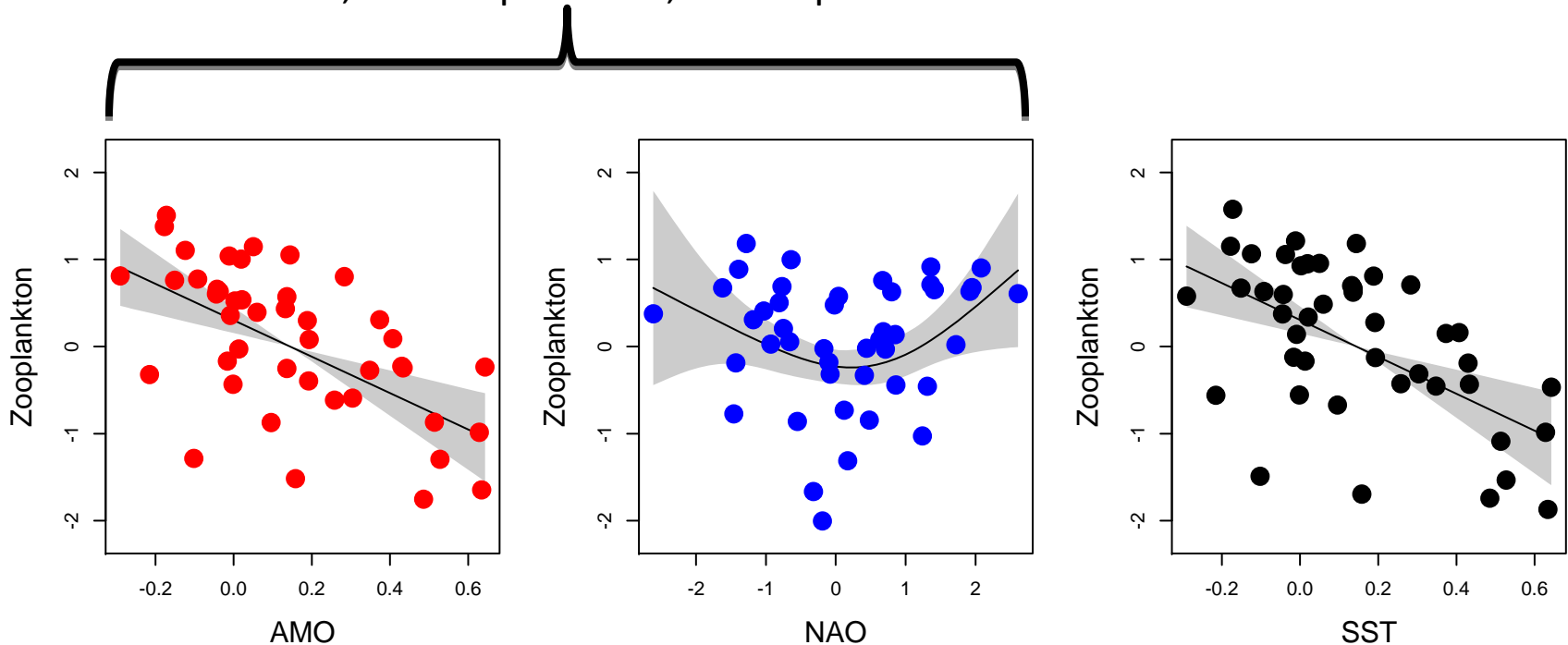
$r^2 = 0.246$ ;  $p < 0.001$



# Zooplankton vs. Climate – Additive

Generalized Additive Model (GAM):

$r^2 = 0.332$ ; AMO –  $p < 0.001$ ; NAO –  $p > 0.05$

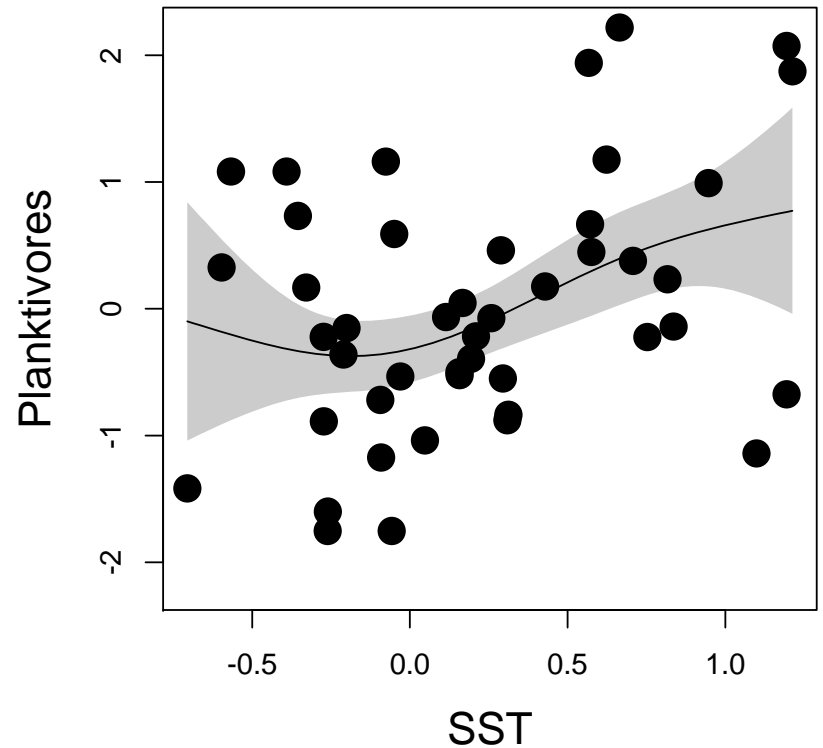
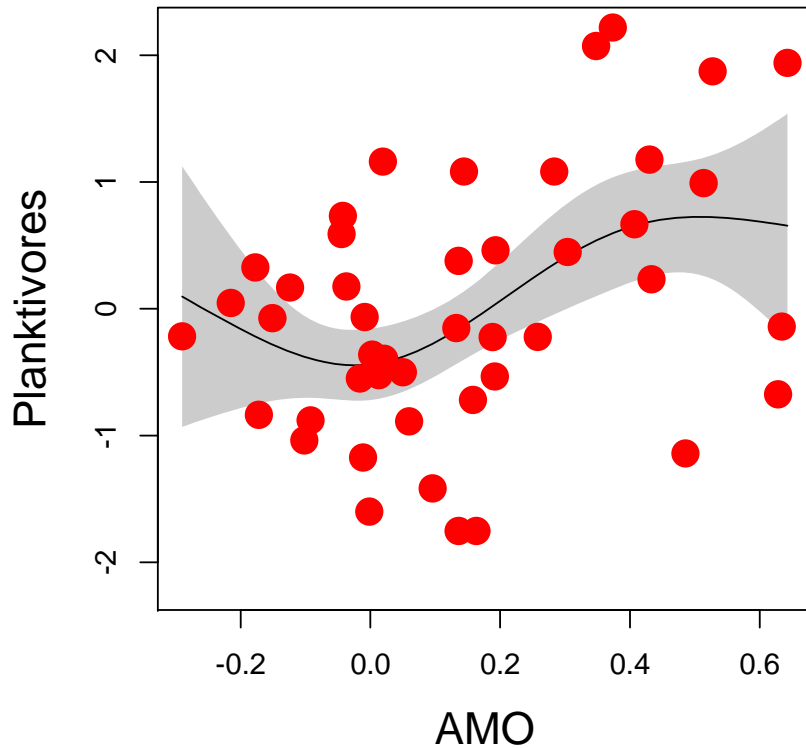


Univariate Model:  
 $r^2 = 0.144$ ;  $p < 0.05$

# Planktivores vs. Climate – Additive

Generalized Additive Model (GAM):

$r^2 = 0.177$ ; AMO –  $p < 0.02$



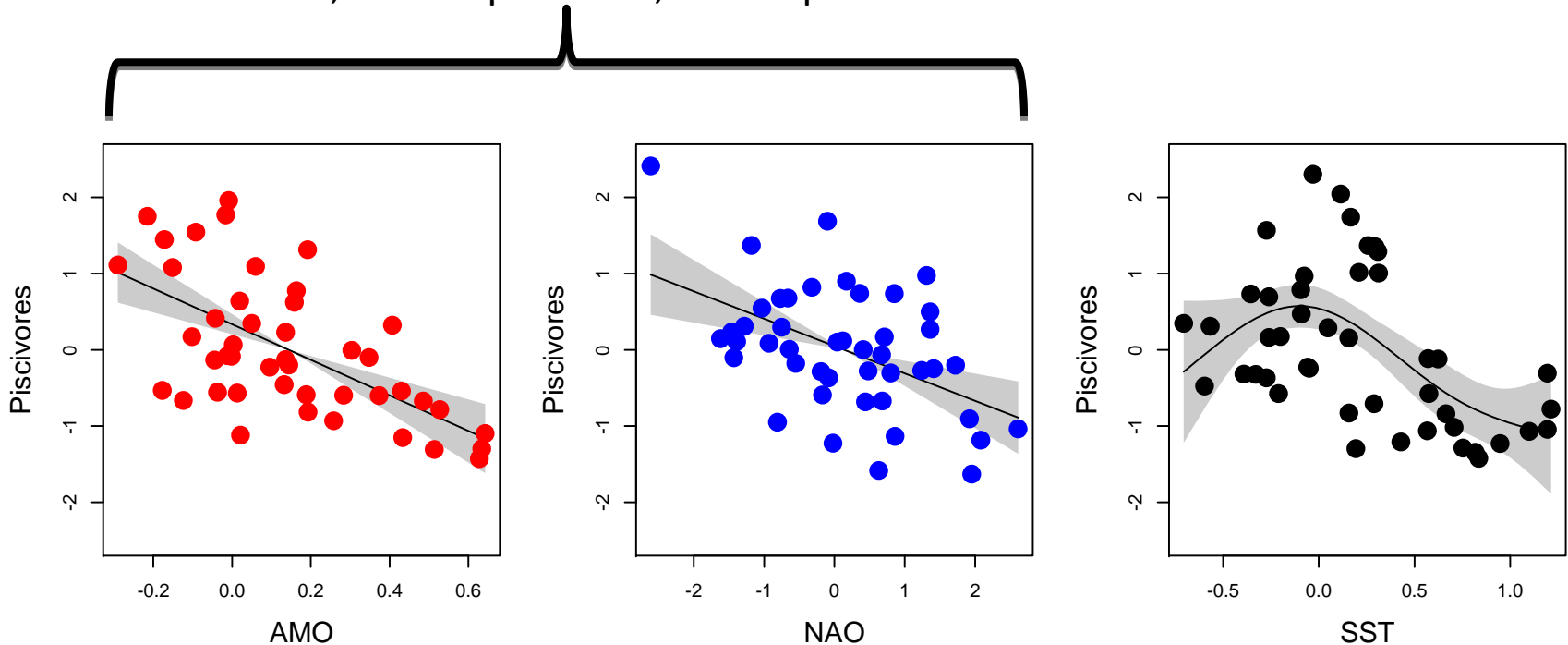
Generalized Additive Model (GAM):

$r^2 = 0.133$ ; SST –  $p < 0.05$

# Piscivores vs. Climate – Additive

Generalized Additive Model (GAM):

$r^2 = 0.465$ ; AMO –  $p < 0.001$ ; NAO –  $p < 0.001$

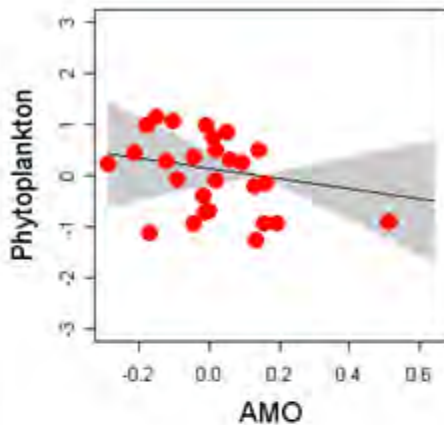


Univariate Model:

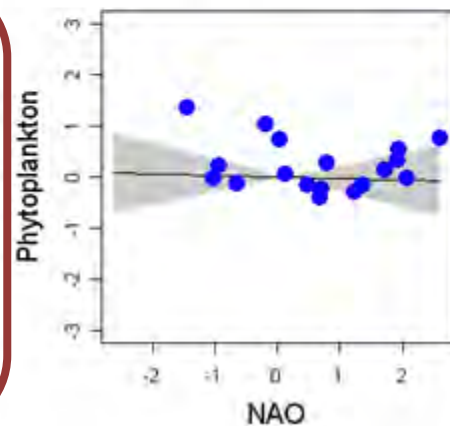
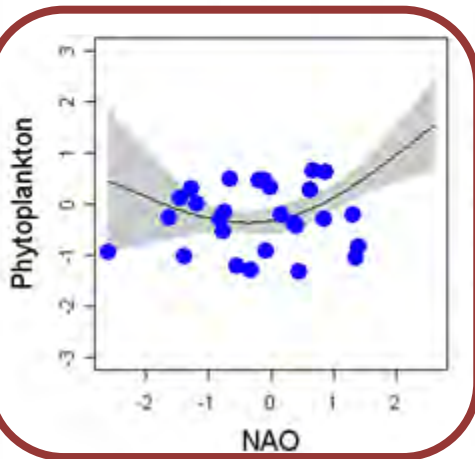
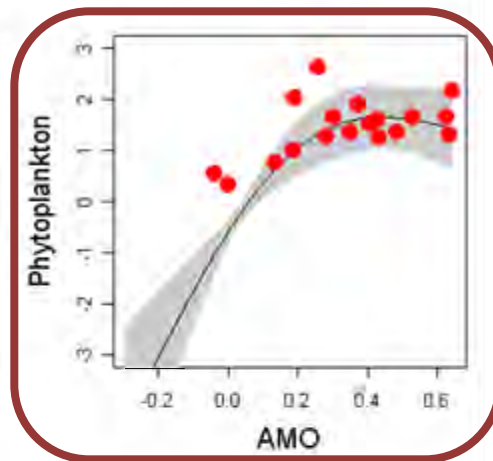
$r^2 = 0.308$ ;  $p < 0.001$

# Phytoplankton vs. Climate – Non-Additive

AMO low ( $\leq r$ )



AMO high ( $> r$ )



Threshold Generalized Additive Model (TGAM):  $r^2 = 0.520$

Predictor	AMO-state	P - values
AMO	low	0.401
<b>AMO</b>	<b>high</b>	<b>&lt; 0.001</b>
<b>NAO</b>	<b>low</b>	<b>&lt; 0.01</b>
NAO	high	0.841

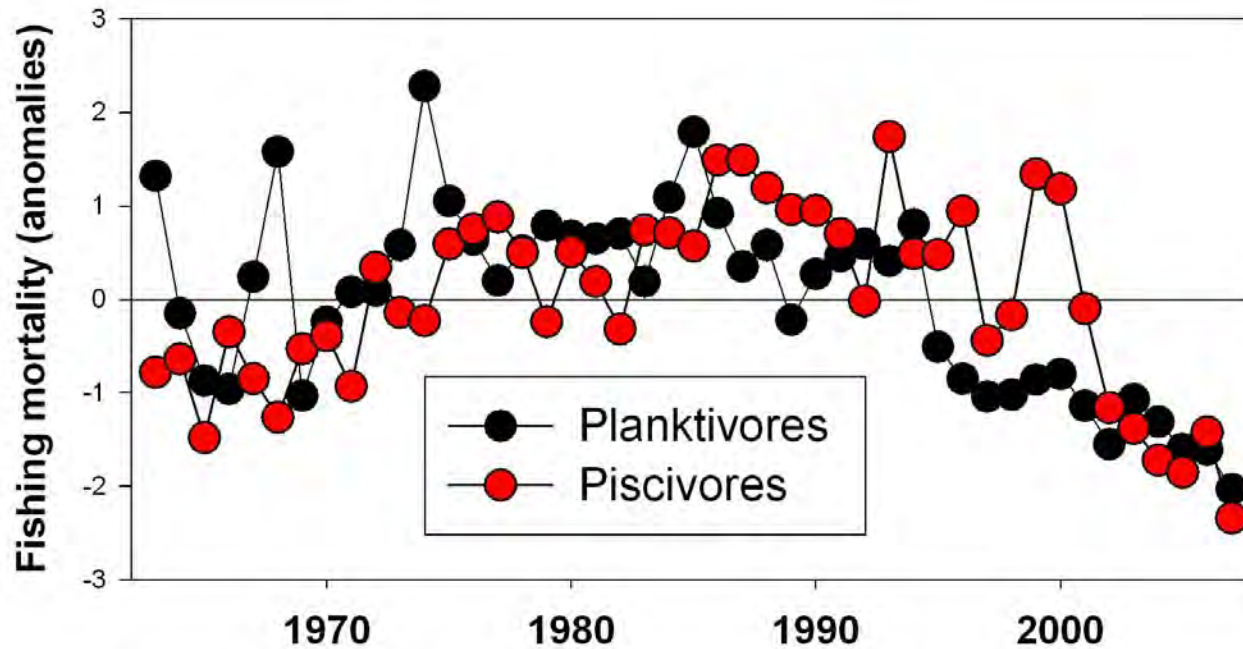
## Conclusions

- TGAM „better“ than GAM
- AMO has significant effect when in a „high (warm) state“
- **NAO has ONLY a significant effect when AMO is low (cold state) !**

# Trophic Levels vs. Climate – Additive vs. Non-Additive

Predictor	AMO-state	Phyto-plankton	Zooplank-ton	Planktivores	Piscivores
AMO	low	0.401	< 0.01	< 0.05	< 0.01
AMO	high	< 0.001	< 0.05	< 0.01	< 0.001
NAO	low	< 0.01	< 0.01	0.348	0.274
NAO	high	0.841	0.884	0.195	< 0.001
<b>T – GAM</b>	-	<b>r<sup>2</sup>=0.520</b>	<b>r<sup>2</sup>=0.390</b>	<b>r<sup>2</sup>=0.421</b>	<b>r<sup>2</sup>=0.498</b>
<b>GAM</b>	-	<b>r<sup>2</sup>=0.404</b>	<b>r<sup>2</sup>=0.332</b>	<b>r<sup>2</sup>=0.177</b>	<b>r<sup>2</sup>=0.465</b>

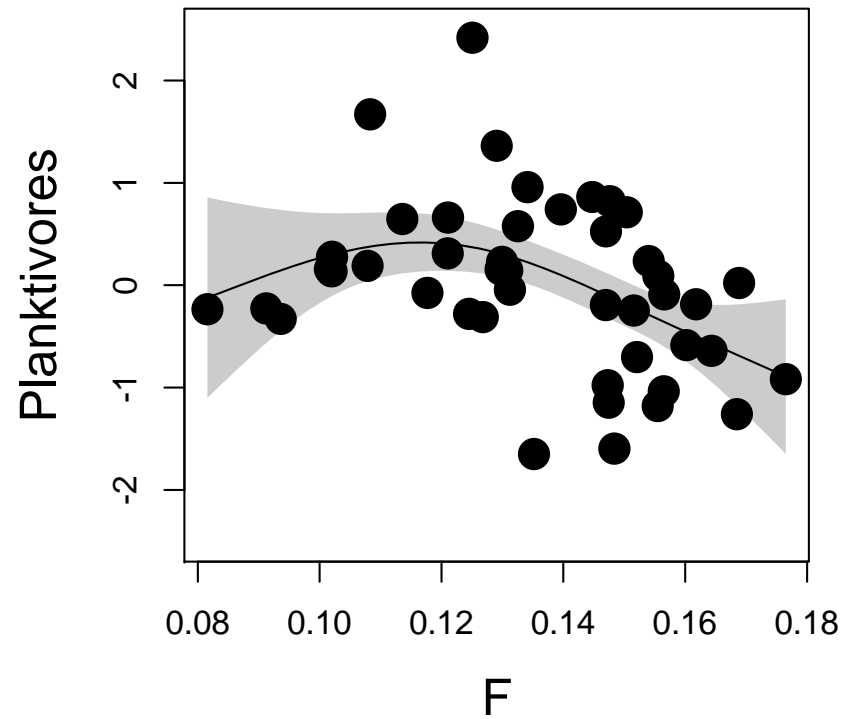
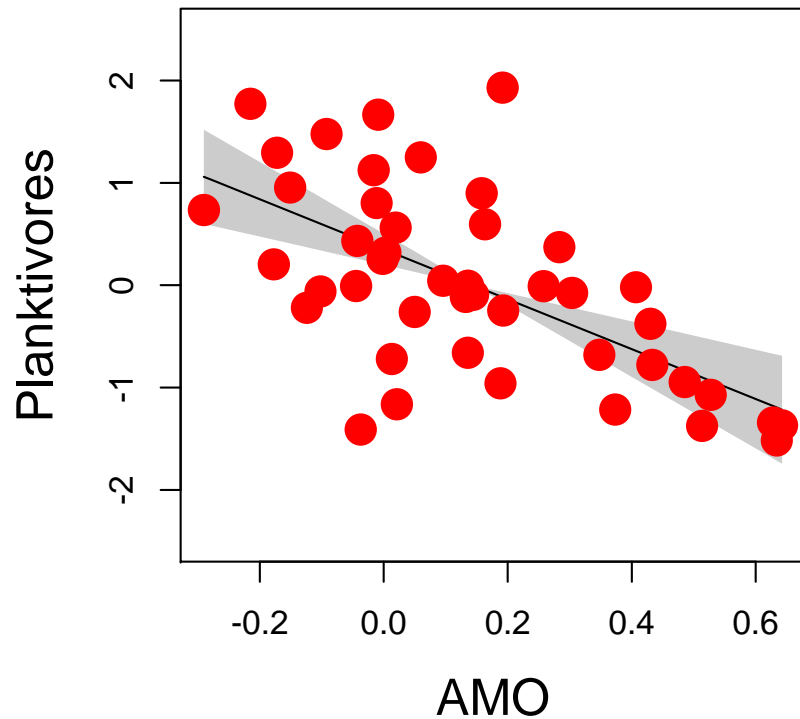
# 3 – Climate & fishing effect on North Sea ecosystem



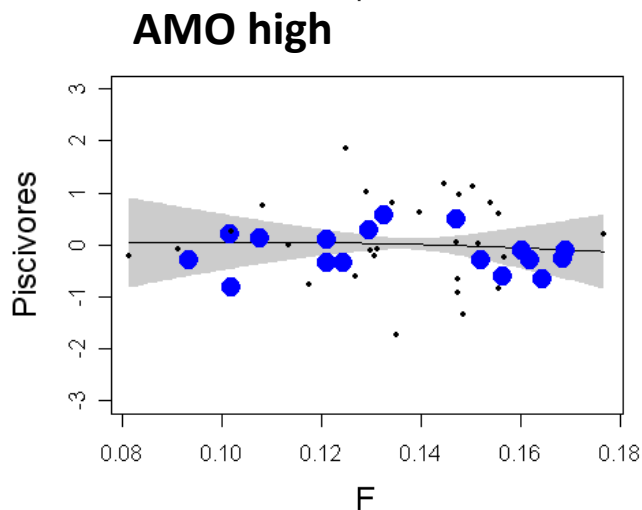
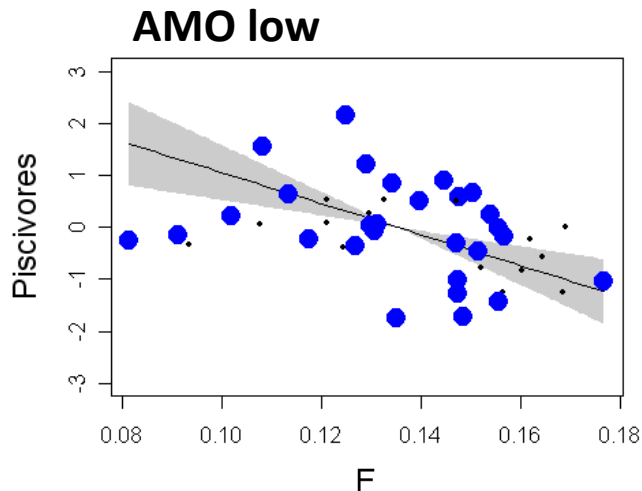
# Piscivores vs. Climate & *Fishing* – Additive

Generalized Additive Model (GAM):

$r^2 = 0.437$ ; AMO –  $p < 0.001$ ; F –  $p < 0.01$



# Piscivores vs. Climate & *Fishing* – Non-Additive



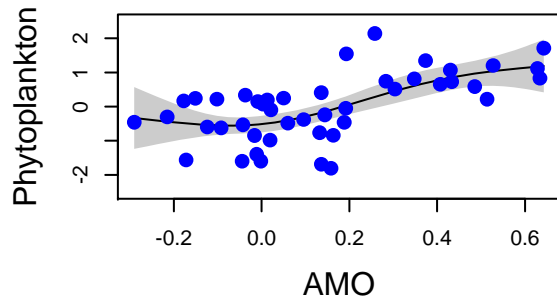
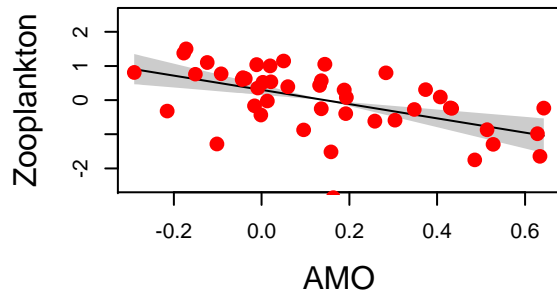
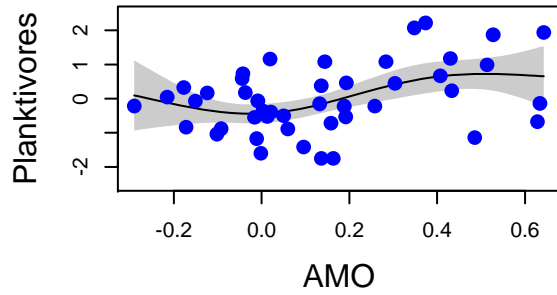
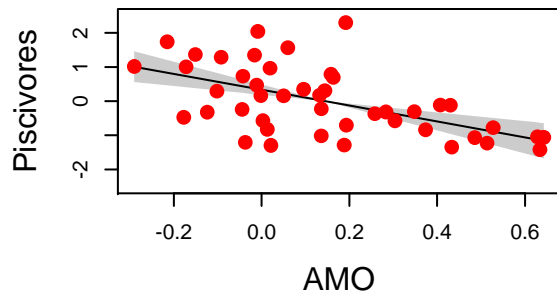
Threshold Generalized Additive Model  
(TGAM):  $r^2 = 0.458$

Predictor	AMO-state	P - values
AMO	low	0.094
<b>AMO</b>	<b>high</b>	<b>&lt; 0.01</b>
<b>F</b>	<b>low</b>	<b>&lt; 0.001</b>
F	high	0.563

## Conclusions

- **Fishing has only a significant effect when AMO is low (in a cold state) !**
- **When AMO is high (in a warm state), fishing effect not detectable anymore !**





„Cascading AMO-effect“  
on Trophic Levels

# Summary

- **Multidecadal (AMO) and decadal (NAO) climate effects** seem to determine North Sea SST in a non-additive way (NAO only important when AMO is low)
- **Trophic Levels**
  - Additive models of AMO & NAO generally perform better than simple SST-model
  - Non-additive models (T-GAMs) perform generally better than additive models (GAM)
  - For lower TLs NAO only important when AMO is in a low (cold) state
  - For higher TLs this pattern slightly reverses (impact of fishing?)
  - Effect of fishing on Piscivores only significant when AMO low (i.e. a cold state—positive for piscivores); when AMO is high (i.e. warm state—negative for piscivores) fishing „does not matter“ anymore
  - **AMO shows a striking „cascading effect“ on TLs, which indicates tremendous trophic reorganization with warming**



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# Thanks !



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