



POTSDAM INSTITUTE FOR  
CLIMATE IMPACT RESEARCH

# Modeling hydro-climatic extremes and flood damages under climate change conditions

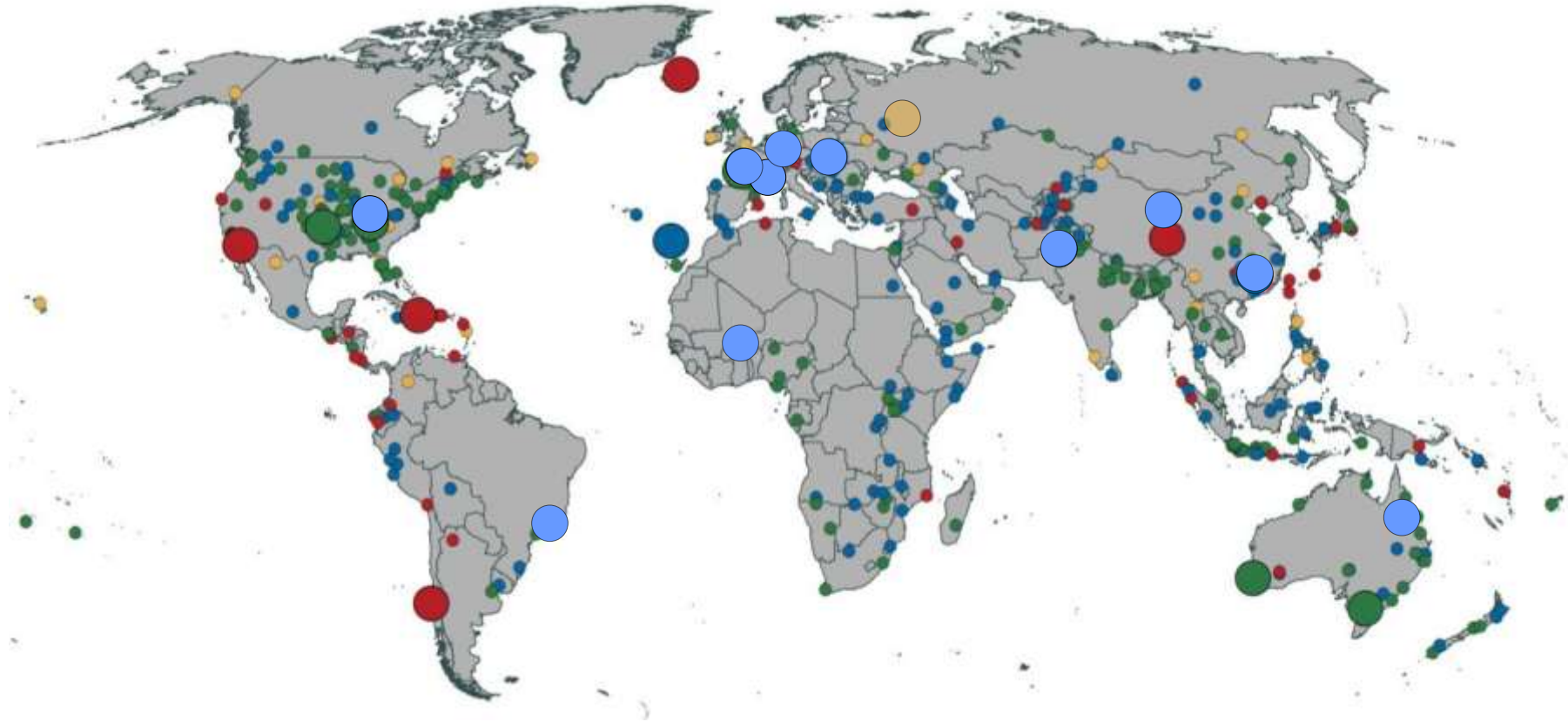
**Fred F. Hattermann, Shaochun Huang & Valentina Krysanova**  
**Potsdam Institute for Climate Impact Research**

# Outline

- Introduction – hydro-meteorological extremes under climate change
- Methodology
  - Model system
  - Data
  - Calibration and validation
  - Bias correction
- Results
- Conclusions



# Significant floods 2010



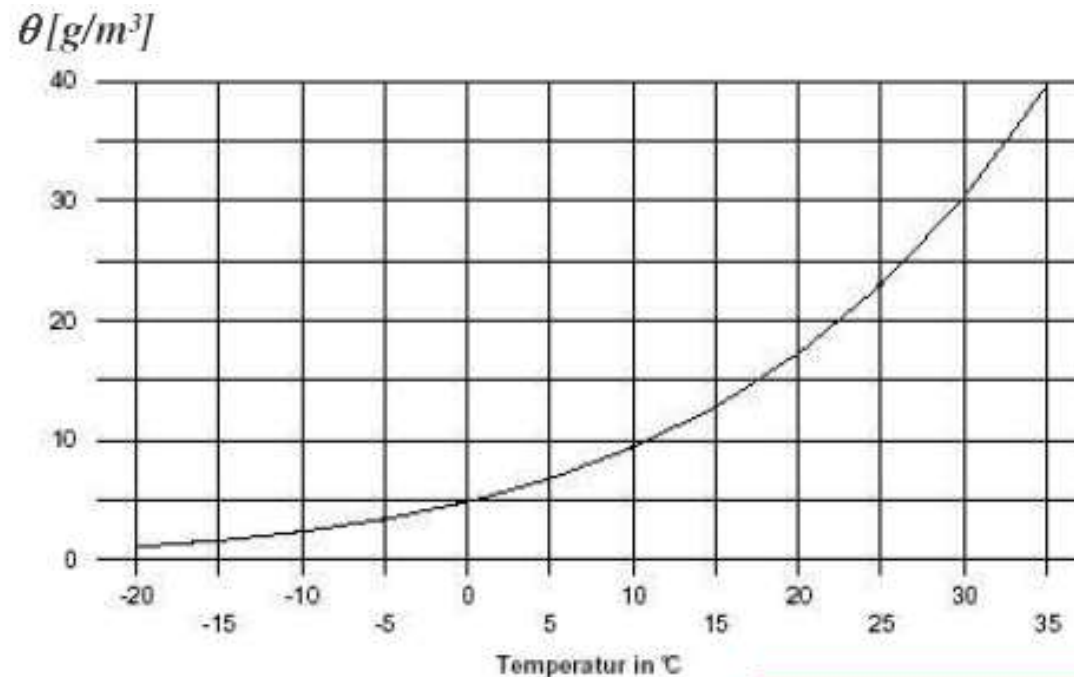
- Natural catastrophe
- Significant events

- Geophysical event
- Meteorological event

- Hydrological event
- Climatological event



# Clausius-Clapeyron: saturated moisture content in the atmosphere is a non-linear function of temperature

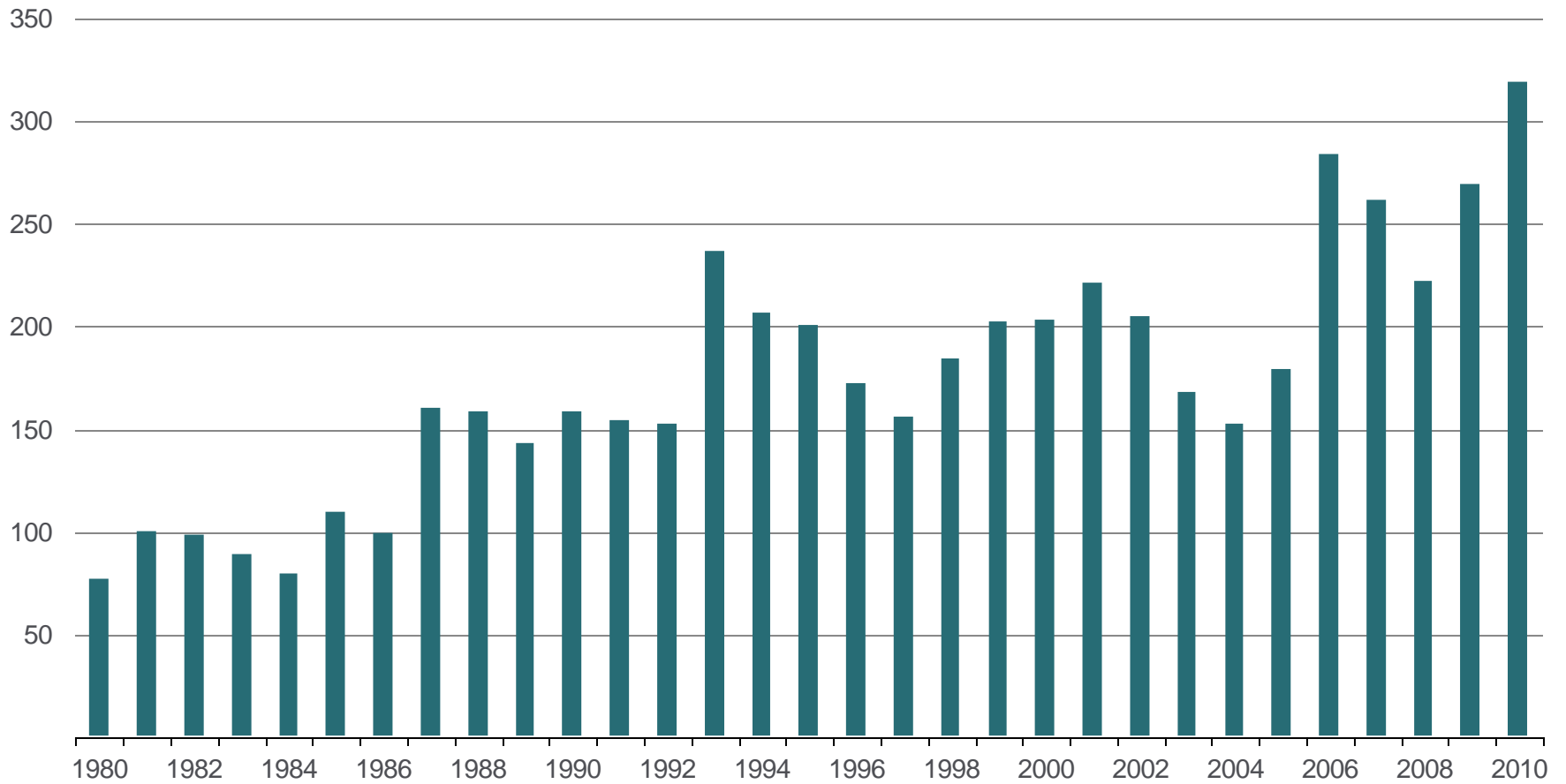


Temperature [ $^{\circ}\text{C}$ ]	0	10	15	18	20
Saturated (maximum) water content [ $\text{g/m}^3$ ]	4.8	9.4	12.9	15.4	17.3

$$\theta(18^{\circ}\text{C}) - \theta(15^{\circ}\text{C}) = 2.5 \text{ g/m}^3 \quad (= 19,4 \%)$$

# Number of major floods 1980 - 2010

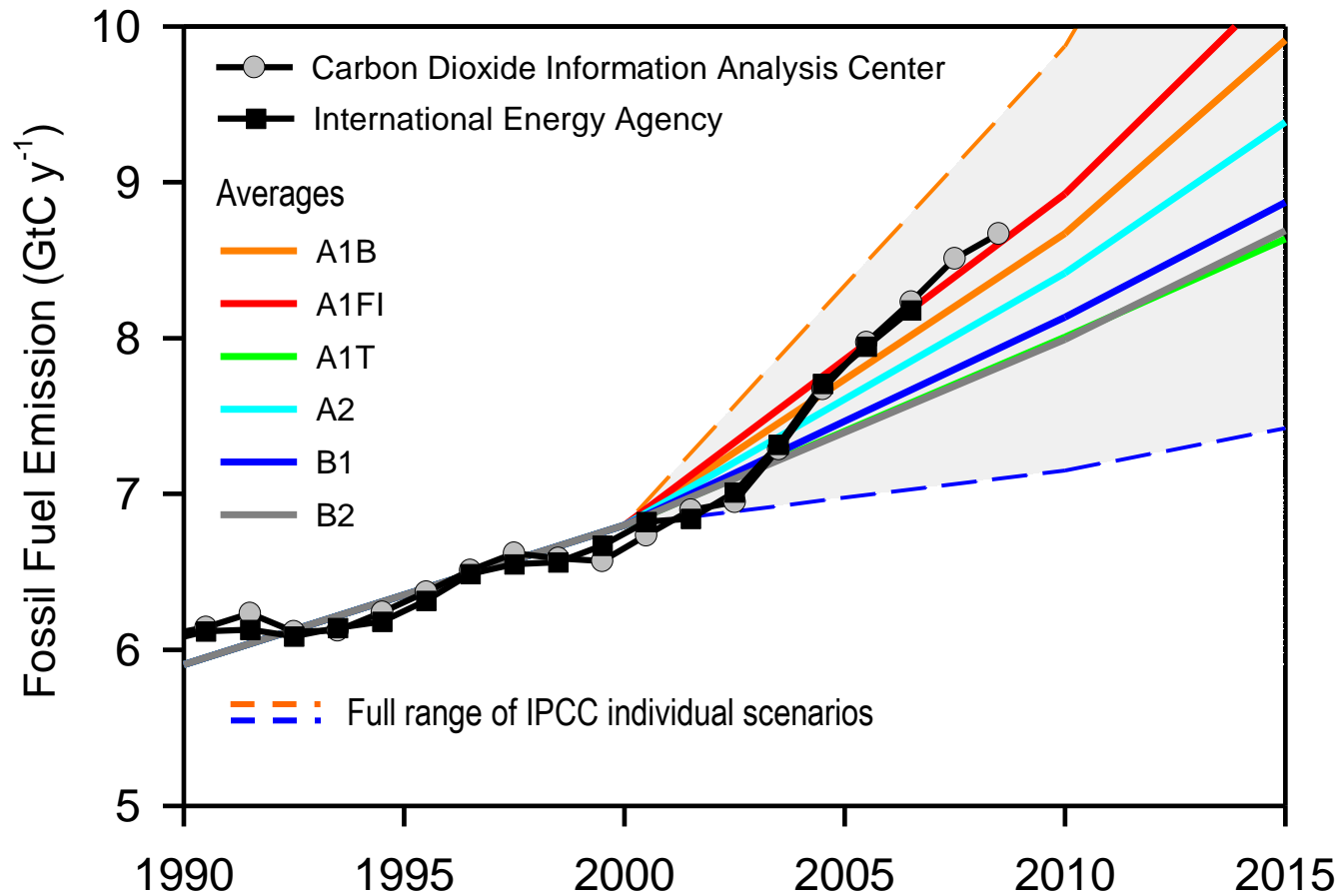
Number



Fred F. Hattermann

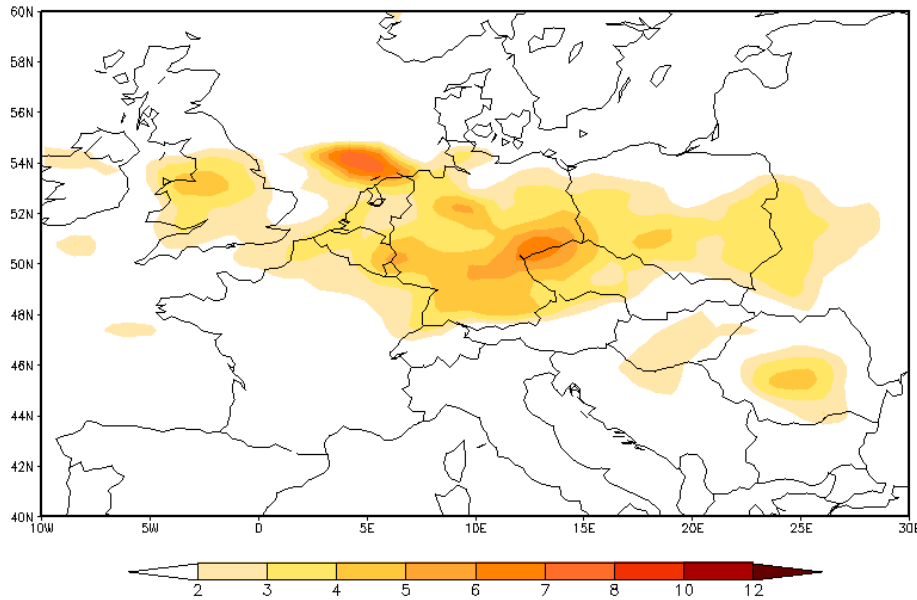
Source: MunichRe

# Global CO<sub>2</sub>-Emissions in Gt/year

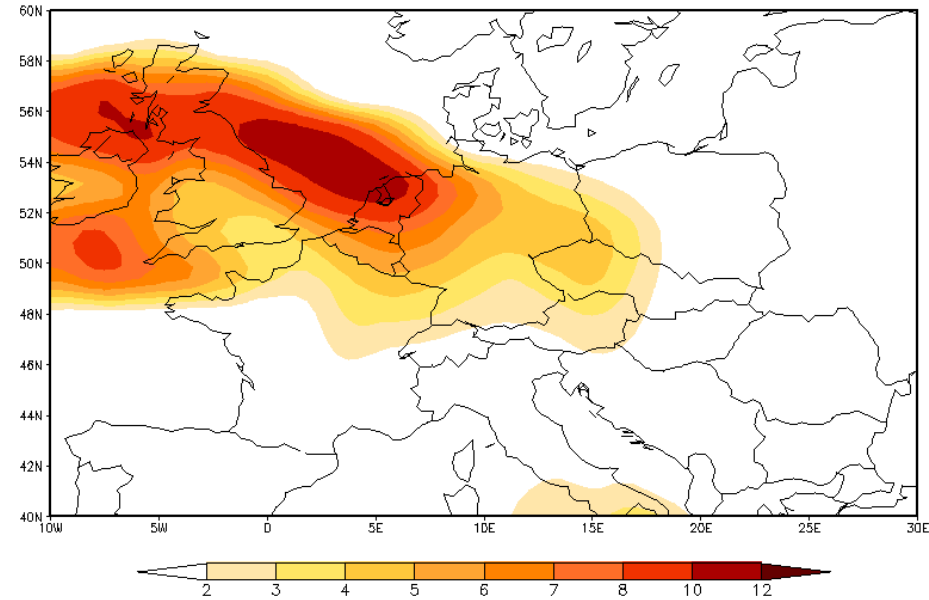


# Storms observed and projected

The strongest storm observed:  
**Kyrill**



Possible storm in future:  
**EH5\_1: 2079-01**



**Storm intensity (wind speed)**

# Co-operation with the leading Insurance Companies (German Insurance Association)

## Leading questions:

- **How will climate change impact on flood generation in Germany?**
- **Do we have more or less intense floods under climate change?**
- **What is the approximated magnitude of the projected losses?**

**Group meetings with the insurance experts every 2-3 month**



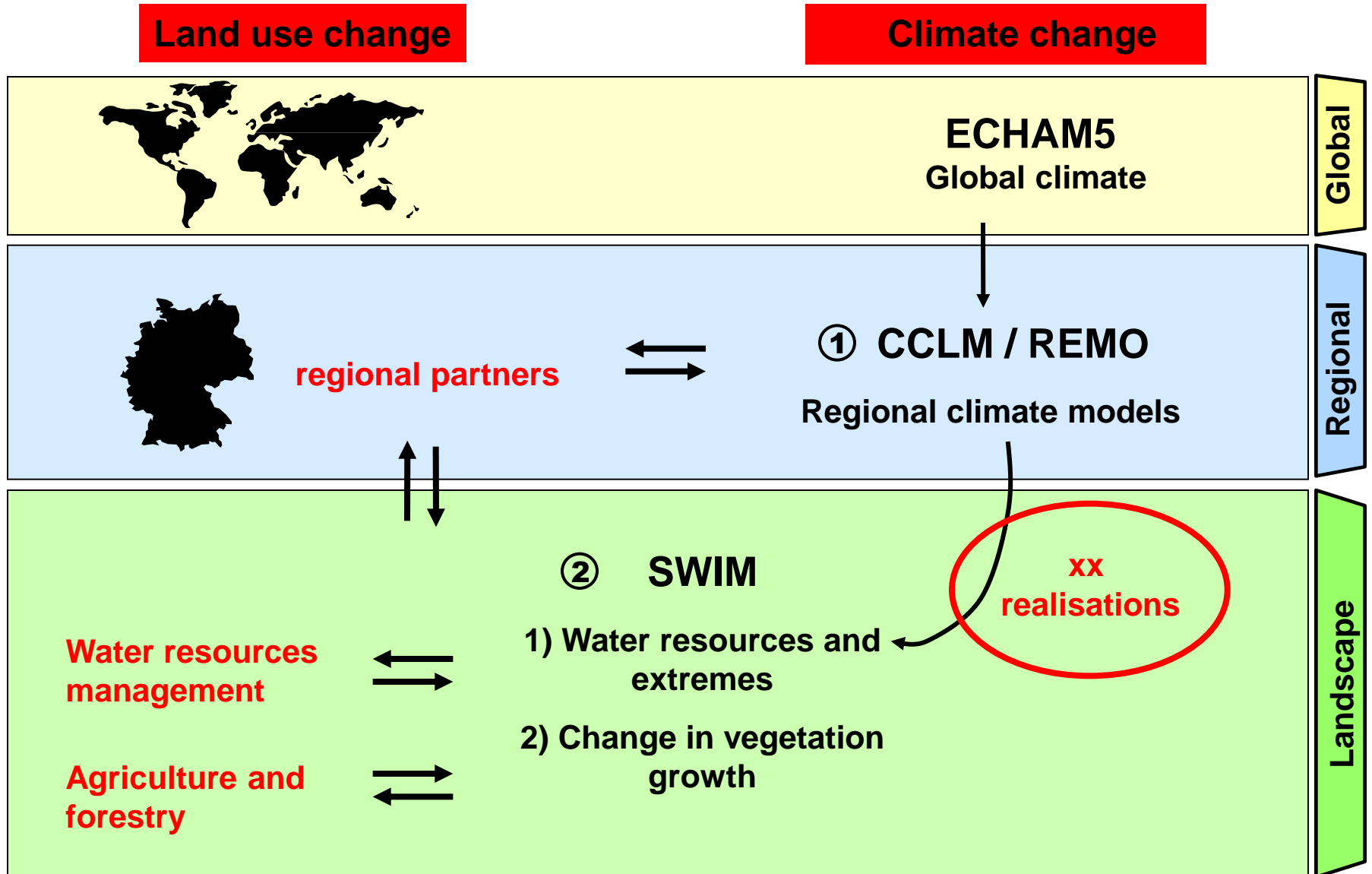


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# Model system



# Methodology: From climate extremes to financial losses

**Step 1:** regional climate by CCLM and REMO (multiple scenario and realisations)

**Step 2:** modelling hydrological processes for each realisation using SWIM (for ~5000 river reaches/ sections)

**Step 3:** calculation of extreme value statistics (reference period) for each river reach (General Pareto Distribution GPD)

**Step 4:** linking runoff and damages using GPD, calculate flood damages for each river reach and scenario day

## General Pareto Distribution:

$$F_u(x) \approx G(x; \tilde{\sigma}, \xi, u) = 1 - \left[ 1 + \frac{\xi(x-u)}{\tilde{\sigma}} \right]^{-1/\xi}$$

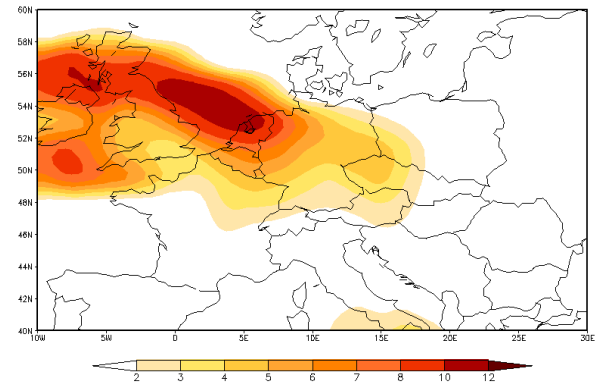
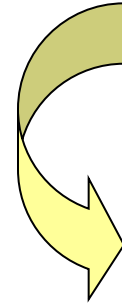
## Developed for return interval $T$ :

$$T = \frac{\sqrt[\xi]{\frac{q-u}{\tilde{\sigma}} \cdot \xi + 1}}{n_u \cdot \Pr(x > u)}$$

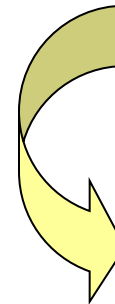
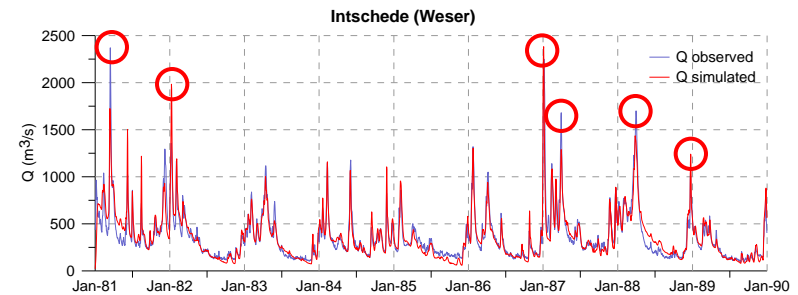
$q$  = runoff

$u$  = threshold

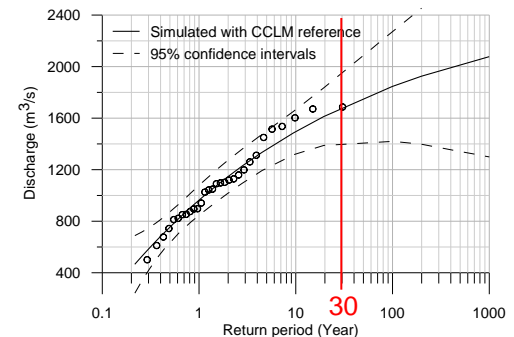
$\xi, \sigma$  = parameters



Downscaling and hydrological modelling (~5000 river sections)



## Calculation of extreme value distributions



# The regional climate models and the hydrological model

## (German) Regional Climate Models:

**REMO** – model domain Central Europe, grid size 10 km, szenarios A1B, A2 and B1 with one realization each

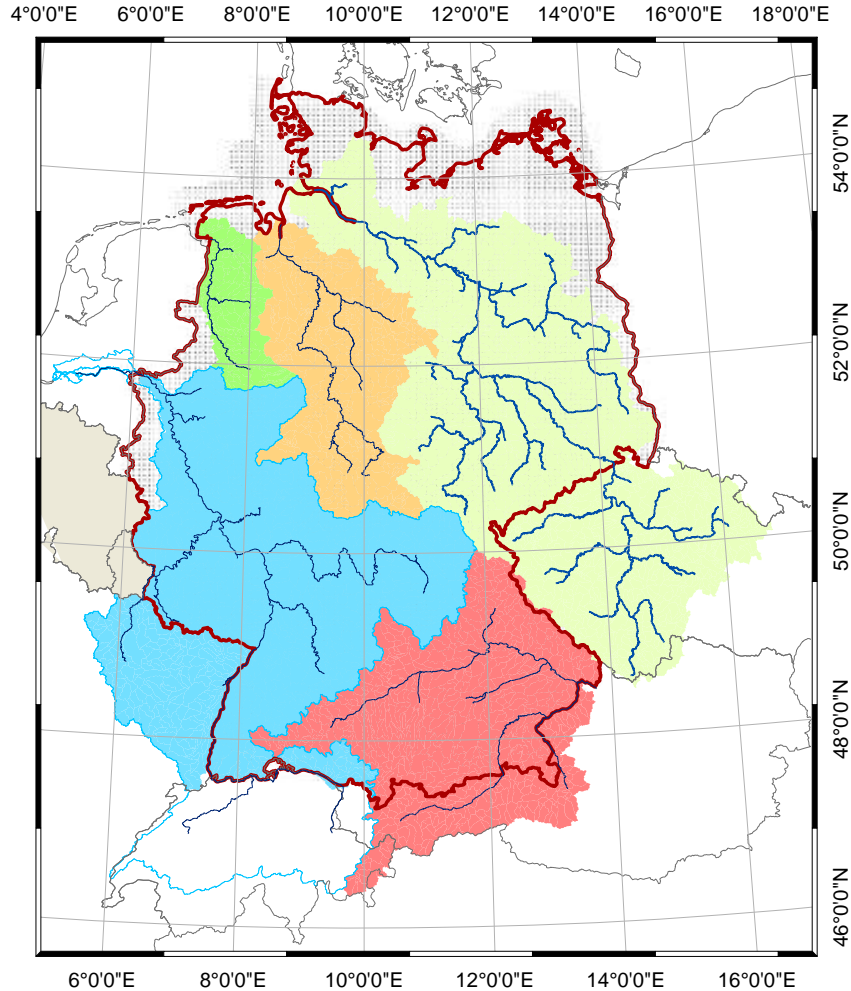
**CCLM** – model domain Europe, grid size ~18 km, szenarios A1B and B1 with two realizations each

## (Eco)-hydrological Model:

**SWIM** – Soil and Water Integrated Model – offspring of SWAT, soil processes and routing same as in SWAT, improved snow module (Huang et al. 2010)



# Data: Main German river basins



5473 subbasins/ river reaches,  
thereof 3766 in Germany

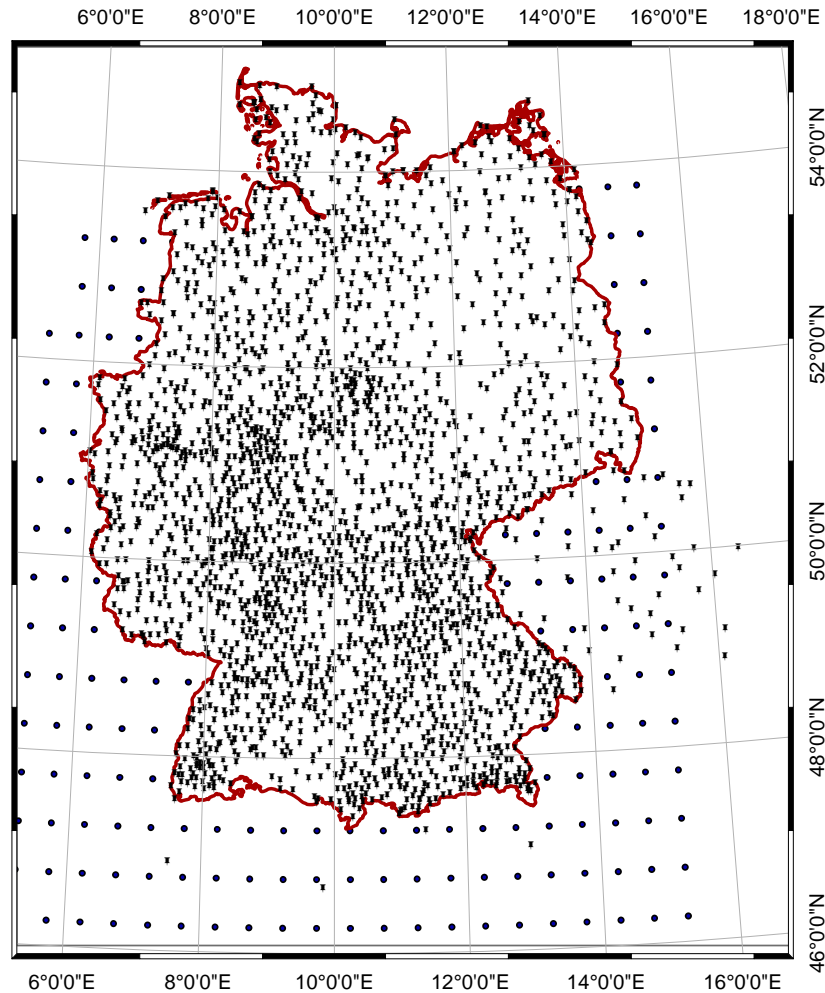
## Subbasins in Germany

- River nets
- Other countries
- Germany
- Rhein
- Donau
- Elbe
- EMS
- Weser
- Other basins in Germany

0 100 200  
Kilometers  
Graph made by Shaochun, Huang, PIK



# Data – Climate



## 2342 climate stations

**Climate stations:**  
(Min. T, Mean T, Max. T,  
Precipitation, Radiation,  
Humidity)

**Source: PIK**

**Country**

 Germany

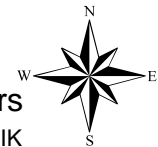
• 2399 observed climate stations

• Climate data from models

0 100 200

 Kilometers

Graph made by Shaochun, Huang, PIK



# Data – data

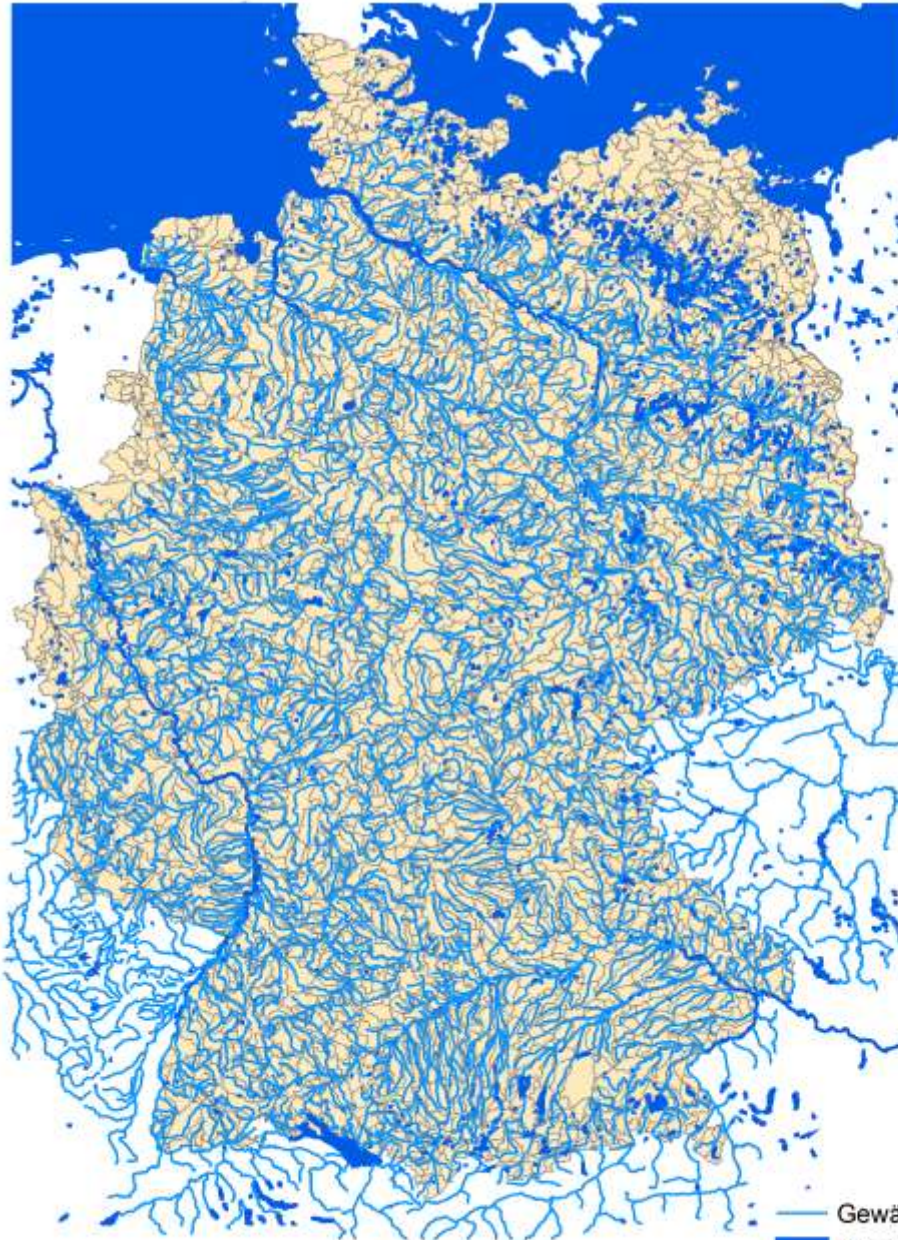
Damage function  
(including  
Re, Swiss

One damage  
zones in C

Linked to the

Considered

Average loss



association  
(Munich

code

year



0 100 200 Kilometer

— Gewässerlinien  
— Gewässerflächen  
— Einzugsgebiete

# Outline

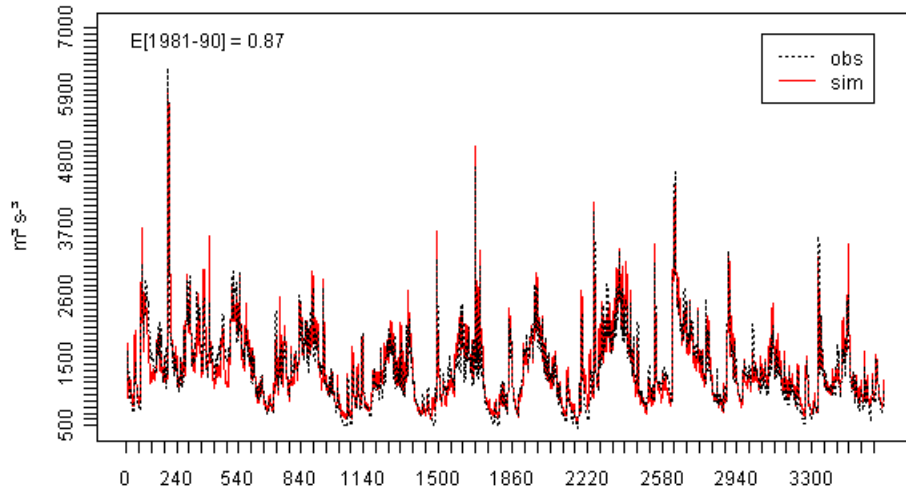
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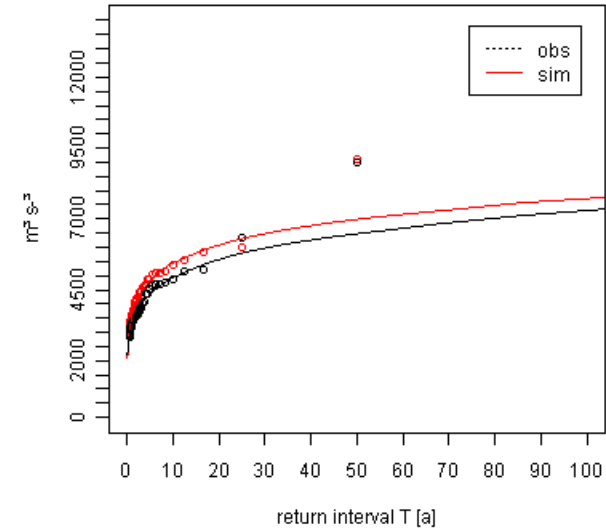


# Calibration and validation using observed climate data

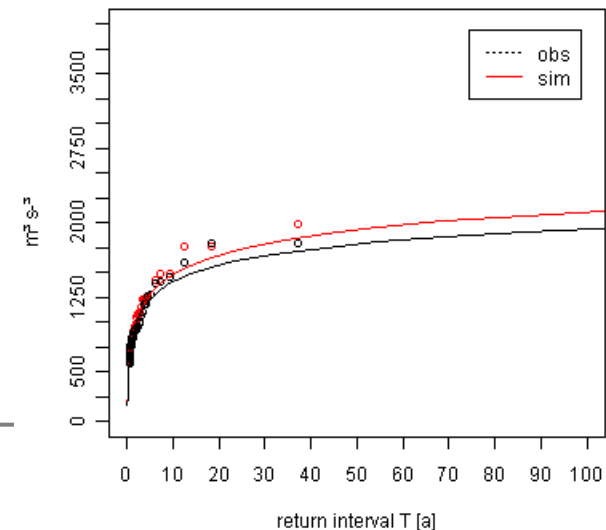
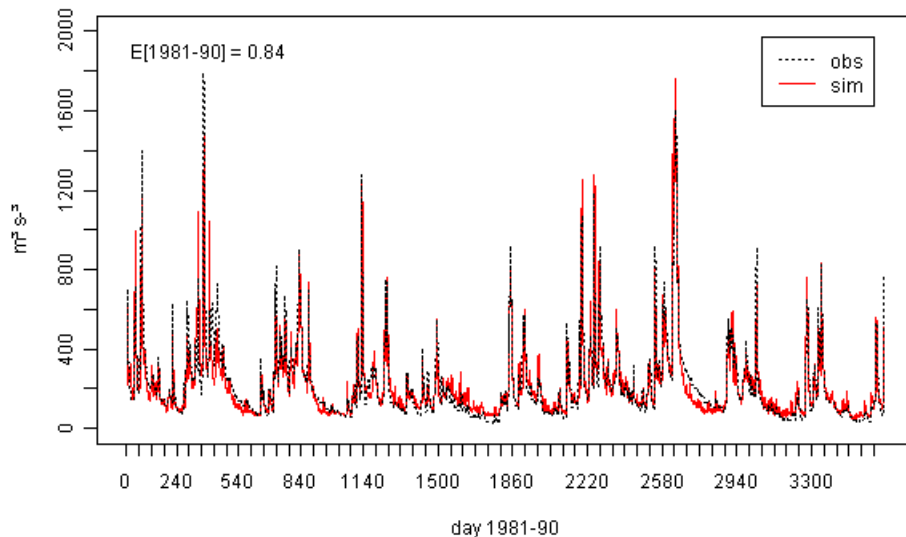
River Danube, gauge Achleiten



River Danube, gauge Achleiten



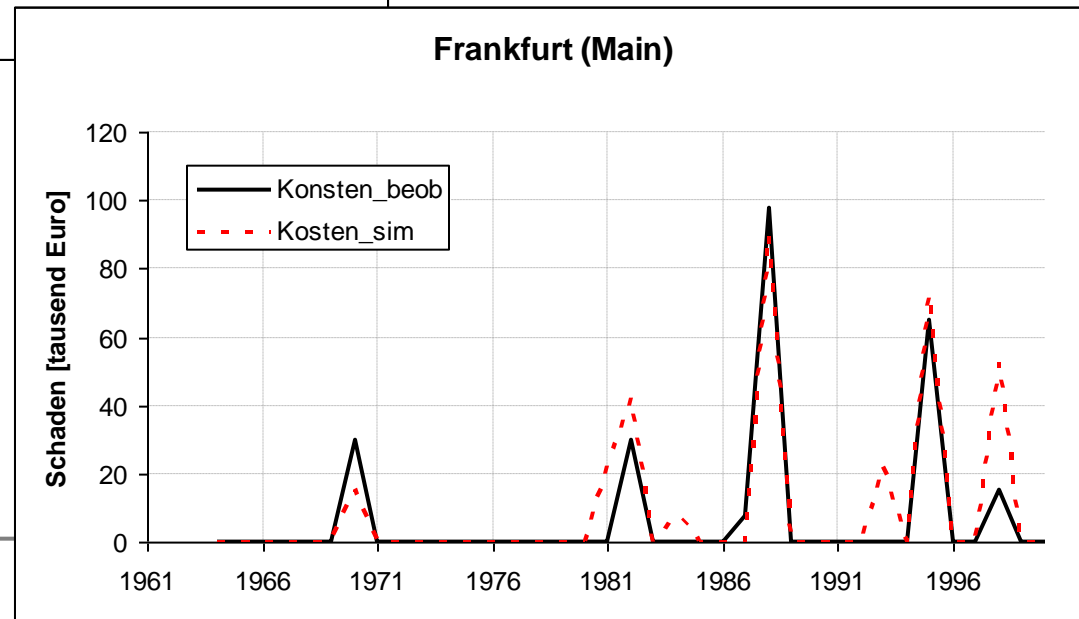
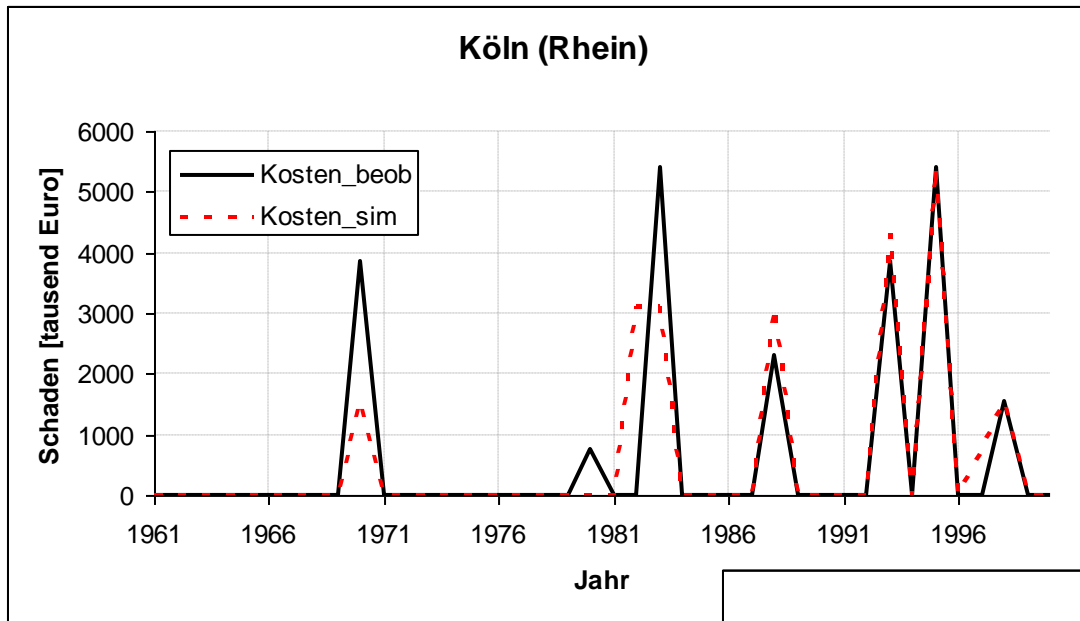
River Main, gauge Frankfurt



Danube

Rhine

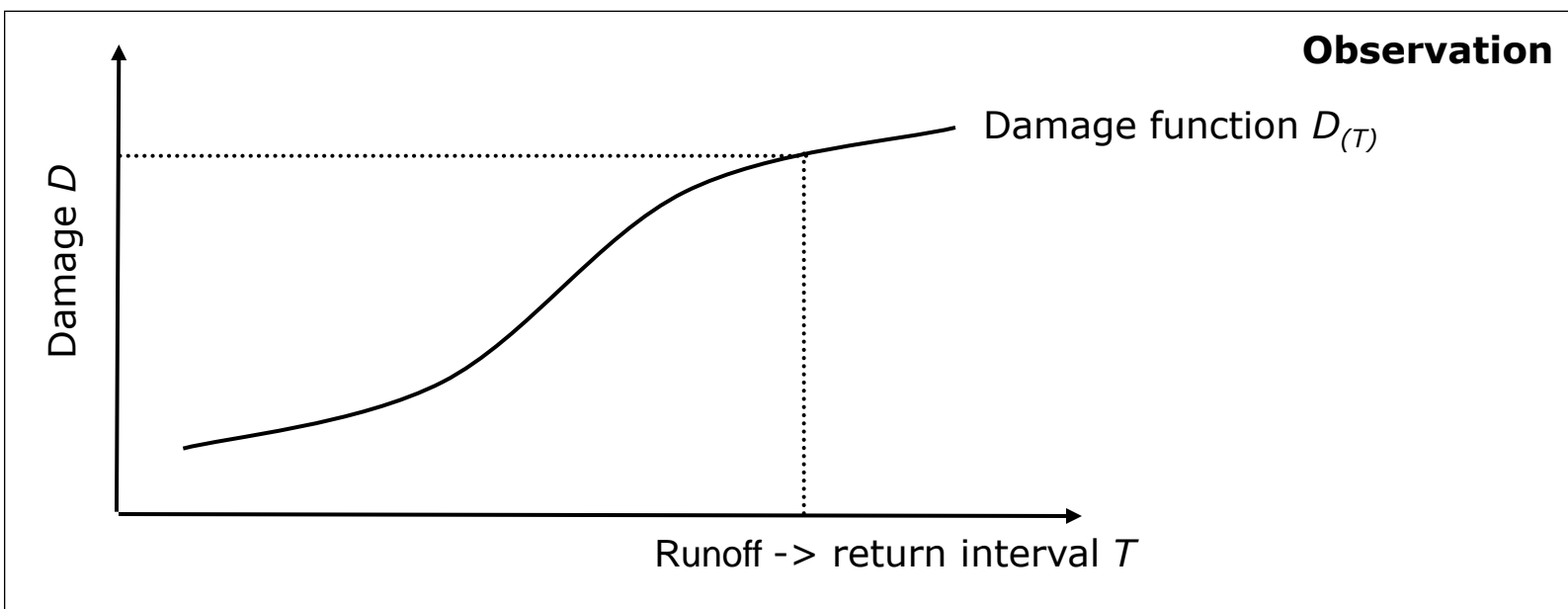
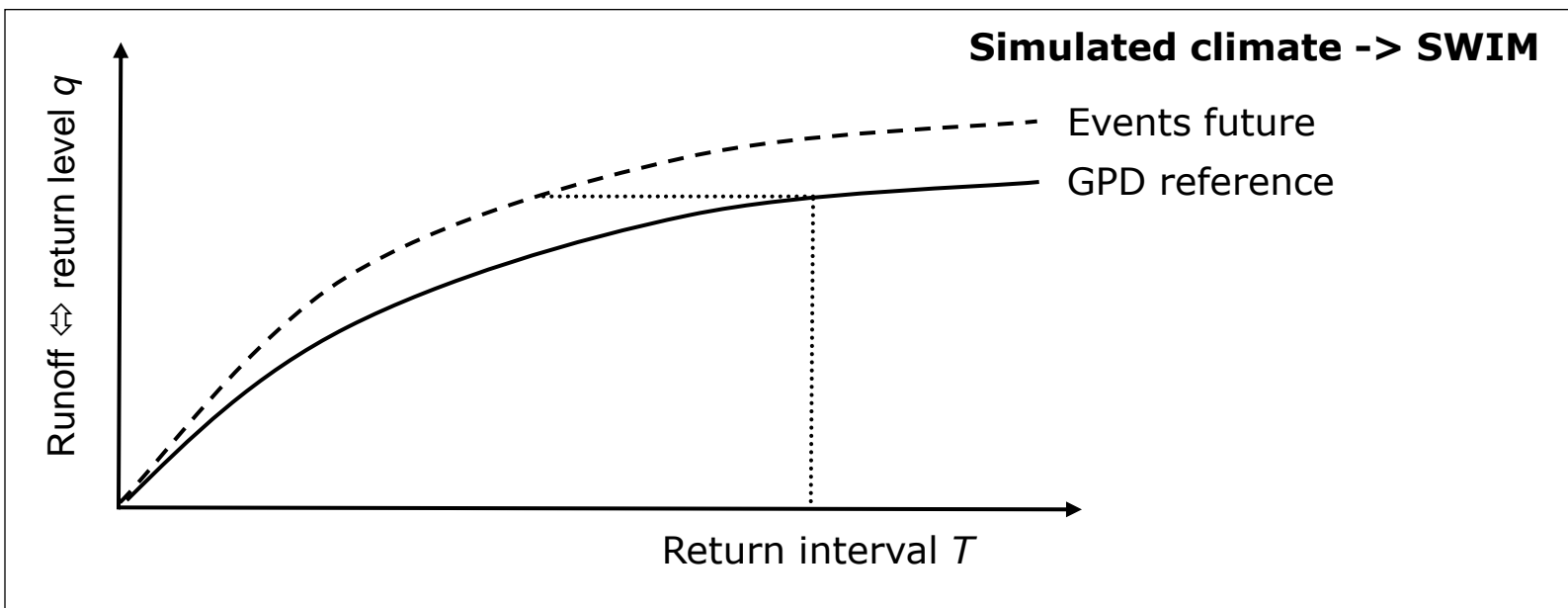
# Flood damages for specific river reaches – Rhine at Cologne and Main at Frankfurt



Losses calculated via **a) observed runoff**, flood statistics and damage functions and **b) simulated runoff ...**



# Bias correction

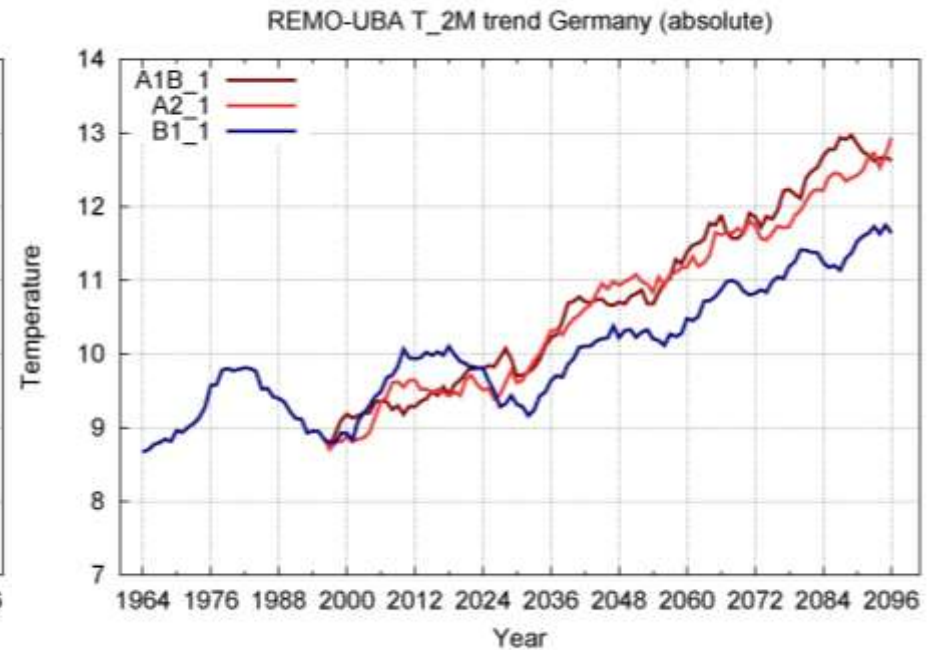
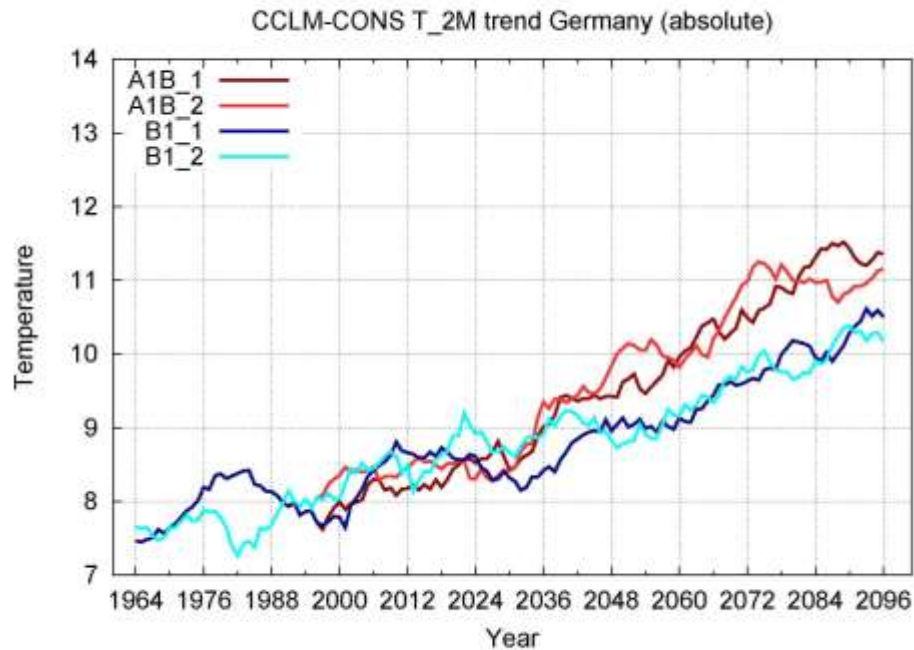


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# Results: Climate – temperature increase



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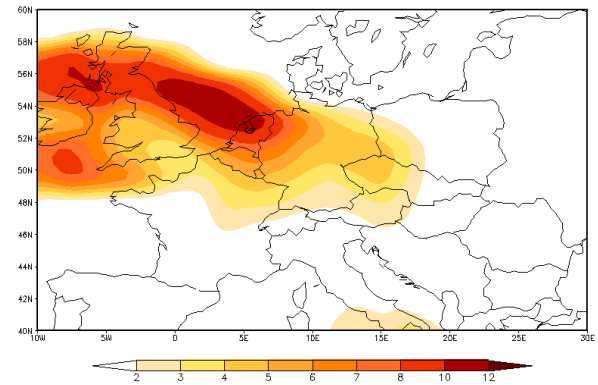
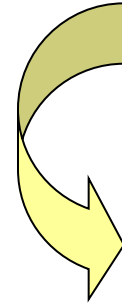
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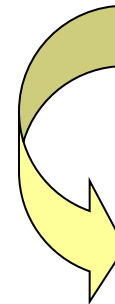
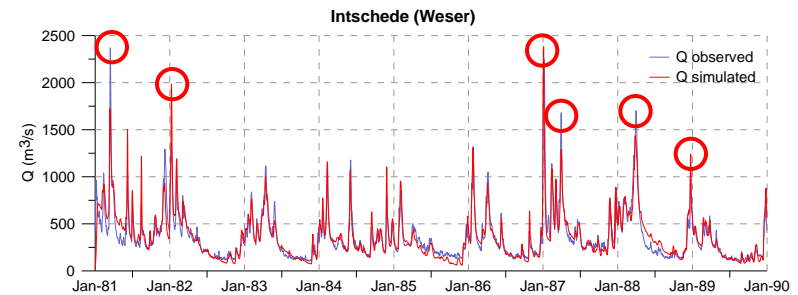
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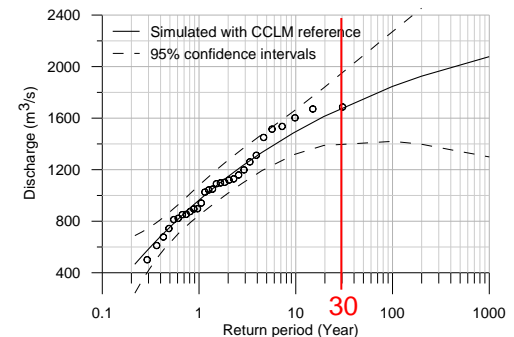
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Downscaling and hydrological modelling (~5000 river sections)

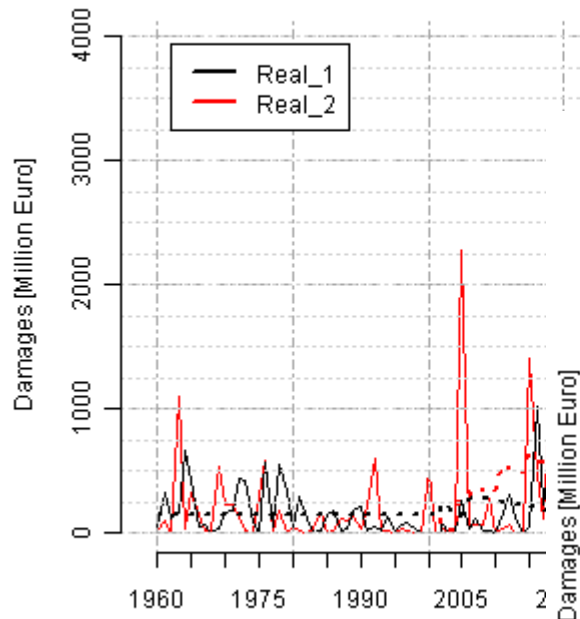


## Calculation of extreme value distributions

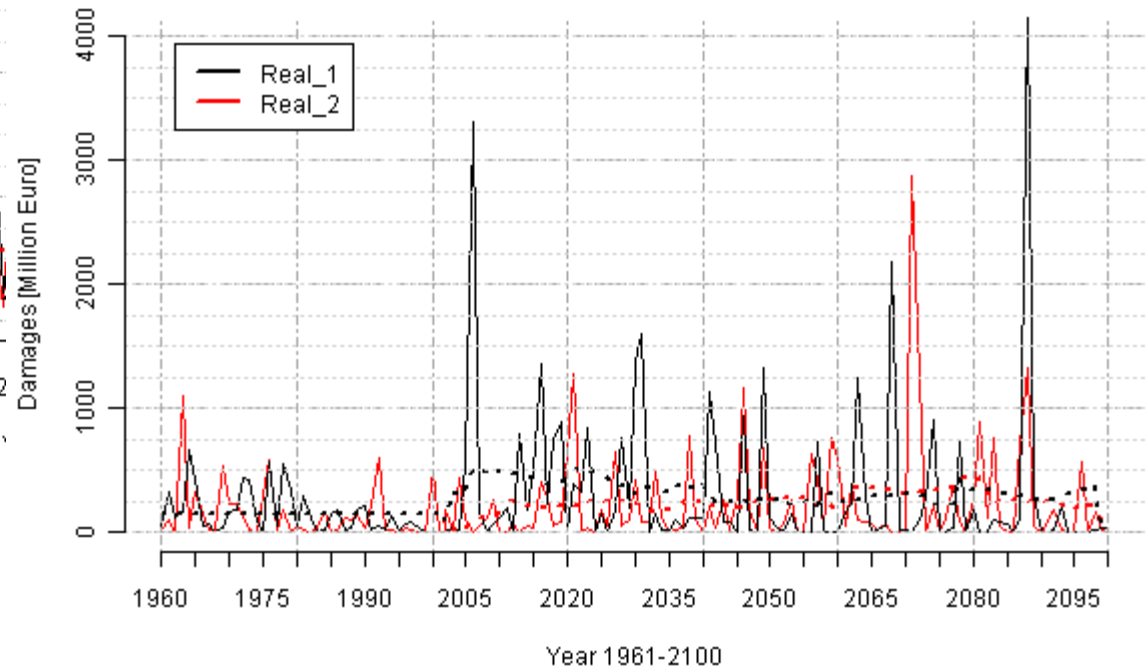


# Results: Flood damages in the Rhine basin under climate change

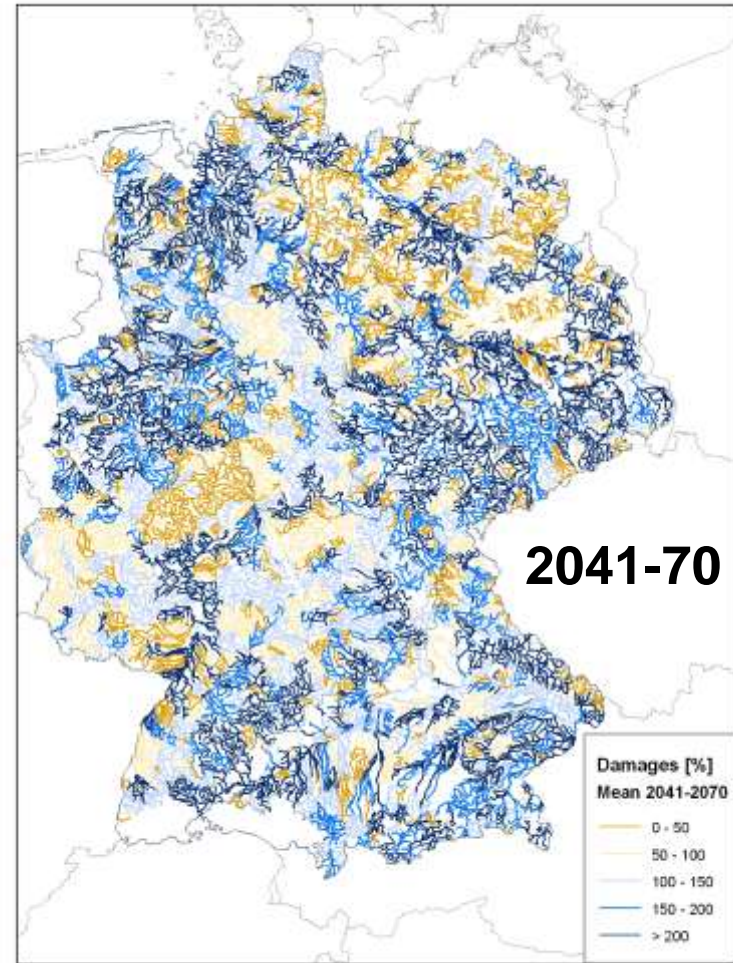
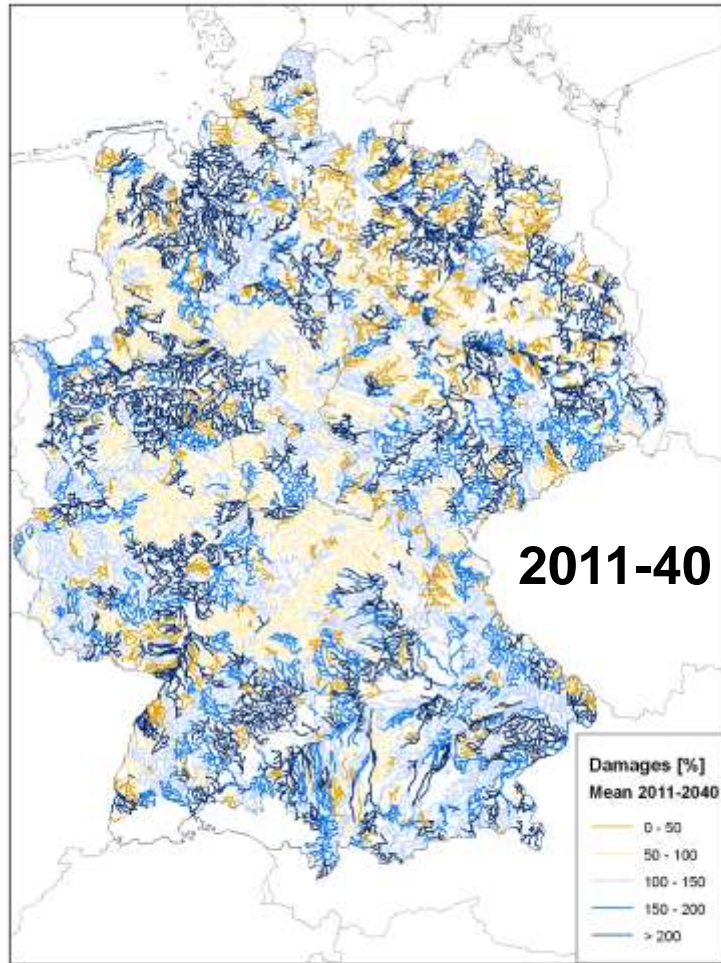
Damages in the Rhine basin (CCLM-B1)



Damages in the Rhine basin (CCLM-A1B)

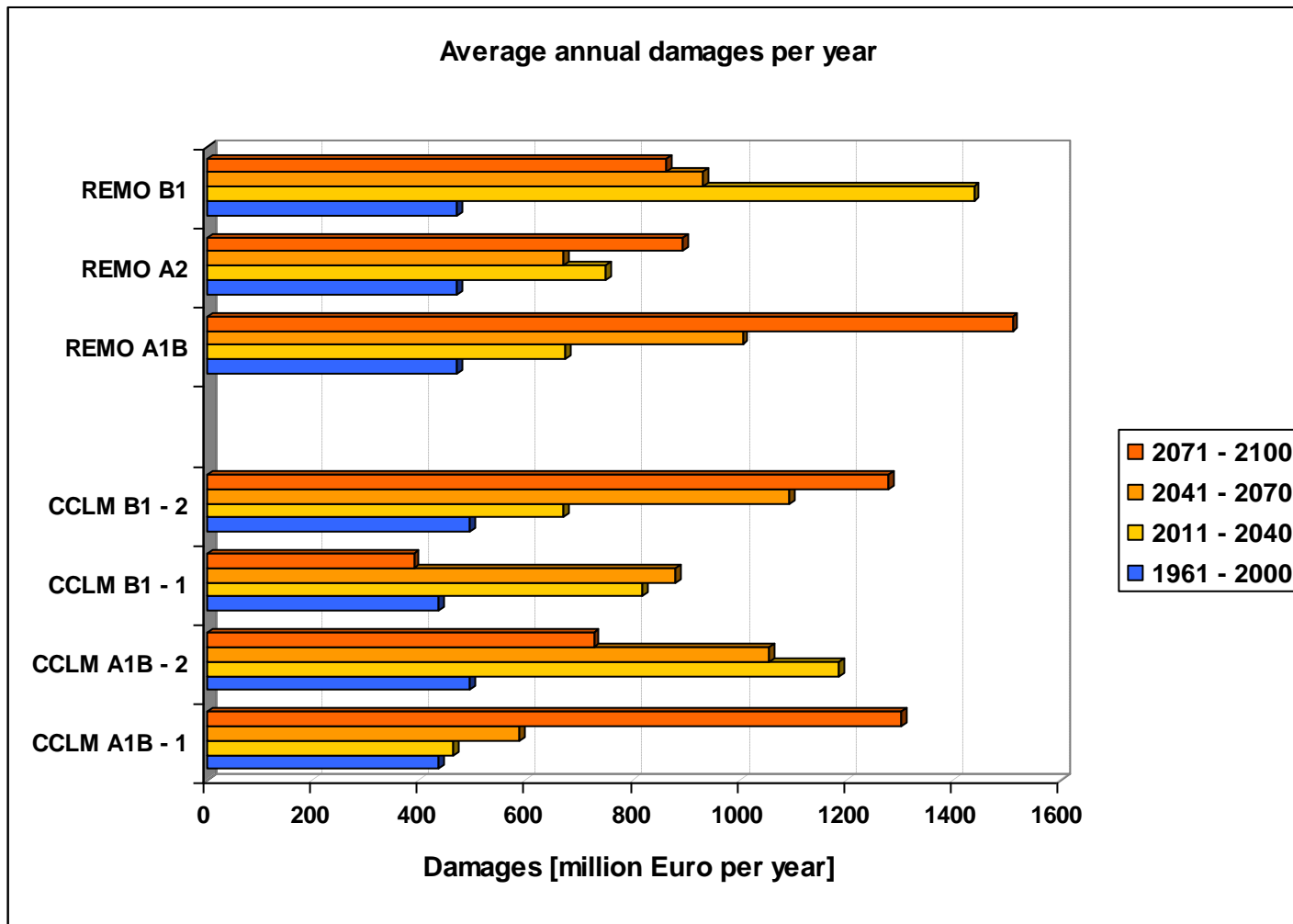


# Maps of the flood-related damages under scenario conditions

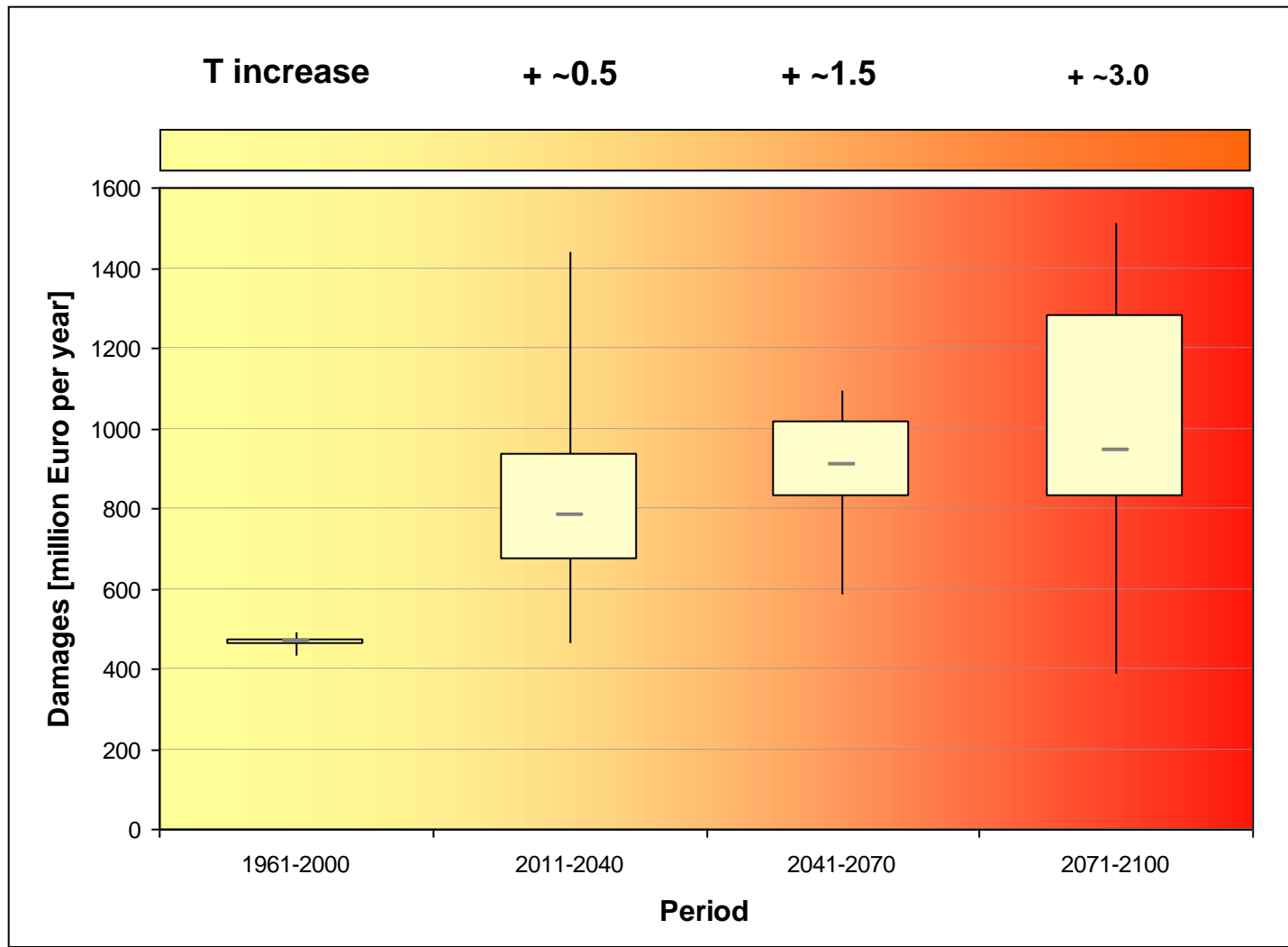




# Damages per climate model, scenario and realization



# Average annual damages per period



# Conclusions

- All scenarios project higher damages in future
- Increase about 100 %
- Results have high uncertainty
- Understanding of climate change has to be improved
- Hydrology is very sensitive to changes in climate
- Unexpected events may happen, never observed before

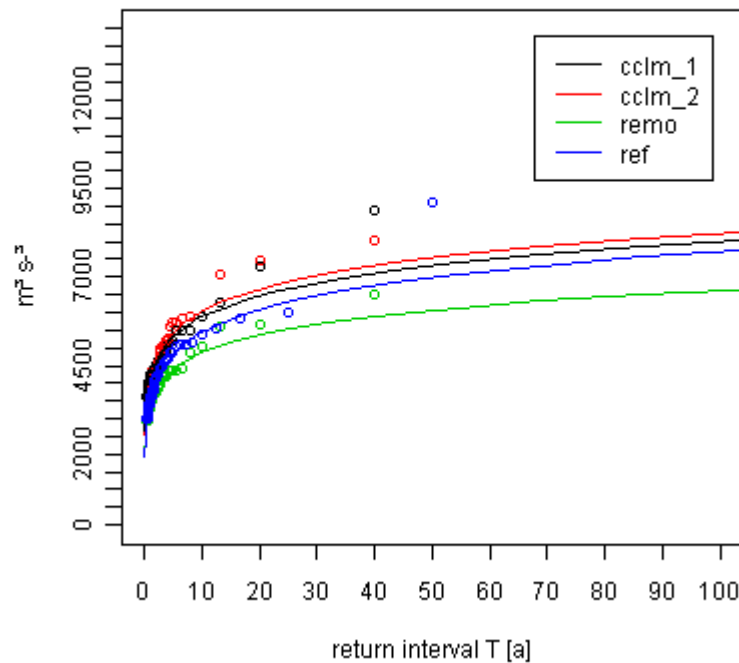
**Thank you very much!**

**Especially to the German Insurance Association for providing  
the damage data**

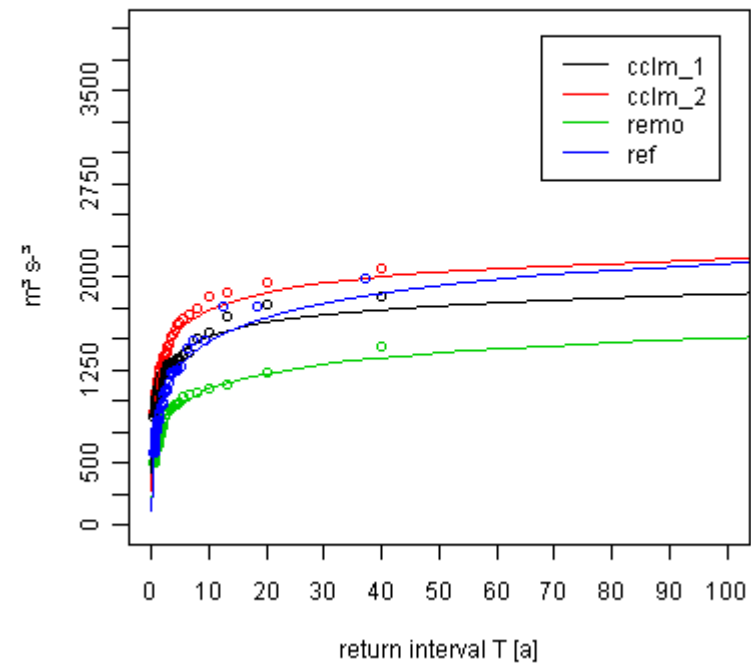


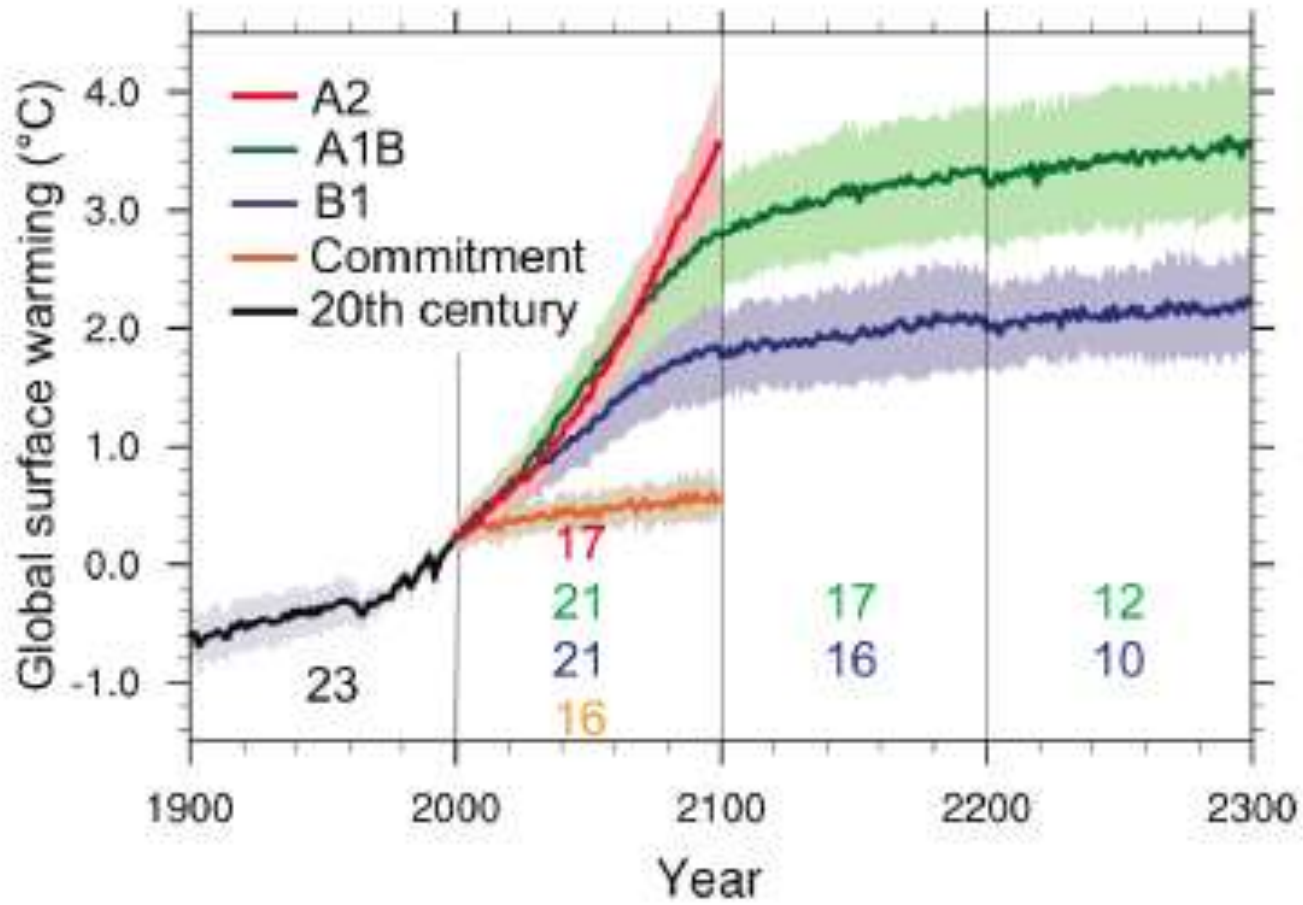
# Bias control: Comparison flood statistics *with observed climate as input and with simulated climate as input* for the reference period 1961 - 2000

River Donau, gauge Archleiten



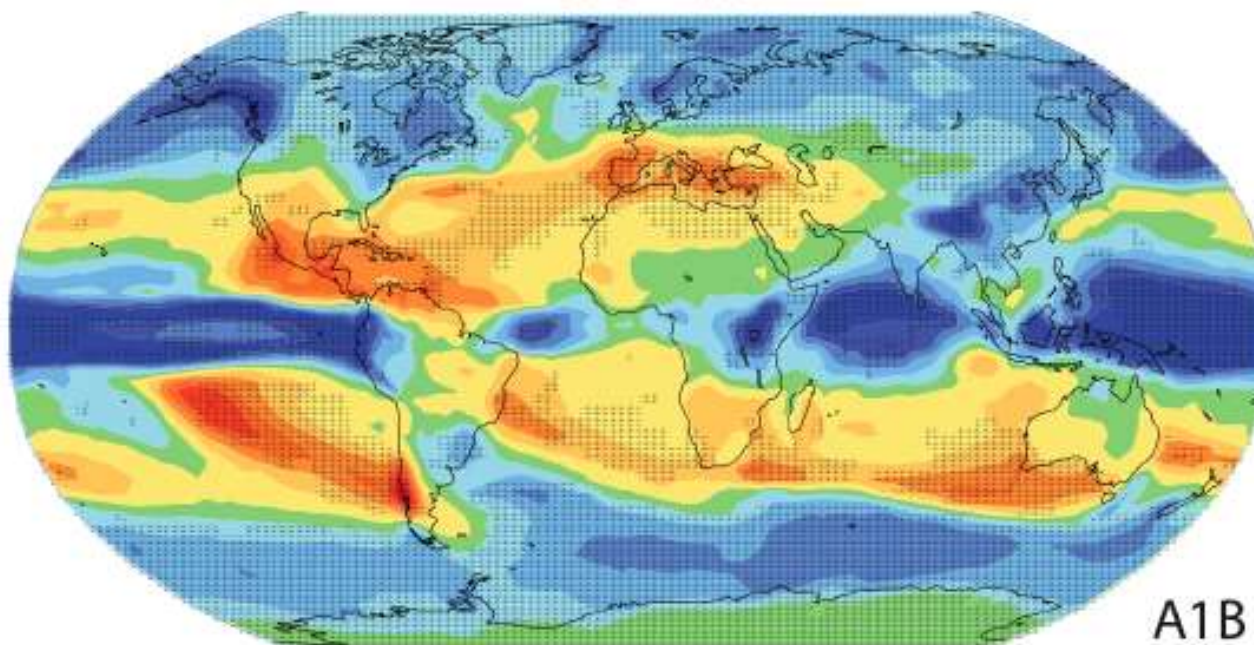
River Main, gauge Frankfurt



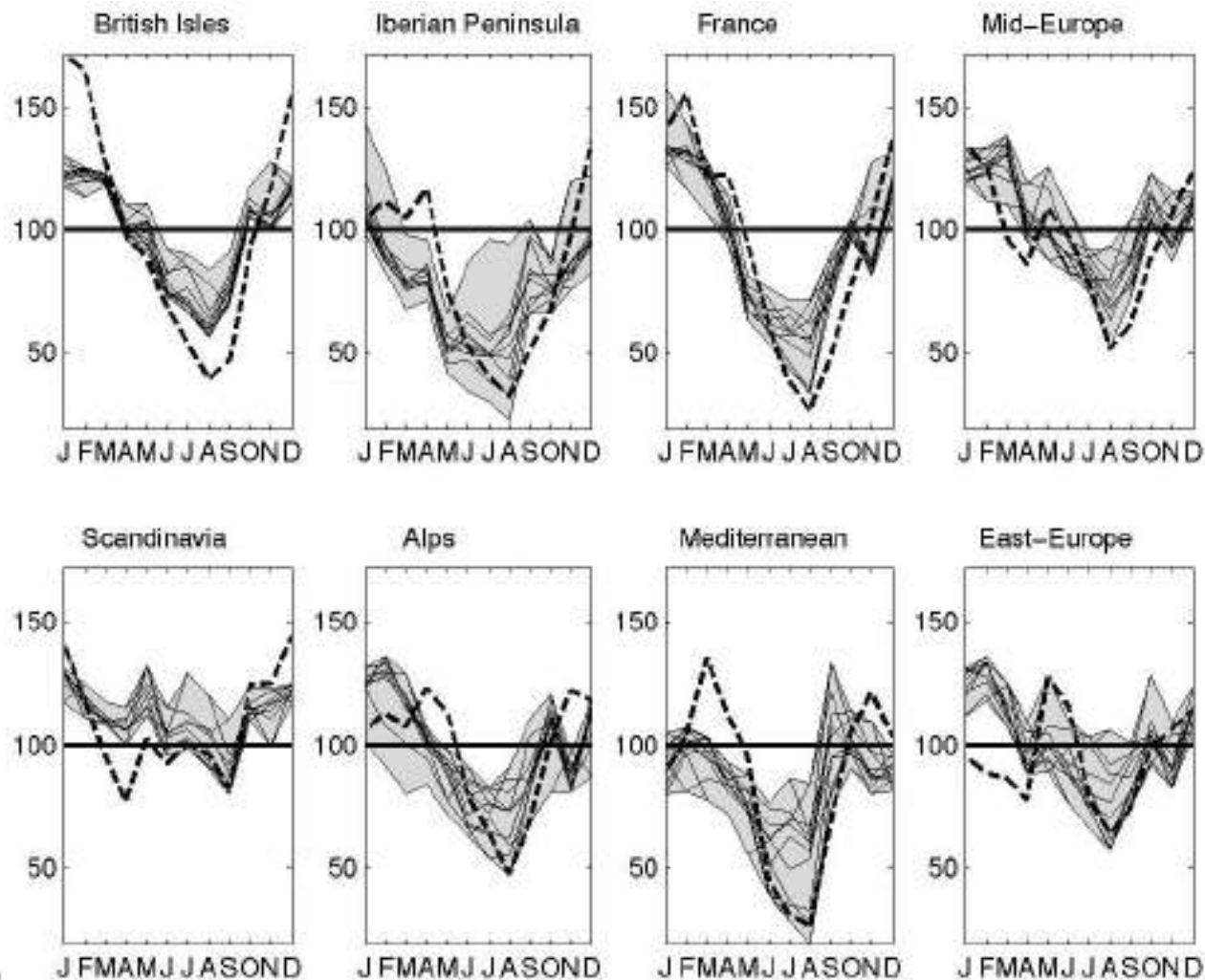


# Global change in precipitation

2080-2099



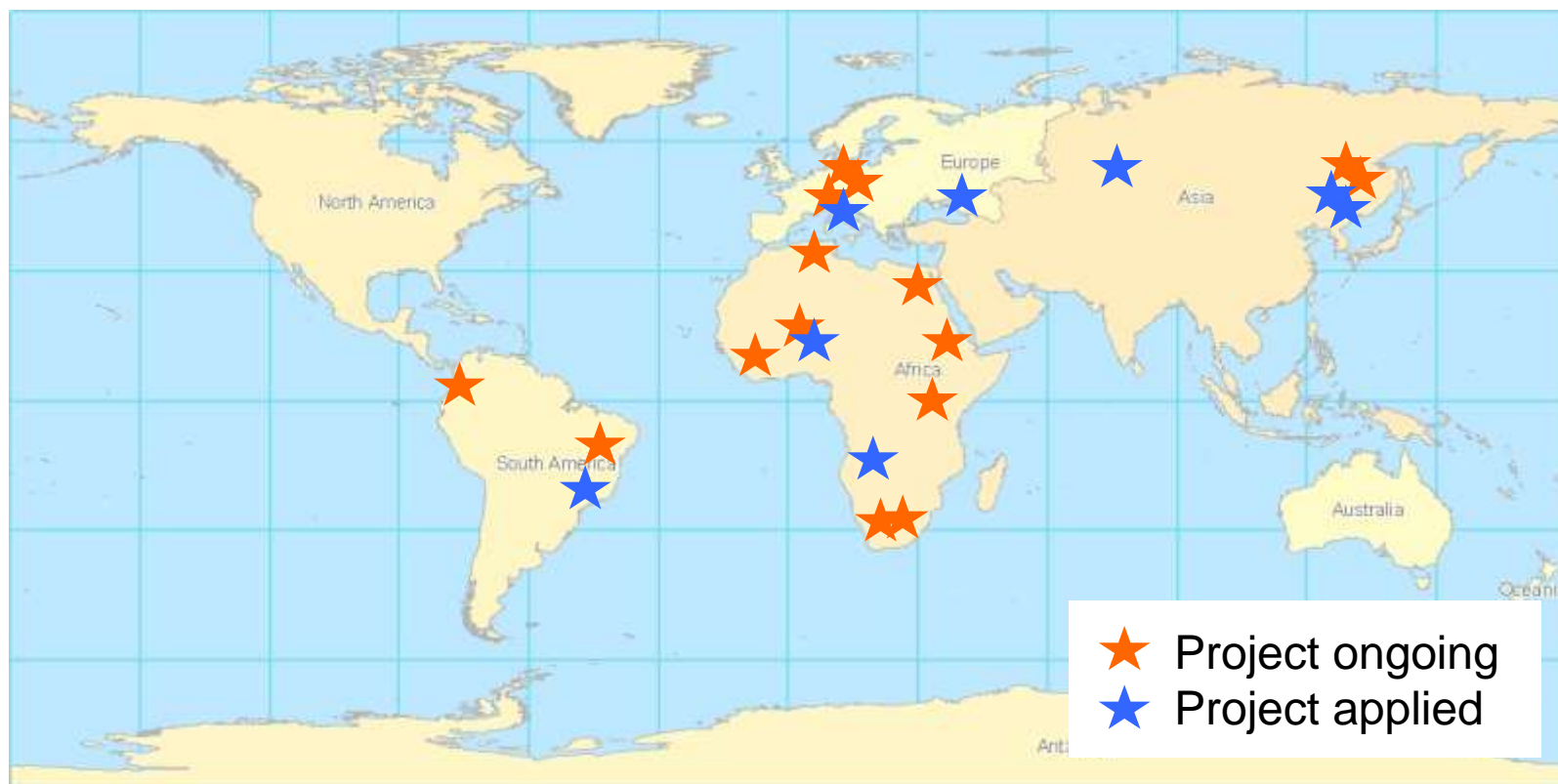
# PRUDENCE: Signal in Precipitation 2071-2100 minus 1961-1990, A2



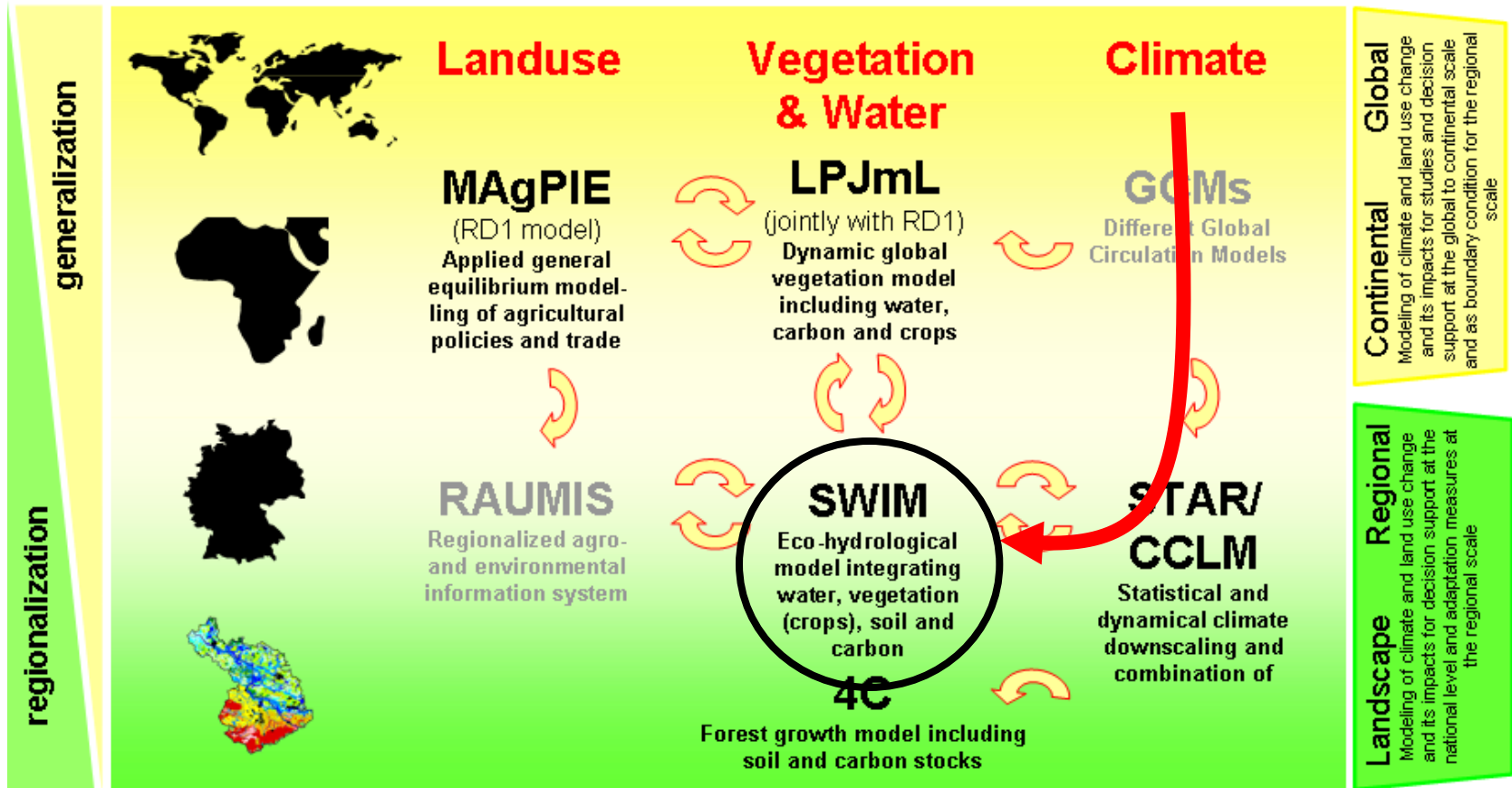


# Climate Impacts in a 2 3 4 Degree World

- Regional investigations worldwide



# PIK Model System



Two way data transfer



One way data transfer

**4C**

Model developed and maintained at PIK

**GCM**

Model developed and maintained by German and international partners, interface and cooperation established



PIK

Fred F. Hattermann



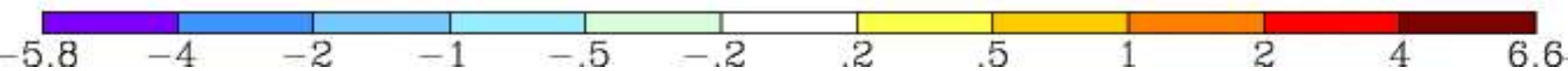
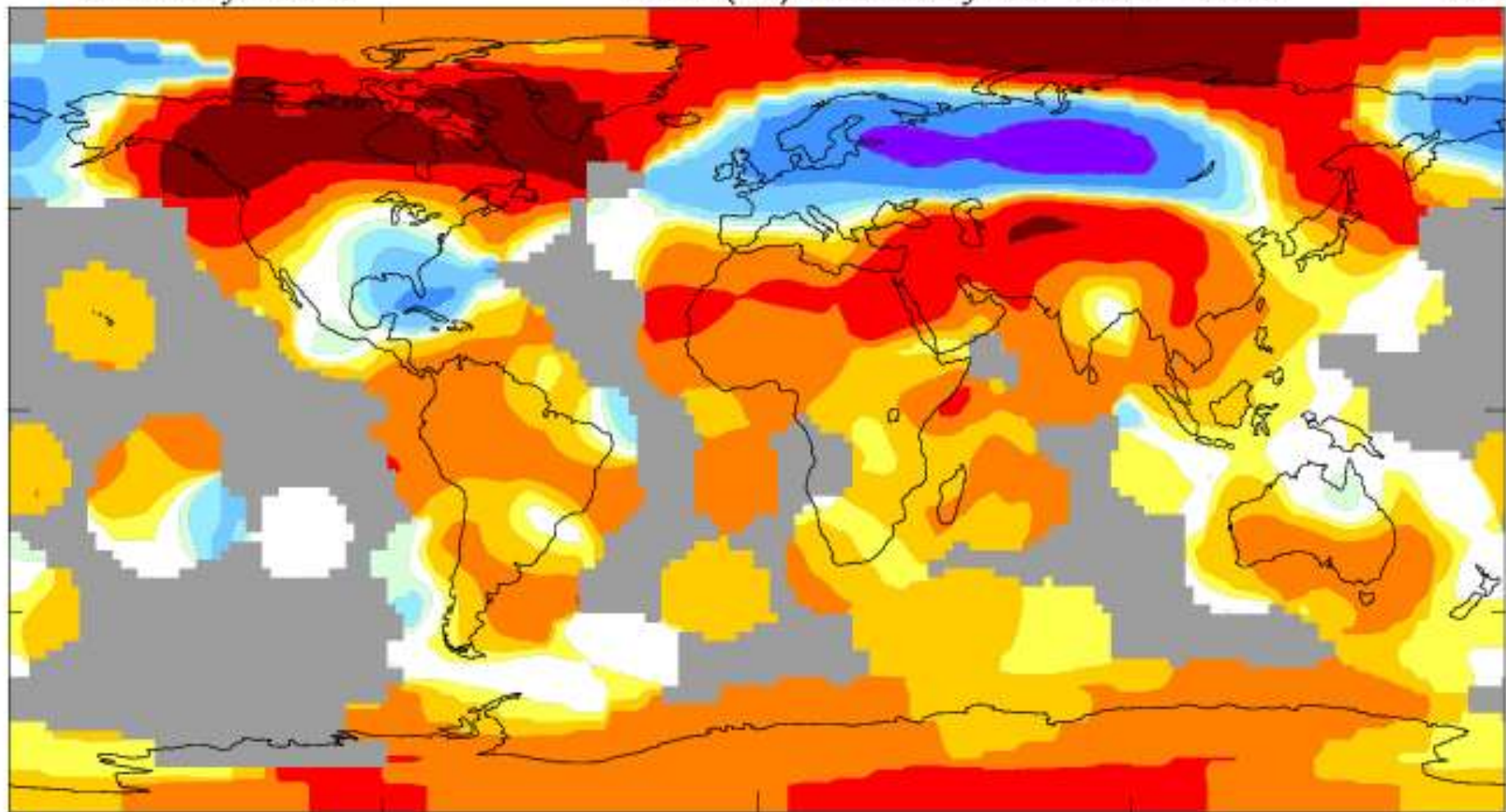
PIK

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January 2010

Tsurf(°C) Anomaly vs 1951–1980

.86

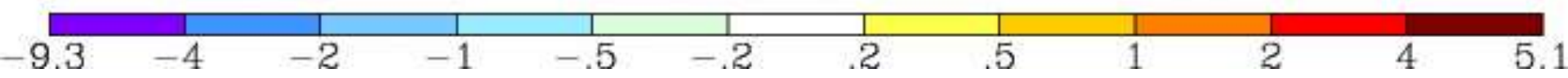
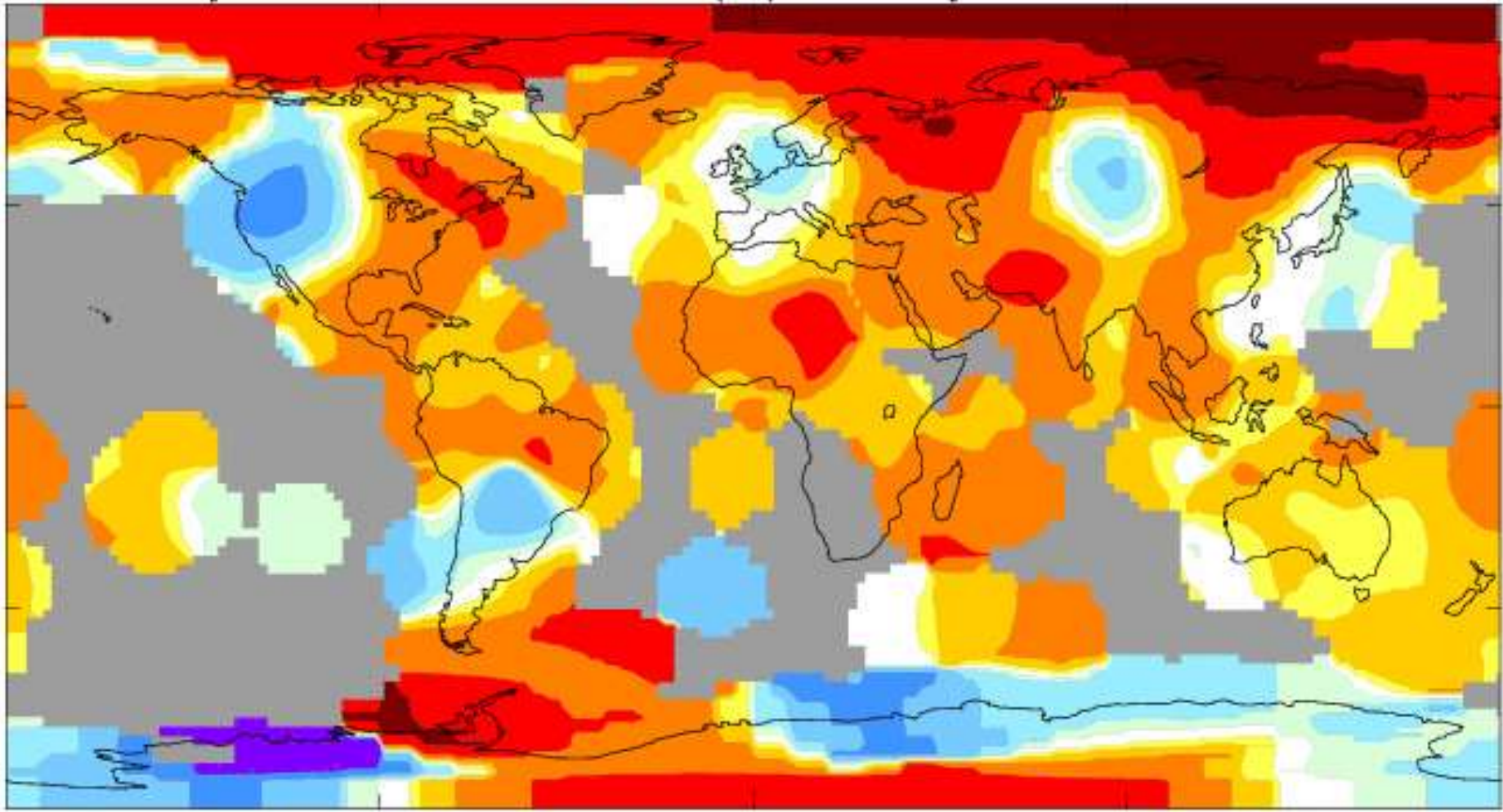


Source: <http://data.giss.nasa.gov/>

May 2010

Tsurf(°C) Anomaly vs 1951–1980

.78



Source: <http://data.giss.nasa.gov/>