



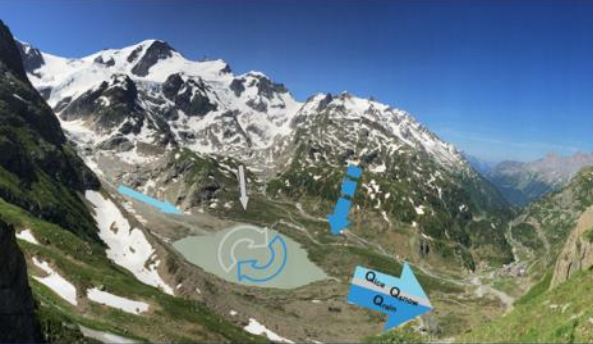
Internationale Kommission für die Hydrologie des Rheingebietes

International Commission for the Hydrology of the Rhine Basin

Impact of climate change on the rain, snow and glacier melt components of streamflow of the river Rhine and its tributaries

Synthesis report

Kerstin Stahl, Markus Weiler, Marit van Tiel, Irene Kohn, Andreas Hänsler, Daphné Freudiger, Jan Seibert, Kai Gerlinger, Greta Moretti



Report No. I-28 of the CHR

# Bias correction of climate model data for hydrological impact modelling

Andreas Hänsler, Kerstin Stahl, Irene Kohn & Markus Weiler

ASGII Symposium

Olten, 01.06.2022



# Identifying the ASGII RCM Ensemble (I)

- Using data from the high-resolution EURO-CORDEX RCM ensemble focusing on the most severe RCP8.5 scenario only
- Only limited number of transient hydrological simulations possible
  - Ensemble size was set to 7 different ensemble members
- Comparability of results from ASGII to previous projects (e.g. Hydro-CH2018, KLIWA)
  - A core ensemble of 4 RCM simulations (2 RCMs forced with 2 GCMs) was identified



**3 additional RCM simulations had to be identified at the start of ASGII**

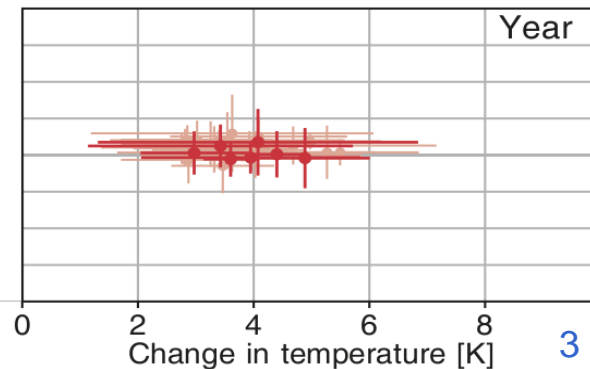
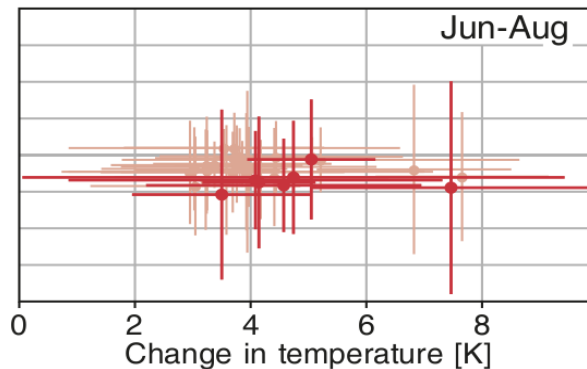
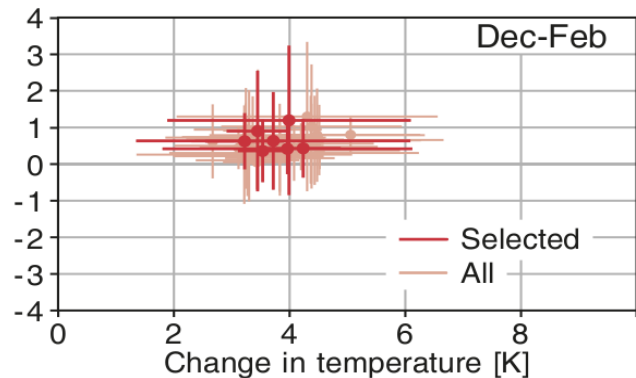
# Identifying the ASGII RCM Ensemble (II)

- ASGII ensemble should reflect the spread in projected changes of the whole EURO-CORDEX ensemble
  - This includes a rather warm/dry outlier simulation
  - Since forcing GCM has major impact on regional CC signal over Europe, final ensemble consist of 2 RCMs and 5 GCMs

**Table 1:** Selected GCM-RCM combinations.

Global climate model	Regional climate model
CCCma-CanESM2	CLMcom-CCLM4-8-17
ICHEC-EC-EARTH	CLMcom-CCLM4-8-17
ICHEC-EC-EARTH	SMHI-RCA4
IPSL-IPSL-CM5A-MR	SMHI-RCA4
MIROC-MIROC5	CLMcom-CCLM4-8-17
MPI-M-MPI-ESM-LR	CLMcom-CCLM4-8-17
MPI-M-MPI-ESM-LR	SMHI-RCA4

Change in precipitation [mm/d]




# Bias RCMs Alpine Region

- Problem: RCM data generally large cold/wet bias over the alpine region mainly in winter
  - Would strongly impact snow accumulation



**Bias–correction needed before data can be used as input for hydrological modelling**

DJF - Temperature  


DJF - Precip  


 Obs

**All other panels:  
Changes  
rel. to  
Obs**

# Bias - Ensemble Mean

**Observations**

**Bias  
uncorrected**

**Mean winter  
temperature**

**Mean annual  
snowfall\***

\* Snowfall is defined as precipitation at days with daily mean temperature  $< 1^{\circ} \text{C}$

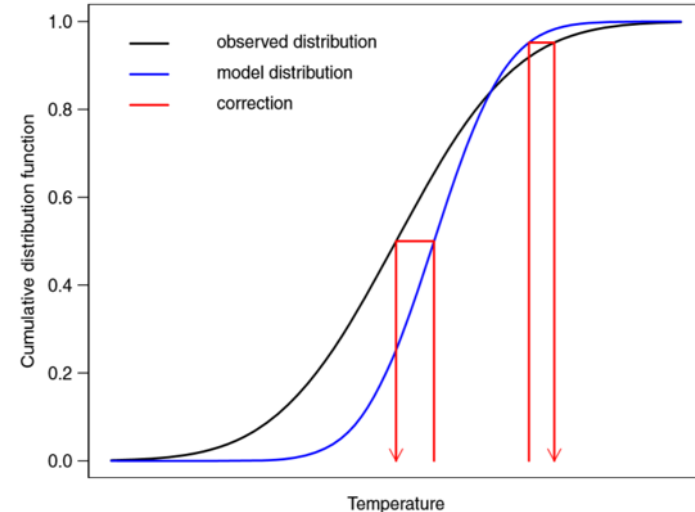
## Challenges

- Removing the bias in the RCM data without:
  - Altering the inter parameter relation (e.g. temperature and rainfall on a snow day)
  - Changing the seasonality of the data
  - Changing the projected climate change signals of the RCM projection
  - Adding new extreme values to the RCM data

## Solution

- Multi-variate, trend conserving quantile mapping bias correction method was applied for the different seasons -> *tas*, *pr*, *humidity*, *rad* were corrected simultaneously
- Results were analyzed for a large set of climate indices -> *single & multi-parameter indices*

## Principle behind QM: matching CDFs



# Bias - Ensemble Mean

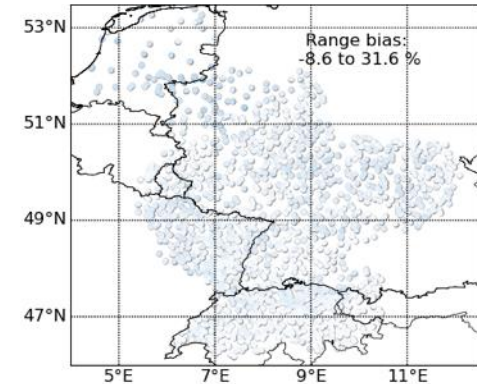
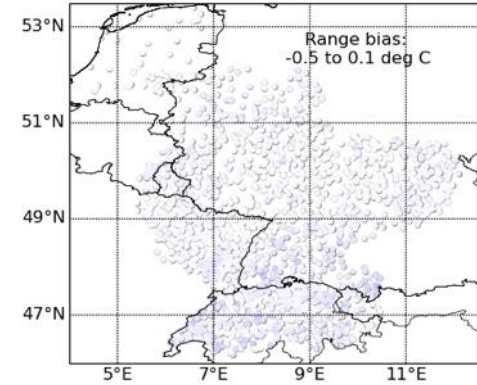
Observations

Bias  
uncorrected


Remaining Bias  
corrected

Mean winter  
temperature

Mean annual  
snowfall\*



# Impact of BC on CC signal

- Visual comparison of cc signal at end of century before and after correction (whole basin) 

## Summary BC

- Large amount of RCM-bias removed
  - For individual indices, univariate correction might be better
  - But if interplay between parameters is important (e.g. hydrological models) multi-variate correction is better
- Trends and extremes of RCM data are mostly preserved

Index	EM 1	EM 2	EM 3	EM 4	EM 5	EM 6	EM 7
cdd_p95	X	~	~	~	~	~	~
dday_SUMMER	X	~	~	~	~	~	~
fday	✓	✓	✓	✓	✓	✓	✓
g30mmday	✓	✓	✓	✓	✓	✓	✓
heatday	✓	✓	✓	✓	✓	✓	✓
p5	✓	✓	✓	✓	✓	✓	✓
p95	~	✓	✓	✓	✓	✓	✓
pr_DJF	✓	✓	✓	✓	✓	✓	✓
pr_JJA	✓	✓	✓	✓	✓	✓	✓
pr_YEAR	✓	✓	✓	✓	✓	✓	✓
psum_hot	~	~	~	~	~	~	~
psum_warm	~	~	~	~	~	~	~
samount	~	~	~	~	~	~	~
sday	~	~	~	~	~	~	~
sdd_p95	✓	✓	✓	✓	✓	✓	✓
summerday	~	~	~	~	~	~	~
tas_DJF	✓	✓	✓	✓	✓	✓	✓
tas_JJA	✓	✓	✓	✓	✓	✓	✓
tas_YEAR	✓	✓	✓	✓	✓	✓	✓
zdays	~	~	~	~	~	~	~

~: almost no difference; ~: moderate difference; X: substantial difference



# Projected future climate – ensemble mean

Reference

Projected changes  
Far future

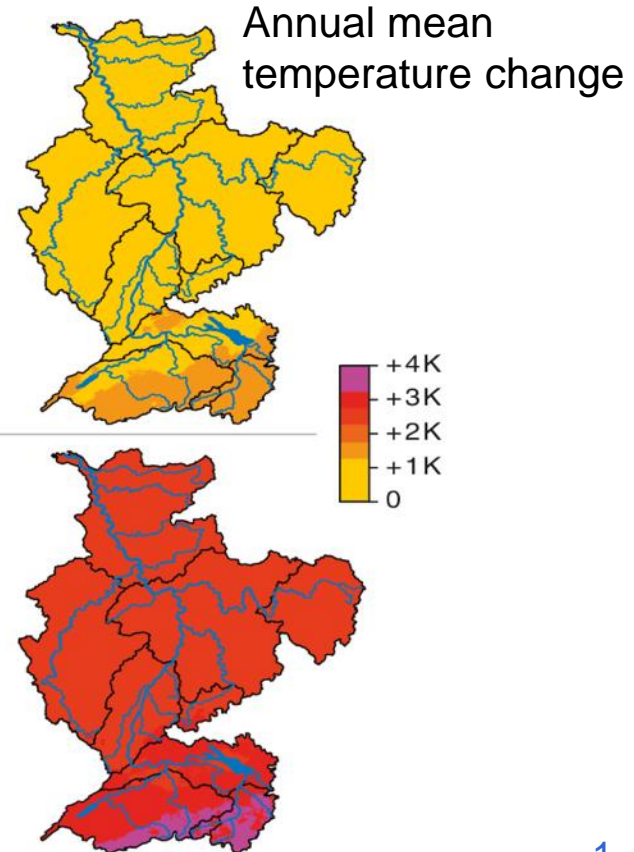
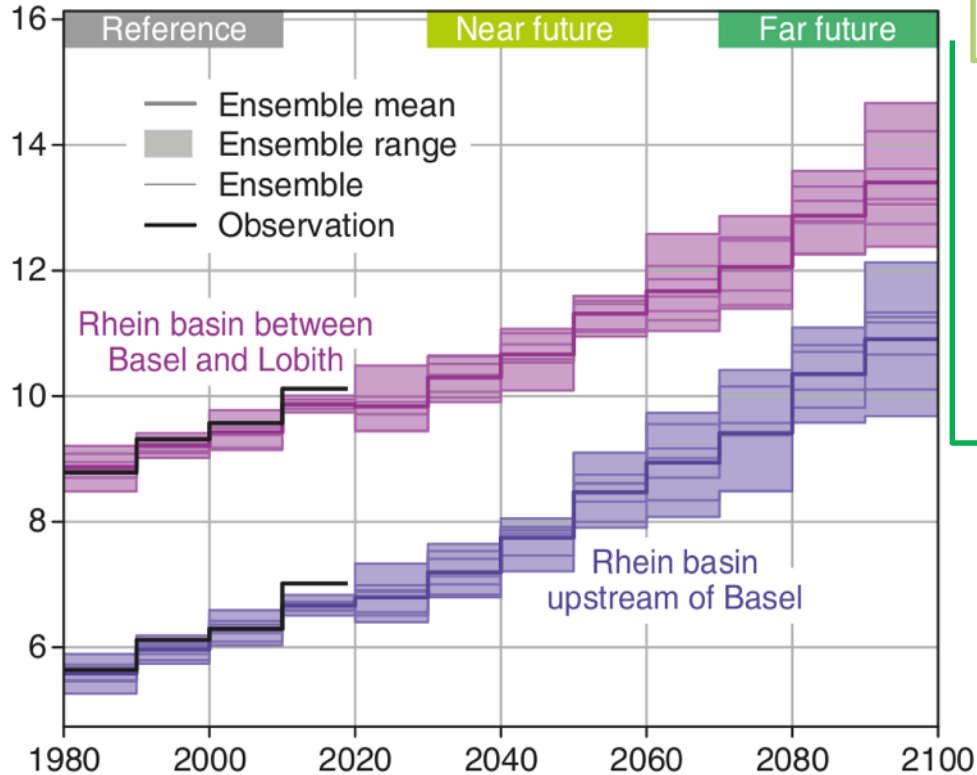
Mean annual  
snowfall\*

Mean number  
of frost days

\* Snowfall is defined as  
precipitation at days with daily  
mean temperature  $< 1^{\circ} \text{C}$

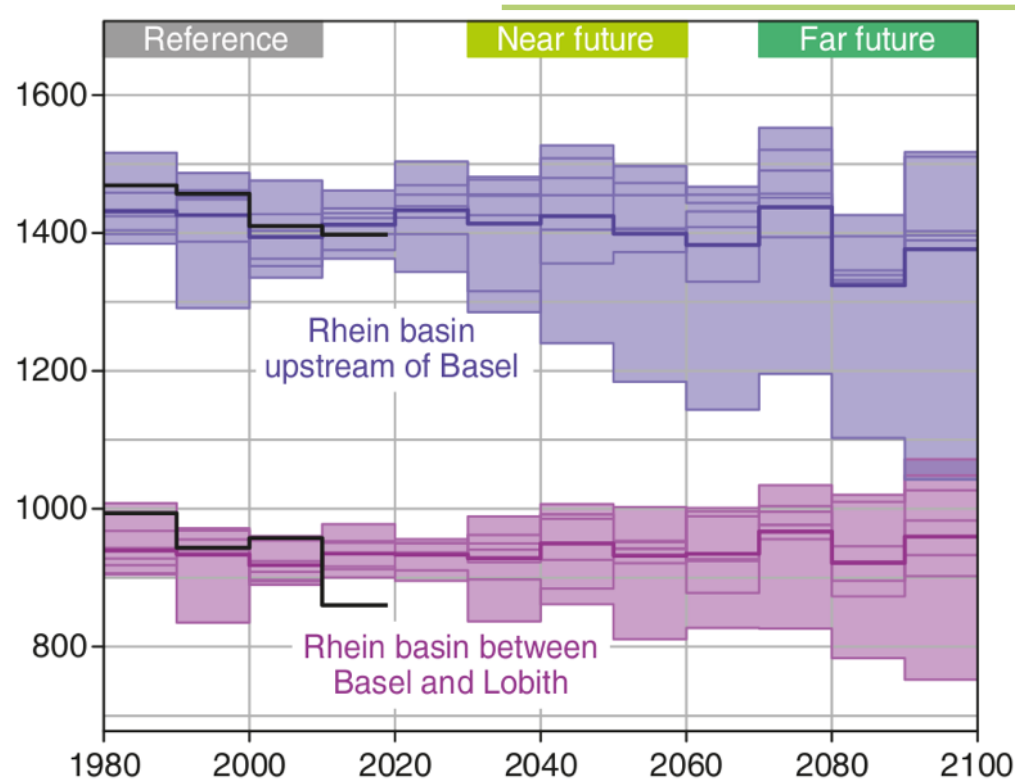
# Projected future climate – range & map of ensemble mean T

Temperature [°C]



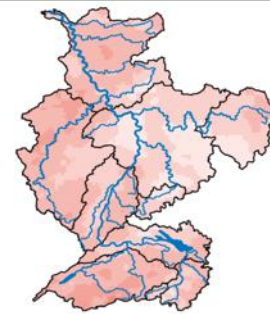
# Projected future climate – range & maps of ensemble mean P

Precipitation [mm]



Summer

Precipitation summer half-year



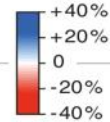
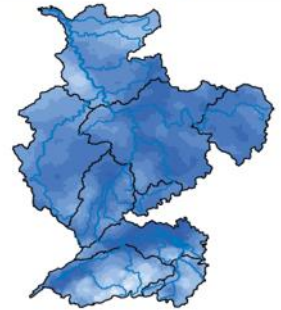
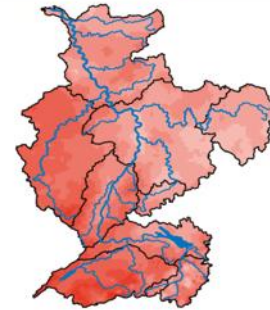
Change near future

Winter

Precipitation winter half-year

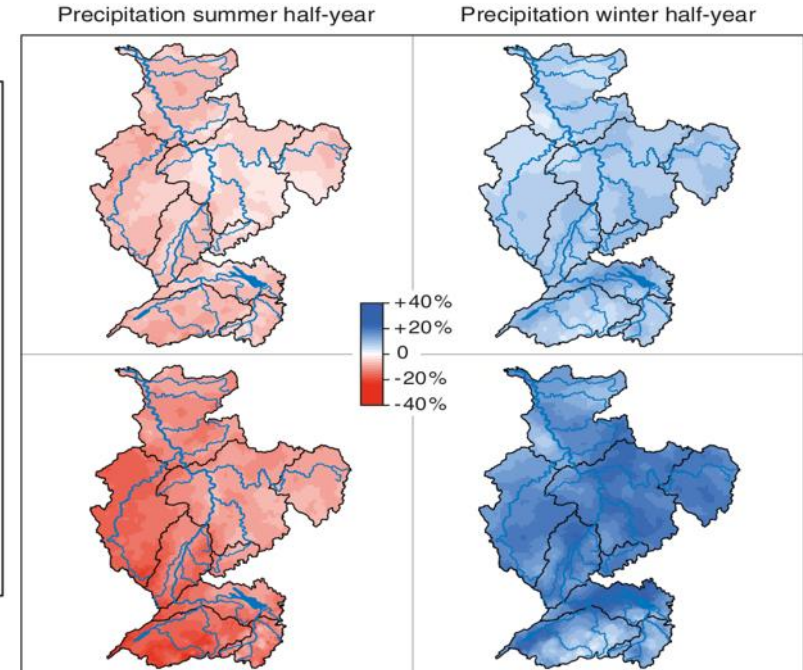
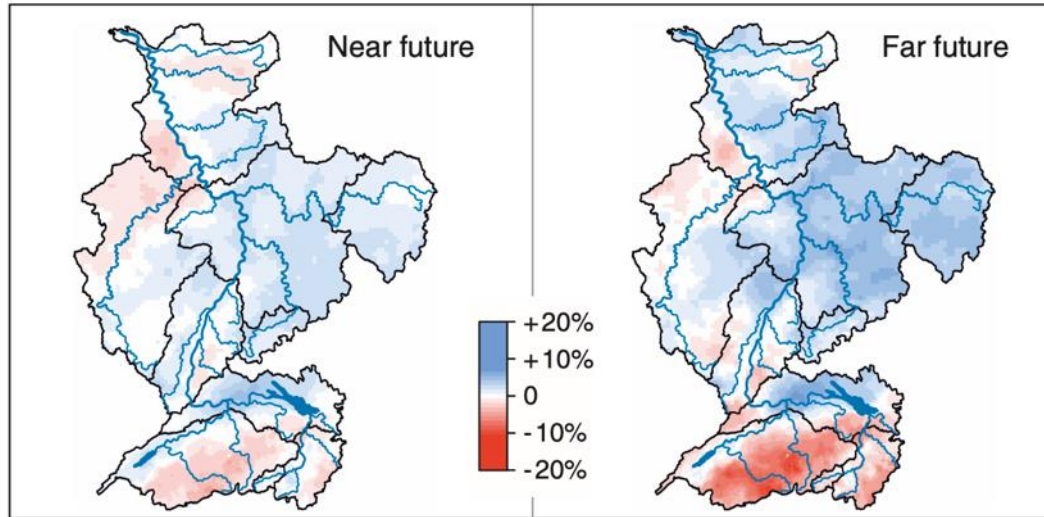


Change far future



# Projected future climate – maps of ensemble mean P

→ important pattern: annual P change!

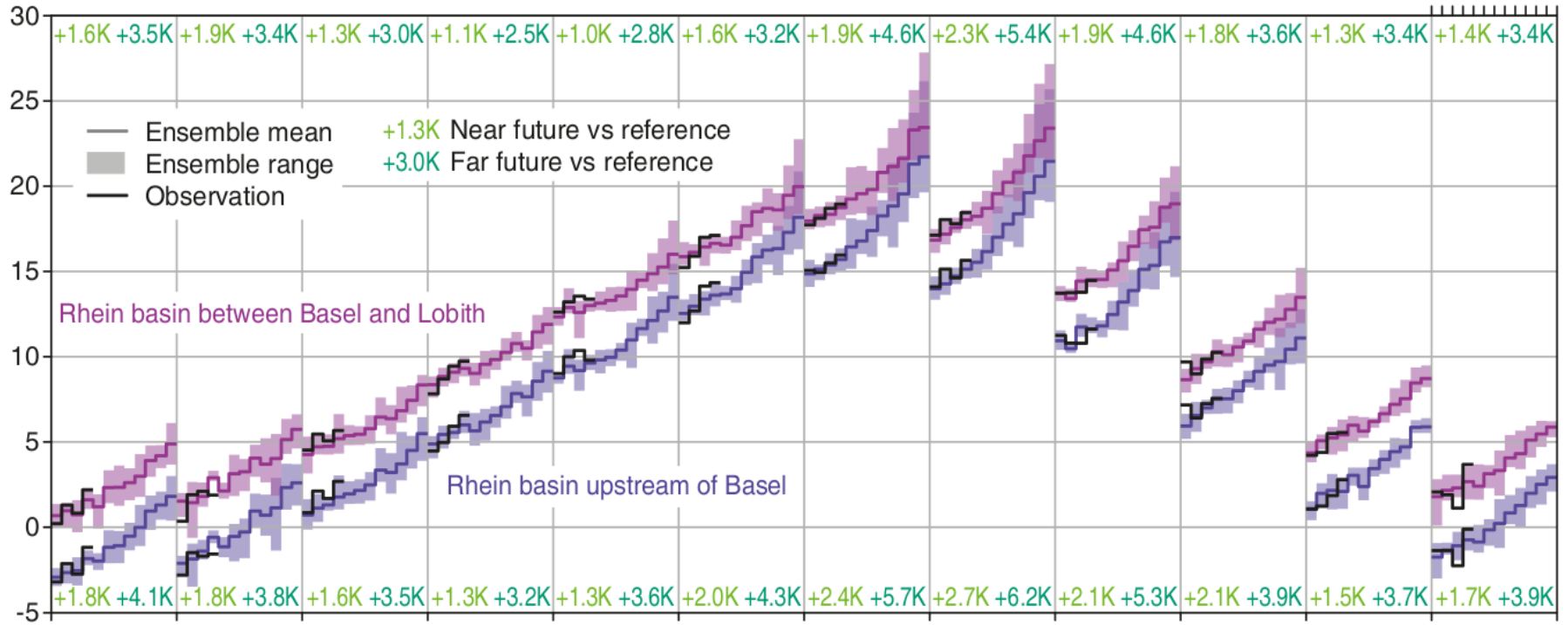


- ASGII Climate model ensemble selected to guarantee comparability to previous activities in the Rhine basin and to reflect the spread of projected changes of the full EURO-CORDEX ensemble
- Bias correction using multi-variate QM method lead to substantially less biased RCM data thereby conserving inter-parameter dependencies as well as projected trends and extremes
- The ensemble represents already known patterns of projected changes like:
  - Substantial increase in projected air temperature in the range from +4 to +8K by the end of the century
  - An increase in winter precipitation but a decrease in summer precipitation
  - Connected to these changes are e.g. an increase in heat waves, a decrease in the number of frost days as well as a decrease in projected snowfall amounts

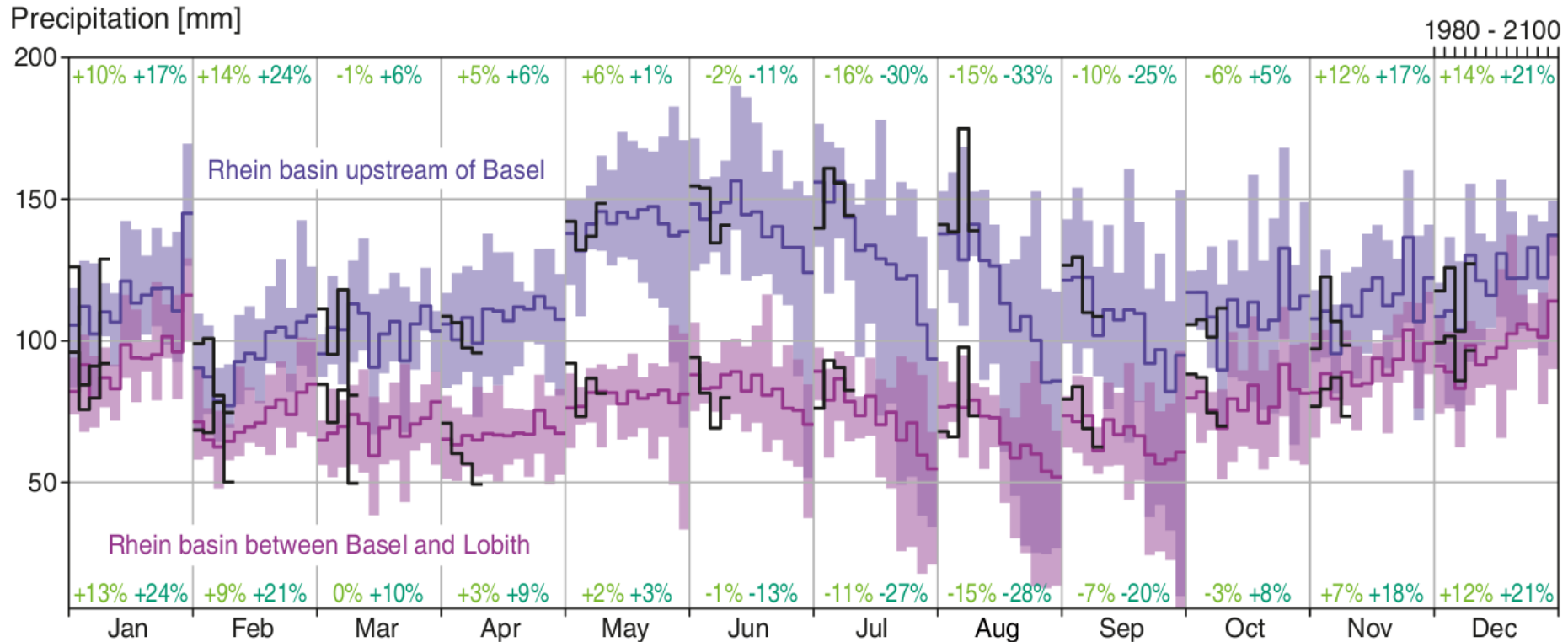
Backup Slides

# Projected seasonal changes

Temperature [°C]



# Projected seasonal changes



**Figure 7:** Time series 1981–2100 for each month in each compartment: 10-year averages of mean monthly temperature (upper) and precipitation sum (lower), averaged in space for the Rhine basin upstream of the gauge Basel and for the Rhine basin between gauges Basel and Lobith; black lines show the observed climate data until 2019.