

Regionalisation of statistical model outputs creating gridded data sets for Germany

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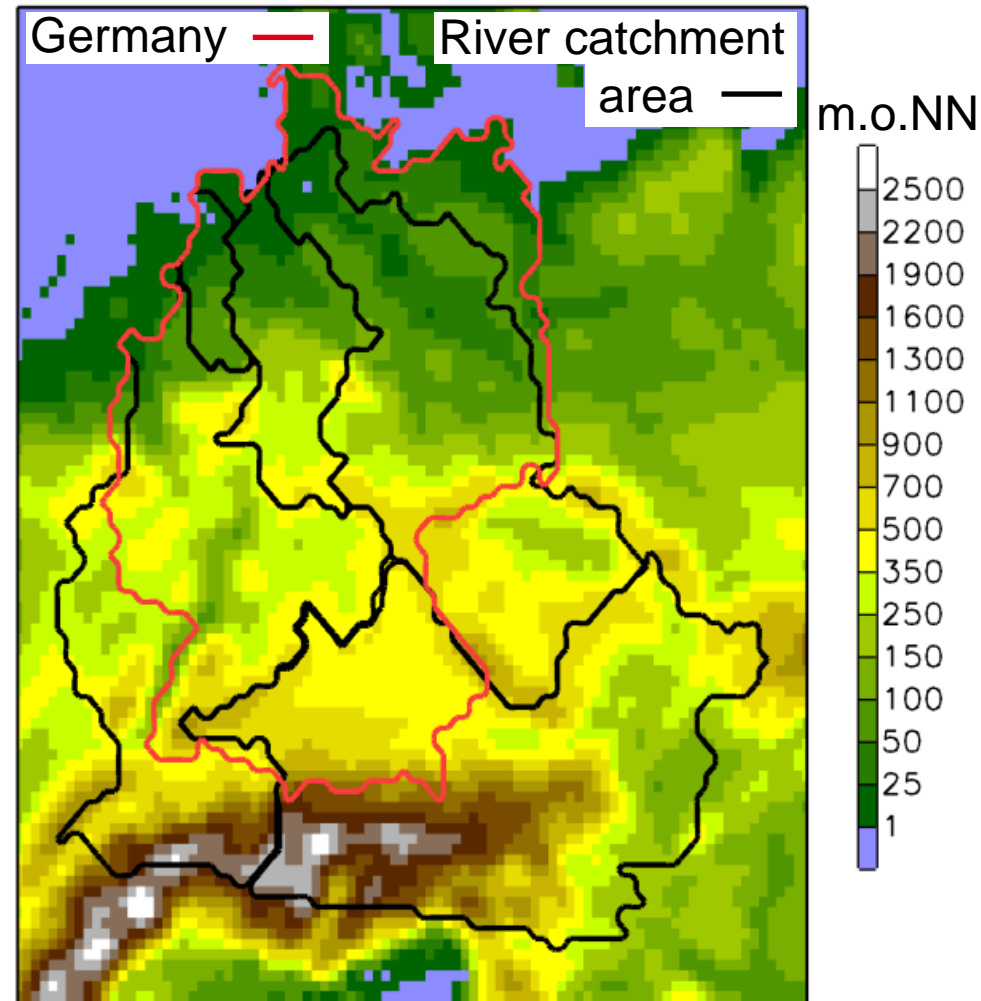
ReKliEs-De
Regionale Klimaprojektionen Ensemble
für Deutschland



ReKliEs-De (Regionale Climate projections ensemble for Germany)

Objectives:

- Providing **robust information** about the **range** and the **extremes** of future climate change in Germany and its river catchment areas in a high spatial resolution ($12.5 \times 12.5 \text{ km}^2$)



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- Enlarging the **CORDEX-EUR11 ensemble** with more dynamical and statistical climate simulations
- Analysing possible **systematical differences** between the results of statistical and dynamical climate models

<http://reklies.hlnug.de/>

GCM + RCP	CCLM	REMO	WRF	WR'10	STARS
MPI-ESM-LR RCP 2.6					
MPI-ESM-LR RCP 8.5		CORDEX			Klimafolgen-Online
CNRM-CM5 RCP 8.5	EURO -				
HadGEM2-ES RCP 8.5	EURO	ReKliEs-De simulations			
EC-EARTH RCP 8.5					
CanESM2 RCP 8.5					
MIROC5 RCP 8.5					

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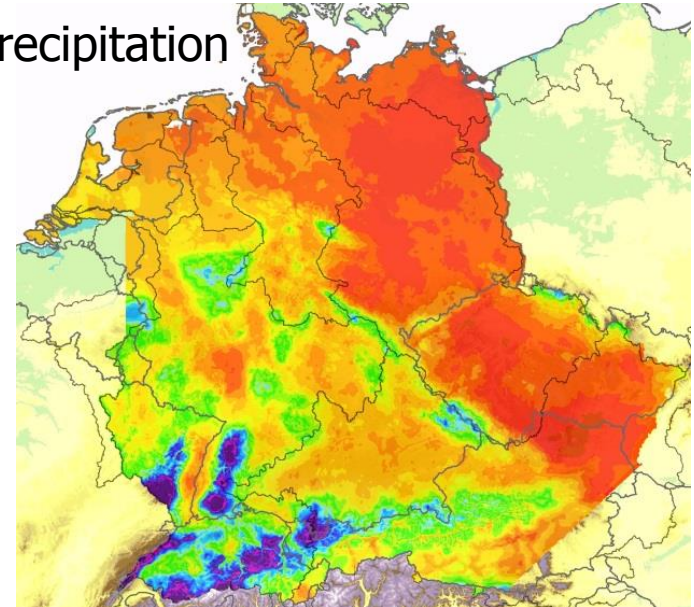
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HYRAS reference data set

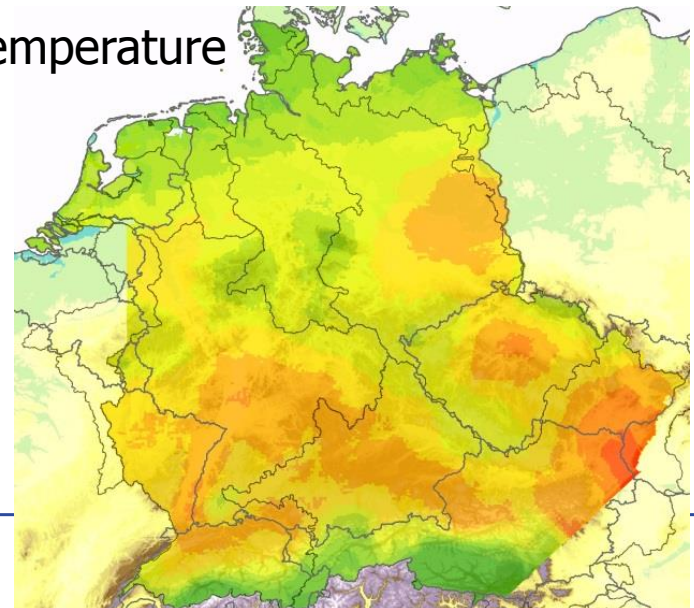
HYRAS („HYdrologische **R**ASTERdaten“; hydrological gridded data set):

- High-resolution gridded station data
DWD/BFG-HYRAS
- 3 variables on daily basis between 1951 and 2006 (5 x 5 km²)
 - precipitation (max. 6200 stations)
 - mean temperature (max. 1000)
 - relative humidity (max. 800)
- In progress:
 - more variables
 - temporal extension

precipitation



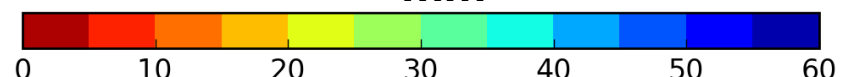
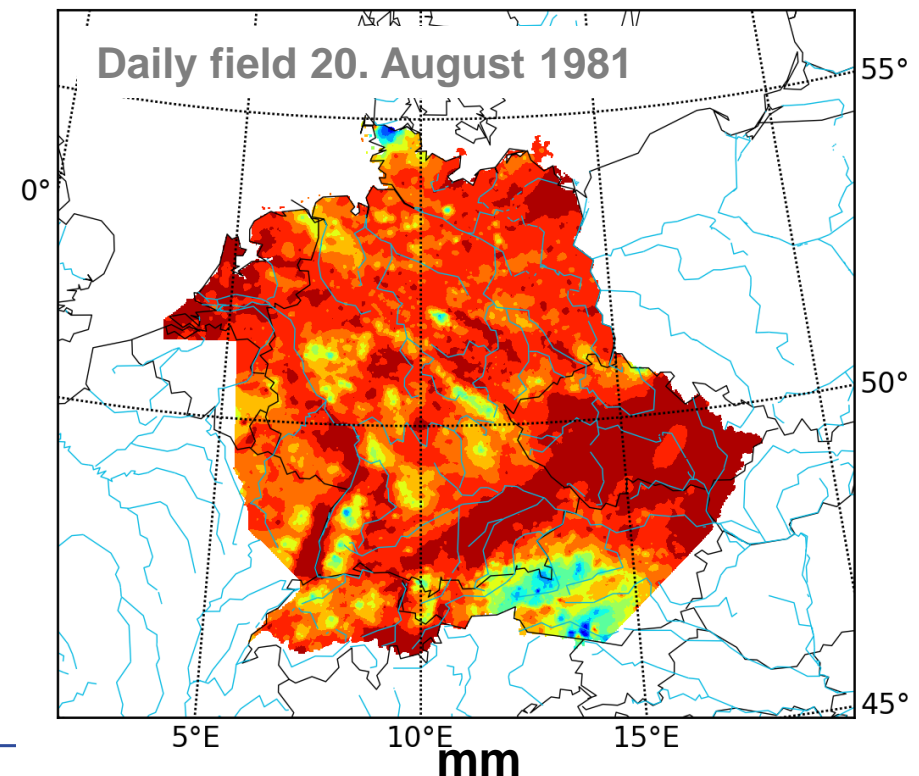
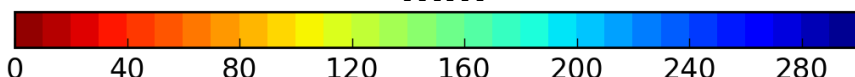
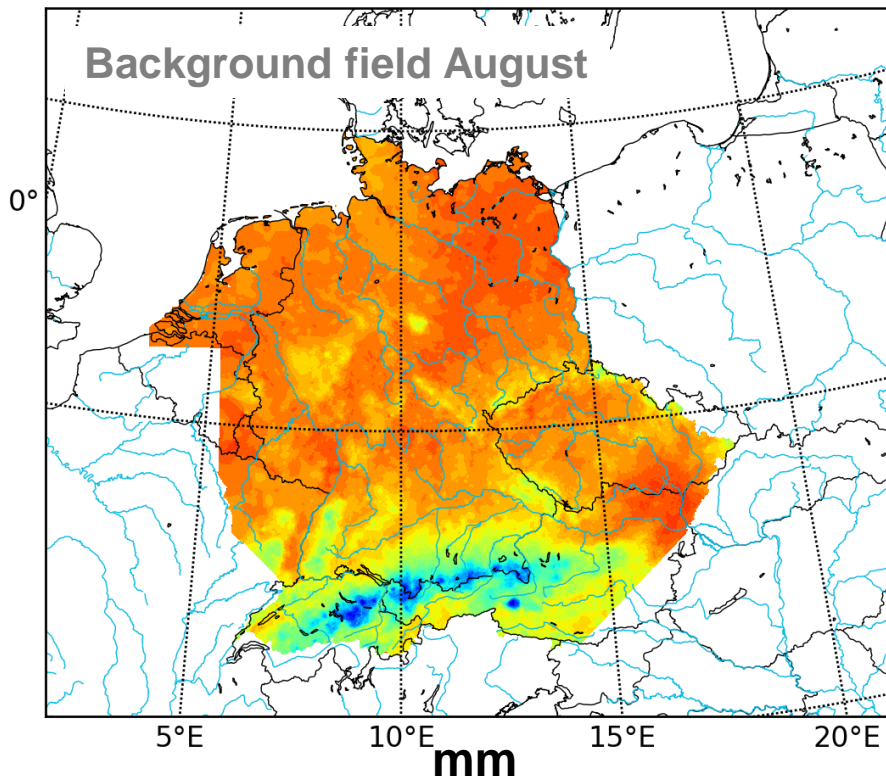
temperature



Regionalisation method for precipitation

REGNIE method („**REG**ionalisierung der **NIE**derschlagshöhen“; regionalisation of precipitation heights):

1. Calculation of climatological background fields on a monthly basis
2. Calculation of the daily values



Regionalisation method for precipitation

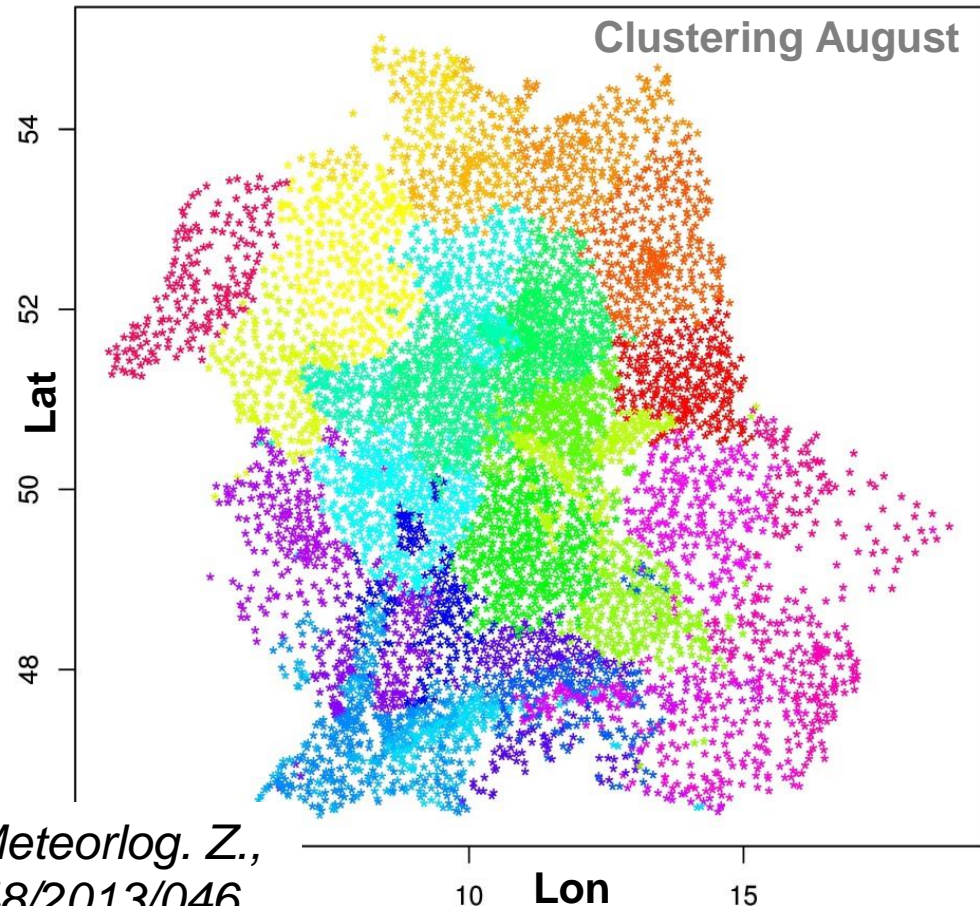
REGNIE method („**REG**ionalisierung der **NIE**derschlagshöhen“; regionalisation of precipitation heights):

1. Calculation of climatological background fields on a monthly basis

- Cluster analysis
- Multiple linear regression
- Inverse distance weighting (IDW)

2. Calculation of the daily values

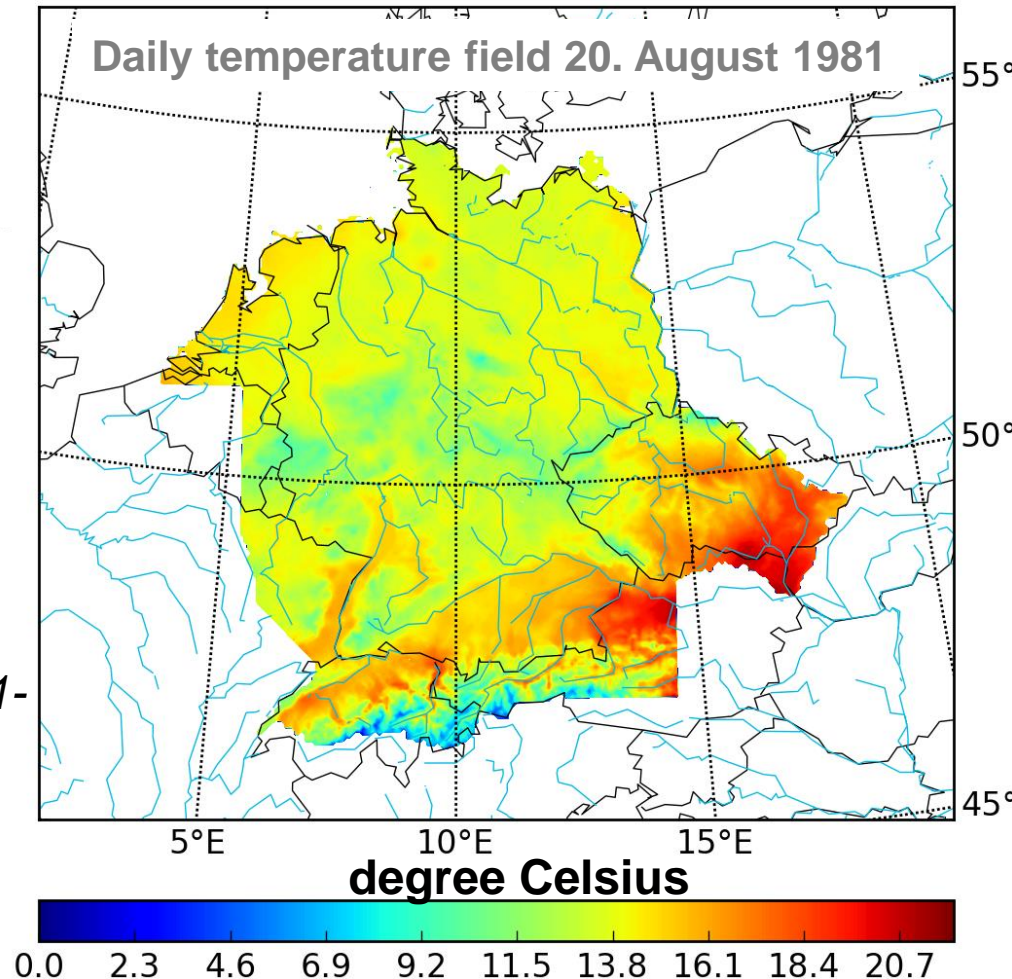
- Allocation of station values to nearest grid cell
- IDW of ratio of station values and background values on grid cell
- Daily values: ratio x background
- ➔ **Station data are conserved on final grid**



Regionalisation method for mean temperature and relative humidity

Optimal Interpolation method:

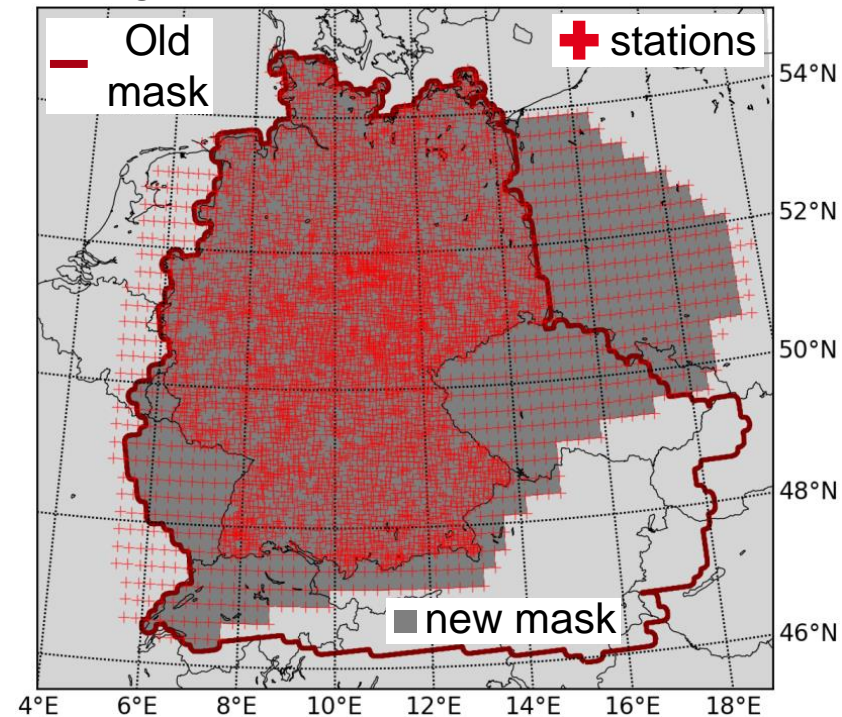
- Operational use of the Optimal Interpolation method in the **SNOW-Modell Version 4** of DWD (forecast of snow cover)
- More about the method in *Frick et al. (2014), Meteorolog. Zeitschr., Central European high-resolution gridded daily data sets (HYRAS): Mean temperature and relative humidity, DOI: 10.1127/0941-2948/2014/0560*



Application of the HYRAS methods to the statistical WETTREG model

WETTREG („**WETT**erlagenbasierte **REG**ionalisierung“;
regionalisation based on circulation patterns):

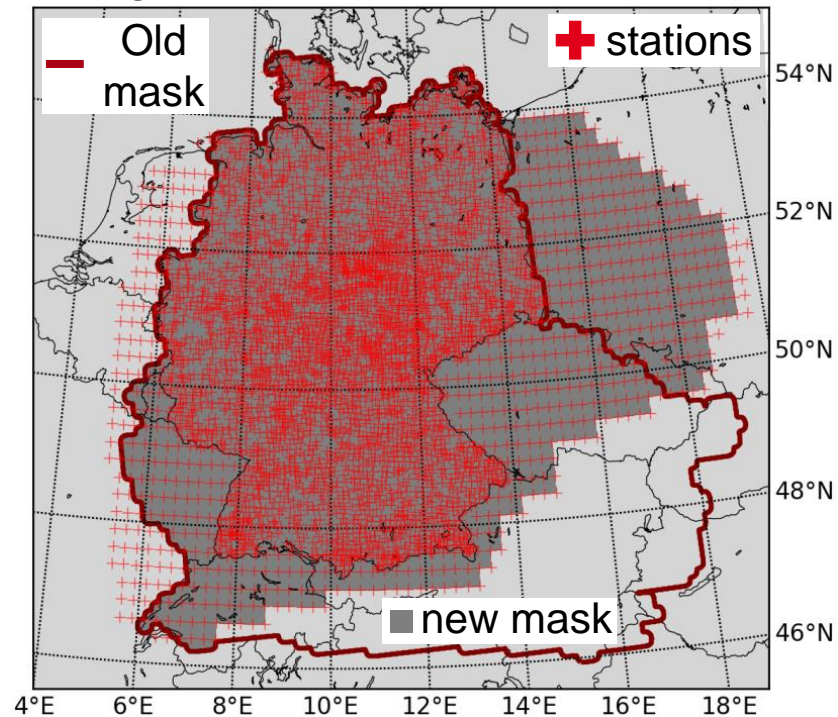
- Output station based (1951 – 2100)
- 7 model runs with 10 realisations
- Within Germany: climate stations (403) and precipitation stations (3248)
- Outside of Germany: EOBs data (gridded data set of about 28 x 28 km²)
- Adjustment of the ReKliEs-De mask
- Regionalisation of the WETTREG output with adjusted HYRAS methods



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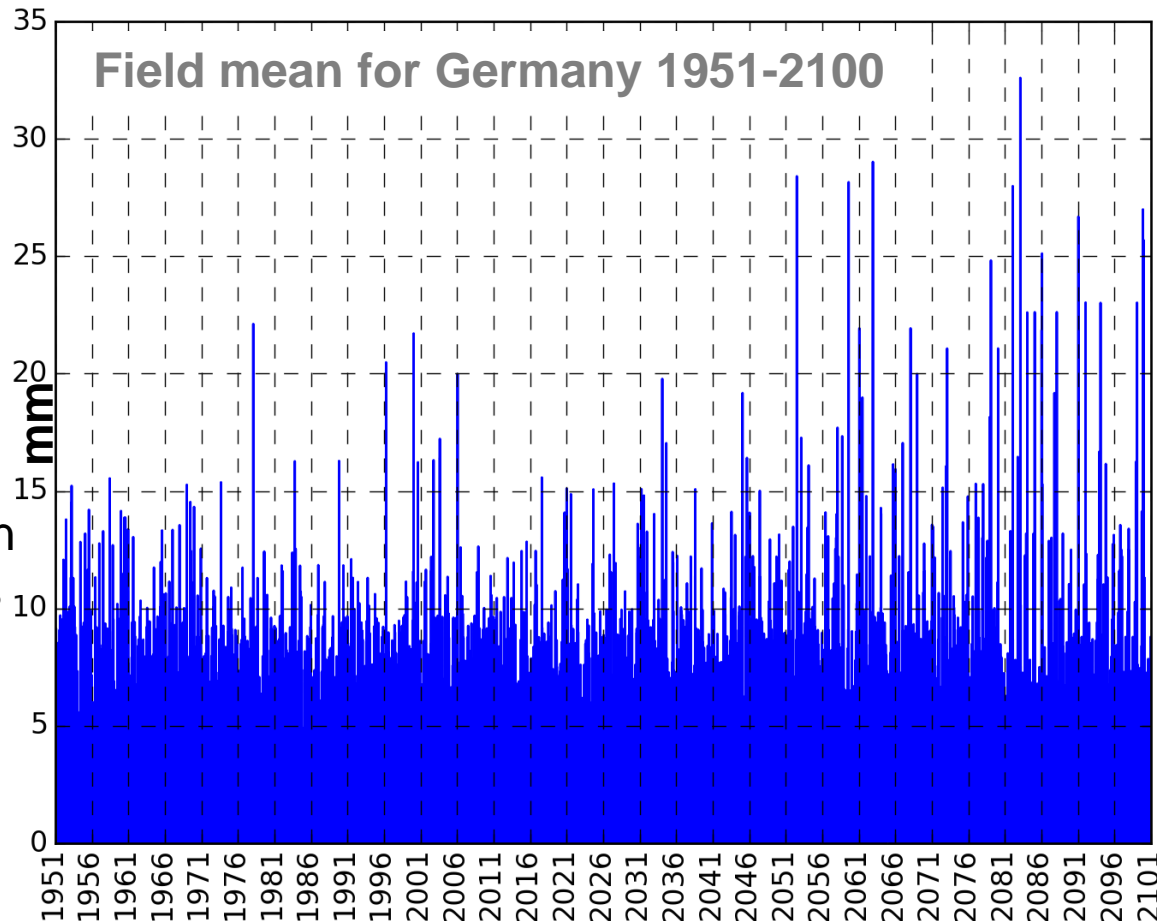
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**Comparability of dynamical und statistical models
Enlarging the ReKliEs-De ensemble**

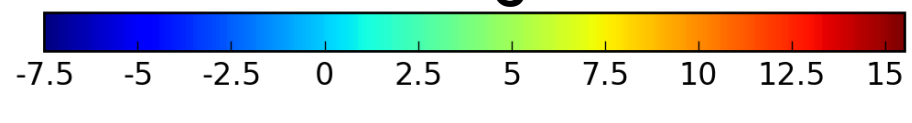
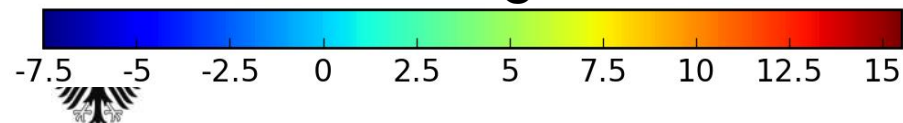
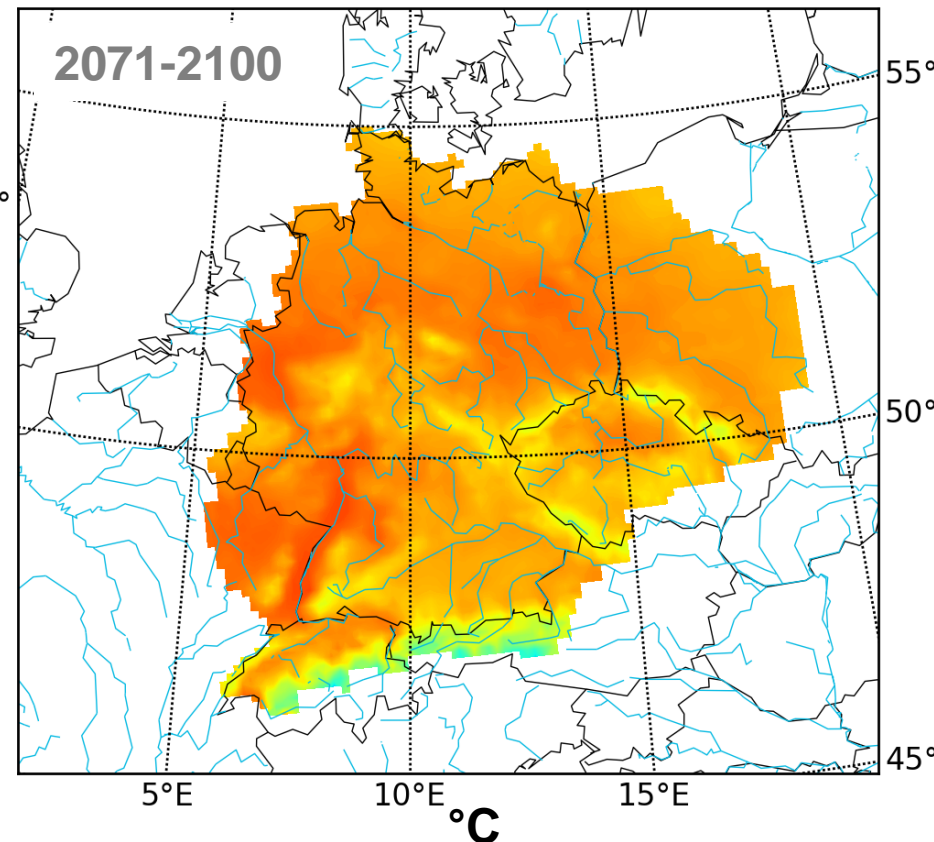
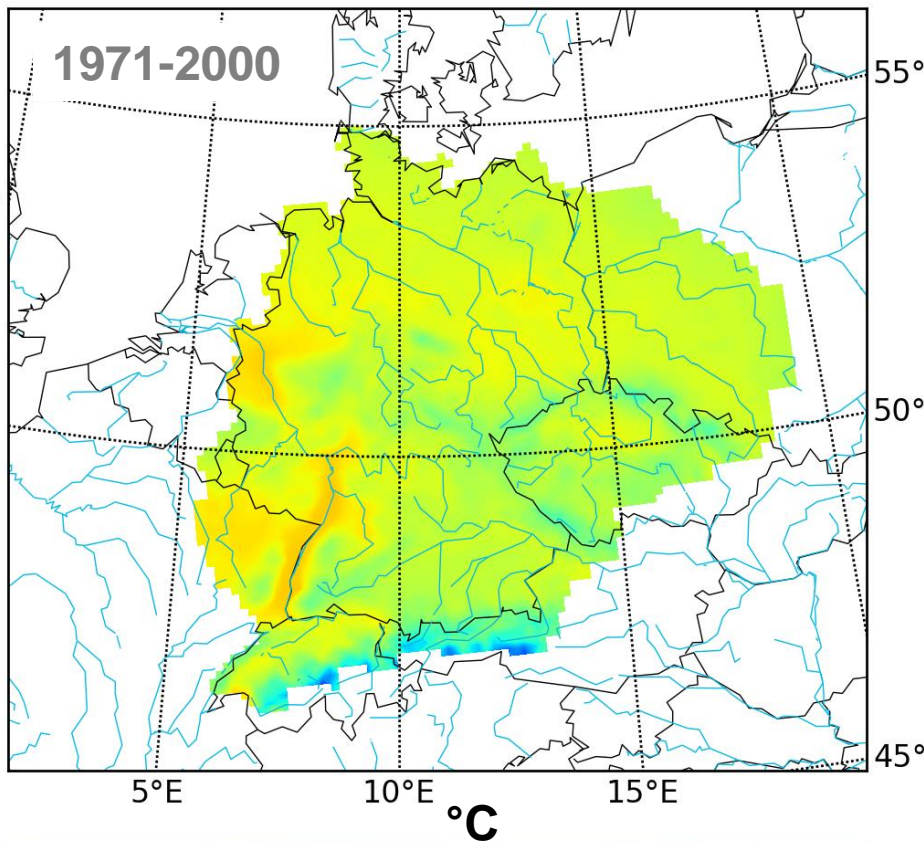
First results: precipitation WETTREG (CNRM-CM5, RCP 8.5)

- Calculation of the field mean for Germany (daily values) over the whole simulation period
- High variability of daily precipitation
- Increasing frequency of extreme precipitation events in this WETTREG simulation (as of 2nd half of 21st century)
- Increase of precipitation amount per extreme precipitation event



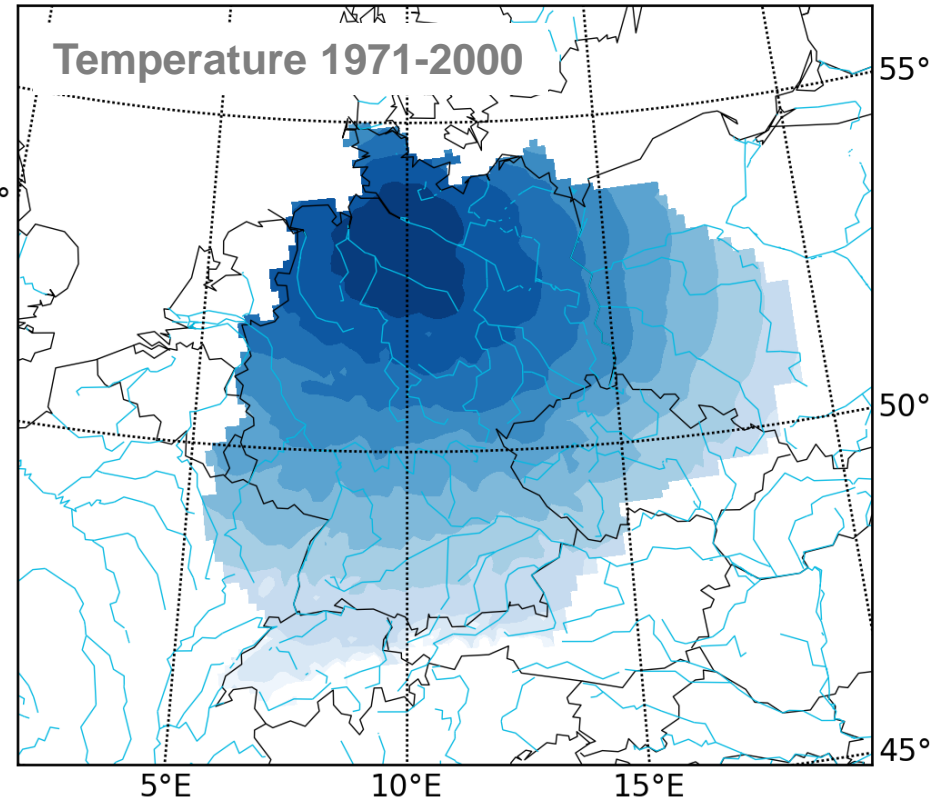
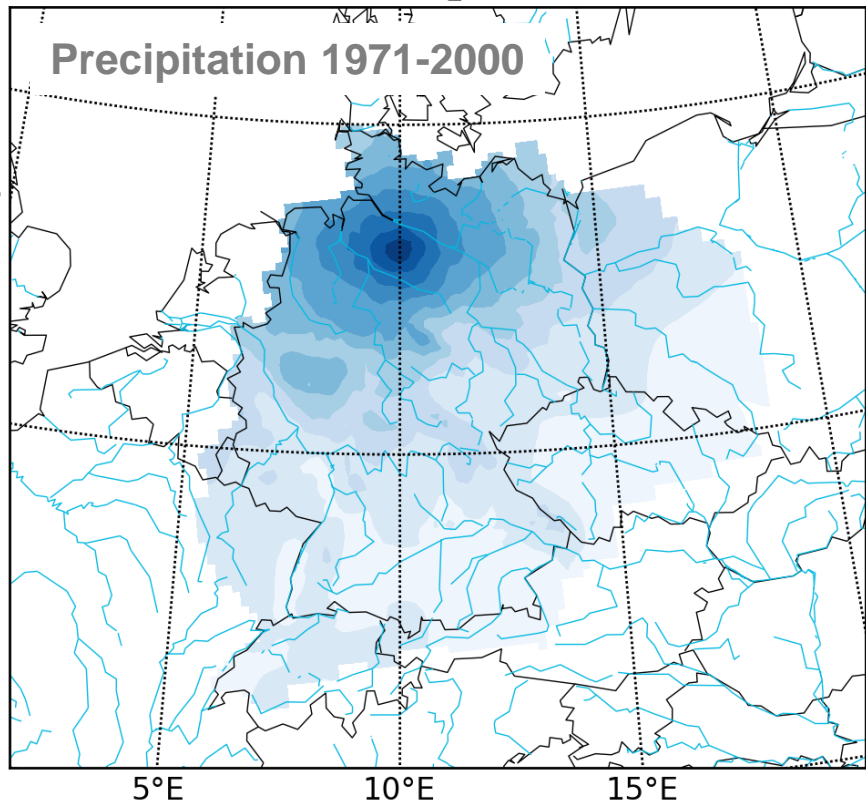
First results: Mean temperature WETTREG (CNRM-CM5, RCP 8.5)

- Long-term **temperature** mean for present and future conditions (WETTREG)
- Future temperature increase



Plausibility of gridded model output

- Correlation matrix for precipitation and temperature



Summary

Transfer of HYRAS regionalisation methods to the output of the statistical climate model WETTREG:

- Gridded model results are plausible
- Comparability of statistical and dynamical model simulations
- Joint analysis of statistical and dynamical model outputs

Outlook:

- Analysis of the ReKliEs-De ensemble for future climate
- Analysis of robustness of the ensemble

**ReKliEs-De user workshop
June 14th/15th 2016 in Potsdam
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Summary

Transfer of HYRAS regionalisation methods to the output of the statistical climate model WETTREG:

- Gridded model results are planned
- Comparability of statistical outputs
- Joint analysis of model outputs

Thank you for your attention!

Outlook:

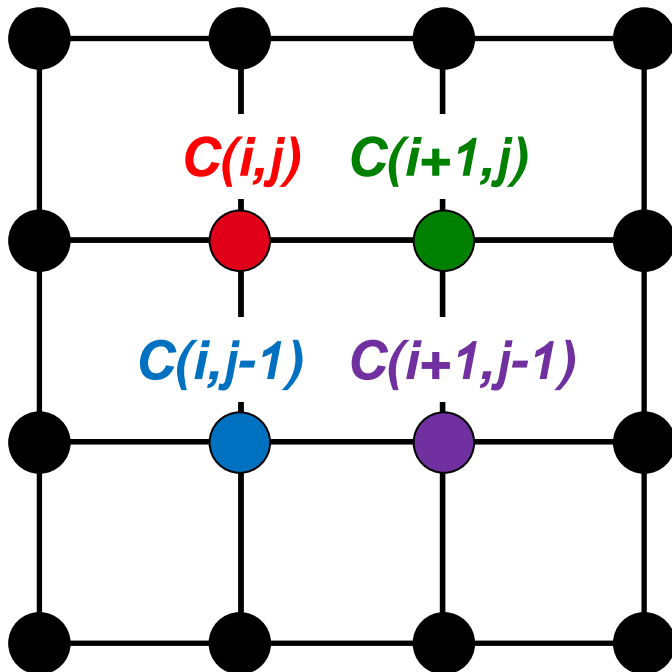
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Plausibility of gridded model output

Calculation of correlation matrix C for all ReKliEs-De grid points:

- Selection of a single grid point $P(i, j)$
- Selection of a specific period (e. g. 1971-2000)
- Calculation of the correlation of grid point $P(i, j)$ to any other grid point



$$C(i, j) = \text{corr}(P(i, j), P(i, j))$$

$$C(i + 1, j) = \text{corr}(P(i, j), P(i + 1, j))$$

$$C(i, j - 1) = \text{corr}(P(i, j), P(i, j - 1))$$

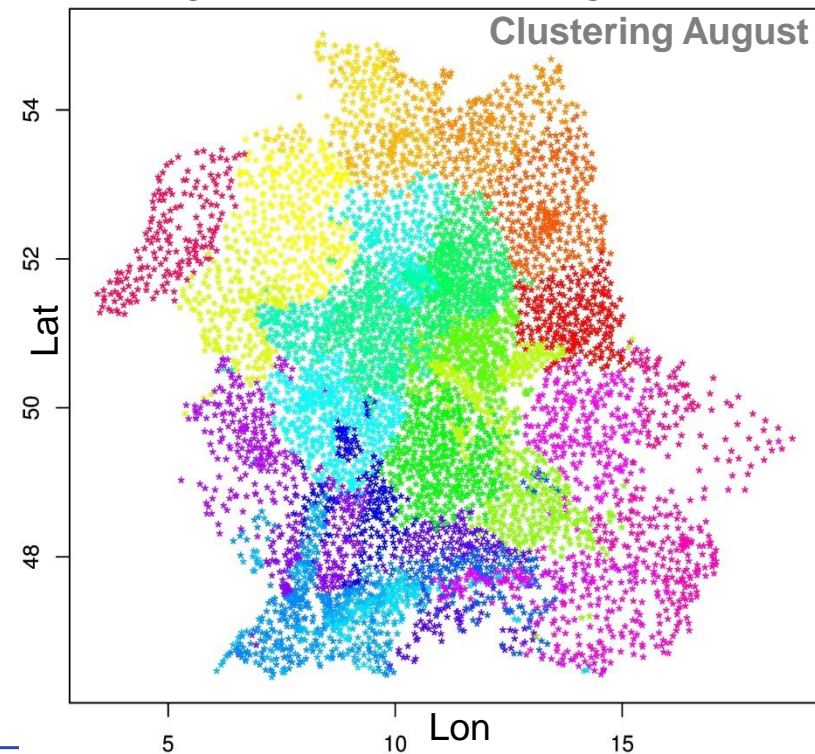
$$C(i + 1, j - 1) = \text{corr}(P(i, j), P(i + 1, j - 1))$$

Regionalisation method for precipitation

REGNIE method („**REG**ionalisierung der **NIE**derschlagshöhen“; regionalisation of precipitation heights):

1. Calculating the climatological background fields on monthly basis

- **Cluster analysis:** Dividing the whole area into homogeneous, climatological areas (30 clusters)
- **Multiple lineare regression** of monthly mean of each station for long time period (z. B. 1961-1990)
- **Inverse distance weighting (IDW)** of residuals and regression coefficients to final grid
- **Calculation the background values** of each grid cell by substituting the residuals and regression values into the regression equation



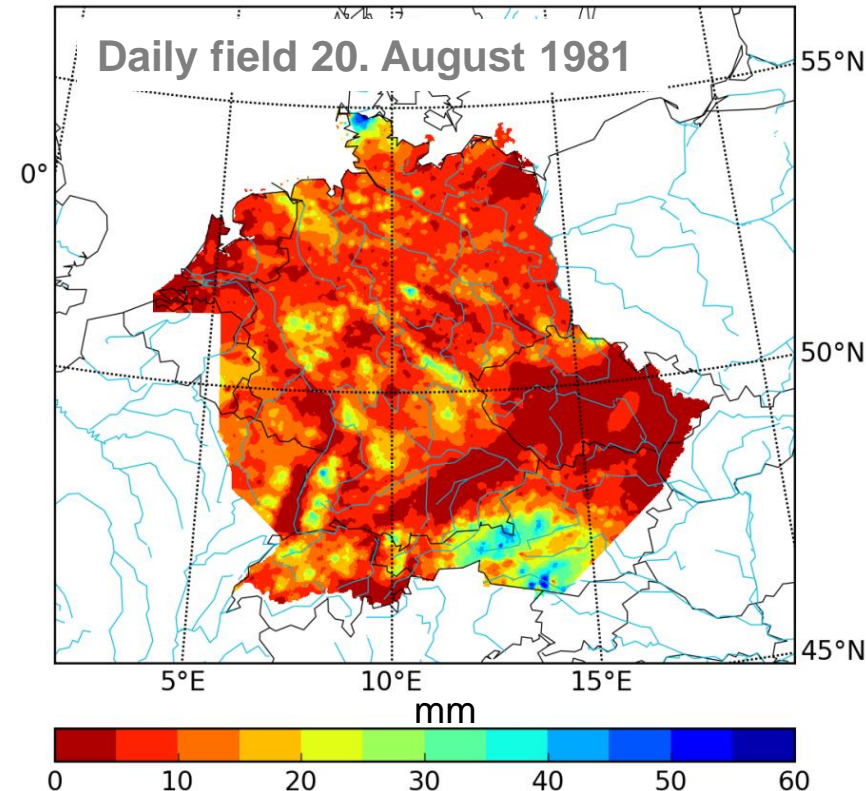
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1. Calculation of the climatological background fields on monthly basis

2. Calculation of the daily data set

- Allocation of the station values to the **nearest grid cell**
 - **Calculation of the ratio** of station values and background values
 - **IDW of the ratios** to the grid cells without station values
 - **Calculation of the daily data set** by multiplication of the ratios with the background values
- ➔ **Station data are conserved on final grid**



*Rauthe et al. (2013), Meteorolog. Z.,
DOI: 10.1127/0941-2948/2013/046*

Regionalisation method for temperature and relative humidity

Optimal Interpolation (interpolation for each time step separately):

- Find 15-30 stations influencing the grid point
- Splitting the station values z into background value z_b and anomaly value z_a :
$$z = z_b(x, y, h) + z_a$$
 1. Calculation of the **background values** for stations and grid points by means of a Trend Surface Analysis employing a multiple linear regression using all station values and successive calculation of station anomalies
 2. Statistical interpolation of all station anomalies to the grid by the **spatial correlation function**
 3. Calculation of **interpolation weights** by solving the linear equation system consisting of the station correlation matrix and the correlation vector between stations and grid points
 - Calculation of **anomalies** by multiplication of normalized interpolation weights and background values
- Grid point values: background values + anomalies