

# Quantification of climate induced changes in groundwater levels using fuzzy rule-based models.

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## 1 Motivation

Direct prediction of groundwater levels from climate data.

- Assessment of future groundwater levels under the influence of climate change.
- Using direct link between climatic influences and groundwater levels.

## 2 Methodology

- Calculation of meteorological indices taking moving averages and time lags into account.
- Variable selection using Random Forest.
- Fitting station wise Fuzzy rule-based models.
  - Rule system optimization using Simulated Annealing (Aarts and Korst, 1989).
- Fitting Multiple linear regression models (MLR).
  - $GWL \sim f(\text{meteorological indices})$
- Applying climate model data based on the RCP8.5 climate scenario.

## 3 Results

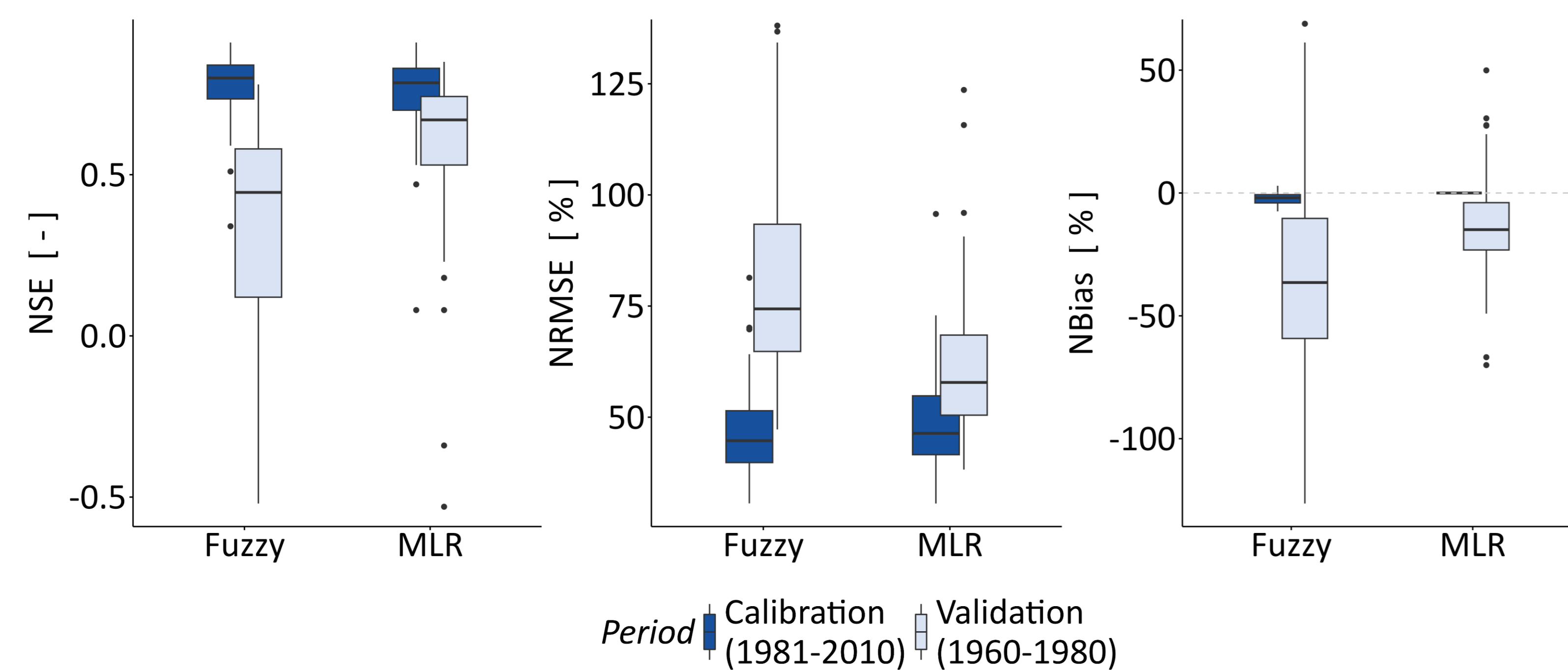


Fig. 1: Nash-Sutcliffe efficiency (NSE), normalised root mean square error (NRMSE) and normalised bias (NBias) of estimates from observed mean groundwater levels using Fuzzy rule-based models (Fuzzy) and Multiple linear regression models (MLR) for the calibration period (dark blue) and validation period (light blue) over 114 stations.

# Groundwater levels in Lower Saxony can be described by meteorological indices using both fuzzy rule-based models and MLR approaches.

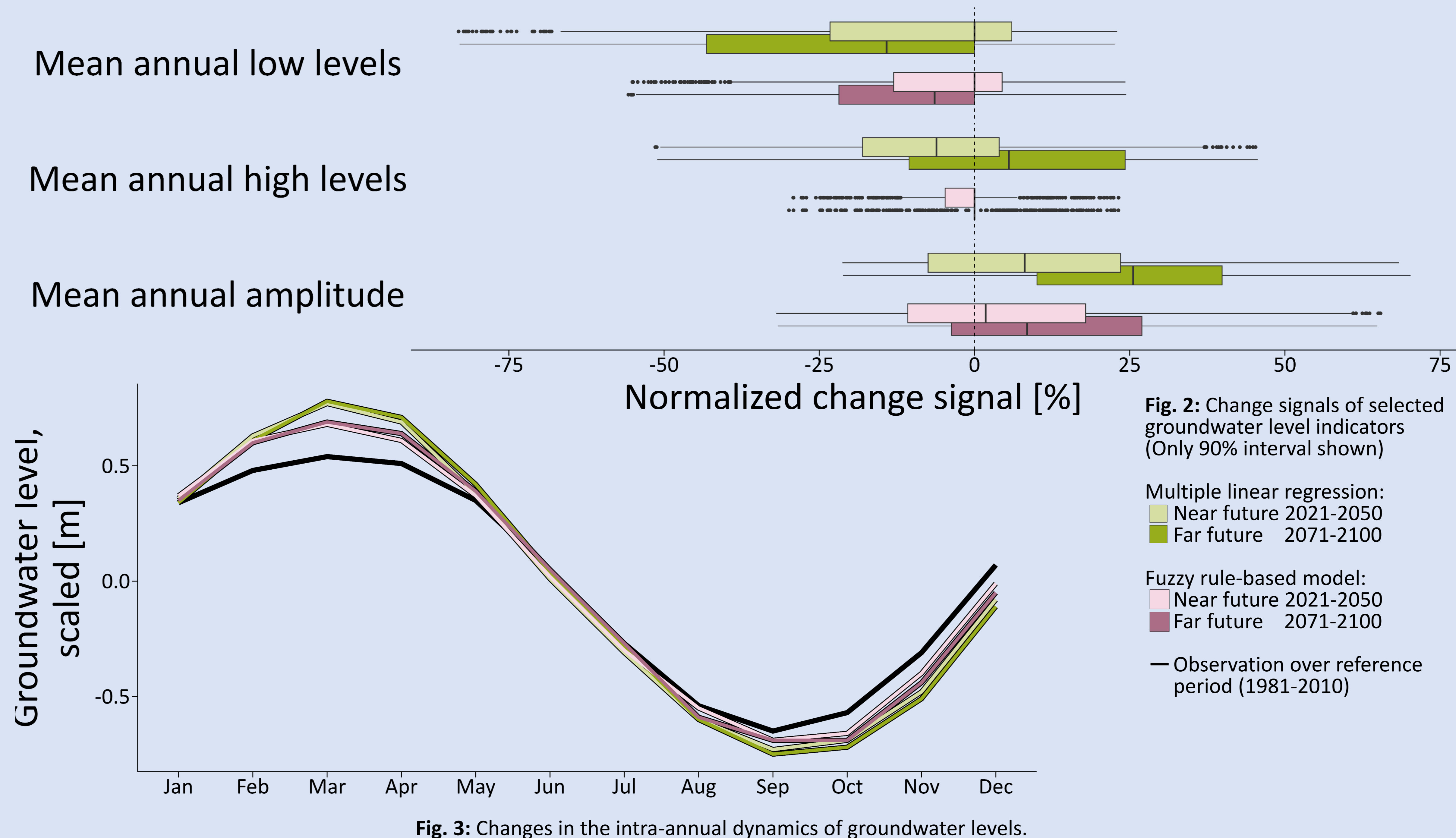


Fig. 2: Change signals of selected groundwater level indicators (Only 90% interval shown)

Fig. 3: Changes in the intra-annual dynamics of groundwater levels.

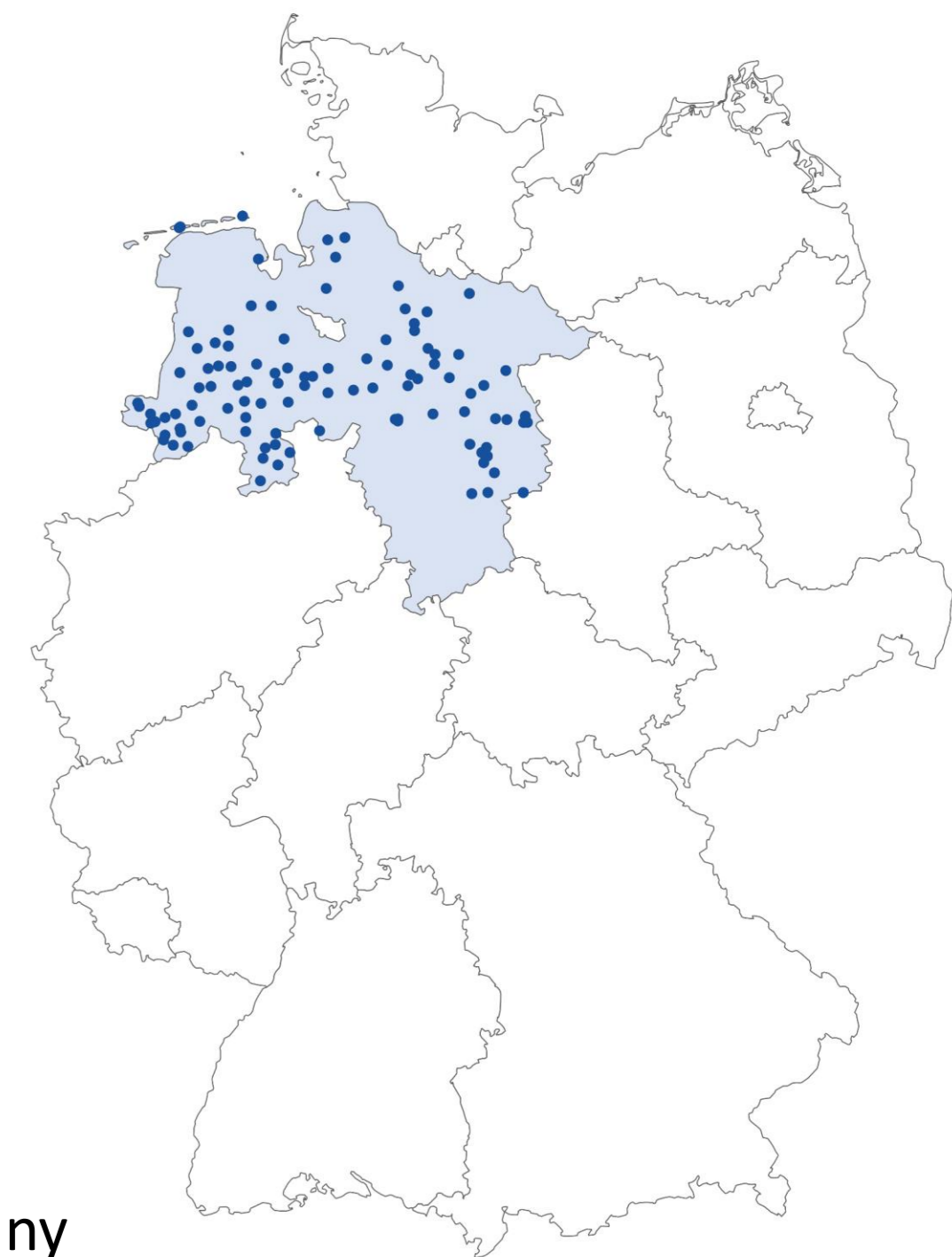
## 4 Conclusion

- Model performance of MLR more robust than that of the currently calibrated Fuzzy rule-based models.
- Both applied methods show similar change signals, with MLR showing slightly more pronounced changes.
- Mean annual low levels decrease, while mean annual high levels decrease slightly. As a result, the mean annual amplitudes increase slightly.
- Slightly delayed timing of the annual extremes.
- The changes in the far future are in general more apparent than in the near future.



## Additional Information

Fig. 4: Available groundwater level stations for Lower Saxony, Germany.



## Study area and data

- Lower Saxony, Germany
- Observed monthly groundwater level data (144 stations with sufficient time series length)
- Observed daily climate data (Interpolated on 1x1km grid)
- Climate model data (Ensemble of 8 climate model projections based on RCP8.5 climate scenario)

## Indices

- Mean Precipitation [mm/d]
- Evapotranspiration [mm/d]
- Minimum, average and maximum temperature [°C]
- Mean climatic water balance [mm/d]
- Relative Humidity [%]
- Standardized Precipitation Index (McKee et al., 1993) [-]
- Global radiation [W/m<sup>2</sup>]
- Standardized Precipitation-Evapotranspiration Index (Vicente-Serrano et al., 2010) [-]
- Groundwater recharge (Ertl et al., 2019) [mm/d]

## Change signals

- Change signals calculated according to DeltaChange approach and normalised with standard deviation of the observed data of the reference period (1981-2010).

Normalized change signal:

$$100 * \frac{\text{DeltaChange}}{\text{sd}(\text{obs})_{\text{ref}}} [\%]$$

with: DeltaChange =  
obs \* simulated change signals

## REFERENCES

- Aarts, E., Korst, J., 1989. Simulated Annealing and Boltzmann Machines. John Wiley & Sons, New York, NY.
- Ertl, G., Erbracht, J., Engel, N., Bug, J., & Herrmann, F. (2019). Grundwasserneubildung von Niedersachsen und Bremen-Berechnungen mit dem Wasserhaushaltsmodell mGROWA18: Landesamt für Bergbau, Energie und Geologie.
- McKee, T.B., Doesken, N.J., Kleist, J. (1993). The relationship of drought frequency and duration to time scales. 8th Conference on Applied Climatology. American meteorological society, Boston, USA.
- Vicente-Serrano S.M., Begueria S., Lopez-Moreno J.I. (2010). A Multiscalar Drought Index Sensitive to Global Warming: The Standardized Precipitation Evapotranspiration Index. Journal of Climate 23: 1696-1718.