High-resolution precipitation reanalysis over France through offline data assimilation in a downscaled ensemble meteorological reconstruction

This study considers an "offline" data assimilation method using the Ensemble Kalman Filter to build a precipitation reanalysis over France. The method is here applied for reconstructing the 2009-2012 period, using past observation density of 1871, 1900 and 1950. The methodology allows taking two main features of precipitation into account: (1) an anisotropic localization matrix based on the climatological background information, (2) a Gaussian transformation applied to daily precipitation. Results show a reduced error and a reduced uncertainty compared to background reconstructions, even with few observations, thus demonstrating the added value of data assimilation.

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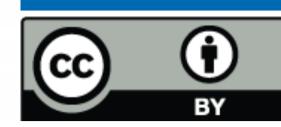
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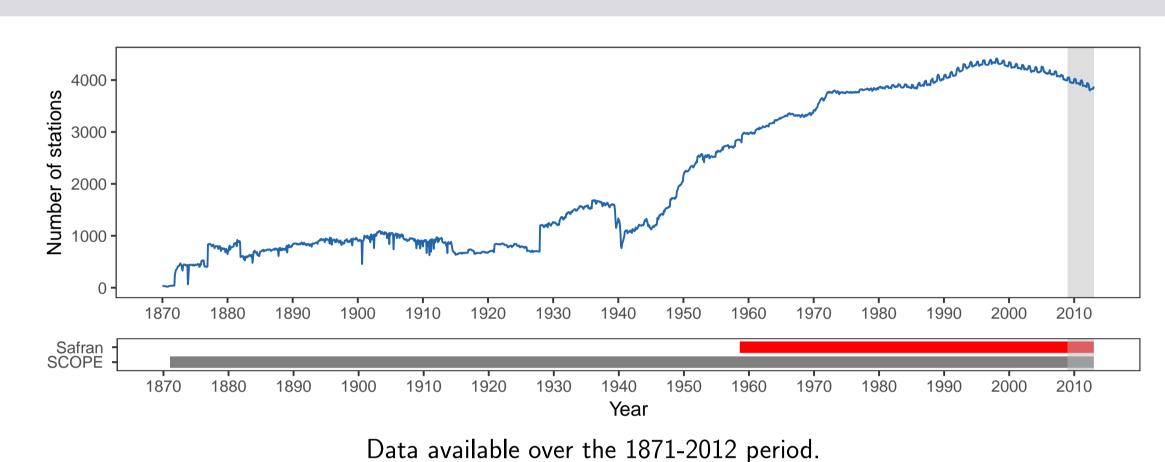


Research question

How to produce a 150-year high-resolution precipitation reanalysis over France ?

- \rightarrow Through data assimilation of observations of precipitation into with available downscaled ensemble
- \rightarrow This work:
- Evaluation of the methodology on the 2009-2012 period
- Sensitivity of the analysis to the network density

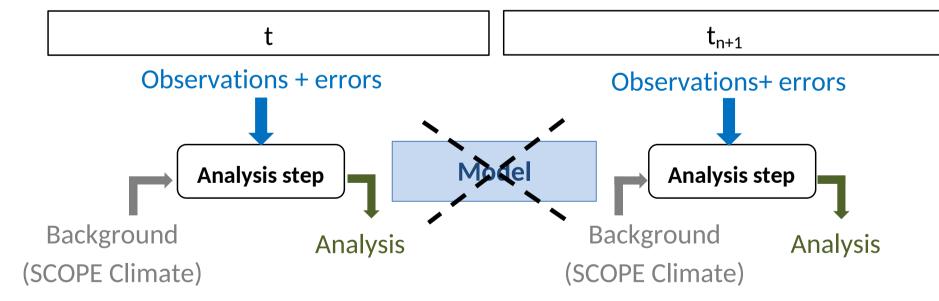
Data



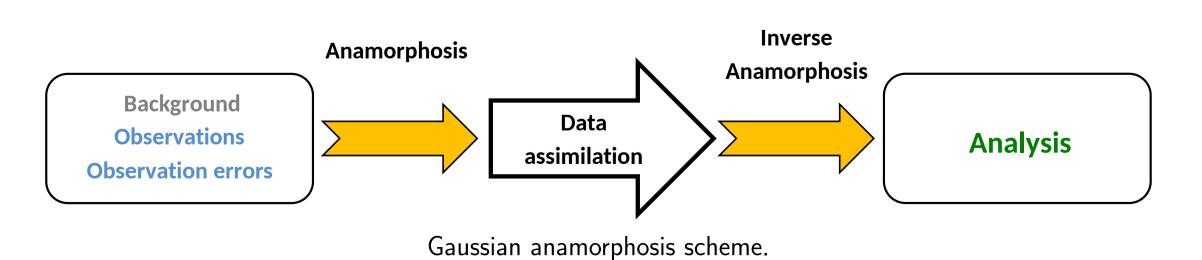
- ▶ Observations: Daily precipitation over France for the 1871-2012 period with associated measurement metadata
- ► Safran [Vidal et al., 2010] : Deterministic reanalysis of meteorological variables / Daily on the 1958-2012 period / 8 x 8 km grid over France (8602 cells)
- ► SCOPE Climate [Caillouet et al., 2016, 2017] : Ensemble reconstructions (25 members) of meteorological variables / Daily on the 1871-2012 period / 8×8 km grid over France (8602 cells)

Methods

► Offline data assimilation scheme



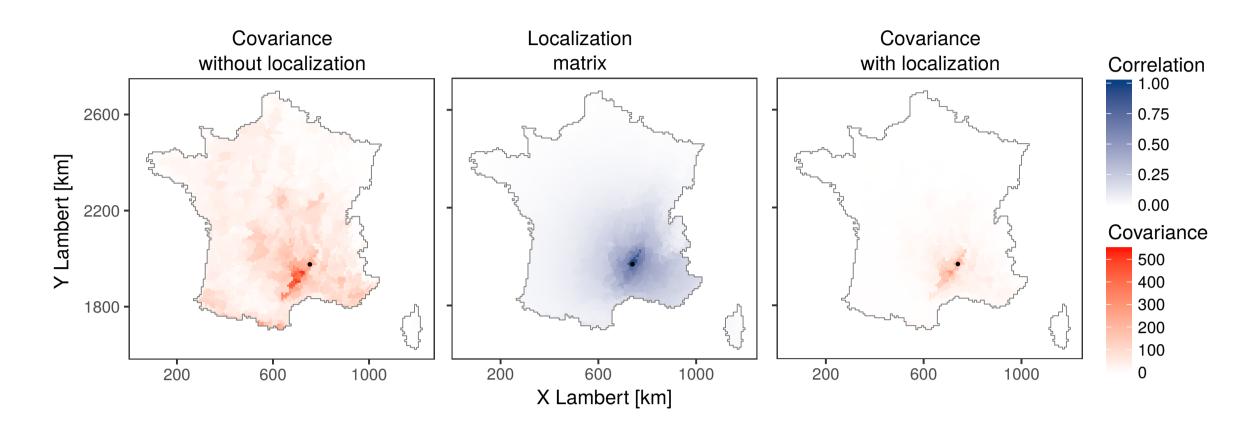
- Offline assimilation scheme.
- No model / Analysis step of the Ensemble Kalman Filter [Evensen, 2003]
- Observation error covariance matrix: diagonal with σ_{obs} defined by metadata
- Background error covariance matrix: defined by the 25 members of SCOPE Climate
- ► Gaussian anamorphosis



- Gaussian transformation [Lien et al., 2013] defined on each cell with SCOPE Climate using 1958-2008 period as reference
- Allows a more Gaussian distribution except for non-null precipitation

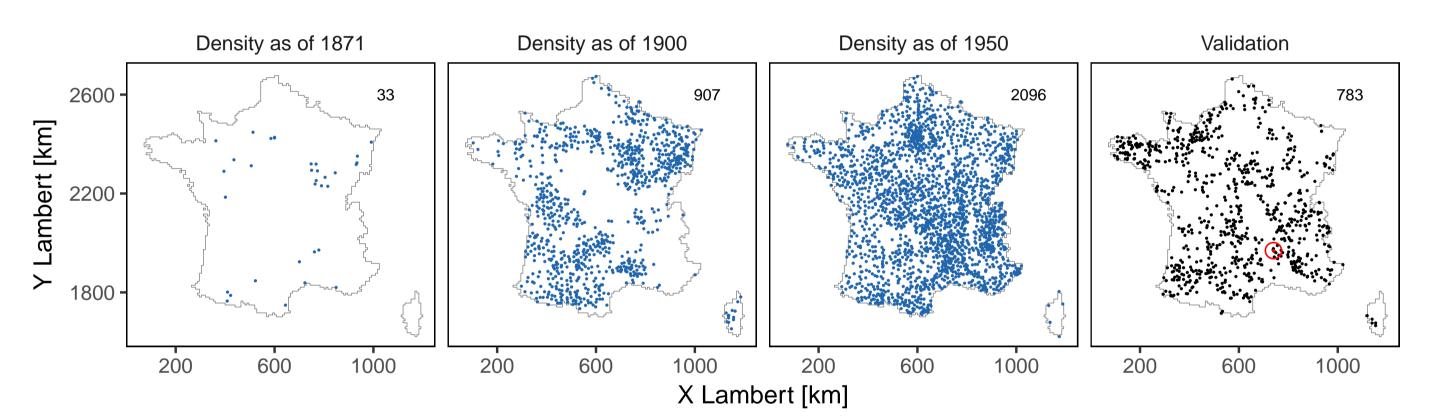
Methods

► Localization of background error covariance matrix



Example of localization for the case study cell (black square) during the extreme event of 3 november 2011.

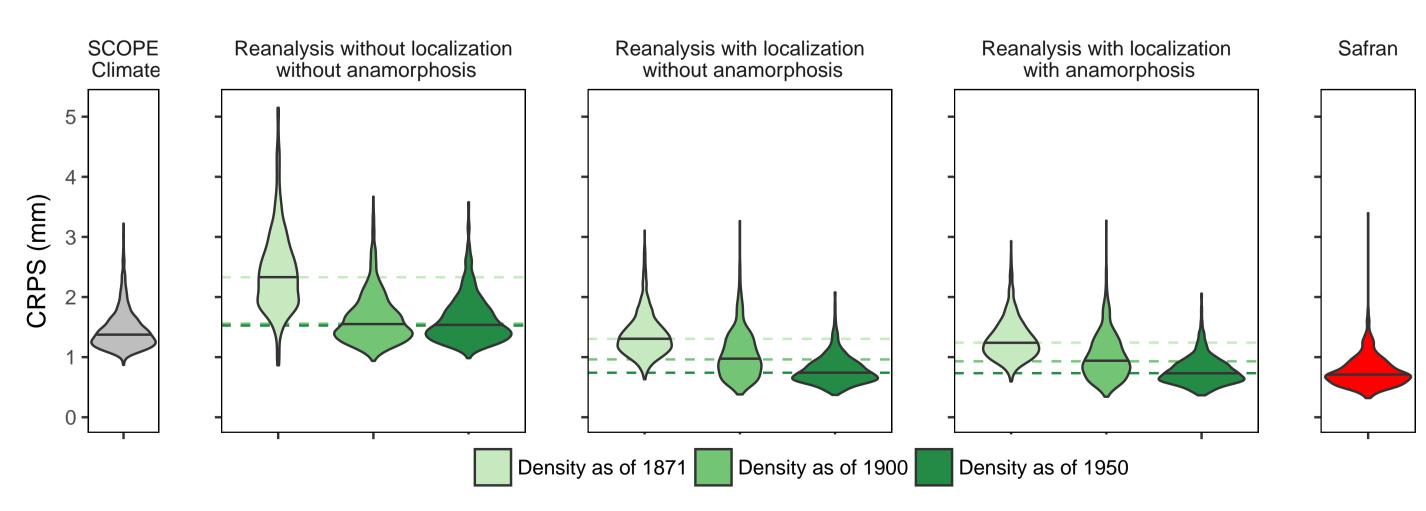
- Construction of localization matrix based on spatial correlation of SCOPE Climate over the 1958-2008
- Localization matrix is strongly anisotropic
- ► Set-up and Validation



Stations used for simulating different densities and stations used for validation. The red square highlights the case study cell.

- Daily reanalysis over the 2009-2012 period
- Density simulated as of 1871, 1900 and 1950 / A set of 783 stations is used for validation
- Validation using the Continuous Ranked Probability Score (CRPS) between each perturbed observation and the corresponding grid cell value from SCOPE Climate / the reanalysis

(1) Results: added value of localization & anamorphosis



Error as a function of density and uses of localization and anamorphosis.

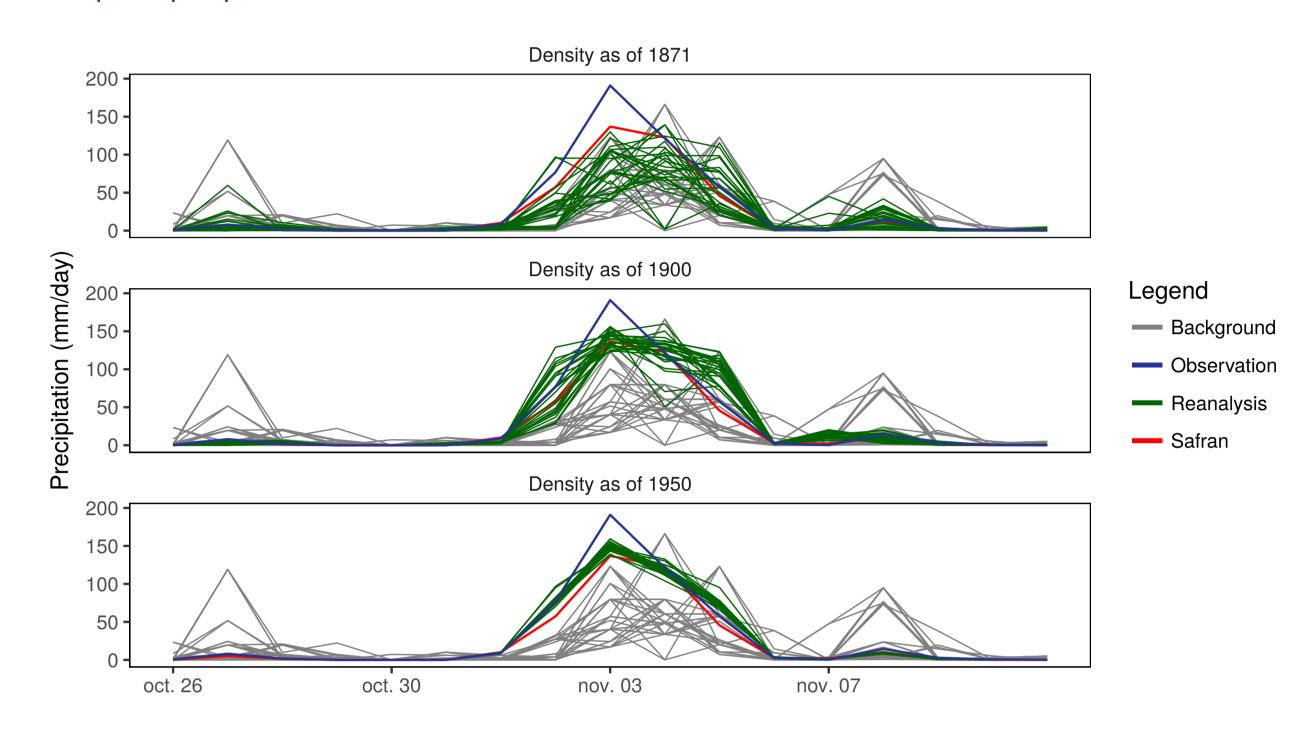
Localization:

Without: error of the reanalysis higher than for the background With: error of the reanalysis lower than for the background

- Anamorphosis: overall improvement with anamorphosis
- Localization / Anamorphosis: Improvement strongly dependent on the density

(2) Results: extreme event of November 2011

- Intense rainfall event that led to 14 casualties in the South of France [MunichRE, 2012]
- ► Temporal perspective



Daily precipitation time series for the case study cell during the extreme event of November 2011.

- \circ Reduction of uncertainty / Improves autocorrelation and coherence between members
- Improvement strongly dependent on the density

► Spatial perspective Reanalysis **SCOPE** Safran Density as of 1900 Climate

Precipitation over France for the 3 november 2011: member #3 of background and reanalysis together with Safran as reference

- High values (South-East) / small precipitation (West) well reproduced
- Smoother small-scale pattern than Safran

Future work

- Meteorological reanalysis of the full 1871-2012 period for both temperature and precipitation
- Hydrological modeling over France for the 1871-2012 period using the meteorological reanalysis produced for improving current hydrological reconstructions SCOPE Hydro [Caillouet et al., 2017]

References

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