



# **OBSERVATION IMPACT ON THE CONVECTION-PERMITTING SCALE USING AN OBSERVATION-BASED VERIFICATION METRIC**

**Tobias Necker, Matthias Sommer, Martin Weissmann**

Hans-Ertel-Centre for Weather Research, Meteorological Institute Munich, LMU Munich  
In collaboration with Deutscher Wetterdienst (Roland Potthast, Hendrik Reich i.a.)

## Goal:

- Impact of observations in the pre-operational regional LETKF DA system (KENDA)

## Current improvement:

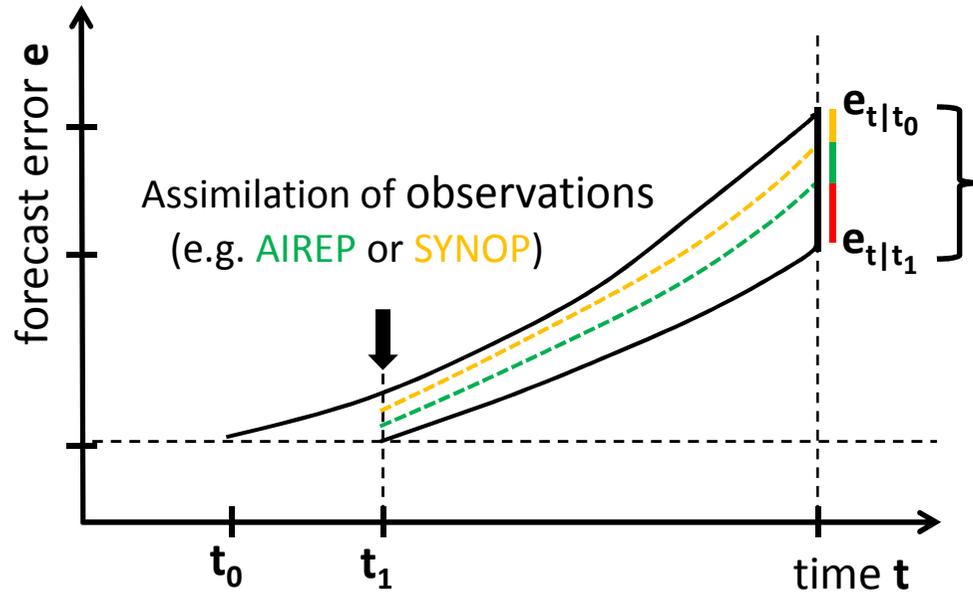
- Verification with independent observations (instead of the model analysis)

## Why observation impact?

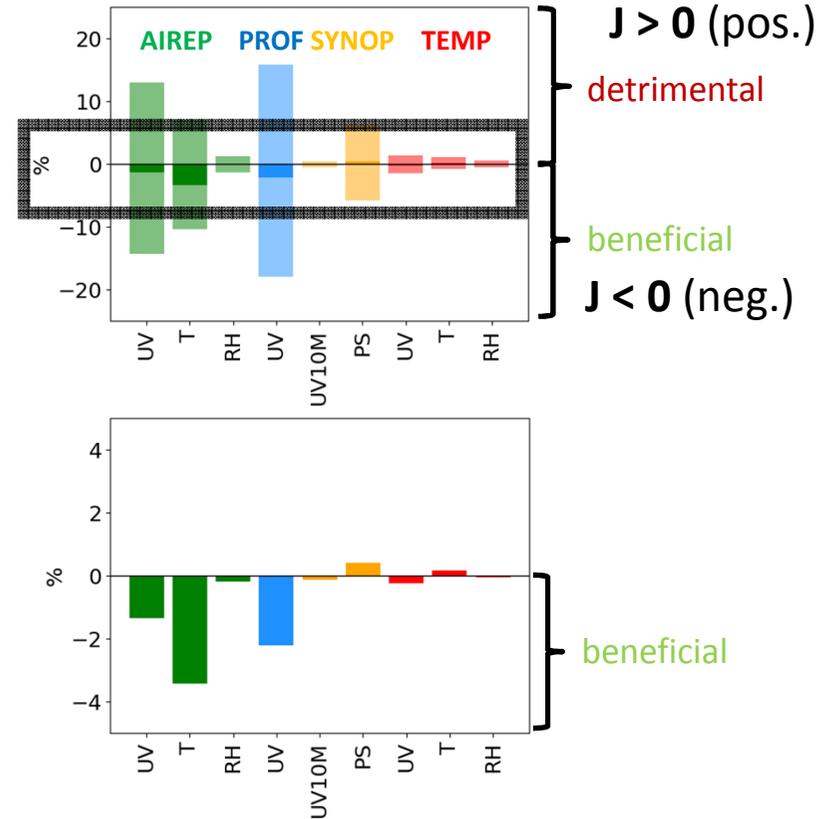
- Detect issues with individual observations
- Optimizing the observing, data assimilation and forecasting system

## Why ensemble approximation of observation impact?

- Re-use of COSMO-KENDA ensemble
- Cheaper than data denial



**Goal:** Contribution of different observations to the reduction of forecast error



$$J(\mathbf{d}') \approx \frac{2}{N_e - 1} \mathbf{e}_f^d \cdot \mathbf{Y}_f^d (\mathbf{Y}_a^d)^T \mathbf{R}^{-1} \mathbf{d}'$$

$J$  : Observation Impact

$\mathbf{R}$  : Observation error covariance matrix

$N_e$  : Number of ensemble member

$\mathbf{d}$  : Innovation vector  $\mathbf{d} = \mathbf{y}_o - \mathbf{y}_b$

$\mathbf{Y}_f^d$  : Forecast ensemble in obs. space

$\mathbf{e}_f^d$  : Forecast error

$\mathbf{Y}_a^d$  : Analysis ensemble in obs. space

( Following Kalnay et al 2012)

( Reformulated by Sommer & Weissmann 2016)

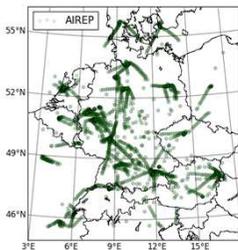
$$e_f^d = \overline{H_{veri}(x_f^d)} - y_{veri}$$

- $e_f^d$  : Forecast error
- $H_{veri}$  : Observation operator into verification space
- $x_f^d$  : Model equivalent for verification
- $y_{veri}$  : Observation used for verification

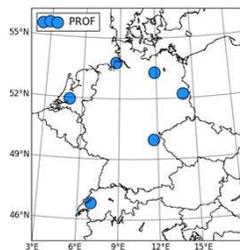
## Conventional (UV/ T/ RH)

## Remote Sensing (TOT\_PREC)

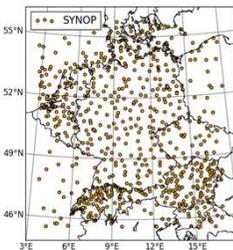
AIREP



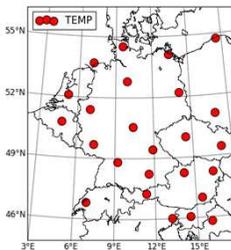
PROF



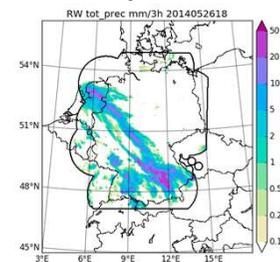
SYNOP



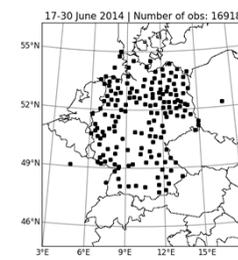
TEMP



Precipitation



GNSS Humidity



## Period:

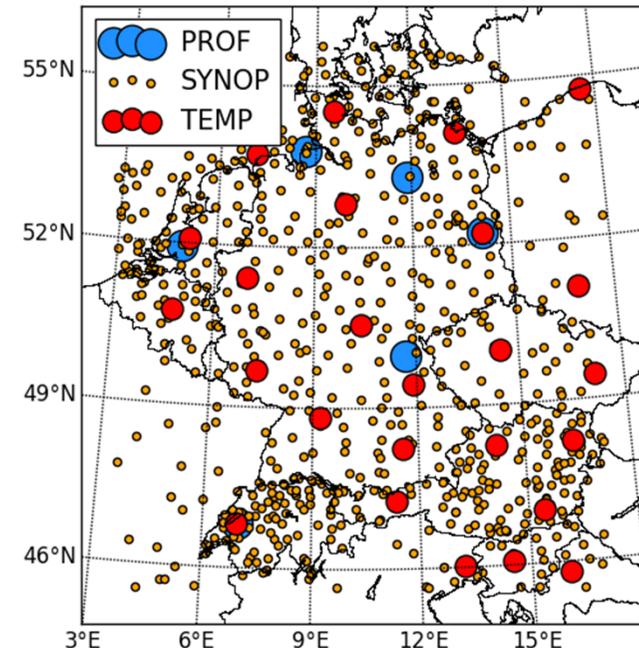
- 36 days (288 cycles): 26. May – 30. June 2016
- Summer period with high impact weather events

## Model:

- Regional COSMO-KENDA (LETKF) ensemble system of DWD (*40 members, 3h forecasts*)

## Setup:

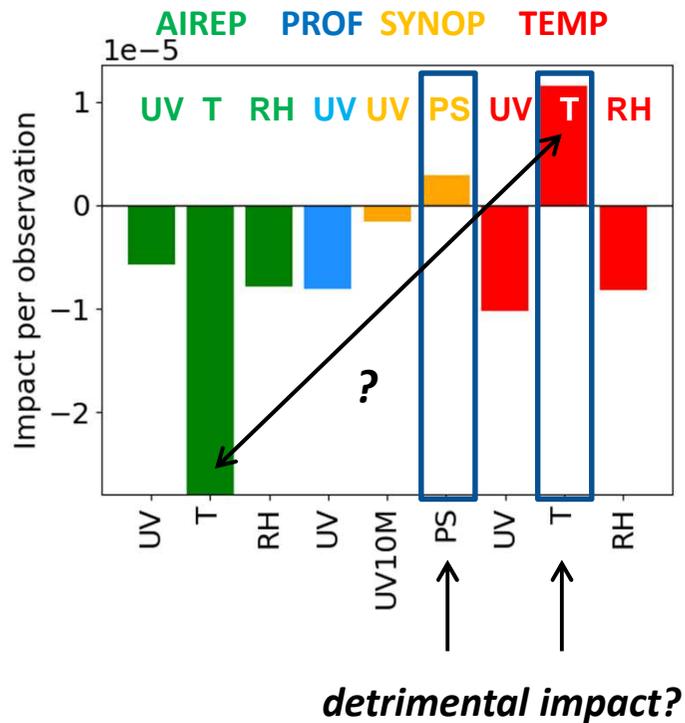
- 1-day spin up & 3h-cycling
- Verification window: 1-3 h after analysis
- Operational setup of DWD except:
  - No adaptive localization
  - Inflation: With RTPP, without RTPS



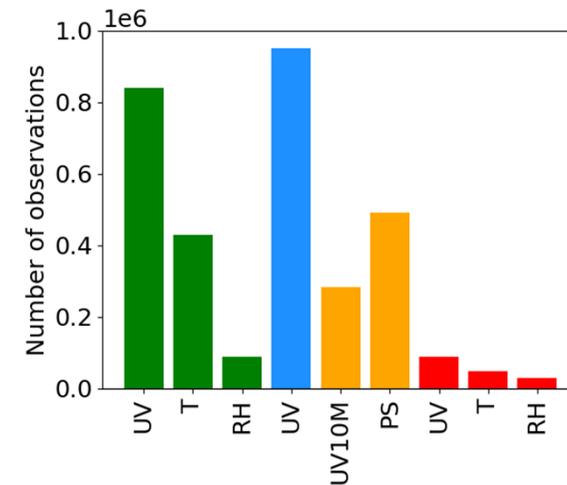
*Stations of different observation types in the COSMO-DE domain*



## Verification with conventional observations



## Number of assimilated observations



### Questions:

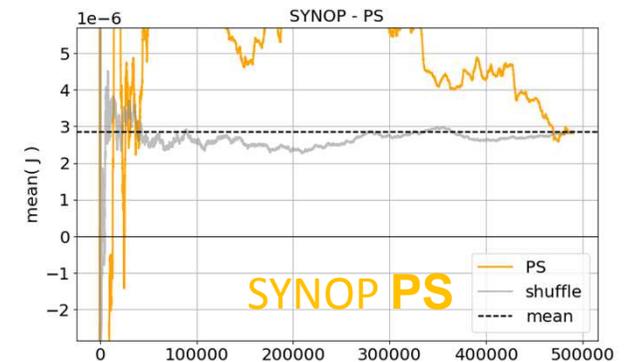
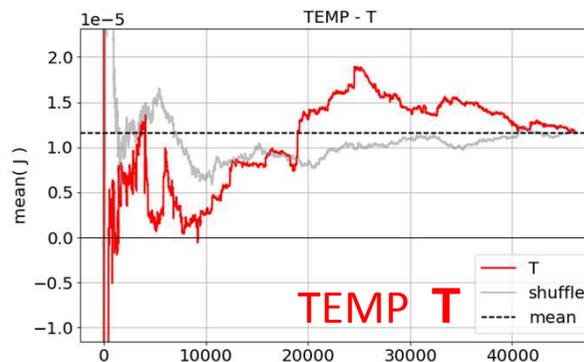
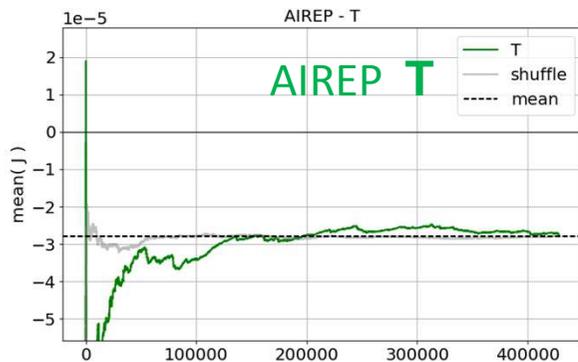
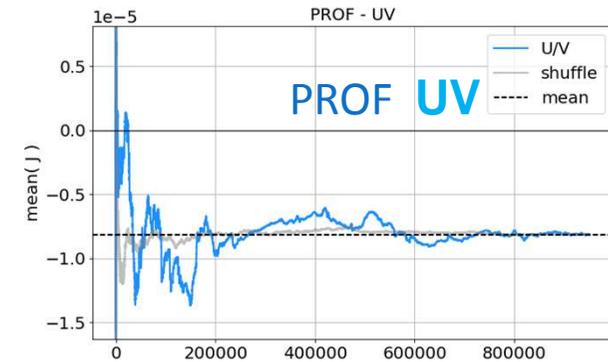
- How reliable are the results? Sample size?
- Large differences between AIREP T and TEMP T?
- Detrimental impact for SYNOP PS and TEMP T?



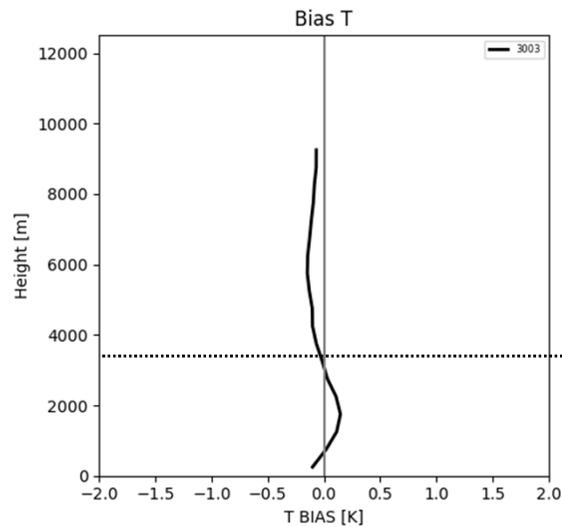
Ordered partial sum - (colored solid line)  
Randomized partial sum - (gray solid line)  
Mean impact - (dashed line)

**Questions:** How reliable are the results? Sample size?

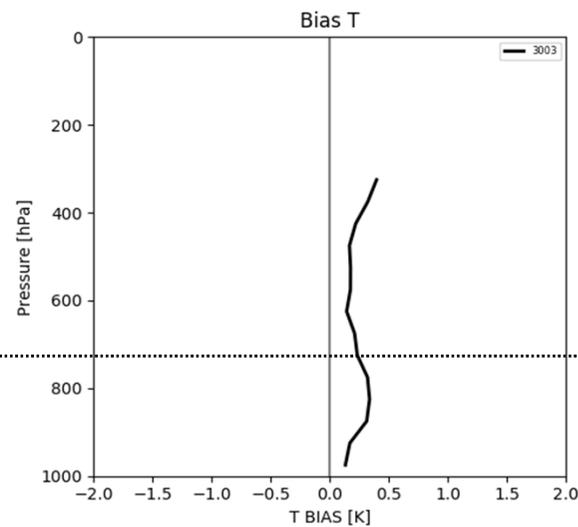
**Answer:** Sample size is large enough



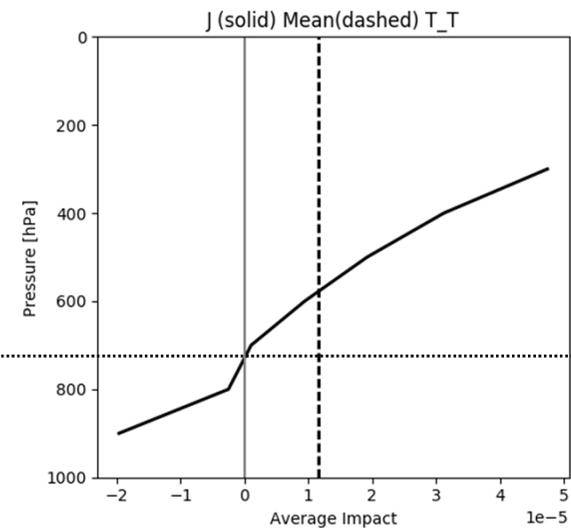
**AIREP T bias**



**TEMP T bias**

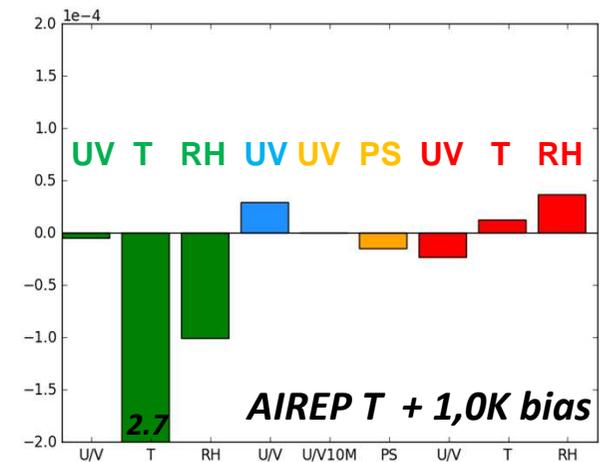
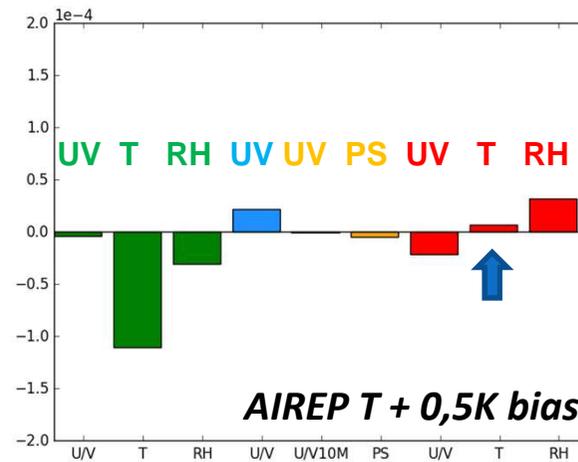
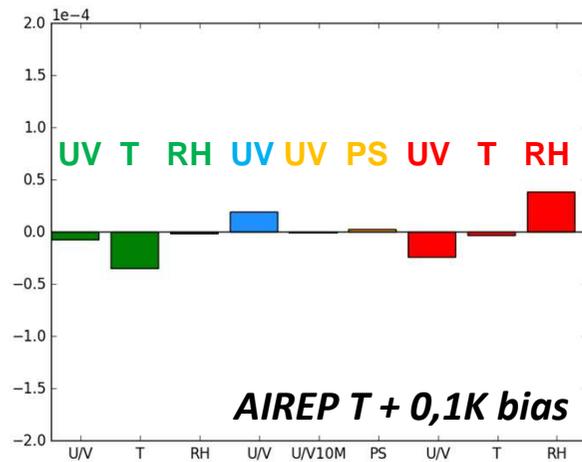


**TEMP T Impact**



**Questions:** Large differences between AIREP and TEMP T?

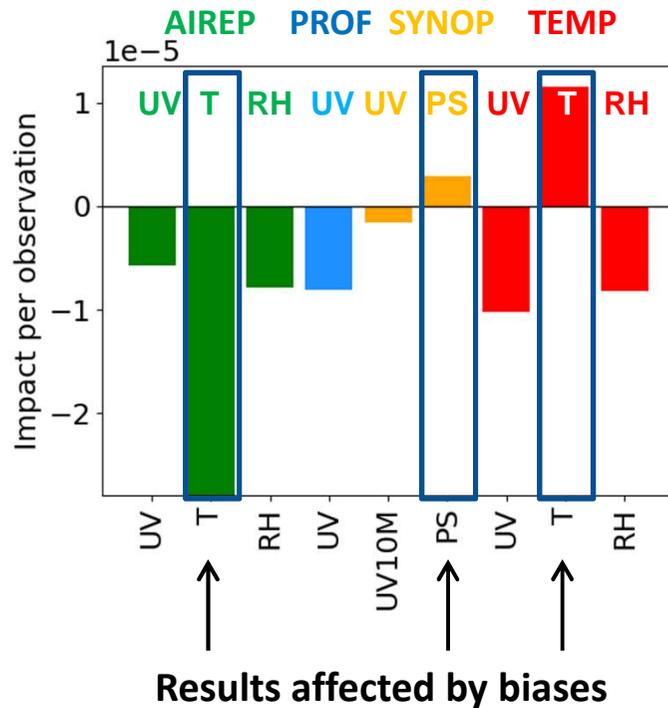
**Answer:** Opposite temperature biases for AIREP T & TEMP T affect impact estimation



**Sensitivity of the estimated observation impact to a simulated AIREP temperature bias:**  
 → Biases can affect impact approximation (valid for any kind of verification)



## Verification with conventional observations



### Issues:

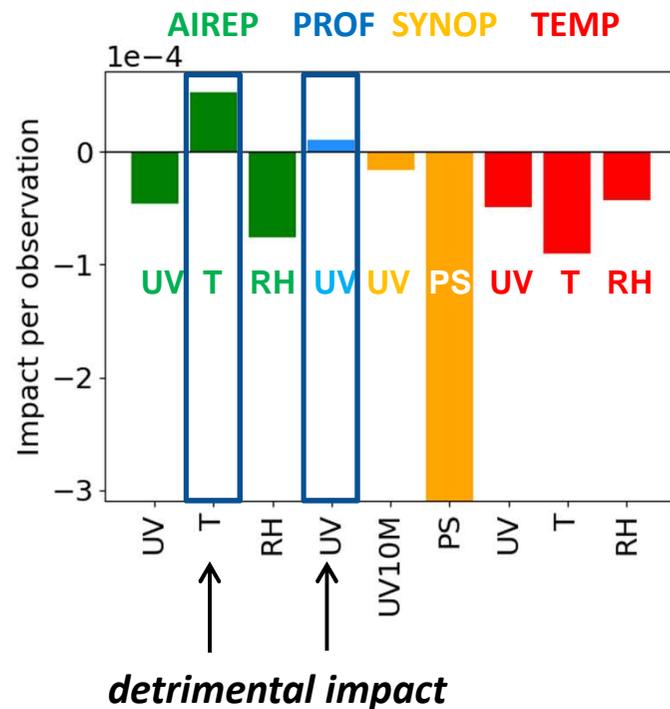
- Biases
- Arbitrariness of verification metric
- Self verification

### Solution:

→ Independent observations for verification  
e.g. remote sensing observations



## Verification with precipitation observations

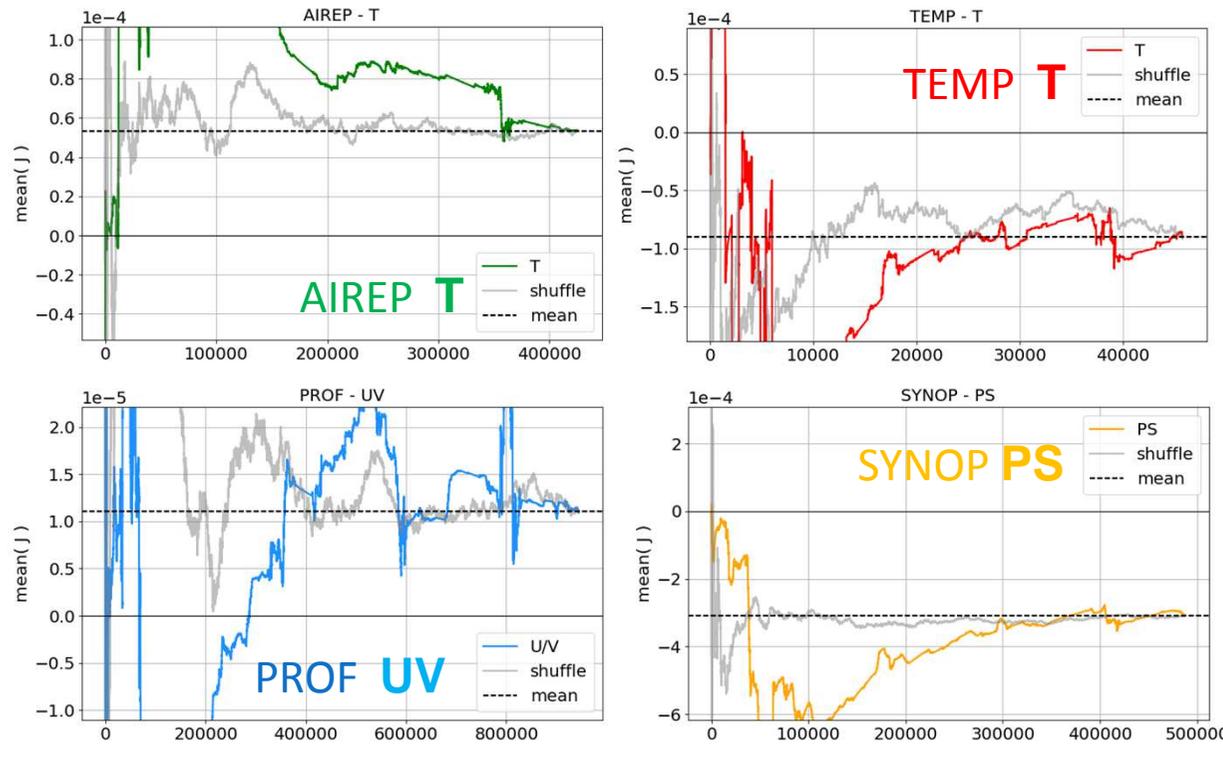


### Verification with precipitation:

- Surface pressure & sounding temperature with largest beneficial impacts
- Aircraft temperature with detrimental impact
- Wind profiler with neutral impact

### Question:

- What about model biases?
- How reliable are the results?



**Question:**

How reliable are the results?

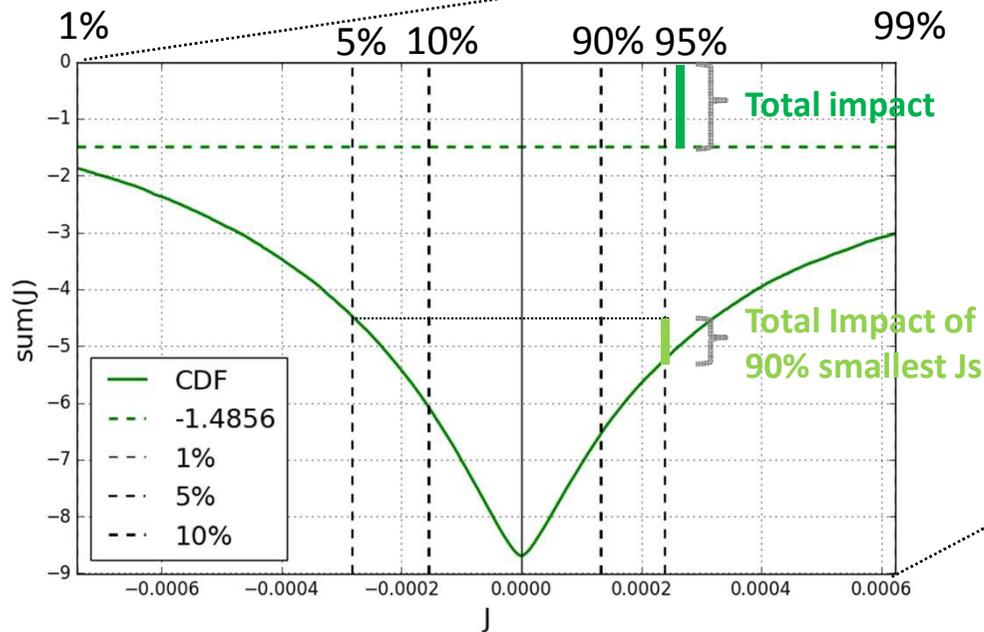
**Answer:**

Sample size is large enough  
for most observation types

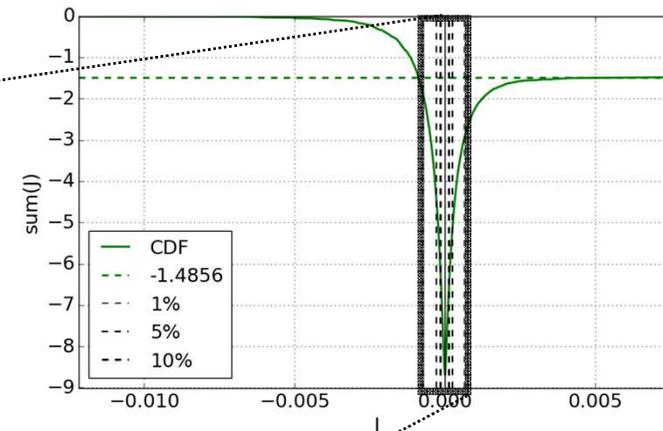
-> Results are representative  
for summer period

Ordered partial sum - (colored solid line)  
Randomized partial sum - (gray solid line)  
Mean impact - (dashed line)

**Question:** Is the small number of observations with extreme impact values important?



**Cumulative Distribution Function (CDF)**

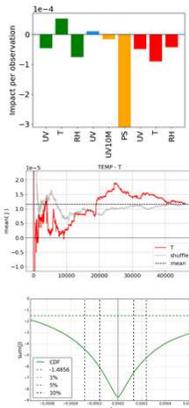
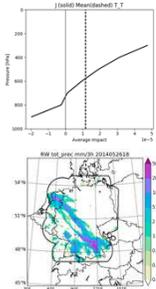


**Answer:** The 10% most extreme impact values contribute as much as smallest 90%

**AIREP U/V**

## Approach:

- Issues: Biases, self verification, arbitrariness of verification metric  
-> Bias-free, independent and representative set of observations for verification required (e.g. remote sensing)
- Method is enhanced to verify with independent remote sensing observations  
-> Precipitation (radar RW/EW) & Humidity (GNSS)



## Results for summer experiment:

- Surface pressure & sounding temperature with largest beneficial impacts
- Aircraft temperature & wind profiler show detrimental & neutral impacts
- Sample size is large enough, results are representative
- 10% most extreme impact values are as important as smallest 90%

- Kalnay, E. et al. 2012:** A simpler formulation of forecast sensitivity to observations: Application to an ensemble transform Kalman filter. *Physica D*, 230: 112-126.  
DOI: 10.3402/tellusa.v64i0.18462
- Sommer, M. and M. Weissmann, 2014:** Observation Impact in a Convective-Scale Localized Ensemble Transform Kalman Filter, *Q. J. R. Meteorol. Soc.*, 140, 2672–2679.  
DOI: 10.1002/qj.2343
- Sommer, M. and M. Weissmann, 2016:** Ensemble-based approximation of observation impact using an observation-based verification metric. *Tellus A*.  
DOI: 10.3402/tellusa.v68.27885