

# TOWARDS A REGIONAL ENSEMBLE REANALYSIS

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[J.Keller](#)<sup>2,3</sup>, [A.Hense](#)<sup>1</sup> and [C.Ohlwein](#)<sup>1,3</sup>

*Thanks to [C.Schraff](#)<sup>2</sup> & [C.Bollmeyer](#)<sup>5</sup>*

and [P.Unden](#)<sup>4</sup>, [A.Kaiser-Weiss](#)<sup>2</sup>, [F.Kaspar](#)<sup>2</sup>, [R.Potthast](#)<sup>2</sup>, [S.Wahl](#)<sup>1,3</sup>, [C.Figura](#)<sup>1,3</sup>, [M.Masbou](#)<sup>2,3</sup>,

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5 Wetteronline GmbH

2016 February, 2nd  
3<sup>rd</sup> UERRA GM Toulouse

# REGIONAL REANALYSES AT THE UNIVERSITY OF BONN

- Regional reanalyses in the **Hans-Ertel Centre for Weather Research**
  - **COSMO-REA6**
    - Europe, 6km *Bollmeyer et. al, 2015*
    - COSMO+nudging
    - 20 years
  - **COSMO-REA2**
    - Germany, 2km
    - COSMO+nudging+Ihn
    - 8 years
- Produced by C.Bollmeyer (PhD student)
- Current contact [clarissa.figura@uni-bonn.de](mailto:clarissa.figura@uni-bonn.de) (PhD student)

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  - Requires ensemble of lateral boundary conditions  $O(40)$
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  - Assimilation of modern observations in development
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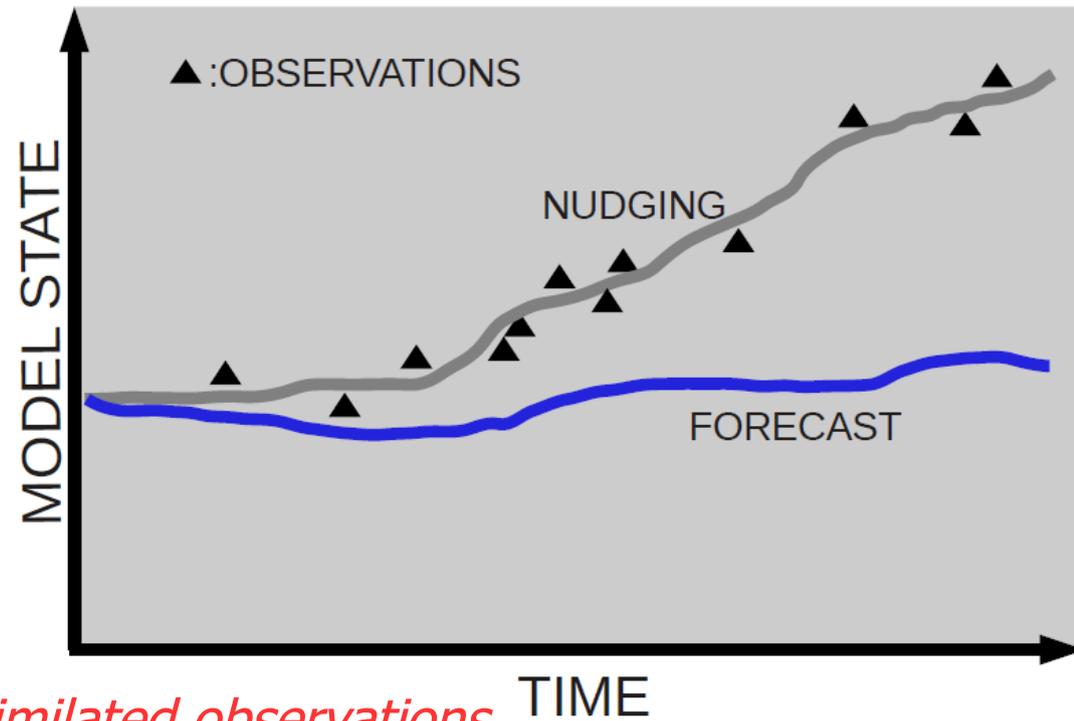
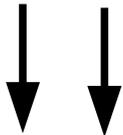
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- Produce reanalysis based on ensemble nudging
- Potentially further experiments with EN-LETKF / just LETKF

# SET-UP OF THE REANALYSIS SUITE

# ENSEMBLE NUDGING

$$\frac{\partial}{\partial t} \psi(\mathbf{x}, t) = F(\psi, \mathbf{x}, t) + G_{\psi} \cdot \sum_{k(\text{obs})} W_k(\mathbf{x}, t) \cdot [\psi_k^{\text{obs}} - \psi(\mathbf{x}_k, t)]$$

- Perturb the **observations** assuming
  - normally distributed
  - stationary
  - spatio-temporally uncorrelated
  - unbiased *obs errors*

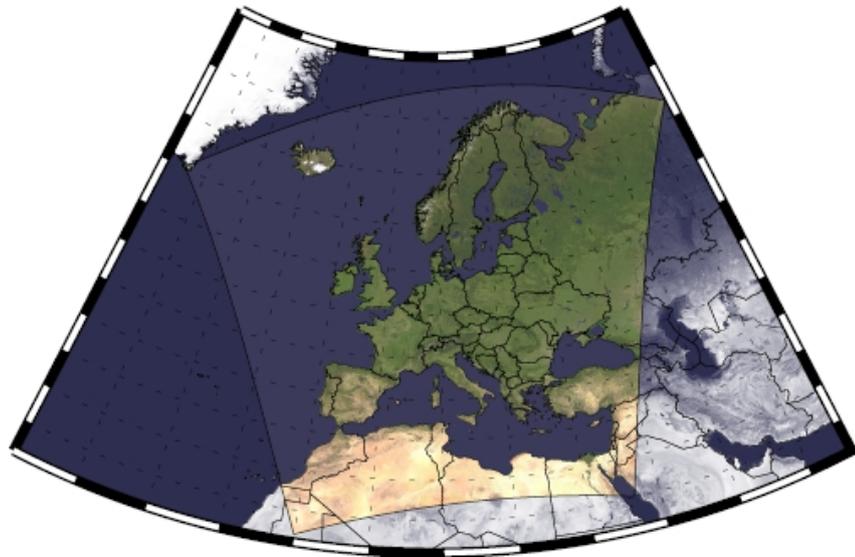


*Uncertainty arising from errors in the assimilated observations*

~ Measurement error + representativity error + observation operator error

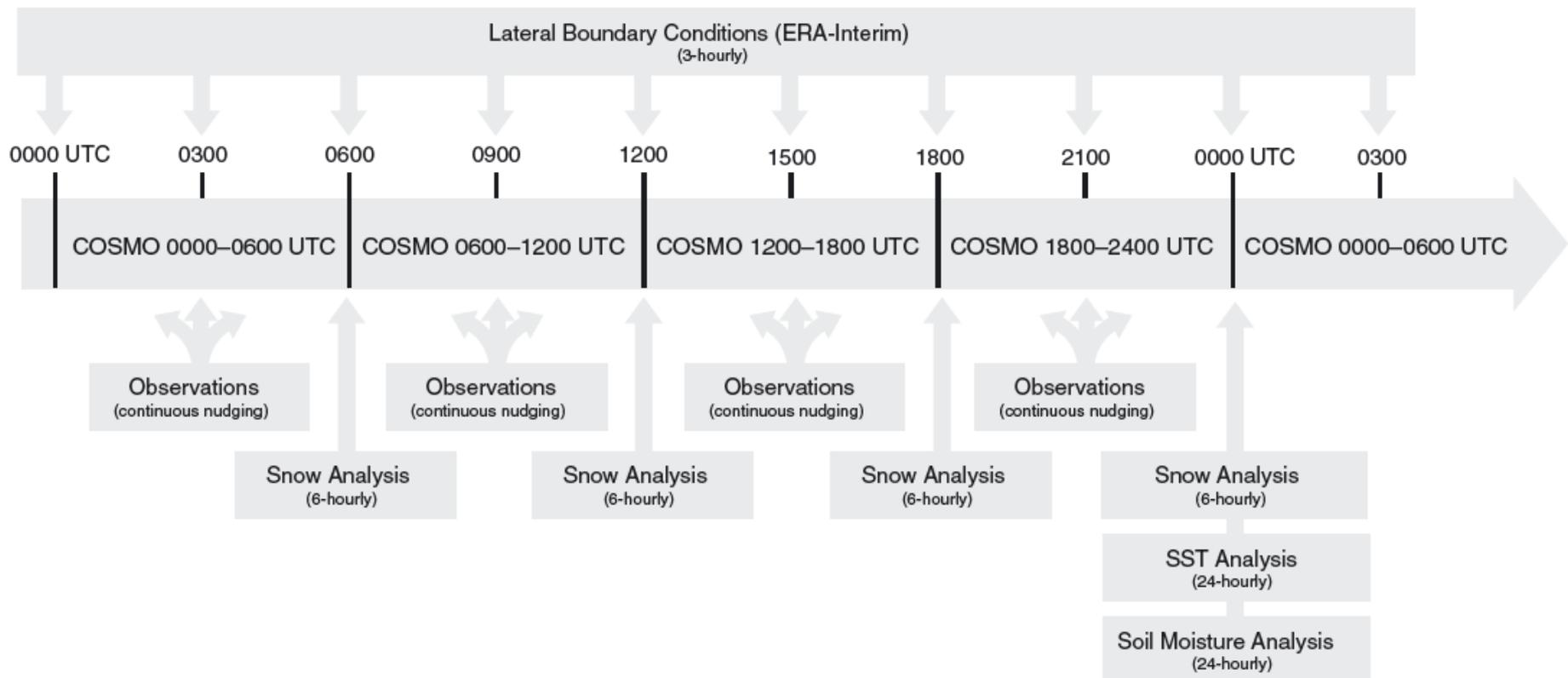
# REANALYSIS SET-UP

- COSMO-EU set-up of model version 5.0 (extended)
- Conventional observations
- 3-hourly LBCs from ERA-INTERIM
- Reanalysis + reforecasts



Observing system	Report type	Observed variable
Radiosondes	PILOT	Upper-air wind
	TEMP	Upper-air wind, temperature, humidity
Aircraft		Surface-level wind
	AIREP	temperature, humidity, geopotential
	AMDAR	Wind, temperature
Wind profiler	ACARS	Wind, temperature
		Upper-air wind
Surface systems	SYNOP	Screen level pressure, wind, humidity
	SHIP	Screen level pressure, wind, humidity
	DRIBU	Screen level pressure, wind, humidity

# PRODUCTION CYCLE



# PRODUCTION

- Implemented to ecfLOW at ECWMMF
- Computation at CCA
- Implementation nearly finished
  - Archiving to ECFS
  - Small bug in SMA
- Start of production planned for late February 2016
- 5 test years 2006 to 2010

# ESTIMATED COSTS

## 1.) Computational time

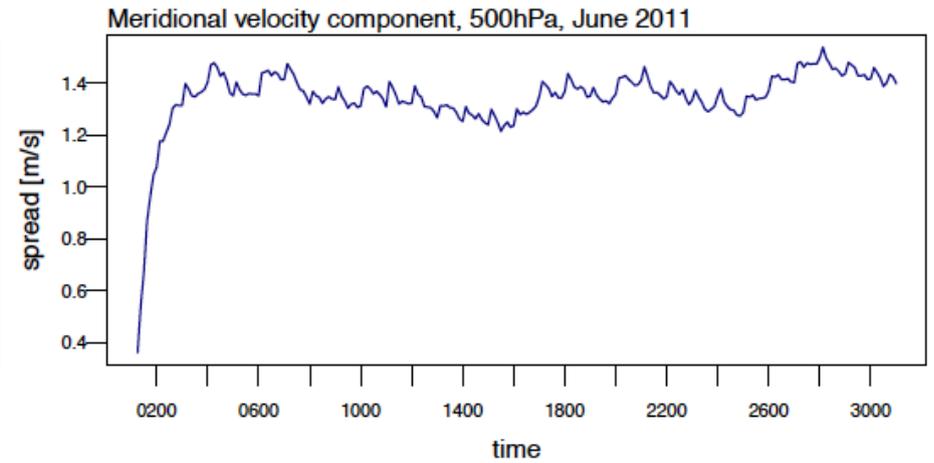
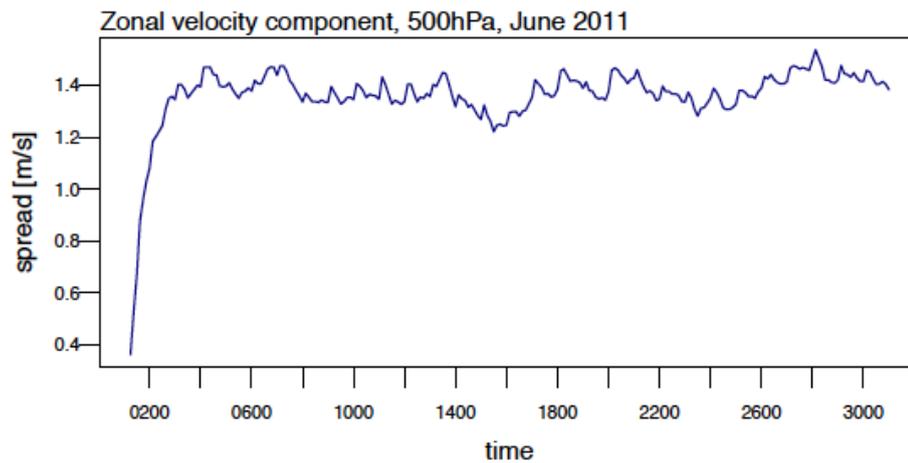
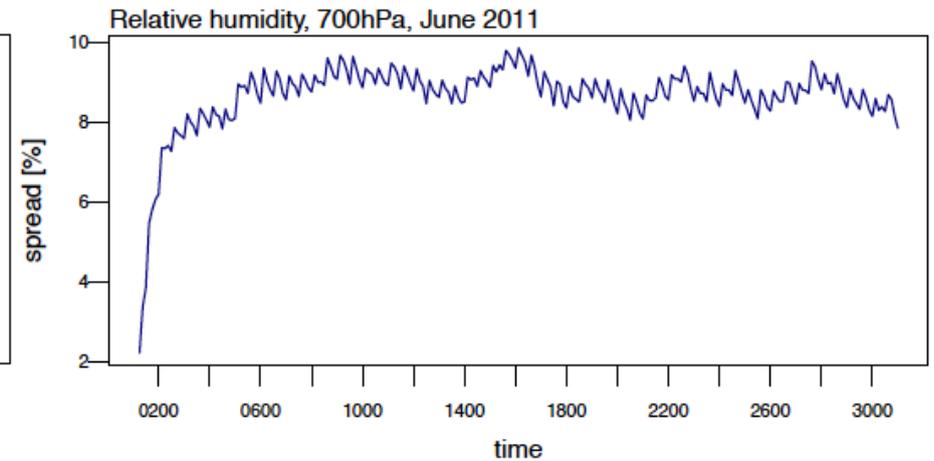
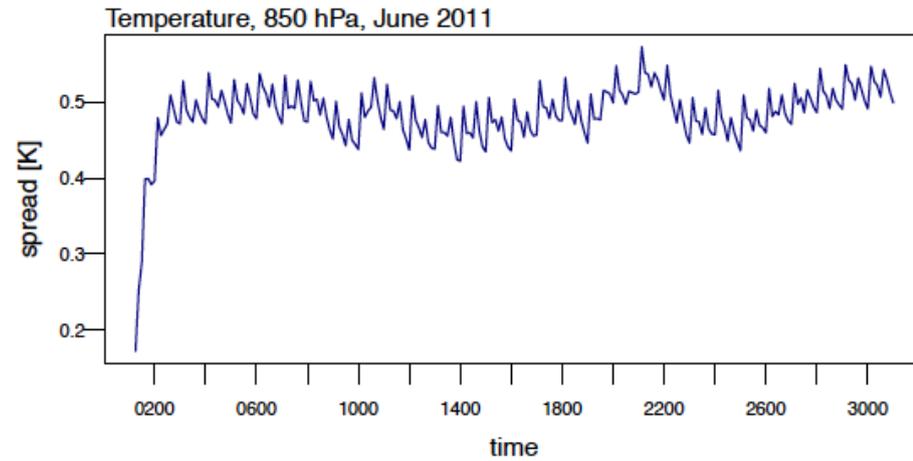
- 5 years à 21 members at 12 km grid spacing
- Speed about 0.5 days/hour
- 5 months pure computing time + archiving
- **Should be completed by the end of 2016**

## 2.) Disk storage

- 1 day of 12km version costs 9G/Member (as tar.gz)
- 5 years à 21 members ~**350 T**

# SOME RESULTS

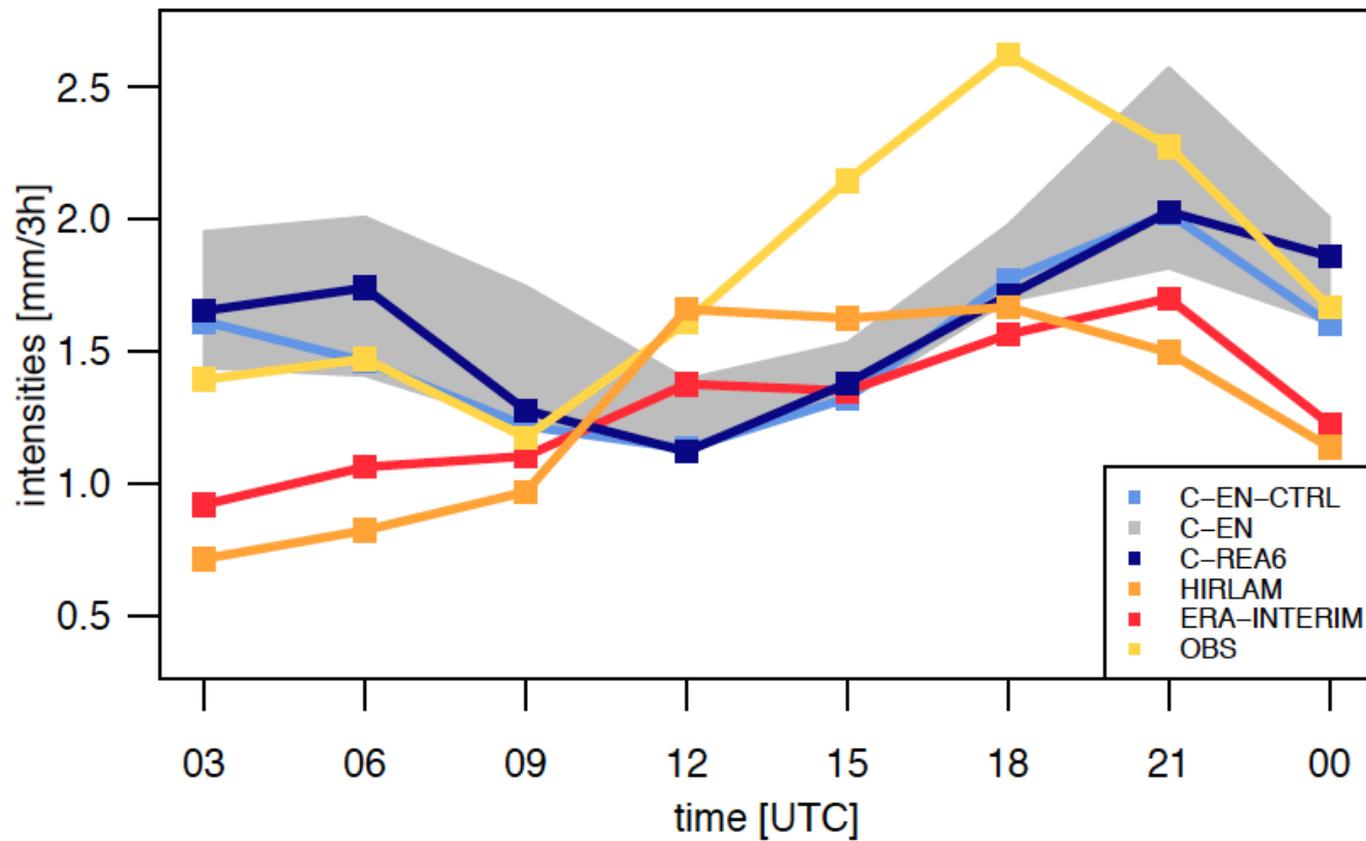
# SPREAD



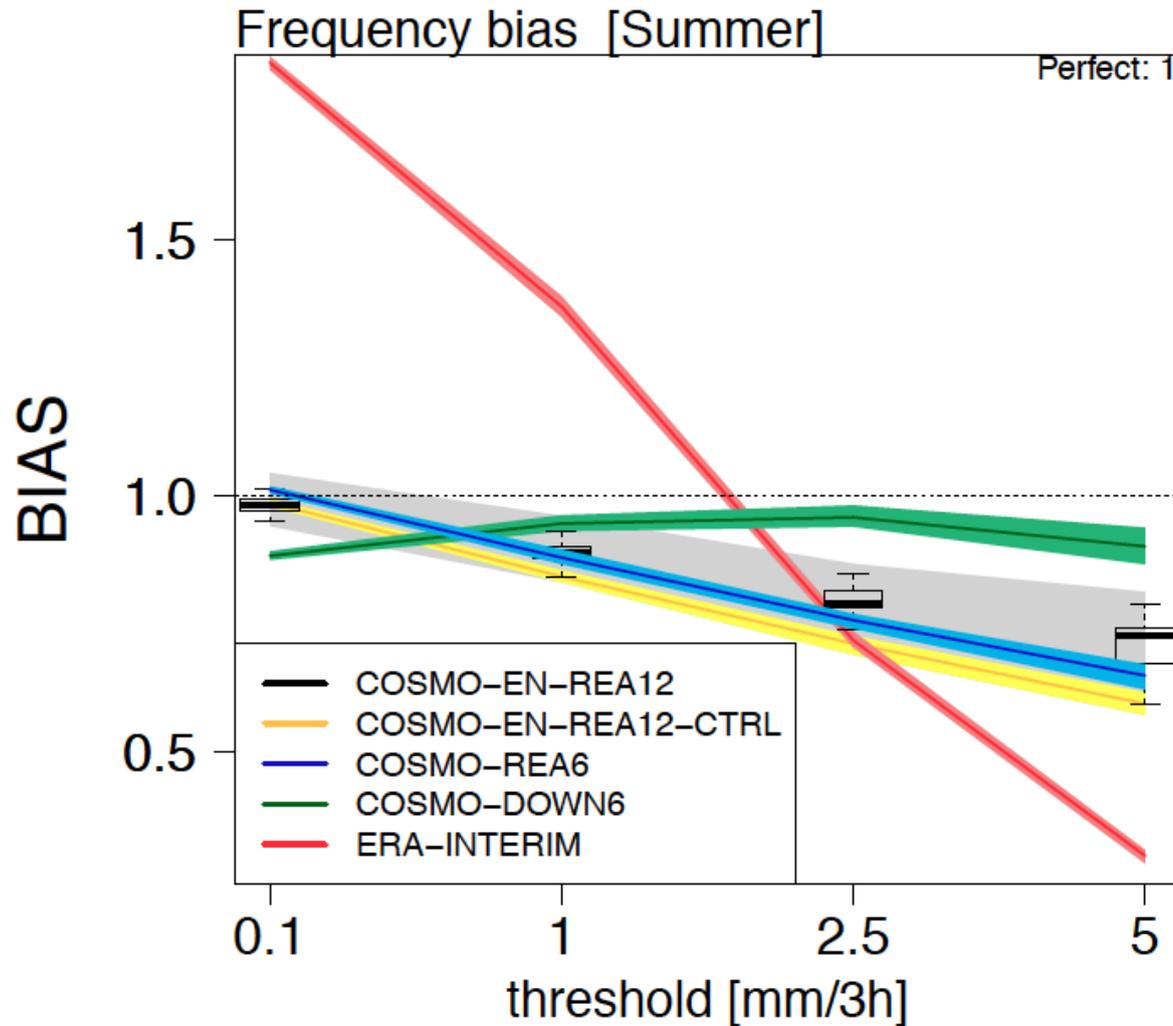
# VERIFICATION OF PRECIPITATION

- Representation of precipitation should have an added value compared to ERA-INTERIM
- 2 longer experiments, June / December 2011
- Verification in German subdomain
  
- Probabilistic verification: 6-hourly precipitation sums
  - Comparison to +06 forecasts of ECMWF-EPS

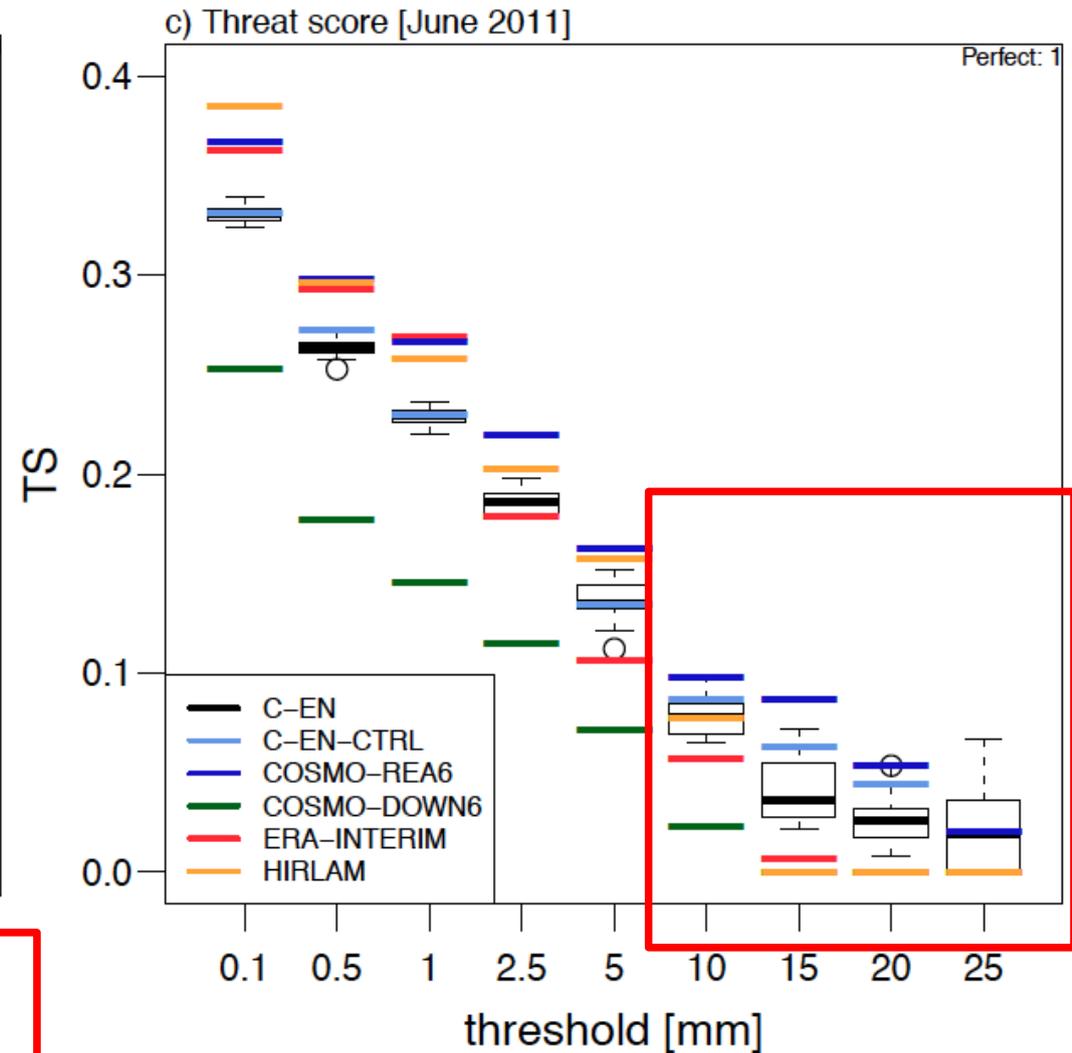
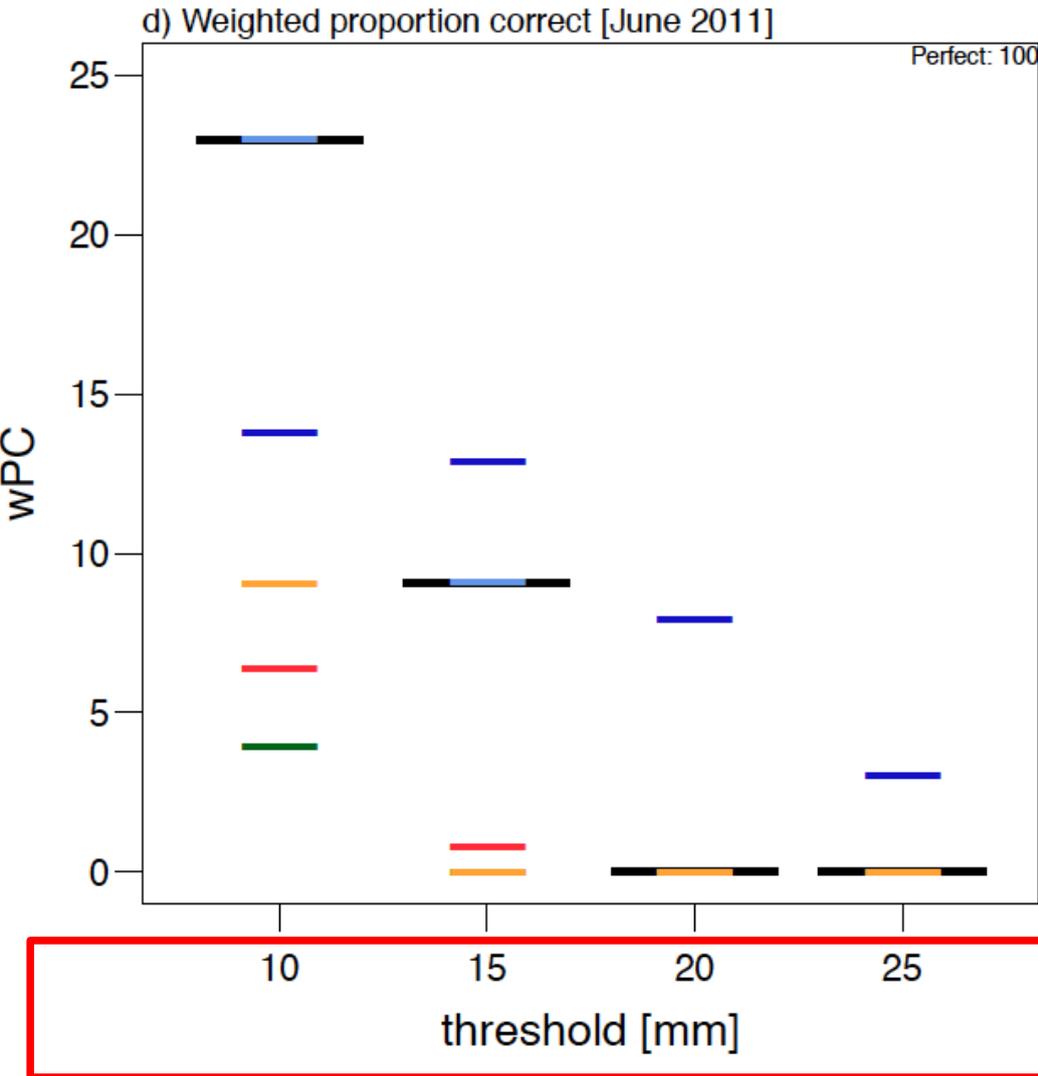
# DIURNAL CYCLE OF PRECIPITATION INTENSITIES



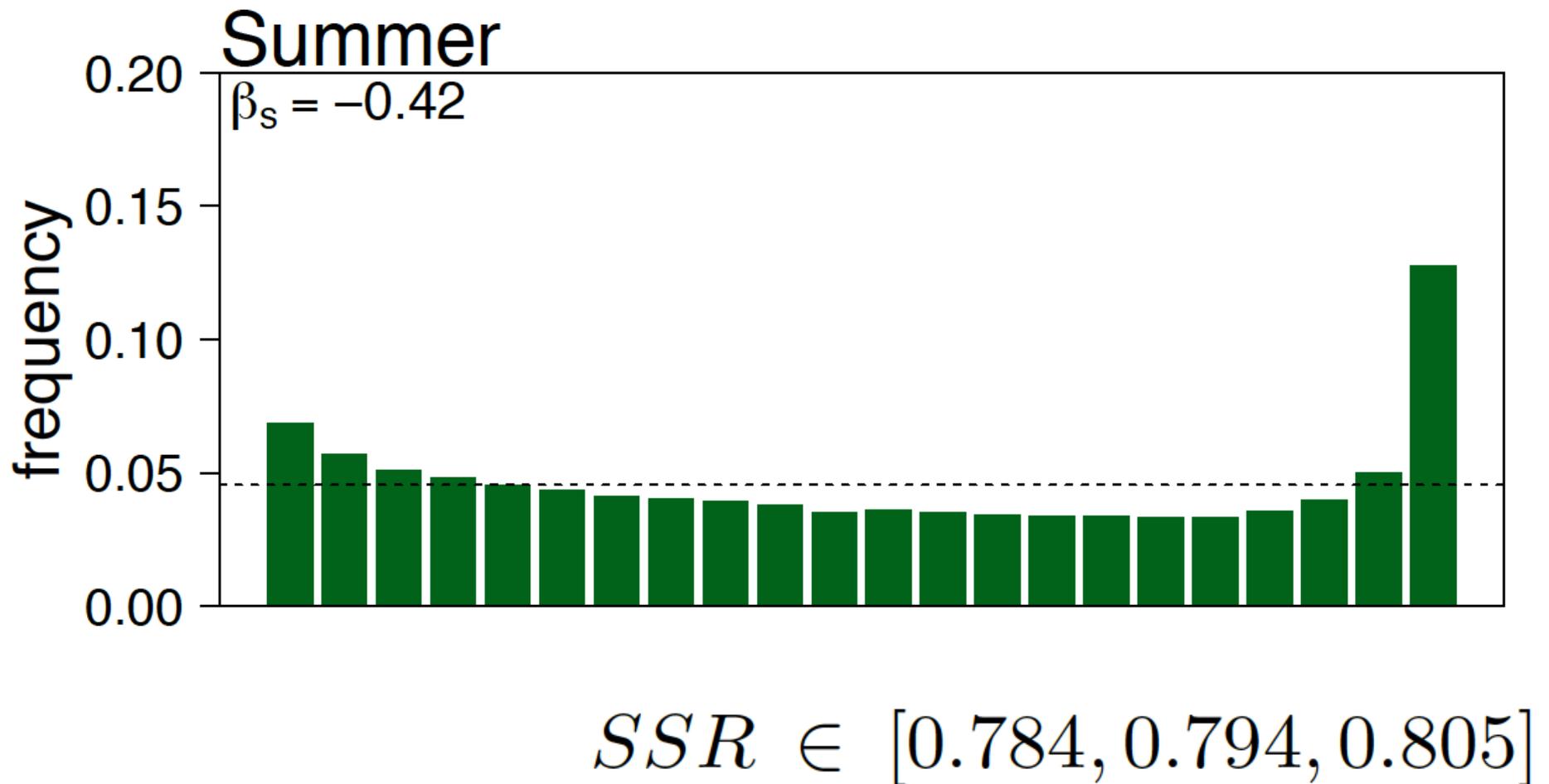
# AGREEMENT OF MARGINAL DISTRIBUTIONS



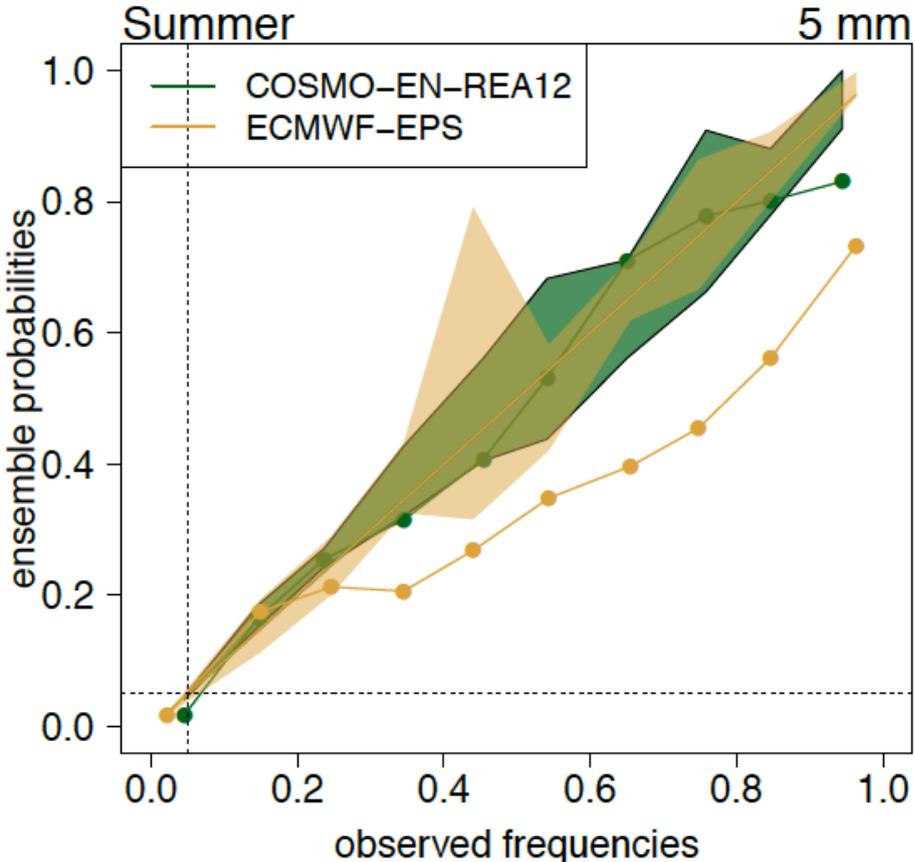
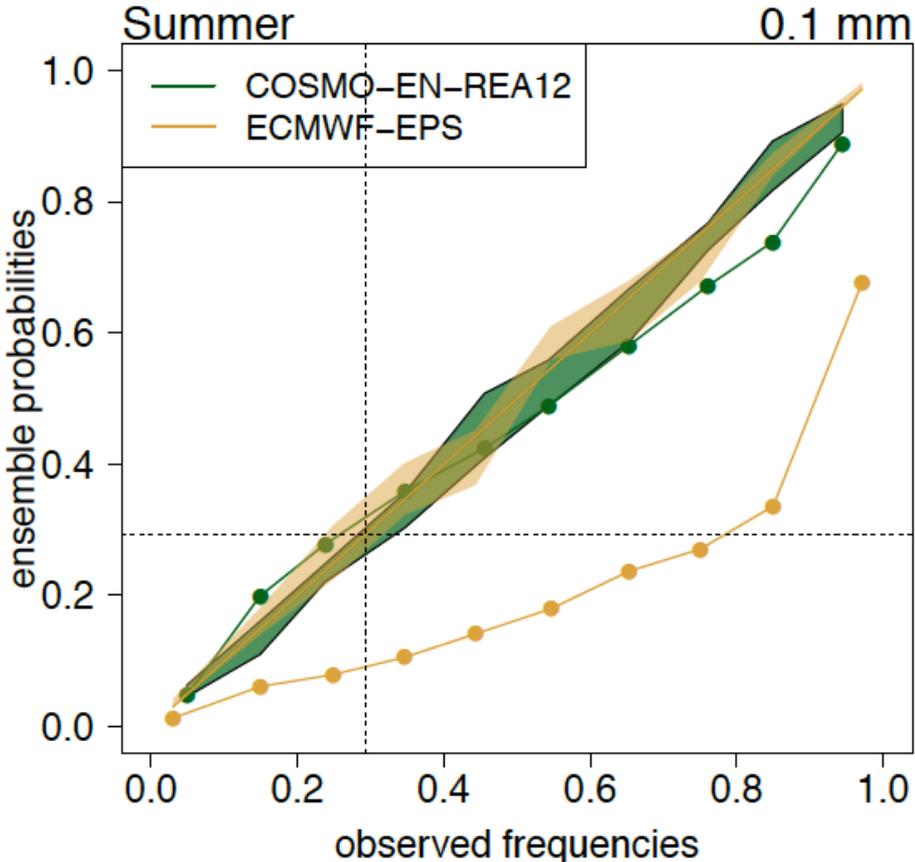
# AGREEMENT OF CONDITIONAL DISTRIBUTIONS



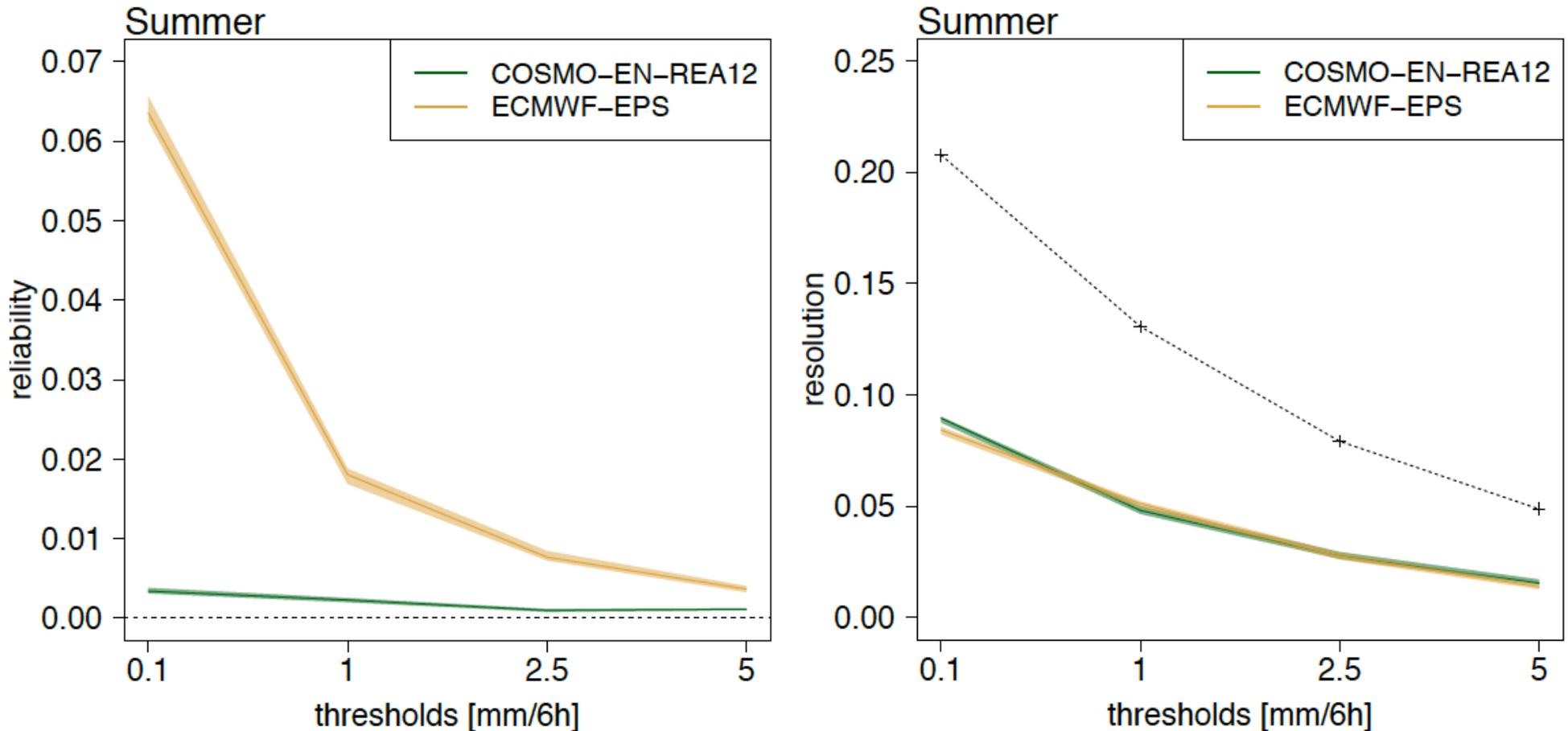
# EQUAL-LIKELIHOOD



# RELIABILITY

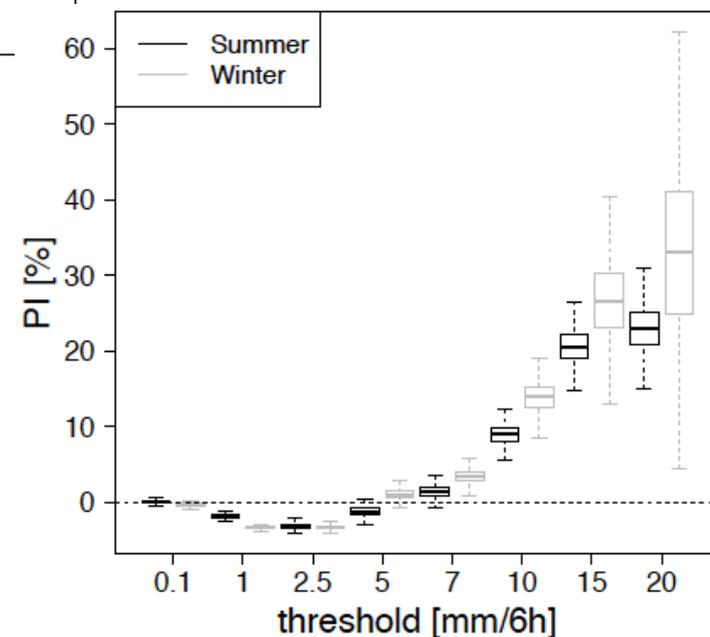
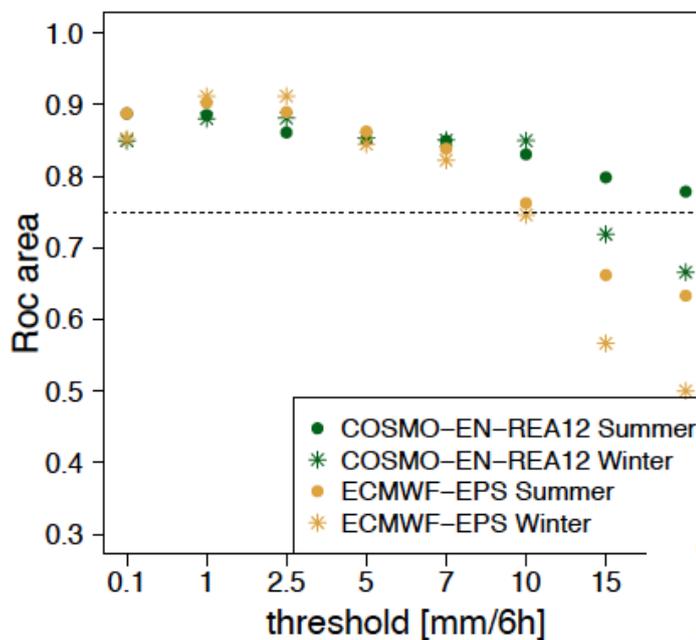
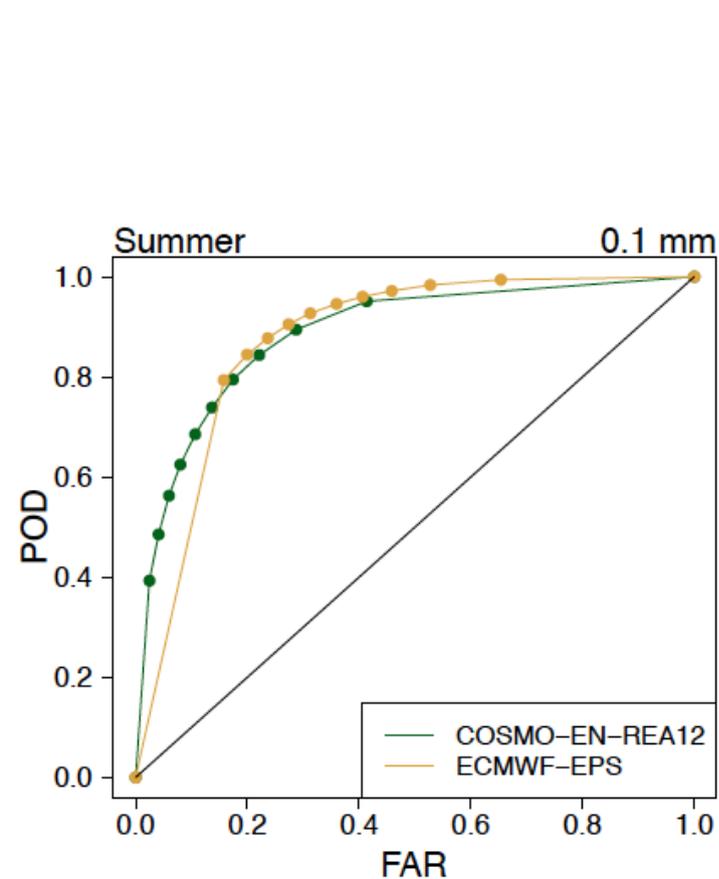


# RELIABILITY & RESOLUTION



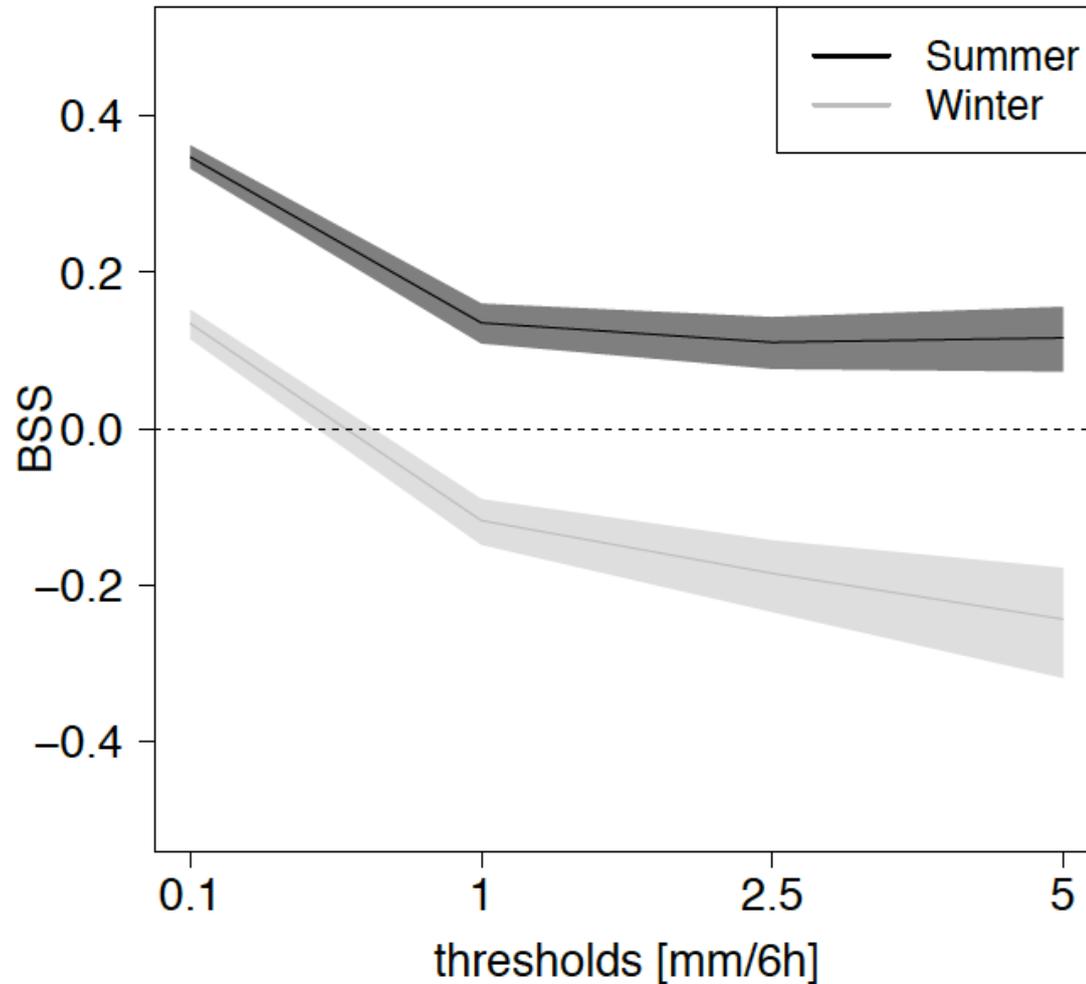
$$BS = \underbrace{\frac{1}{n} \sum_{i=1}^N N_i (y_i - \bar{o}_i)^2}_{\text{Reliability}} - \underbrace{\frac{1}{n} \sum_{i=1}^N N_i (\bar{o}_i - \bar{o})^2}_{\text{Resolution}} + \underbrace{\bar{o}(1 - \bar{o})}_{\text{Uncertainty}}$$

# DISCRIMINATION



difference of conditional probabilities from the climatic average

# SKILL



Summer

$CRPSS \in [-0.01, 0.00, 0.012]$

$CRPSS \in [-0.02, 0.00, 0.016]$

Winter

# BENEFITS BY THE ENSEMBLE

- Added value in frequency bias
- Added value at high precipitation thresholds
- **Uncertainty estimation** for 12 km model set up given observation uncertainties (70 to 80 %)
- Quite **well-calibrated ensemble** (analysis rank histogram)
- **Reliability** win compared to ECMWF-EPS (reliability diagrams, BS)
- **Resolution/discrimination** (roc curve, BS)
- **Probabilistic accuracy** comparable to ECMWF-EPS (CRPSS)

# RESEARCH PLANS

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- *What are the uncertainties in regional reanalyses?*
- Experiments with
  - Lateral boundary conditions
    - ICON-Ensemble
    - ERA-5
  - Model physics
    - Perturbed physics ensemble
    - SPPT
- What combination of uncertainty sources will lead to the best spread skill ratio? What is the most important source of uncertainty?
- Experiments with LETKF + ICON-ENS at 12 km

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# TEMPERATURE T2M

Only German stations with +/-50 height difference to model grid point

	RMSE [K]	BIAS [K]
Control	1.69	0.09
Ensemble Mean	1.64	0.06