

Towards an operational use of the KENDA system at DWD

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talk outline

- motivation
- towards operational use of KENDA:
 - deterministic forecasts: comparison KENDA-LETKF vs. nudging + LHN
 - EPS: comparison to COSMO-DE-EPS setup → *Richard Keane*
- use of additional high-resolution observations (outlook)
 - *Michael Bender, Theresa Bick, ...*



Motivation : Why develop Ensemble Data Assimilation ?

convection-permitting NWP:

stochastic nature of (air-mass) convection

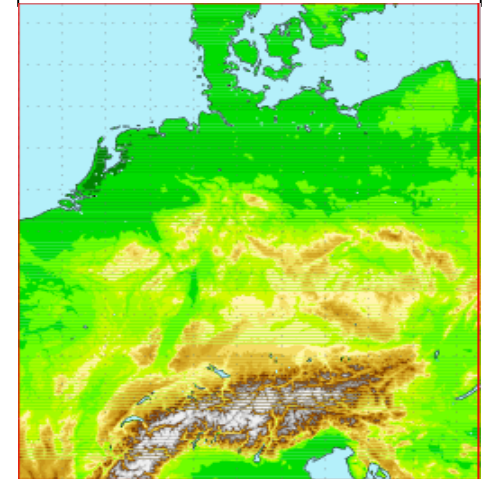
→ deliver probabilistic (pdf) rather than deterministic forecast

→ need ensemble prediction system (EPS)

COSMO-DE EPS operational,
but without data assimilation (DA) cycle

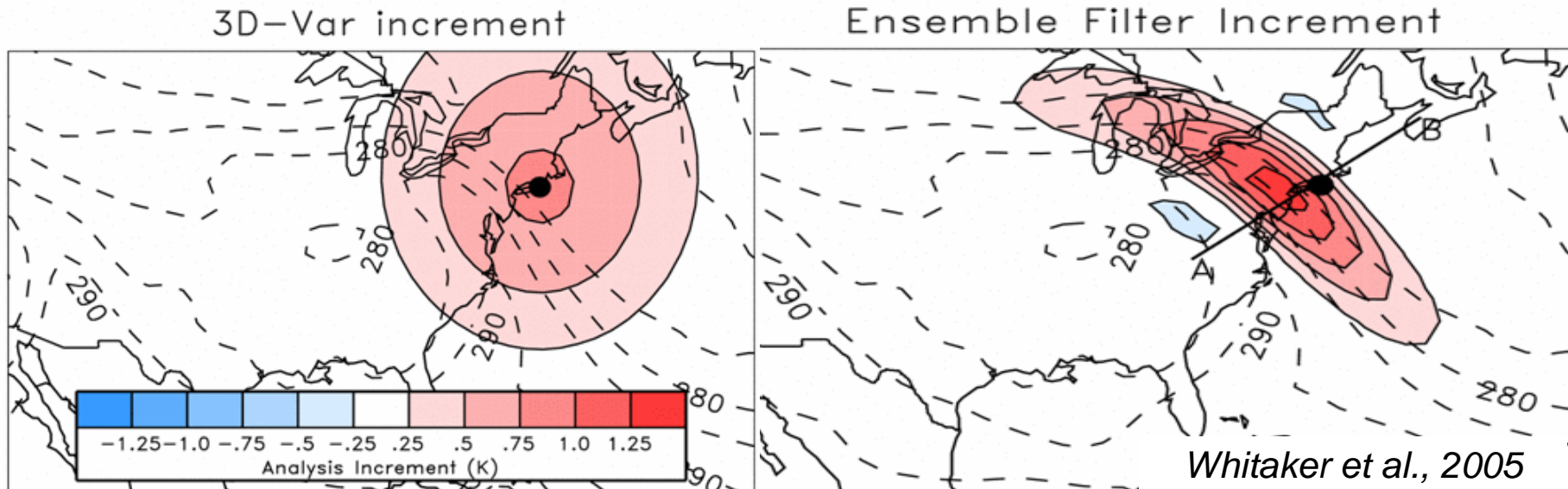
→ develop ensemble DA
to provide suitable **perturbed IC for EPS**

COSMO-DE
($\Delta x = 2.8$ km)
deep convection
simulated explicitly



Motivation : Why develop Ensemble Kalman Filter (EnKF) ?

analysis increments given a single observation



- EnDA / EnKF : uses first guess (1h forecast) ensemble to estimate current, flow-dependent first guess errors + use
- ensemble spread mainly localised over frontal area, + fcst. errors assumed in EnKF
- observation causes analysis increments over frontal area
- advantage esp. in convective scale, where error covariances strongly flow dep.

Motivation : Why develop EnKF / LETKF ?

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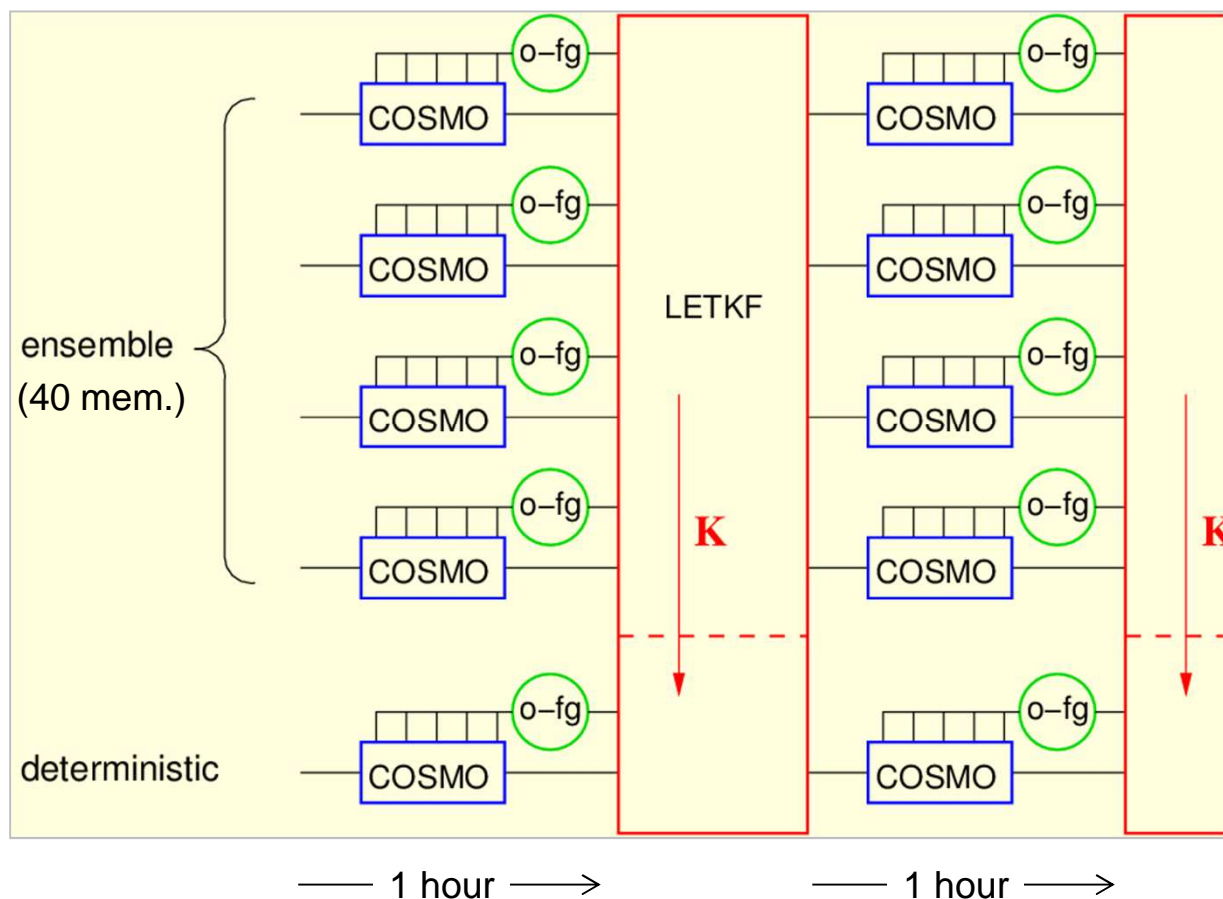
1. provide **perturbed IC for EPS**
 2. improved analysis / forecast quality by use of **multi-variate, flow-dependent error covariances**
 3. better suitable than current operational nudging scheme for use of **indirect observations (satellite, radar, etc.)**:
 - nudging requires retrievals (e.g. T-, q- profiles from satellite radiances)
 - EnKF: apply forward observation operator (→ simulated radiances)
- **Local Ensemble Transform Kalman Filter (LETKF)**, Hunt et al. 2007) ,
(because of its relatively low computational costs)
- developed in COSMO priority project: Km-scale ENsemble DA (**KENDA**)



KENDA-LETKF: setup, with deterministic analysis / forecast



LETKF: KENDA



→ **4D-LETKF**

→ **K**: Kalman Gain
for ensemble mean
(to compute ana incr.)

→ benchmark:
Nudging



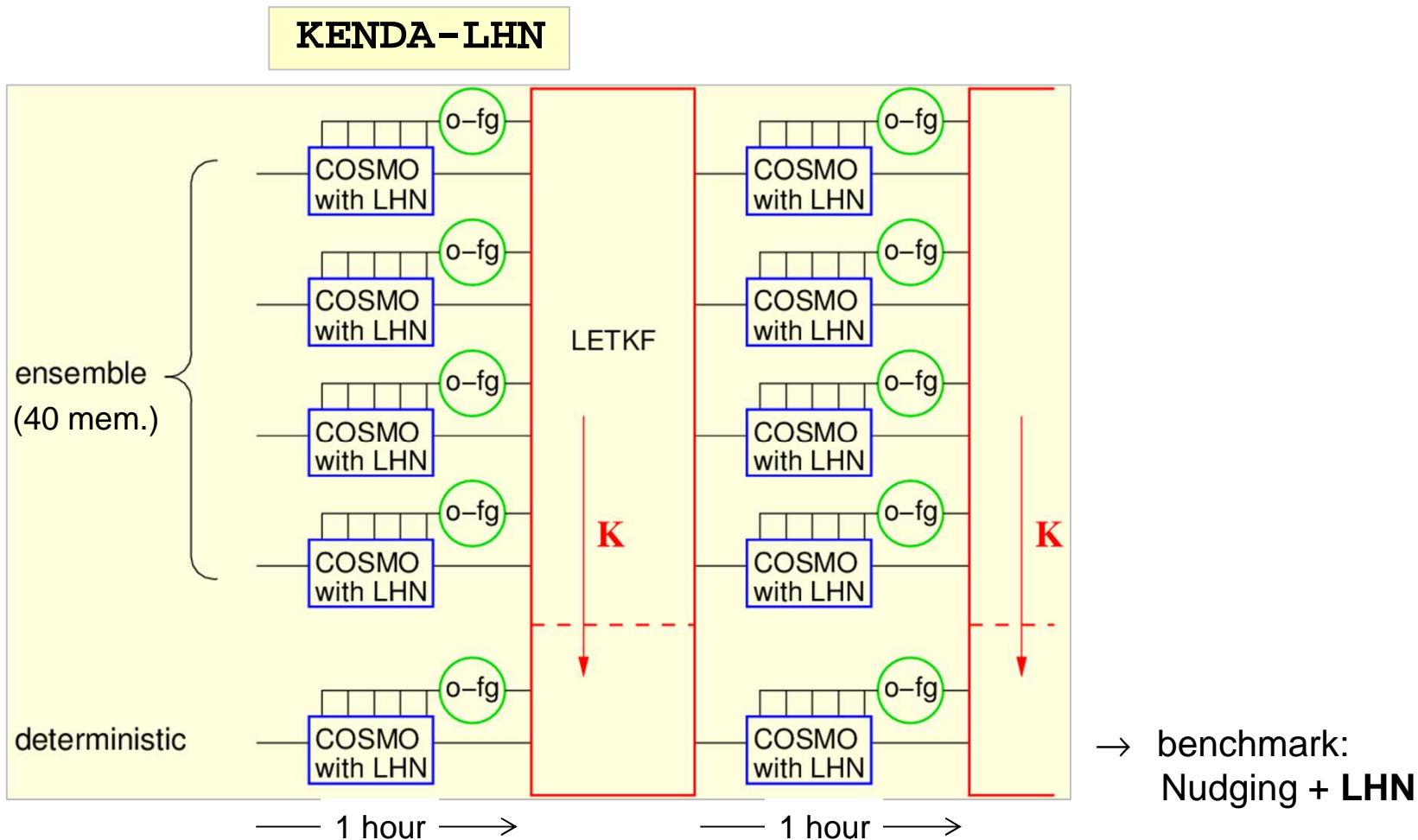


DWD

- 1st goal: replace nudging + LHN with **deterministic** LETKF analysis for COSMO-DE ($\Delta x = 2.8$ km)
 - for operation-ability: quality of deterministic forecast from KENDA (using conventional obs: radiosonde, aircraft, wind prof, surface) as good as nudging + LHN (for use of radar precip)
 - **test period 28 days** (18 May – 15 June 2014 : convection, little advection)
 - adaptive localisation & multiplicative covariance inflation, RTPP (relaxation to prior perturbations), soil moisture perturbations
 - LBC from 80-km ICON-LETKF / 40-km 3DVar , conv. obs , 1-hrly LETKF cycle
 - **combine LETKF with LHN, compare with nudging (+ LHN)**
- 2nd goal: use KENDA for IC of COSMO-DE-**EPS** (possibly in combination with other perturbations)



KENDA-LETKF: setup, with LHN added to LETKF



LETKF + LHN : new approach, does it work ?



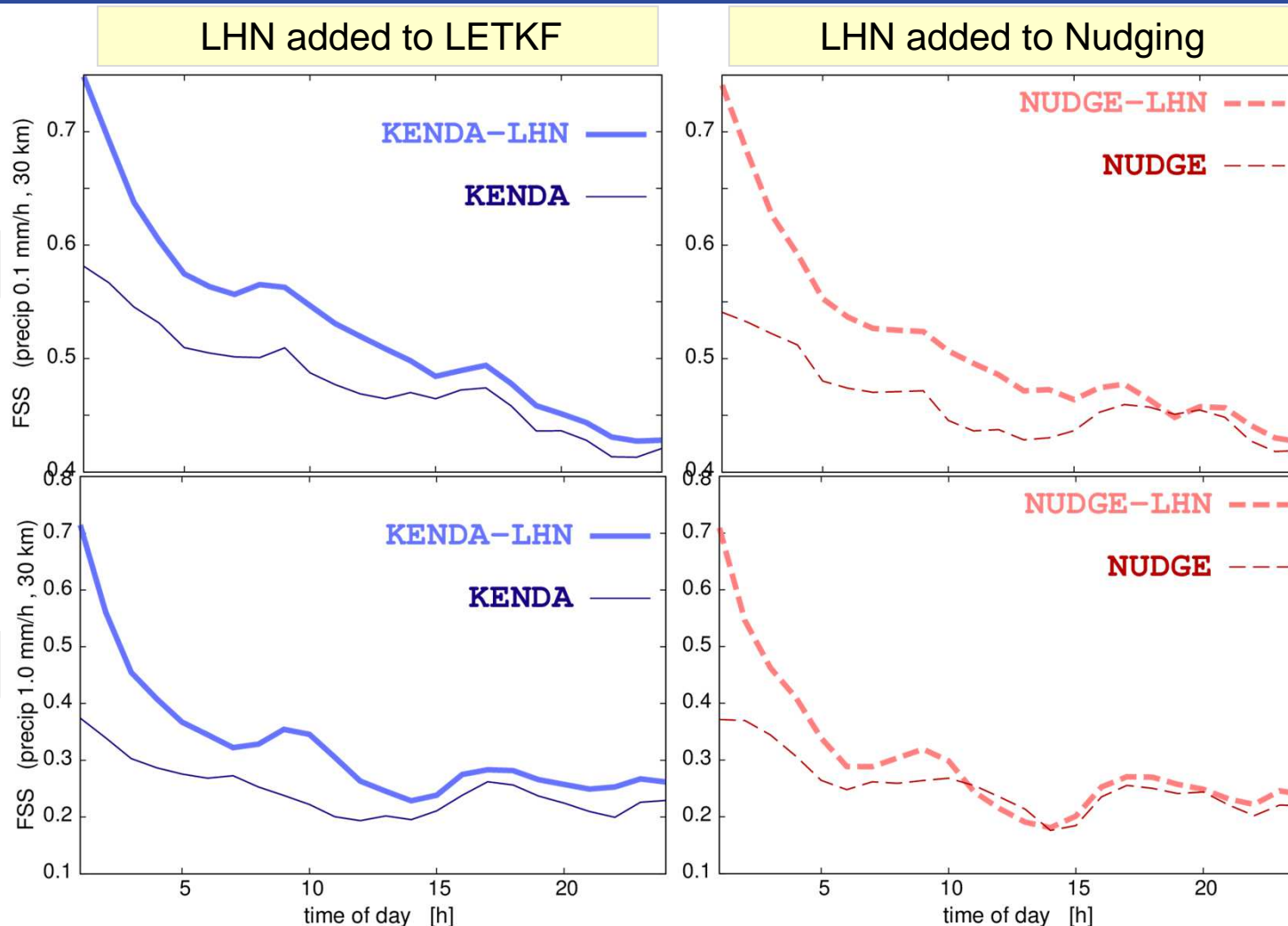
KENDA-LETKF for deterministic forecasts: impact of LHN

28 days
18.05. – 15.06.
2014

0.1 mm/h

0-UTC runs
precip
FSS
(30 km)

1 mm/h



✓ LHN added to LETKF: large, long-lived positive impact from LHN (except 12 UTC run)

✓ LHN added to nudging: less (long-lived) positive impact, particularly for higher thresholds



KENDA-LETKF for deterministic forecasts: comparison to Nudging

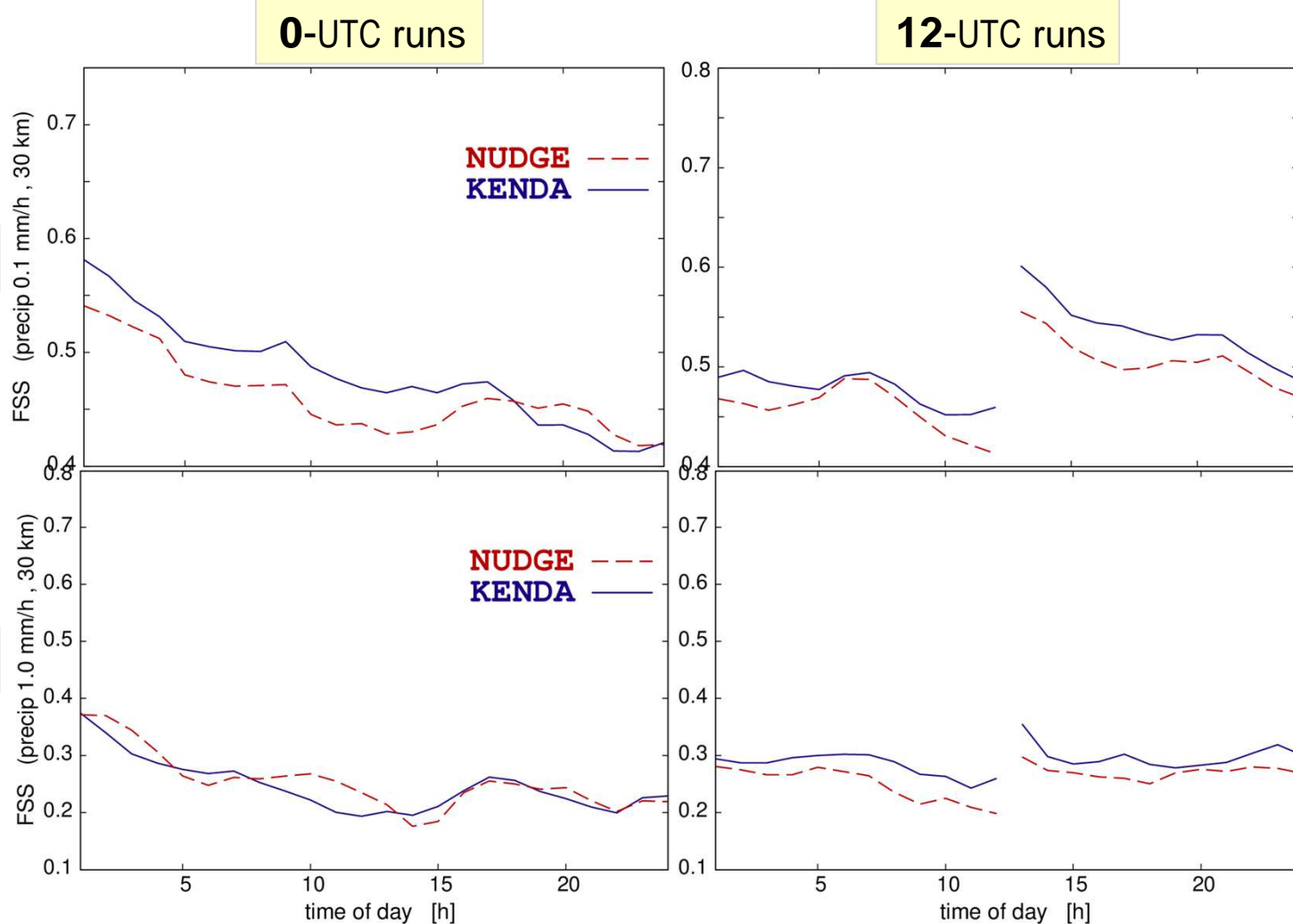


28 days
18.05. – 15.06.
2014

0.1 mm/h

**precip
FSS
(30 km)**

1 mm/h



✓ without LHN: usually long-lived advantage of KENDA over nudging



KENDA-LETKF for deterministic forecasts: comparison to Nudging + LHN

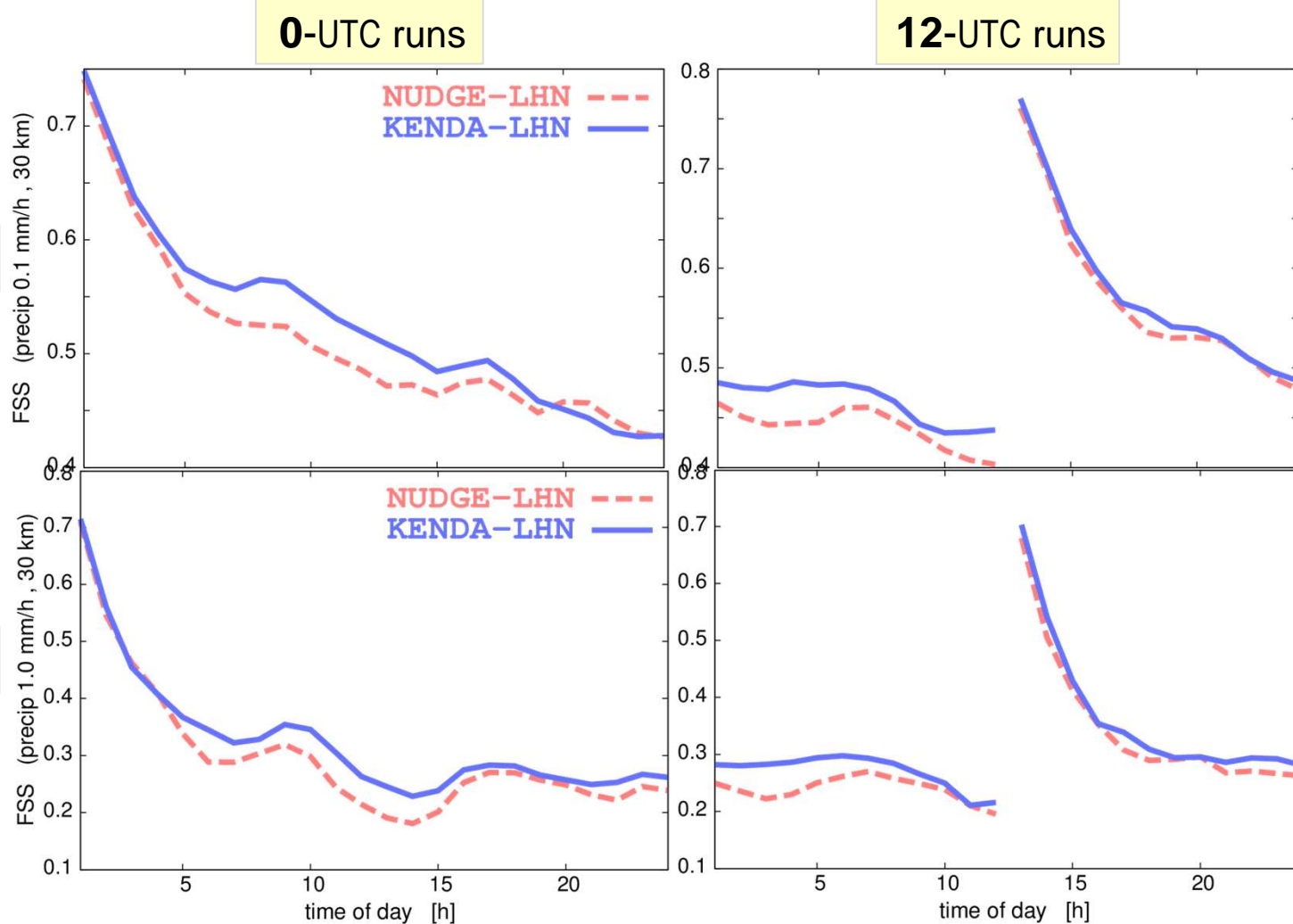


28 days
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**precip
FSS
(30 km)**

1 mm/h



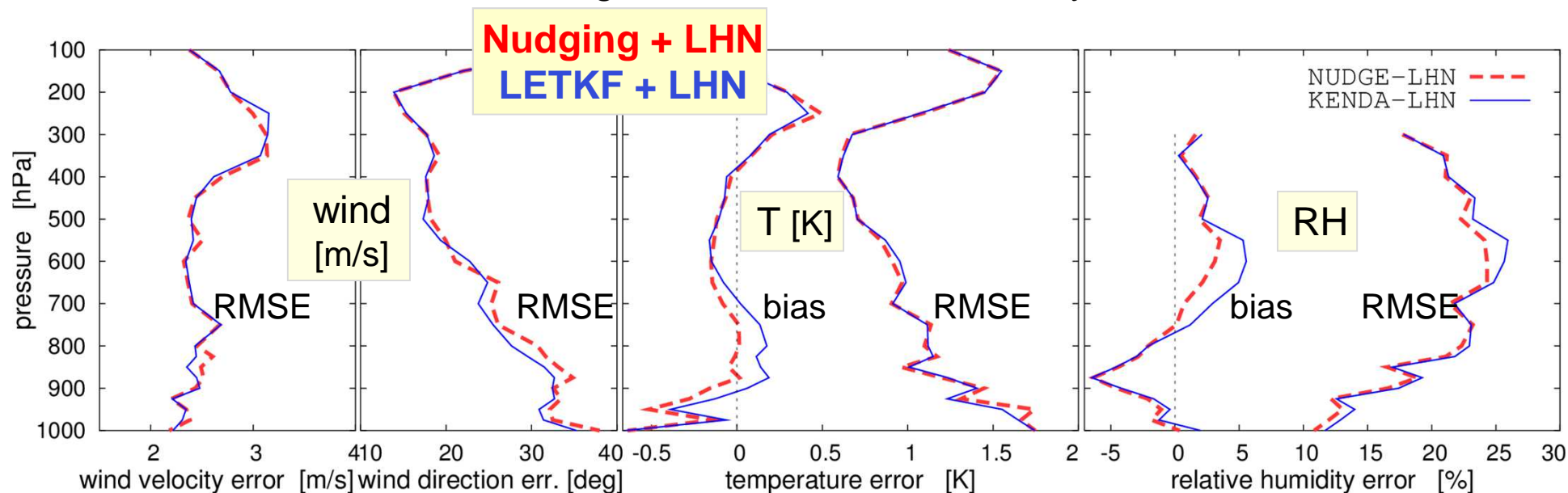
✓ with LHN: small difference in first 4 hours due to dominating influence of LHN, thereafter, advantage of KENDA over nudging tends to be larger than without LHN



KENDA-LETKF for deterministic forecasts: comparison to Nudging + LHN



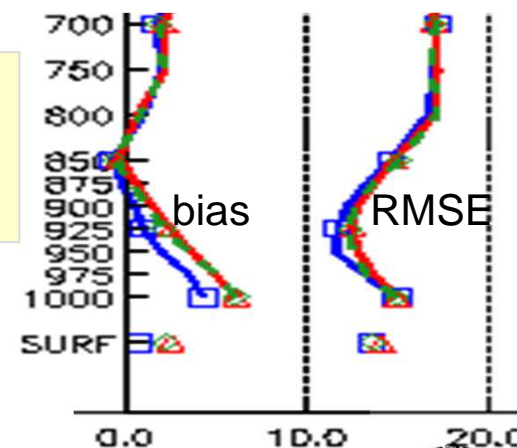
verification of 6-h forecasts against radiosondes , 28 days (18.05. – 15.06. 2014)



MeteoSwiss: 2 months
(March + April 2015)

Nudging
LETKF
NO-OBS

- ✓ LETKF: smaller wind errors, larger humidity errors
- ✓ LETKF less able to correct (model) biases

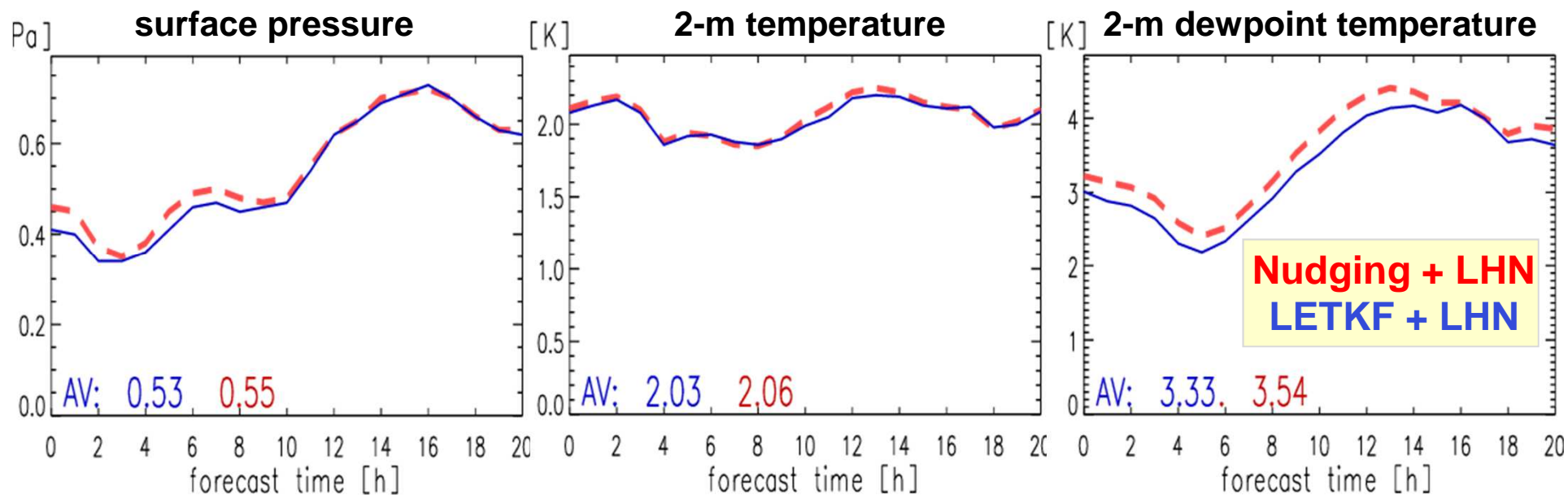


KENDA-LETKF for deterministic forecasts: comparison to Nudging + LHN

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SYNOP verification (RMSE) of **0-UTC** forecast runs , 28 days (18.05. – 15.06. 2014)



✓ LETKF: neutral or smaller errors, particularly pressure and humidity





- DWD :** **LETKF outperforms nudging**, in particular if both **combined with LHN**,
in test periods (→ Schraff et al., QJRM 2016, in press)
- most critical criterion for operationability fulfilled (still **more periods required**)

remaining issues:

- **upper-air humidity** verifies slightly worse, mainly in **PBL**
(also MeteoSwiss → [talk by Leuenberger et al](#))
 - should be investigated (non-Gaussianity of relative humidity ?
sampling noise in LETKF cross-covariance ?)
 - tolerable, considering benefits for other variables (precip !) (DWD)
- LETKF less able than nudging to correct (temperature, humidity) **model biases**
 - inherent, difficult to solve in LETKF
 - needs improvement of model itself



KENDA-LETKF for COSMO-DE-EPS → Richard Keane et al.

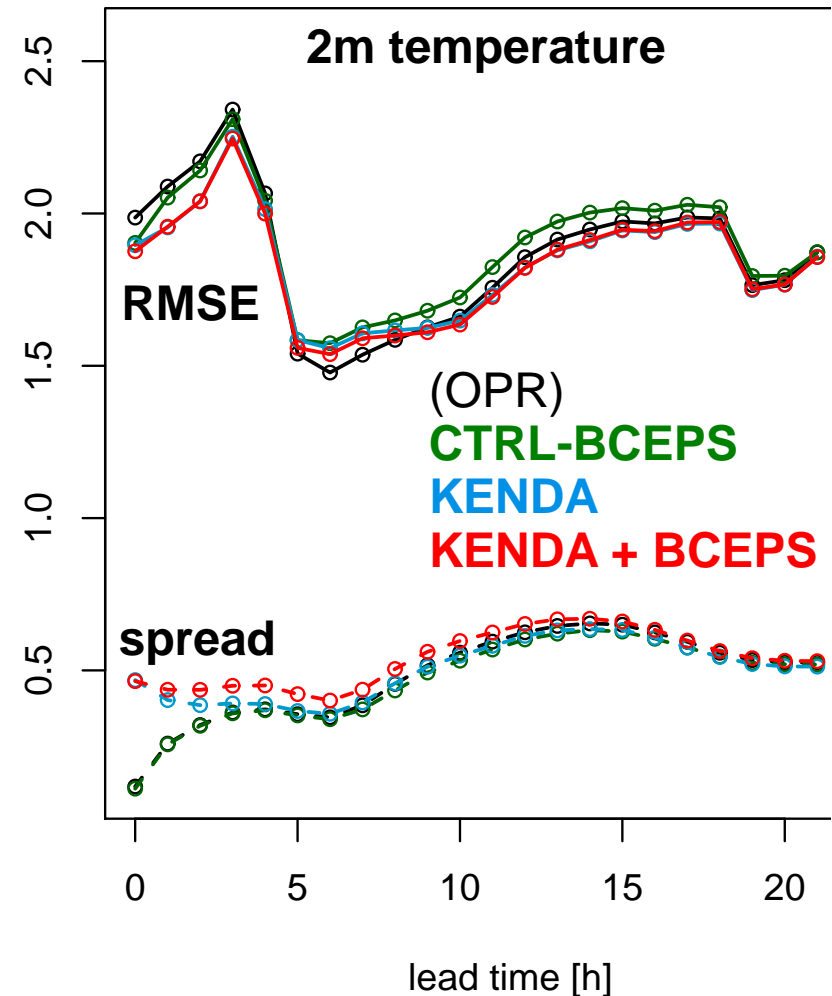
OPR: IC: C-DE operational determin. analysis (nudging + LHN; LBC from 7km C-EU)
+ perturbations from 4 global models
LBC: BCEPS (reflecting 4 global models)

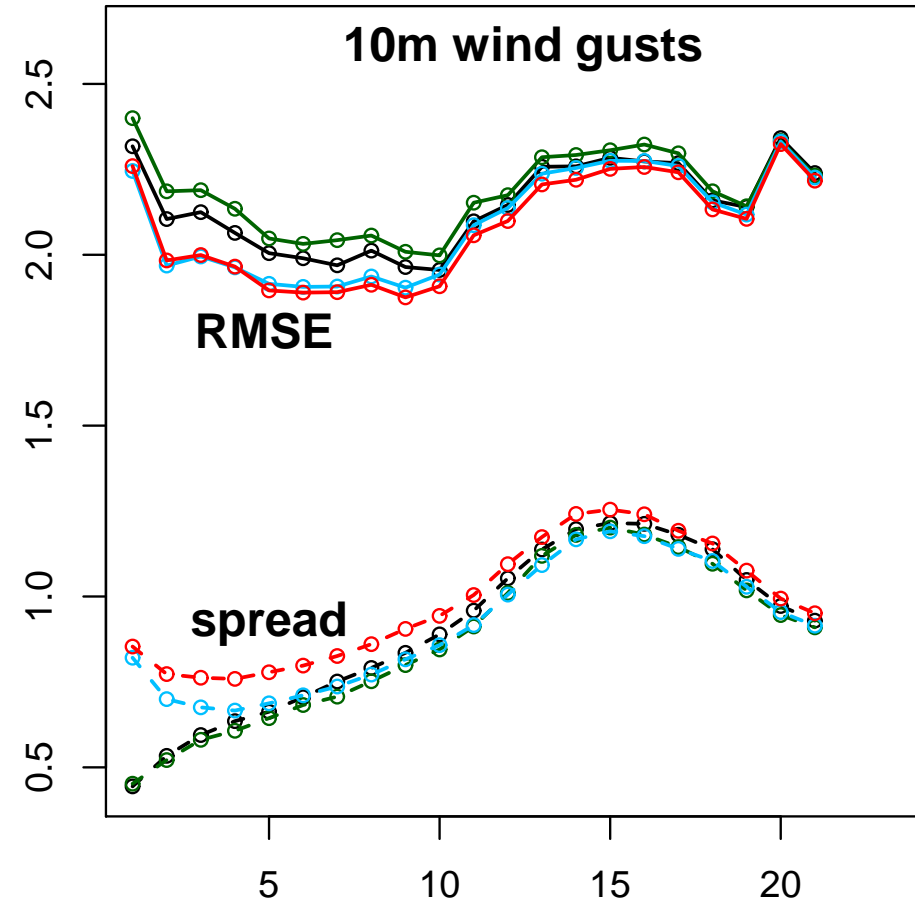
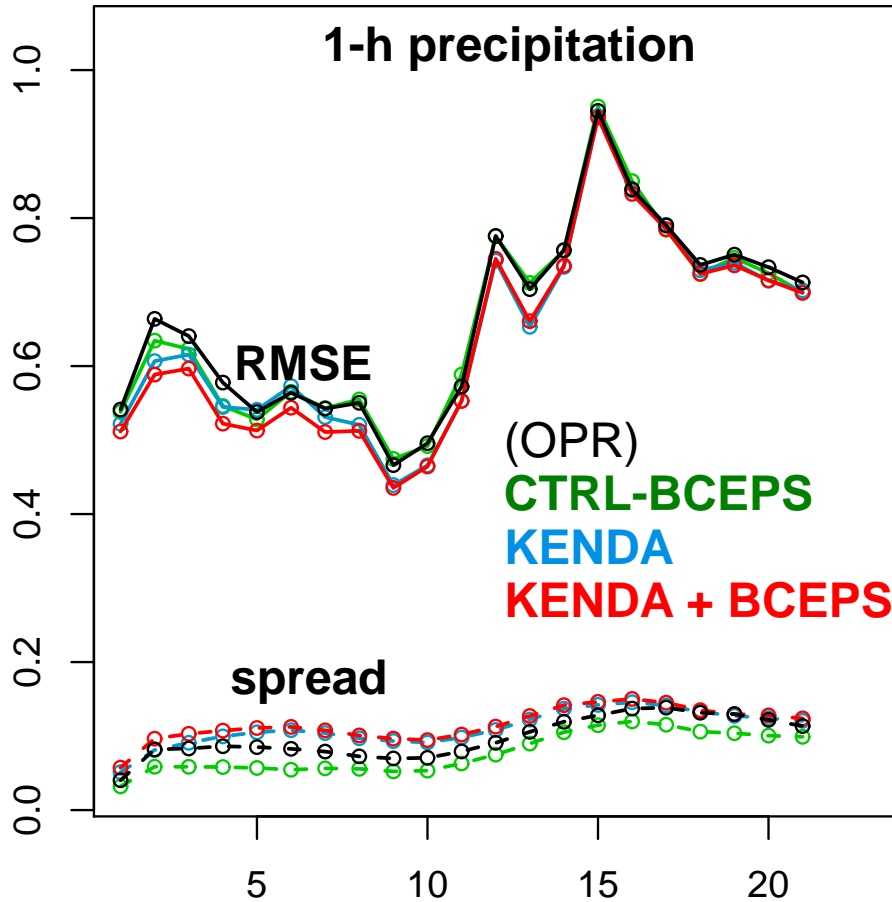
CTRL-BCEPS: as OPR, but
C-DE det. ana with LBC
from 40-km ICON-3DVar

KENDA : IC from KENDA (i.e. LBC
from 80-km ICON-LETKF
40-km ICON-3DVar)

KENDA + BCEPS: 15 IC from KENDA
+ 5 IC from reference 40km

- ✓ KENDA: smaller RMSE, initially larger spread than CTRL-BCEPS
- ✓ KENDA + BCEPS: even better





- ✓ **KENDA + BCEPS > KENDA > CTRL-BCEPS**
- **KENDA-IC better than IC from nudging + perturbations from global models, but adding a few members with perturbations from global models allows the EPS to cover a larger part of the true forecast uncertainty, without increasing forecast errors**



DWD

- **parallel** (pre-operational) **suite** with KENDA for COSMO-DE in March / April 2016
 - DA cycle: LBC from operational ICON-EnVar 40km/ **20km** + det 13km/ **6.5km**
 - deterministic forecast
 - 20-mem. EPS, KENDA IC, LBC from ICON-EU-EPS
 - 20-mem. EPS, KENDA IC; LBC from BC-EPS (like COSMO-DE-EPS)
- KENDA **operational** (at least replacing nudging)
 - in autumn 2016 or in 2017, dep. on IT (data base...) (and forecast quality)
- (COSMO-D2: postponed for technical reasons)





main aim for next years:

increase quality of KENDA-4D-LETKF analyses + forecasts (deterministic + EPS)
particularly of cloud + precipitation in very SR (towards nowcasting)

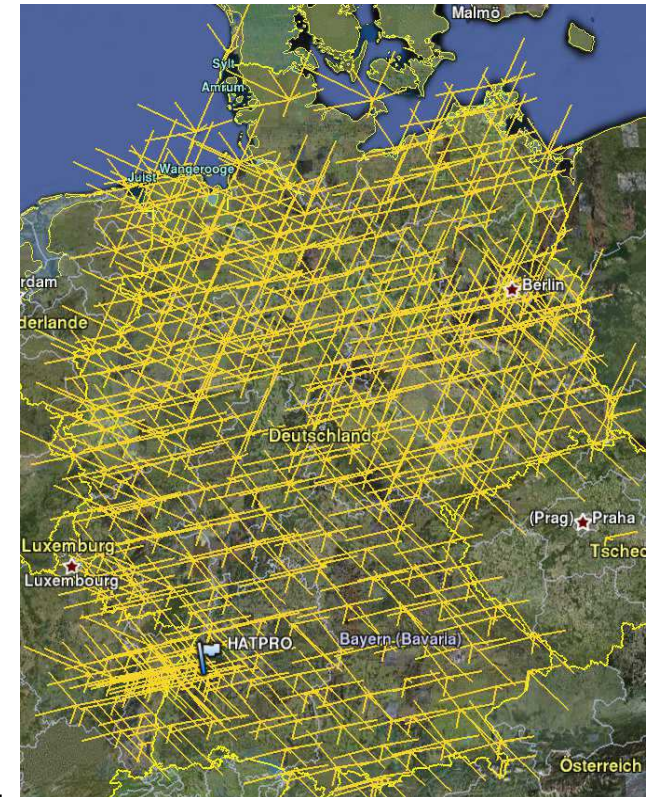
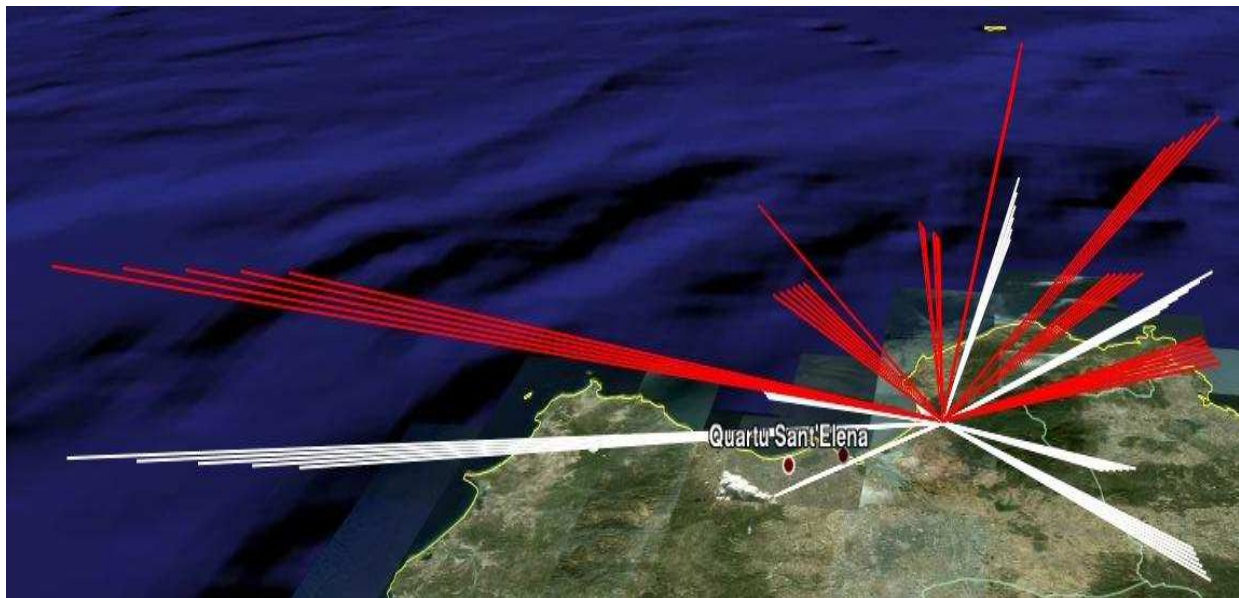
→ increase use of high-resolution obs for convective scale
(cloud, precip, humidity, PBL, surface → remote sensing)

→ new project **KENDA-O**: Km-scale ENsemble-based Data Assimilation
(09/2015 – 08/2020) for high-resolution **O**bservations



high-resolution obs: GNSS Slant Total Delay (STD)
→ Michael Bender (DWD/IAFE)

- GNSS (GPS) Slant Path Delay : **humidity integrated over path**
from ground station to GNSS (GPS) satellite, all weather obs
- (45) GPS obs from 1 station / 9 satellites in 15 min.



elevation angles $90^\circ - 5^\circ$

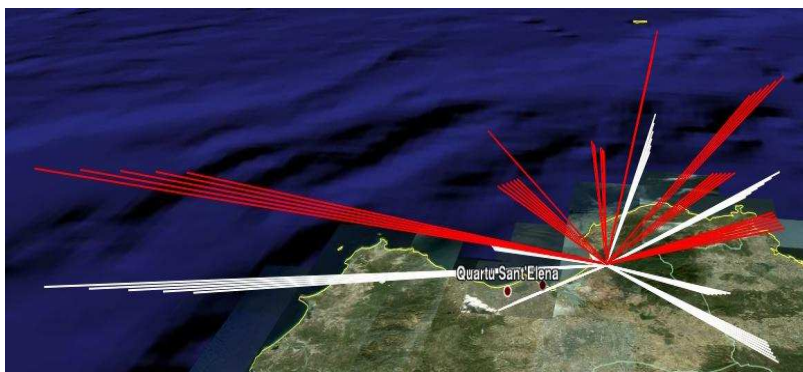
- many stations → 3-D information on humidity, but !
- at 5° (7°), path reaches height of 10 km at ~ 100 (80) km distance
- vert. + horiz. non-local obs (not point measurements)

high-resolution obs: GNSS Slant Total Delay (STD)
→ Michael Bender (DWD/IAFE)

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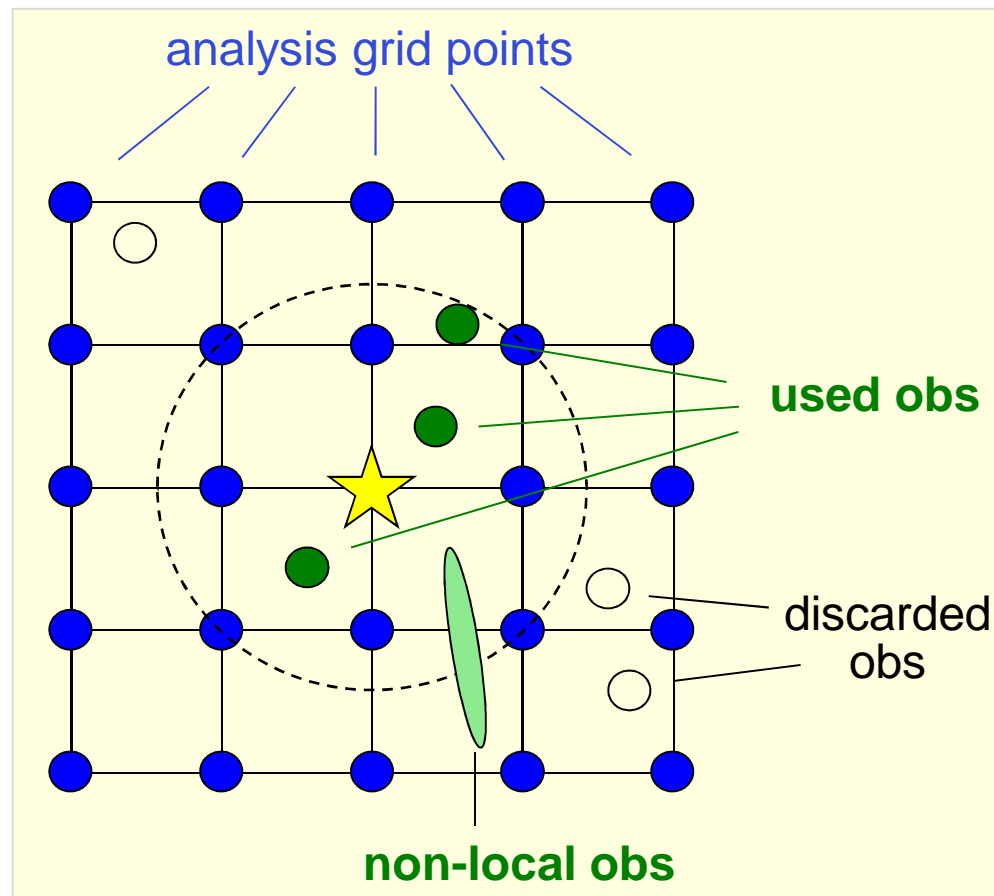
Slant Total Delay :
humidity integrated over path
from ground station to satellite



elevation angles $90^\circ - 5$

- vert. + horiz. non-local obs
- difficult to use in LETKF:

explicit localization (doing separate analysis at every analysis grid point,
select only obs in vicinity and scale \mathbf{R}^{-1})

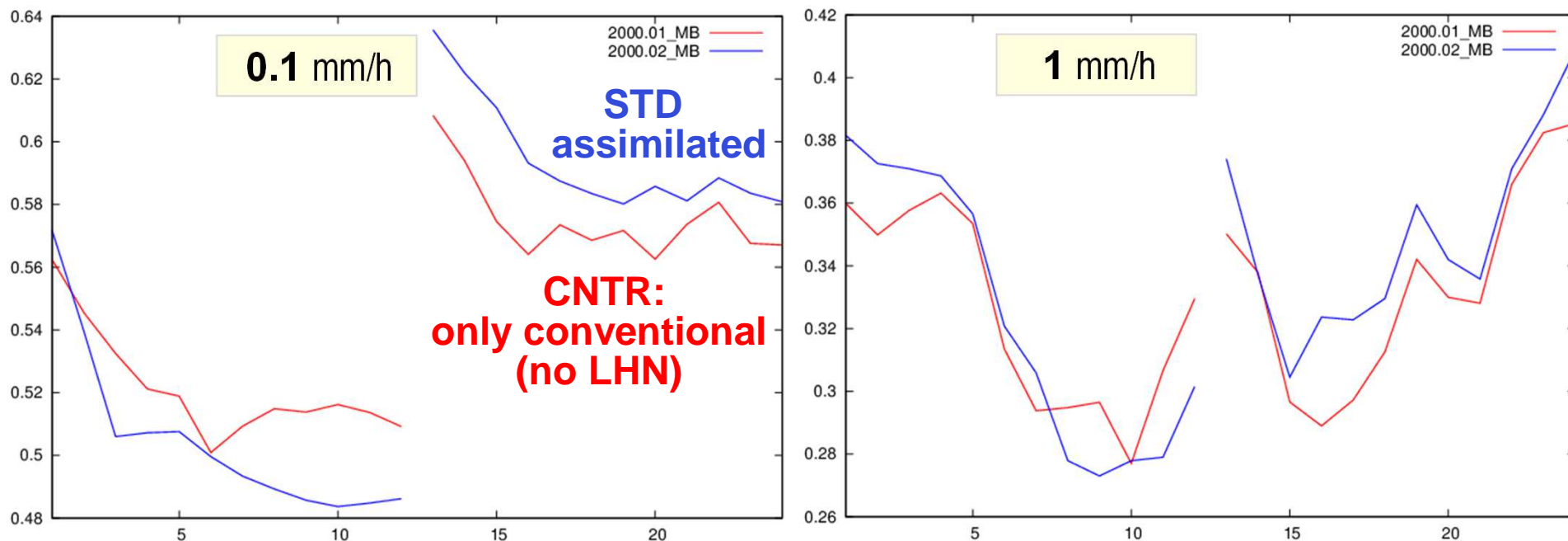


high-resolution obs:
GNSS-STD, first trial for use in KENDA

13 days
17. – 29.06.
2014

1-hrly precip
FSS
(30 km)

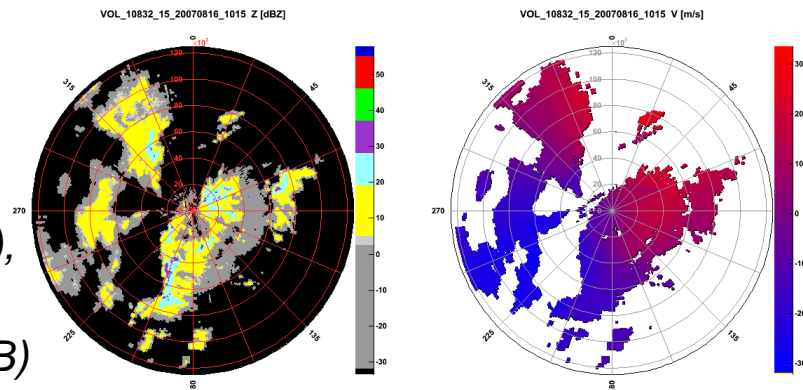
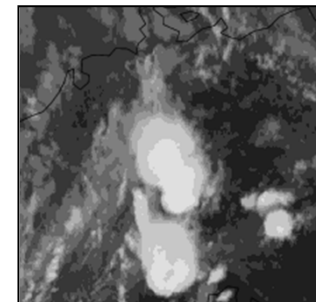
12-UTC
forecast runs



preliminary (!) results (no LHN):

- ✓ improved precip forecast in first 8 – 16 hours
- ✓ precip forecasts tend to be degraded for longer lead times

- pre-convective environment: no clouds
 - **GNSS Slant Total Delay** : humidity integrated over path from ground station to GNSS satellite, all weather obs
 - *Michael Bender (DWD/IAFE)*
- developing convection: clouds
 - cloud top height from satellite data (Meteosat / SEVIRI)
 - **cloudy SEVIRI** radiances (IR window + WV channels)
 - *Axel Hutt (DWD/IAFE)* ; *Florian Harnisch (LMU/HErZ)*
(some positive impact on cloud / radiances)
- mature convection: precipitation
 - **radar**: 3-dim. **reflectivity**
3-dim. **radial velocity**
 - *Elisabeth Bauernschubert (DWD/IAFE)*,
Virginia Poli (ARPAE-SIMC) → talk
(until March: *Theresa Bick (DWD/MIUB)*)



high-resolution obs: radar reflectivity
 → *Theresa Bick et al., QJRMS 2016*

7 days / 29 forecasts
 (22 – 29 May 2014)

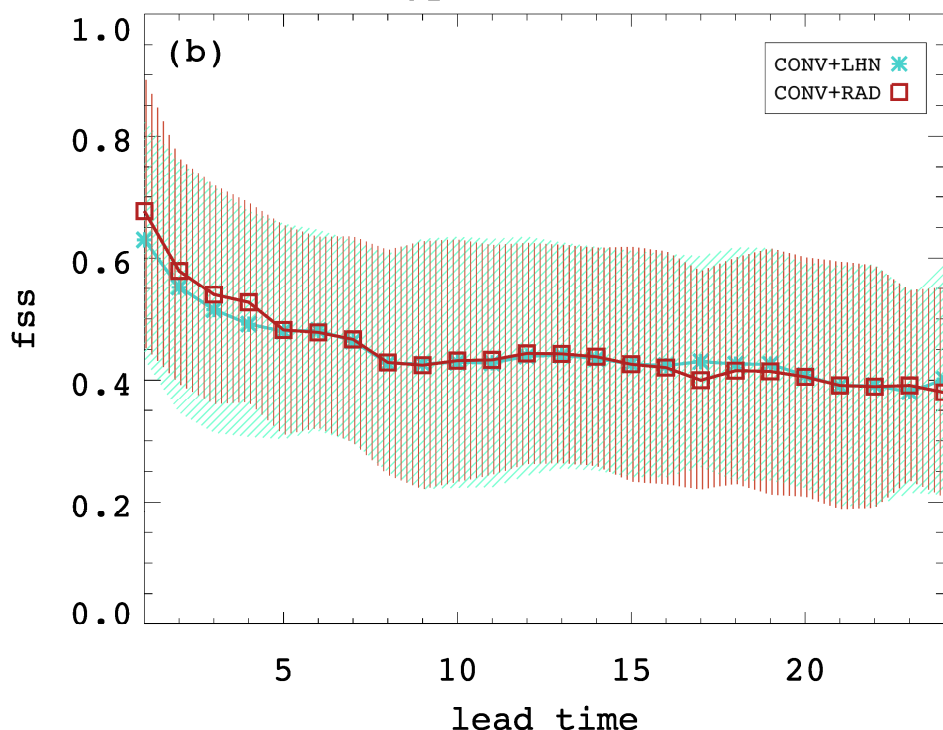
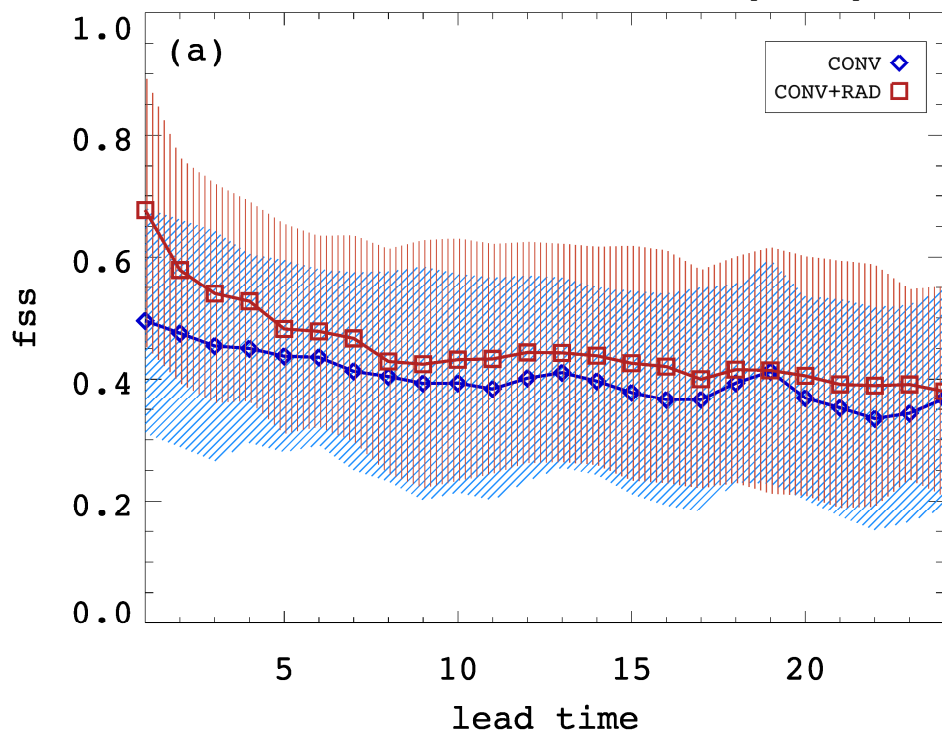
CONV
 CONV + RAD

FSS precip
 – ens. mean
 – std dev.

CONV + LHN
 CONV + RAD

5gp 0.5mm/h precip

5gp 0.5mm/h precip



- ✓ rather large, long-lived positive impact from use of radar reflectivity in LETKF
- ✓ use of radar reflectivity in LETKF slightly better than LHN in first 4 hours



- (high-res) observations
 - 3D radar radial velocity + 3D radar reflectivity
 - GPS Slant Path Delay
 - direct use of cloudy SEVIRI IR window + WV channels (for cloud info) / Cloud Top Height (CTH) derived from SEVIRI
 - screen-level observations (q2m, T2m, uv10m) → [poster by Tobias Necker](#)
 - Mode-S (aircraft high-resolution) wind + temperature (LMU: Lange & Janjic, QJ 2015)
 - ground-based remote-sensing (microwave radiometer, lidar (wind, Raman), ...)
 - AMSU-A, ATMS, IASI
- satellite soil moisture for soil moisture analysis (in LETKF) (Cardinali, COMET)
- refine 4D-LETKF (e.g. additive covariance inflation, multi-scale DA (variable localis.),...)
- to address non-Gaussianity: Particle Filters (PF) + hybrid LETKF-PF
- KENDA for ICON-regional: porting from COSMO to ICON (start 2017)

