Deutscher Wetterdienst



COSMO-DE EPS

construction, diagnosis and verification of a limited-area ensemble prediction system on the convective scale

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Overview

- construction and current status of COSMO-DE EPS
 - perturbation strategy
- results with focus on precipitation
 - diagnosis of different EPS experiments
 - verification of ensemble forecasts with "PACprove"





Model configuration of deterministic COSMO-DE

- grid-spacing: 2.8 km → convection permitting model
- forecast lead time: 0-21 hours
- model start: every 3 hours
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Ensembles based on high-resolution models are a new field of research!

→ Question: Which perturbations have really an effect on the forecast?



COSMO-DE EPS: general perturbation strategy

- perturbation of model physics
- perturbation of boundary conditions
- perturbation of initial conditions









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combination of perturbations

Χ













COSMO-DE EPS: general perturbation strategy



DWD

Perturbation of the model



alter parameters in parameterization schemes

- alteration should lead to a different forecast
- alteration should not deteriorate forecast quality (on average)





Perturbation of the model



alter parameters in parameterization schemes

- alteration should lead to a different forecast
- alteration should not deteriorate forecast quality (on average)
- 12 different <u>fixed</u> configurations of model physics i.e. 12 slightly different model versions



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Perturbation of boundary conditions

nesting procedure



DWF





Perturbation of boundary conditions

nesting procedure

COSMO-DE EPS (DWD, Germany)













































Combination of physics and boundary perturbations



- all global models should be included

- 3 physics perturbations with highest impact on spread are chosen







Results with focus on precipitation

- time period: 15 days of August 2007
- ➢ 3 EPSs with 12 members: PHY, LBC, COMB
- starting point: 00 UTC, lead time 0-24 hours
- ensemble diagnoses
 - Normalized Variance Difference
- ensemble verification: "PACprove"
 - quality of single members
 - probabilistic verification





Ensemble diagnoses: Normalized Variance Difference

 \succ investigation of the impact of different EPSs on the spread.

NVD =
$$\frac{Var(EPS1) - Var(EPS2)}{Var(EPS1) + Var(EPS2)}$$
$$-1 \le NVD \le +1$$





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$$NVD = \frac{Var(EPS1) - Var(EPS2)}{Var(EPS1) + Var(EPS2)}$$
$$-1 \le NVD \le +1$$
$$NVD \begin{cases} > 0 \Rightarrow higher impact of EPS1 \\ = 0 \Rightarrow equal impact of both EPSs \\ < 0 \Rightarrow higher impact of EPS2 \end{cases}$$





Ensemble diagnoses: Normalized Variance Difference







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Ensemble diagnoses: Normalized Variance Difference



→ Following verification results focussing on the COMB experiment







Ensemble verification with "PACprove"

- PACprove = Package for probabilistic verification
- Why we are developing our own Package and not "R" for example?
 - actually, the R-package is not officially supported at DWD
 - main work has to be done on data handling (outside "R")
 - perfromance problems using "R" for large data amounts





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 - deterministic: standard error scores like FBI, ETS, ...
 - probabilistic: Brier score, rank histogram, reliability diagram, ROCcurve/area





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 - in general: all relevant parameters
 - focus here: verification of precipitation with RADAR estimations





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Keep in mind: development stage \rightarrow How far we get with our perturbations?





Verification results: single member quality check

Is our perturbation strategy the right way?







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- Frequency Bias Index
- 24 hours accumulated precipitation
- red line shows the deterministic COSMO-DE





Verification results: single member quality check

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- all members are within a reasonable range
- we are on the right way!





Verification results: Brier Skill Score







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Verification results: rank histogram

3.0×10⁵ 2.5×10⁵ Frequency 2.0×10⁵ 1.5×10⁵ 1.0×10⁵ 5.0×10⁴ 3 8 10 11 12 13 1 2 5 9 4 6 7 Rank

24 hours accumulated precipitation





Verification results: rank histogram







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- verification of the COMB ensemble (for precipitation) with PACprove
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most of these results are presented in an article (submitted to Atmos. Res.)





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- the COSMO-DE ensemble needs further developments
 - include the initial conditions (increase of the spread) \rightarrow promising ideas
 - increase duration of experiments → more data





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 - first step: logistic regression for calibration of probabilities
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COSMO-DE EPS is planned to be operational in 2011









Extra Slides

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Verification results for 2m-temperature 12UTC

threshold: 25°C





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- first experiments: perturb "nudgecast"
 - correlation length of observation increments
 - geostrophic balance
 - divergent flow correlations
- current work:

use differences between control and COSMO-SREPS as IC perturbations

Iong-term plan:

Ensemble Transform Kalman Filter (COSMO project KENDA)

Perturbation of initial conditions











Experiments – physics and boundary perturbations



no perturbation of initial conditions









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no perturbation of initial conditions







