

*Regional Cooperation for  
Limited Area Modeling in Central Europe*



# Stochastic perturbations of model tendencies in AROME-EPS

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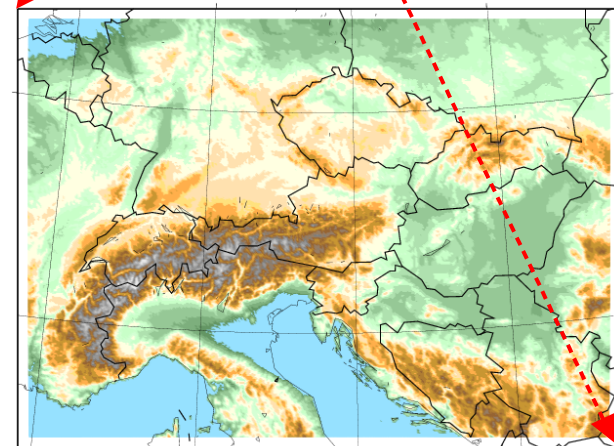
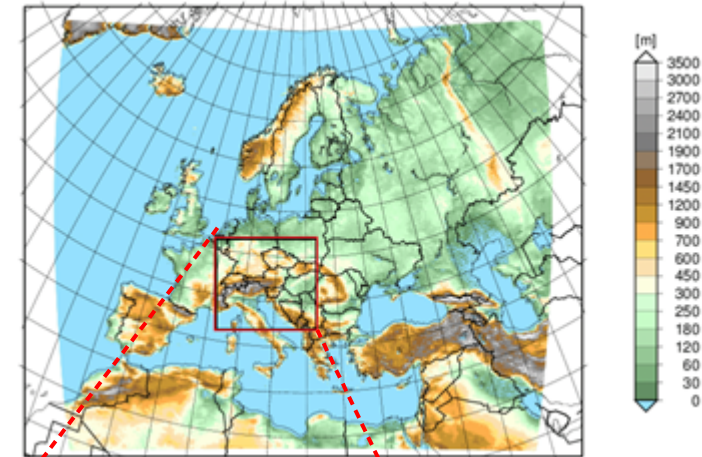
ARSO METEO  
Slovenia



# AROME-EPS at ZAMG

- ▶ not yet operational
- ▶ test phase - wait for new HPC at ZAMG

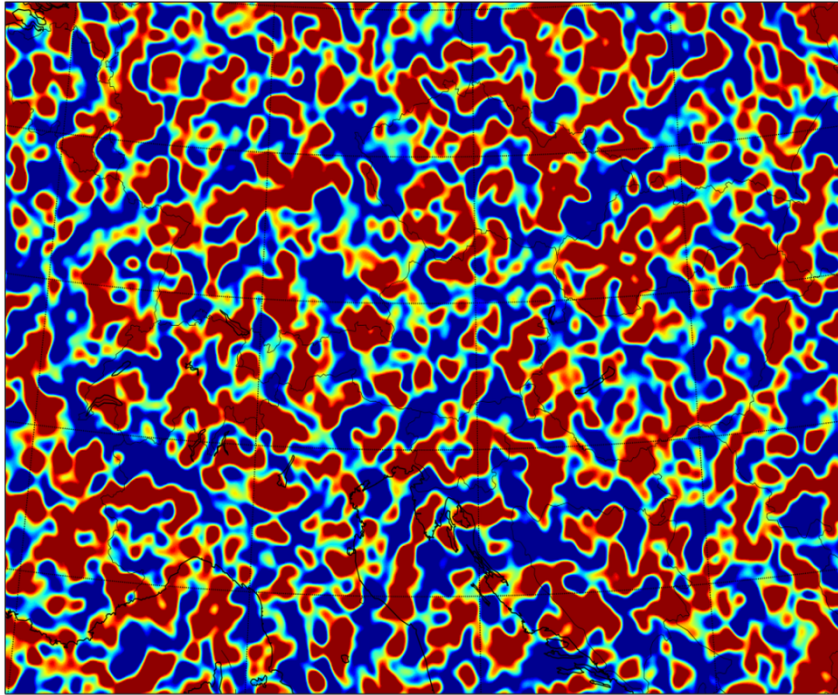
AROME-EPS	
ensemble size	16 + 1
$\Delta x$ / vertical levels	2.5 km / 90
coupling	ECMWF EPS
runs per day	2 / 4 runs (+ 30 h forecast)
IC perturbation	EDA + EnJk + sEDA
model perturbation	SPPT / iSPPT / pSPPT / ipSPPT: <ul style="list-style-type: none"> <li>● total tendencies (SPPT)</li> <li>● independent total tendencies (iSPPT)</li> <li>● partial tendencies (pSPPT)</li> <li>● independent partial tendencies (ipSPPT)</li> </ul>



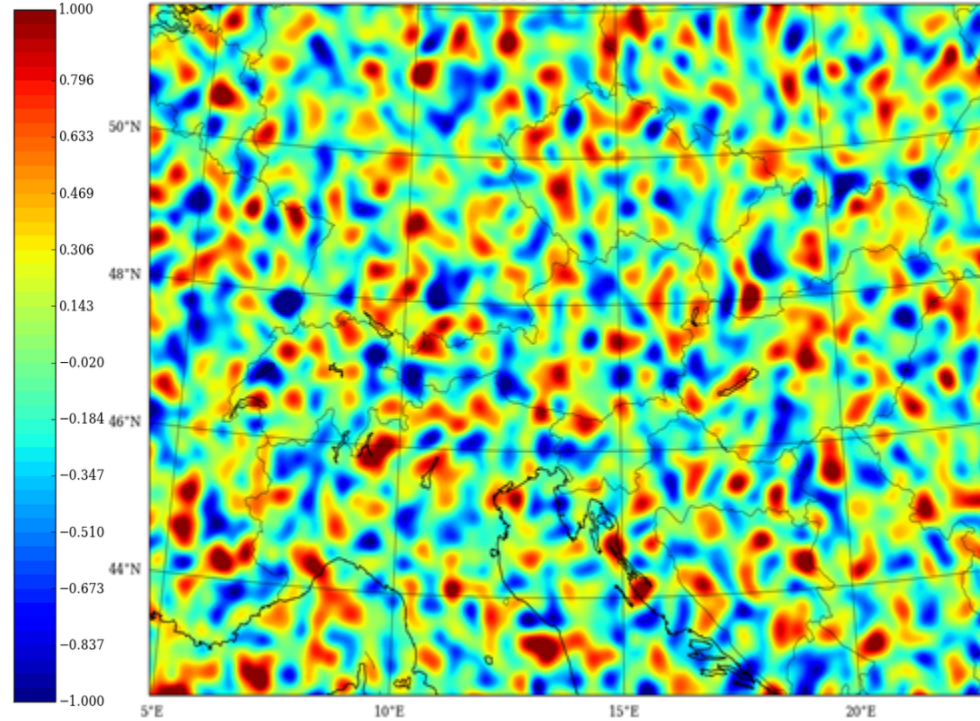
Domain of AROME-EPS at ZAMG

# Adaptation of spectral pattern generator

S038SPPT  
2011-07-24 00:00:00

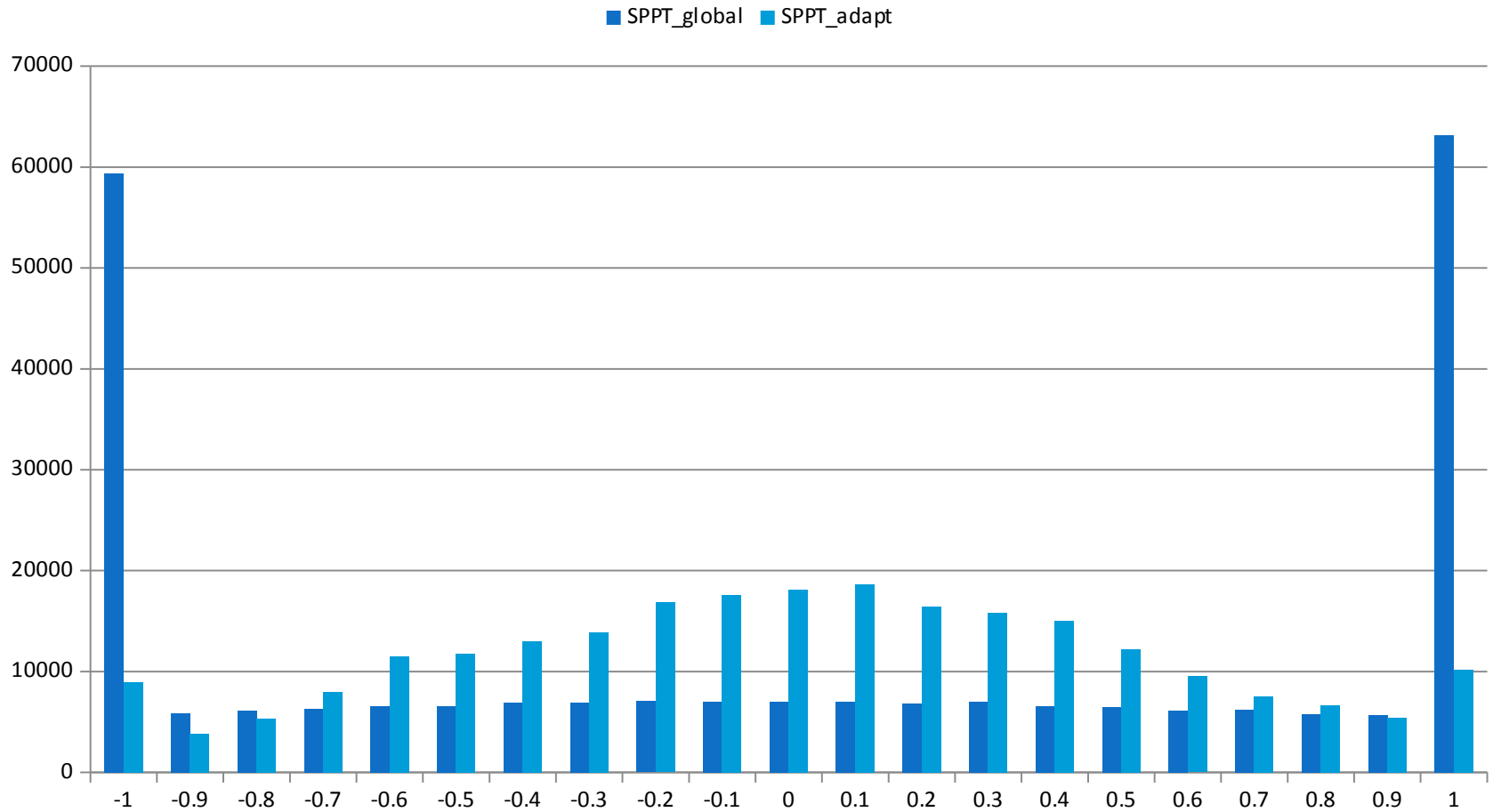


S038SPPT  
2011-07-24 00:00:00



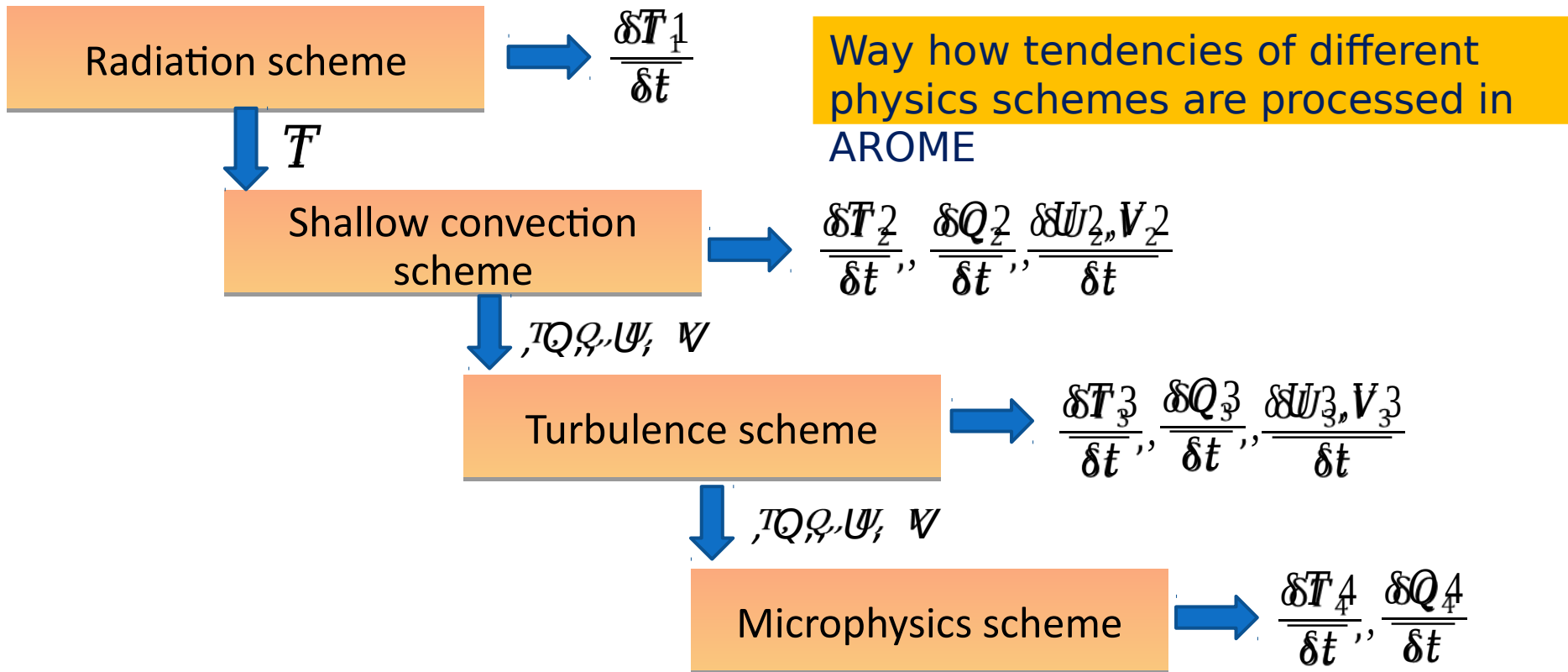
Stochastic patterns created with default (left) and adapted (right) spectral pattern generator

# Adaptation of spectral pattern generator



Absolute frequency of stochastic perturbations (number of gridpoints)

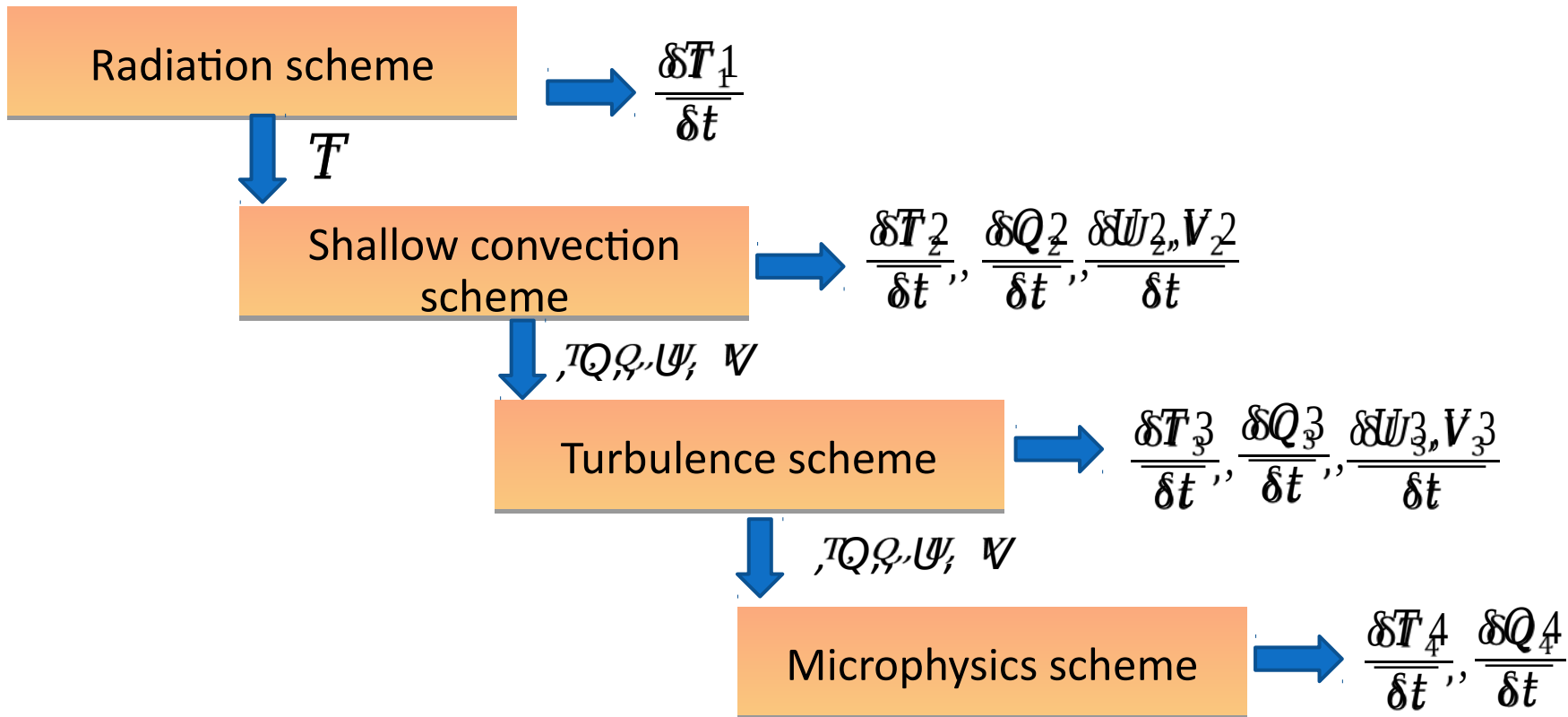
# Stochastic perturbations of total model tendencies: SPPT (ECMWF)



Standard SPPT: Perturbation of total tendencies

$$\frac{dT}{dt} \frac{dT}{dt} \approx \sum_{i=1}^{44} \frac{\delta T_i}{\delta t} \frac{T}{\delta t} \frac{dT}{dt} = \frac{dT}{dt} * (1 + P) \frac{dQ}{dt} \frac{dQ}{dt} \approx \sum_{i=1}^{44} \frac{\delta Q_i}{\delta t} \frac{Q}{\delta t} \frac{dW}{dt} \approx \dots$$

# Independent perturbations of total tendencies: iSPPT (Christensen et al.)



iSPPT: Perturbation of total tendencies - 4 different patterns

$$\frac{dT}{dt} \frac{dT}{dt} = \sum_{i=1}^{44} \frac{\delta T_i}{\delta t} \frac{dT}{dt} = \sum_{i=1}^{44} \frac{\delta T_i}{\delta t} \left( \sum_{j=1}^{44} P_{ij} \right) \frac{dQ}{dt} = \sum_{i=1}^{44} \frac{\delta Q_i}{\delta t} \frac{dQ}{dt}$$

# Stochastic perturbation of partial tendencies: pSPPT (ZAMG)

Radiation scheme

$$\frac{\delta T_1}{\delta t} * (1 + P)$$

Shallow convection scheme

$$\frac{\delta T_2}{\delta t} * (1 + P), \frac{\delta Q_2}{\delta t} * (1 + P), \text{etc.}$$

Turbulence scheme

$$\frac{\delta T_3}{\delta t} * (1 + P), \frac{\delta Q_3}{\delta t} * (1 + P), \text{etc.}$$

Microphysics scheme

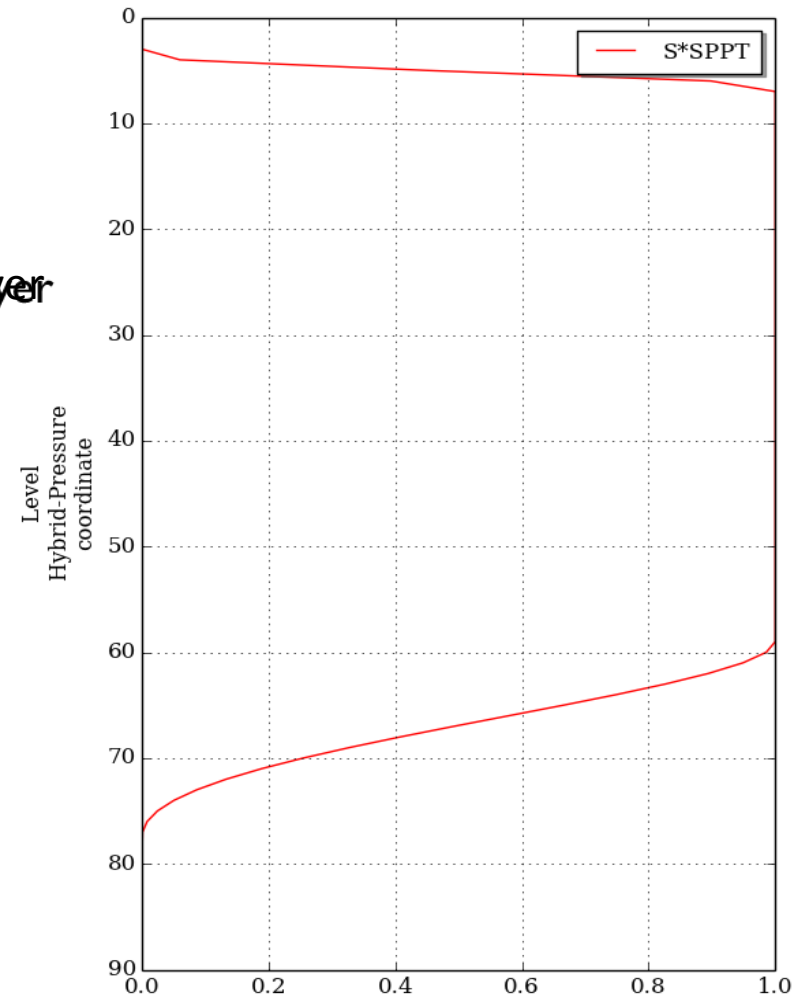
$$\frac{\delta T_4}{\delta t} * (1 + P), \frac{\delta Q_4}{\delta t} * (1 + P), \text{etc.}$$

- ▶ pSPPT: stochastically perturbed partial tendencies
- ▶ partial T, Q, U and V tendencies of e.g. shallow convection scheme are directly perturbed
- ▶ perturbed partial tendencies influence the subsequent turbulence scheme
- ▶ partial T, Q, U and V tendencies of turbulence scheme are perturbed and passed to microphysics scheme
- ▶ etc.

# Tapering function

$$\frac{dT'}{dt} = \frac{dT}{dt} * (1 + P) \quad P = P * \alpha$$

- ▶ **Tapering function introduced in SPPT because of numerical instabilities**
- ▶ **Reduces the perturbations to 0 in the boundary layer (< 1300m) and in the stratosphere (> 100hPa)**
- ▶ **Physically not acceptable (assumes different error statistics in the atmosphere)**
- ▶ **Tests with SPPT and tapering off in July 2016 revealed 10% model crashes (too strong wind)**
- ▶ **pSPPT approach is much more stable (< 3% model crashes) and flexible**
- ▶ **Tapering can be switched on/off separately for different physics schemes**
- ▶ **Setting with tapering off, except for turbulence revealed best results and is stable**





# Independent perturbation of partial tendencies: ipSPPT (ZAMG)

Radiation scheme

$$\frac{\delta T_1}{\delta t} * (1 + P_1)$$

Shallow convection scheme

$$\frac{\delta T_2}{\delta t} * (1 + P_1), \frac{\delta Q_2}{\delta t} * (1 + P_2), \text{ etc.}$$

Turbulence scheme

$$\frac{\delta T_3}{\delta t} * (1 + P_1), \frac{\delta Q_3}{\delta t} * (1 + P_2), \text{ etc.}$$

Microphysics scheme

$$\frac{\delta T_4}{\delta t} * (1 + P_1), \frac{\delta Q_4}{\delta t} * (1 + P_2), \text{ etc.}$$

- ▶ ipSPPT: independent perturbation of partial tendencies
- ▶ Assumption in SPPT that all parameters (T, Q, U, V) in one physics scheme have the same error characteristic (same pert.)
- ▶ Wind direction is never changed in that way (U, V – same pert. pattern)
- ▶ In ipSPPT different perturbations are applied to the parameters T, Q, U, V
- ▶ We need 4 different perturbation patterns – pattern generator has to be run 4 times with different seeds

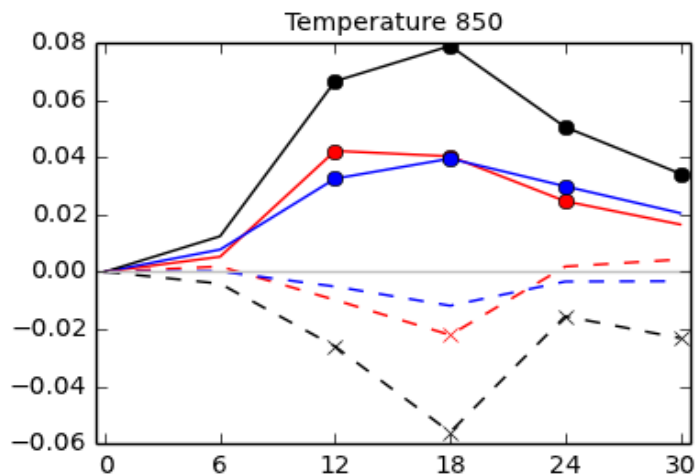
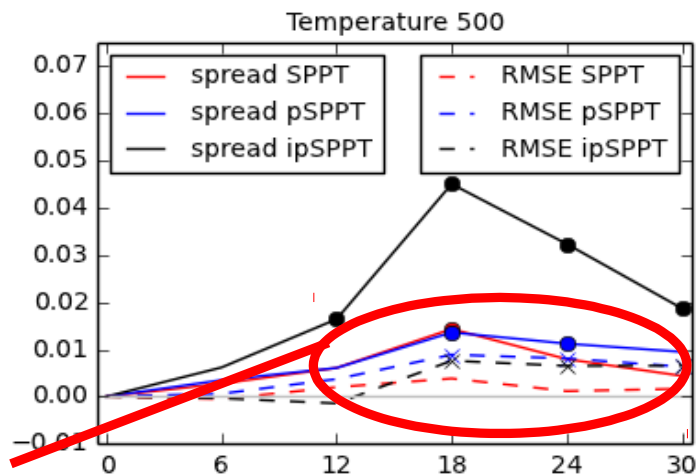
## Set-up for verification

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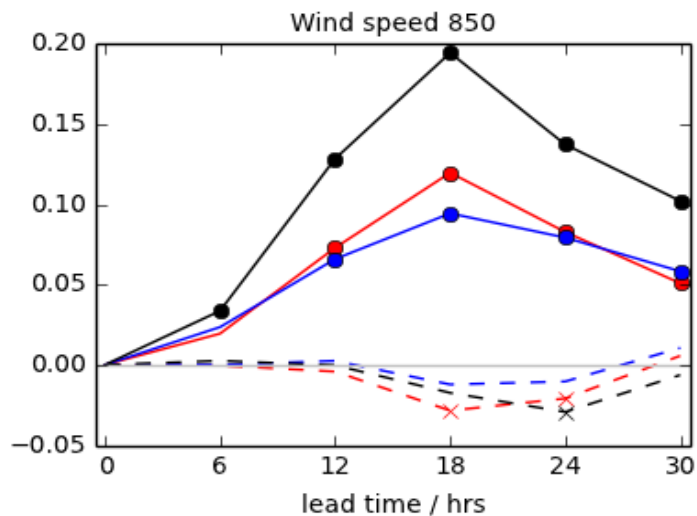
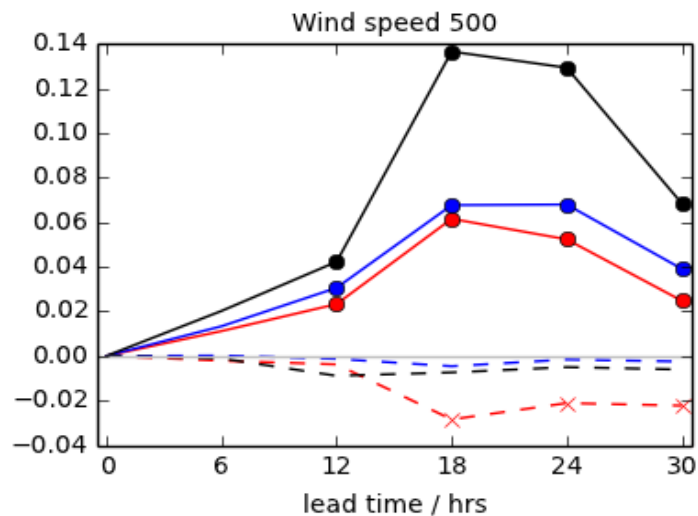
- ▶ 2 test periods of 1 month: July 2016 and January 2017
- ▶ 16 members, 00 UTC run, 30 h lead time
- ▶ No data assimilation, no initial perturbations  
only interested in effect of stochastic physics
- ▶ 4 experiments: Ref, SPPT, pSPPT, ipSPPT
- ▶ Verification of upper air variables (500 h Pa and 850 hPa): ECMWF analysis
- ▶ Verification of surface variables: point verification; 1200 synop stations in operational domain
- ▶ Classical scores (RMSE, bias, spread)  
probabilistic scores (CRPS, Brier Score, Talagrand, etc.)
- ▶ All scores are relative to AROME-Ref without any stochastic physics



# Results – July 2016



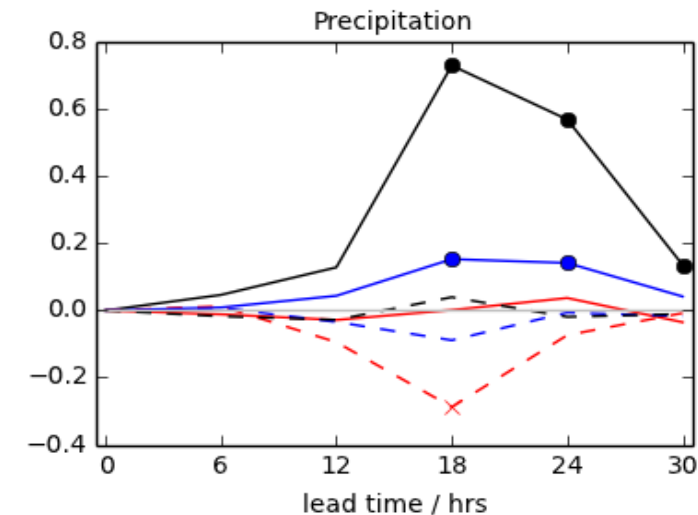
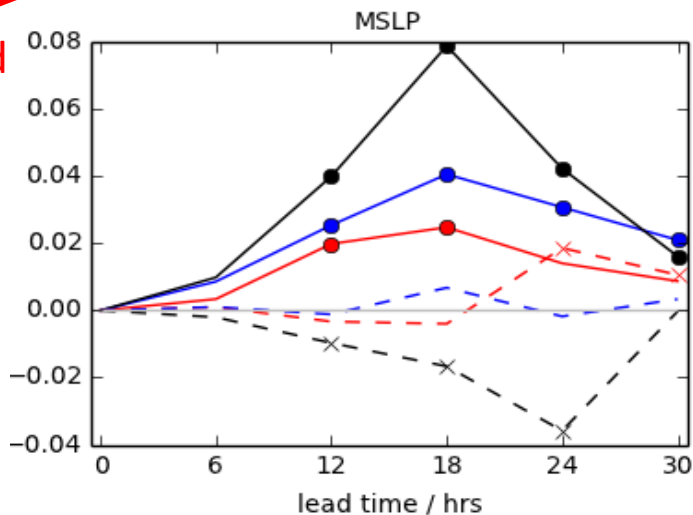
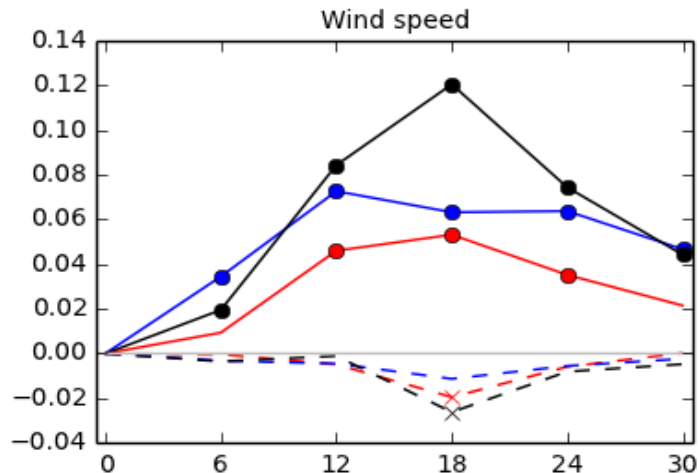
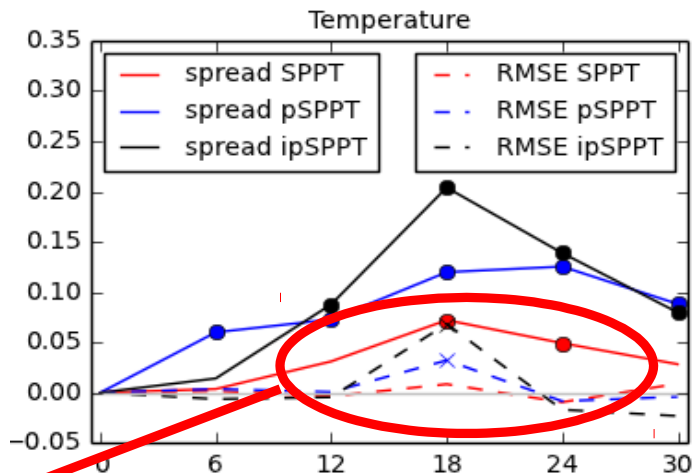
● Statistical significant  
 ✕ significant



Increased RMSE, positive Bias

Ensemble spread and RMSE of temperature and wind speed at 500/850 hPa for July 2016

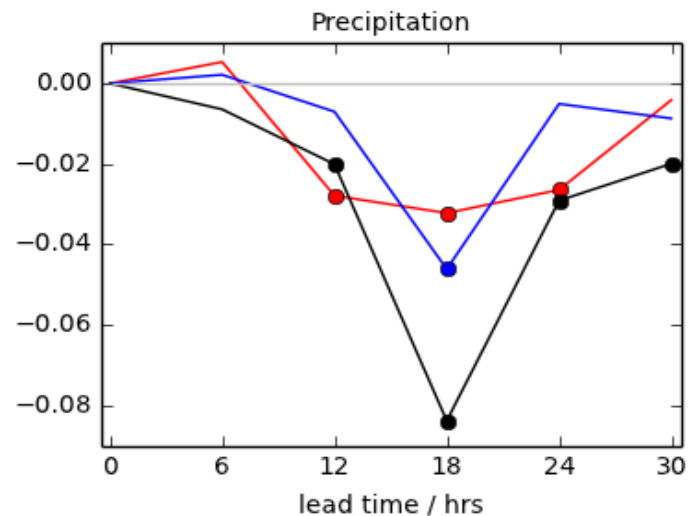
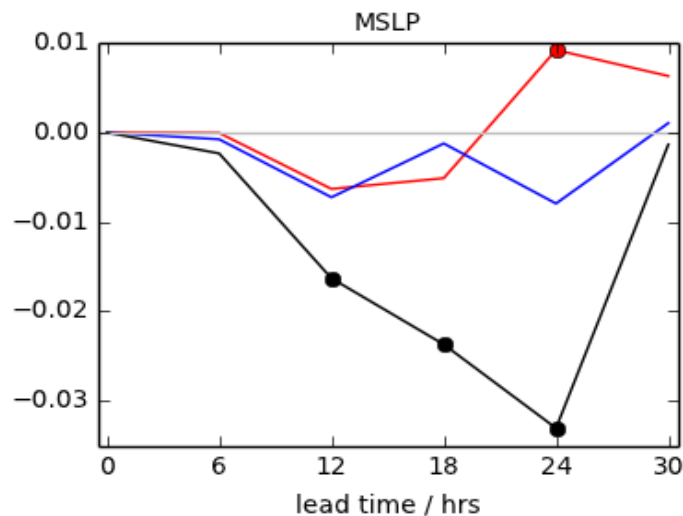
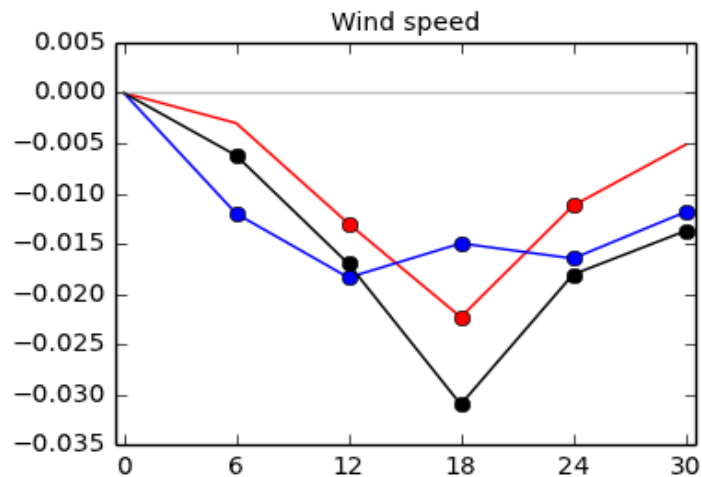
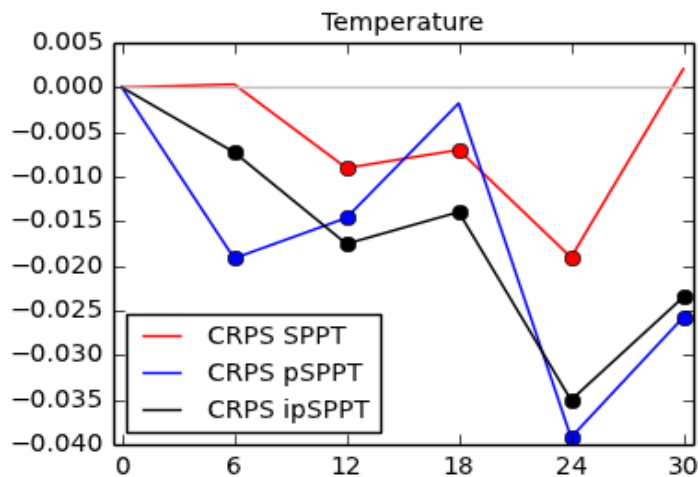
# Results – July 2016



Increased RMSE, negative Bias

Ensemble spread and RMSE of 2m-T, 10m-wind speed, MSLP and precipitation for July 2016

# Results – July 2016



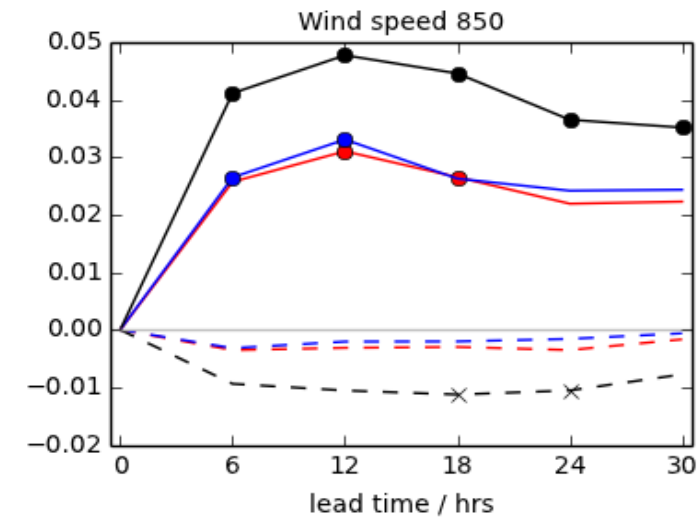
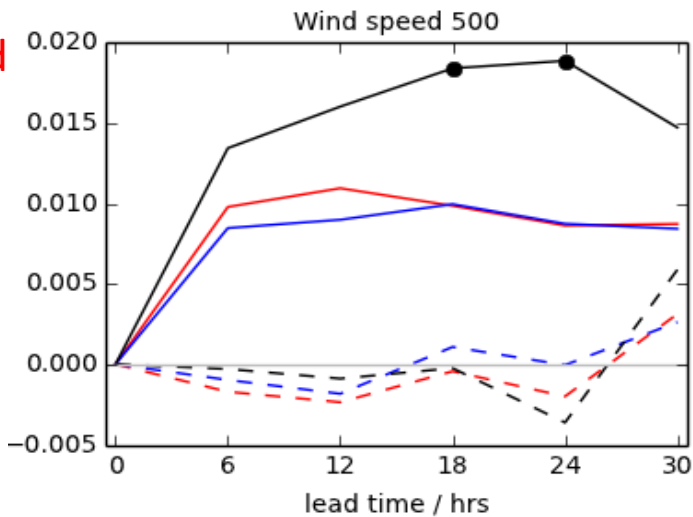
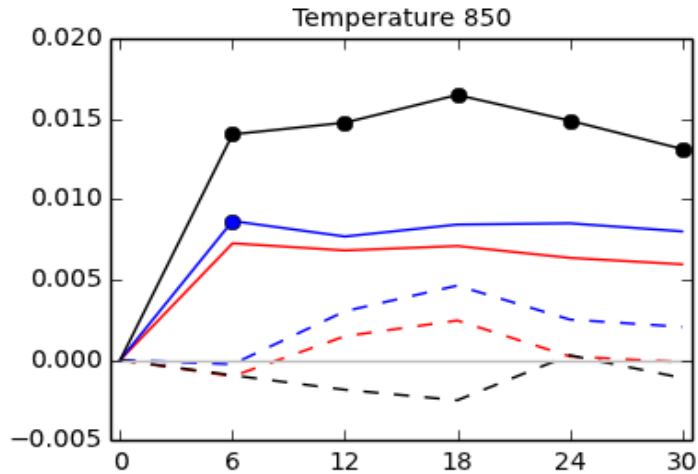
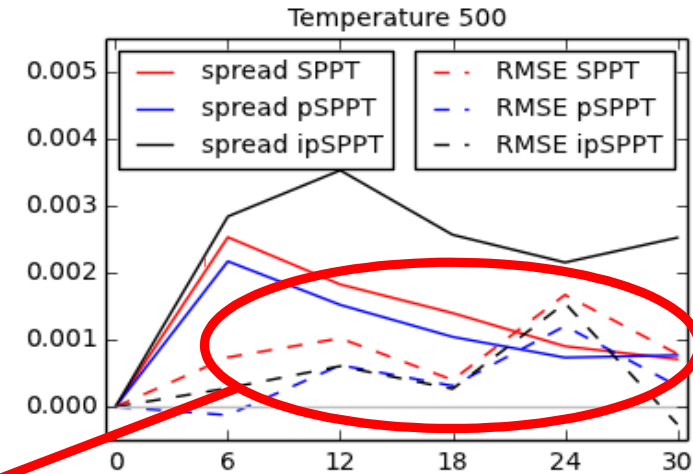
CRPS of 2m-temperature, 10m-wind speed, MSLP and precipitation for July 2016

# Supersaturation adjustment

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- ▶ T increase in the upper levels; decrease near the surface; drying of the atmosphere
- ▶ Perturbations are between -1 and +1, on average 0
- ▶ We use the very simple supersaturation adjustment:  
no perturbations are added if air is saturated (T and Q perturbations)
- ▶ On average we get a small negative bias of water vapor content (drying of atmosphere) and a slight positive bias of temperature
- ▶ Near the surface we experienced a slight temperature decrease – increased evaporation due to dryer air
- ▶ In SPPT this effect is reduced near the surface (tapering)

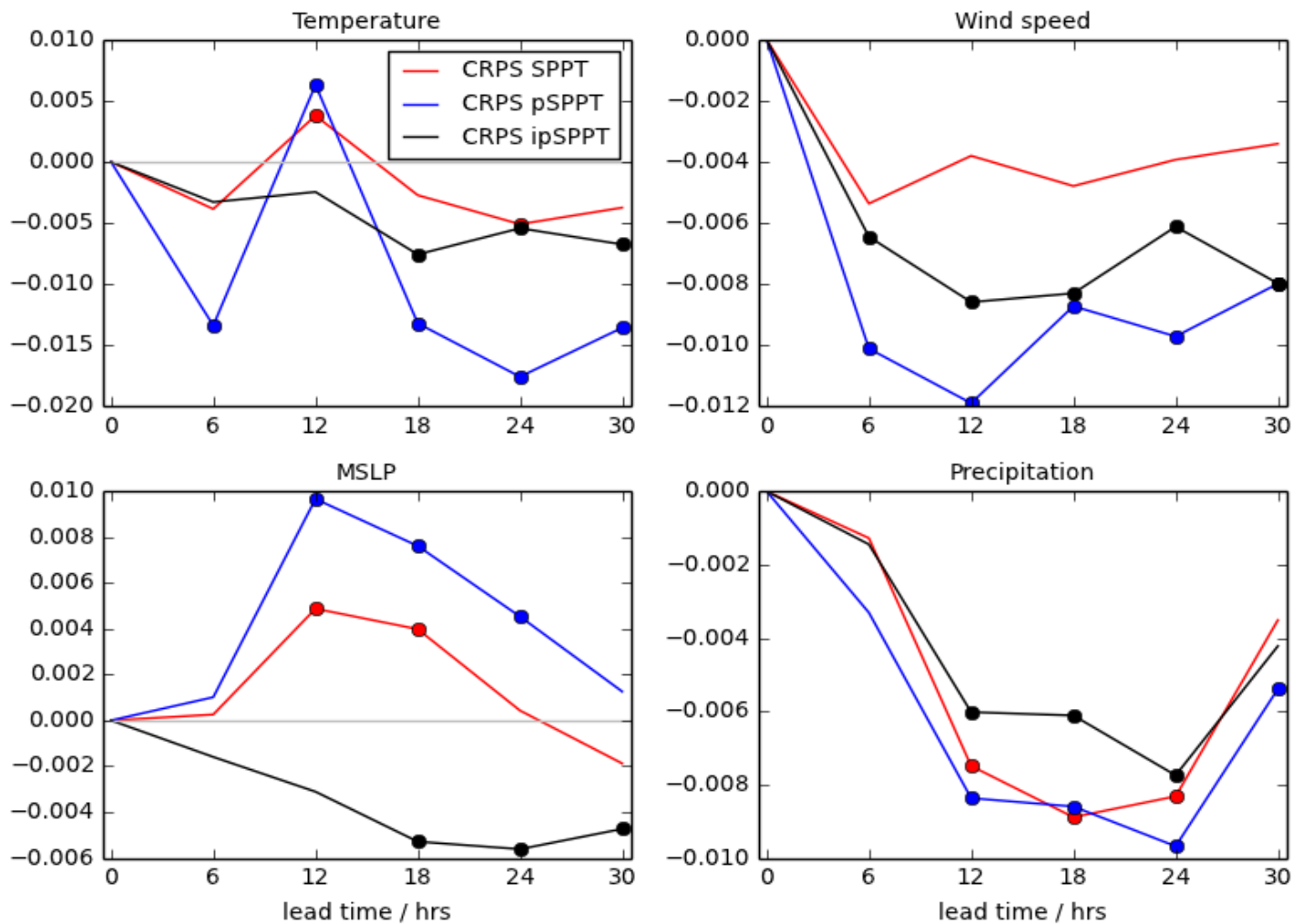
# Results – January 2017



Increased  
RMSE,  
positive  
Bias

Ensemble spread and RMSE of temperature and wind speed at 500/850 hPa for January 2017

# Results – January 2017



CRPS of 2m-temperature, 10m-wind speed, MSLP and precipitation for January 2017



## Conclusions

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- ▶ Spectral pattern generator has to be adapted to domain; bug removed
- ▶ SPPT significantly increases spread and reduces RMSE in many cases (after adaptation of pattern generator)
- ▶ Effect of stochastic physics is generally higher in summer (more sensible because of convection)
- ▶ Perturbing partial tendencies of physics schemes increases stability of the model – tapering can be switched off, except for turbulence
- ▶ Separately perturbing the parameters T, U, V, Q provides best results, especially for spread
- ▶ Some shortcomings can be reduced to the simple supersaturation adjustment – adaptations necessary