



---

# Model Error Representation in the Canadian Ensemble Prediction Systems

---

**Leo Separovic<sup>1</sup>, Martin Charron<sup>1</sup>, Amin Erfani<sup>2</sup>, Normand Gagnon<sup>2</sup>,  
Ayrton Zadra<sup>1</sup> and Paul Vaillancourt<sup>1</sup>**

<sup>1</sup>Recherche en Prévision Numérique Atmosphérique, Meteorological Research Division,  
Environment and Climate Change Canada, Dorval, Canada

<sup>2</sup>Meteorological Service of Canada,  
Environment and Climate Change Canada, Dorval, Quebec, Canada

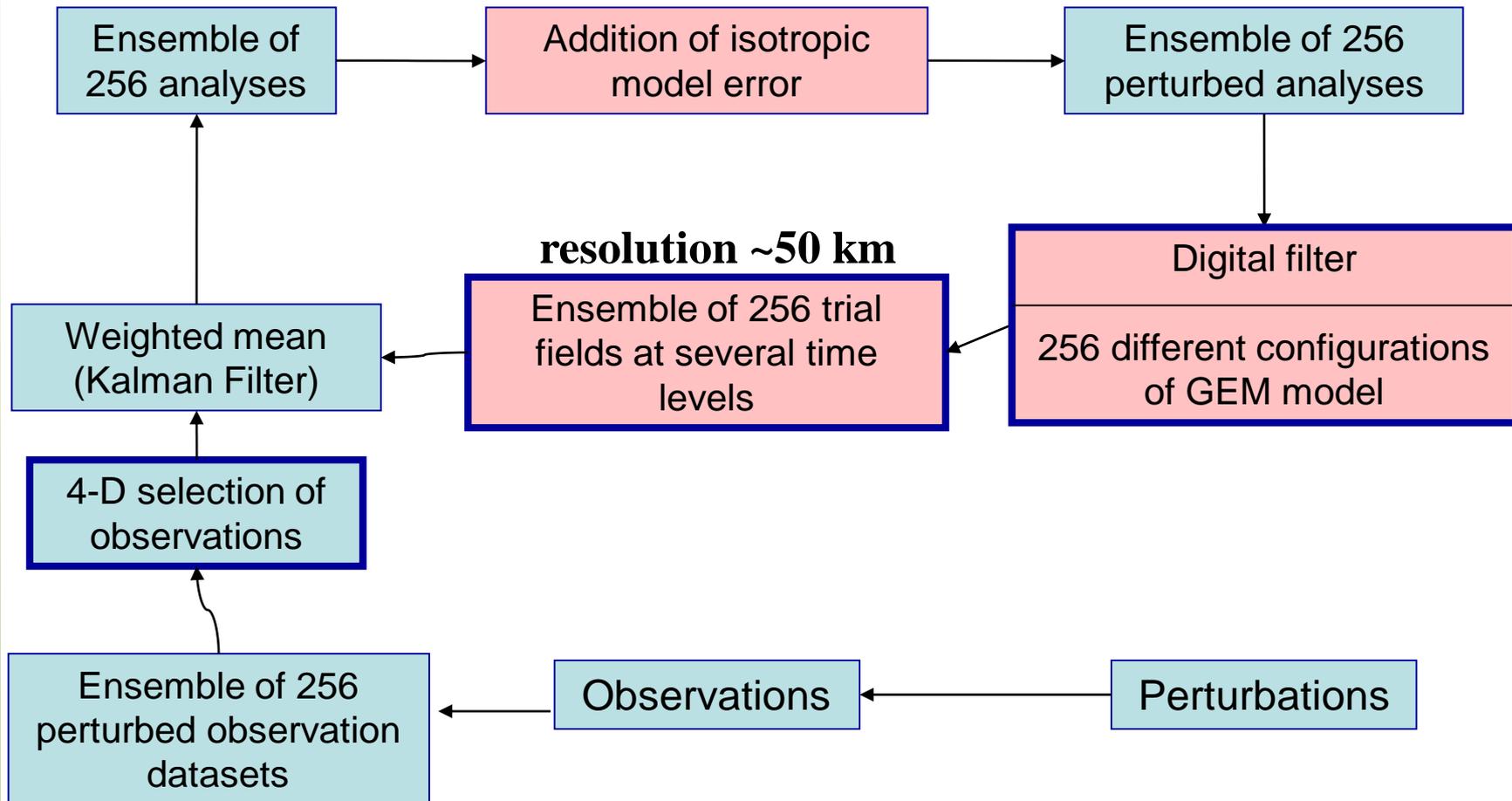
# Outline

---

- Current error sampling practices at Meteorological Service of Canada
  - Data Assimilation with Ensemble Kalman Filter (EnKF)
  - Ensemble Prediction based on
    - Multi-parameterization approach
    - Stochastic physical tendency perturbations (PTP)
    - Stochastic kinetic energy backscatter scheme (SKEB)
- Ongoing work on a stochastic deep convection scheme
  - Modification of the Bechtold scheme (Bechtold *et al.*, 2001) to include stochastic component
  - Approach based on the Plant-Craig scheme (Plant and Craig, 2008).



# Data assimilation (EnKF)



(Houtekamer *et al.*, 2014)



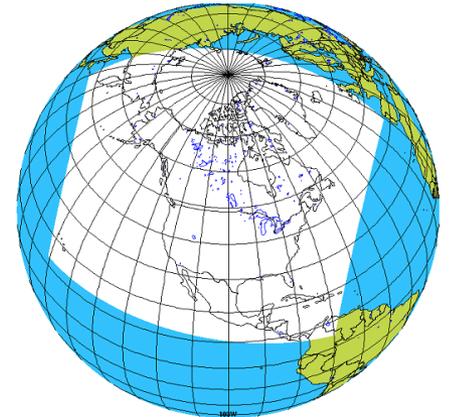
# Global Ensemble Prediction System (GEPS)

- System configuration:
  - **21** members (one control and 20 perturbed).
  - GEM dynamical core
  - A  $0.45^\circ$  (~**50 km** at the equator) global uniform grid, **40** vertical levels
  - **16-day** integrations (32 days once a week).
- Model error representation:
  - **Initial conditions**: selection of 20 out of the 256 EnKF perturbed analyses to initialize GEPS members.
  - **PTP** (Buizza *et al.* 1999; Charron *et al.* 2010) disabled if deep convection is active
  - **SKEB** scheme (Shutts, 2005)
  - **Multi-physics** approach.



# Regional Ensemble Prediction System (REPS)

- System configuration:
  - **21** members
  - GEM dynamical core
  - A **~15 km** limited-area grid over N. America, **48** vertical levels
  - Lateral boundary conditions updated hourly from GEPS
  - **72-hr** integrations.
- Model error representation:
  - **Initial conditions**: Interpolated global analyses
  - **Lateral boundary conditions**: 21 GEPS members
  - **PTP**
  - **no SKEB, no multi-physics.**



# GEPS physics configurations

No	Convection	Gravity wave drag	Mixing length	Vertical Diffusion	Orographic blocking	Deacu Z0T	Salty QSAT	SKEB	PTP
0	Kain&Fritsch	Standard	Bougeault	1.0	1.0	Yes	Yes	No	No
1	Kain&Fritsch	Strong	Blackadar	1.0	1.5	Yes	No	Yes	Yes
2	Kuo	Strong	Blackadar	1.0	0.5	No	No	Yes	Yes
3	Kain&Fritsch	Weak	Bougeault	0.85	0.5	Yes	Yes	Yes	Yes
4	Kuo	Weak	Bougeault	0.85	0.5	No	No	Yes	Yes
5	Kain&Fritsch	Weak	Blackadar	1.0	1.5	No	No	Yes	Yes
6	Kuo	Weak	Blackadar	1.0	0.5	Yes	Yes	Yes	Yes
7	Kain&Fritsch	Weak	Bougeault	1.0	1.5	No	Yes	Yes	Yes
8	Kuo	Weak	Bougeault	1.0	0.5	No	Yes	Yes	Yes
9	Kain&Fritsch	Strong	Bougeault	1.0	1.5	Yes	Yes	Yes	Yes
10	Kuo	Strong	Bougeault	1.0	0.5	No	Yes	Yes	Yes
11	Kain&Fritsch	Strong	Bougeault	0.85	1.5	No	No	Yes	Yes
12	Kuo	Strong	Bougeault	0.85	0.5	No	No	Yes	Yes
13	Kain&Fritsch	Weak	Blackadar	0.85	1.5	Yes	No	Yes	Yes
14	Kuo	Weak	Blackadar	0.85	0.5	Yes	Yes	Yes	Yes
15	Kain&Fritsch	Strong	Blackadar	0.85	1.5	Yes	Yes	Yes	Yes
16	Kuo	Strong	Blackadar	0.85	0.5	No	Yes	Yes	Yes
17	Kain&Fritsch	Strong	Blackadar	1.0	0.5	No	No	Yes	Yes
18	Kuo	Strong	Blackadar	1.0	1.5	No	Yes	Yes	Yes
19	Kain&Fritsch	Weak	Bougeault	0.85	1.5	No	No	Yes	Yes
20	Kuo	Weak	Bougeault	0.85	0.5	No	Yes	Yes	Yes



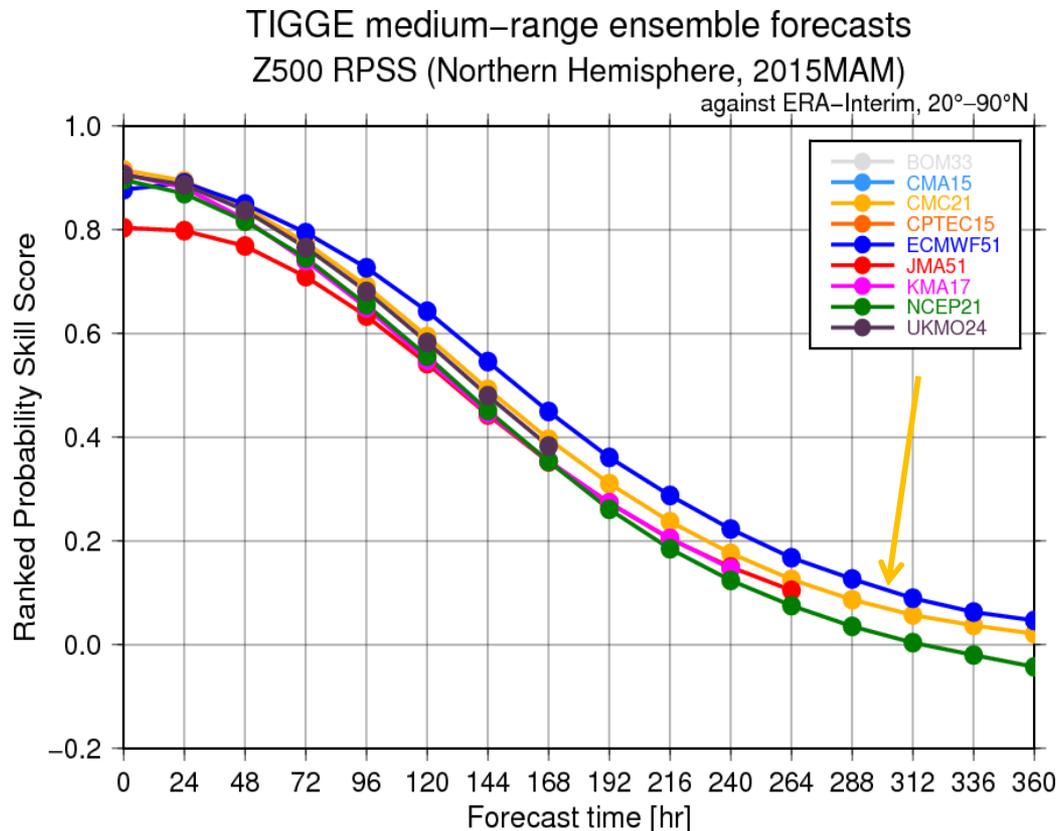
# EnKF physics configurations

No	Convection	Gravity wave drag	Mixing length	Vertical Diffusion	Orographic blocking	Deacu Z0T	Salty QSAT	SKEB	PTP
0	Kain&Fritsch	Standard	Bougeault	1.0	1.0	Yes	Yes	No	No
1	Kain&Fritsch	Strong	Blackadar	1.0	1.5	Yes	No	Yes	Yes
2	Kuo	Strong	Blackadar	1.0	0.5	No	No	Yes	Yes
3	Kain&Fritsch	Weak	Bougeault	0.85	0.5	Yes	Yes	Yes	Yes
4	Kuo	Weak	Bougeault	0.85	0.5	No	No	Yes	Yes
5	Kain&Fritsch	Weak	Blackadar	1.0	1.5	No	No	Yes	Yes
6	Kuo	Weak	Blackadar	1.0	0.5	Yes	Yes	Yes	Yes
7	Kain&Fritsch	Weak	Bougeault	1.0	1.5	No	Yes	Yes	Yes
8	Kuo	Weak	Bougeault	1.0	0.5	No	Yes	Yes	Yes
9	Kain&Fritsch	Strong	Bougeault	1.0	1.5	Yes	Yes	Yes	Yes
10	Kuo	Strong	Bougeault	1.0	0.5	No	Yes	Yes	Yes
11	Kain&Fritsch	Strong	Bougeault	0.85	1.5	No	No	Yes	Yes
12	Kuo	Strong	Bougeault	0.85	0.5	No	No	Yes	Yes
13	Kain&Fritsch	Weak	Blackadar	0.85	1.5	Yes	No	Yes	Yes
14	Kuo	Weak	Blackadar	0.85	0.5	Yes	Yes	Yes	Yes
15	Kain&Fritsch	Strong	Blackadar	0.85	1.5	Yes	Yes	Yes	Yes
16	Kuo	Strong	Blackadar	0.85	0.5	No	Yes	Yes	Yes
17	Kain&Fritsch	Strong	Blackadar	1.0	0.5	No	No	Yes	Yes
18	Kuo	Strong	Blackadar	1.0	1.5	No	Yes	Yes	Yes
19	Kain&Fritsch	Weak	Bougeault	0.85	1.5	No	No	Yes	Yes
20	Kuo	Weak	Bougeault	0.85	0.5	No	Yes	Yes	Yes



# GEPS performance

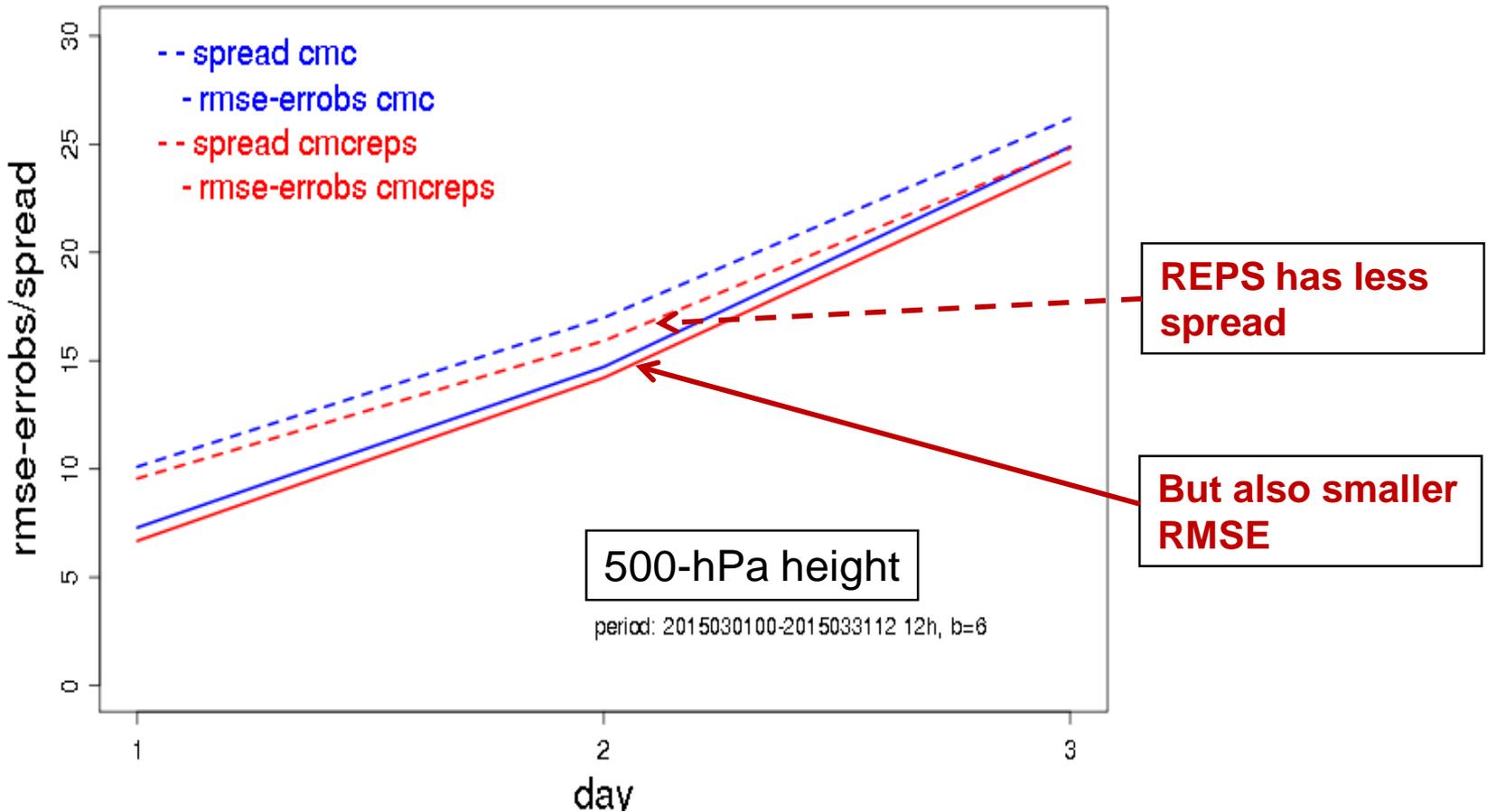
- GEPS generally places well as compared to other centres:



©Mio Matsueda, TIGGE Museum

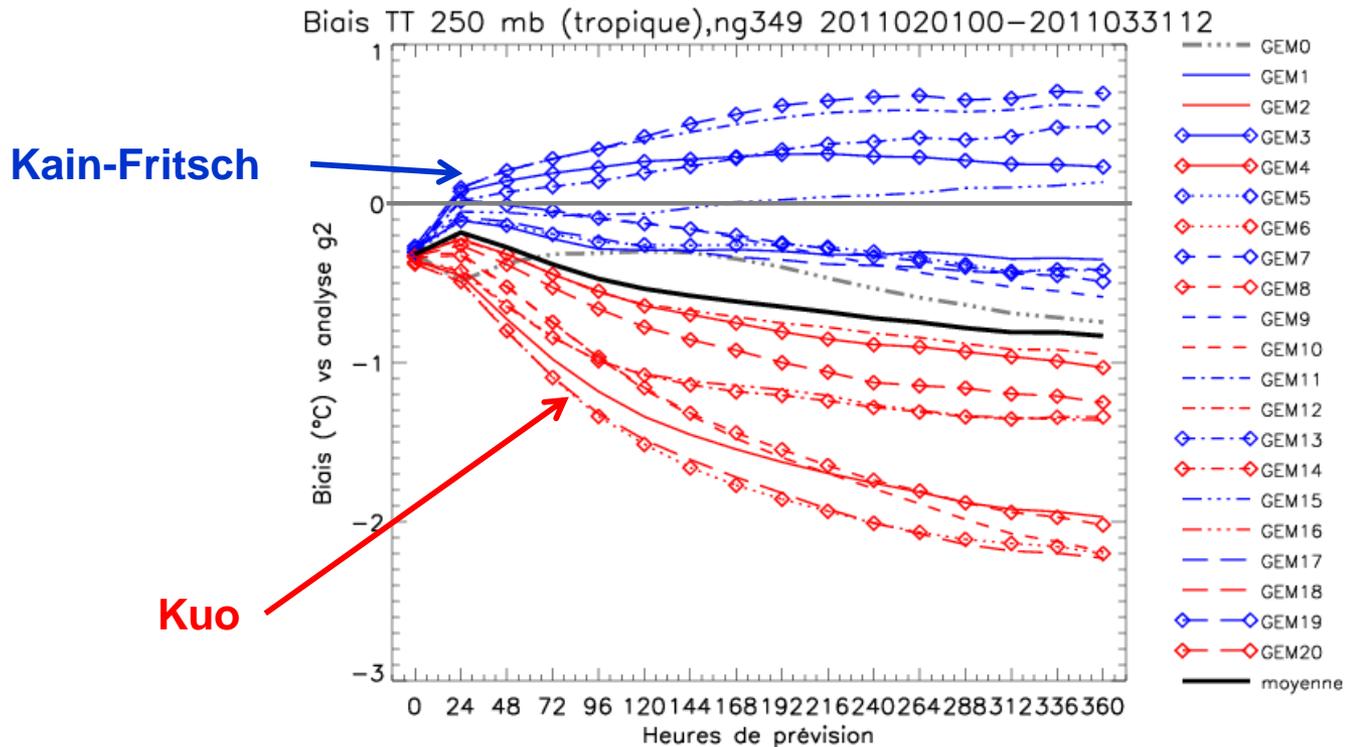


# REPS vs. GEPS performance



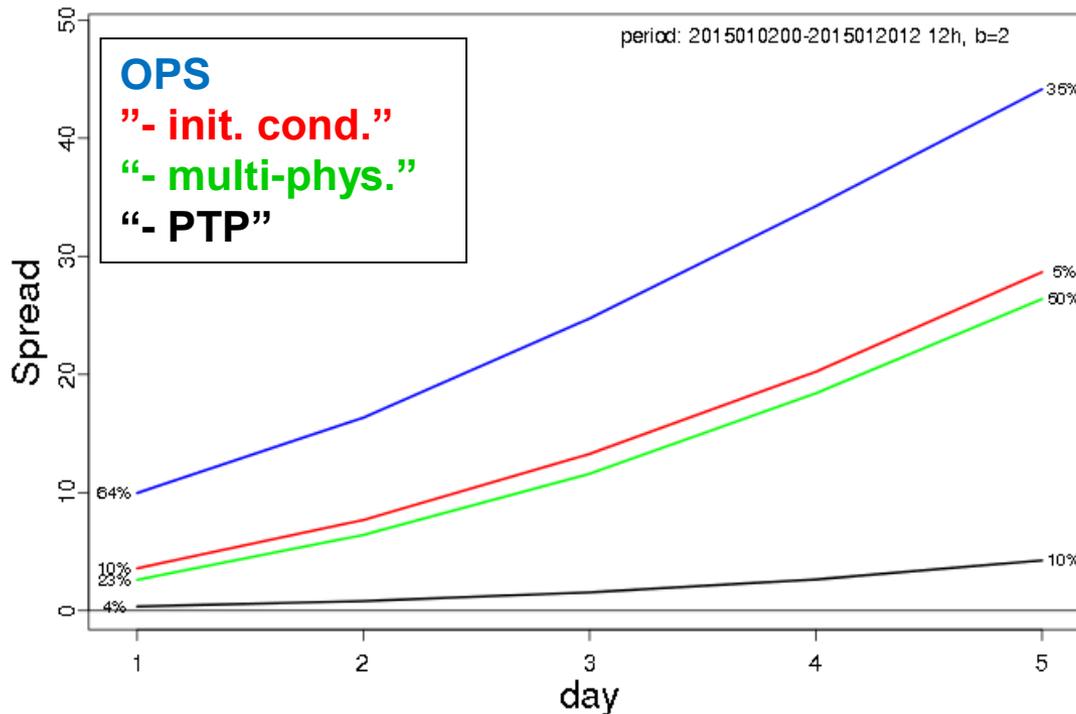
# GEPS performance

- Bimodality in T-250mb in the tropics due to the use of two deep-convection schemes:



# GEPS performance

- Contribution of the system subcomponents to ensemble spread for NH 500mb height:



The impact of multi-physics is relatively small

(poster of N. Gagnon)



# Stochastic Deep Convection Scheme

- Current scheme is based on the **Plant-Craig (PC)** stochastic deep convection parameterization (Plant and Craig, 2008).
- The cloud model is however adopted from the **Bechtold scheme**:
  - A bulk mass flux convection parameterization
  - Modular structure
  - Consistent deep and shallow convection representation.
- Two principal modifications to the Bechtold scheme:
  - **Closure modification**: calculate tendency based on the weighted-average plume properties (*still deterministic*)
  - **Plume random generation**: draw plumes from the size distribution (*stochastic component to the scheme*).



# Plant-Craig scheme

- **Exponential distribution** of cloud-base mass flux of subgrid-scale plumes:

$$p(m) = \frac{1}{\langle m \rangle} \exp\left(-\frac{m}{\langle m \rangle}\right)$$

where  $\langle \rangle$  denotes the expected value and  $\langle m \rangle$  is a tunable parameter.

- **Constant vertical velocity** at the cloud base:

$$m = \langle m \rangle r^2 / \langle r^2 \rangle$$

- PDF of the cloud radius at the LCL follows (Plant and Craig, 2008):

$$p(r) = \frac{2r}{\langle r^2 \rangle} \exp\left(-\frac{r^2}{\langle r^2 \rangle}\right)$$



# Plant-Craig scheme

- **Plume sampling function** – on average  $\langle N \rangle$  plumes is generated during the specified cloud life time  $T$ :

$$p(r)dr = \langle N \rangle \frac{\Delta t}{T} \frac{2r}{\langle r^2 \rangle} \exp\left(-\frac{r^2}{\langle r^2 \rangle}\right) dr$$

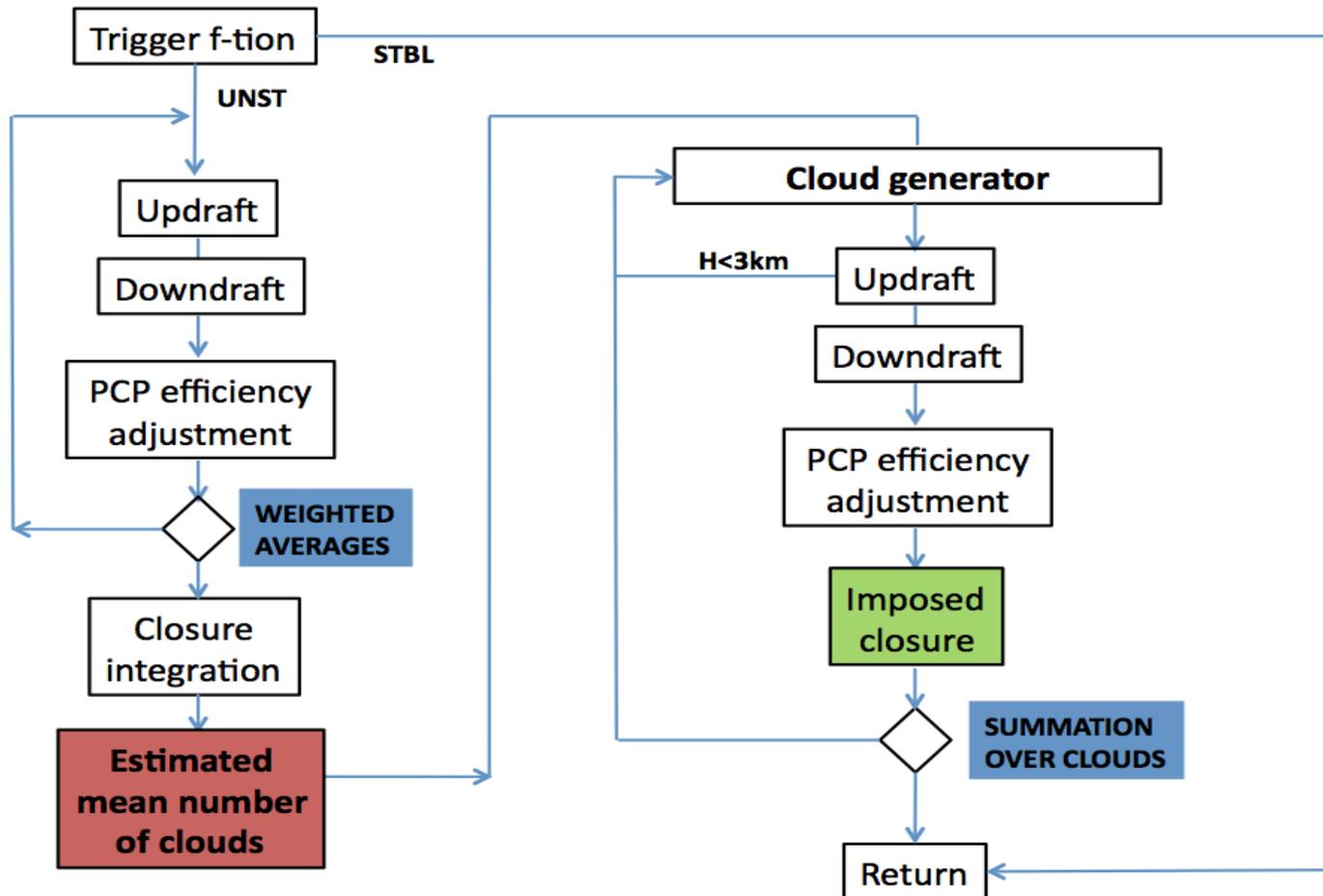
- **Mean number of plumes  $\langle N \rangle$**  is calculated from the net grid-area updraft mass flux  $\langle M \rangle$  and the expected individual updraft mass flux  $\langle m \rangle$  at the LCL, as

$$\langle N \rangle = \langle M \rangle / \langle m \rangle$$

- **Net grid-area mass flux  $\langle M \rangle$**  is obtained from closure assumptions in the deep-convection scheme.



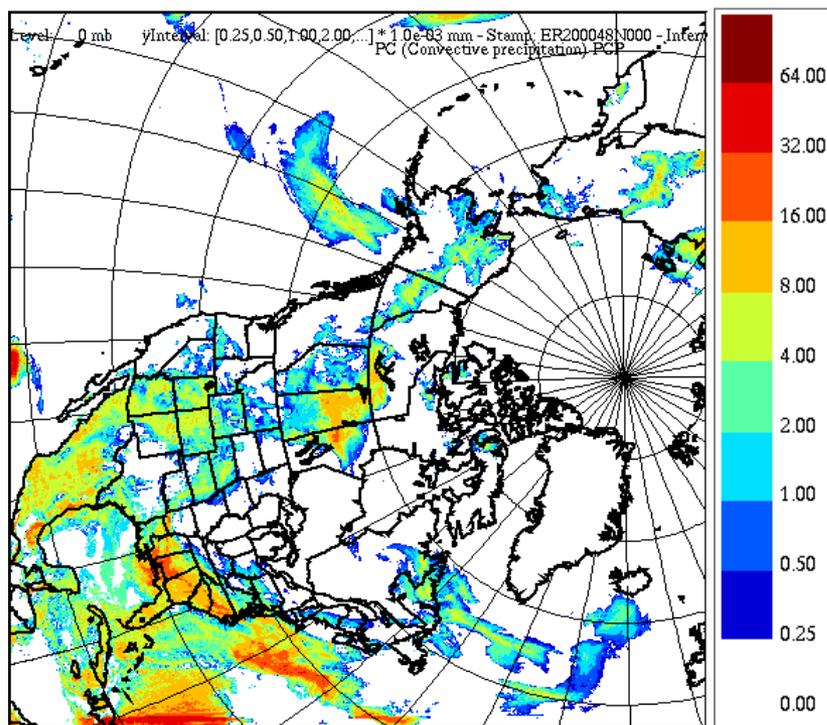
# Modification of Bechtold Deep Convection Scheme



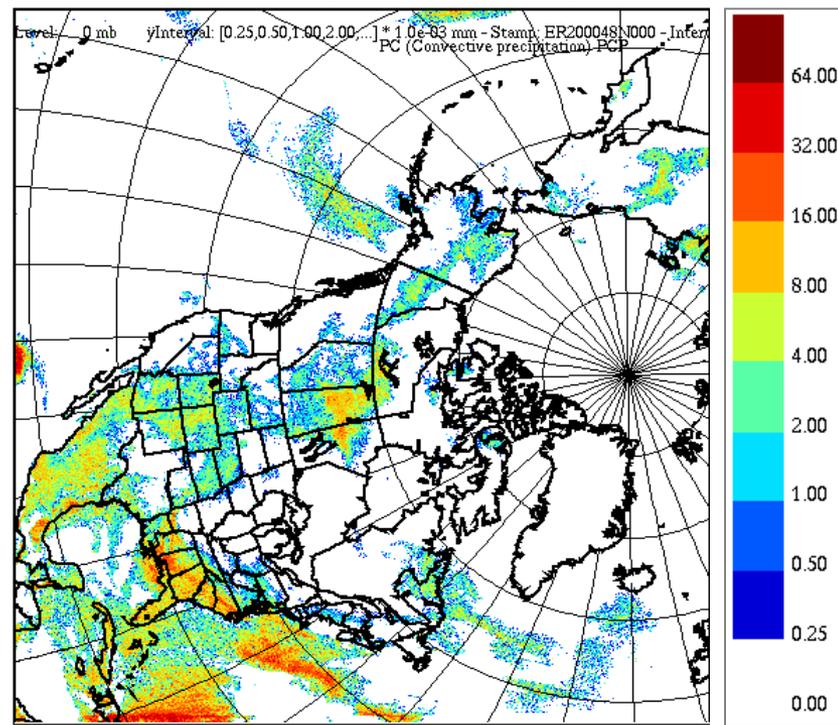
# Application in REPS

- REPS 2014-07-10-00 CONTROL MEMBER: 00-24h **convective precipitation** accumulation [mm/day]

**BECHTOLD SCHEME (DETERMINISTIC)**



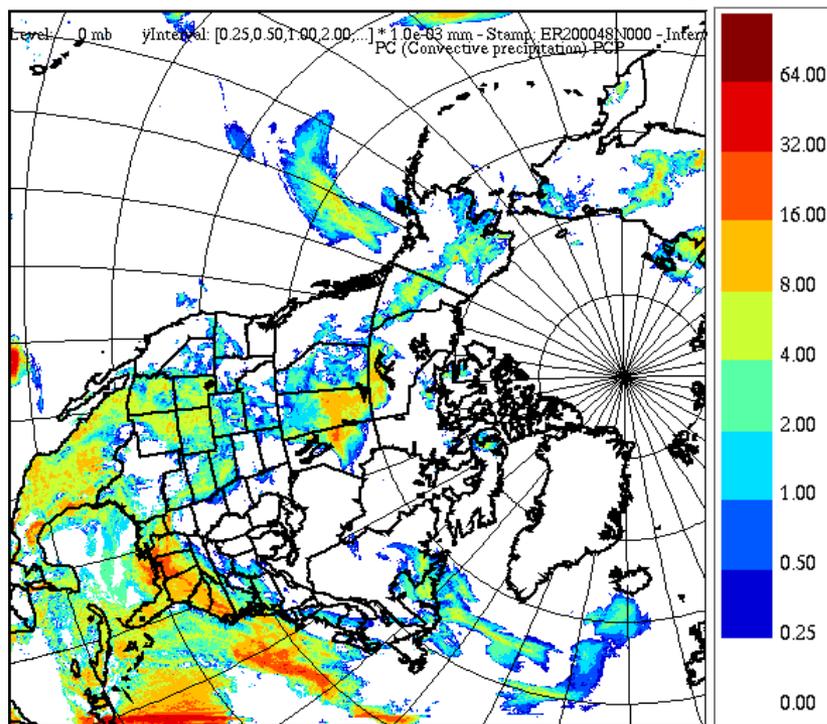
**BPC SCHEME (STOCHASTIC)**



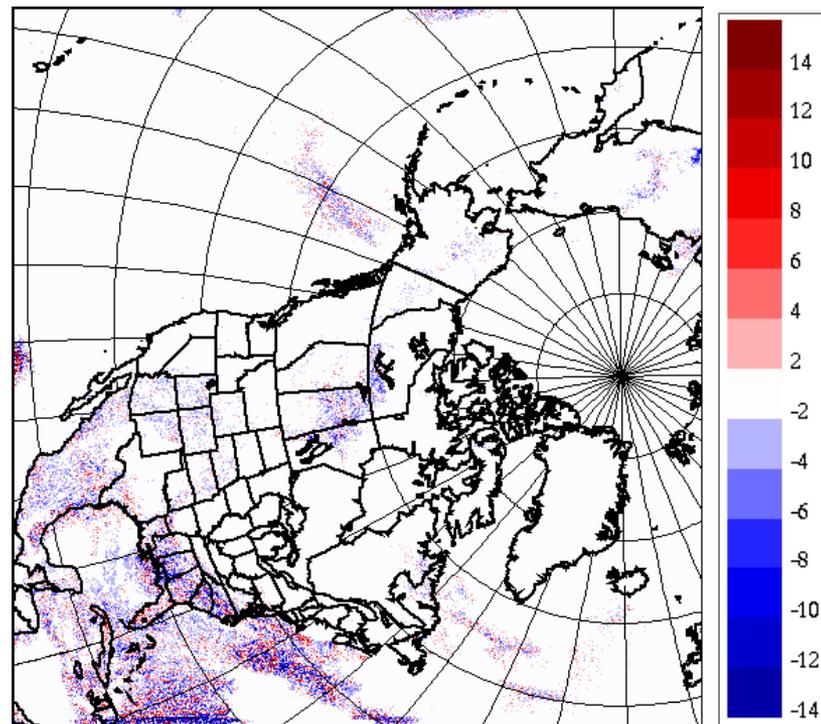
# Application in REPS

- REPS 2014-07-10-00 CONTROL MEMBER: 00-24h **convective precipitation** accumulation [mm/day]

BECHTOLD SCHEME (DETERMINISTIC)



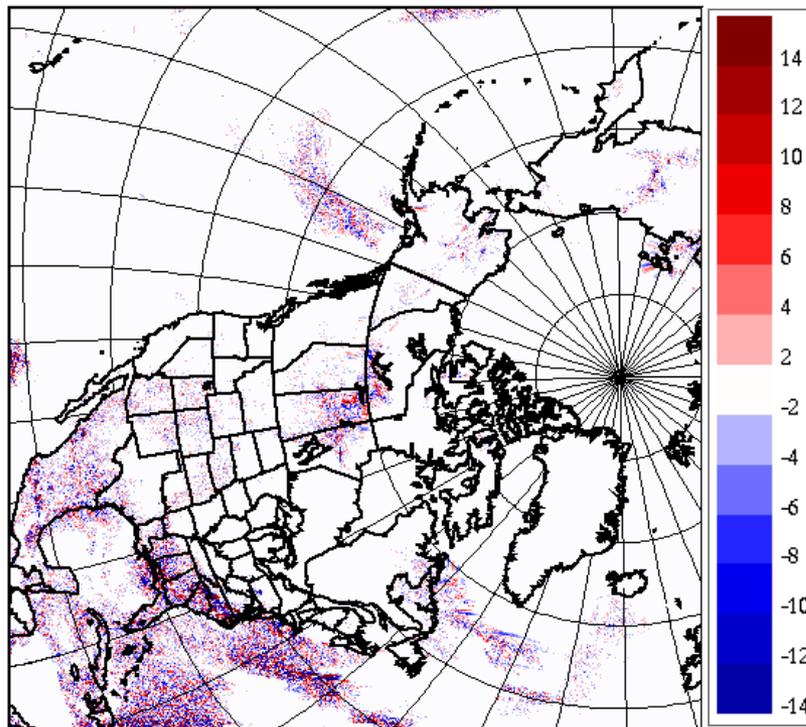
Difference BPC-BECHTOLD



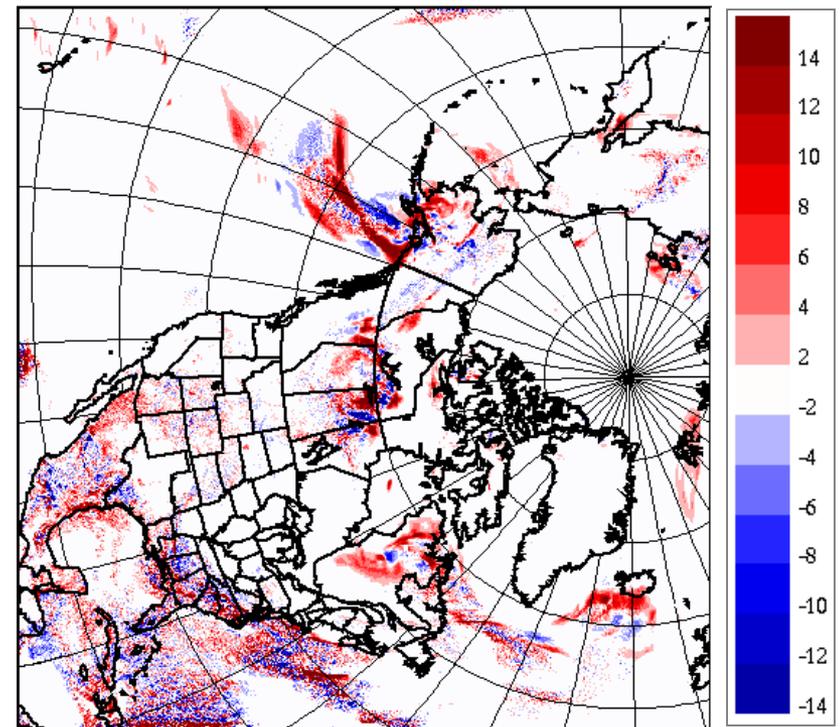
# Application in REPS

- REPS 2014-07-10-00 CONTROL MEMBER: 00-24h **TOTAL** precipitation accumulation [mm/day]

BPC scheme: change RND SEED

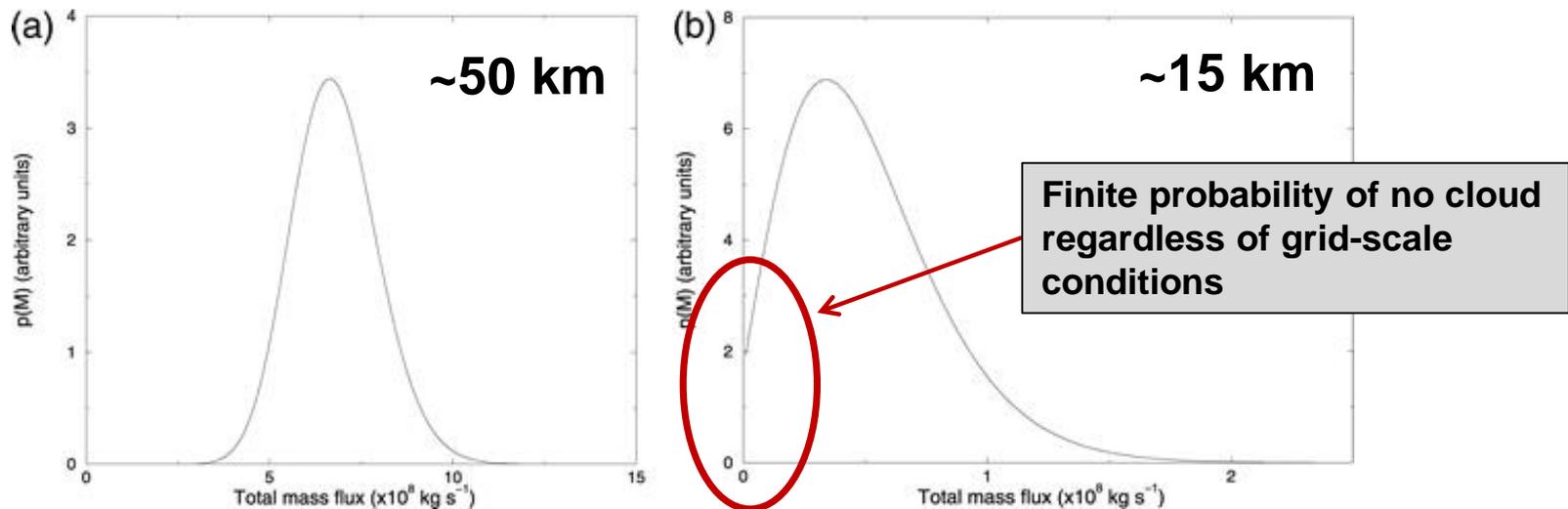


BPC scheme: PTP activated



# Net grid-area updraft mass flux distribution

- Resulting grid-scale cloud-base updraft mass flux PDF for average number of clouds: (a)  $\langle N \rangle = 68$  and (b)  $\langle N \rangle = 5$



Craig and Cohen (2006)

- Can model try to substitute the deep convection scheme with a “grid-scale storm”?



# Summary

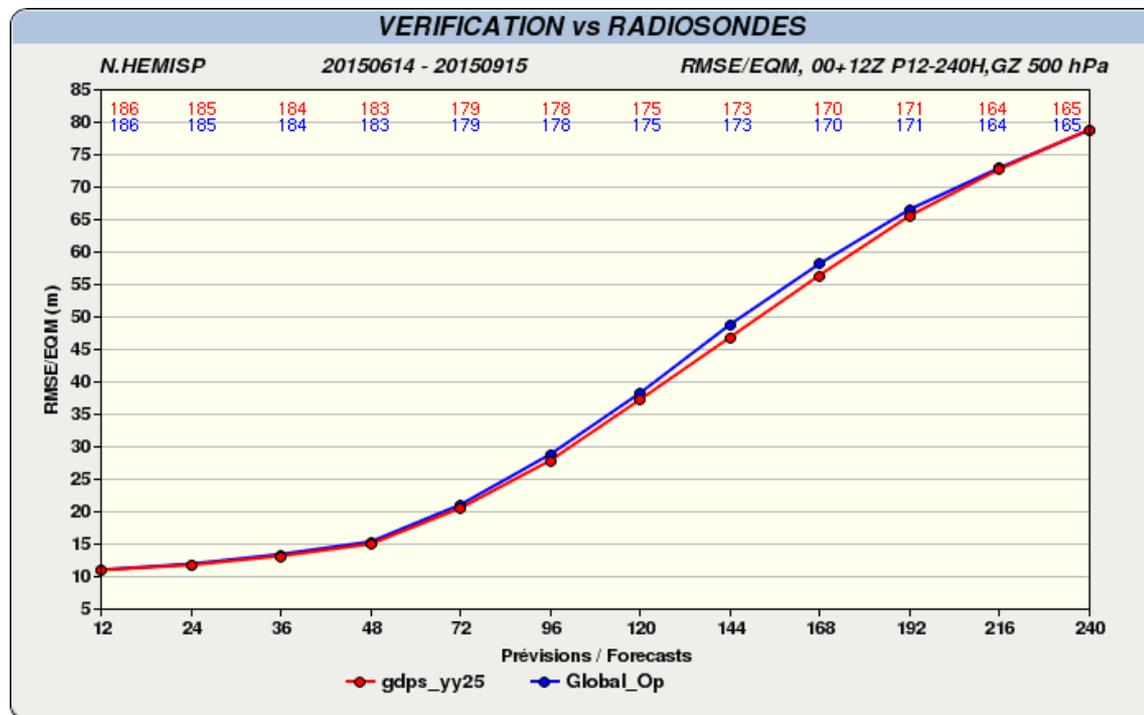
---

- GEPS and REPS in general place well, compared to other centres.
- Multi-physics approach
  - has relatively small impact on the spread in GEPS
  - bimodality - not correlated with uncertainty in the forecast.
- So far, rather moderate expectations from the stochastic deep convection approach
  - expected to add fine-scale variability to precipitation and near-surface fields and increase the spread
  - far from substituting PTP.
- Future work
  - stochastic shallow convection in the Bechtold scheme
  - other schemes (e.g., boundary layer, gravity wave drag).



# Impact of Inconsistencies in Discretizations

- Inconsistencies between the Semi-Lagrangian advection and trajectory calculations:
  - Mid-point -> Trapezoidal rule in trajectory calculations
  - Linear -> cubic interpolation in the calculations for departing positions.

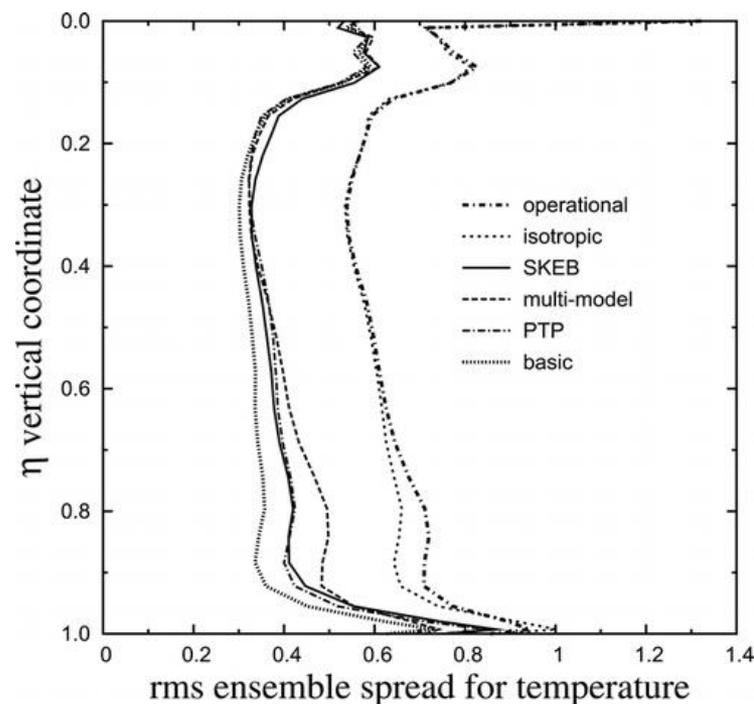
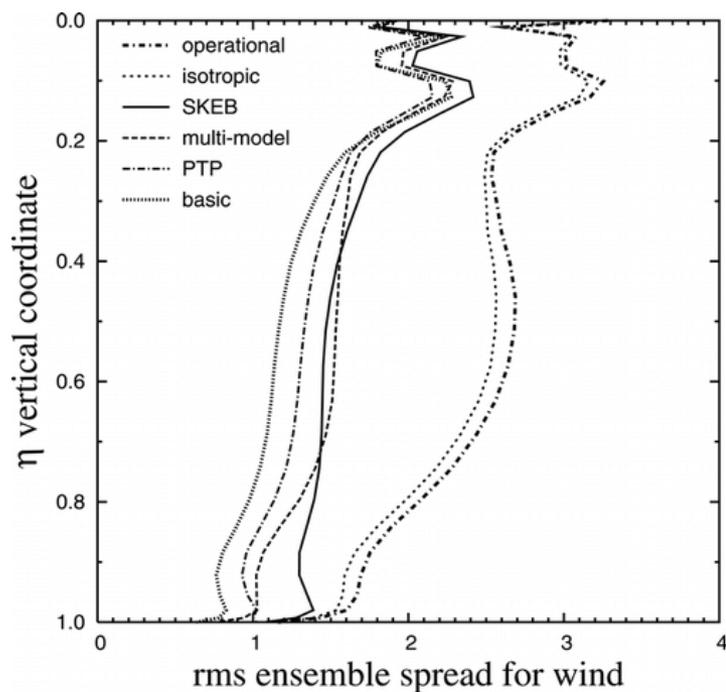


[return](#)



# Stochastic perturbations in the EnKF

- Approaches to model error simulation, such as PTP and SKEB, are costly but have a small contribution to ensemble spread in the EnKF context:



Houtekamer et al. (2009)

© American Meteorological Society

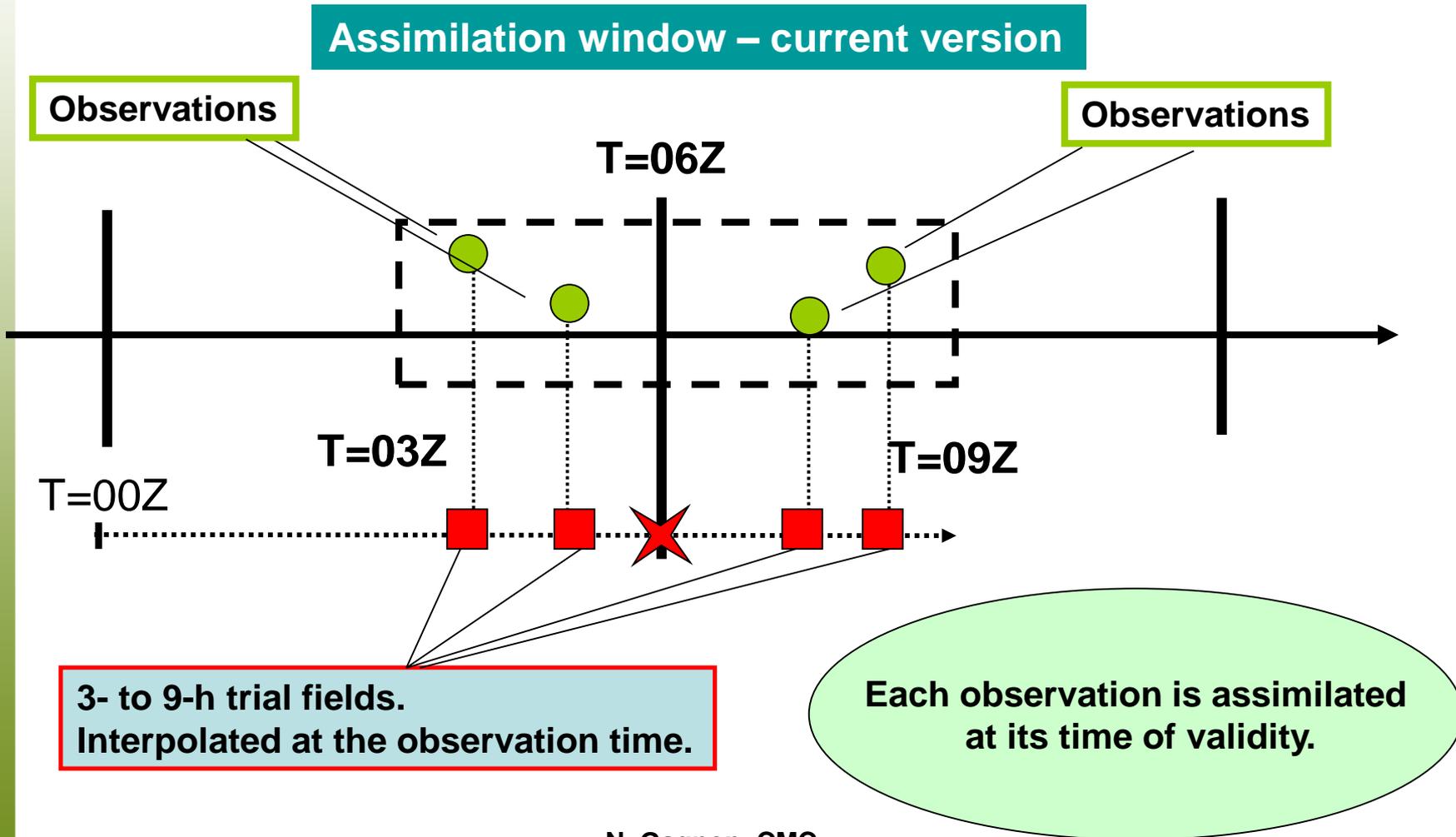


Environment  
Canada

Environnement  
Canada

Canada

# EnKF - 4D assimilation cycle



N. Gagnon, CMC

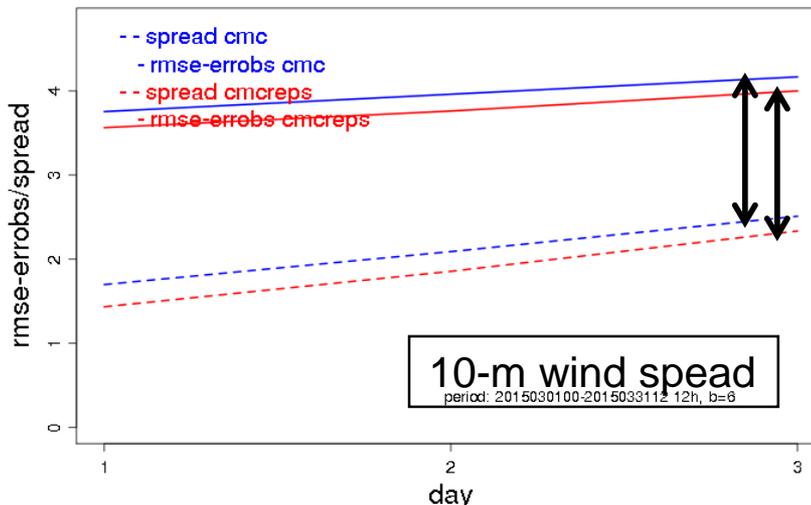
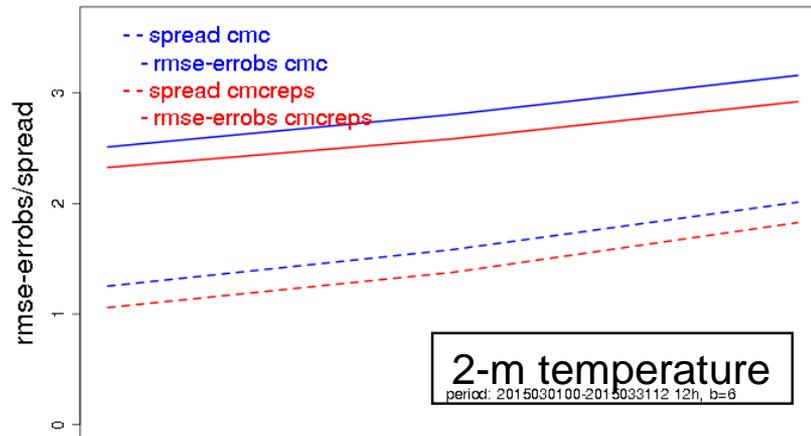


Environment  
Canada

Environnement  
Canada

Canada

# REPS vs. GEPS



**At the surface REPS does not improve the RMSE/SPREAD ratio.**  
**Space for improvement:**

- no perturbations of land-surface fields
- uniform observation error statistics

