

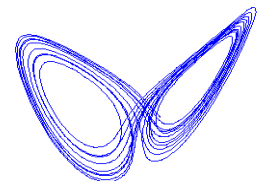


What is a reasonable ensemble size for operational GEFS?

Juhui (Jessie) Ma

Acknowledgment: Yuejian Zhu, Dingchen Hou,
Mozheng Wei, Malaquias Pena

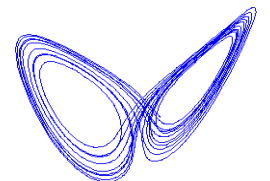
10/08/2010





Outline

- ➡ Impact of **ensemble size** on ensemble skill with **Lorenz 96** model
- ➡ Impact of **ensemble size** on ensemble skill with **NCEP GEFS** model
- ➡ The relative impact of increasing **model resolution** and increasing **ensemble size** with **NCEP GEFS** model



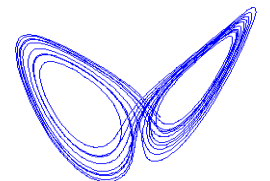


Impact of ensemble size on ensemble skill with Lorenz 96 model

- **Model:** Lorenz 96 model $\frac{dX_i}{dt} = (X_{i+1} - X_{i-2})X_{i-1} - X_i + F$
 - The magnitude of the forcing $F = 8$
 - $\Delta t = 0.05$ (corresponds to approximately 6h in the atmosphere)
 - Fourth-order Runge-Kutta integration scheme
 - Cyclic boundary condition
- **Analysis:** Kalman Filter method $x^a = x^b + P^b H^T (HP^b H^T + R)^{-1} (y - Hx^b)$

It provides analysis-error covariance to ETR perturbation.

$$P^a = P^b - P^b H^T (HP^b H^T + R)^{-1} HP^b$$
- **Initial perturbations :**
 - 1) Monte Carlo perturbation
 - 2) ETR based perturbation
- **Ensemble size:** 10, 20, 40, 60, 80, 100, 200
- **Verification:**
 - 1) RMS error of ensemble mean and Spread
 - 2) CRPS





RMSE and SPREAD

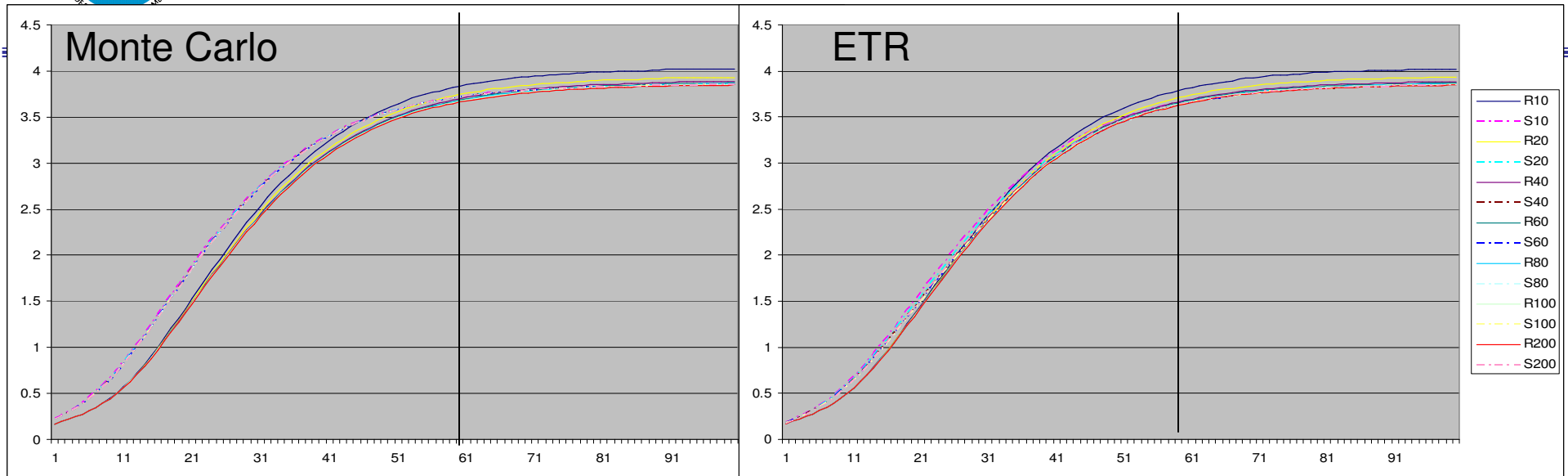
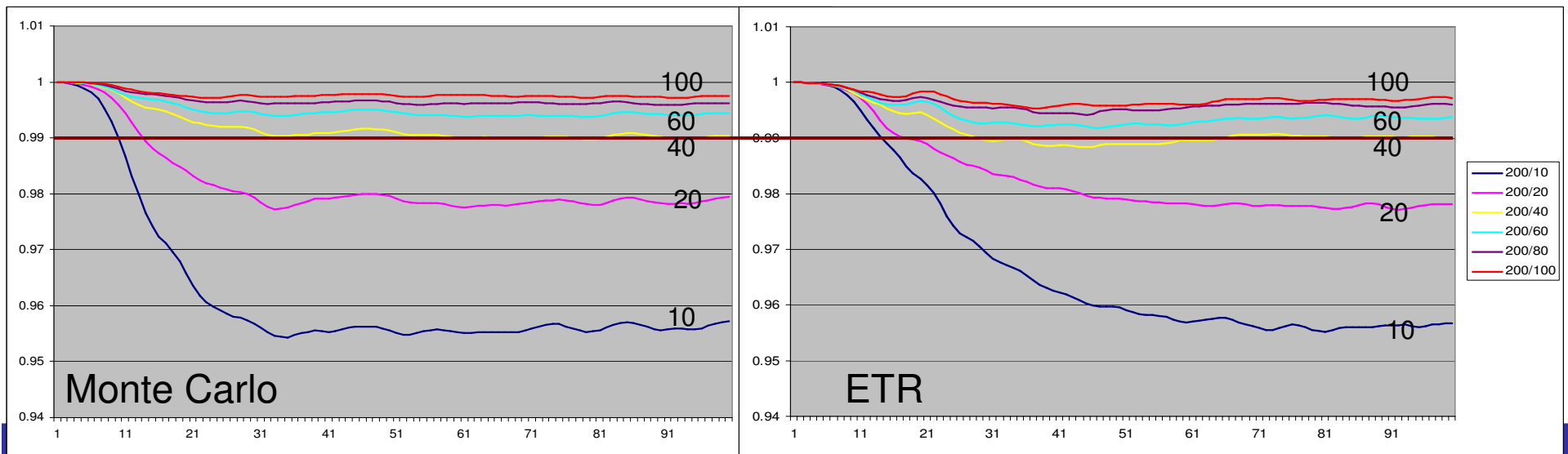


FIG.1 RMS error of ensemble mean and SPREAD for different ensemble members

FIG.2 RMS error ratios of 200-member ensemble mean to others



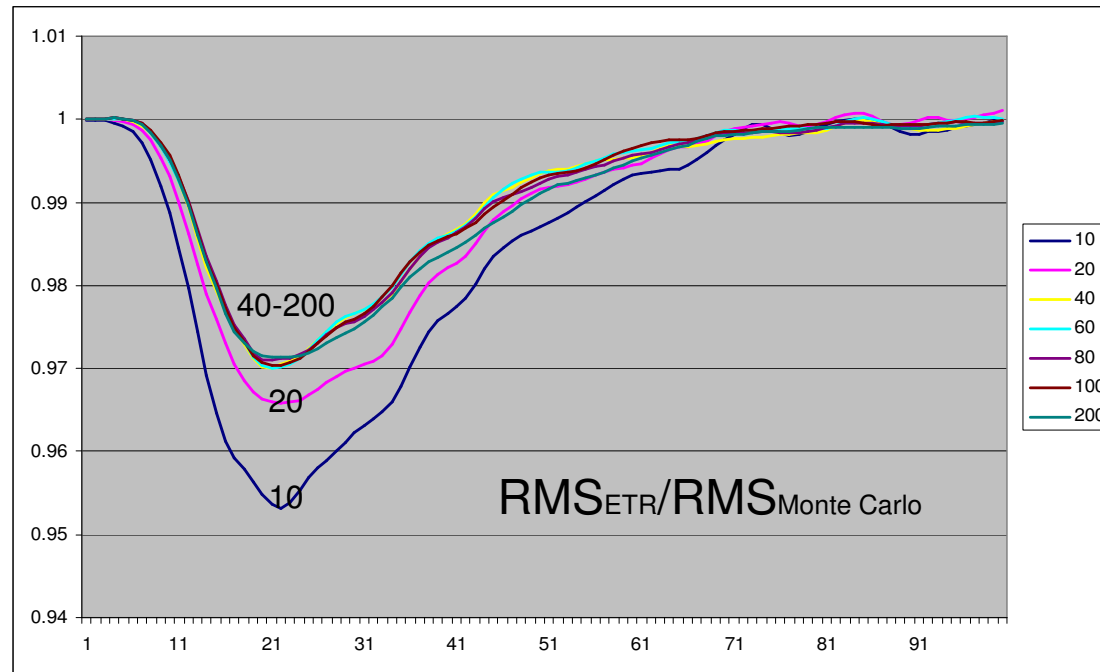
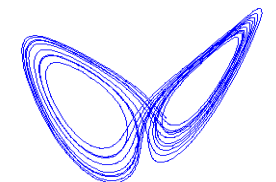


FIG.3 RMS error ratios of ETR to Monte Carlo perturbation for different ensemble members.





CRPS

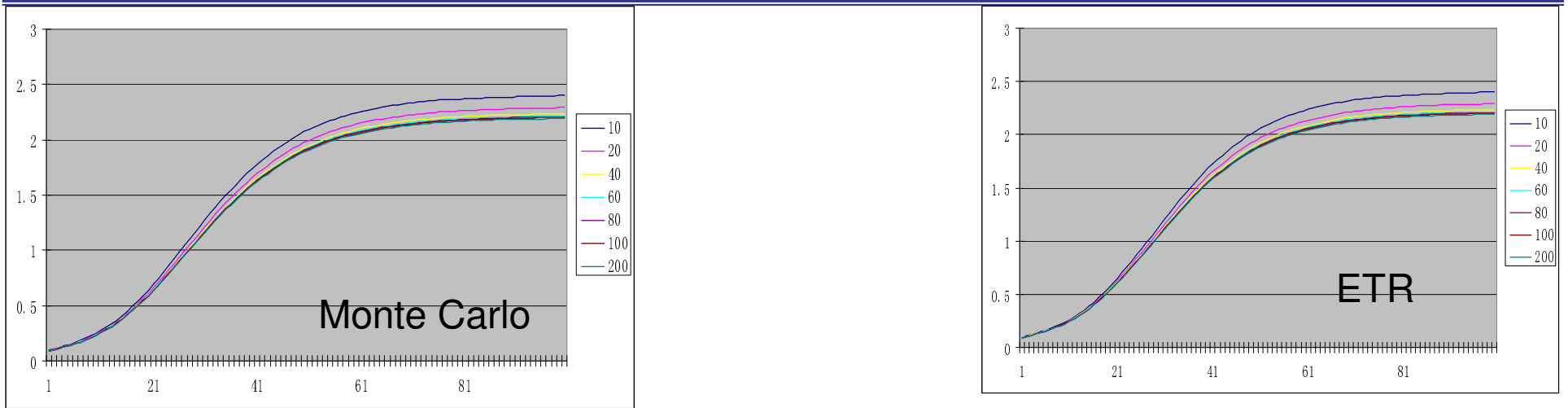
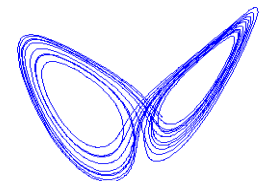
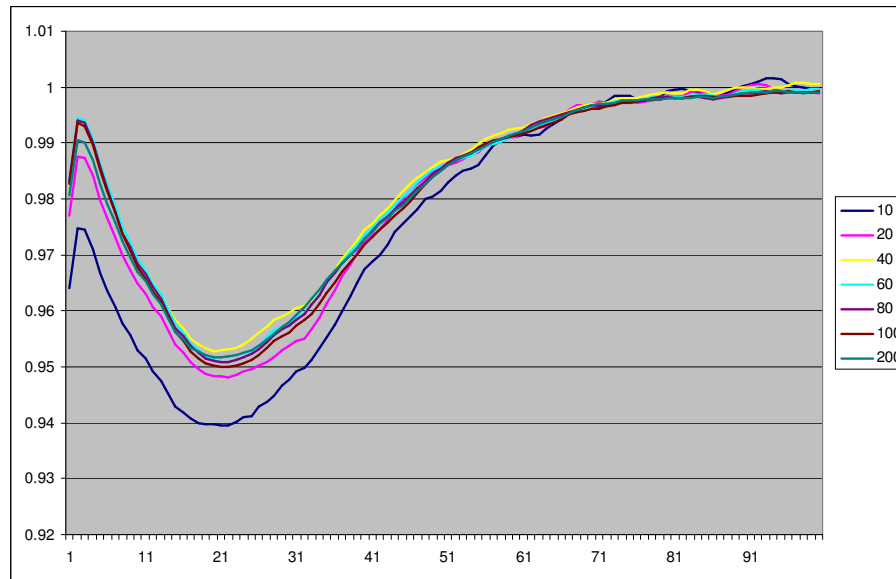


FIG.4 CRPS for different ensemble members. a, Monte Carlo perturbation; b, ETR perturbation.
FIG.5 CRPS ratios of ETR to Monte Carlo perturbation for different ensemble members.





Plan

- increase ensemble size to 1000

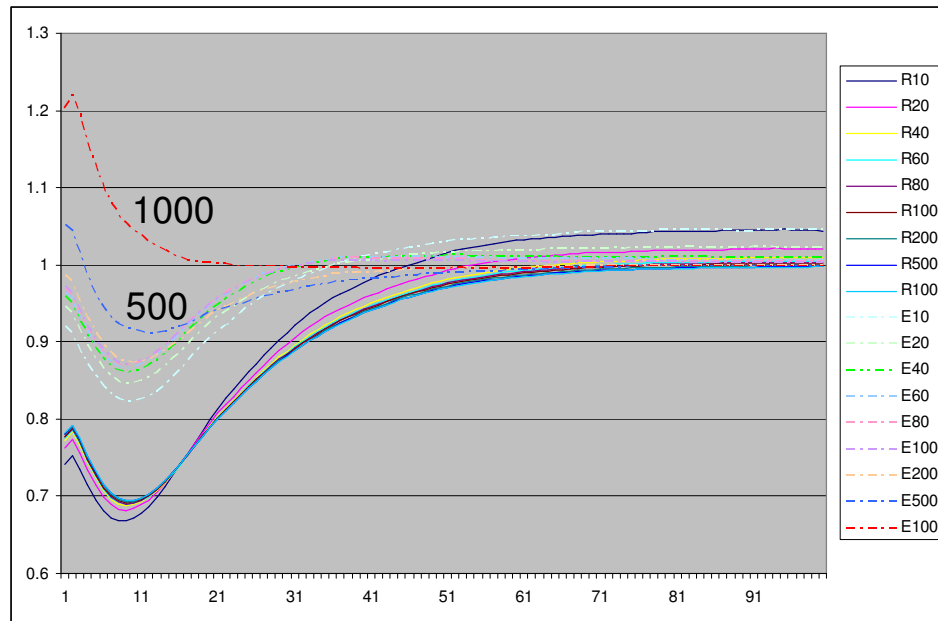
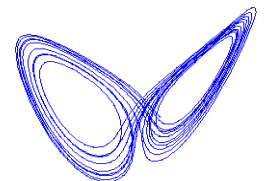


FIG.6 Ratio of RMS to SPREAD for different ensemble members. Solid lines are Monte Carlo perturbation; dot lines are ETR perturbation.

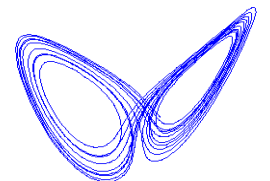
$$\frac{dX_i}{dt} = (X_{i+1} - X_{i-2})X_{i-1} - X_i + F \quad i=1000$$





Outline and Summary

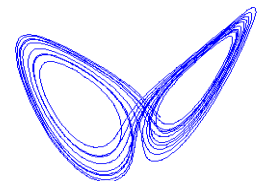
- ➔ Impact of **ensemble size** on ensemble skill with **Lorenz 96** model
 - ✦ RMS error of 40 members can almost represent 99% of 200 members, but 10 members only represent less than 96%.
 - ✦ ETR scheme outperforms Monte Carlo method for all lead time, especially around 4-7d.
- ➔ Impact of **ensemble size** on ensemble skill with **NCEP GEFS** model
- ➔ The relative impact of increasing **model resolution** and increasing **ensemble size** with **NCEP GEFS** model





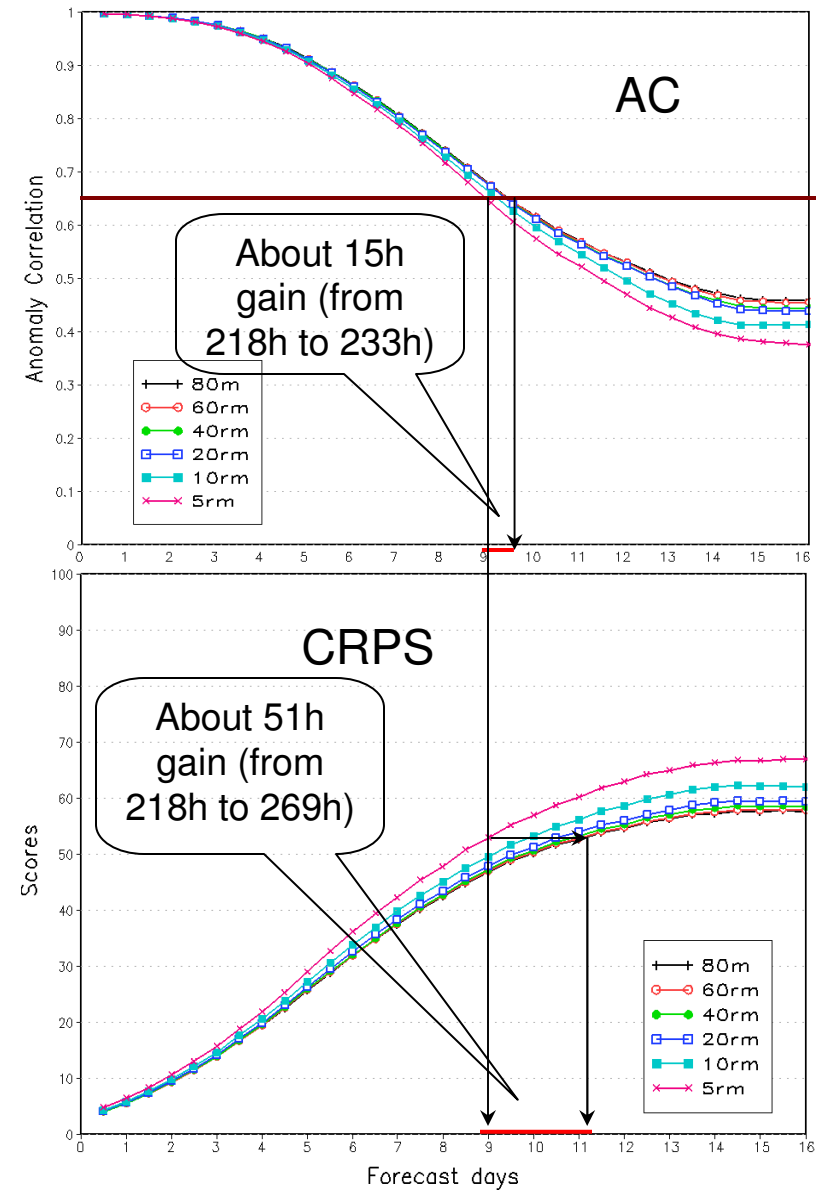
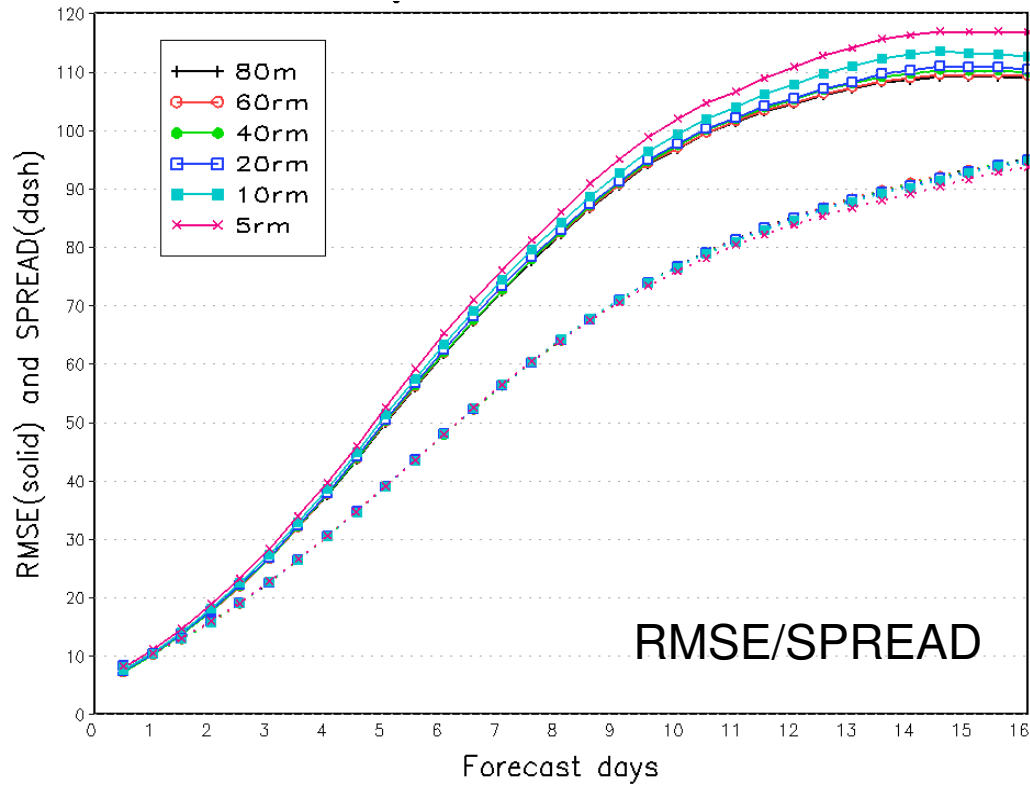
Impact of ensemble size on ensemble skill with NCEP GEFS model

- **Model:** The current operational GEFS bases on GFS v8.0 model at resolution T126L28.
- **Forecast length:** 384 forecast hours from 00UTC
- **Initial uncertainty:** ETR
- **Ensemble sizes:** 80, 60, 40, 20, 10 and 5
- From December 1st, 2009 to January 31st, 2010





NH z500





RMSE

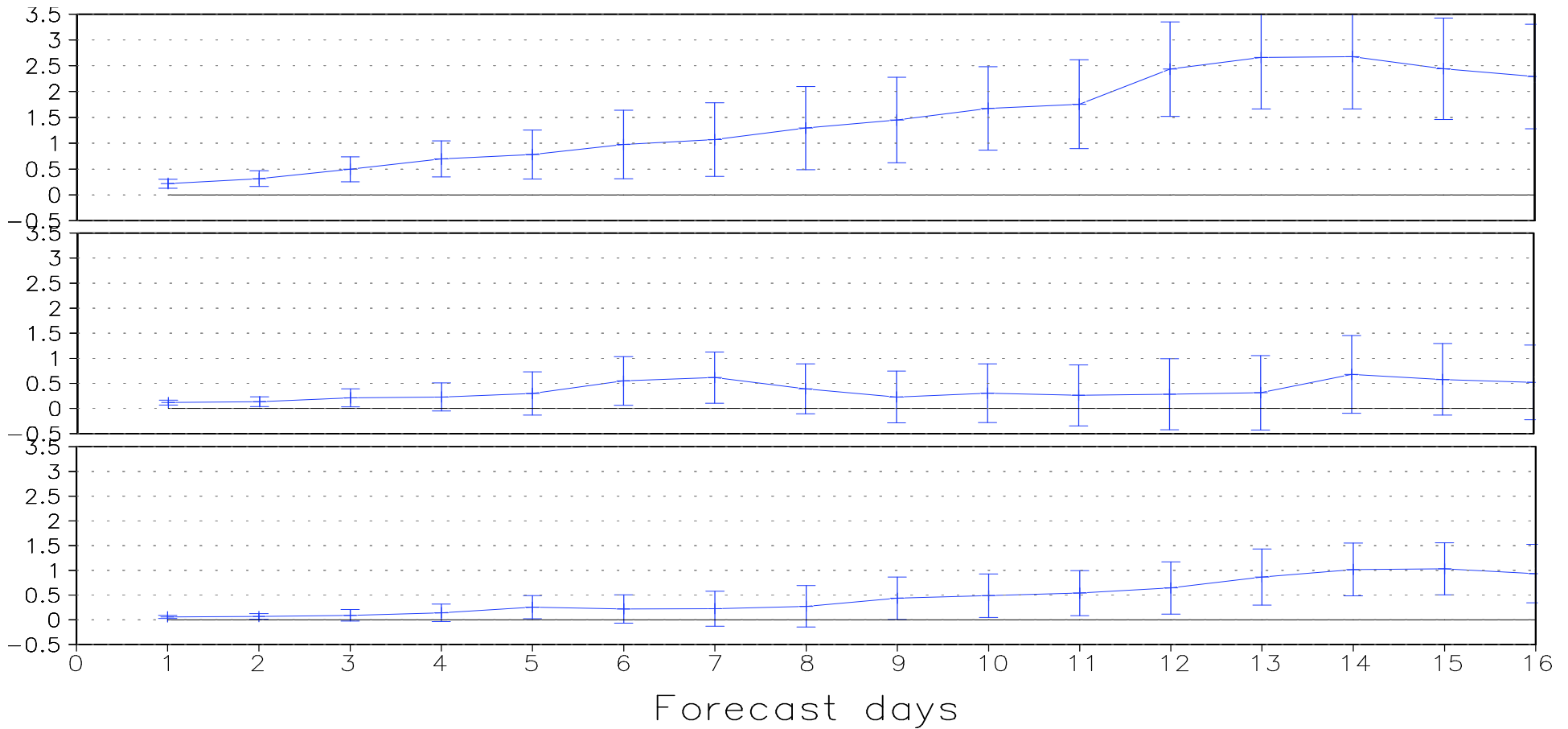
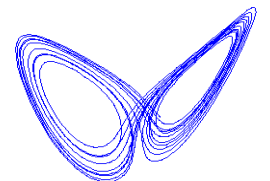


FIG. The differences of RMSE between 10-20, 20-40 and 40-80 ensemble members respectively. The Blue bars around the difference (blue line) are 95% confidence intervals.





CRPS

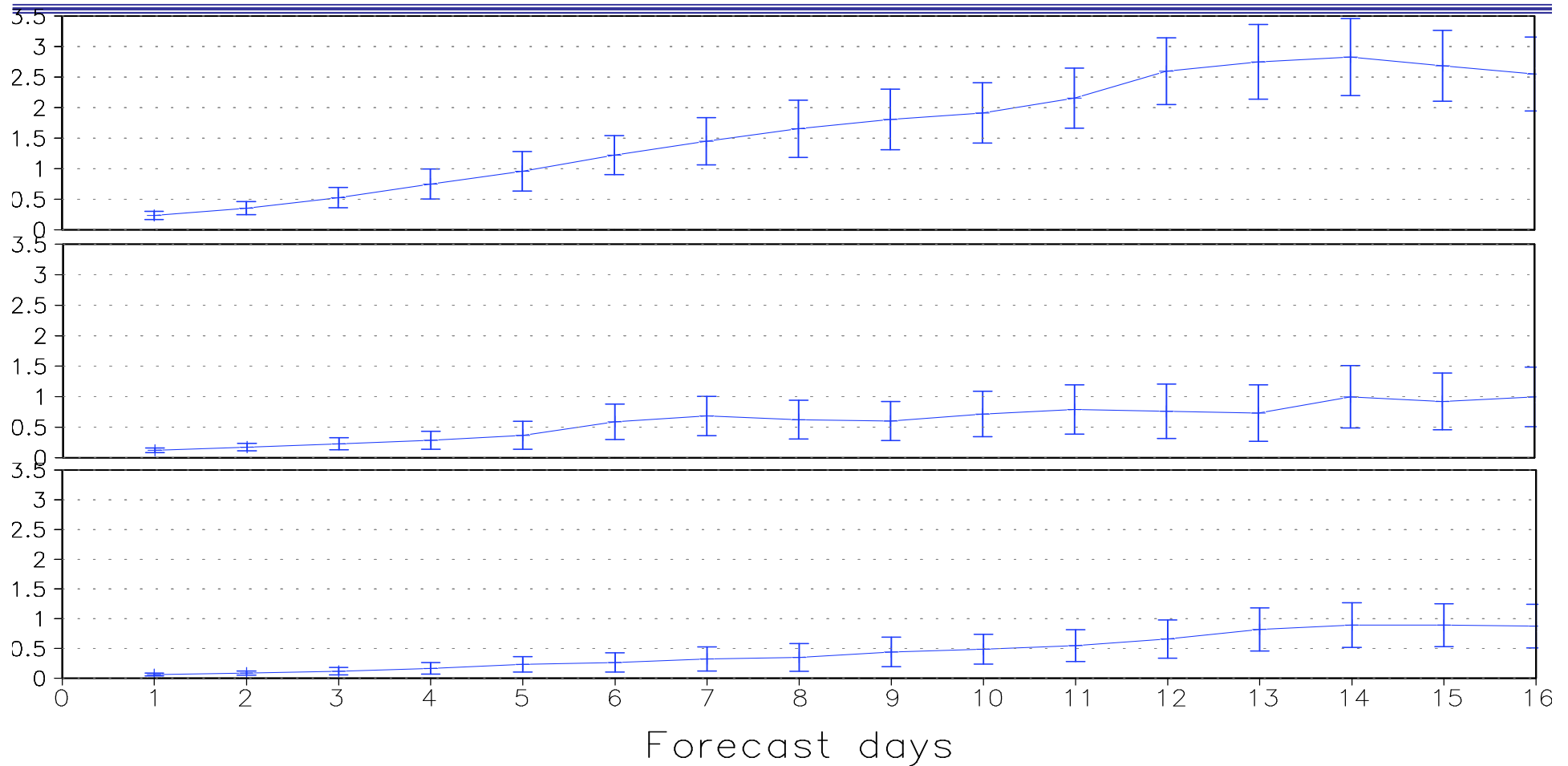
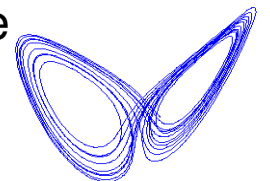
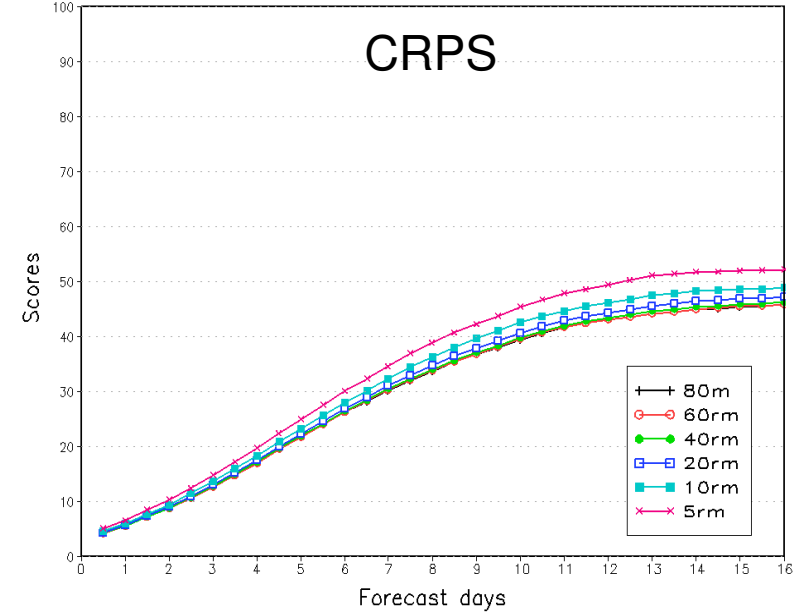
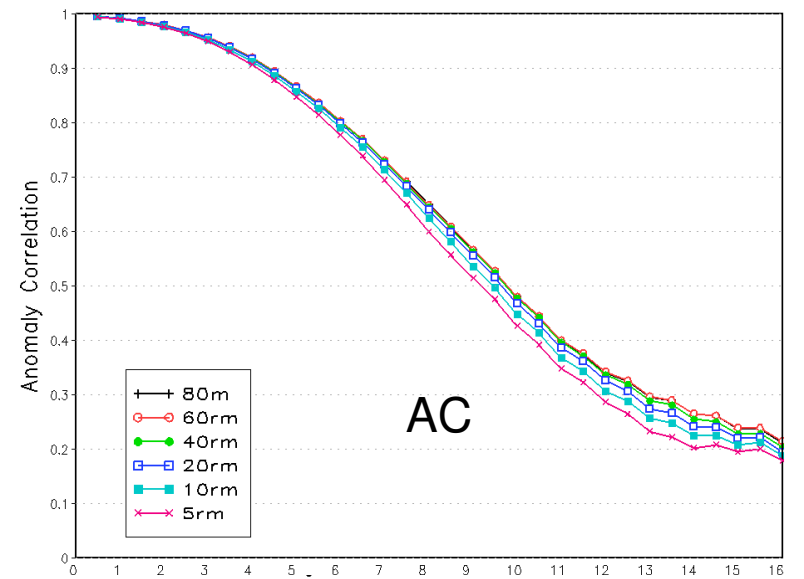
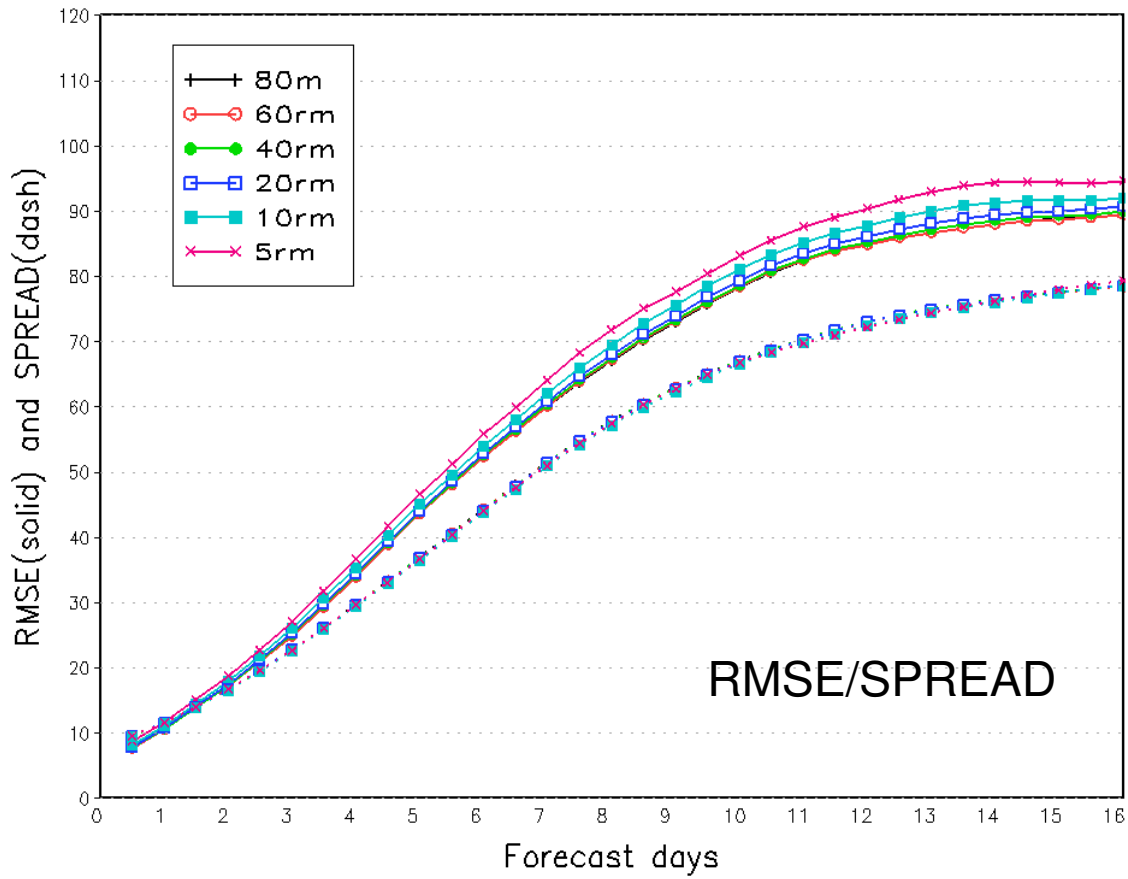


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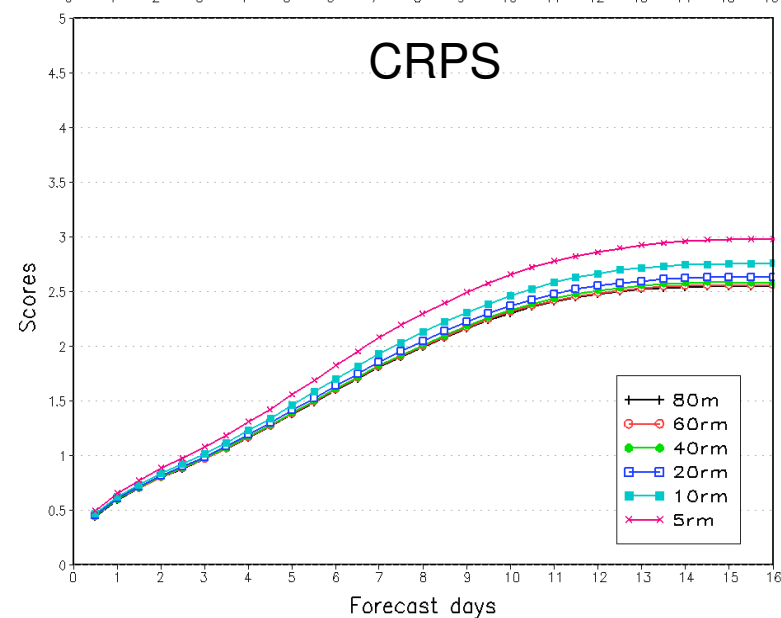
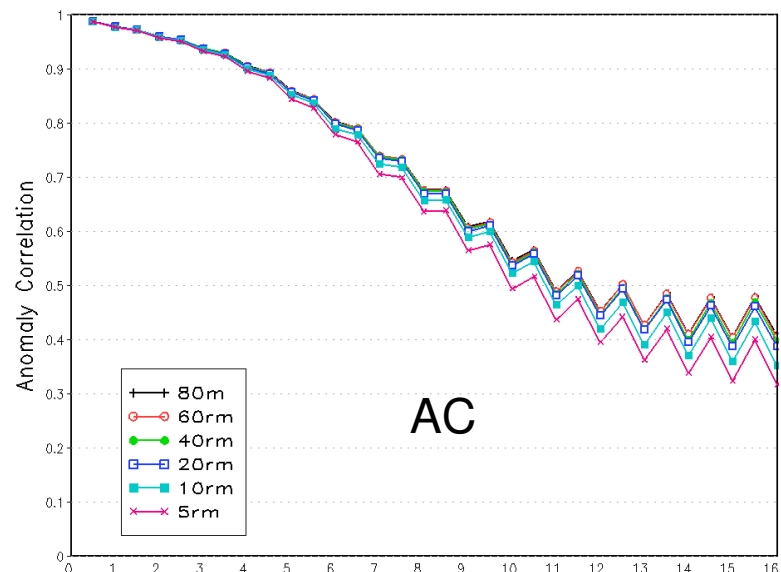
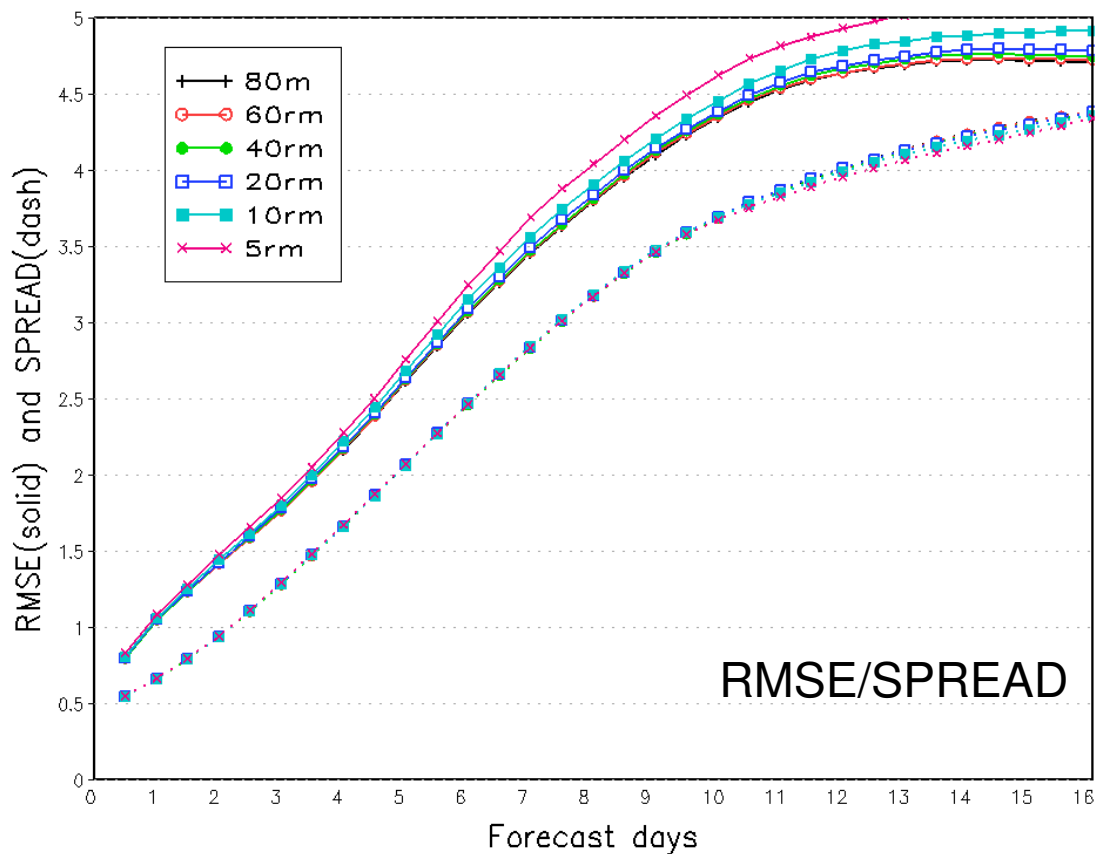


SH z500



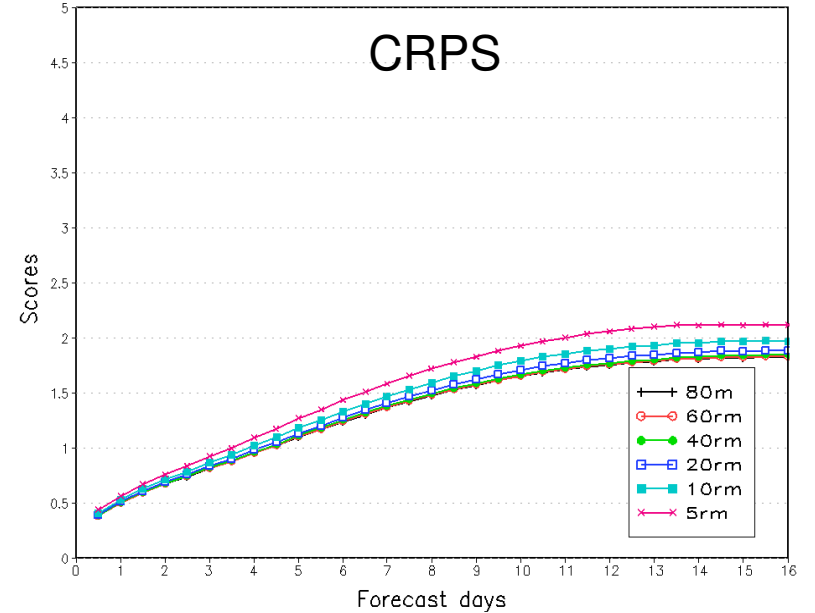
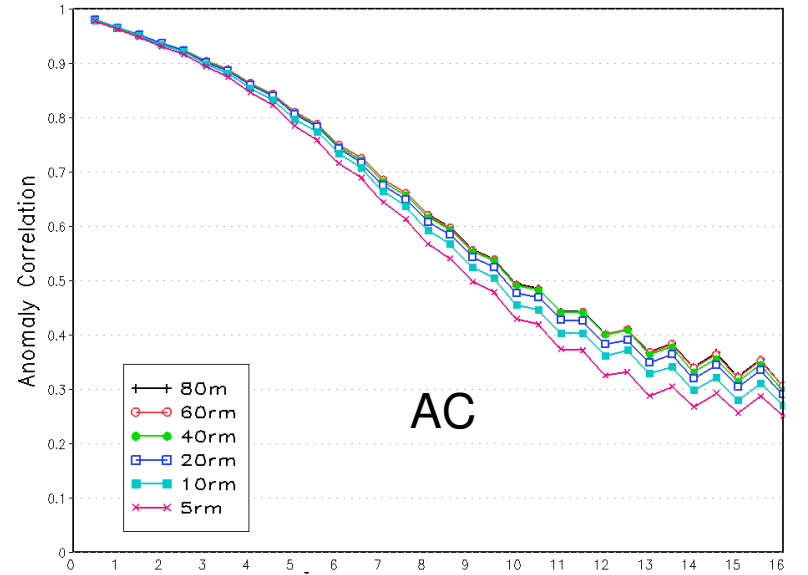
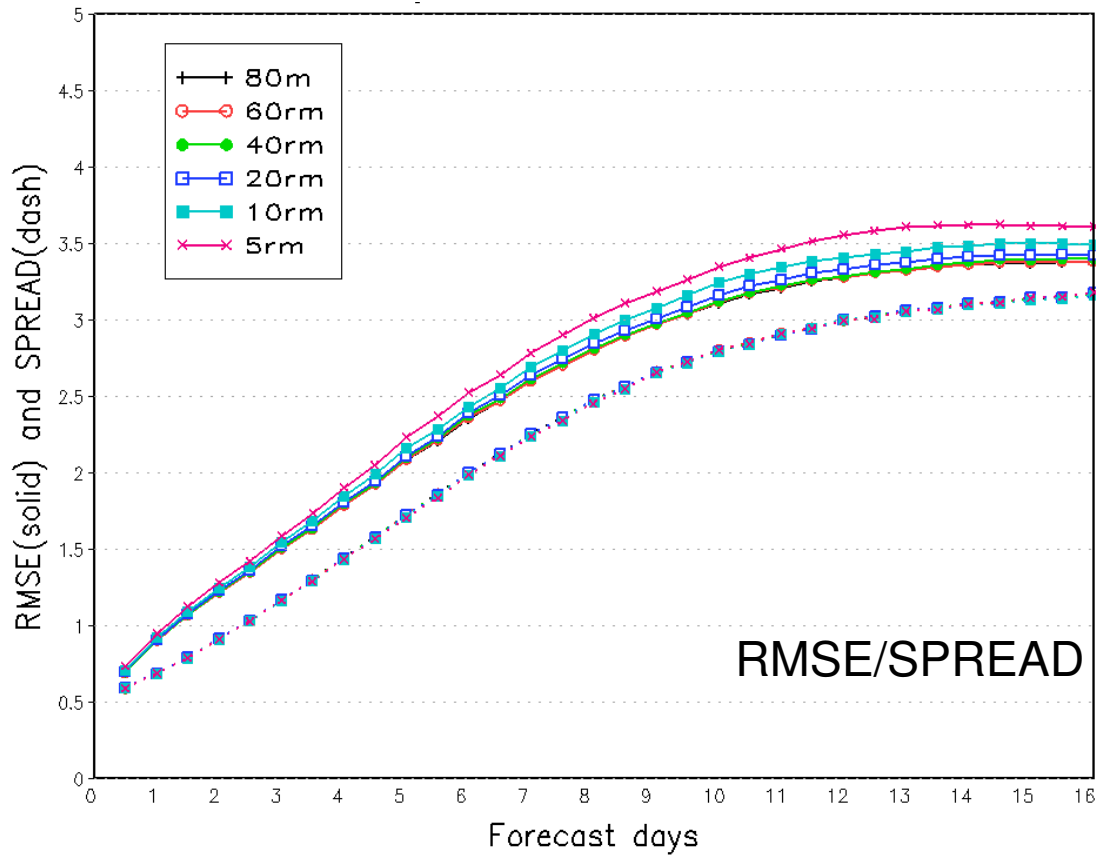


NH t850





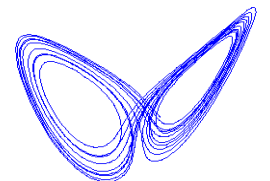
SH t850

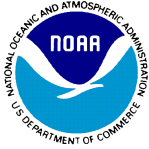




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- ➡ Impact of **ensemble size** on ensemble skill with **NCEP GEFS** model
 - ✧ The performance of ensemble forecast is affected by ensemble size, especially from 10-member increasing to 20-member.
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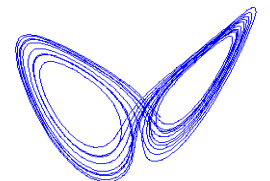
The relative impact of increasing model resolution and increasing ensemble size with NCEP GEFS model

T126L28 with 80 members

VS

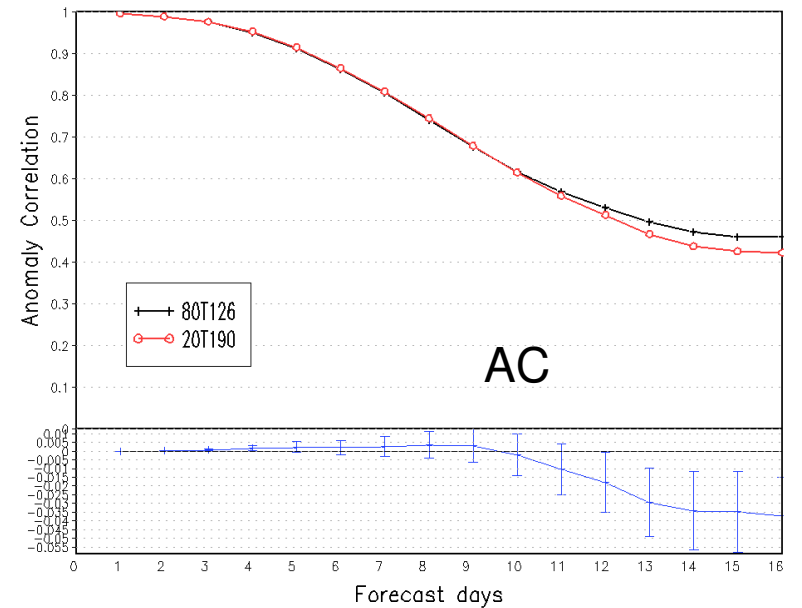
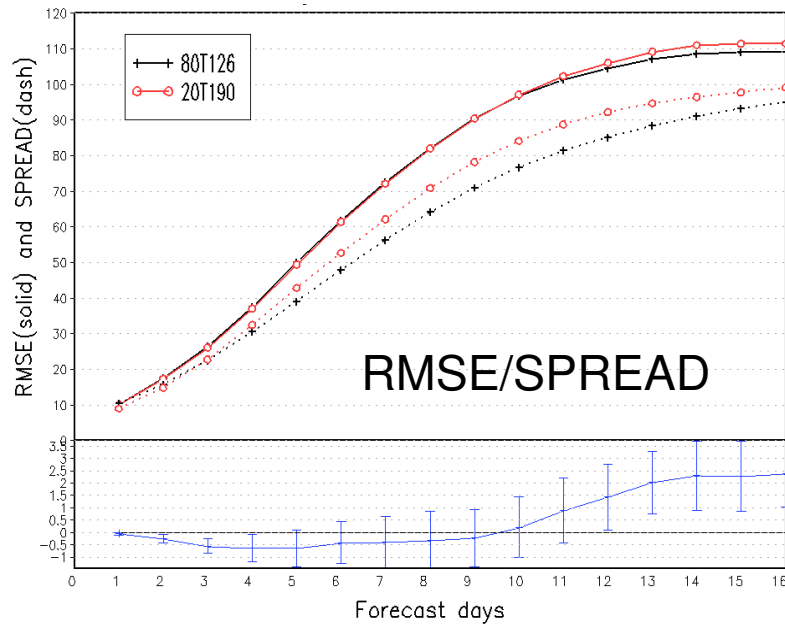
T190L28 with 20 members

They have equivalent computational costs, so it's necessary to compare their relative benefits.

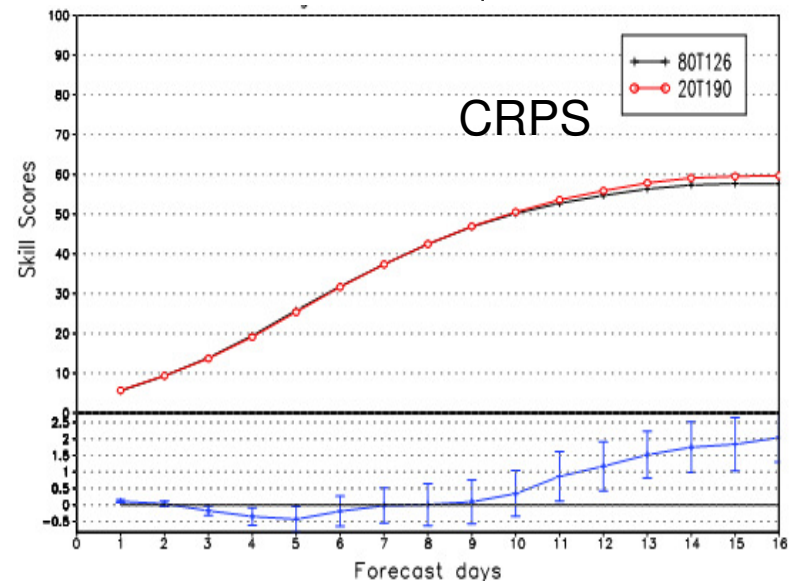




NH z500



	RMSE	AC	CRPS
20T190	1-5d	1-5d	3-5d
80T126	12-16d	13-16d	11-16d





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- ✧ The performance of ensemble forecast is affected by ensemble size, especially from 10-member increasing to 20-member.

➡ The relative impact of increasing **model resolution** and increasing **ensemble size** with **NCEP GEFS** model

- ✧ Increasing model resolution is more (less) beneficial than increasing ensemble size for short (long) lead times.
- ✧ More ensemble members will benefit the extend forecast.

