Study on data assimilation to improve precipitation forecasts

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- 1. Background and purpose
- 2. Improved DA scheme
- 3. Comparison of PR Z observation with model

1. Background



Various satellite data have been assimilated to generate accurate initial states of Numerical Weather Prediction (NWP)

However, use of cloud/precipitation-affected data is limited

- Complex processes, high nonlinearity and non Gaussianity
- While some cloud/precipitation-affected radiances have been assimilated in NWP centers, no space radars have been used
- Aonashi & Eito (2011) developed EnVAR+DEC data assimilation (DA) system
 - Successfully assimilated cloud/precipitation-affected TMI radiances
 - But some issues were found
 - 1. Sampling errors
 - Small ensemble members, especially for precipitation event
 - 2. Gravitational noise generated in DEC
 - 3. Limited observations

EnVAR: Ensemble-based VARiational method DEC: Displacement Error Correction





- Generate better initial states and forecasts by developing an advanced DA system and assimilating cloud/precipitation observations
- 1. Improve EnVA+DEC DA system
 - Reduce sampling errors in EnVA
 - Suppress gravitational noise by developing a smoothing term in the variational method in DEC
- 2. Assimilate new observation
 - PR and DPR vertical profiles

EnVA+DEC (Aonashi & Eito 2011)



DEC

Preprocessing to correct displaced error d using a variational method

$$J_{d} = \frac{1}{2} (Y - H(\bar{X}^{f}(\bar{d})))^{t} R^{-1} (Y - H(\bar{X}^{f}(\bar{d}))) + \left| \bar{d} \right|^{2} / 2\sigma_{d}^{2}$$

EnVA

An ensemble-based variational method

- Estimate flow-dependent error covariance
- Need no adjoint models
- Handle non-linearity

• Analysis variable Ω is defined in ensemble forecast error subspace $P_e^{f/2}$

$$J_{x} = \frac{1}{2}(\bar{X} - \bar{X}_{f})P_{f}^{-1}(\bar{X} - \bar{X}_{f}) + \frac{1}{2}(Y - H(\bar{X}))R^{-1}(Y - H(\bar{X}))$$

 $\vec{X} - \vec{X}^{f} = P^{f/2} \circ \Omega \qquad P_{e}^{f/2} = [\vec{X}_{1}^{f} - \vec{X}^{f}, \vec{X}_{2}^{f} - \vec{X}^{f}, ..., \vec{X}_{N}^{f} - \vec{X}^{f}]$ Spatial localization is applied to forecast error covariance $P_{f} = P_{e}^{f} \circ S$

Improve EnVA (1/2): 2-scale analysis variables



- Horizontal scale varies for variables and rain condition
- Separate analysis variables into large-scale mode and local mode according to horizontal correlation scale
 - Large-scale mode : U,V, quasi-RH, potential temperature
 - Local mode : precipitation-related variables and departure of the large-scale mode from the spatial average



Horizontal correlation of 2-scale analysis variables

- Without separation, both variables have moderate scale
- With separation, local variable (precipitation) reasonably shows smaller scale while others show larger scale.



Improve EnVA (2/2) Neighboring ensemble (NE)



- Adopting spectral localization (Buehner and Charron, 2007) creates spatially shifted versions of ensemble members to calculate the forecast error covariance.
 - Increased ensemble members reduce sampling errors although effective spatial scale is compromised.
 - NE within up to s=5 grids (=5x5 ensemble) successfully reduced averaged distance with high correlation of precipitation



Averaged distance for precipitation horizontal correlation > 0.5 in the case of typhoon

Evaluation of the new EnVA using OSSE



- The new EnVA (2-scale analysis variables and NE) was tested by assimilating simulated RAOB and surface precipitation.
- OSSE results showed
 - Analysis increment with reasonable scale variation according to precipitation conditions.
 - Precipitation analysis well agrees with truth.



3. Assimilate PR & DPR



- Investigate the viability and impact of Z or precipitation profiles
 - Exploit vertically-resolved precipitation-related information

- As the 1st step, we are comparing PR observation (Z) with model simulation
 - JMA-NHM (Saito et al. 2006) + Joint-simulator (Hashino et al. 2013)
 - Needed to develop quality control procedures in DA
 - Help to verify model cloud microphysics
 - Contribute to model improvement

Comparison result 1

Model : JMA-NHM

- 5km, 50 layers, 151x151 grids
- Initial: 00UTC on 6 April 2008, 5-h forecast
- Observation :TRMM/PR (ver.7)
 - 2A25 (attenuation-corrected Z)
 - IC21 (No corrected Z)
 - Used when "rain certain" in "reliab" flag
- Simulator : Joint-simulator (Ver201308)
 - Nearest neighborhood interpolation to observation point
 - Turn off bright band calculation function



TRMM/PR precipitation & TRMM/VIRS cloud 05 UTC on 6 Apr. 2008





CFAD (Contoured Frequency by Altitude Diagram)



JMA