

# The 10,240-member ensemble Kalman filtering with an intermediate AGCM without localization

Keiichi KONDO and Takemasa MIYOSHI

RIKEN AICS  
Data Assimilation Research Team



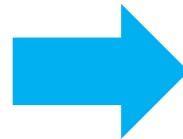
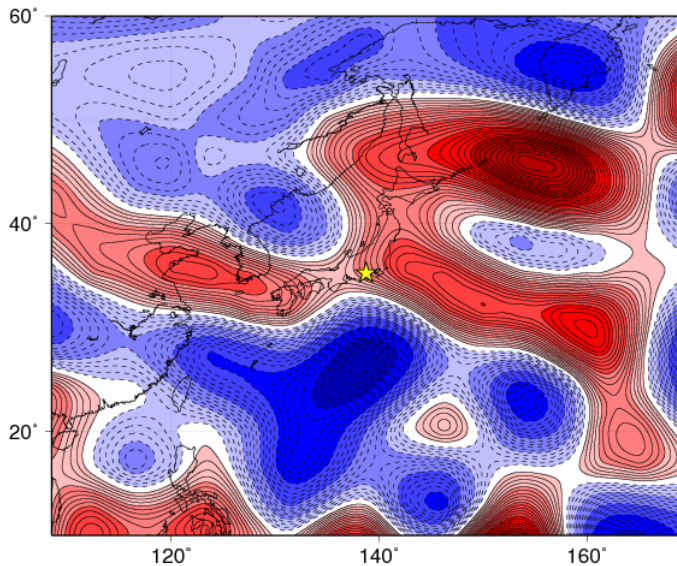
# Introduction

- Dual localization method
- Impact of a large ensemble

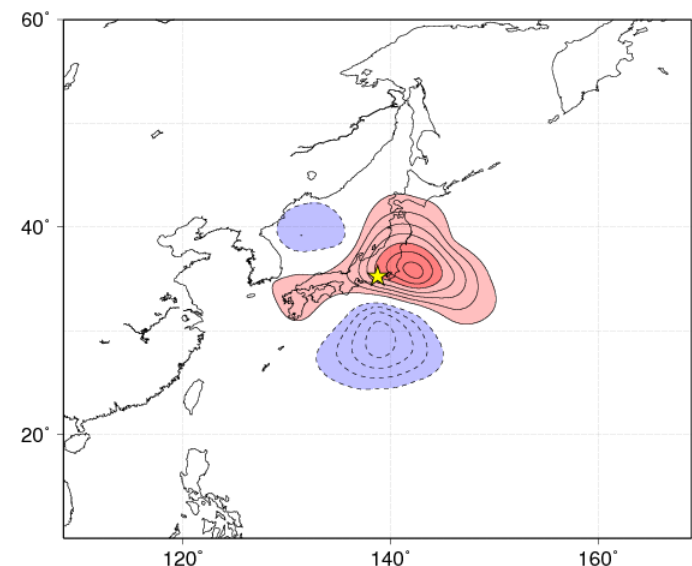
# Introduction

- Spurious sampling error may be problematic.
  - Localization plays an essential role.

## No localization



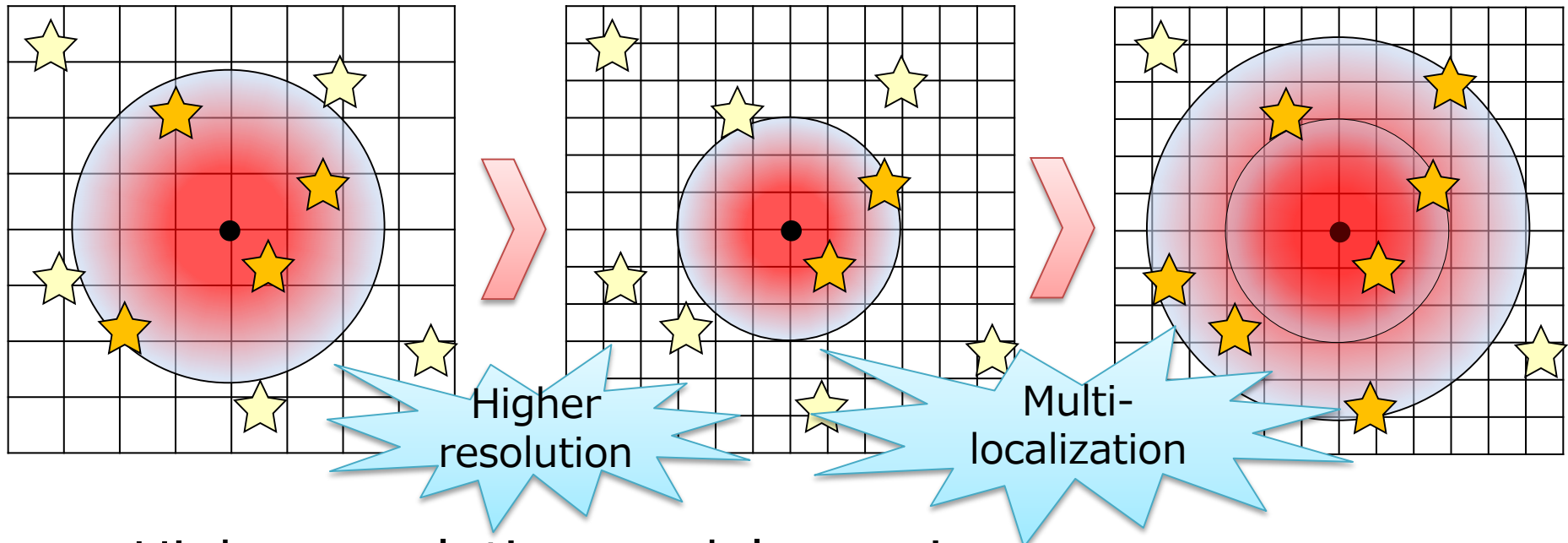
## Localized



Analysis increments from a single profile observation (20 members)

# Introduction

- Model resolution and localization



- Higher resolution models require narrower localization which limits the influence of observations.

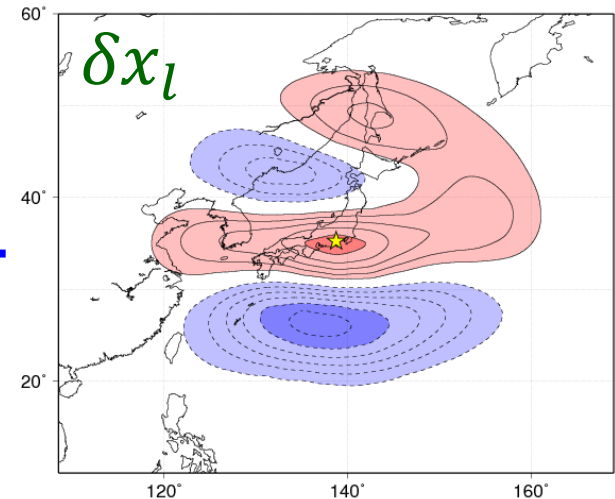
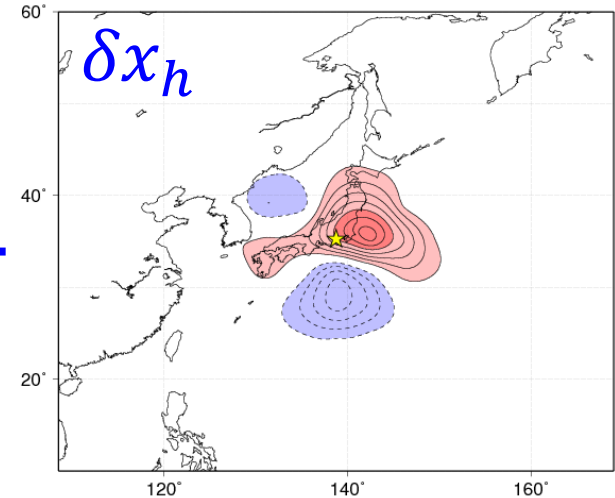
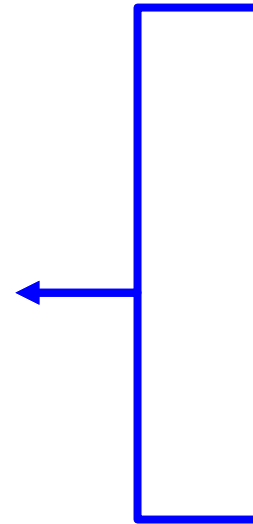
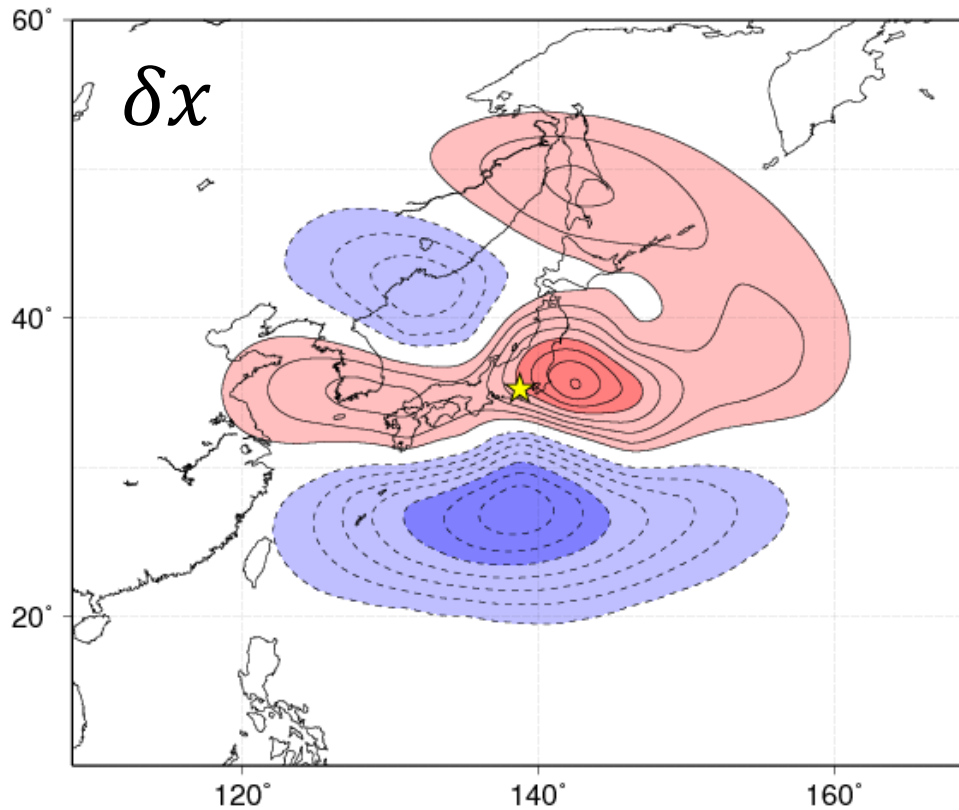


- Miyoshi and Kondo (2013) and Kondo et al. (2013) proposed “**multi-scale localization method**”.

# Dual-Localization Method

- We construct analysis increments as a sum of high- and low- resolution components.

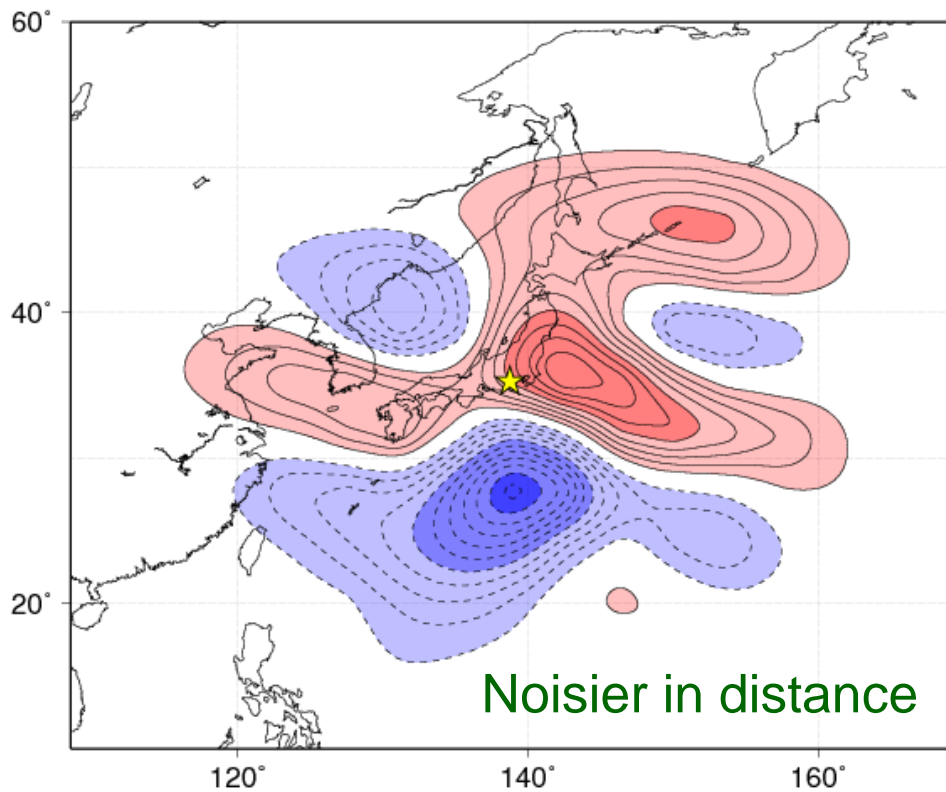
$$\delta x = \delta x_h + \delta x_l$$



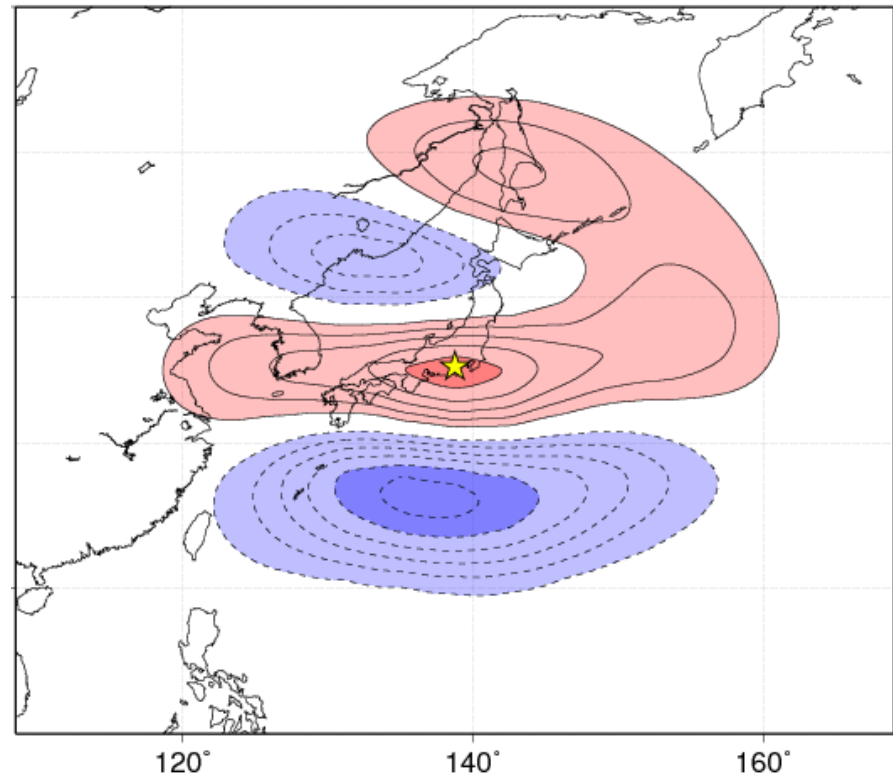
# Larger-scale structure

- Applying a larger scale localization.

Full-resolution analysis increment



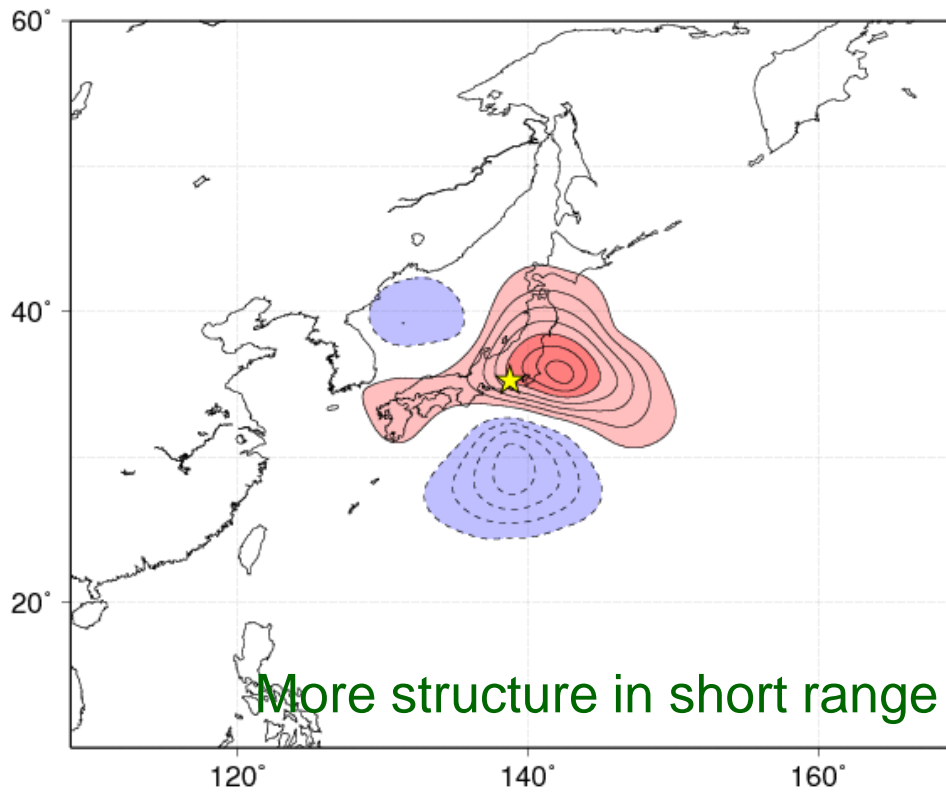
Reduced-resolution analysis increment



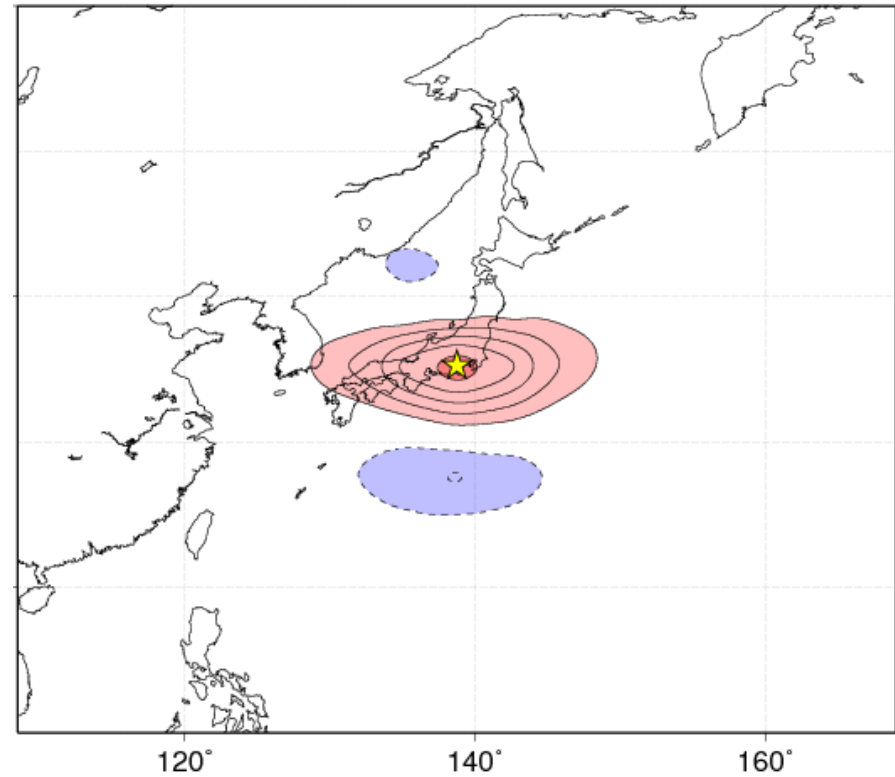
# Smaller-scale structure

- Applying a smaller scale localization.

Full-resolution analysis increment

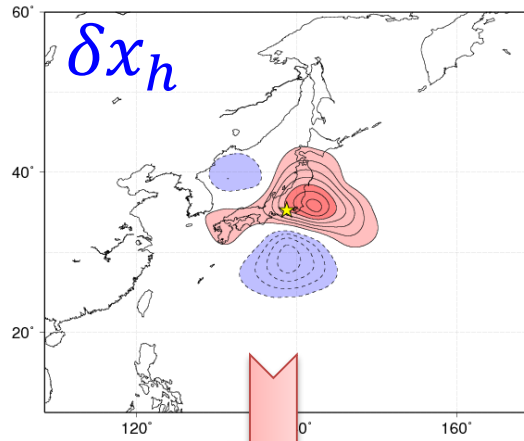


Reduced-resolution analysis increment

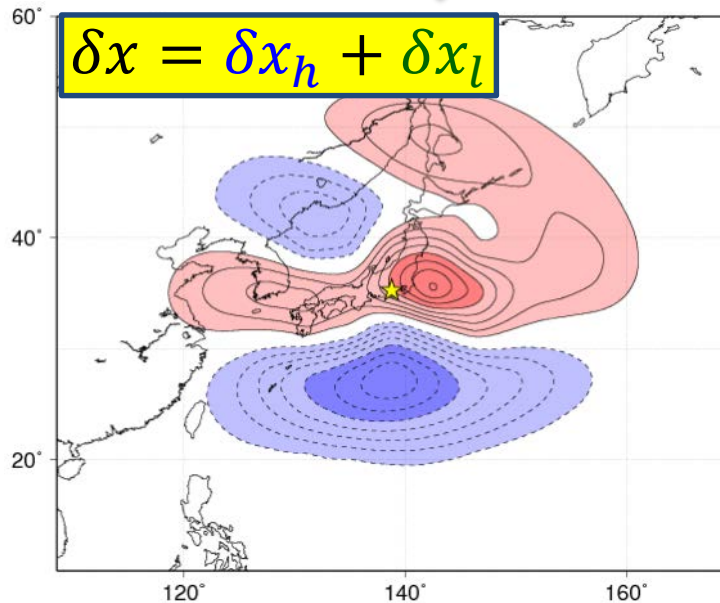
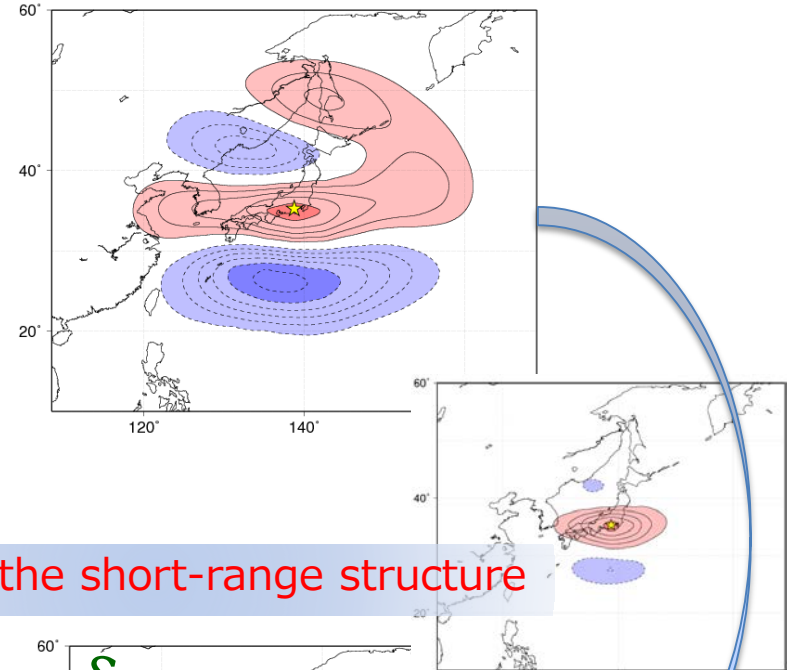


# Merging the two scales

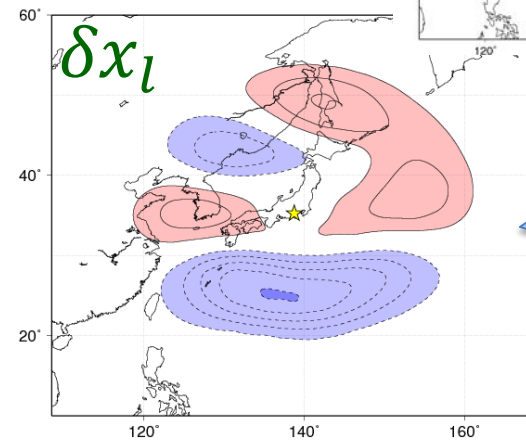
Full-resolution and short-range analysis increment



Reduced-resolution and long-range analysis increment

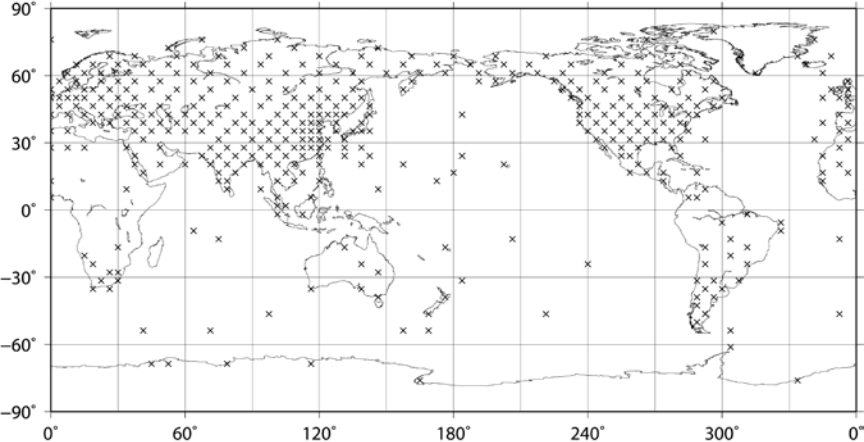


Removing the short-range structure





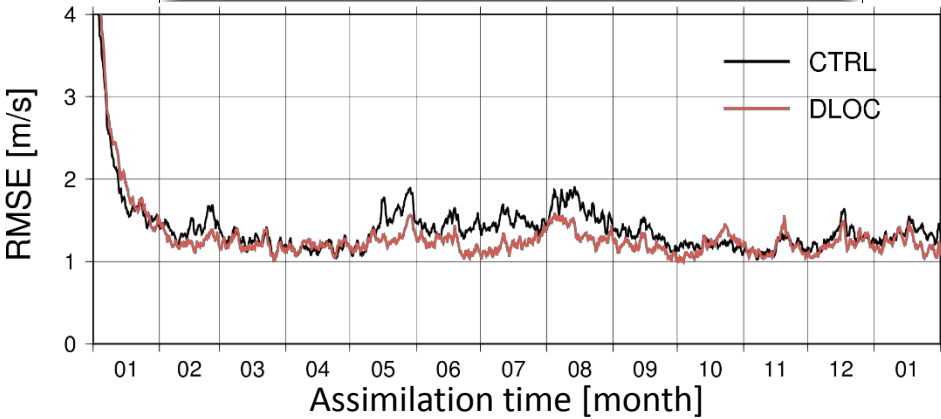
# Settings of perfect model experiments

	<b>CTRL</b> (single localization)	<b>DLOC</b> (dual localization)
Model	SPEEDY, T30L7 (Molteni 2003)	
Observation network	Radiosonde-like  Observation elements: U, V, T, Q, Ps	
Ensemble size	20	
Localization scale	<b>700 km</b>	<b>600 km</b> <b>900 km</b>

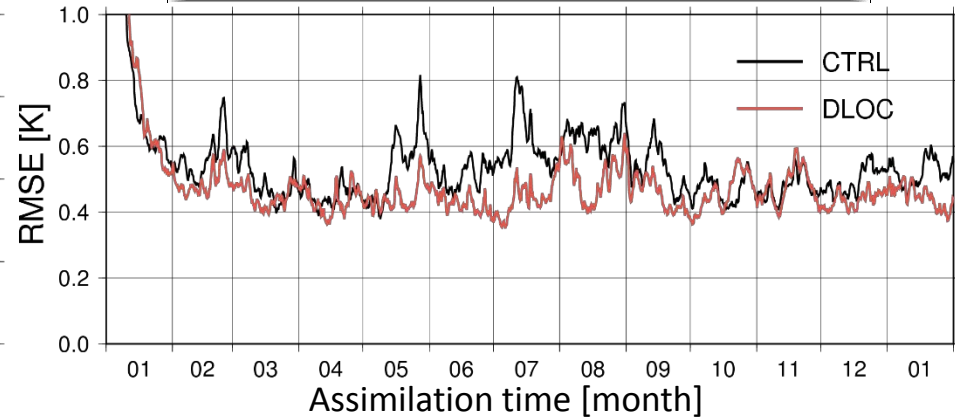
- Experiment period : 01/01/1982 – 02/01/1982
- DLOC: Dual-Localization method with Lanczos filter as a smoothing function.

# CTRL vs. DLOC: Analysis RMSE

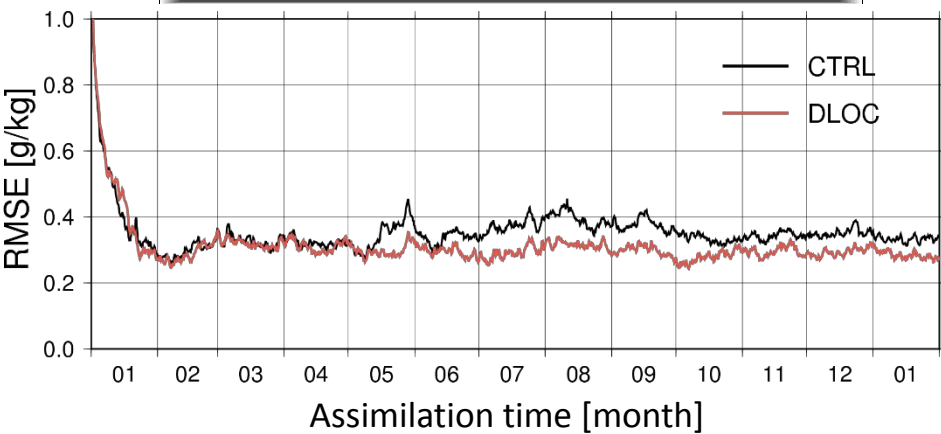
## U (4th model level)



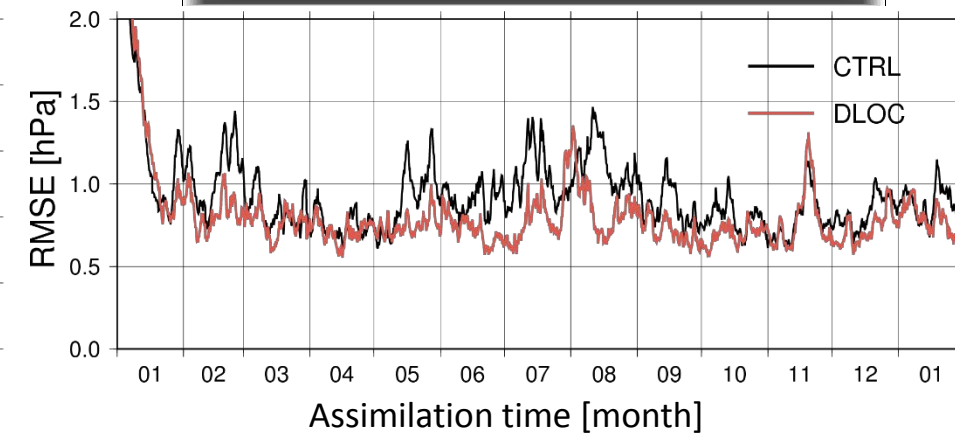
## T (2nd model level)



## Q (1st model level)



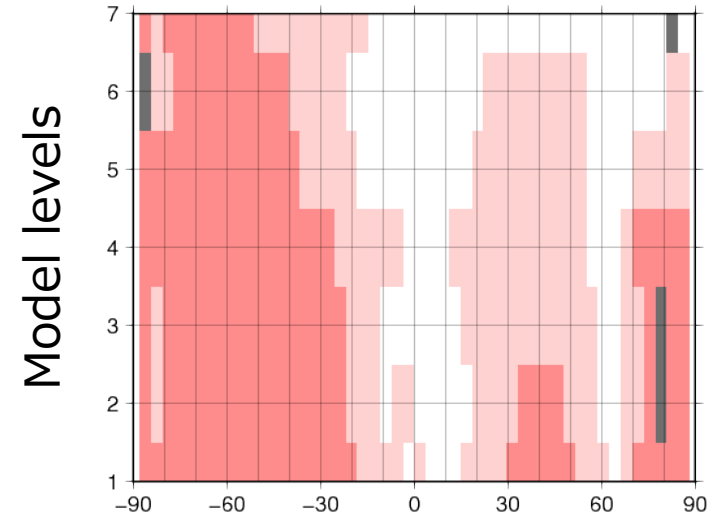
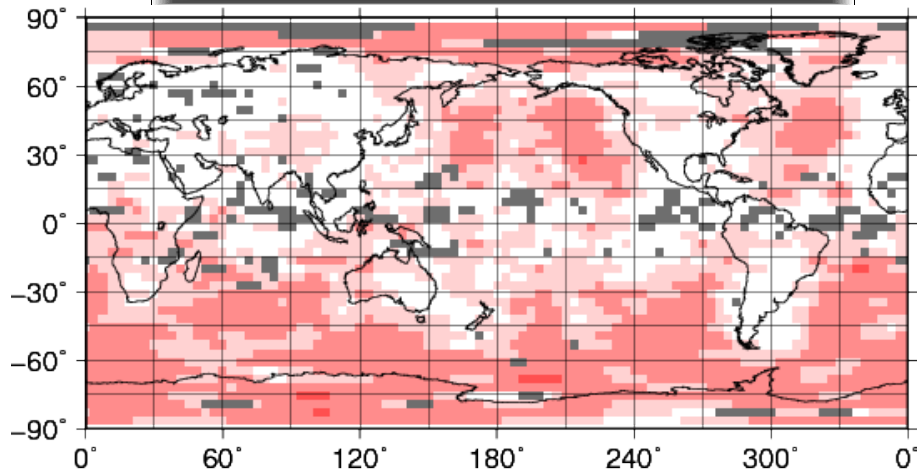
## Ps



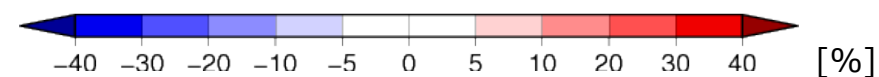
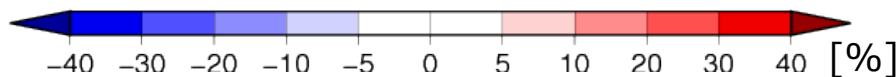
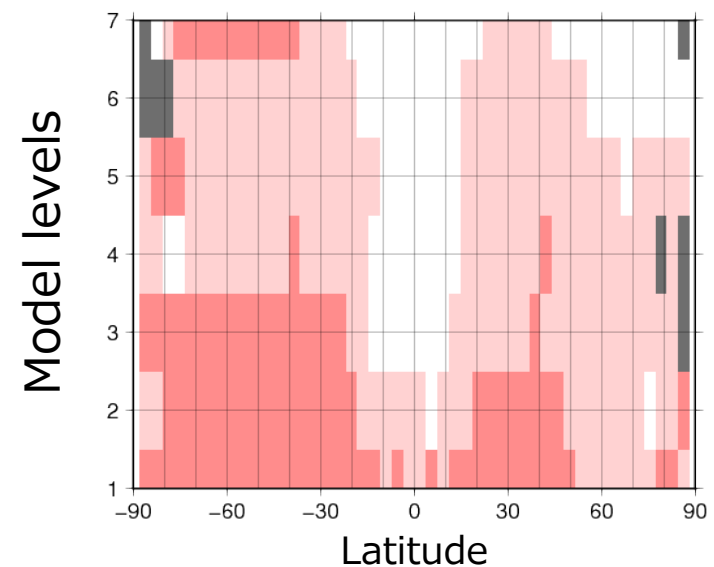
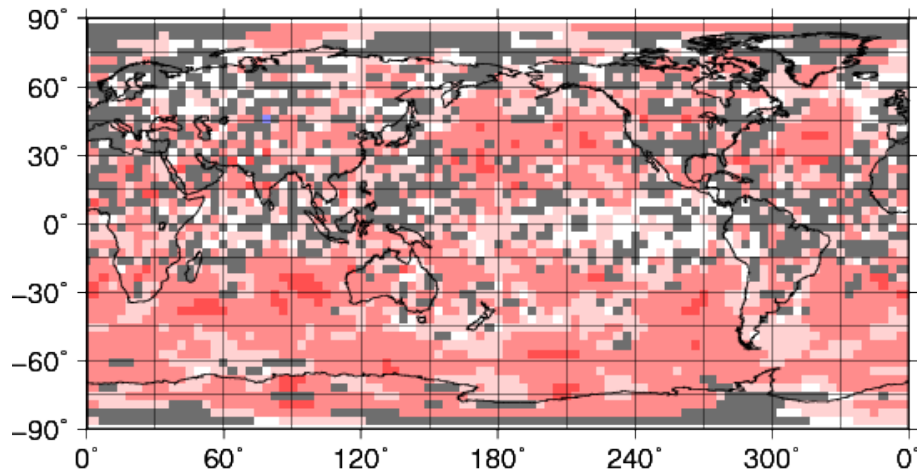
- General improvements everywhere for all variables.
  - Especially, Q !

# Improvements of an annual averaged RMSE

U (4th model level)



T (2nd model level)

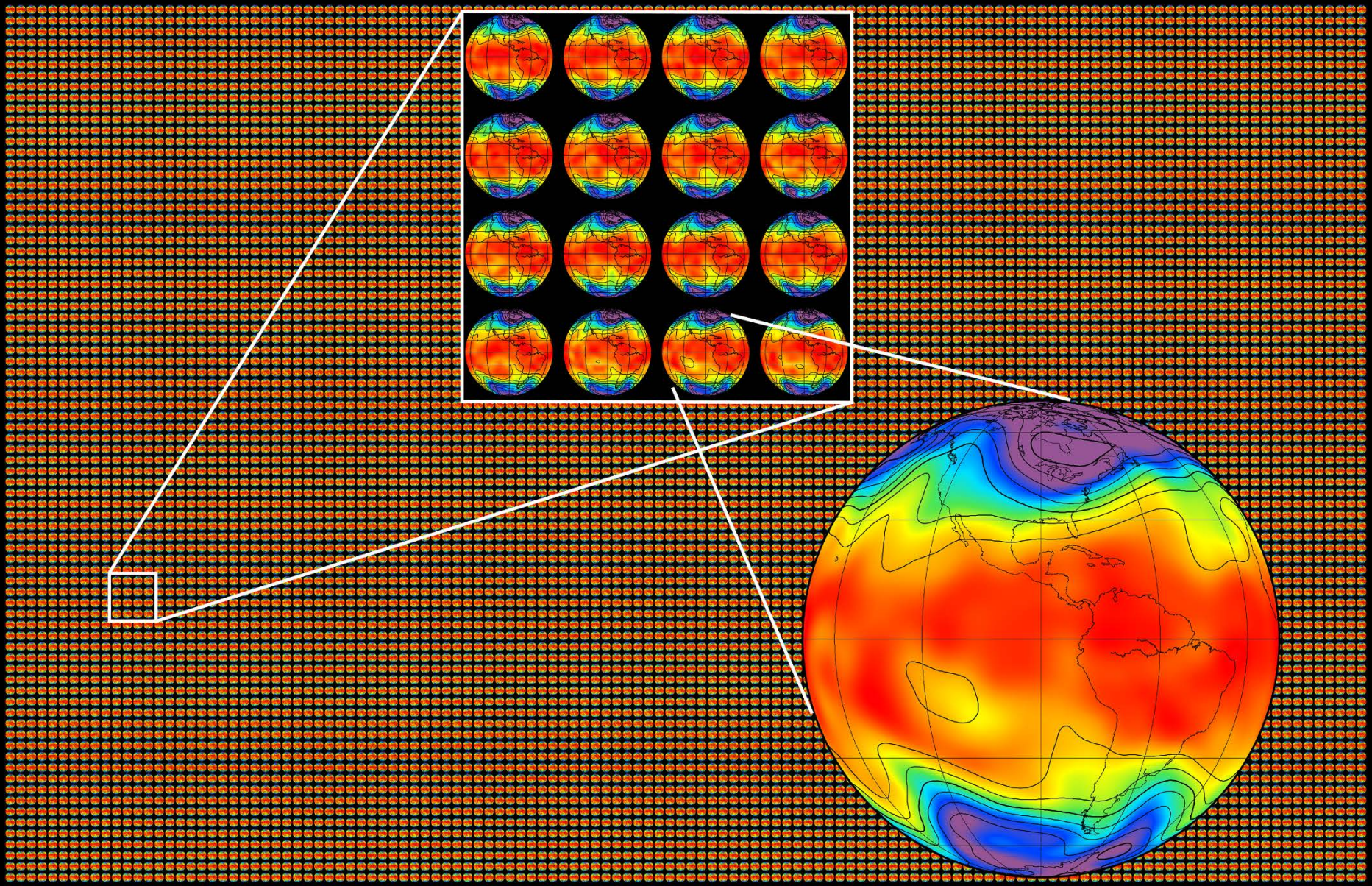


※ Gray : non-significant areas in which any one of the four parallel experiments disagrees.

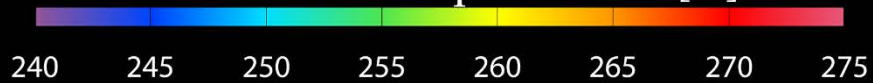
# Summary

- Dual-localization showed promising results.
  - General improvements everywhere for all variables.
  - But computations of the dual-localization are **tripled**.
- Triple-localization did not improve analysis in the SPEEDY model (not shown).

10240 parallel earths

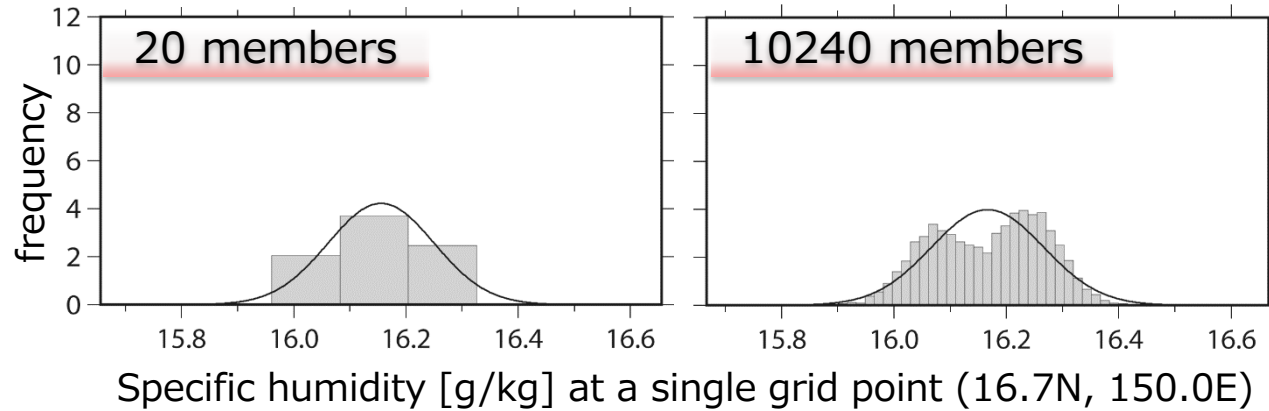


500 hPa Temperature [K]



# Introduction

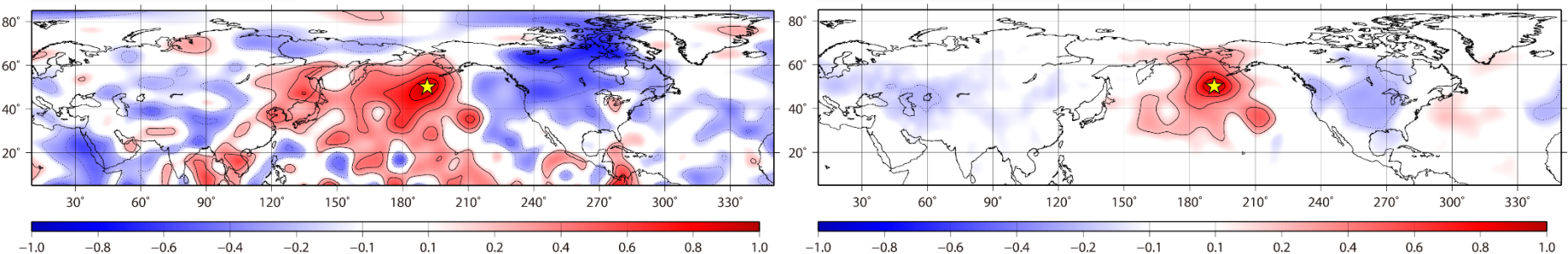
- Miyoshi et al. (2014) successfully implemented 10,240-member LETKF with the SPEEDY model.
  - It is difficult to discuss the PDFs with 20 members.



- Long range correlations

20 members

10240 members



Auto-correlations for Ps from ★ at 00 UTC 17 January.

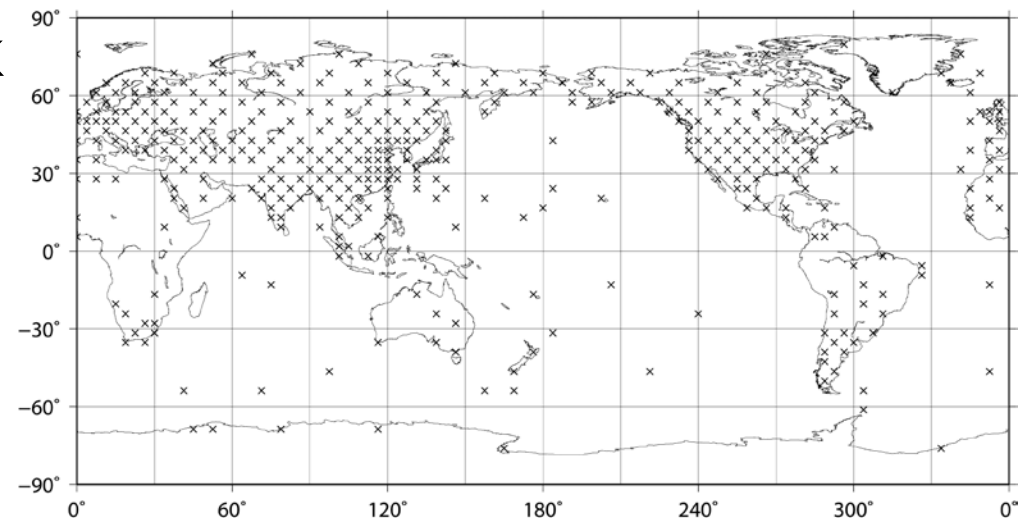
# Motivation

- **Localization is removed** to investigate
  - the impact of far-away observations
  - non-Gaussianity

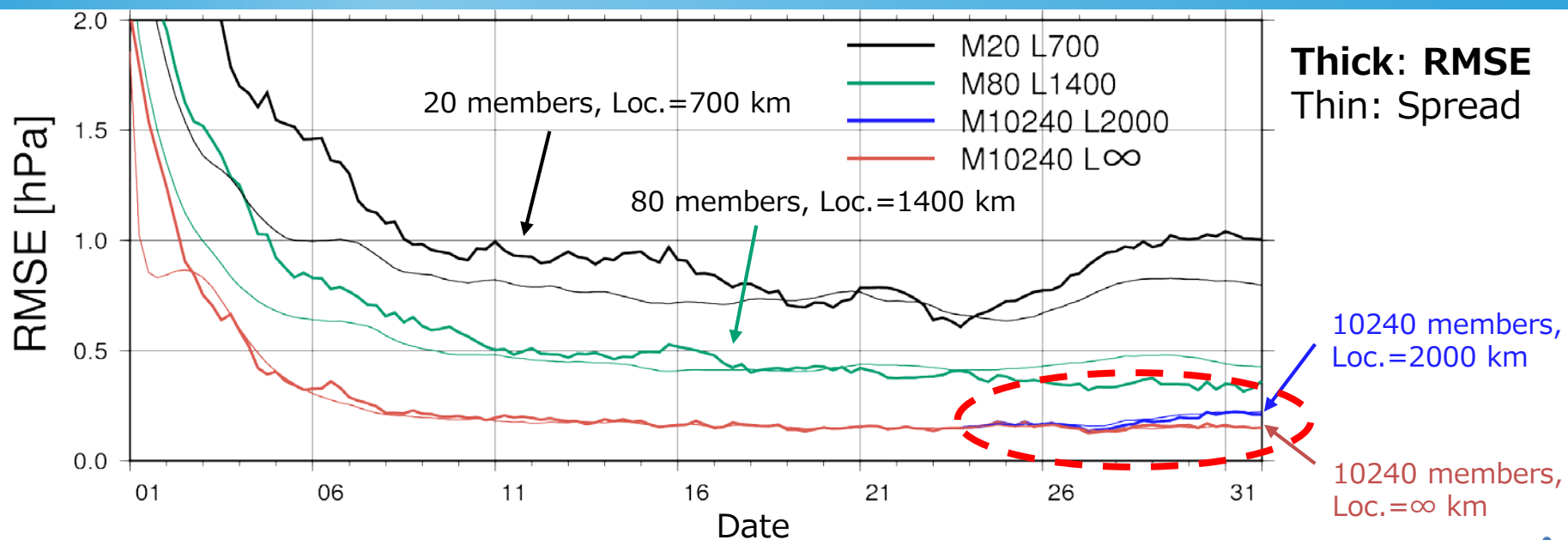
## Experimental settings

<b>Ensemble size</b>	20	80	<b>10240</b>	<b>10240</b>
<b>Localization scale (Radius of Loc.)</b>	700 km (2550 km)	1400 km (5100 km)	2000 km (7300 km)	<b><math>\infty</math></b> km ( <b><math>\infty</math></b> km)

- The experimental period: 1 month
- Observation network



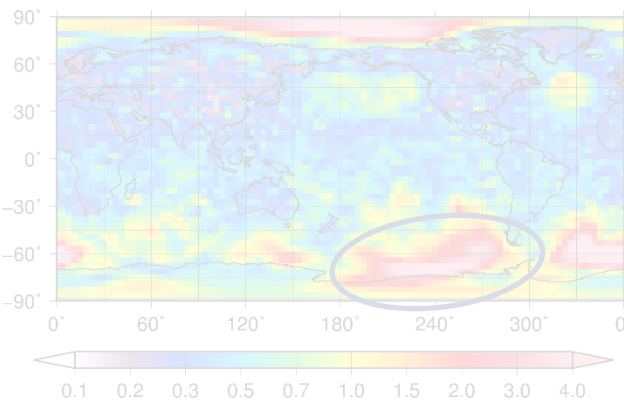
# Analysis RMSE (Ps)



## Spatial distribution of analysis RMSE (01/24/1982 ~ 02/01/1982)

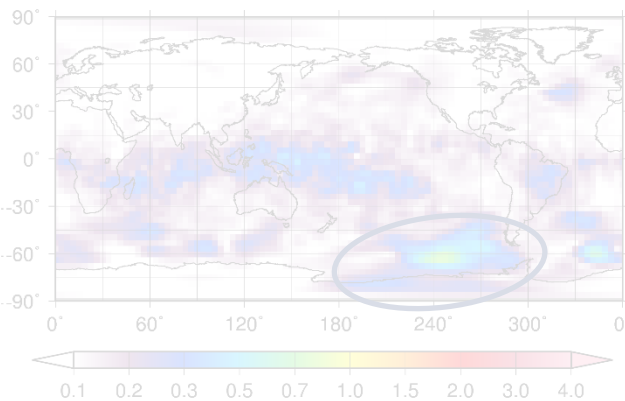
20 members  
(Loc.=700 km)

Analysis RMSE ( Ps [hPa] )



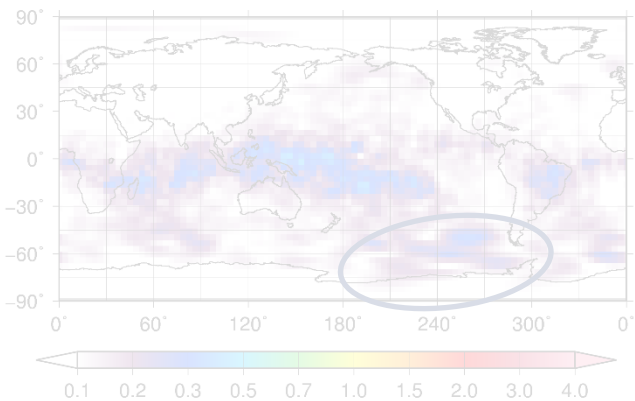
10240 members  
(Loc.=2000 km)

Analysis RMSE ( Ps [hPa] )



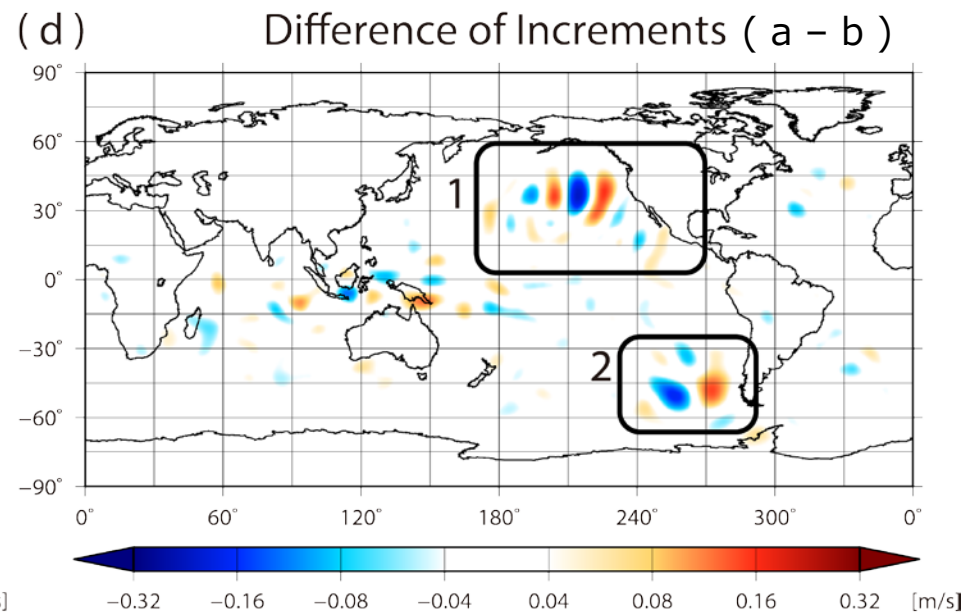
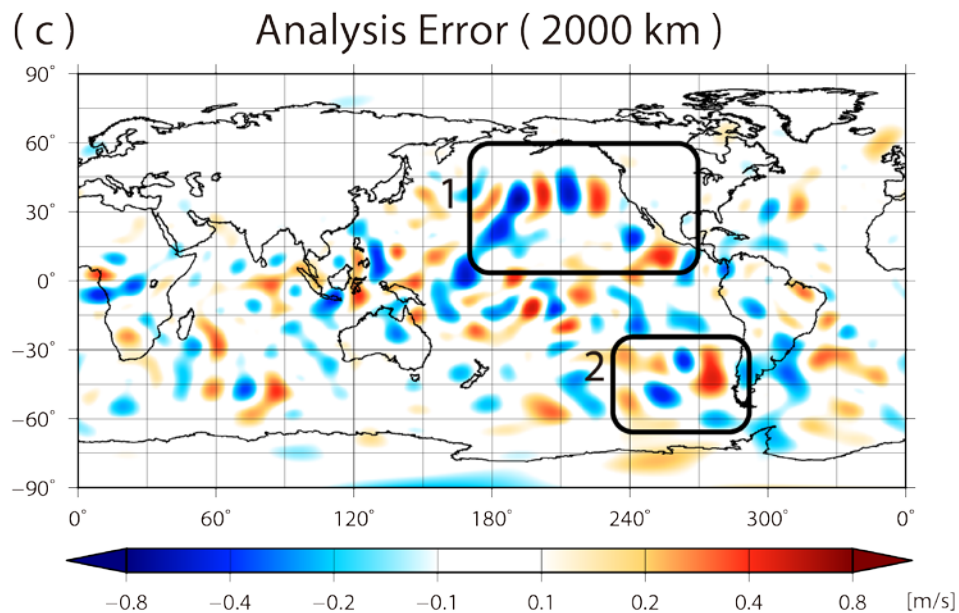
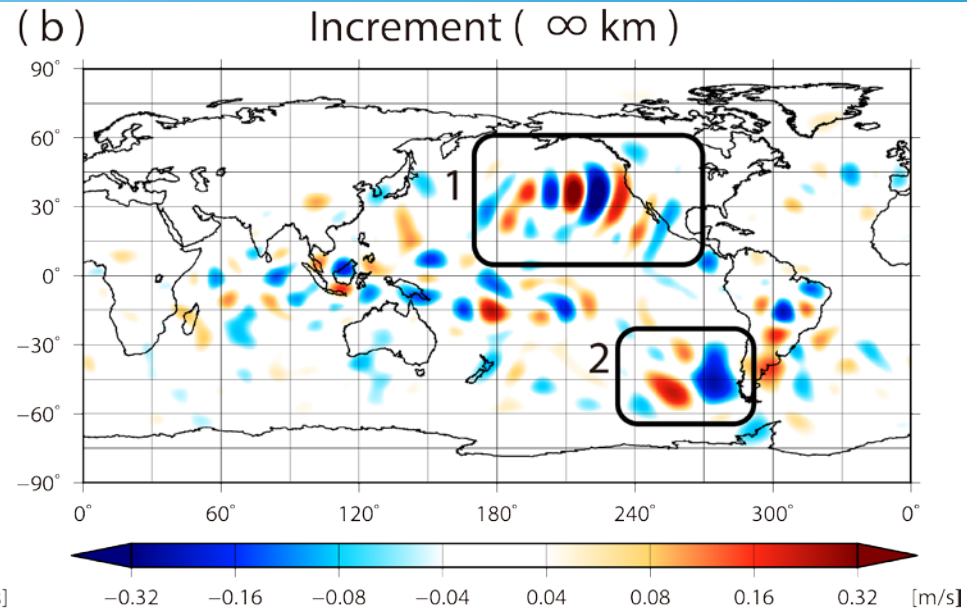
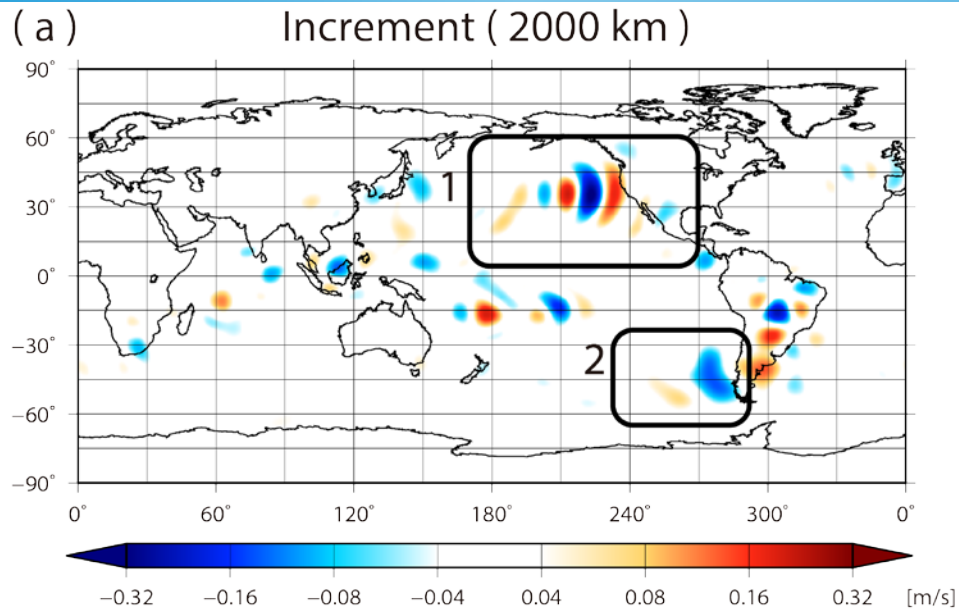
10240 members  
(Loc.= $\infty$  km)

Analysis RMSE ( Ps [hPa] )





# Analysis Increments (v at 1st level at 00 UTC 24 Jan.)

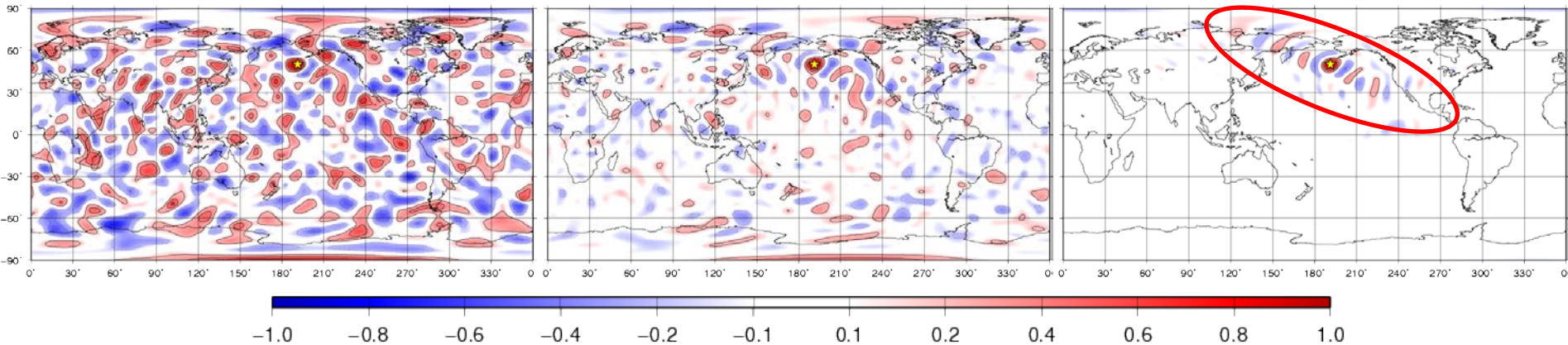


# Auto-correlations, $Q$ (4th level: $\sim 500$ hPa)

20 members

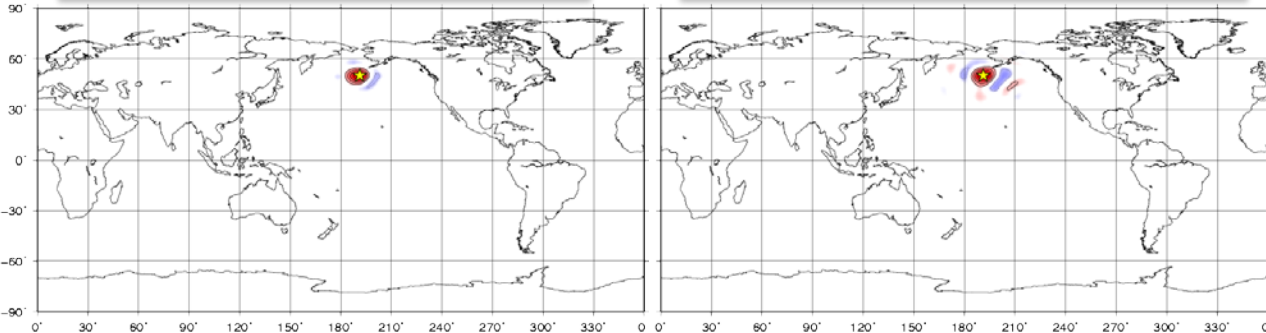
80 members

10240 members



Localization = 700 km

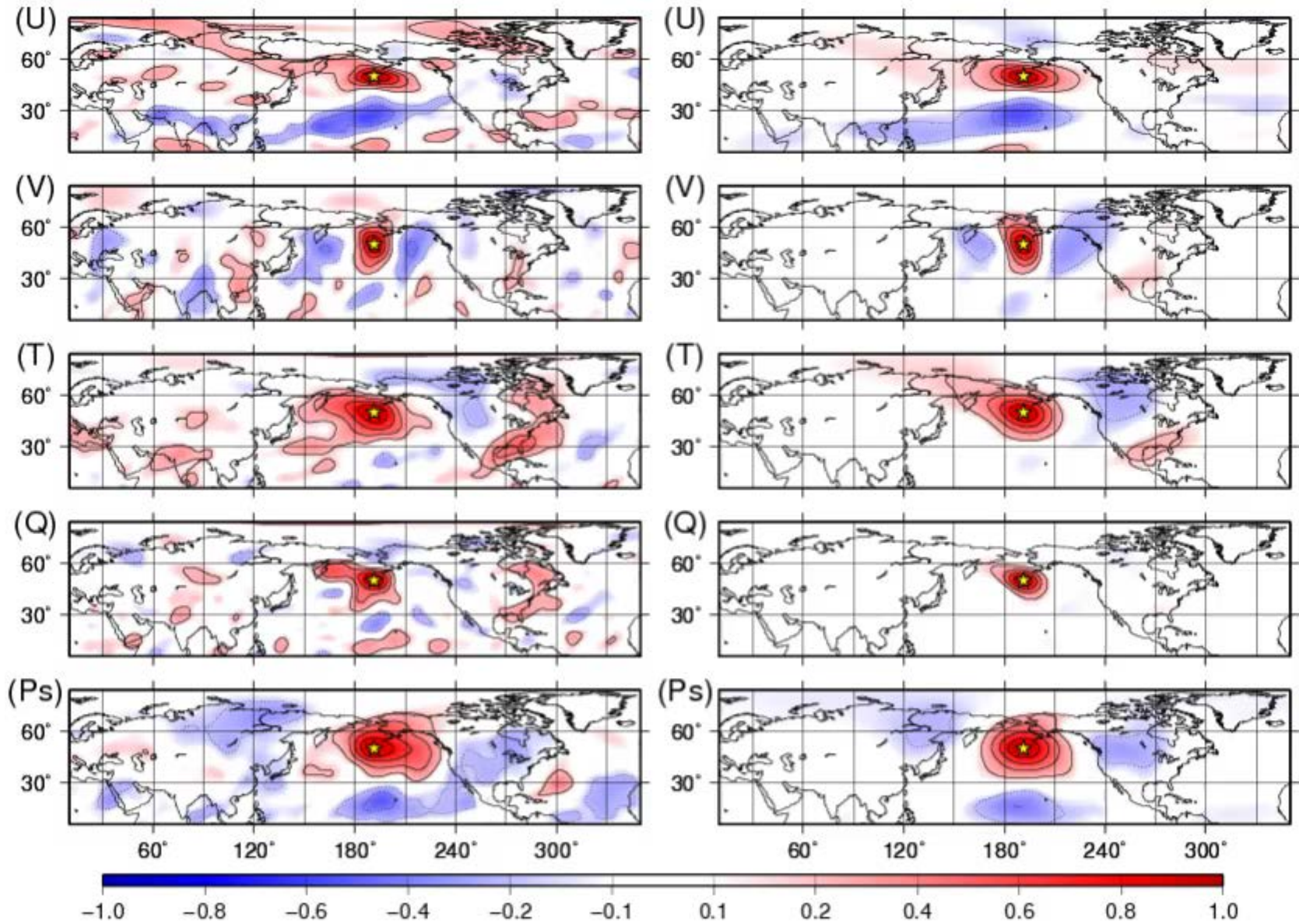
Localization = 1400 km



○ Far-away observations are included with 10,240 members.

➡ Reducing the analysis errors

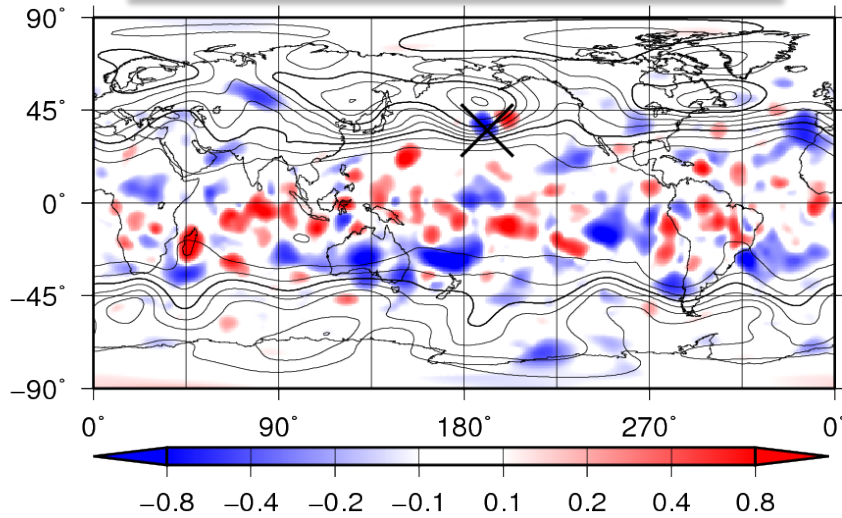
# Auto-correlations (animation)



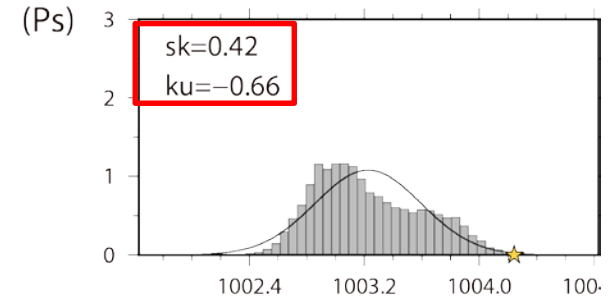
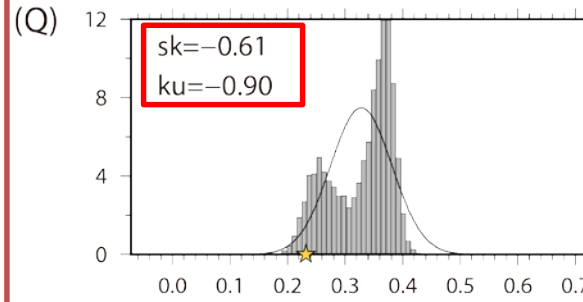
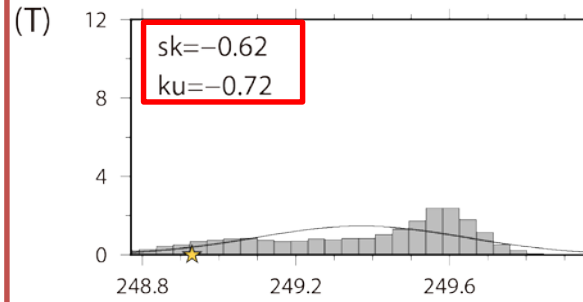
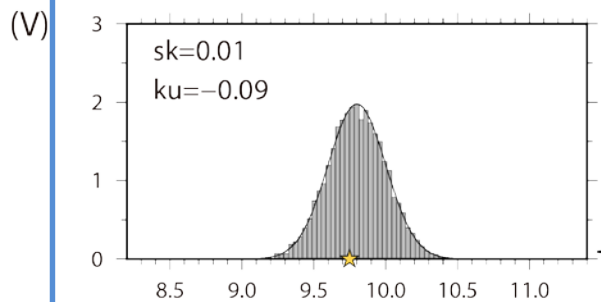
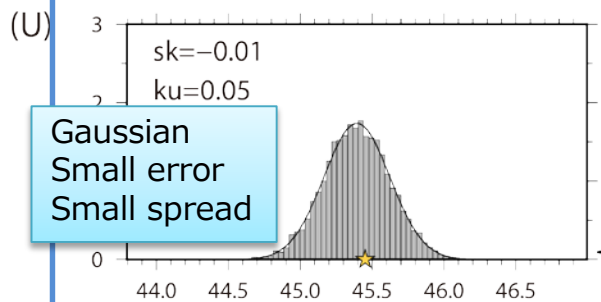
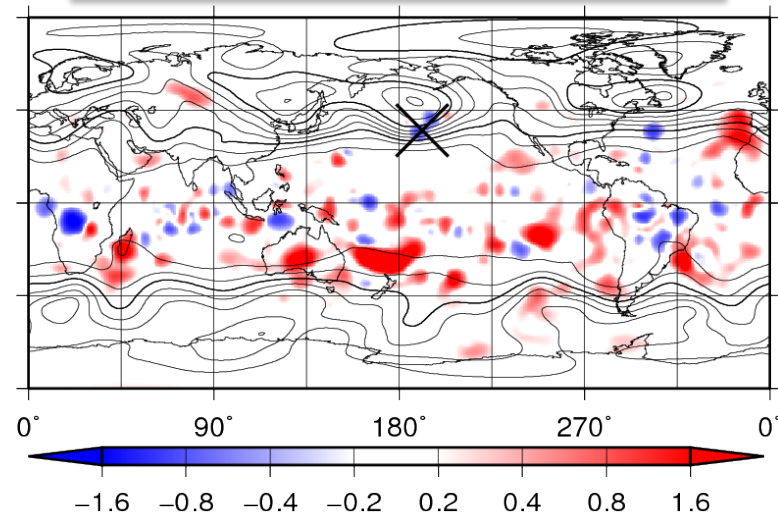
# Non-Gaussianity ①

## ○ T at 4th level (00 UTC, 01/13/1982)

### Skewness



### Kurtosis

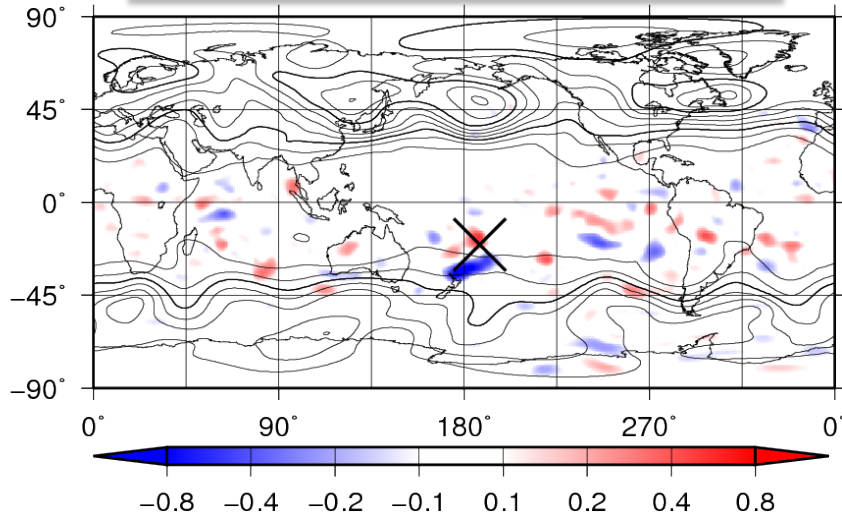


Non-Gaussian  
Large error  
Large spread

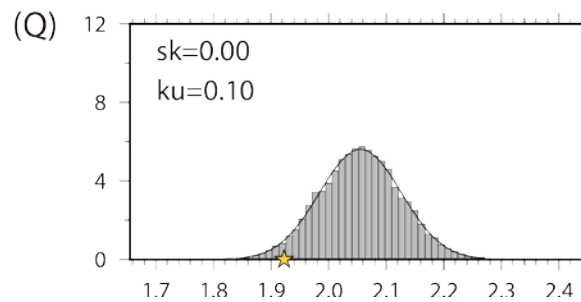
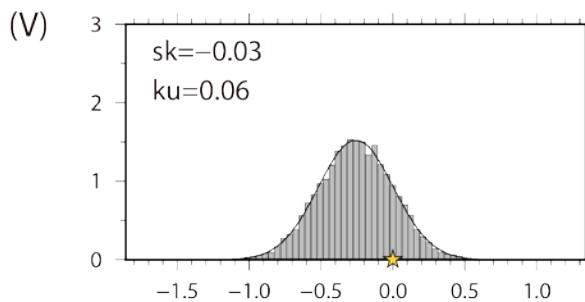
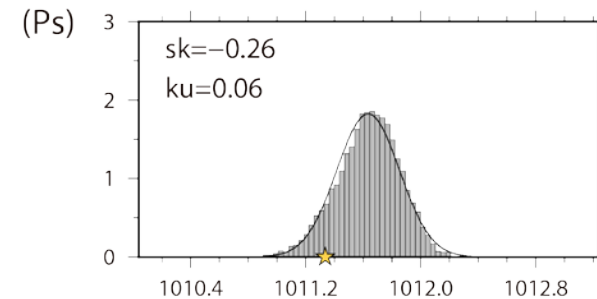
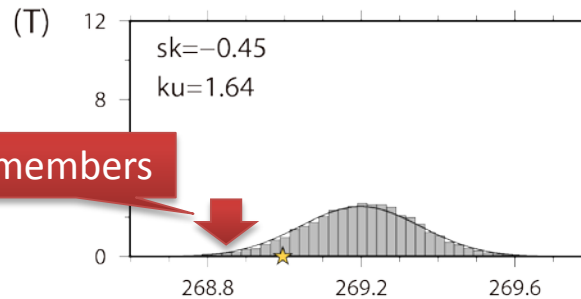
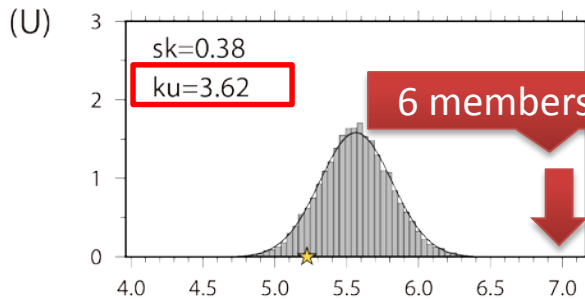
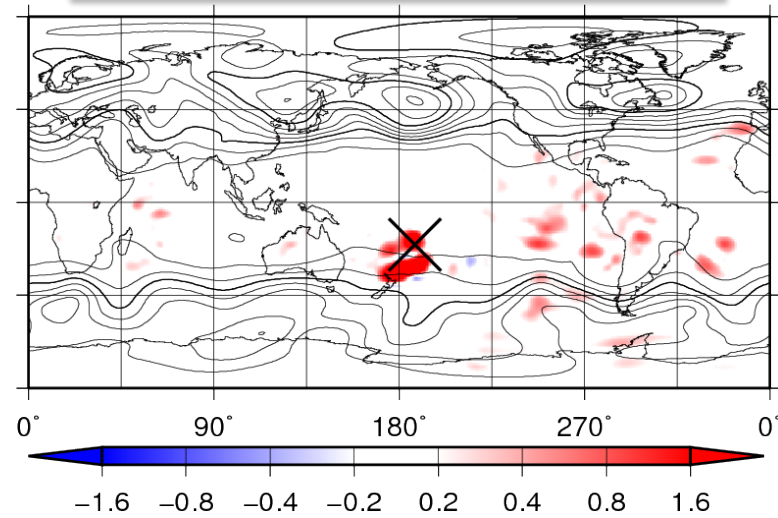
# Non-Gaussianity②

## ○ U at 4th level (00 UTC, 01/13/1982)

### Skewness



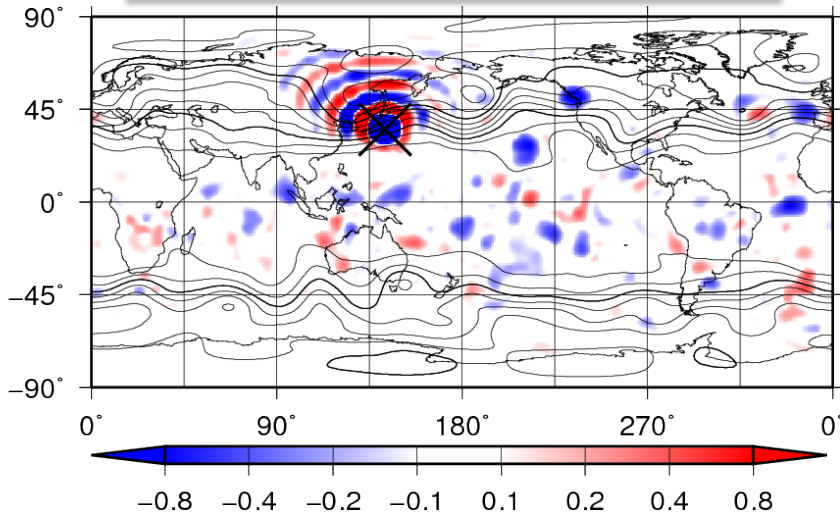
### Kurtosis



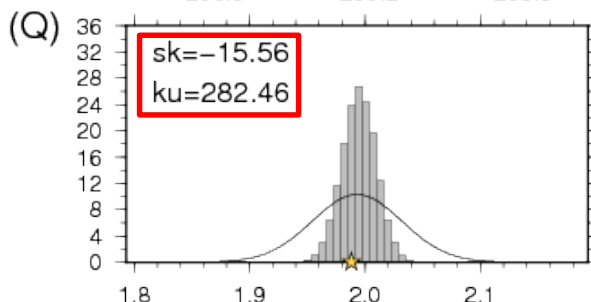
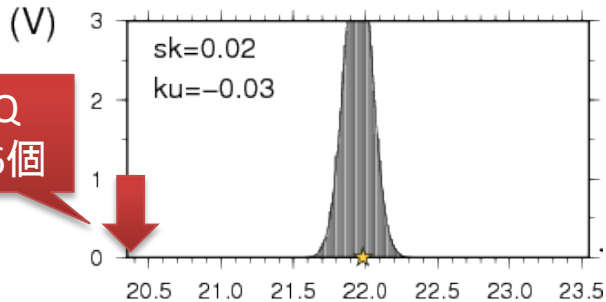
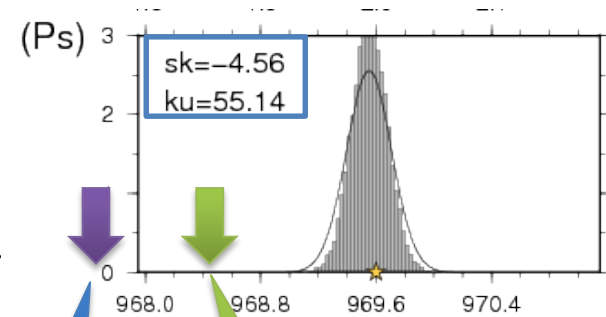
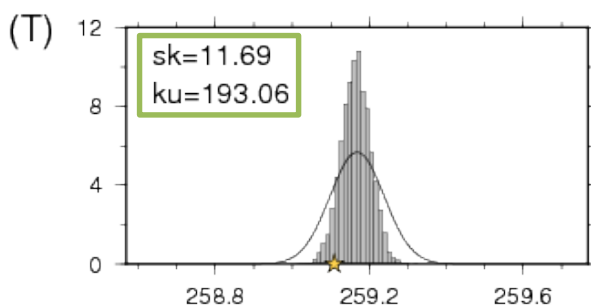
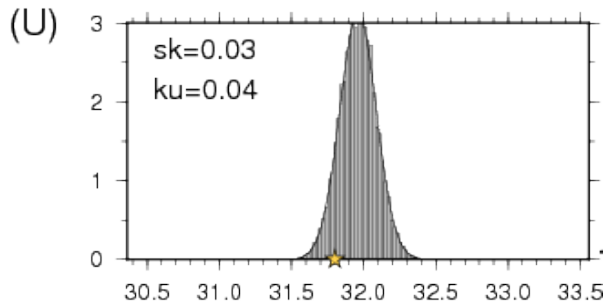
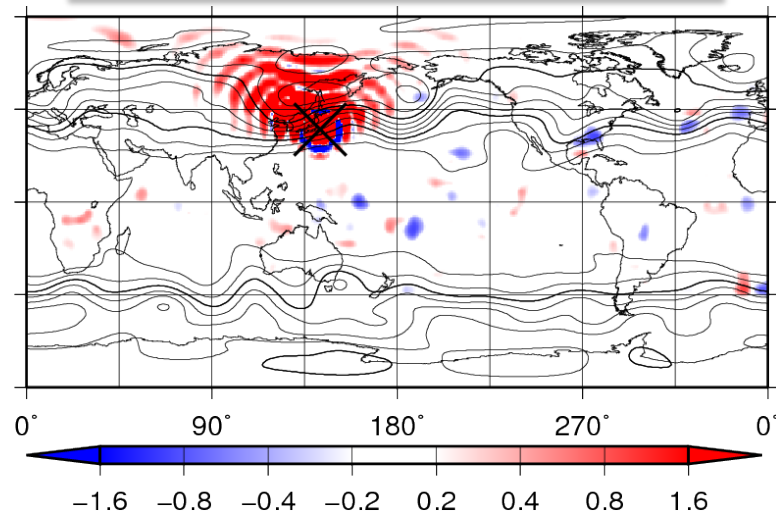
# Non-Gaussianity③

## ○ Q at 4th level (00 UTC, 01/31/1982)

Skewness



Kurtosis

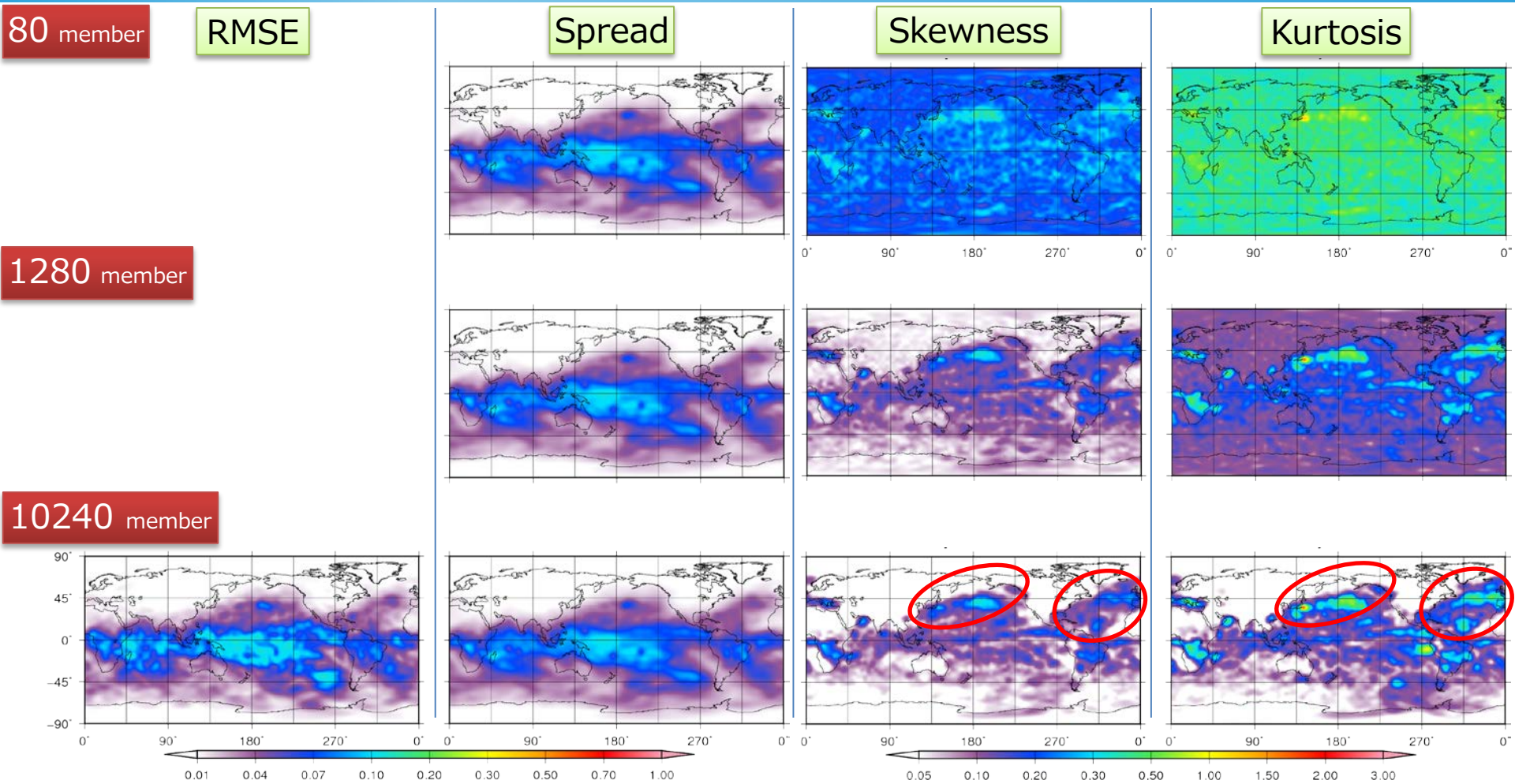


Ps  
26個

T  
26個

Q  
26個

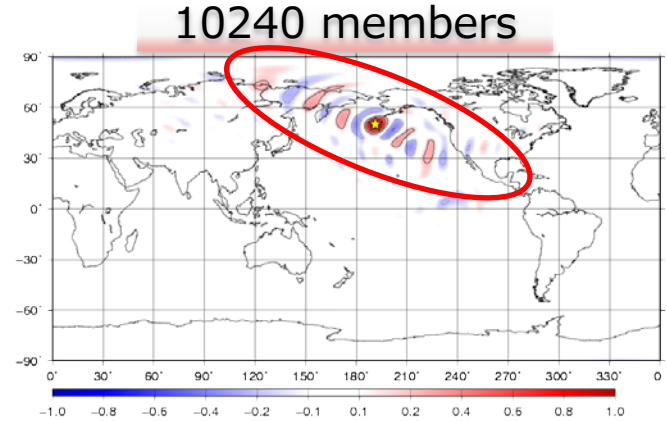
# Skewness & Kurtosis (21 days average, for Q at 2nd level)



- Skewness, Kurtosis are large in the storm track.
- The shape of Skewness and Kurtosis are similar to the RMSE and spread.

# Summary

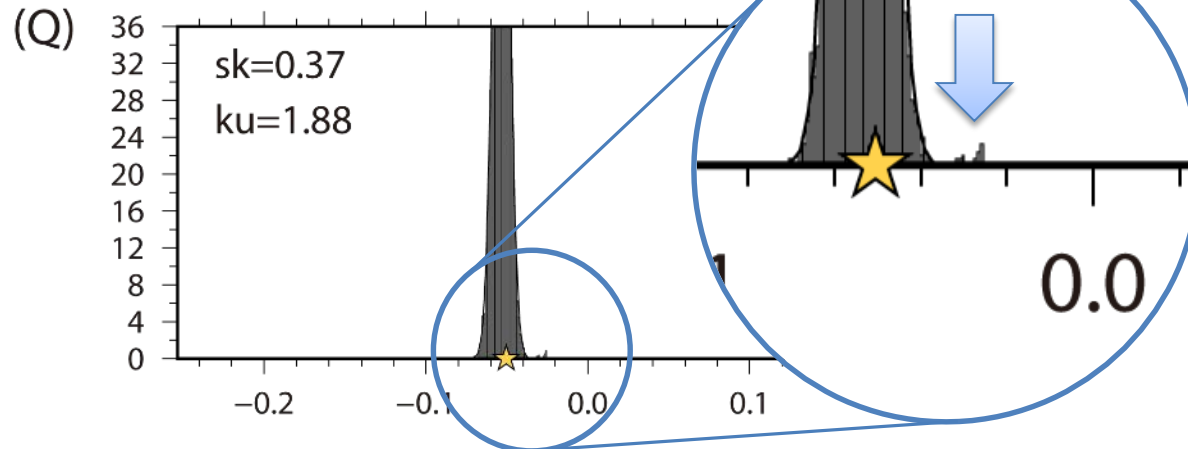
- Analysis is improved by including far-away observations.
  - No localization with a large ensemble



- Non-Gaussianity

- Large in the storm-track and tropical regions.
- Skewness, Kurtosis  $\Leftrightarrow$  RMSE, Spread
- ➡ Non-Gaussian data assimilation helps ?
- Occasionally some members split from the main cluster

(Amezcuca et al. 2012)







Thank you!