

# Data assimilation of atmospheric observations of the Earth using ensemble Kalman filter

Takeshi Enomoto

DPRI, Kyoto University/Earth Simulator Center, JAMSTEC  
eno@dpac.dpri.kyoto-u.ac.jp

T. Miyoshi (University of Maryland)

J. Inoue, M. Hattori (RIGC, JAMSTEC)

A. Kuwano-Yoshida, N. Komori, B. Taguchi (Earth Simulator Center, JAMSTEC)

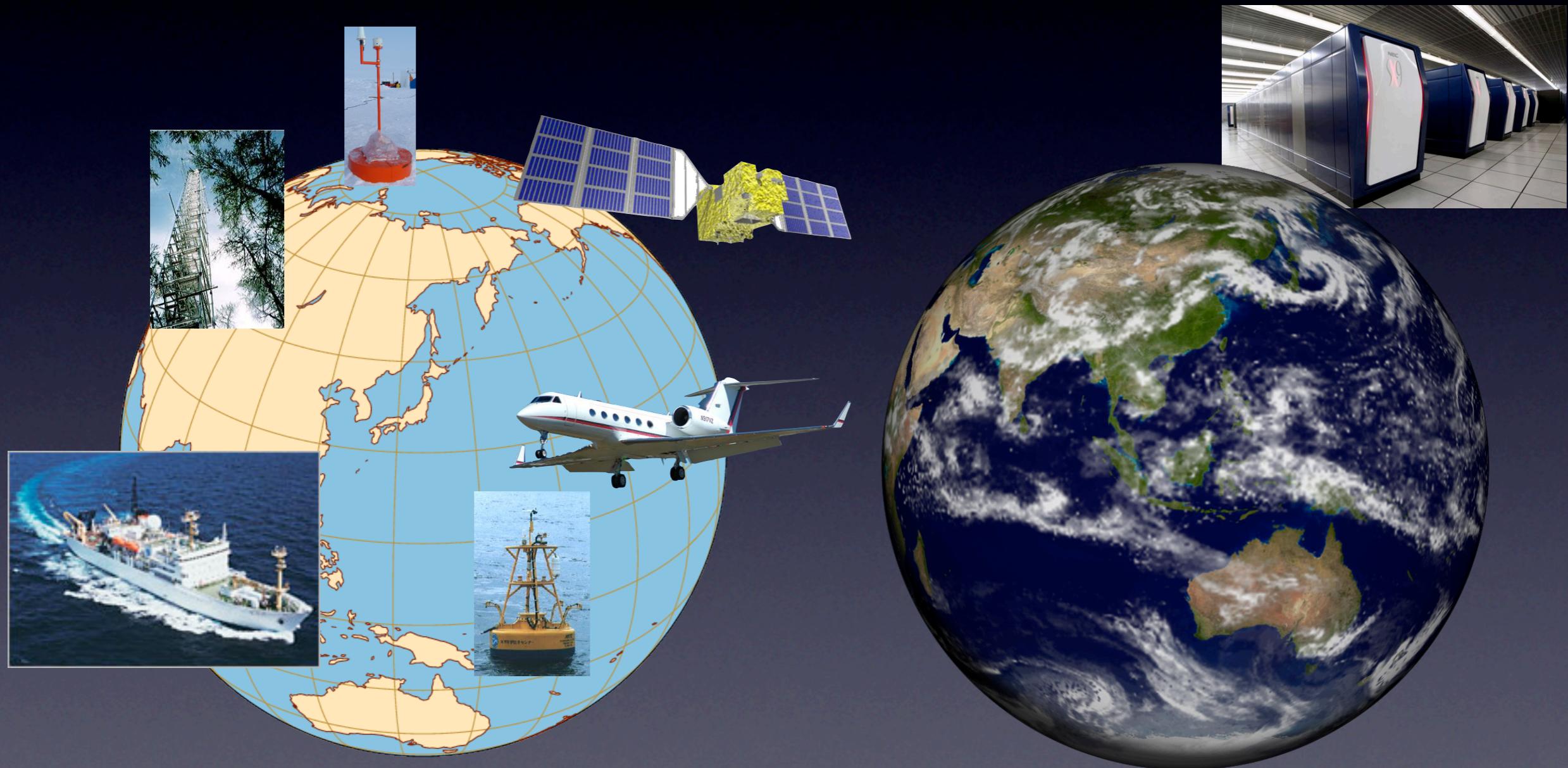
S. Yamane (Doshisha University)

9 April 2012  
CPS seminar

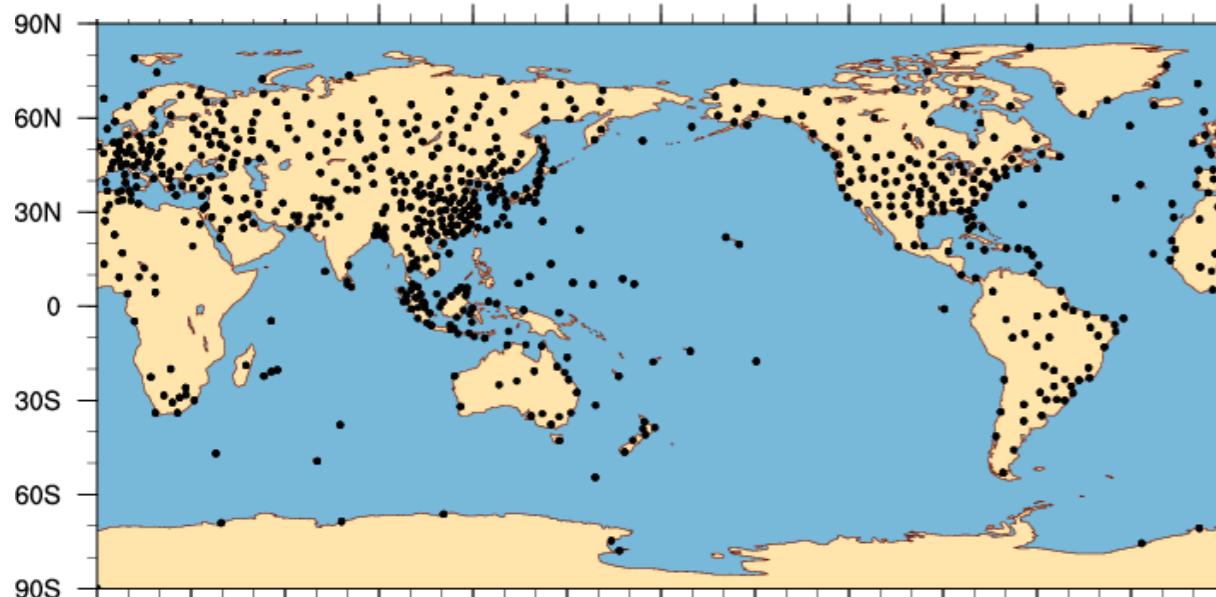
# Plan of the talk

- Data assimilation
- Mechanisms and predictability
- Evaluation of observations

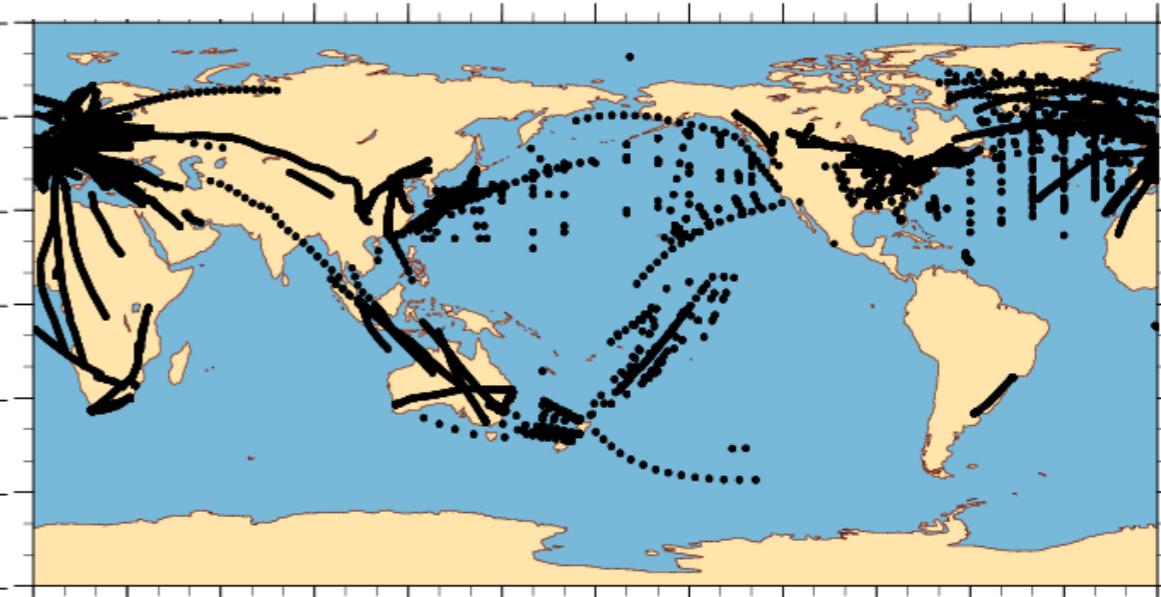
# Observation and forecast



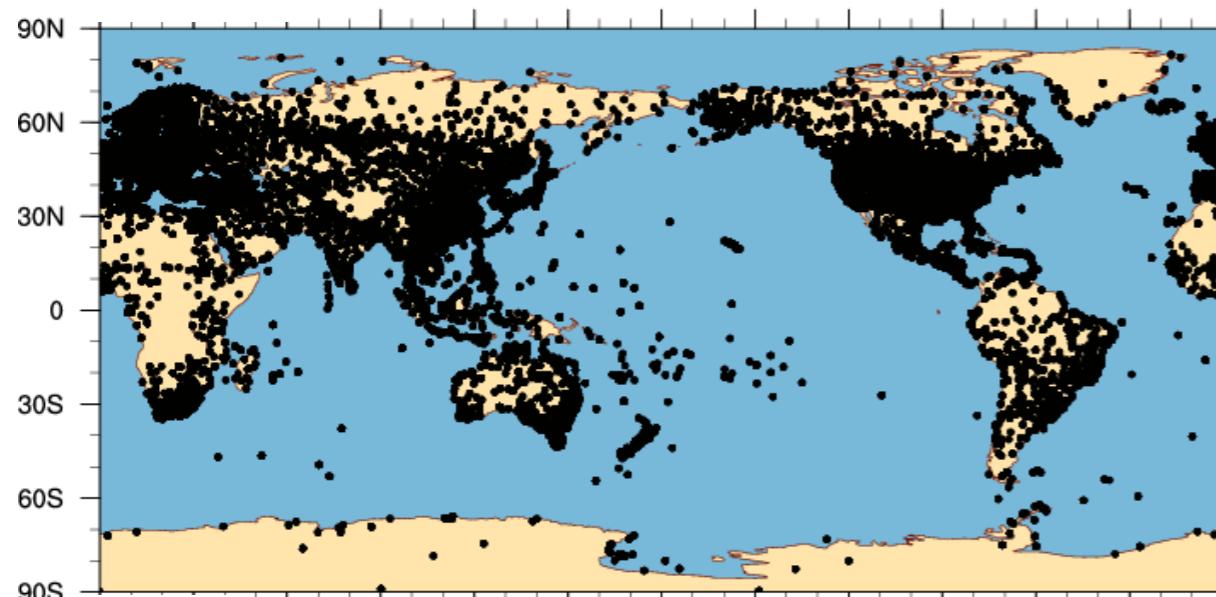
**1287 ADPUPA 2008010112**



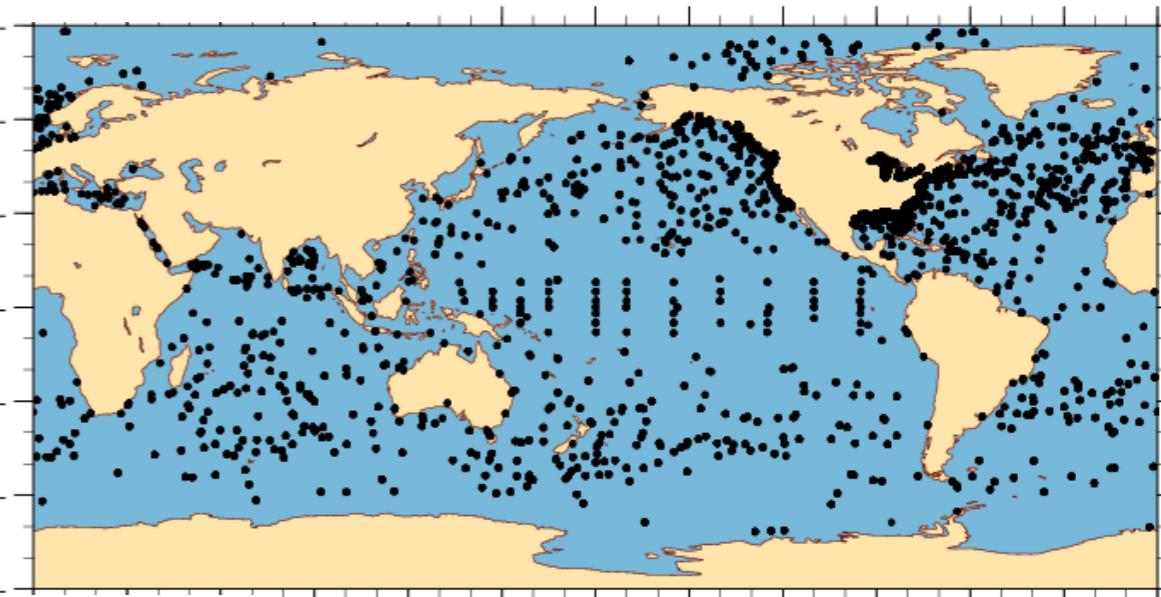
**38036 AIRCFT 2008010112**



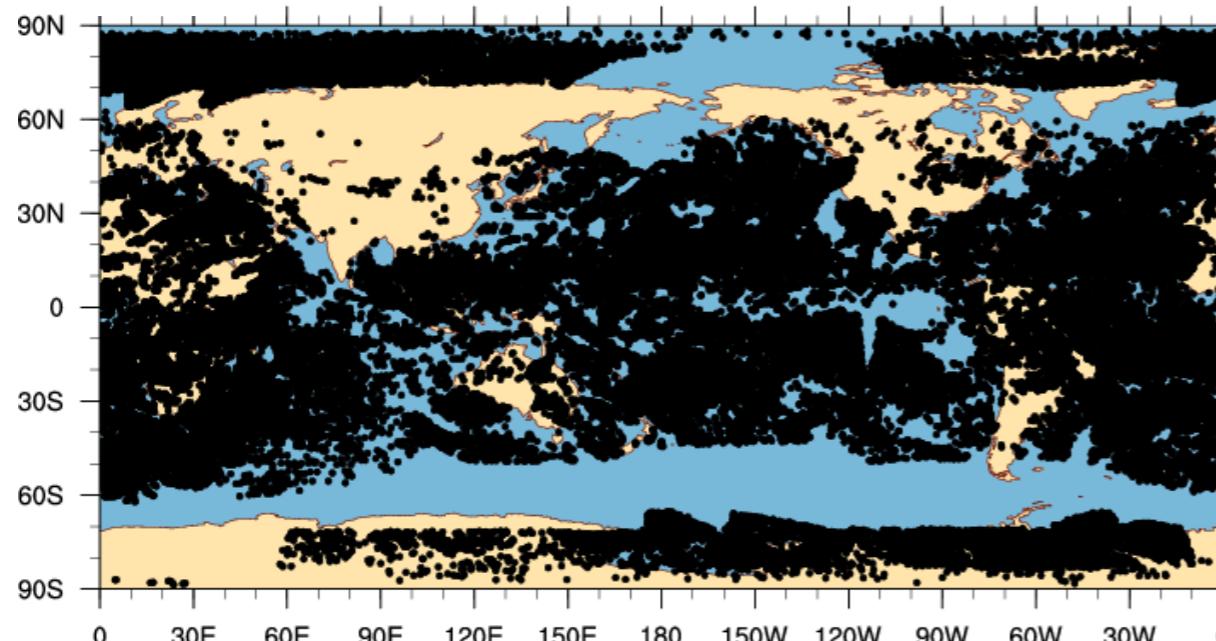
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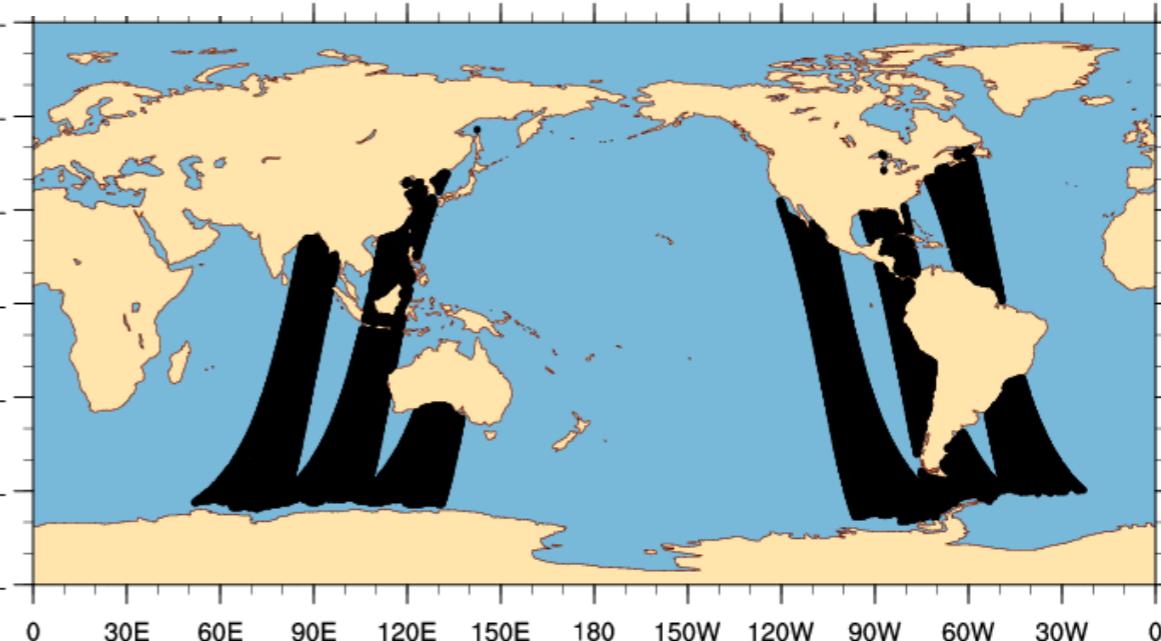
**6 SFCSHP 2008010112**



**86444 SATWND 2008010112**



**25589 QKSWND 2008010112**



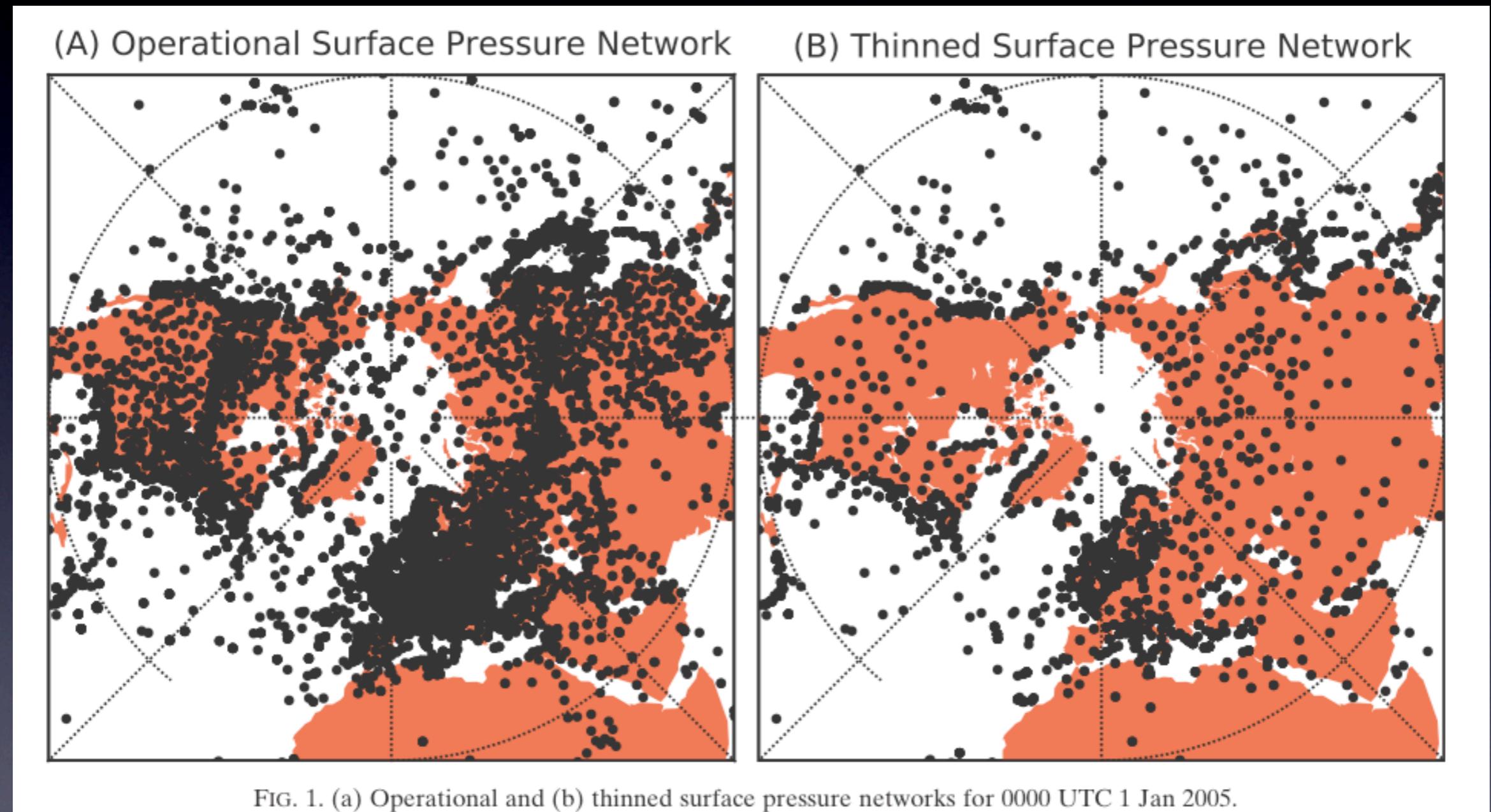
# Observation and Simulation

	observation	simulation
distribution	inhomogeneous	homogeneous
consistency	individual	model
error	small	large

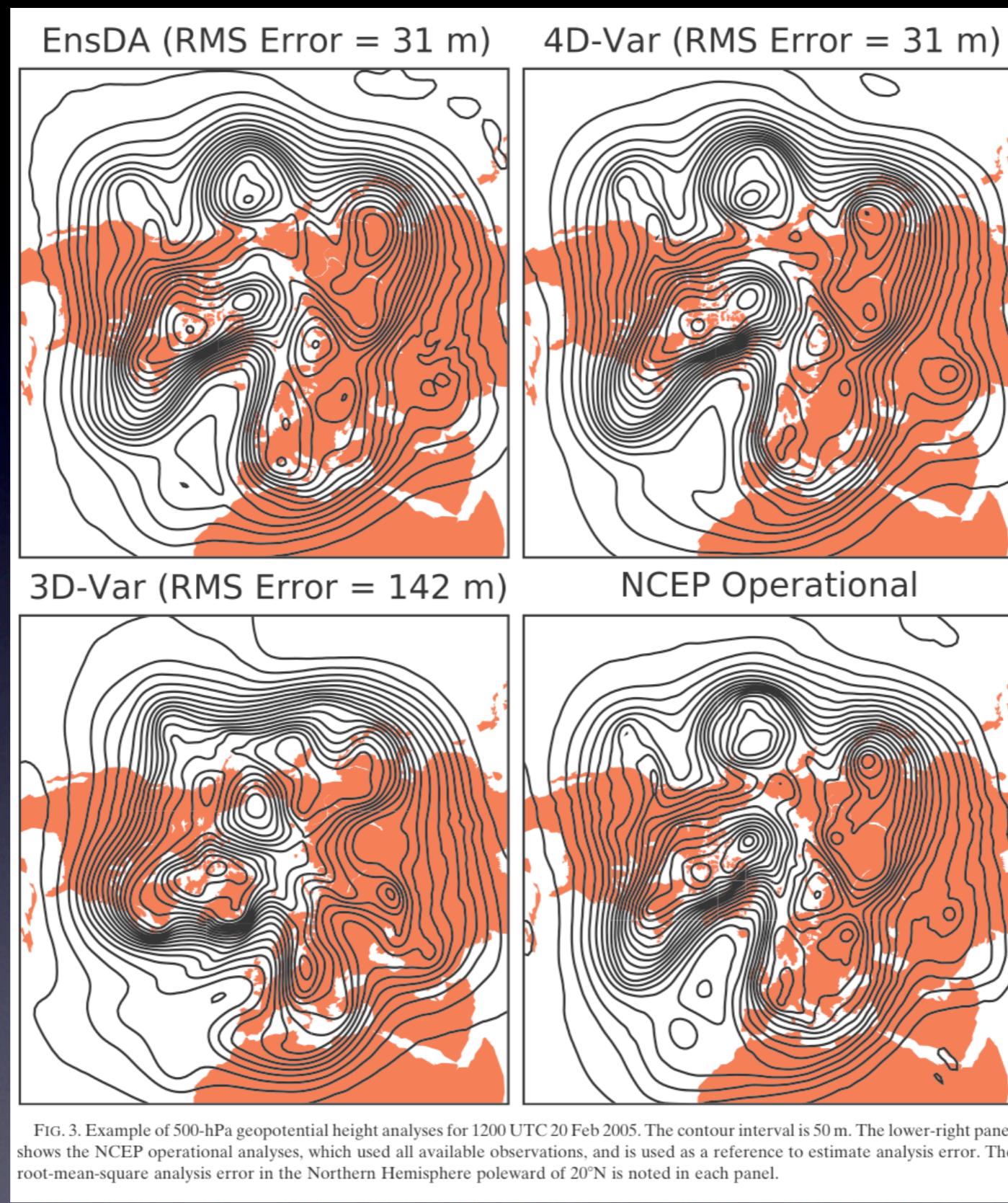
# Data assimilation

- Minimum variance, sequential
  - Optimal interpolation, Ensemble Kalman filter
- Maximum likelihood, iterative
  - 3DVar, 4DVar

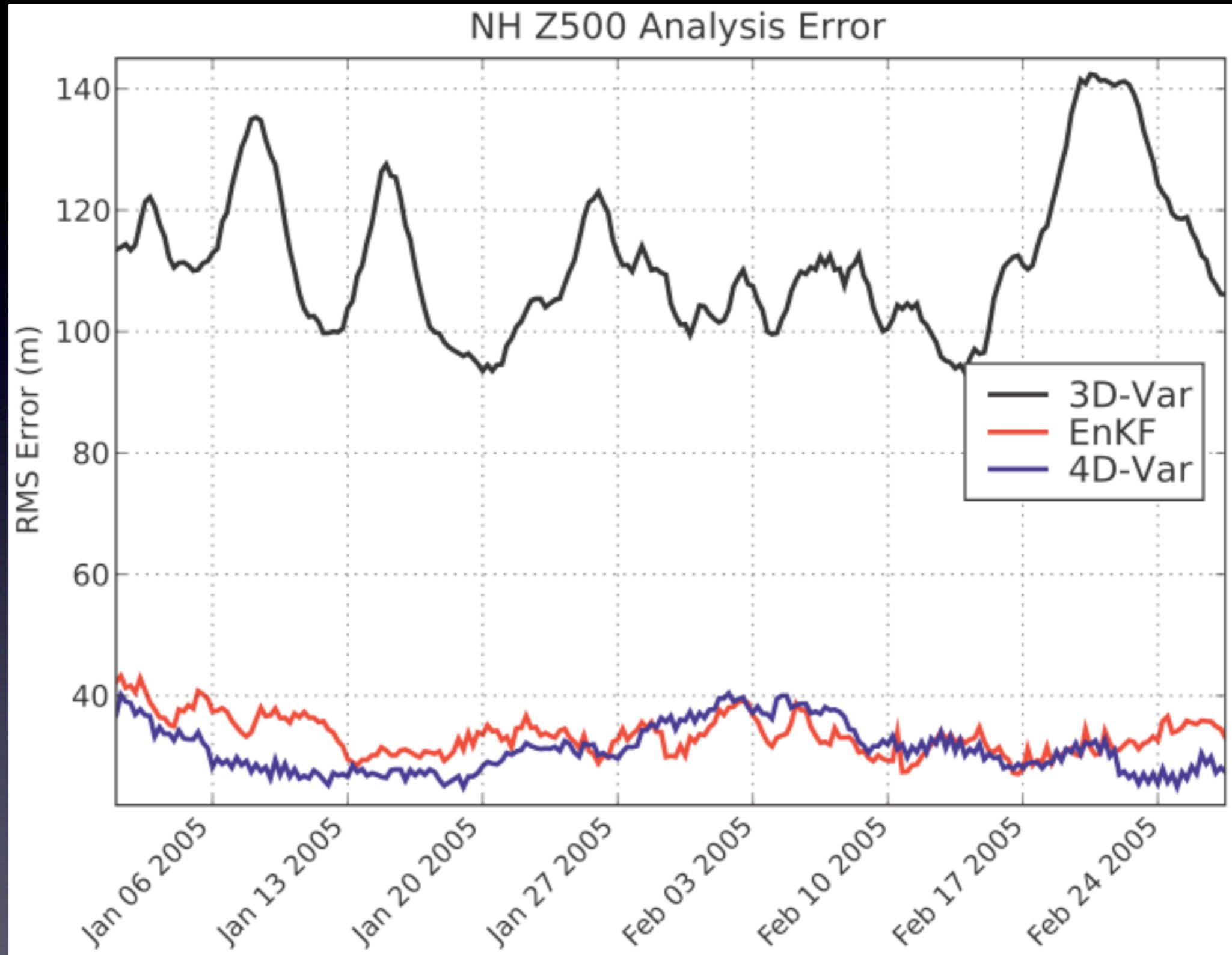
# 3DVar, 4DVar, EnKF compared



Whitaker, Compo, Thépaut (2009)



Whitaker, Compo, Thépaut (2009)

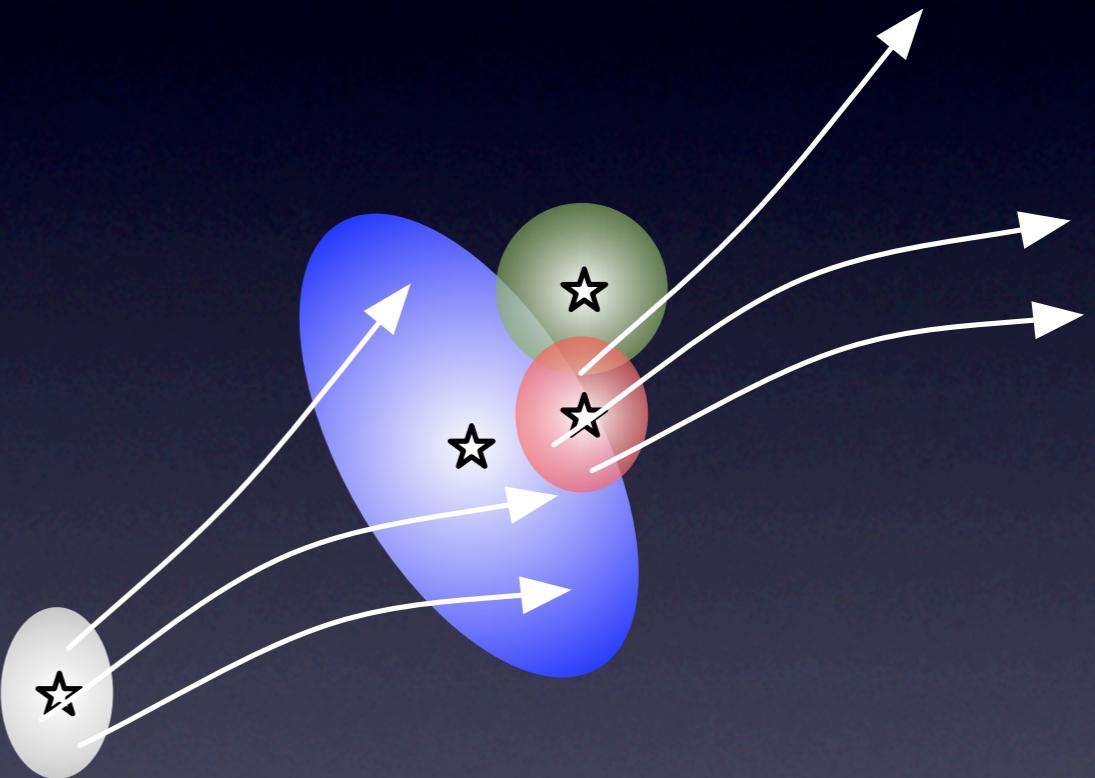


Whitaker, Compo, Thépaut (2009)

# LETKF

## Local Ensemble Transform Kalman Filter

- Weighted average
- Assimilate observations into the mean
- The analysis error covariance is the linear combination of the forecast error covariance
- Local analysis



LETKF: Hunt et al. 2007; Miyoshi and Yamane 2007; Miyoshi et al. 2007

# ALERA

# ALERA

AFES-LETKF experimental reanalysis

- first application of LETKF to full AGCM
- provides analysis ensemble spread as error estimates
- a product of collaboration among JMA, JAMSTEC and CIS

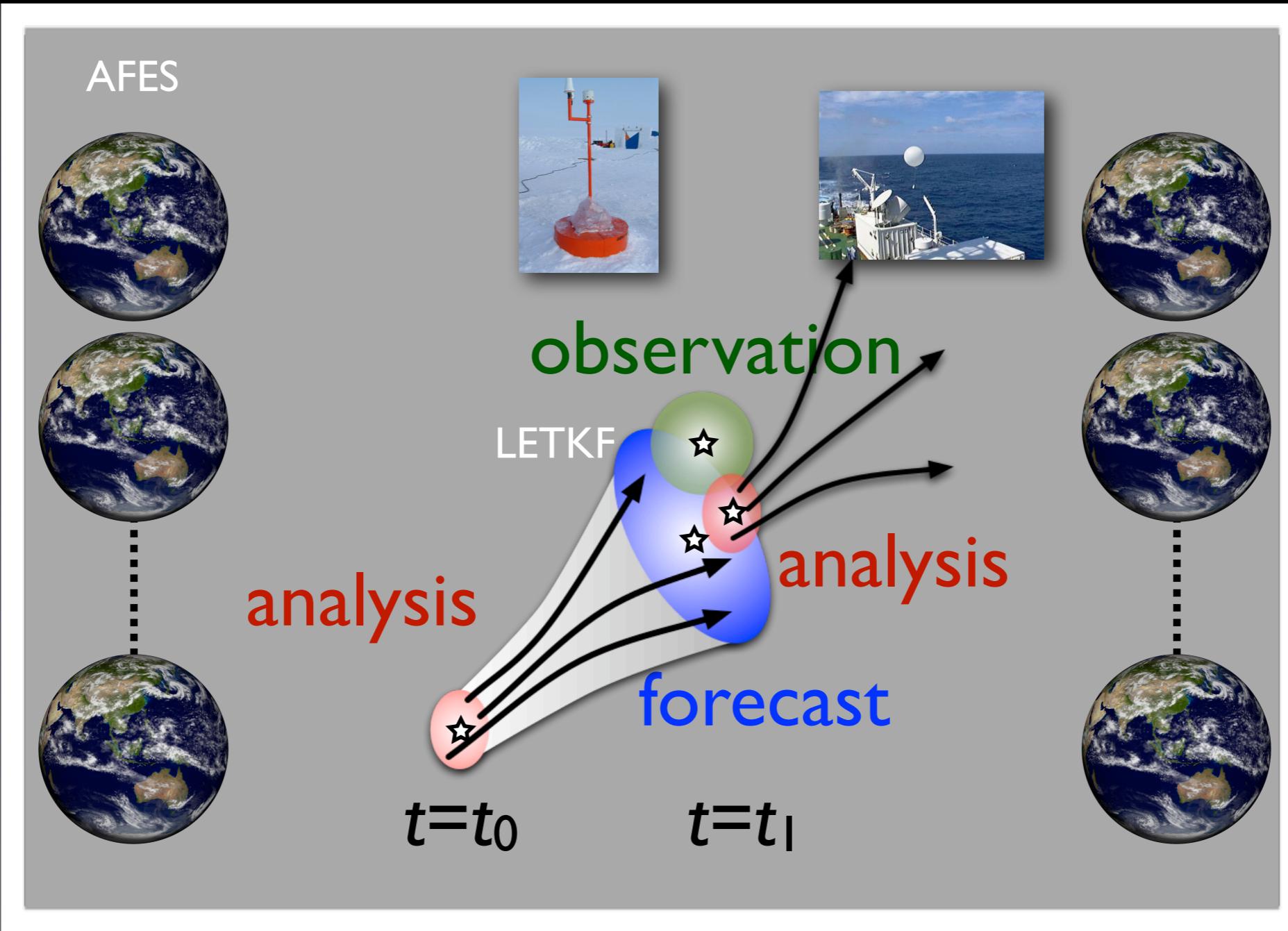


# ALERA: specifications

- Observations used in NWP at JMA
- AFEST159L48M40
- from 18UTC 1 May 2005 to 12UTC 11 Jan 2007
- $u, v, T, T-T_d, z, \text{slp}$
- available from the Earth Simulator Center  
<http://www.jamstec.go.jp/esc/afes/alera/>

Hunt et al. 2007; Miyoshi and Yamane 2007; Miyoshi et al. 2007a

# ALEDAS: AFES-LETKF Ensemble Data Assimilation System

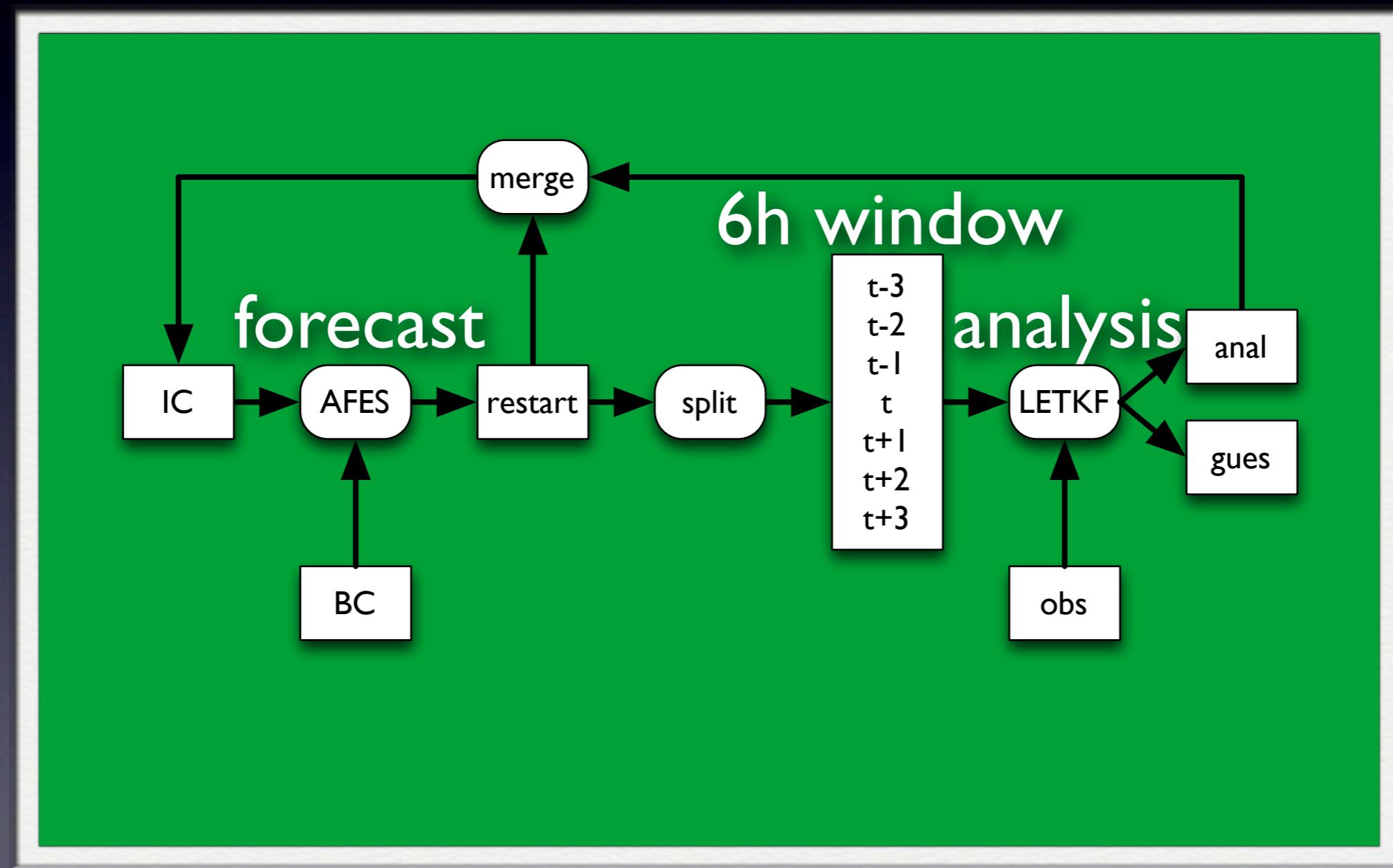


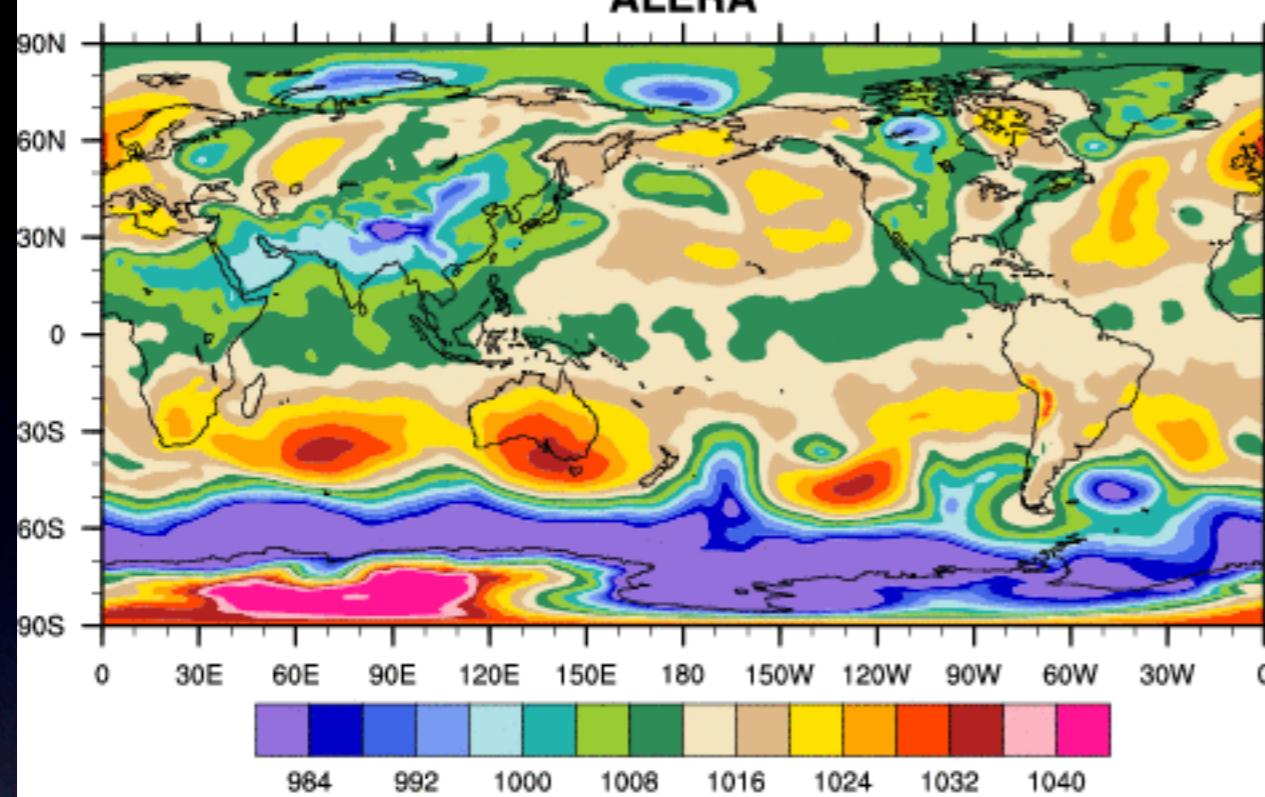
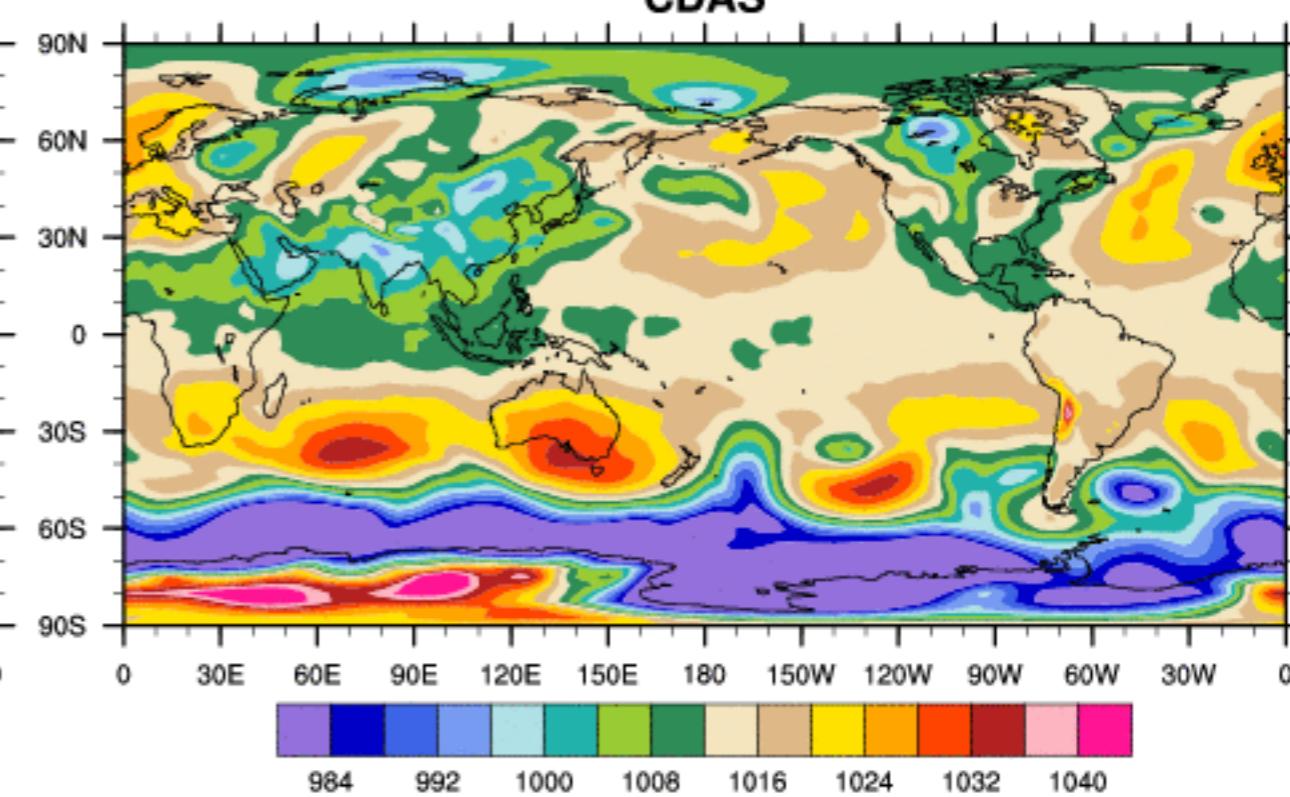
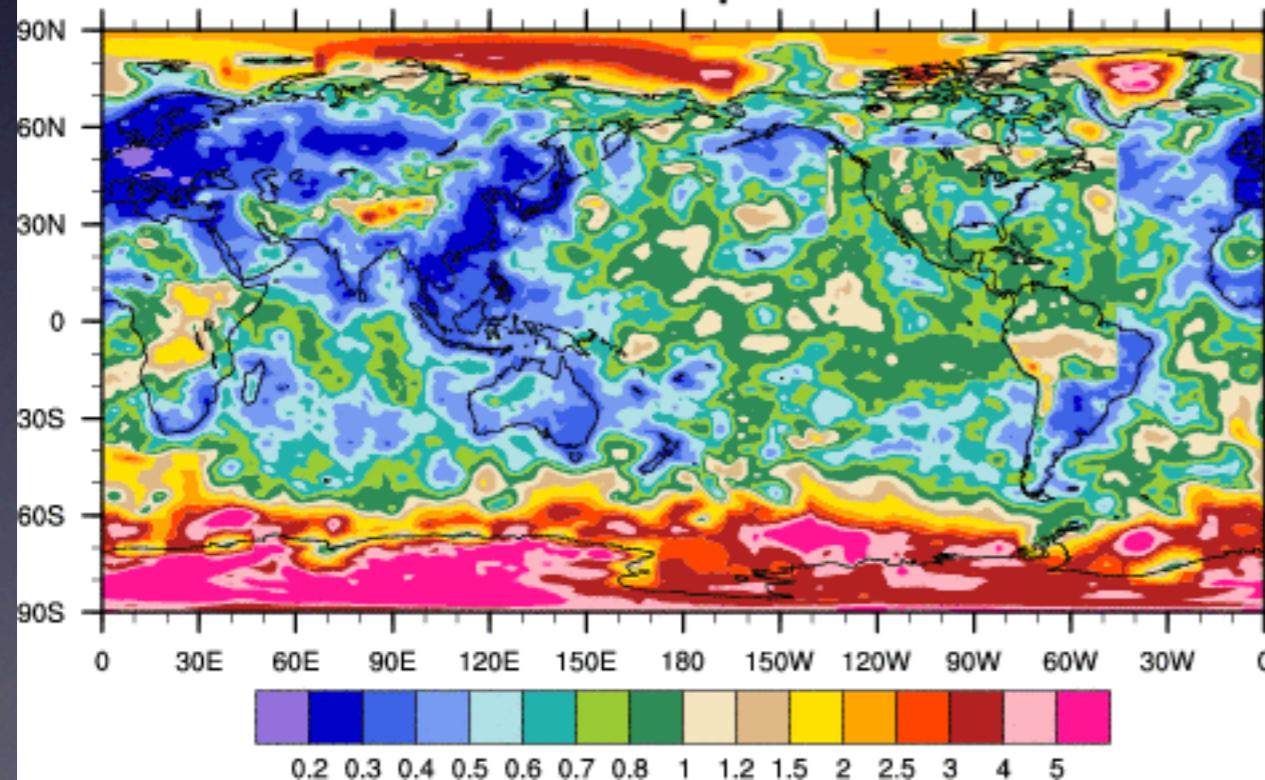
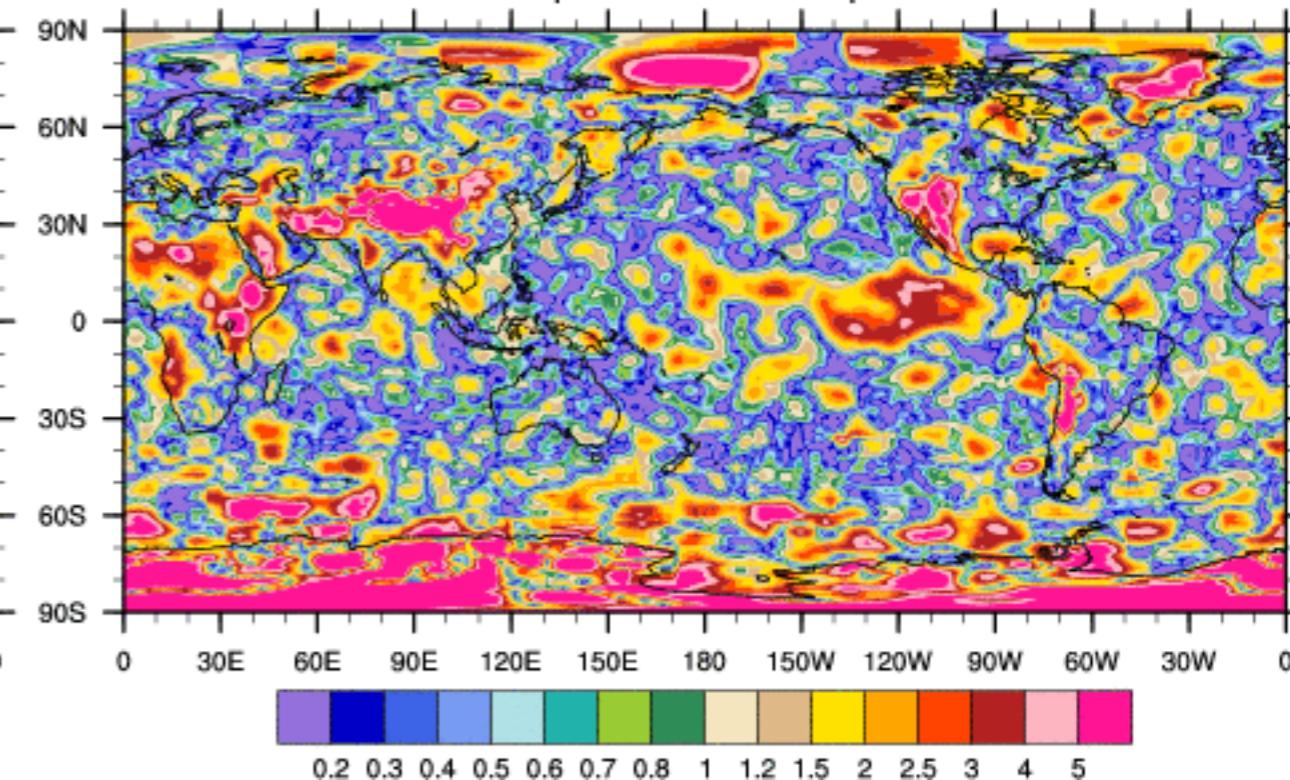
LETKF: Hunt et al. 2007; Miyoshi and Yamane 2007; Miyoshi et al. 2007

AFES: Numaguti et al. 1997; Ohfuchi et al. 2004; Enomoto et al. 2008

# Forecast–Analysis Cycle

## AFES-LETKF

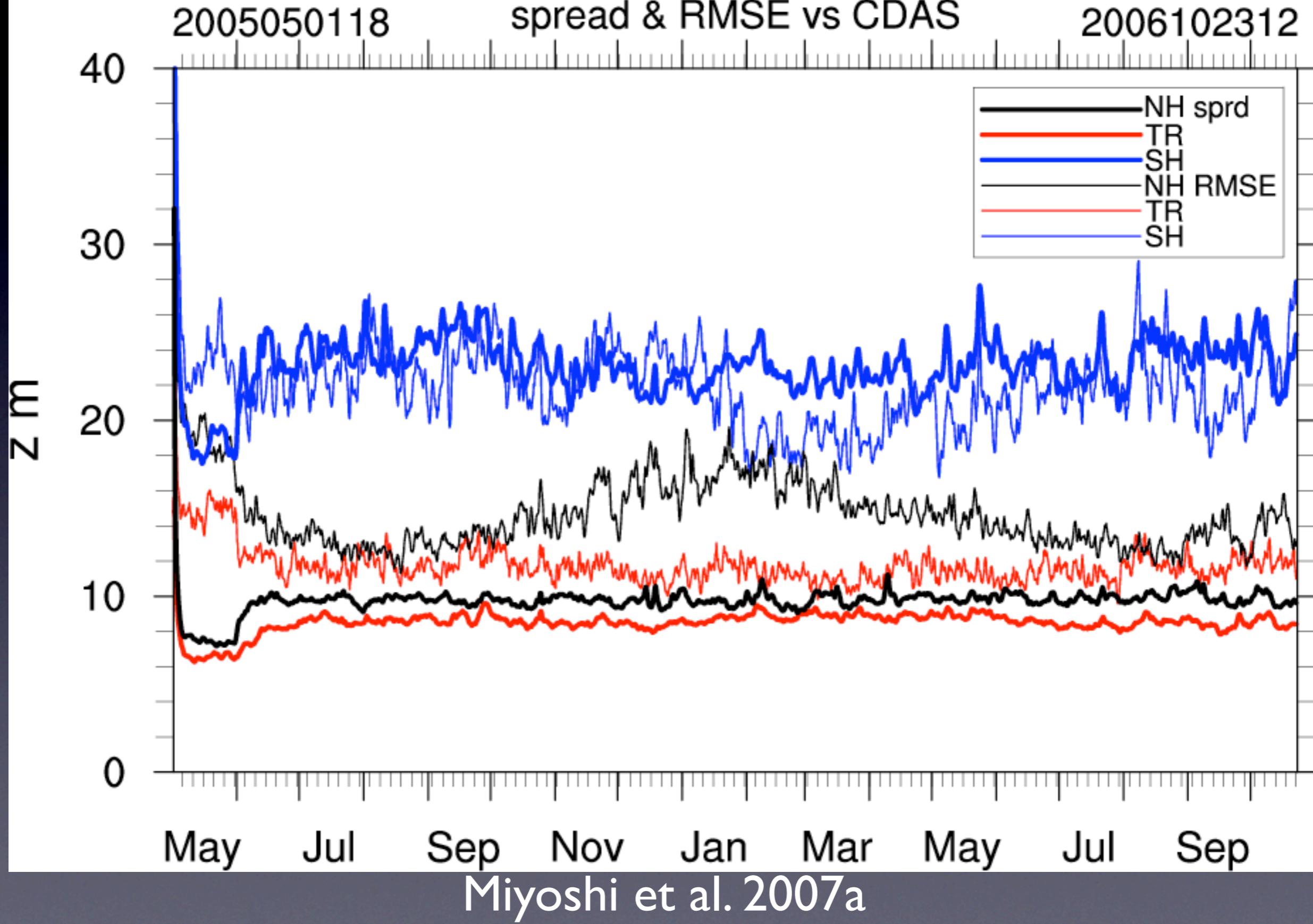


**ALERA****CDAS****ALERA spread****|ALERA-NCEP|**

Miyoshi et al. 2007a

# ALERA

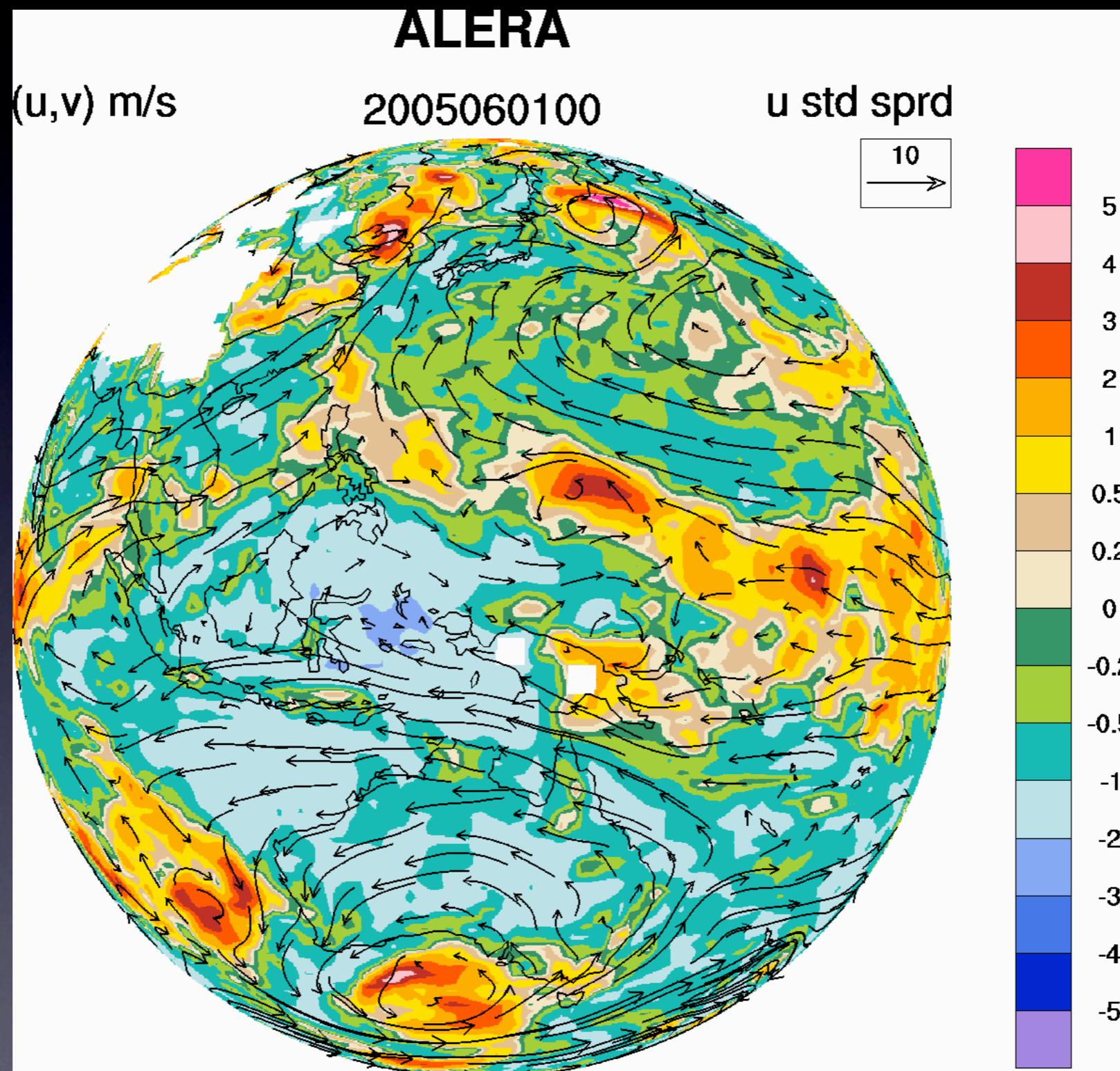
spread & RMSE vs CDAS



Miyoshi et al. 2007a

# Typhoons

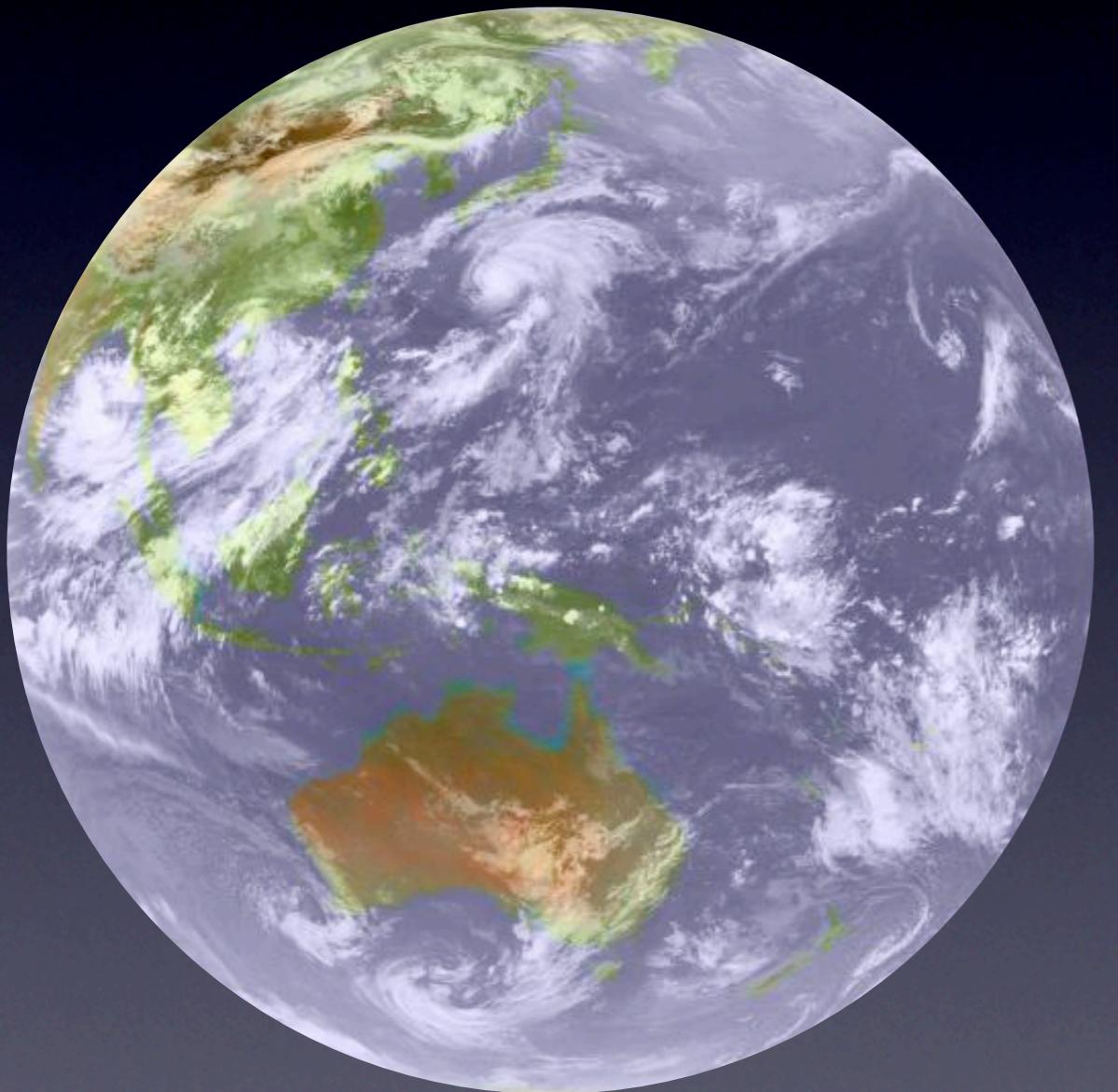
# 850 (u,v) and standardized U850 spread



# ET of Typhoon 0504

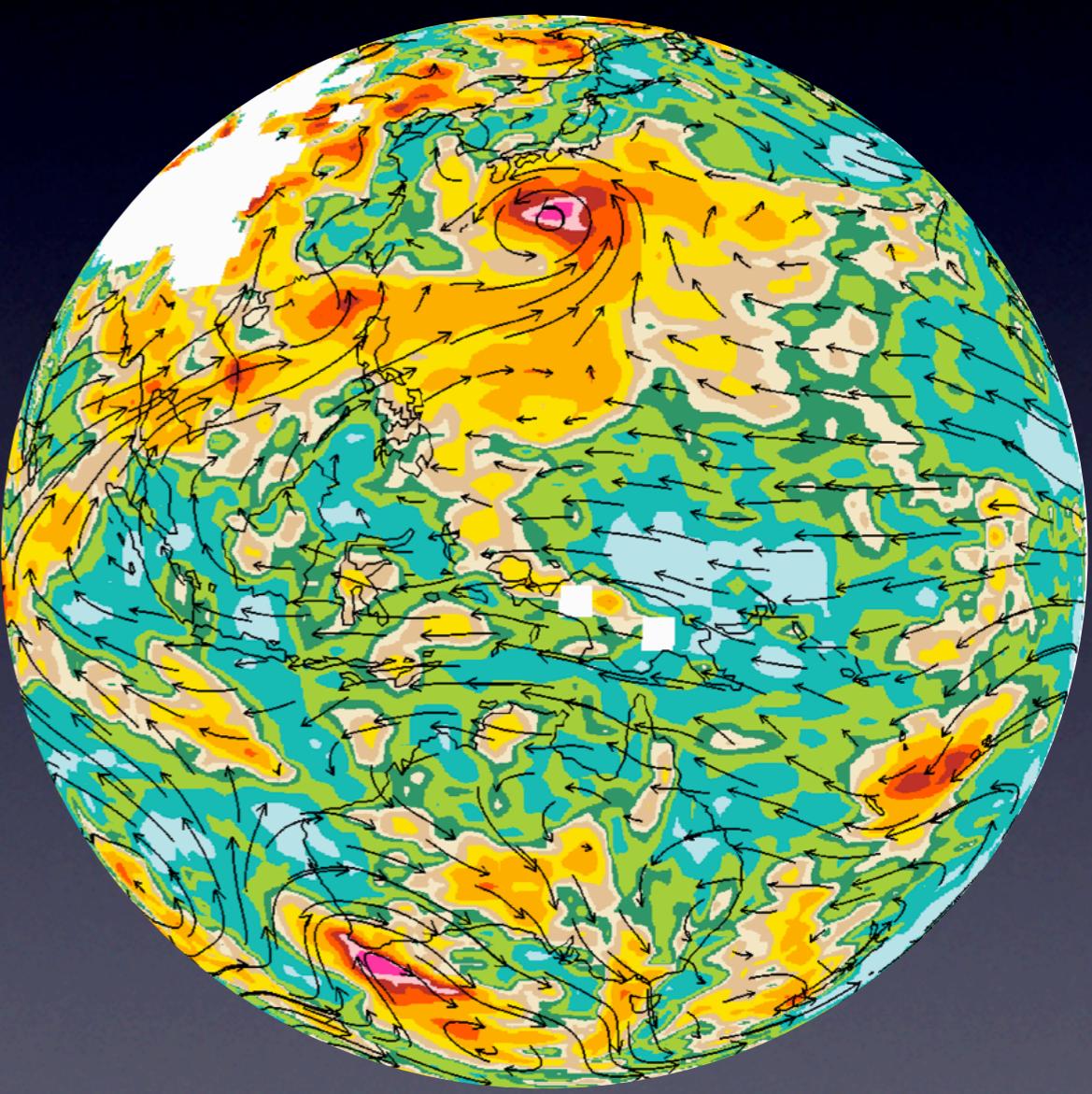
GOES 9 IR

JMA/Kochi Univ

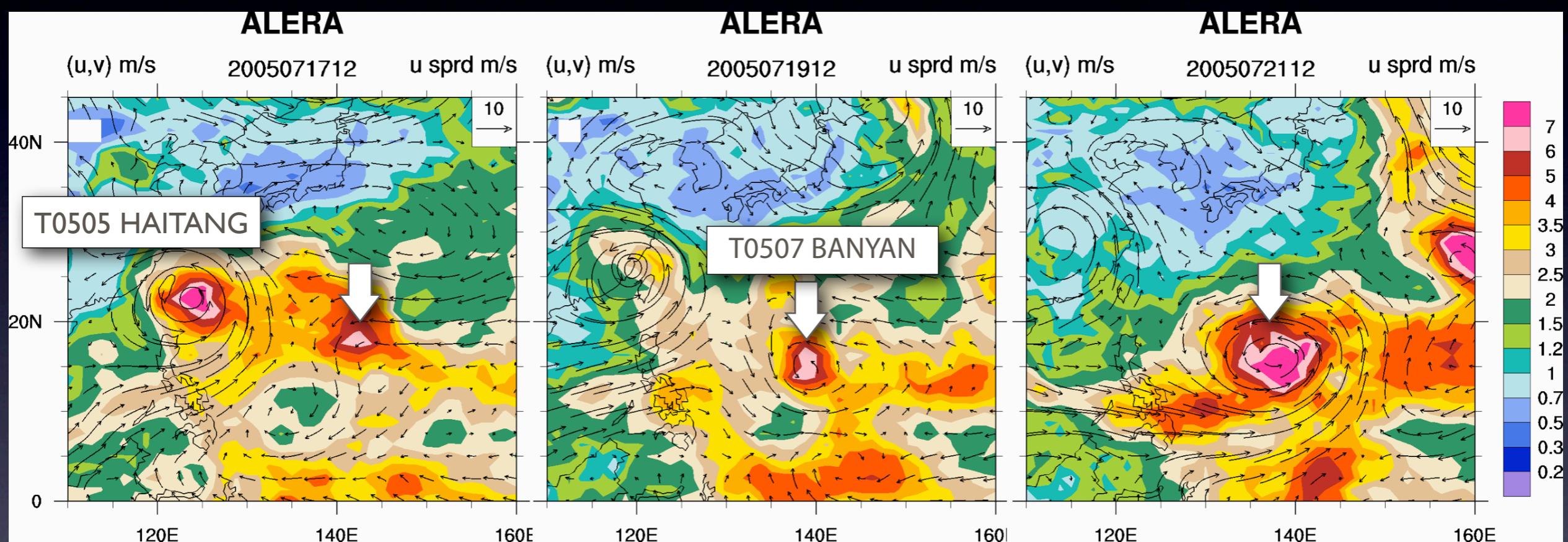


ALERA

(u,v) 850 hPa & u850 sprd

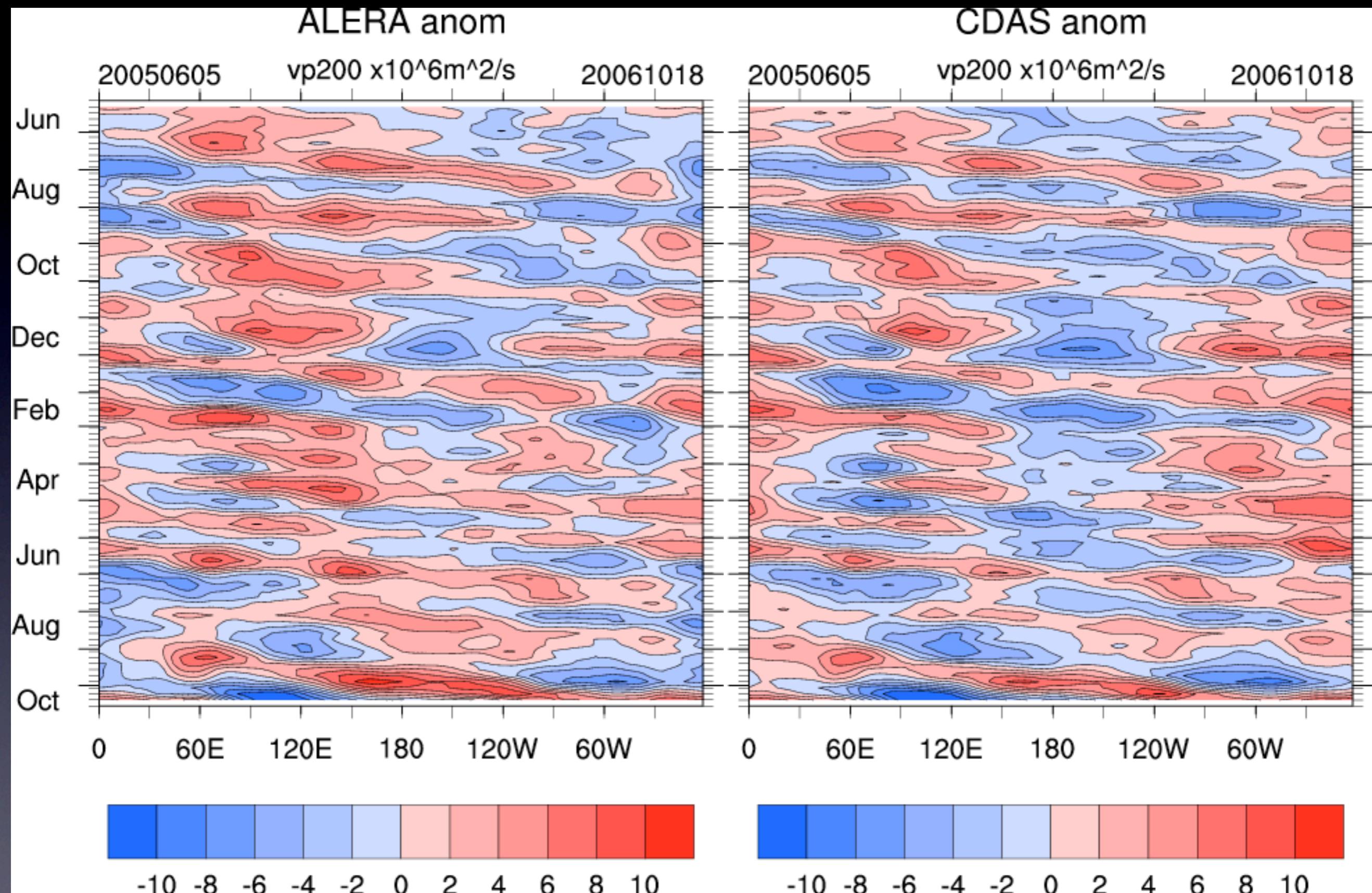


2005-06-09 0UTC



# Tropics

# VP200

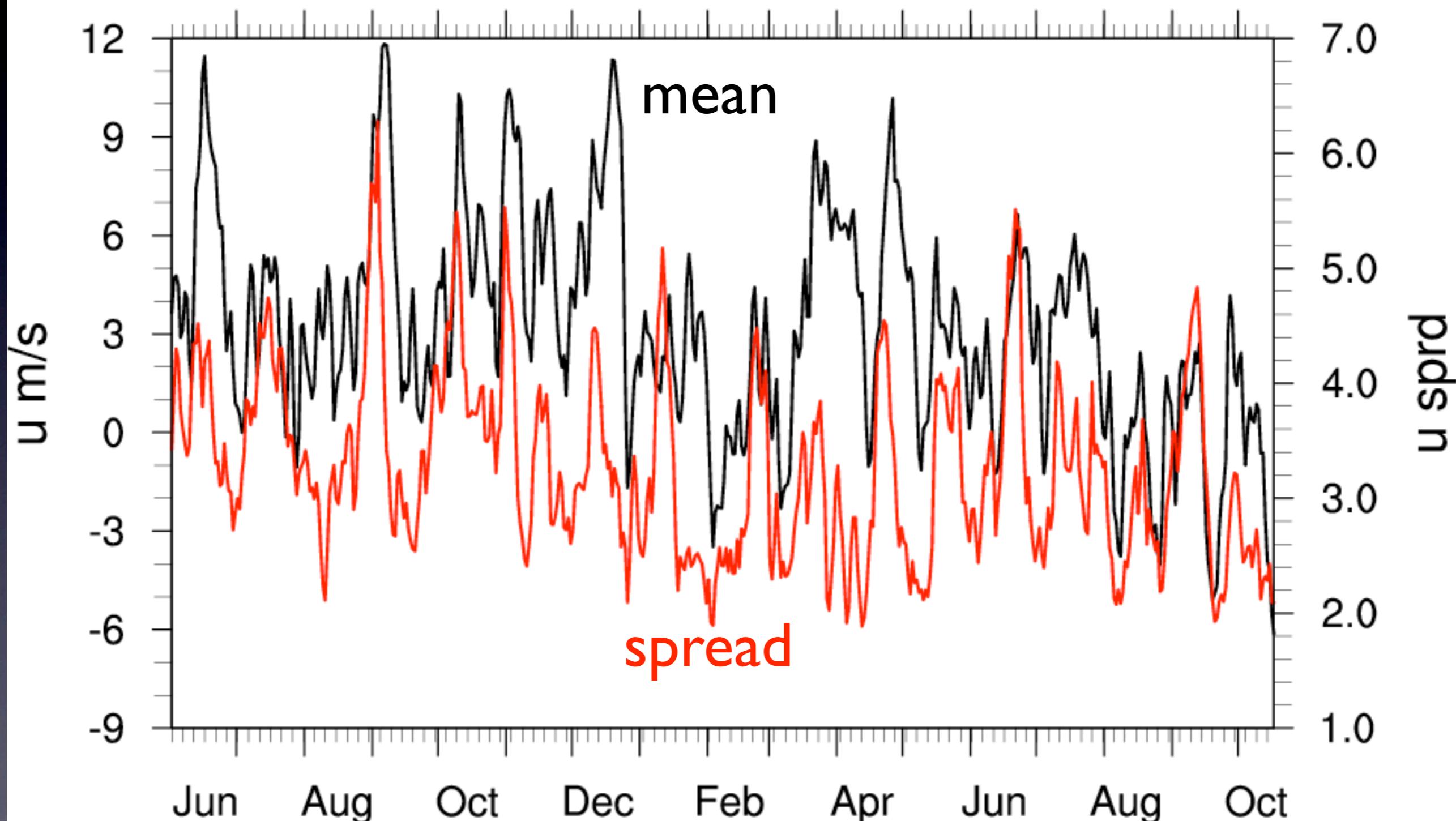


# ALERA

20050601

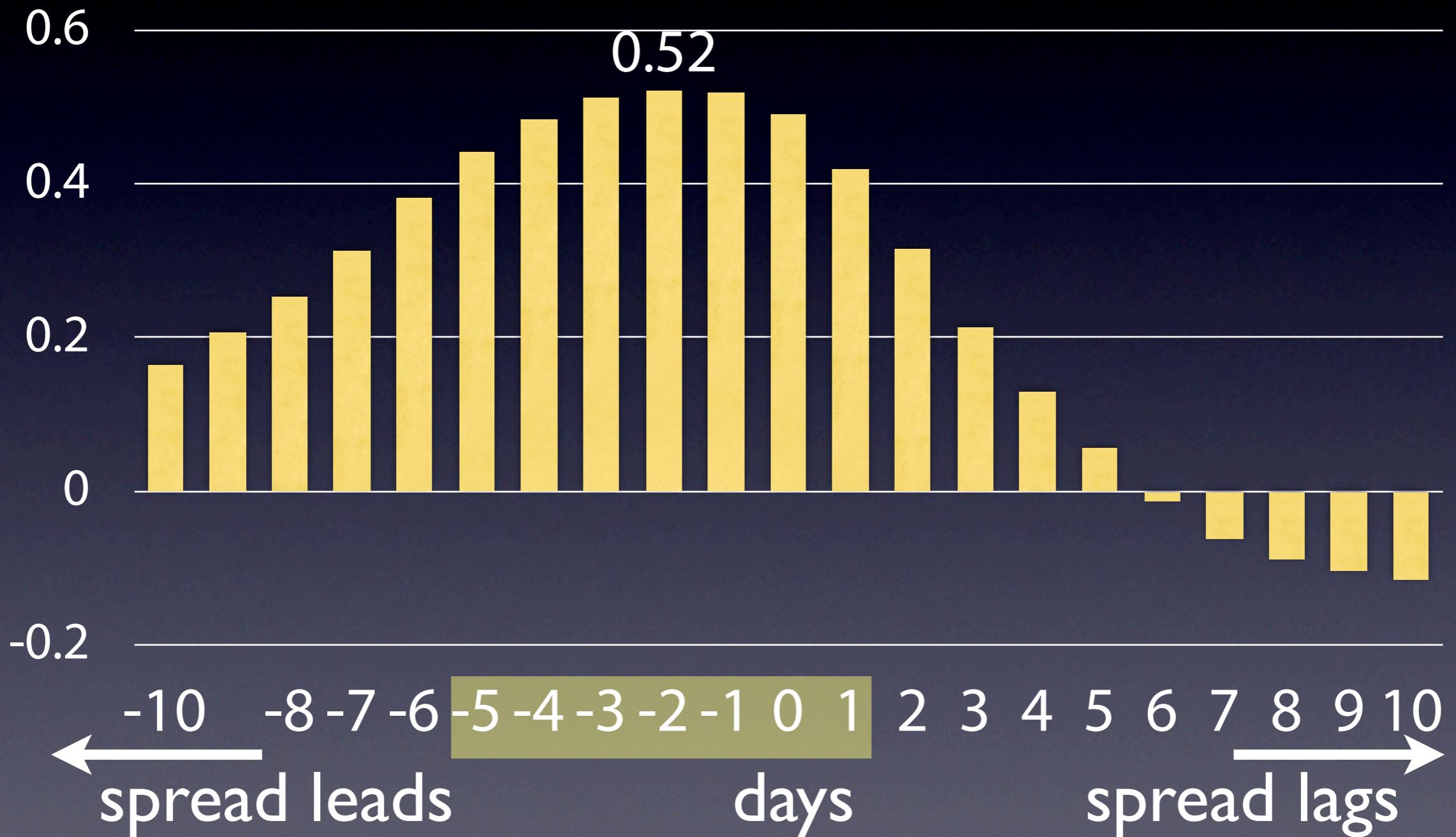
U850 5S-5N, 75E-95E

20061017



Enomoto et al., 2010 GRL

# Lag correlation between mean and spread



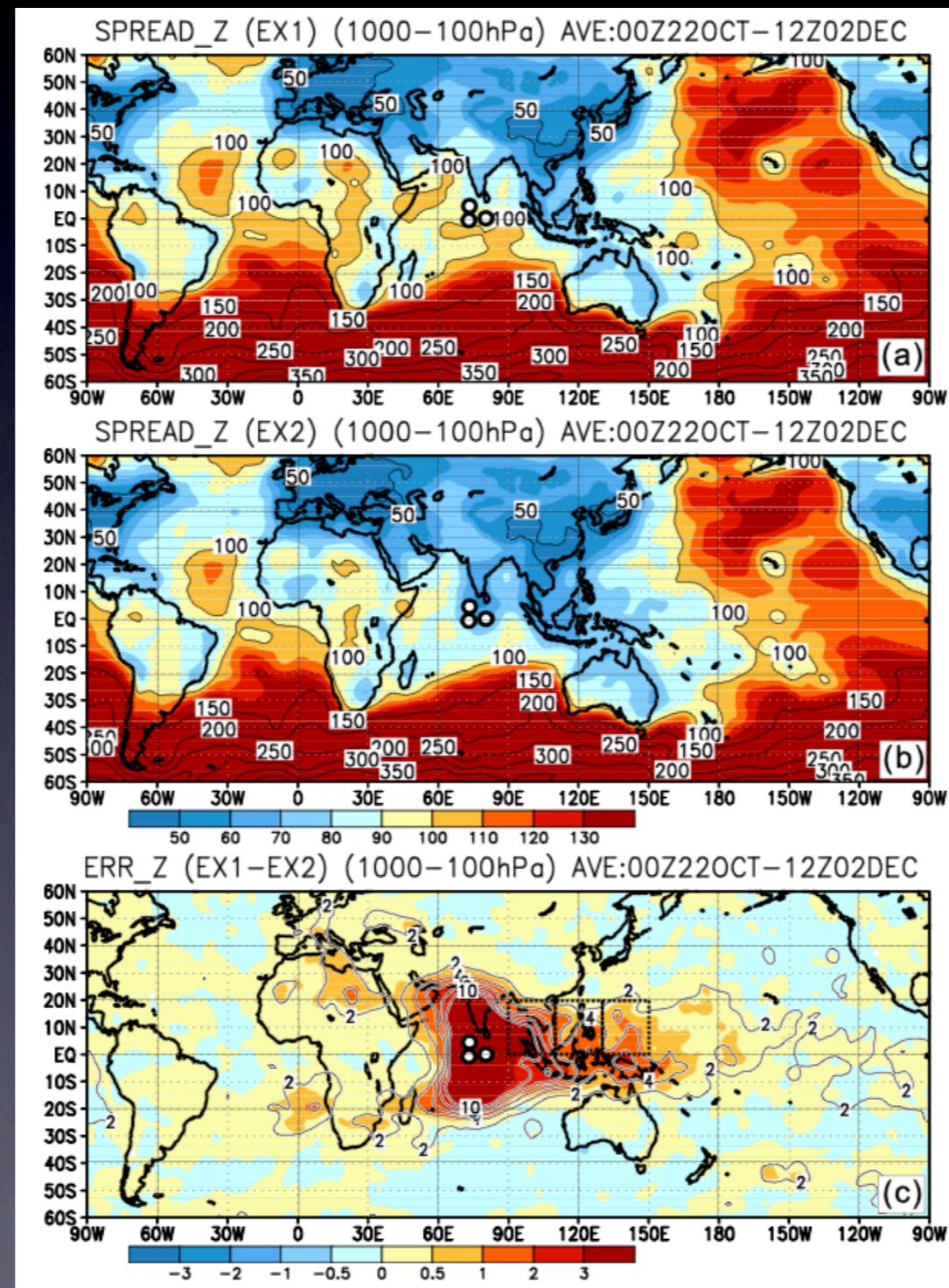
Enomoto et al., 2010 GRL

# Influence of sondes in Matsuno-Gill pattern

ALERA (w/o MISMO sondes)

with MISMO sondes

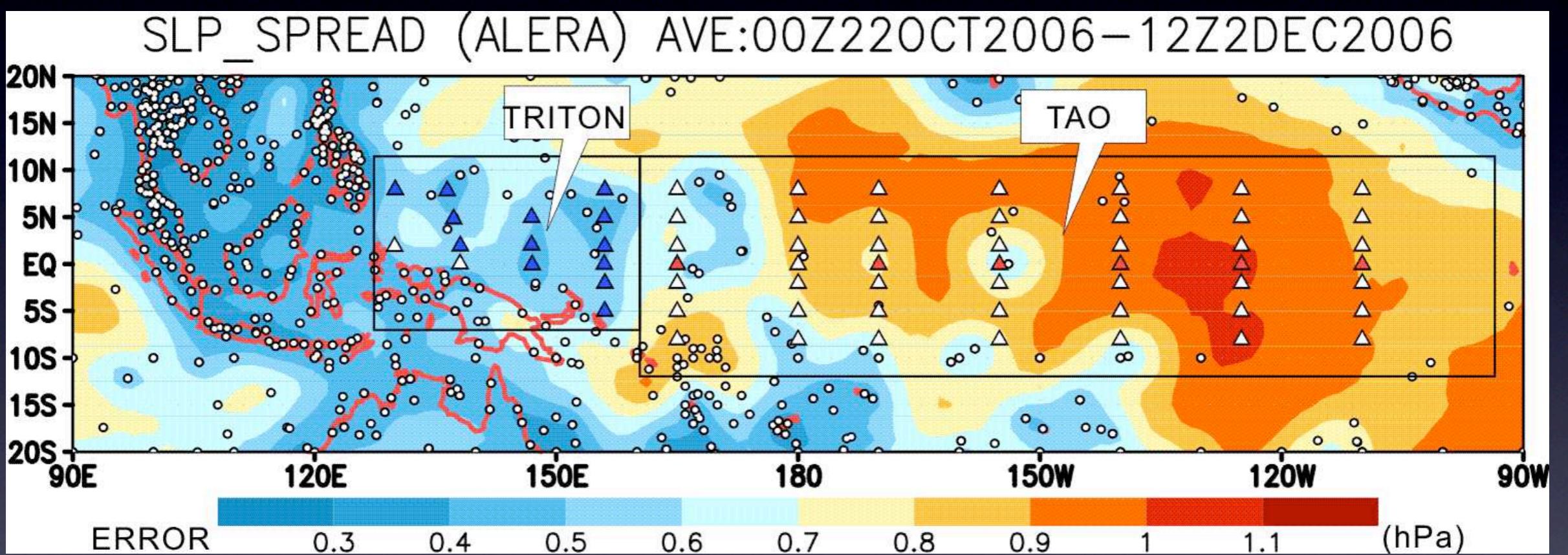
ALERA – with MISMO



MISMO Oct–Dec 2006  
in the Indian Ocean

Influence on  
typhoon genesis

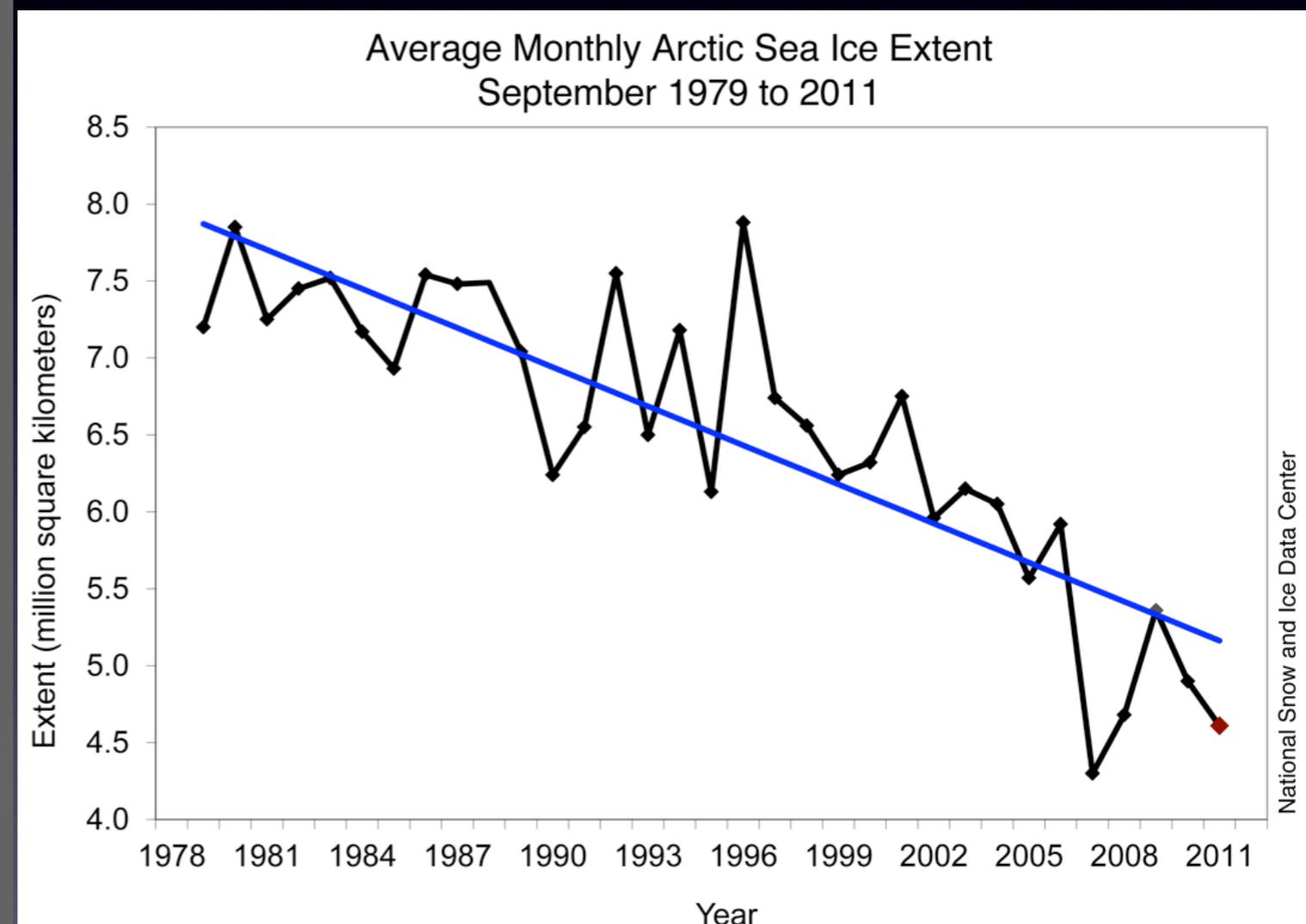
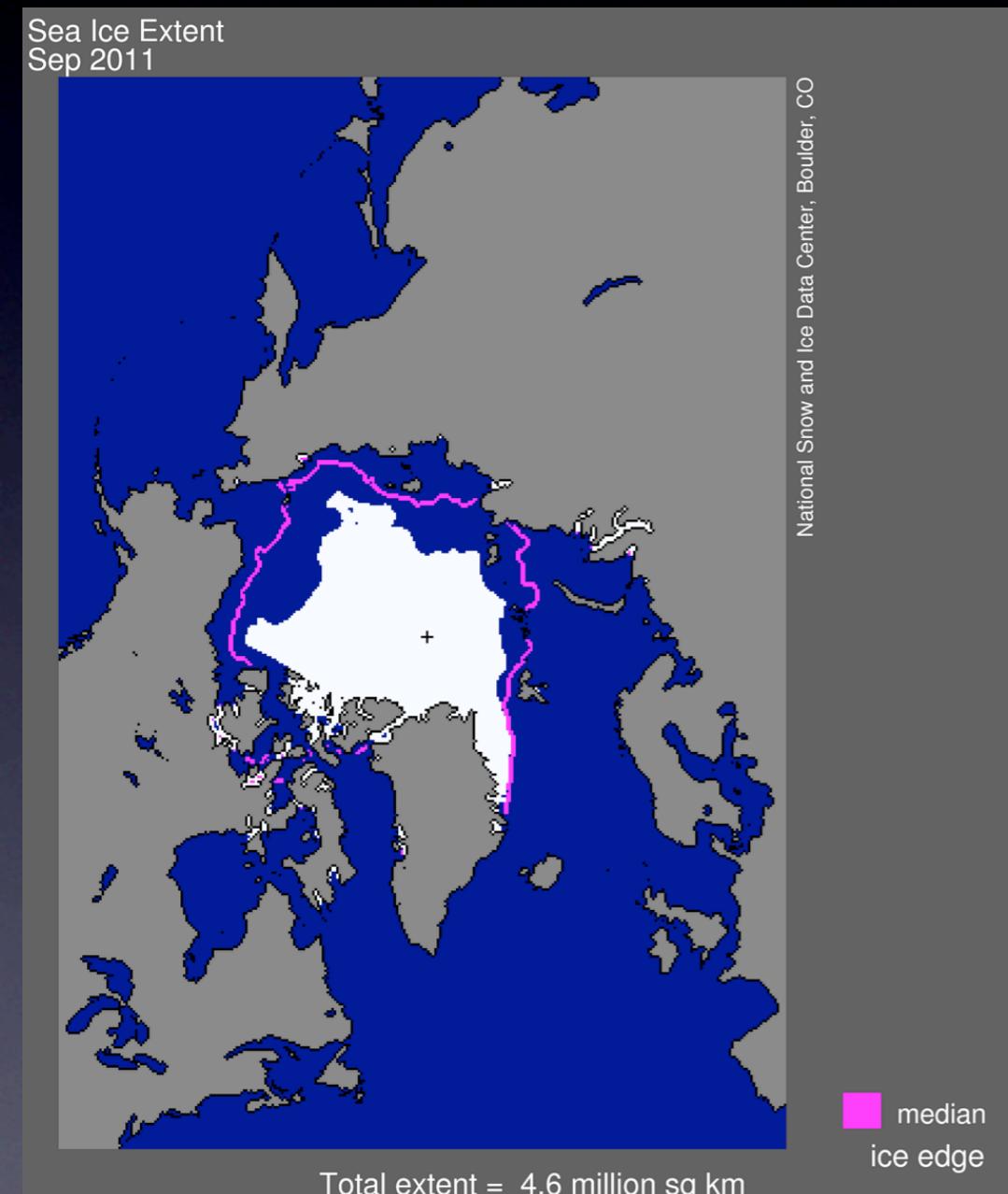
Moteki et al. 2011, QJRMS



Moteki, *pers. comm.*

# Arctic

# Arctic ice in September 2011



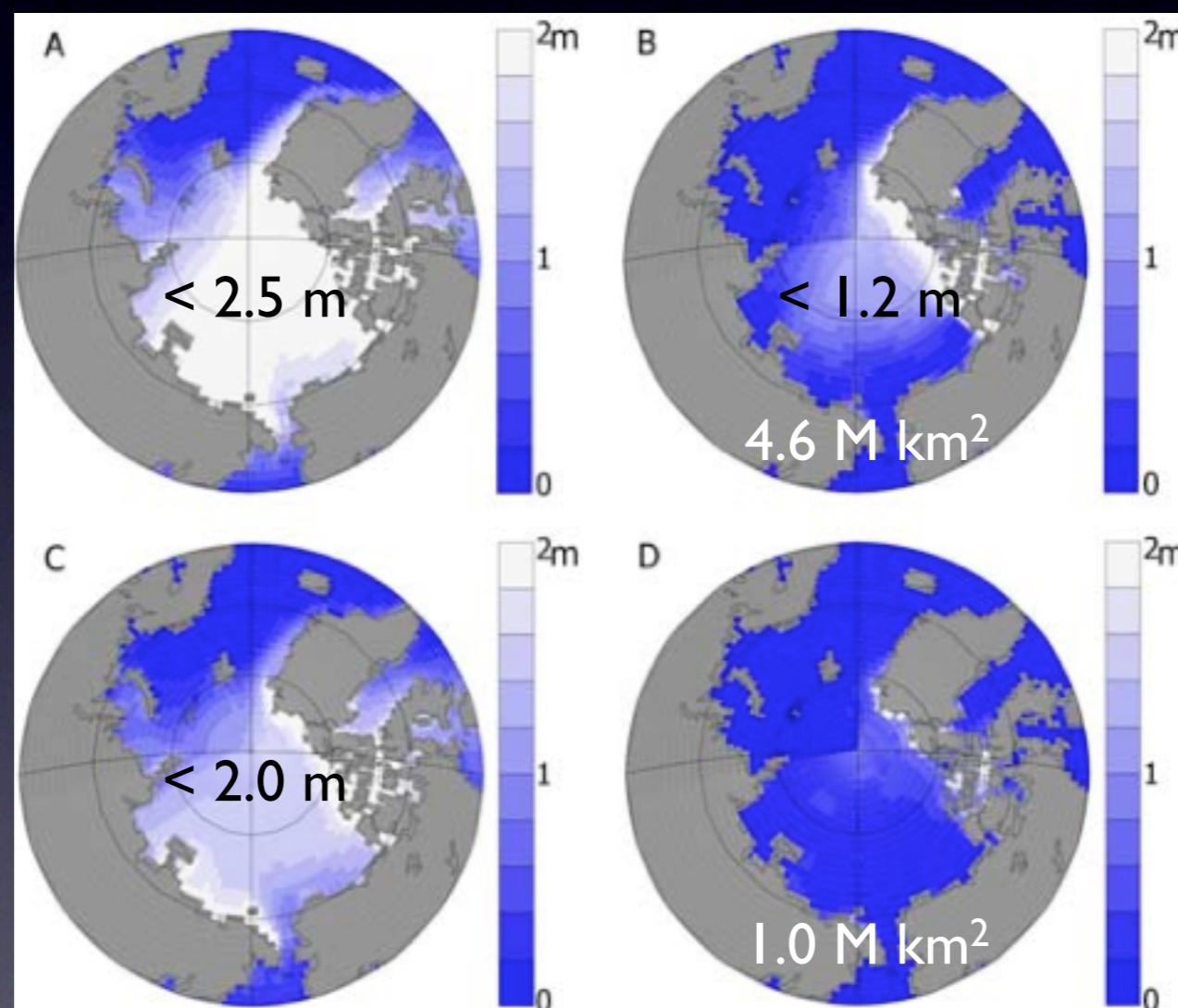
NSIDC

# Blue Arctic in 30 years?

Ensemble mean sea ice thickness

March

September



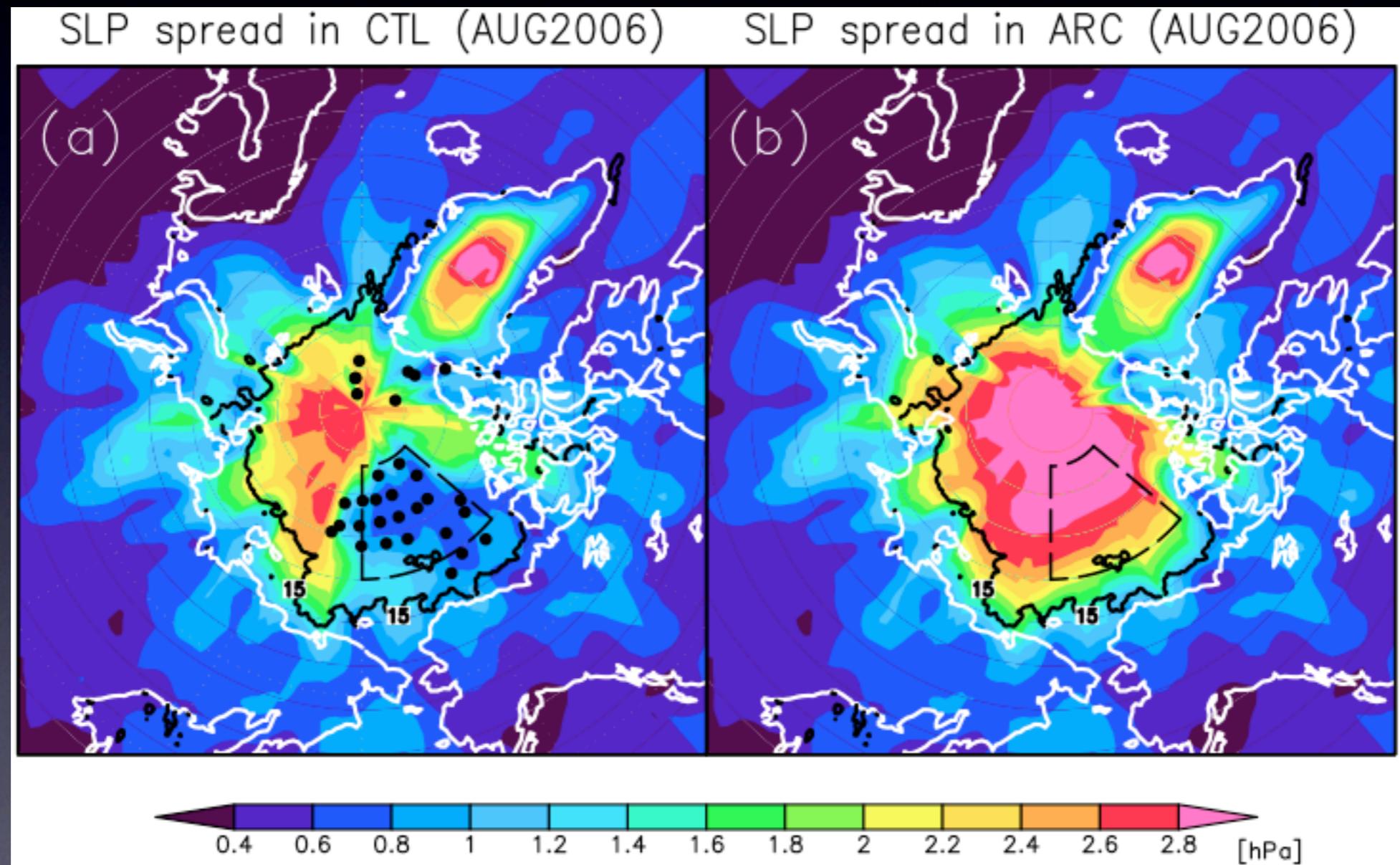
6 selected IPCC models

Wang and Overland 2009

# Experimental settings

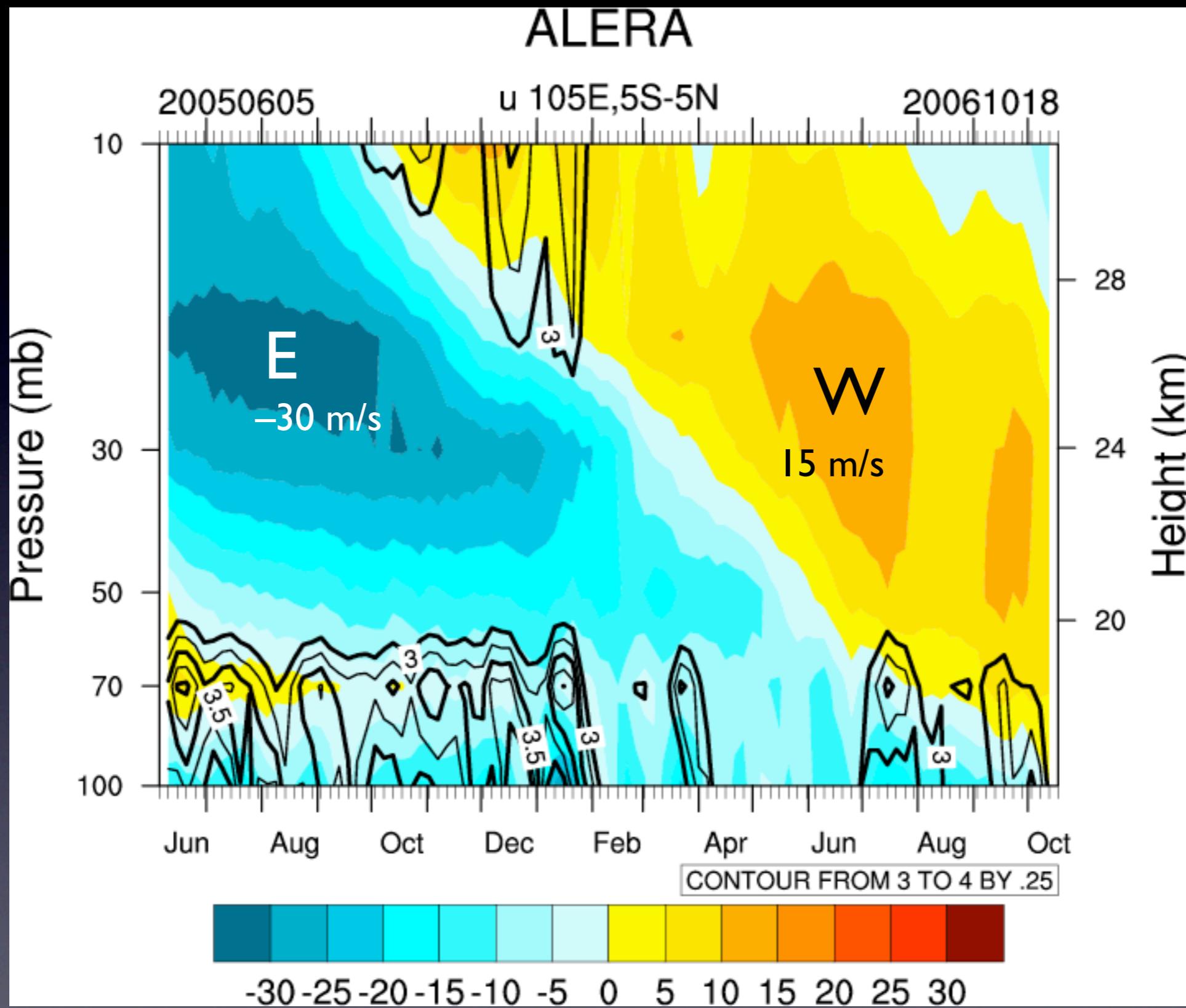
- Reference: ALERA
- Test: pressure observations north of 70N removed
- About half a year from June 2006

# Impact on sea-level pressure



Inoue et al 2009

# Stratosphere

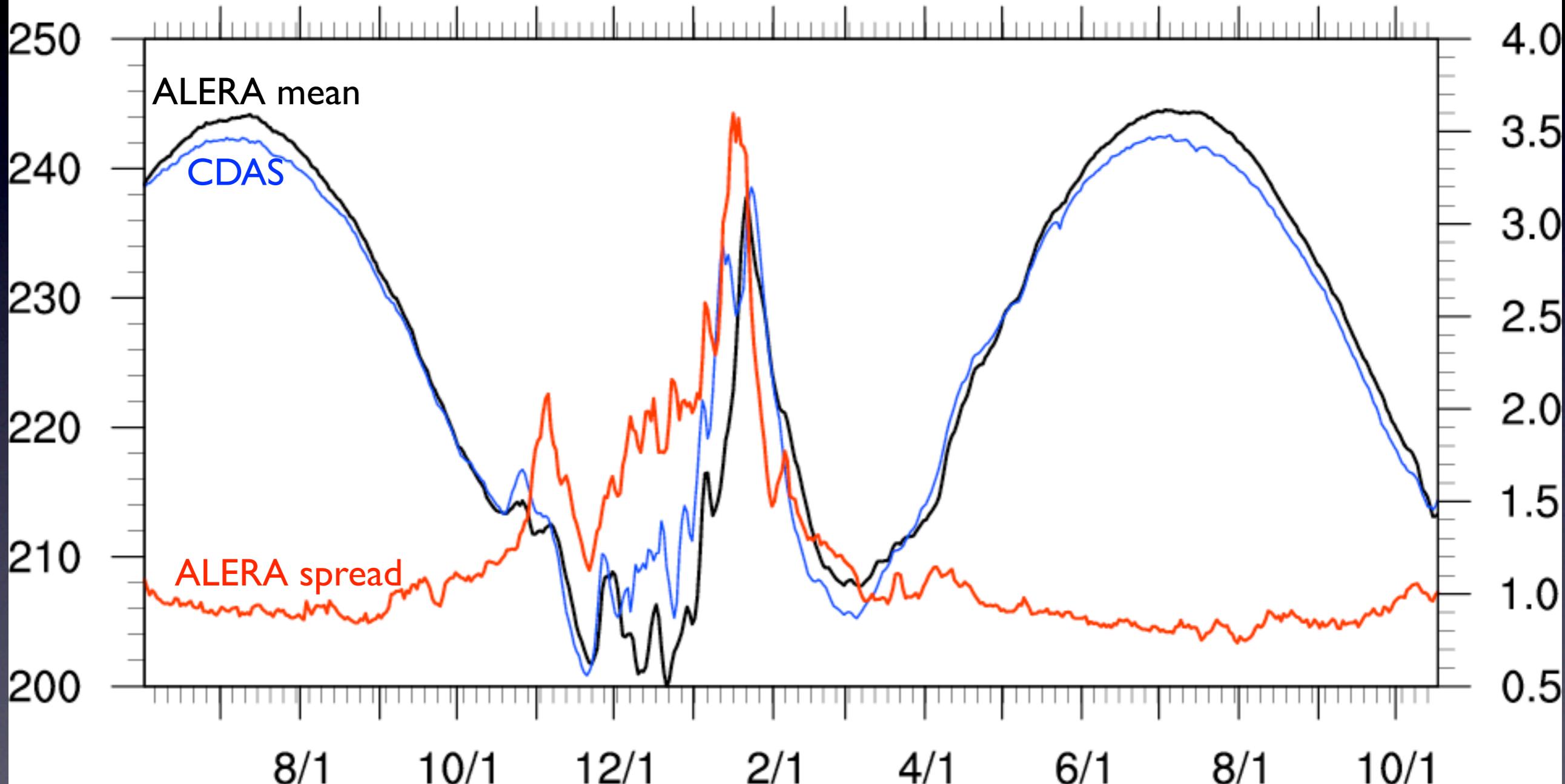


# ALERA

20050601

T10 65N-90N

20061017

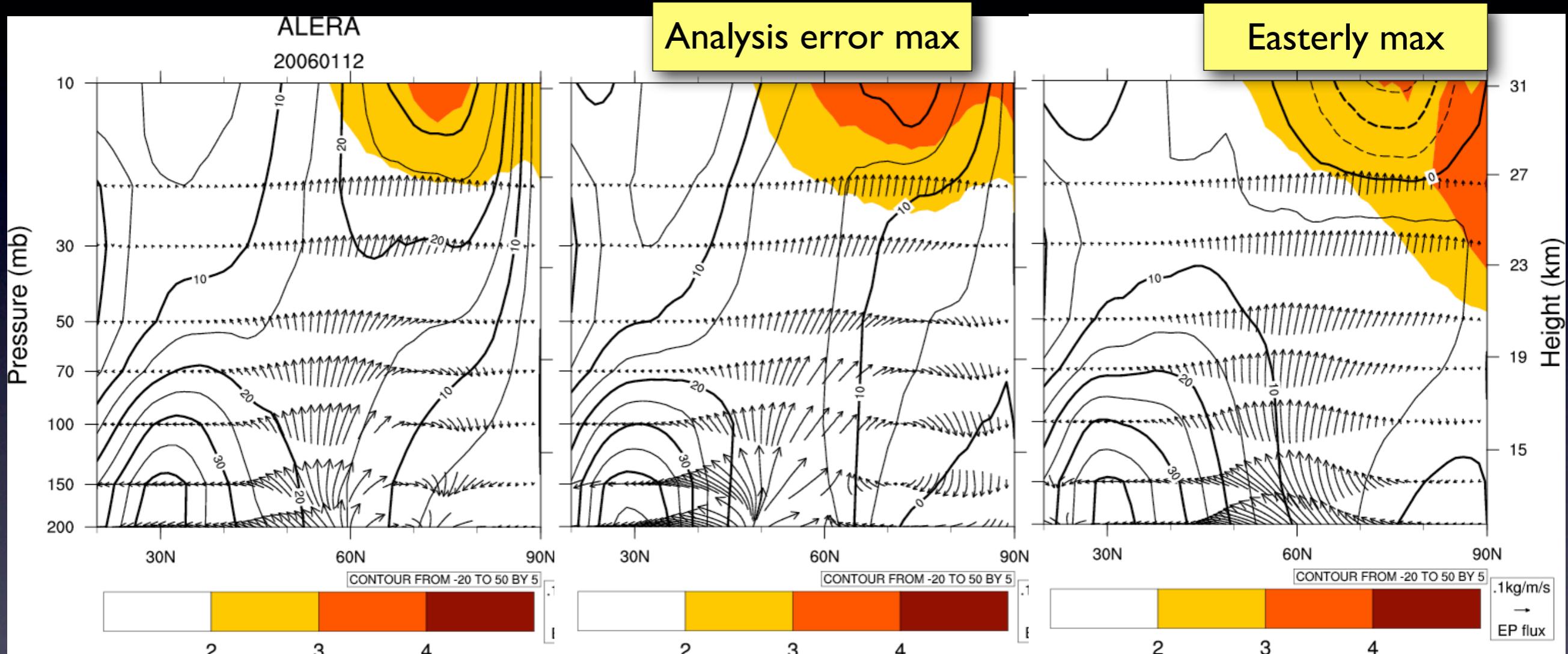


Enomoto et al., GRL, 2010

12 Jan 2006

16 Jan 2006

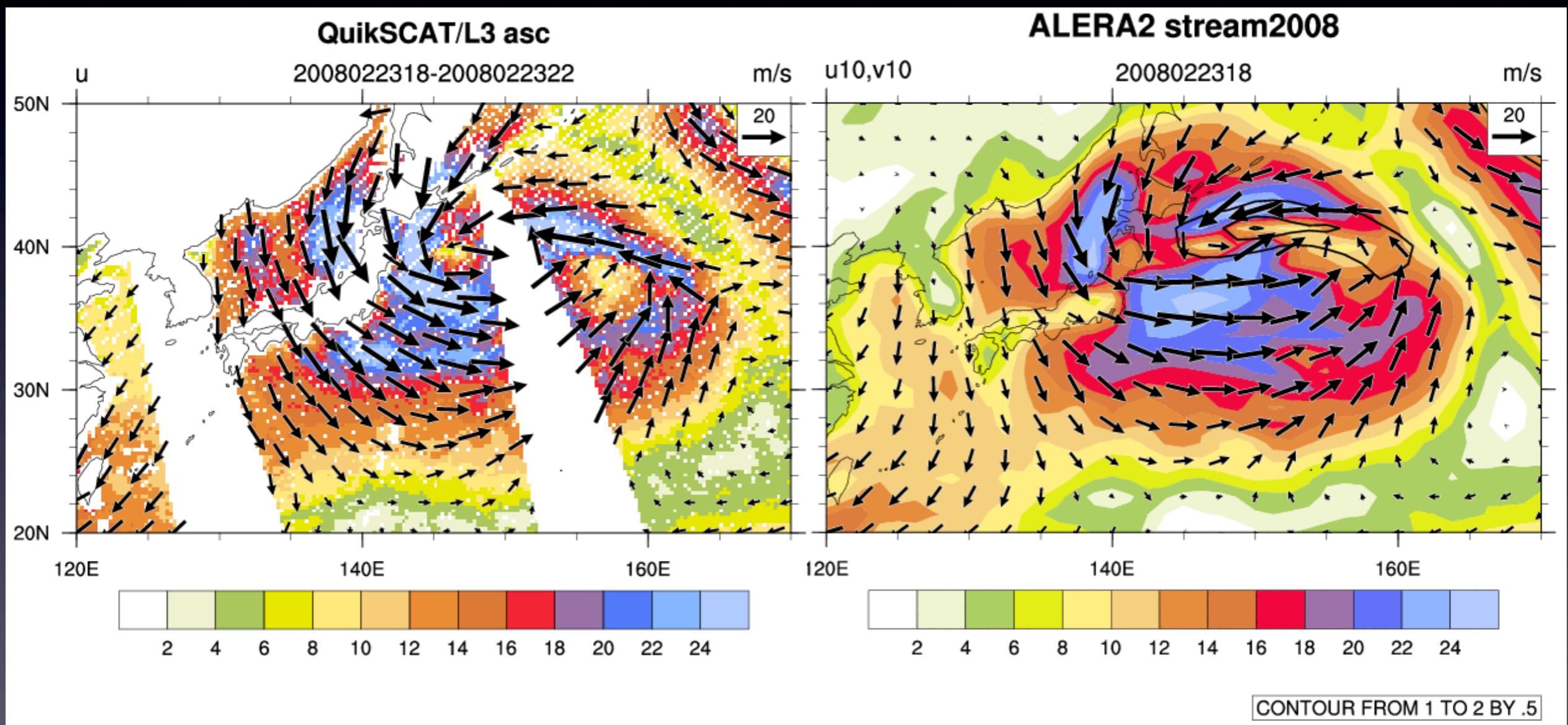
22 Jan 2006



EP flux,  $u$  (contours),  $u$  ensemble spread (shades)

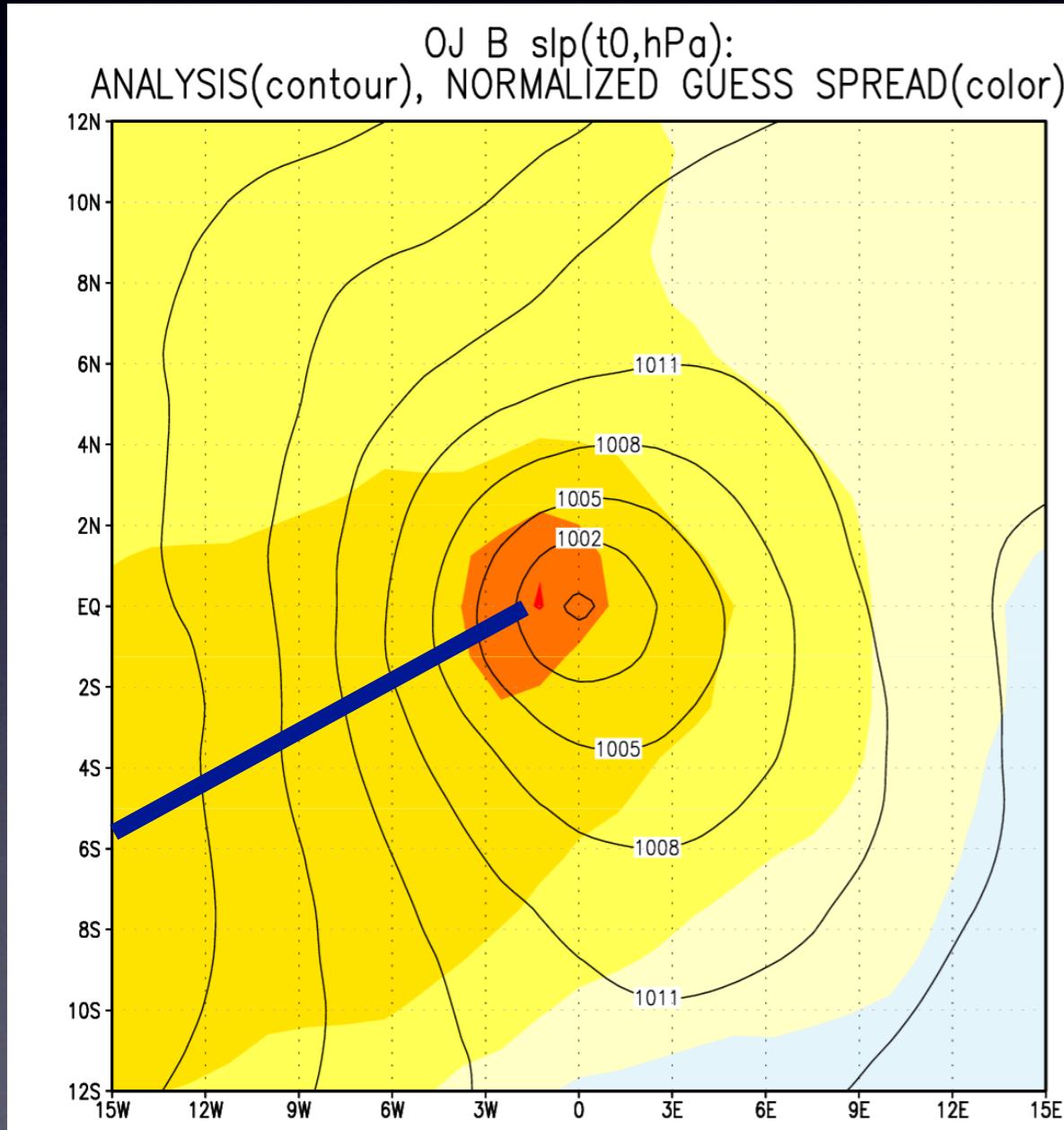
# Bomb cyclones

# Bomb cyclone

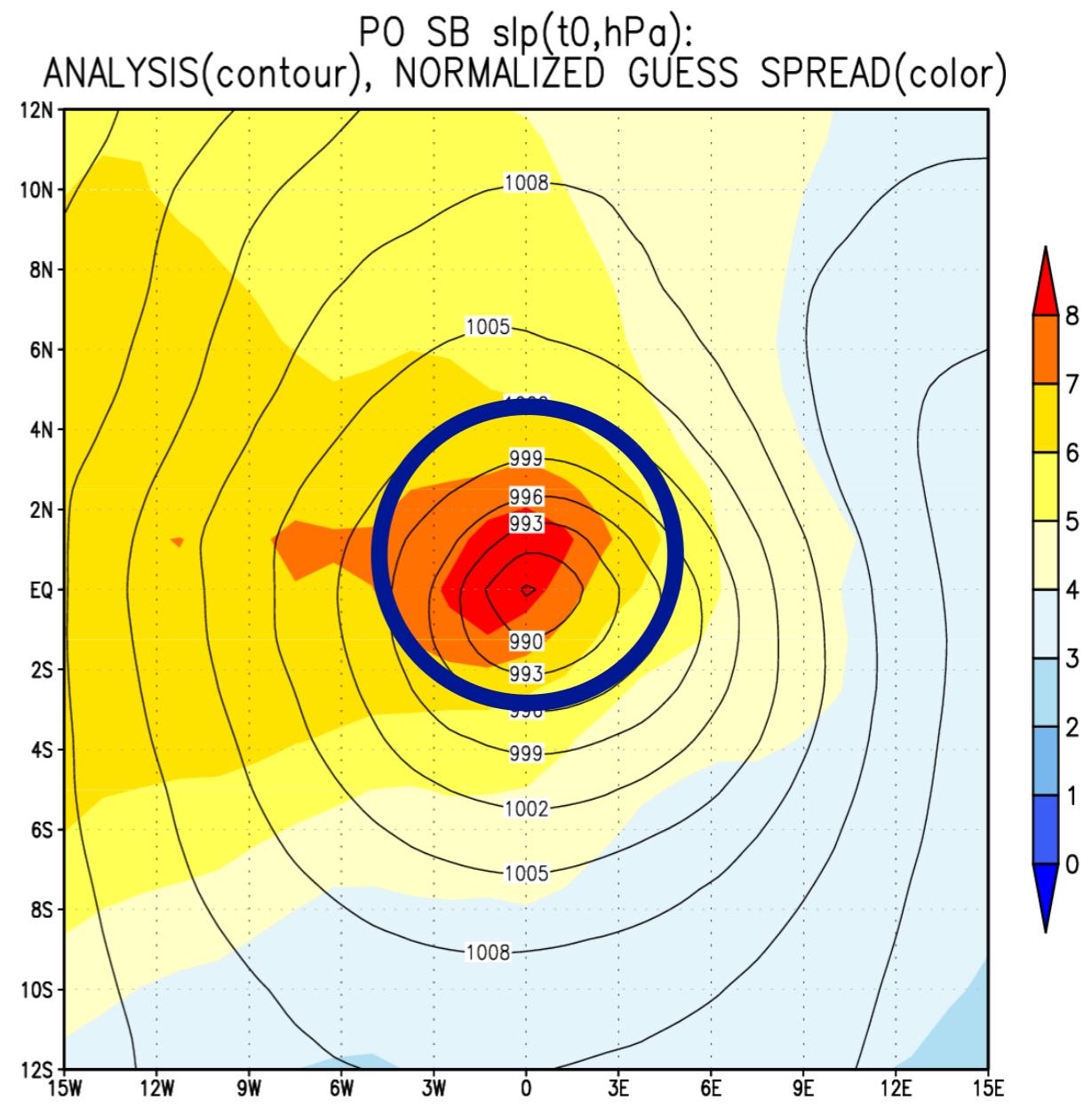


# Development locations

Sea of Japan

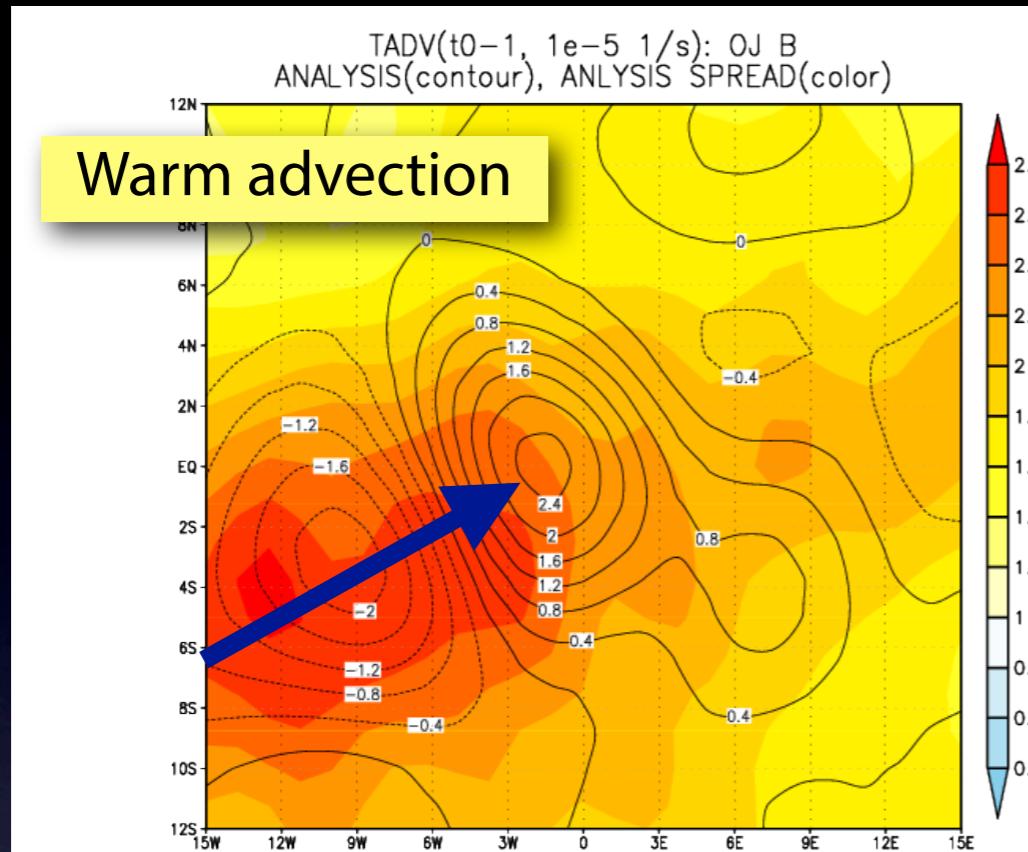


Pacific

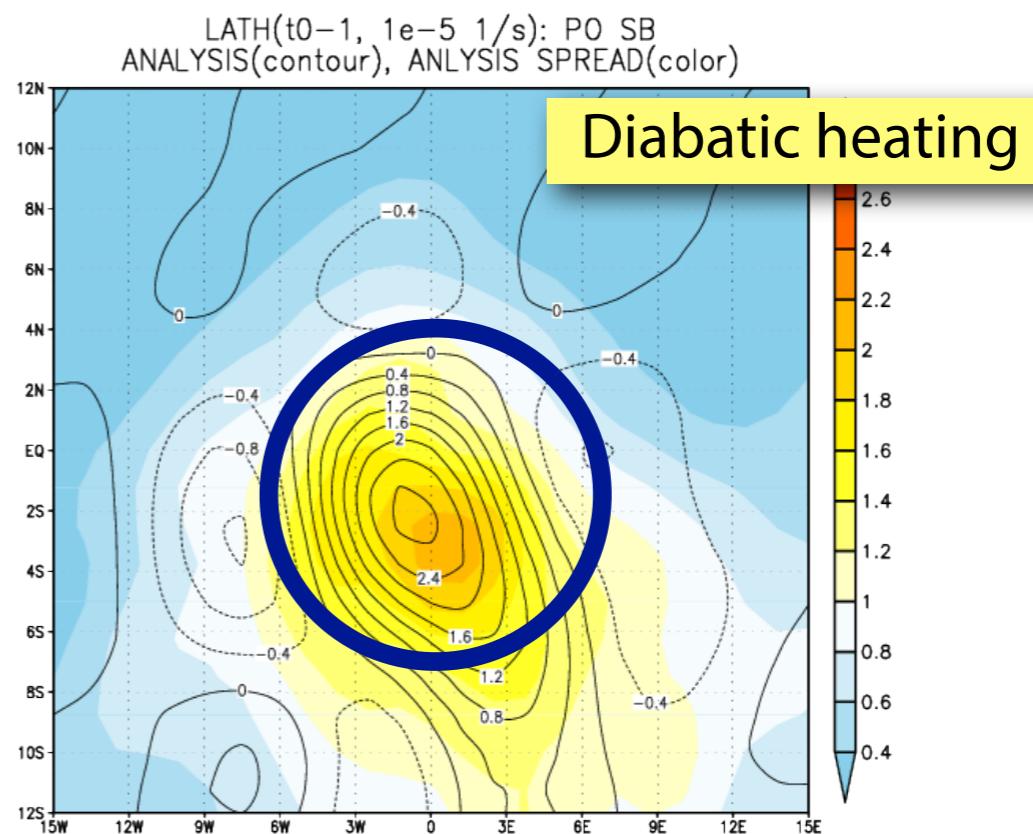
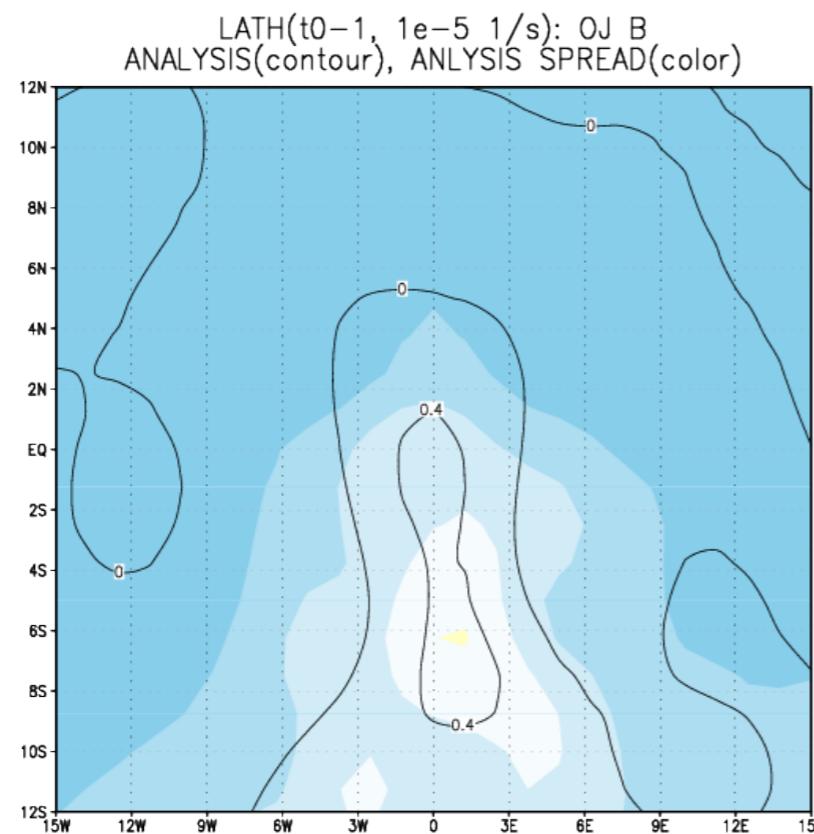
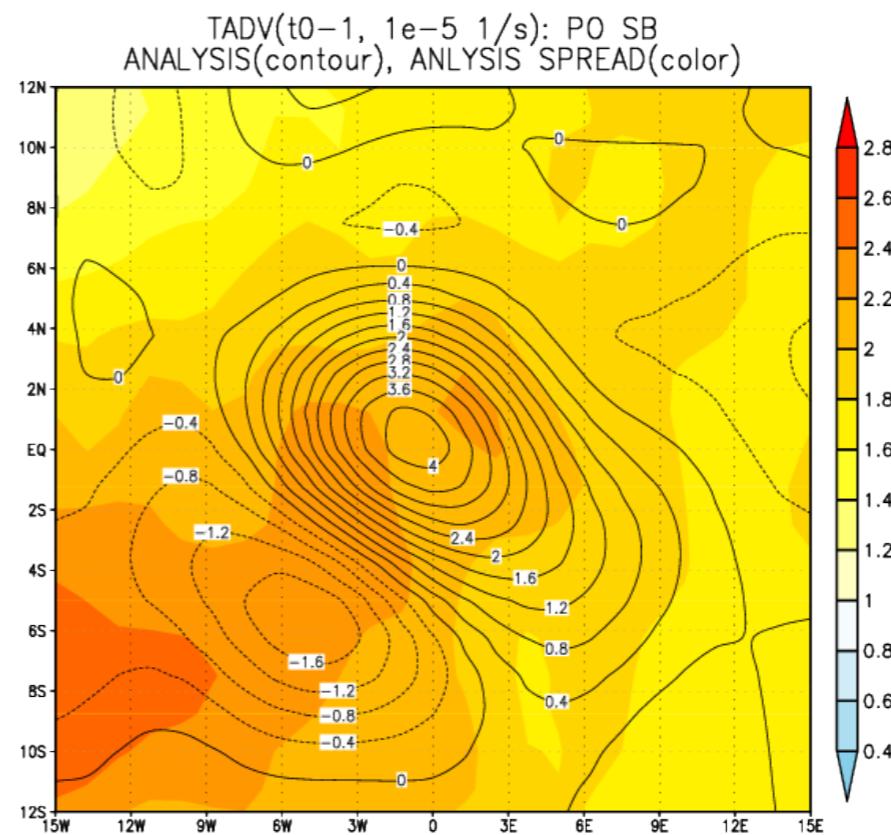


Kuwano-Yoshida

# Sea of Japan



# Pacific



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# Summary

- Analysis = Observation + Forecast
- Ensemble-based analysis provides analysis error estimation
- Mechanisms, predictability and evaluation of observations