

# All-sky assimilation of infrared radiances at water vapor bands of Himawari-8 in the global data assimilation system at JMA

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1. Background and objective
2. Development of ASR assimilation
3. Data assimilation experiments
4. Additional impact studies
5. Summary and plans

- IR radiance assimilation is significantly beneficial for NWP
  - Mostly limited to clear-sky radiances (**CSR**)
- IR all-sky radiance (**ASR**) assimilation will be more beneficial because
  - Increasing obs coverage (homogeneous spatial and temporal distribution)
  - Reducing sampling bias (e.g. dry bias)
  - Exploiting cloud and unique obs info
- **Challenges** of ASR assimilation (compared with CSR assimilation)
  - Poorer representation in radiative transfer model (RTM) and forecast model
  - Stronger situation-dependency of obs statistics
  - Higher non-Gaussianity and non-linearity
- Encouraging results in many recent studies
  - Otkin (2010, 2012, JGR), Zhang et al. (2016, GRL), Honda et al. (2018 MWR; 2018 MWR, JGR), Minamide & Zhang (2017 MWR; 2018 MWR), Okamoto et al. 2019, QJRMS), Sawada et al. (2019, JGR)
  - However, **few studies in global DA system**, except Geer et al. (2019, AMT) for IASI

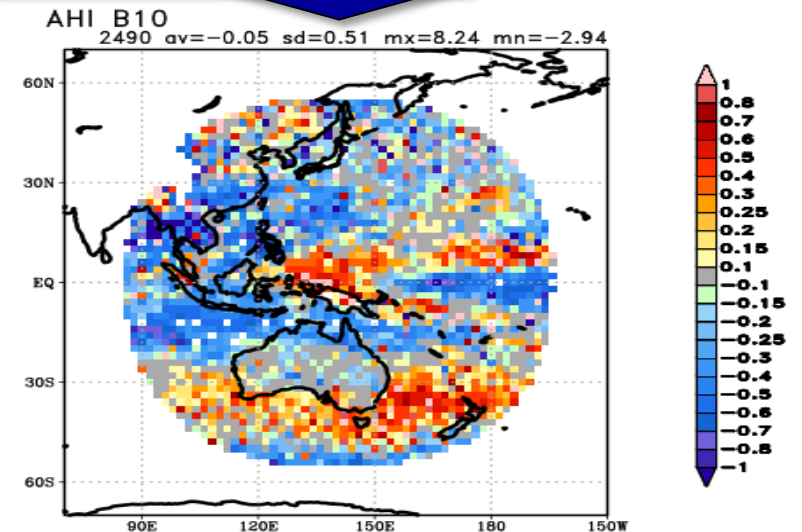
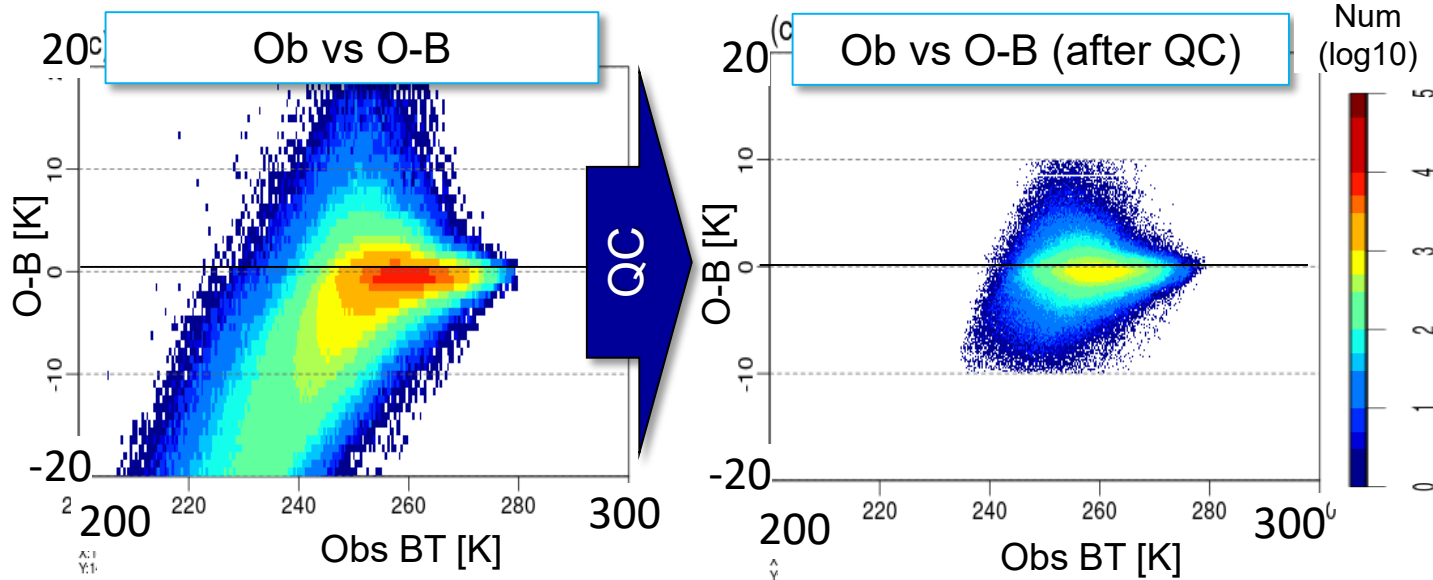
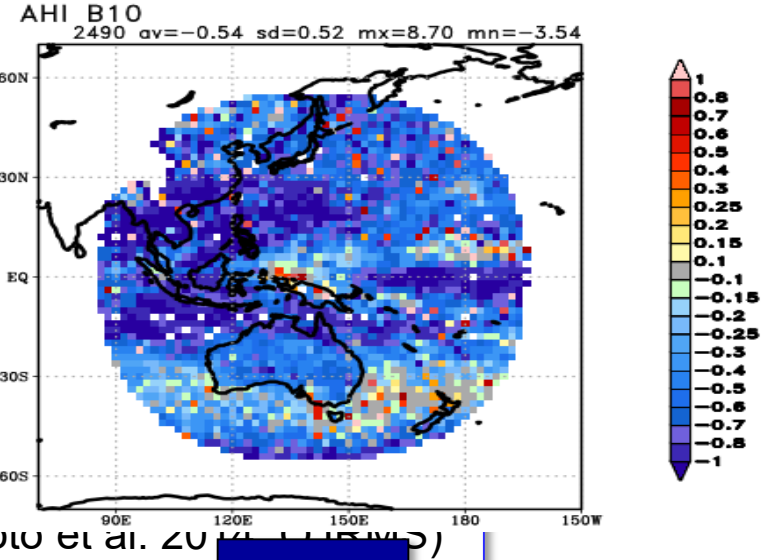
# 1. Objective

- Improve analysis & forecast by assimilating IR ASR in JMA's **global system**
  - Start with **Himawari-8** (and will expand to other IR sensors on Geo/Leo satellites)
  
- 1. Examine the reproducibility of ASR simulations from JMA global model
  - Okamoto et al. 2021 QJRMS
- 2. Develop ASR assimilation processings
  - **Cloud-dependent Quality Control (QC), Bias Correction (BC), obs error model,,,**
- 3. Assess impacts of ASR assimilation relative to CSR assimilation

## 2. Development of ASR assimilation

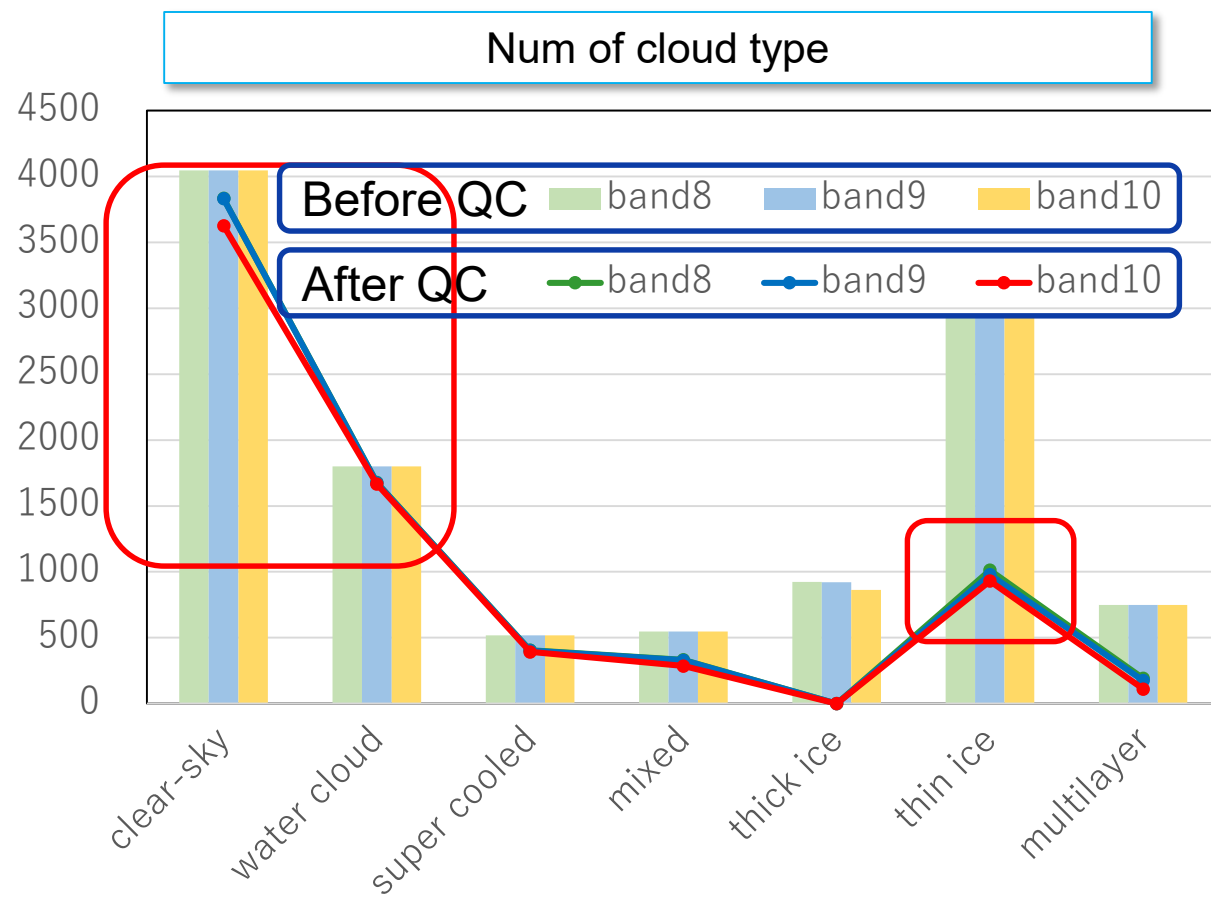
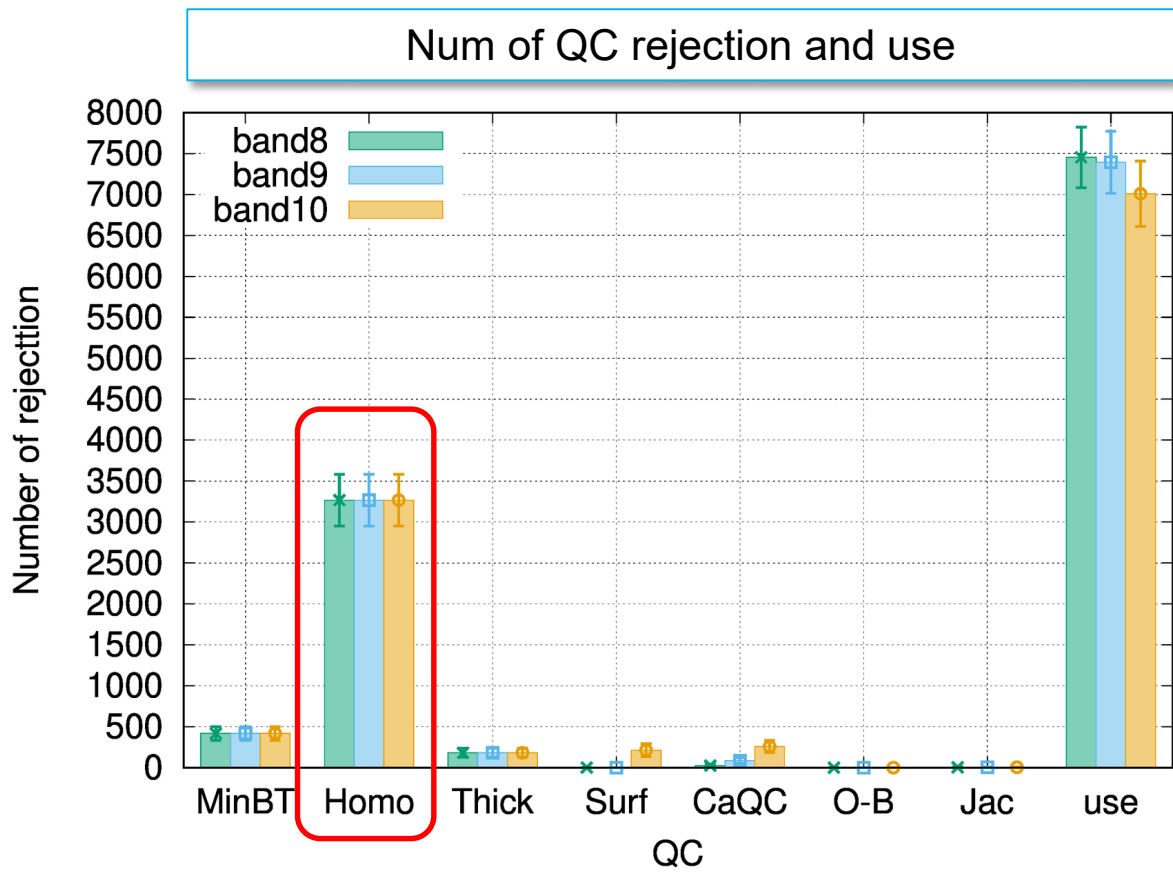
### 2-1. Quality Control (QC) and Bias Correction (BC)

- QC removes scenes poorly simulated:
  - low observed BT (BT13<230K), thick ice, large land sensitivity
  - **high inhomogeneity** (standard deviation BT13>5K),
  - **large cloud-affected (CA-QC)**, large O-B, inconsistent btw inner/ou
- → O-B becomes more symmetric (and Gaussian) safer QC but negative bias remains
- → Bias correction (VarBC)



# 2. Development of ASR assimilation QC

- Homogeneity check plays major role
- ASR adds obs in water clouds and thin ice clouds to clear-sky obs

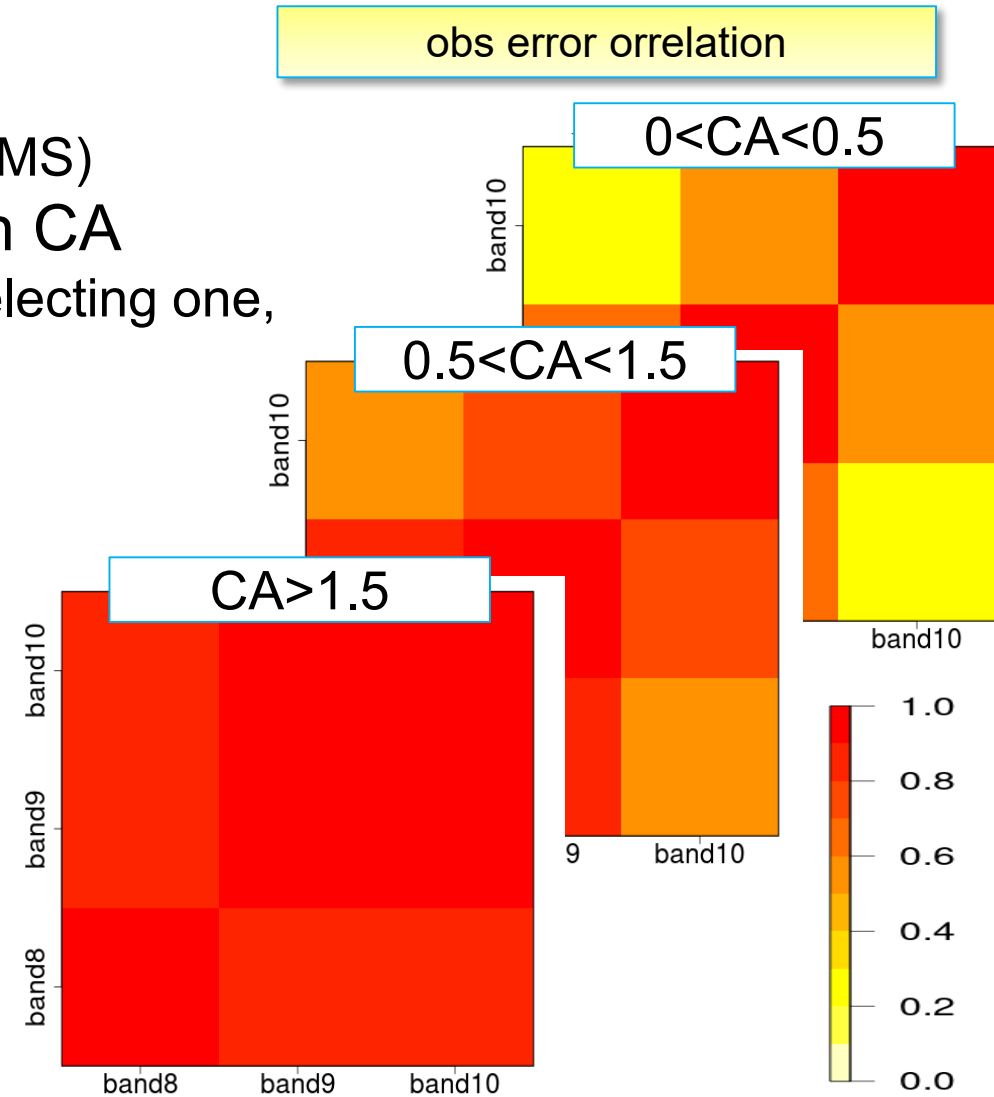
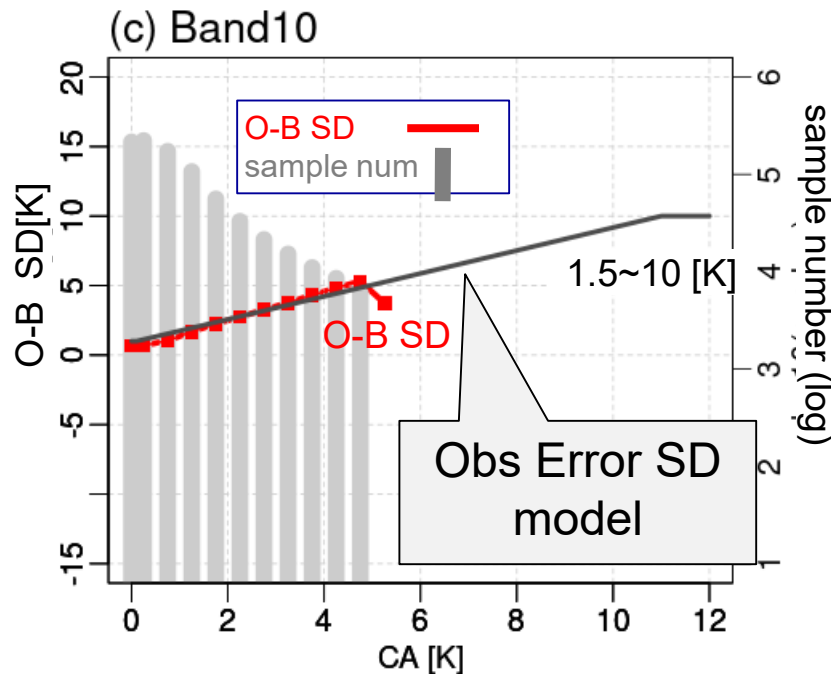


## 2. Development of ASR assimilation

### 2-2. Obs error covariance model

- O-B variability can be predicted with a simple function of CA
- Obs error standard deviation (SD) is modeled with a linear stepwise function of CA
  - Geer & Bauer (2011, QJRMS); Okamoto et al. (2014, QJRMS)
- Evident inter-band error correlation, increasing with CA
  - → Account for cloud-dependent obs error correlation by selecting one, according to CA, from 3 correlation matrices precalculated

O-B SD and obs error SD model at band10



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# 3. Data assimilation experiment

## ■ Assimilation system

- Operational global DA system of JMA (as of Dec. 2019)
- Hybrid-4DVar
  - ▣ 4DVar + LETKF, TL959L100 (20km grid), MW ASR assimilation
    - RTTOV13.0

## ■ Obs Configuration

- **CNTL**: Same as the operational configuration (Himawari-8/**CSR**)
- **TEST**: Assimilate Himawari-8/**ASR**, instead of CSR
  - ▣ All the WV bands (8,9,10), 220km thinning
  - ▣ CSR is assimilated for GOES and MSG in all the experiments

## ■ Period

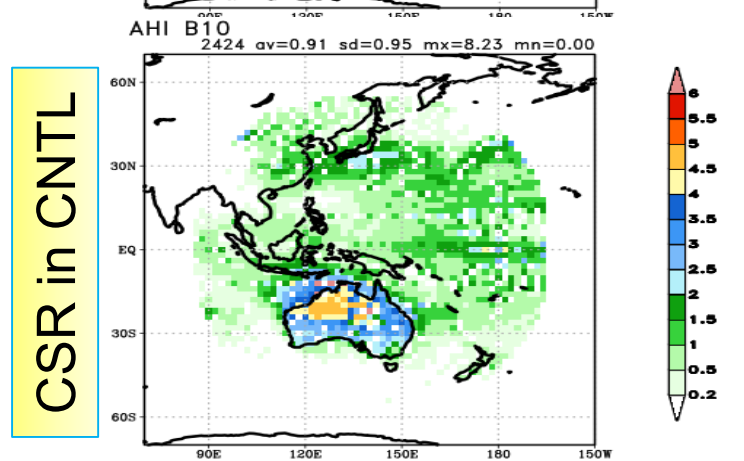
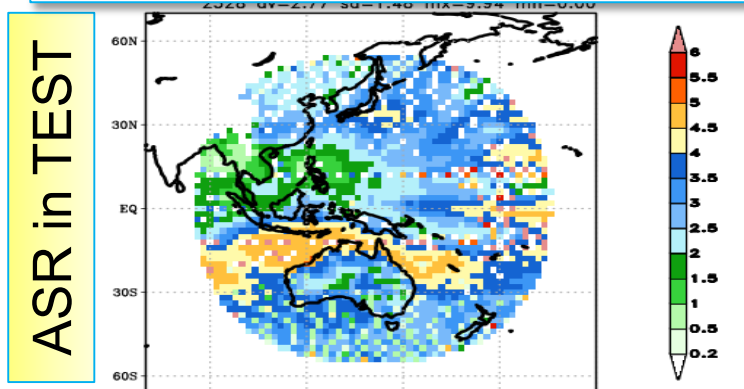
- Analysis: 10 Jul. – 17 Sep. 2020
- Forecast: 12UTC, 20 Jul. – 6 Sep. 2020,

### 3. DA experiment

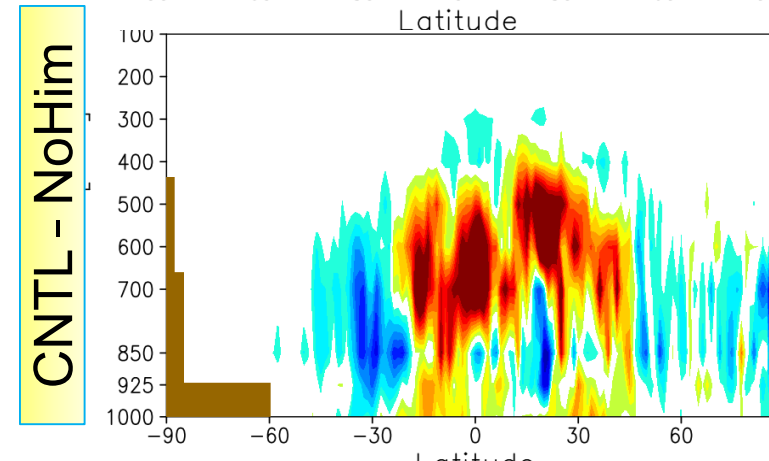
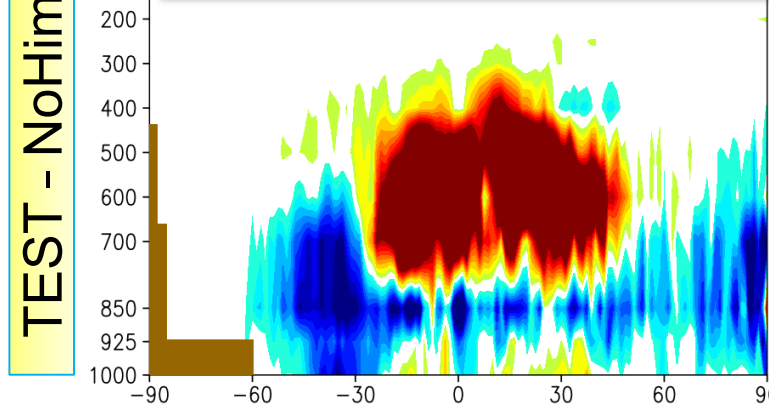
## 3-1. Change in number of used data and humidity analysis

- ASR is more numerous and homogenous than CSR: 21,840 vs 7,802 (2.8 times)
- ASR increase mid- and upper tropospheric humidity more than CSR
- → More effectively reduce dry bias than CSR

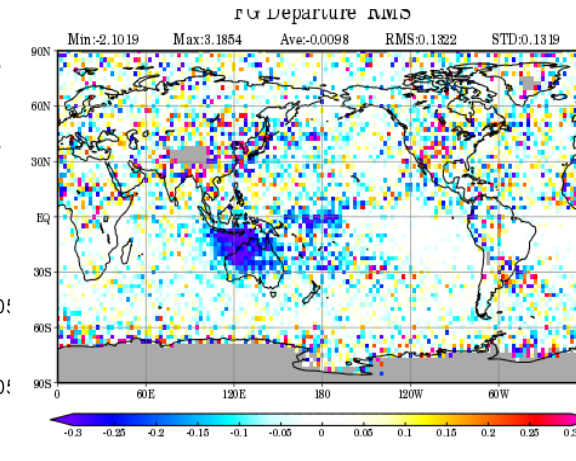
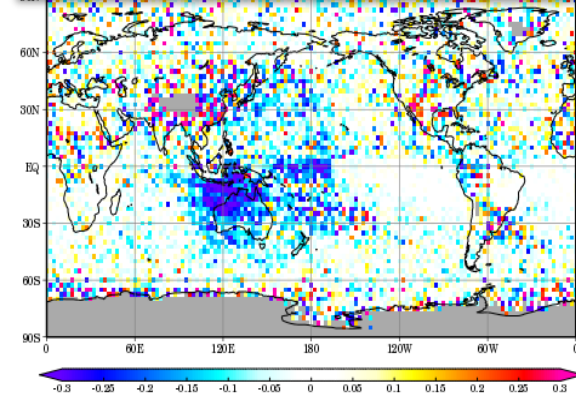
Averaged num of assimilated data



Humidity analysis [g/kg]

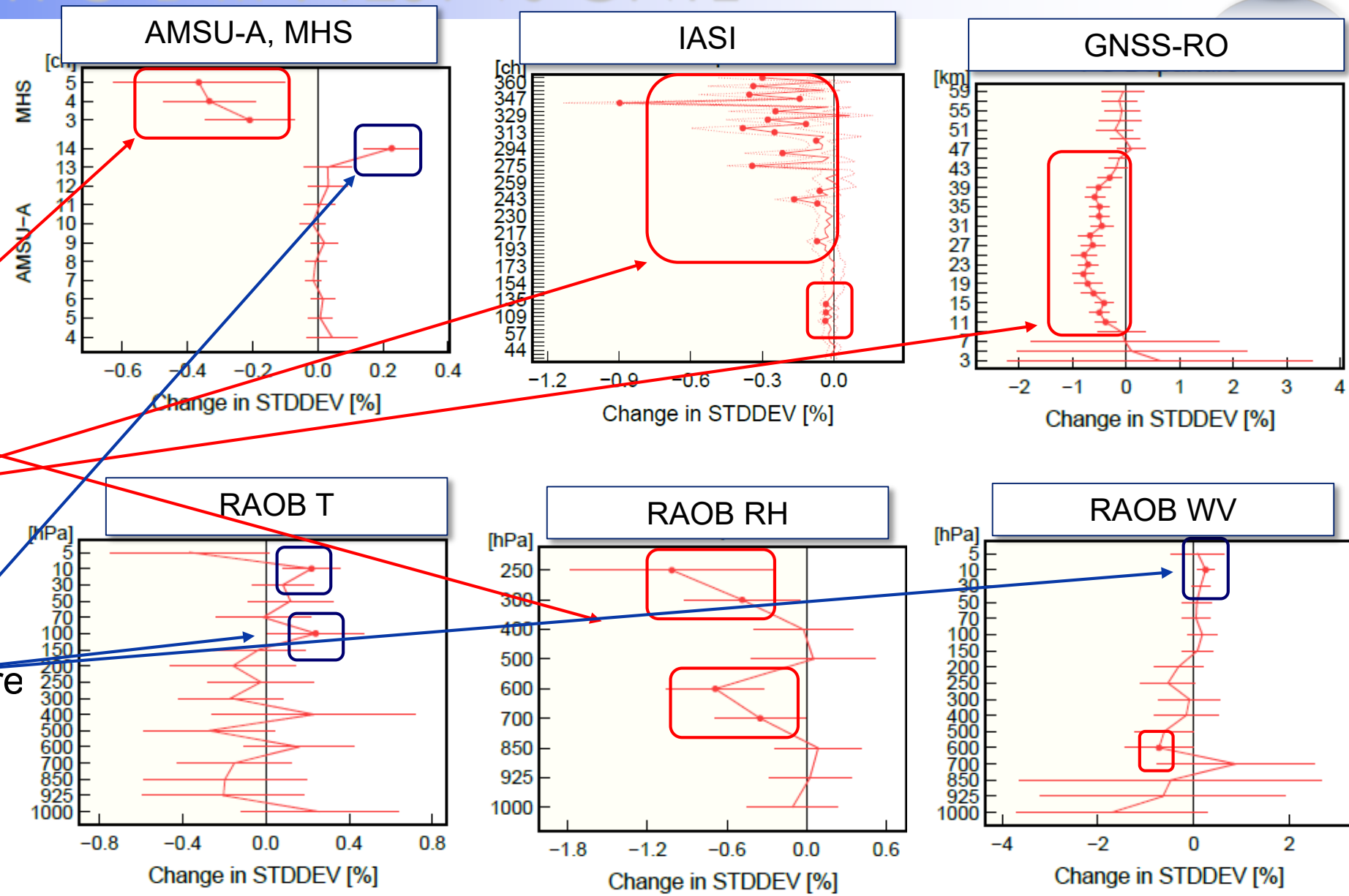


O-B SD in MHS ch4 [K]



## 3-2. Impact on O-B fit : TEST vs CNTL

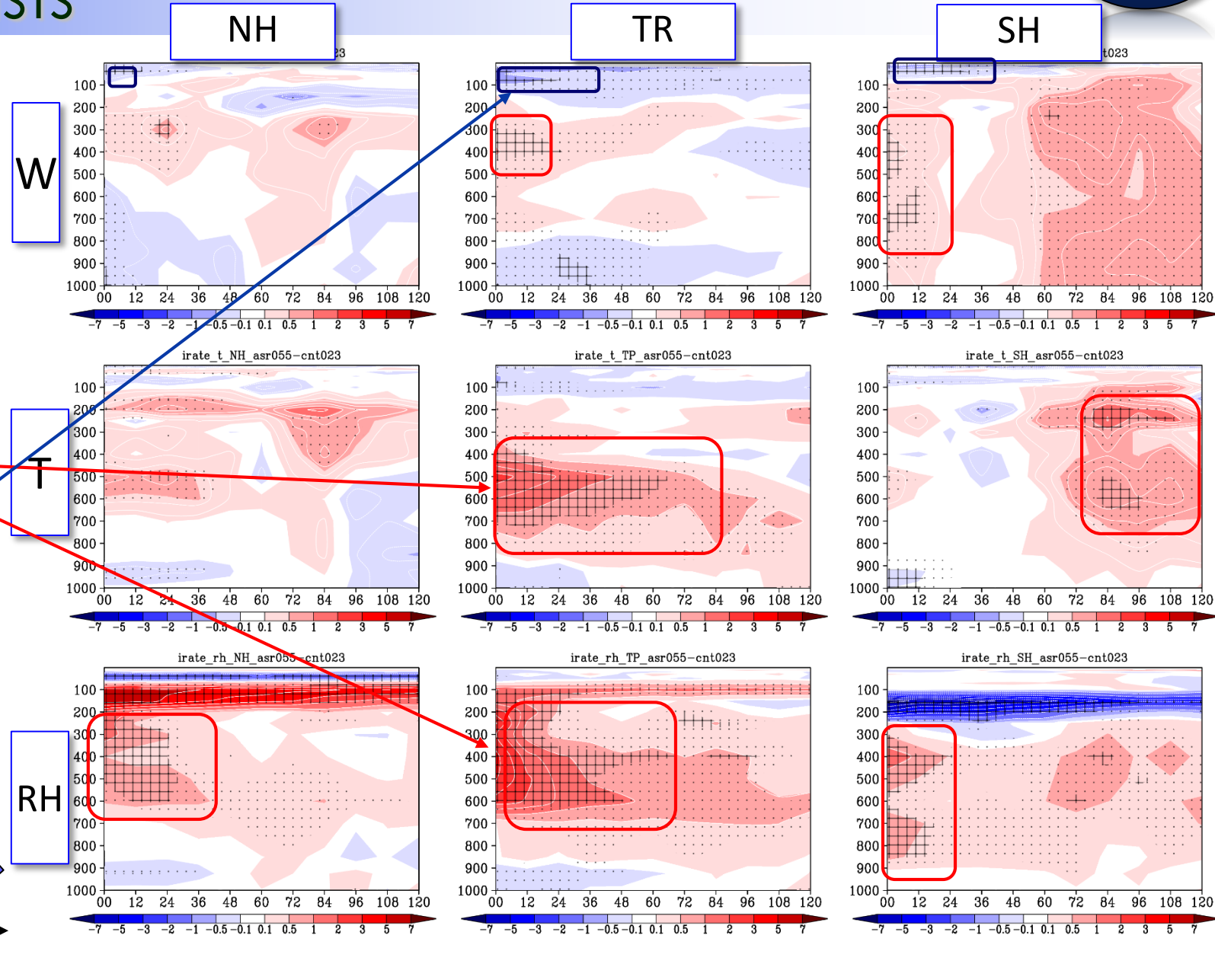
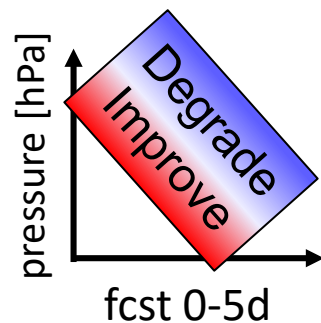
- Global O-B fit difference
  - Negative means ASR better improve background than CSR
- Significant improvement
  - Mid- and upper-tropospheric humidity
    - MHS, RAOB
  - Tropospheric Temperature
    - IASI, GNSS-RO
- Degradation in upper stratospheric temperature and wind
  - AMSU-A, RAOB



# 3. DA experiment

## 3-3. Impact on forecasts

- Forecast improvement rate (TEST vs CNTL)
  - Warmish (Positive) shade means ASR improves forecast over CSR
- Improvement in mid- and upper-tropospheric humidity and temperature up to 48-h especially in Tropics
- Degradation in stratospheric wind

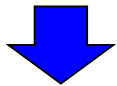


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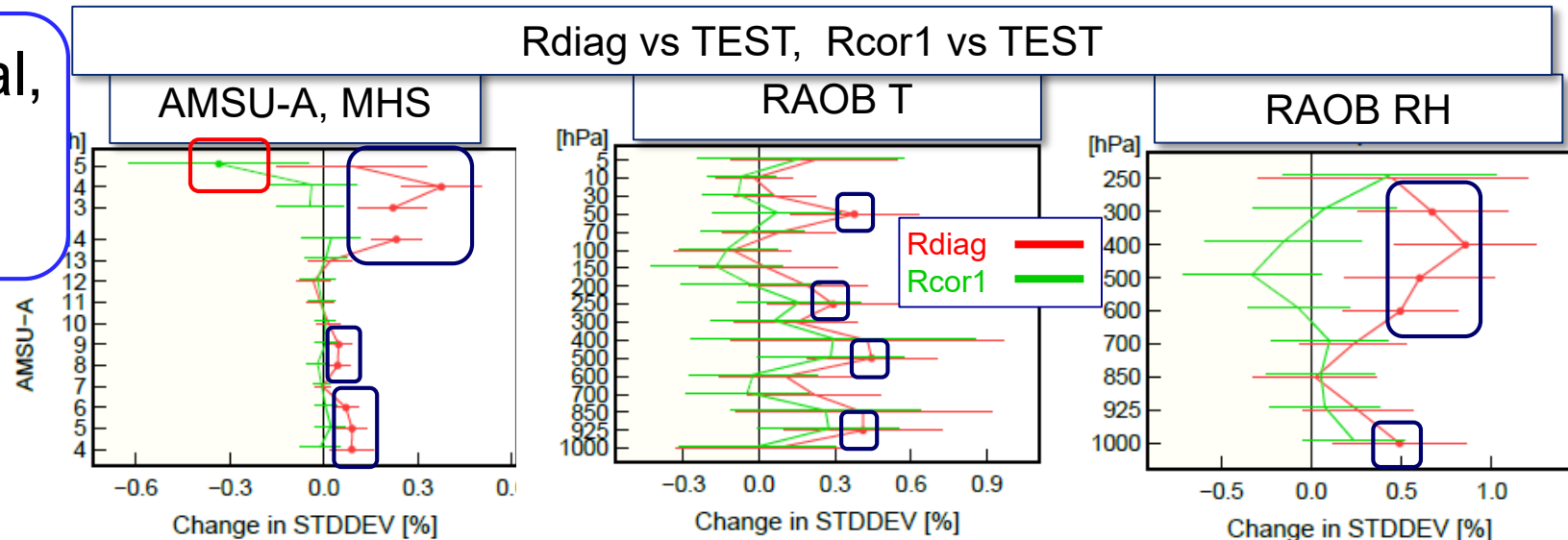
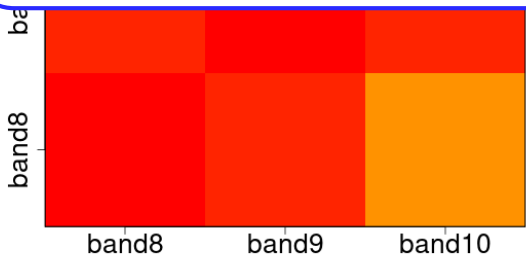
# 4. Additional impact studies cloud-dependency of obs error covariance

- Compare TEST (cloud-dep obs error covariance (both SD and correlation)) with
- **Rdiag**: Cloud-dep. SD but no correlation (diagonal R)
  - Significant degradation
  - → Inter-band correlation is critical when using multiple WV bands
- **Rcor1**: Cloud-dep. SD but fixed correlation
  - Not significant difference or slightly better
  - → Cloud-dep. of error correlation is not as critical as that of SD

	SD	corr
TEST	cld.dep	cld.dep
Rdiag	cld.dep	no corr
Rcor1	cld.dep	No cld.dep (fixed)



Inter-band correlation is critical, but its cloud dep. is not as important as SD



# 4. Additional impact studies cloud-dependency of BC

## ■ Examine VarBC predictors

■ Ref: **CSR BC** =  $c_1 * Bclr + c_2 * 1/\cos(\theta) + c_3$

■ TEST: **BC** = **CSR BC** +  $c_4 * CA + c_5 * CA^2$

## ■ **BC1**: Equivalent to CSR: **BC** = $c_1 * Bclr + c_2 * 1/\cos(\theta) + c_3$

■ Coefficients calculated from samples with O-Bclr > 1K

■ → Significant degradation

## ■ **BC2**: Obs-based predictors (Otkin & Potthast 2019):

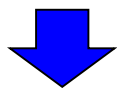
**BC** =  $c_1 * O + c_2 * O^2 + c_3 * O^3 + c_4 * 1/\cos(\theta) + c_5$

■ → Equivalent skills as TEST

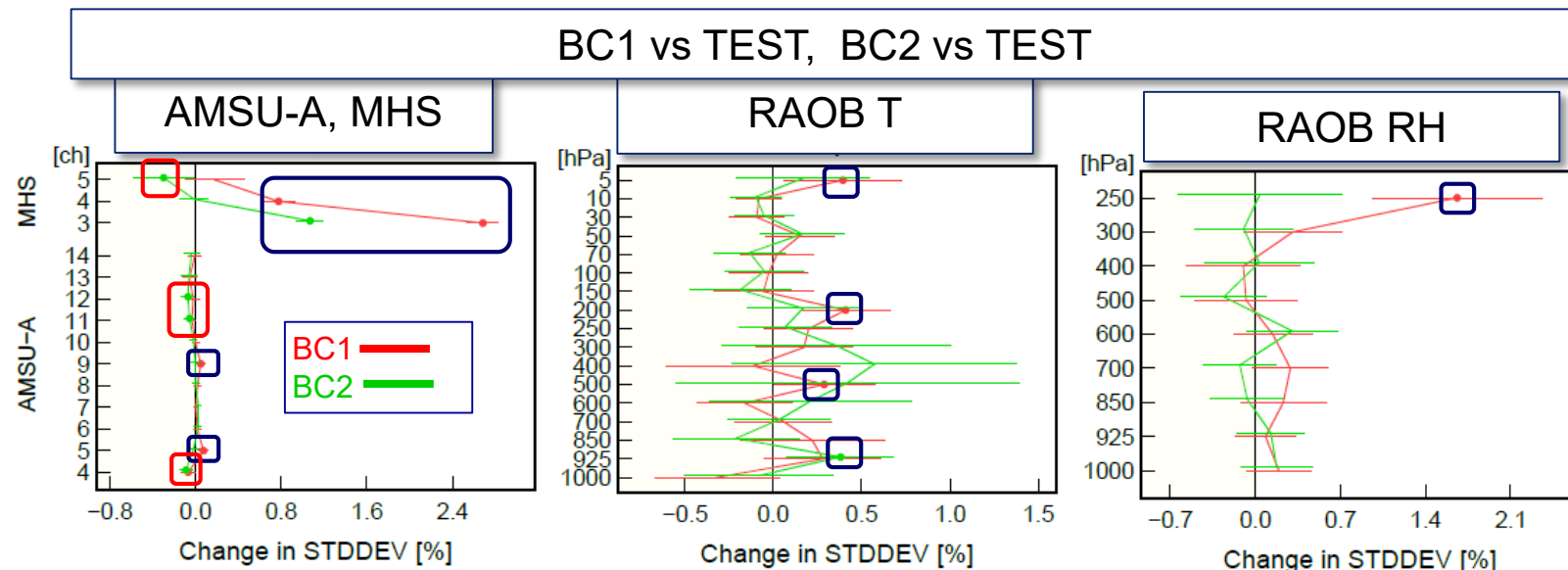
$\theta$ : sat. zenith angle

Bclr: clear-sky background BT

O: all-sky obs BT



Cloud-dep predictors are important in the presence of significant O-B bias



# 4. Additional impact studies

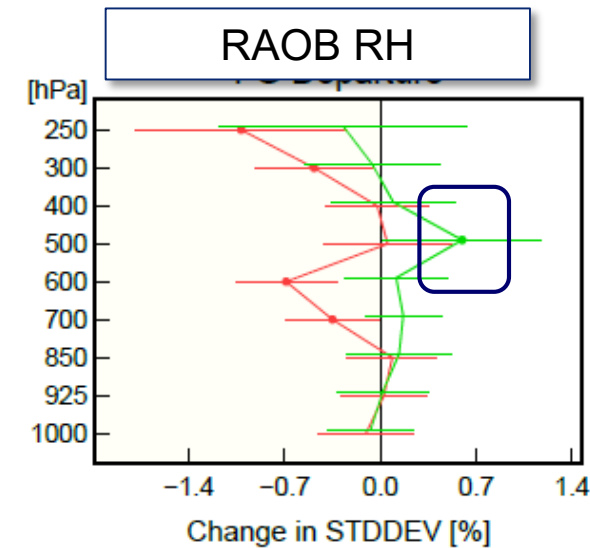
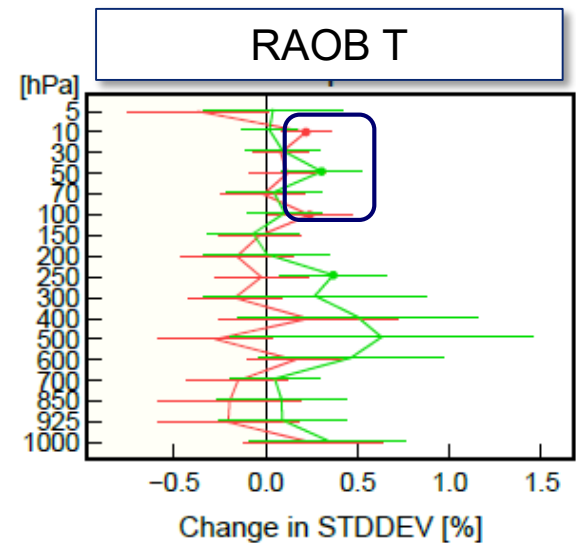
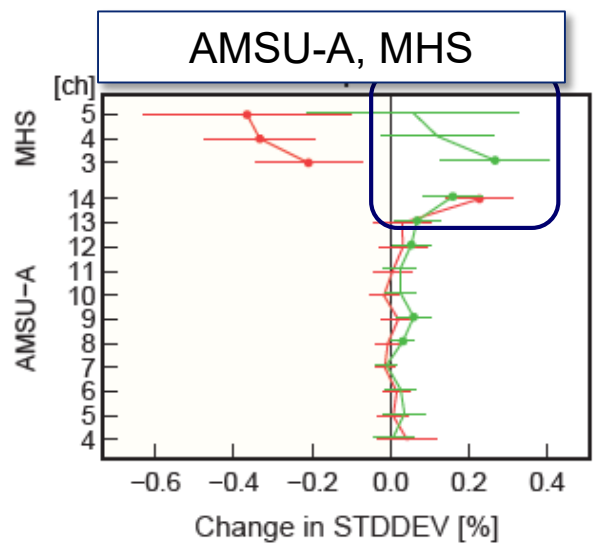
## 1-band ASR vs 3-band CSR/ASR

- **TEST**: Assimilate ASR at bands 8, 9 and 10
- **BND9**: Assimilate ASR at only band 9
- As many previous studies did in regional DA systems

	band8	band8	band10
CNTL	CSR	CSR	CSR
TEST	ASR	ASR	ASR
BND9	N/A	ASR	N/A

Single band ASR assimilation was inferior to multiband CSR assimilation, not to mention multiband ASR assimilation

TEST vs CNTL,  
BND9 vs CNTL



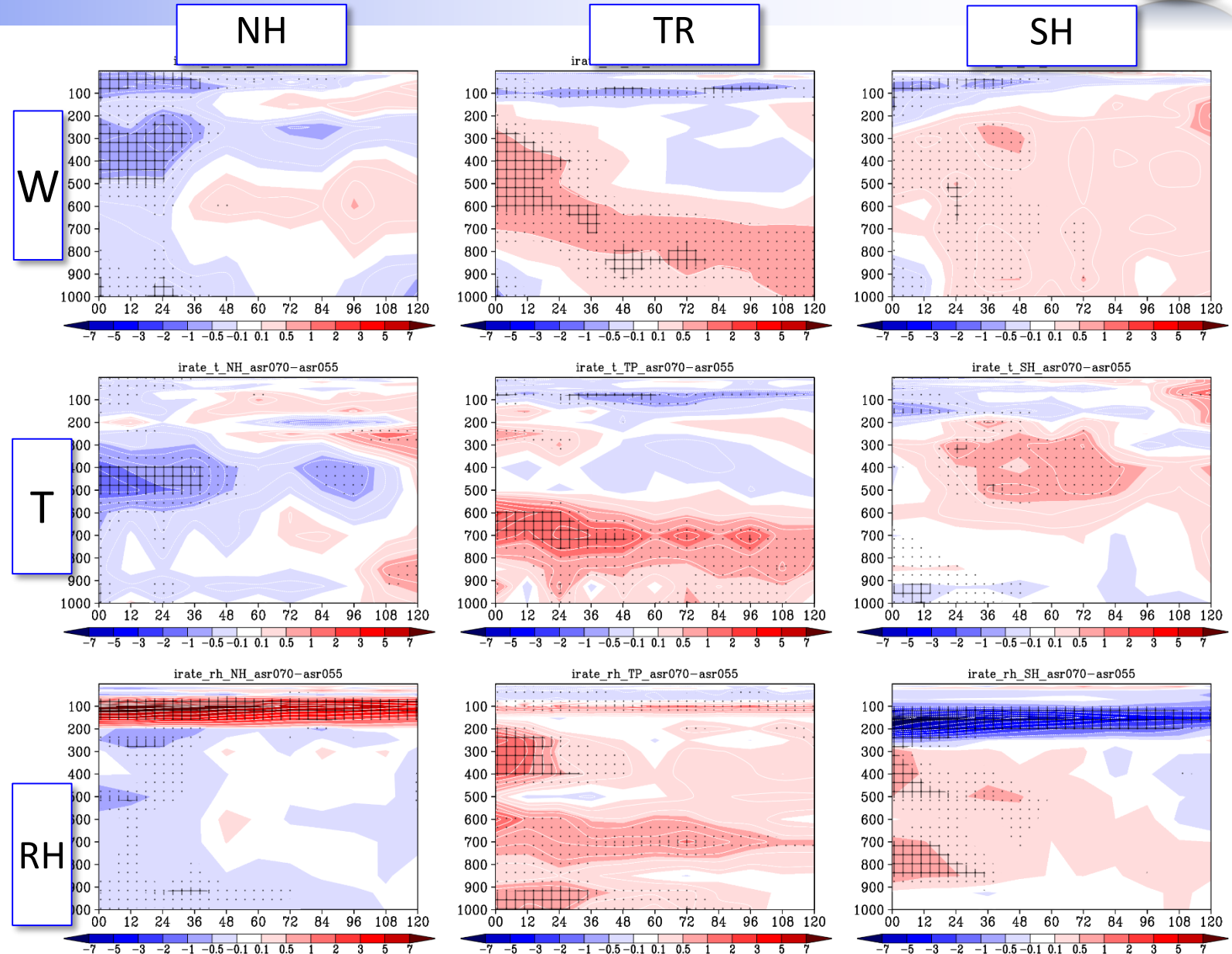


# 5. Summary and plans

- Developed IR all-sky radiance assimilation in global data assimilation system
  - Cloud-dependent QC, BC and obs error covariance model
- ASR assimilation, relative to CSR assimilation
  - Significantly increase observations assimilated by 2.8 times
  - Increase mid- and upper tropospheric humidity to better alleviate dry bias than CSR assimilation does
  - Improve short-range forecast (~48h) of Q, T and W in the mid- and upper troposphere, especially in Tropics
  - Degrades stratospheric T and W
- Sensitivity experiments
  - Single band ASR is inferior to multiband CSR, not to mention multiband ASR
  - Obs error correlation and cloud-dep SD are important, but cloud-dependency of correlation is not so much.
  - Cloud-dep BC predictors are essential in the presence of large (negative) O-B bias
- Ongoing studies and Plans
  - Assess impacts of ASR from GOES and MSG
  - Extend the development to meso-scale DA and hyperspectral IR sounders

# Preliminary experiments with ASR of all Geo ASR (Him+MSG+GOES)

- vs Him8 ASR + MSG+GOES CSR
- Significant improvement in winds, temperature and humidity in tropics and SH
- But degradation in NH
- Fewer ASR over land due to much stricter QC and poorer treatment of land skin temperature than CSR



# Backup Slides

## 2. Development of ASR assimilation

### 2-2. Bias Correction (BC)

- **BC**: Apply variational BC (VarBC) to mainly correct the negative O-B
  - Add CA and CA<sup>2</sup> to CSR predictors
  - To avoid excessive correction, **CA-QC** excludes samples that could be substantially affected by model bias
- Remaining bias can be negligible because of large **obs error** assigned

