



# 2019 International Workshop on Radiative Transfer Models for Satellite Data Assimilation



## Assimilation of Surface Sensitive Radiances in GRAPES

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# Outline

## ● Background

- Progress of GRAPES
- Analysis Uncertainty Over Asia
- Key Issues in Satellite Radiance Assimilation: **Emissivity**

## ● Progress

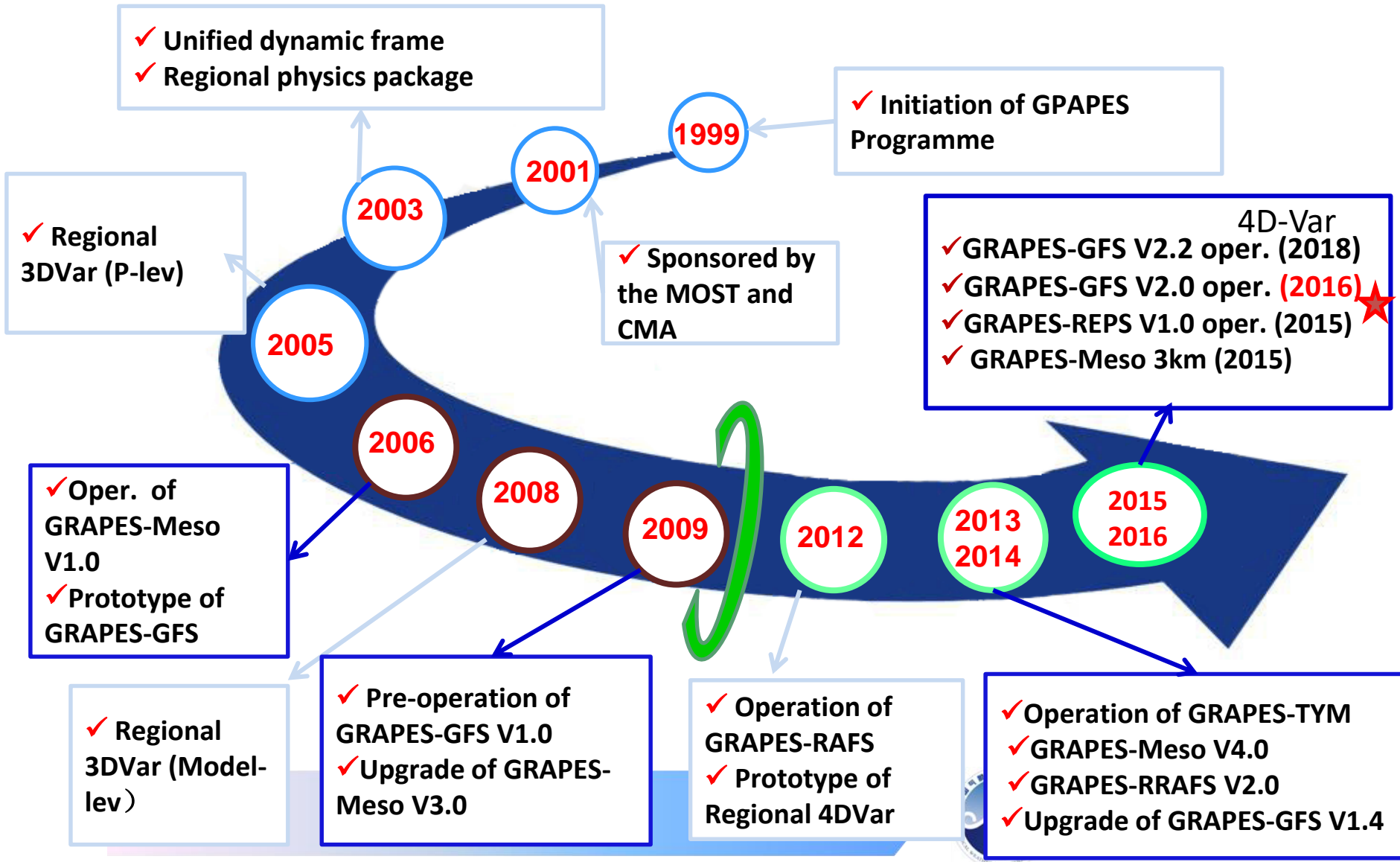
- Emissivity physical model, datasets , retrieval
- Impact on O-B
- Impact on analyses and forecasts using satellite radiances over land

## ● Future Plan

- Use of more FY3、FY4 and other Satellite observations effectively
- Focus on Tibetan Plateau and Sahara Desert

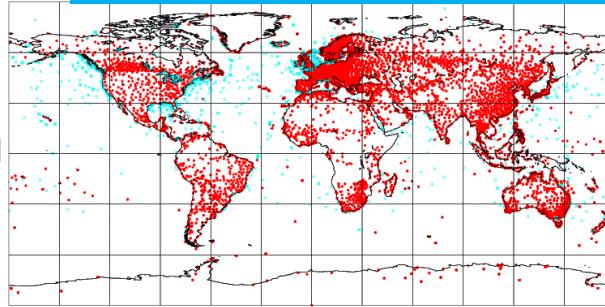
# Milestones of GRAPES

**GRAPES** = **G**lobal/**R**egional **A**ssimilation **P**r**E**diction **S**ystem

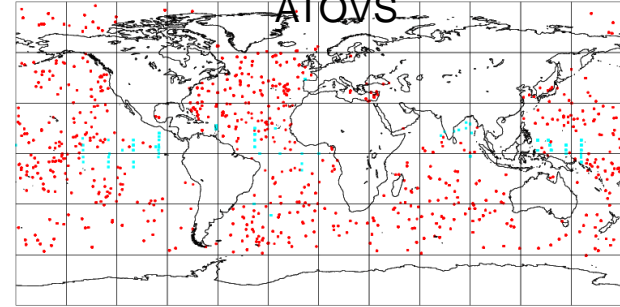


# Observations in GRAPES-GFS Data Assimilation (-3h~+3h) Time Window

Synops and ships

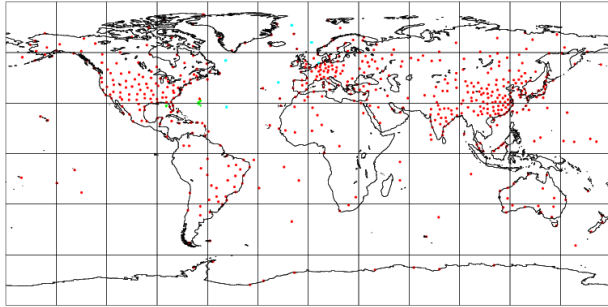


Buoys

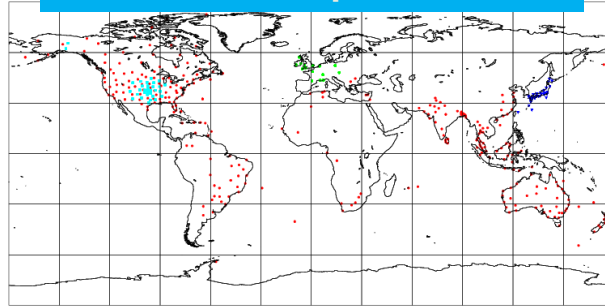


ATOVS

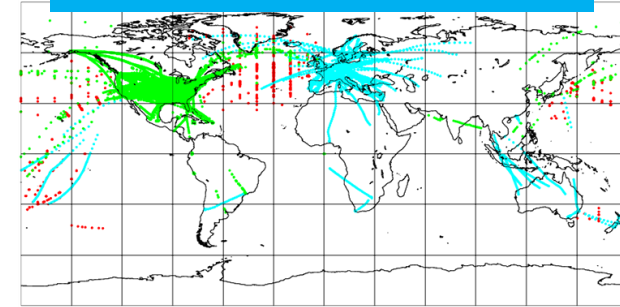
Radiosondes



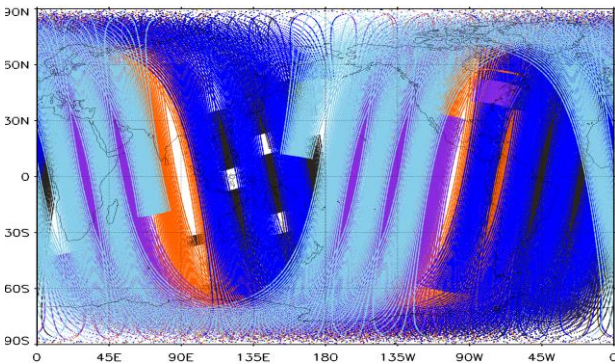
Pilots and profilers



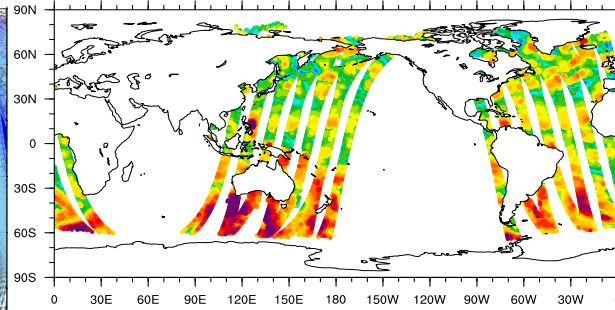
Aircraft



Polar(AMSU,ATMS)

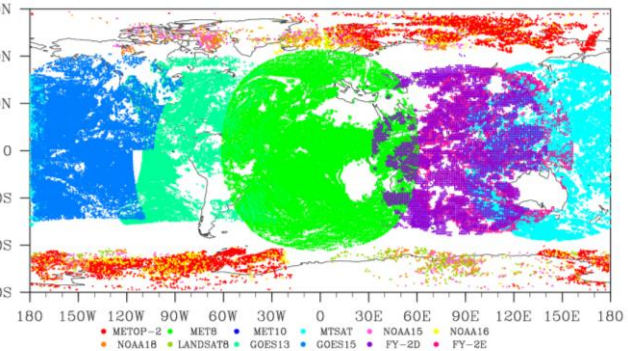


METOP-A & -B/ASCAT 2014070100

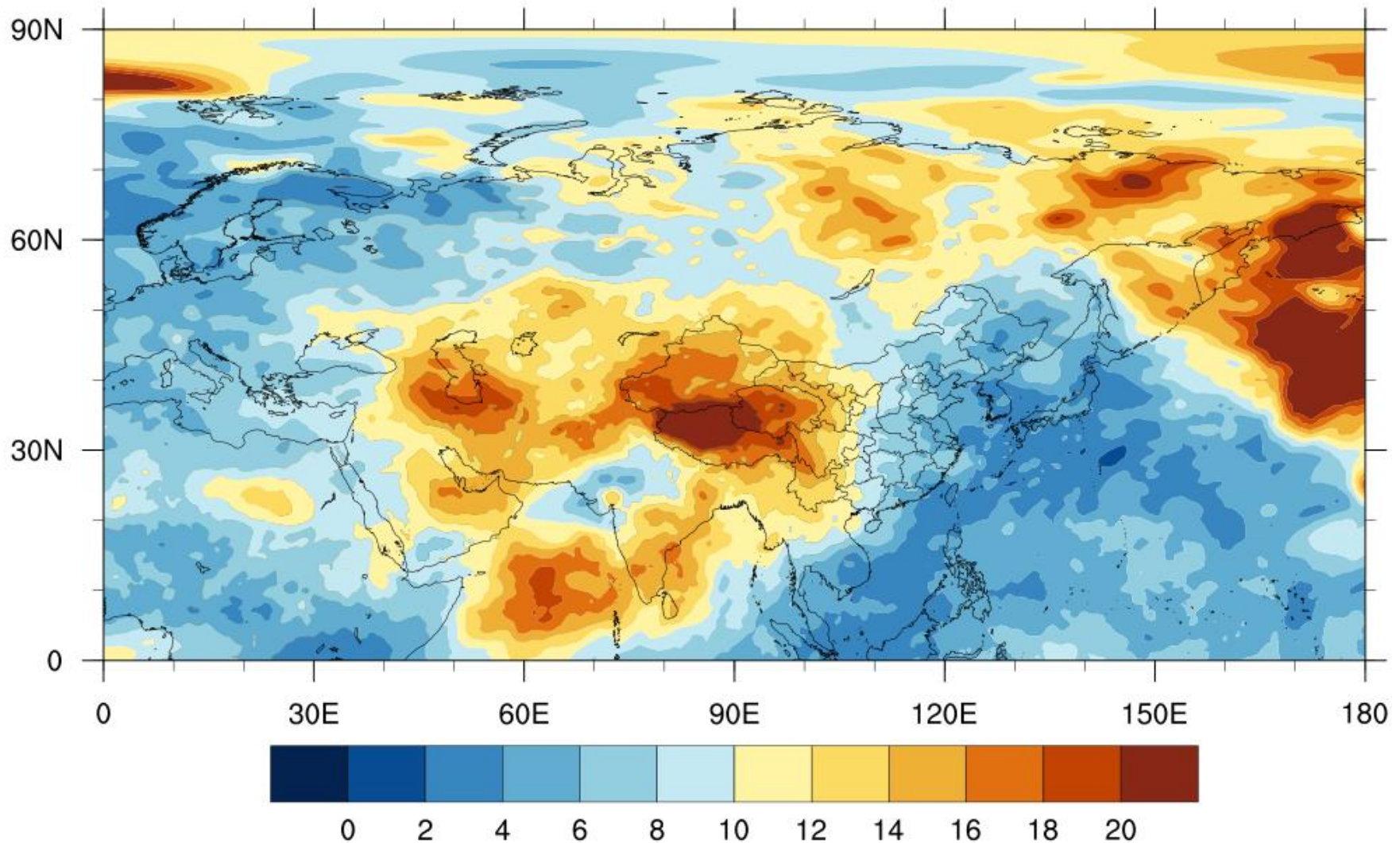


GRAPES Data Coverage(All obs DA)-AMV IR

total number of obs =247146

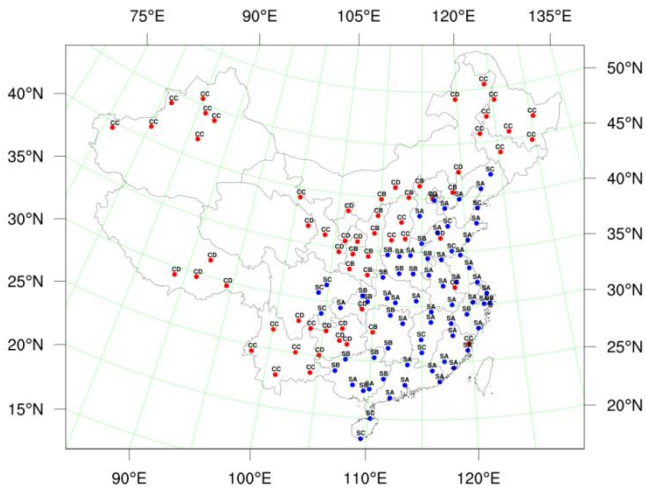


# Analysis Uncertainty Over East Asia(500hPa)



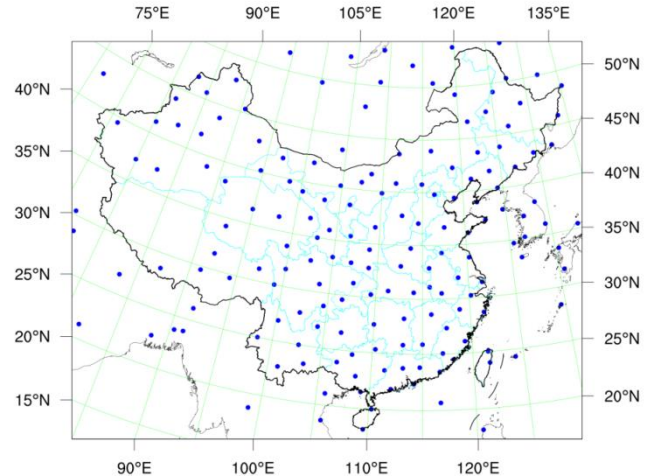
Mean RMS(H\_GRAPES-H\_ECMWF) at 500hPa for July 2016.

### Radar Stations Map

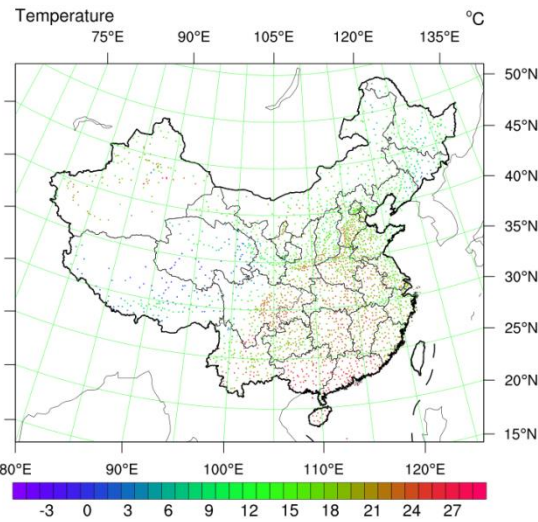
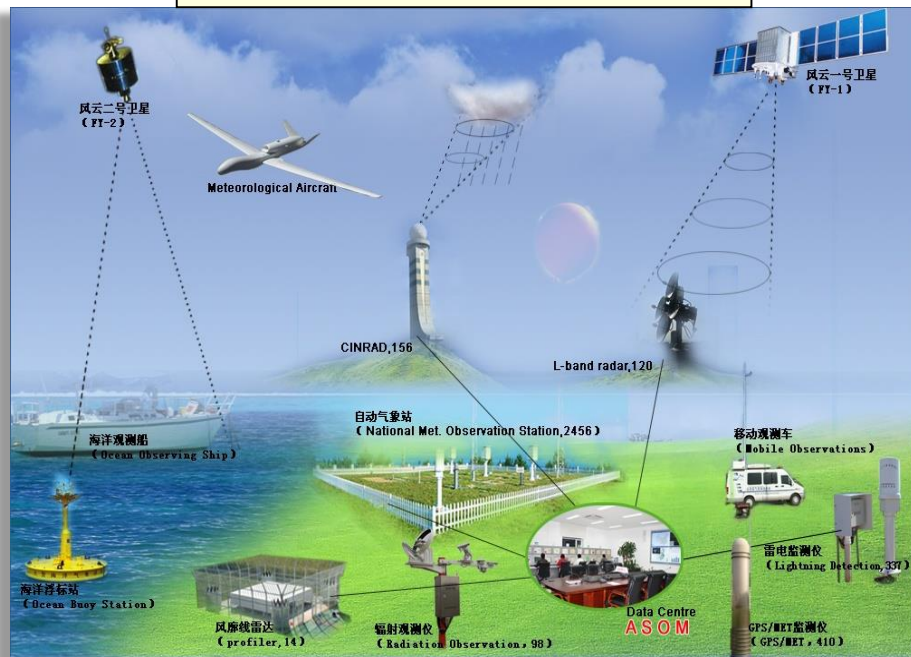


Weather Radar

### Raob Stations



Sonde station

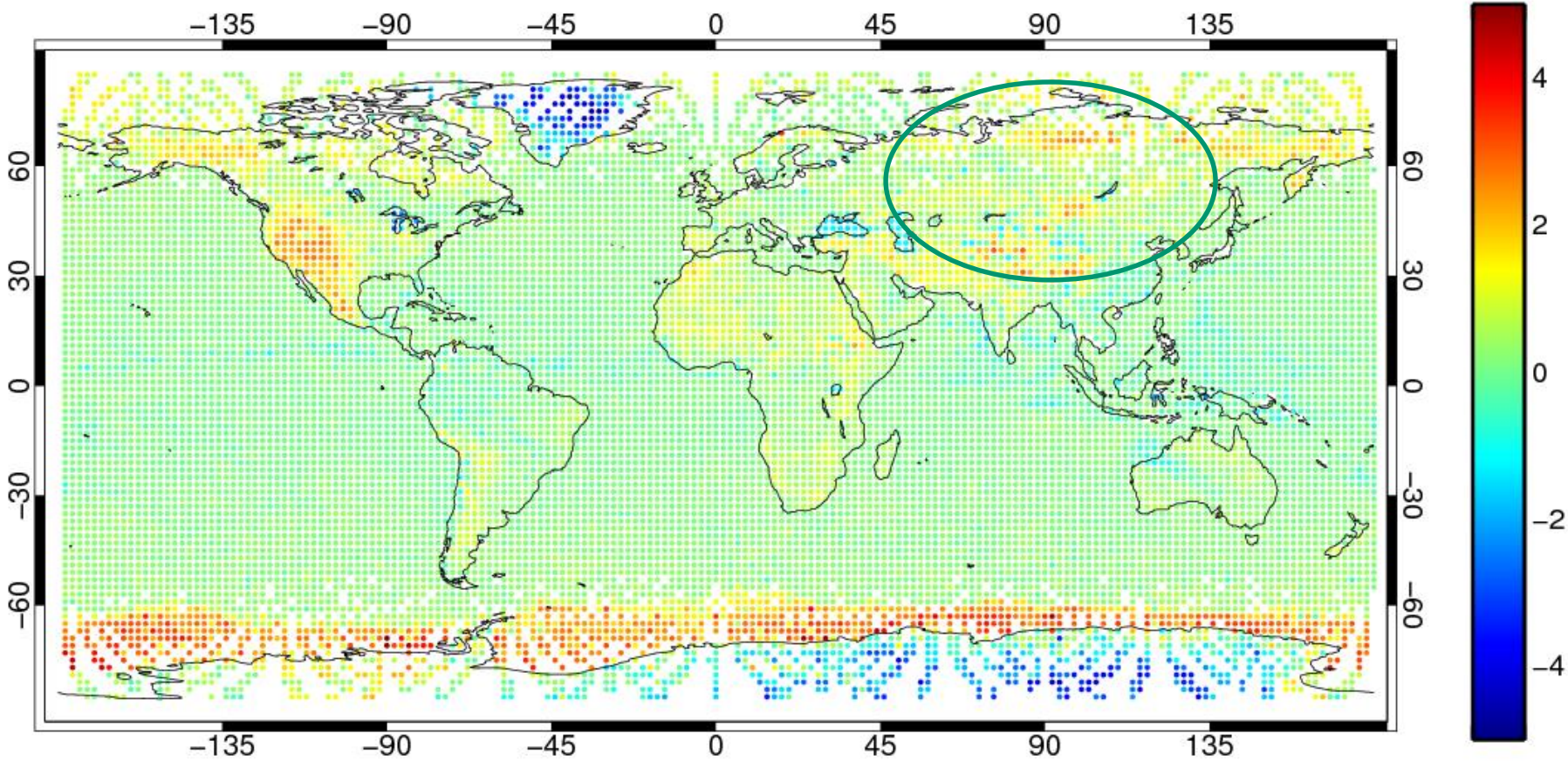


Surface Station

# Large O-B over Land (2013/6/1~ 2013/6/10)

GRAPES

Ch5: 700hPa(WF peak)



2\*2 degree box mean

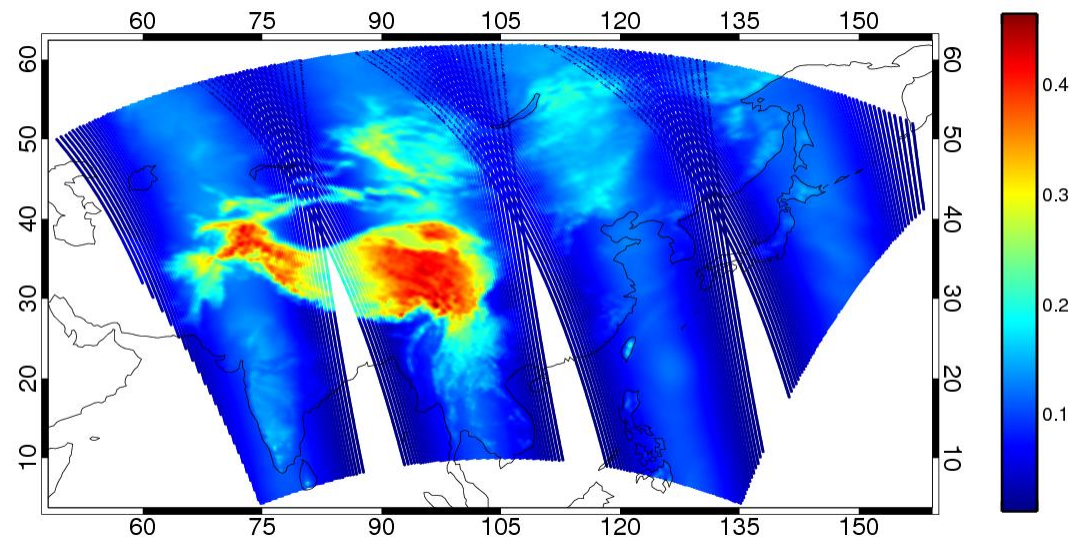
# Atmospheric Transmittance

- Sounding channels

(Temperature and moisture)

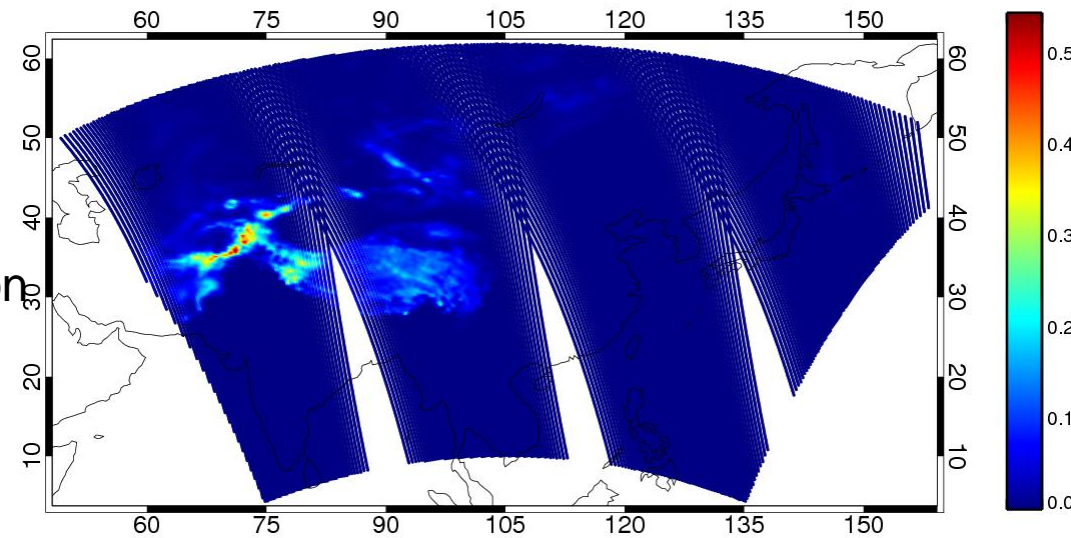
- Tibetan Plateau

Contribution from land surface need to be modeled accurate enough  
For extracting atmospheric information



Temperature Sounding

Ch7, 54.4GHz, 400hPa



Moisture Sounding

Ch19,  $183.31 \pm 4.5$ GHz, 700hPa



# Brightness Temperature Sensitivity to Surface Emissivity

Courtesy of Dr. Banghua Yan

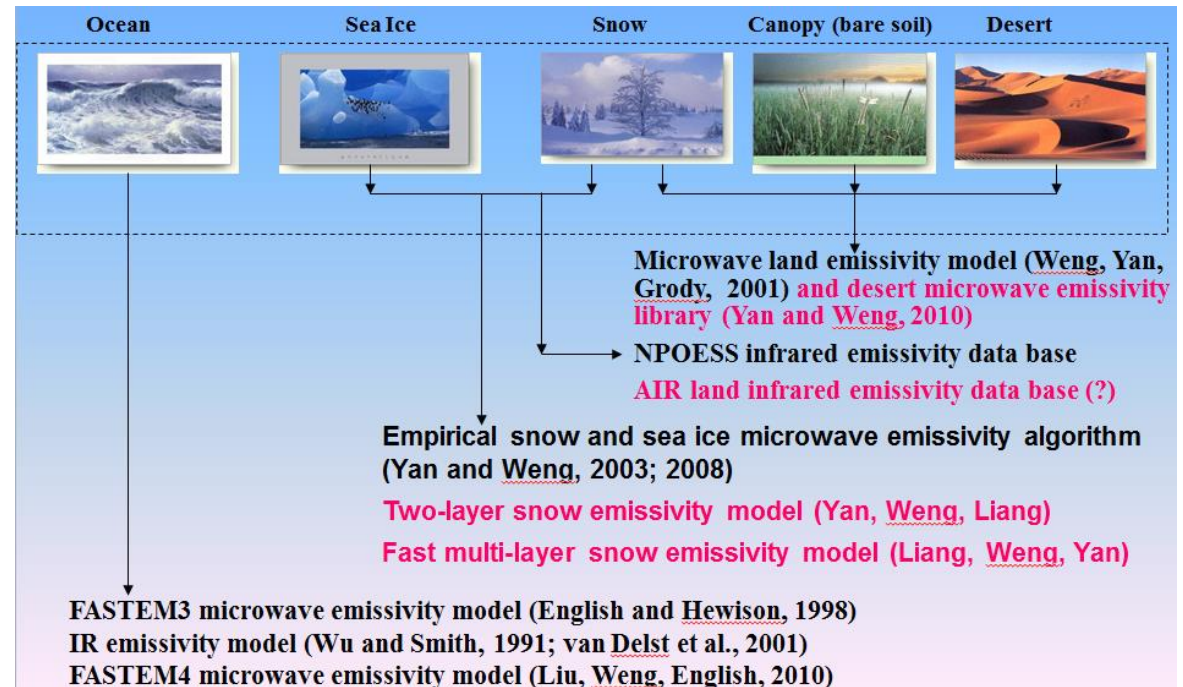
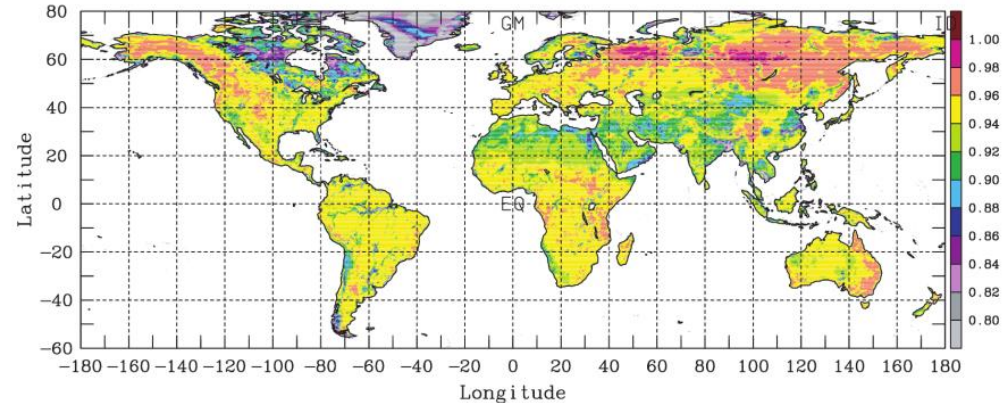
Freq (GHz)	T <sub>s</sub> = 230 K and TPW = 0.5 mm					
	P <sub>s</sub> = 600 (mb)			P <sub>s</sub> = 1000 (mb)		
	T <sub>d</sub> (K)	τ	ΔT <sub>B</sub> (K)	T <sub>d</sub> (K)	τ	ΔT <sub>B</sub> (K)
50.3	49.30	0.774	5.593	112.5	0.487	2.289
52.8	111.2	0.492	2.337	188.6	0.153	0.253
150	4.4	0.980	8.844	12.5	0.944	8.209
183.3±7	16.6	0.925	7.893	43.5	0.807	6.018
183.3±3	55.3	0.750	5.242	104.1	0.538	2.709
183.3±1	134.6	0.392	1.496	160.1	0.288	0.806

$$\Delta T_B = \tau(T_s - T_d)\Delta\varepsilon \quad \Delta\varepsilon = 0.04$$

# Three main techniques for land emissivity in NWP

- Physical model (Weng)
- Datasets (Catherine)
- Window channel retrieval

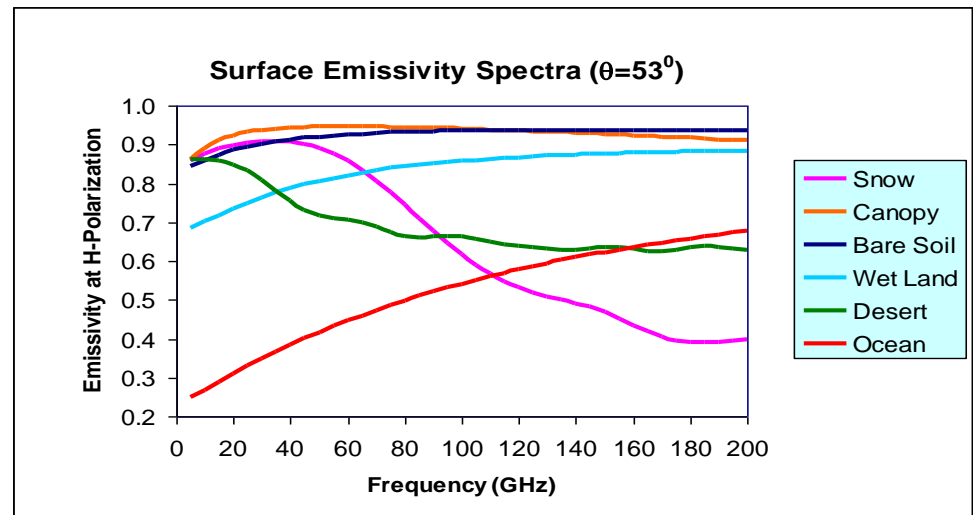
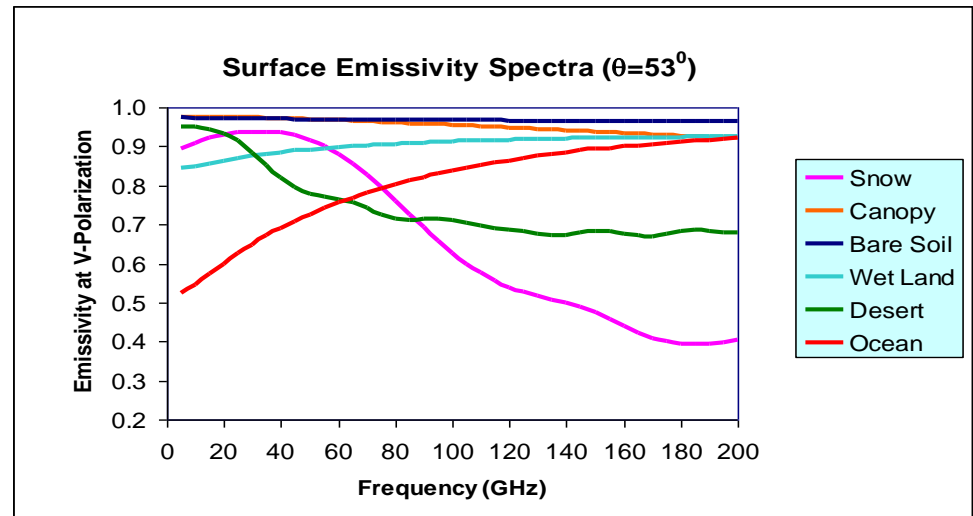
$$\varepsilon_{\alpha} = \frac{R_{\alpha} - R_u - \tau R_d}{\tau(R(T_s) - R_d)}$$



# Surface Emissivity Spectrum vs. Surface Type

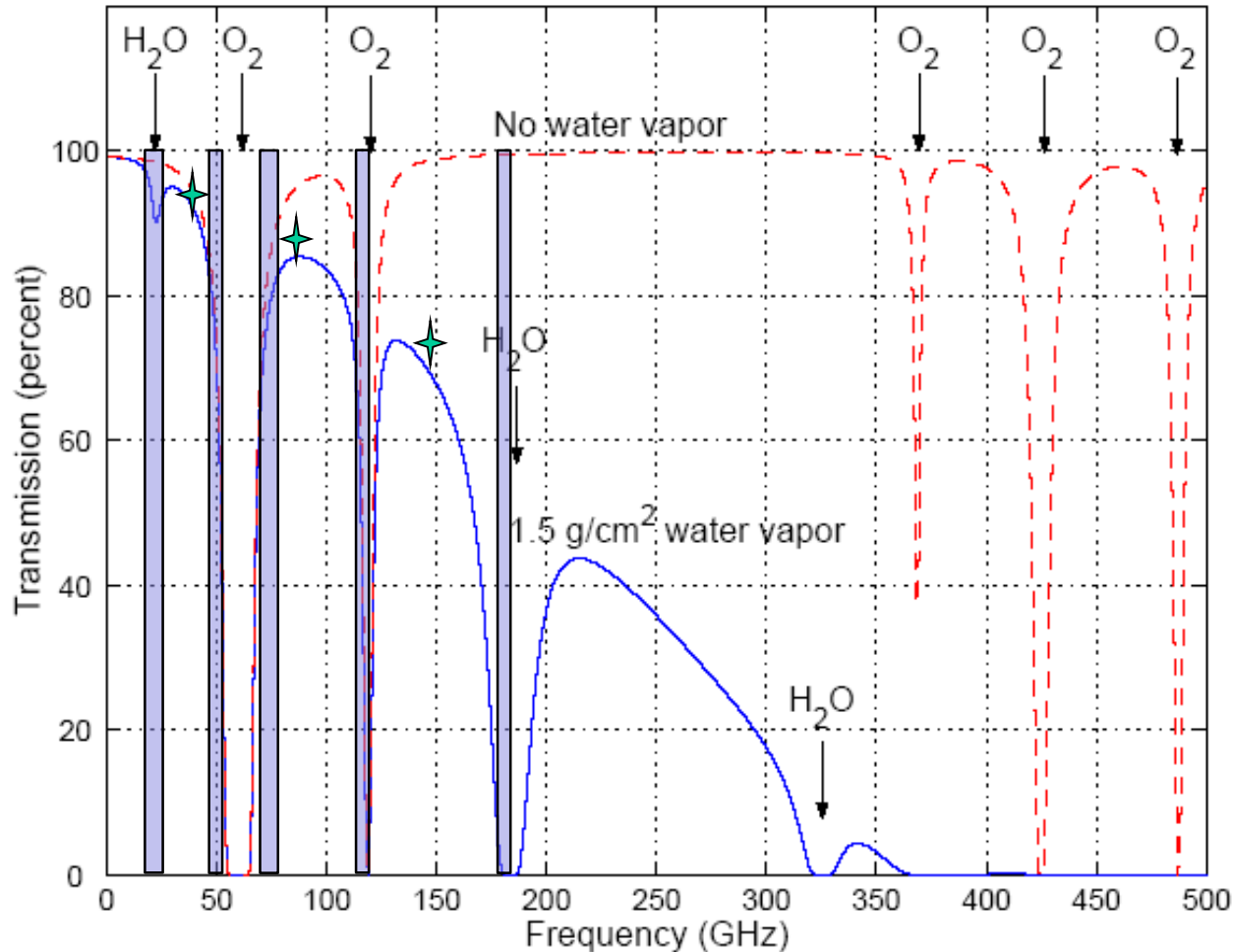
- **Open water** – two-scale roughness theory
- **Sea ice** – Coherent reflection
- **Canopy** – Layer clustering scattering
- **Bare soil** – Coherent reflection and surface roughness
- **Snow/desert** – Random media

Weng et al (2001, JGR)



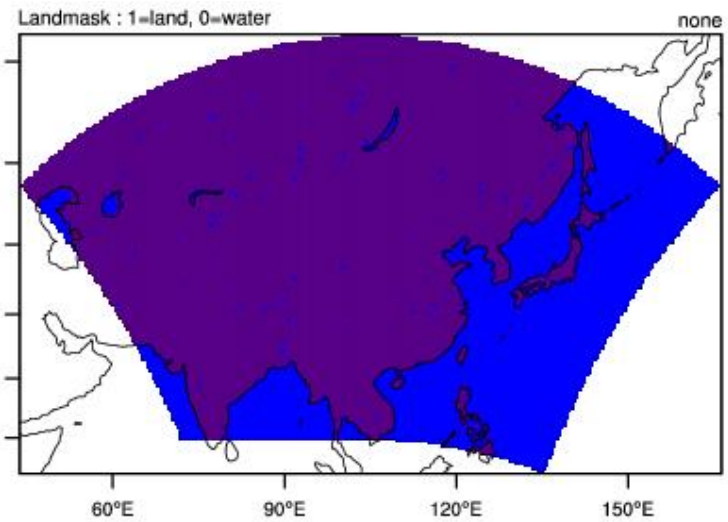
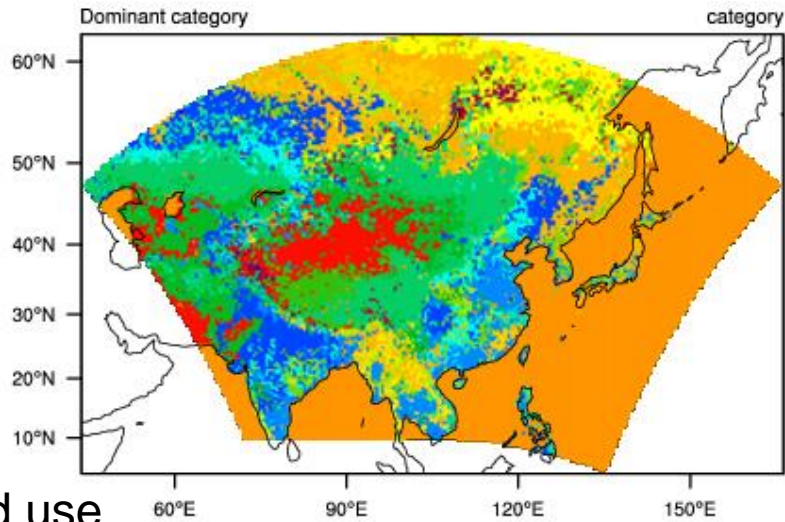
# Atmospheric Transmission at Microwave Wavelengths

$$\varepsilon_{\alpha} = \frac{R_{\alpha} - R_u - \tau R_d}{\tau(R(T_s) - R_d)}$$

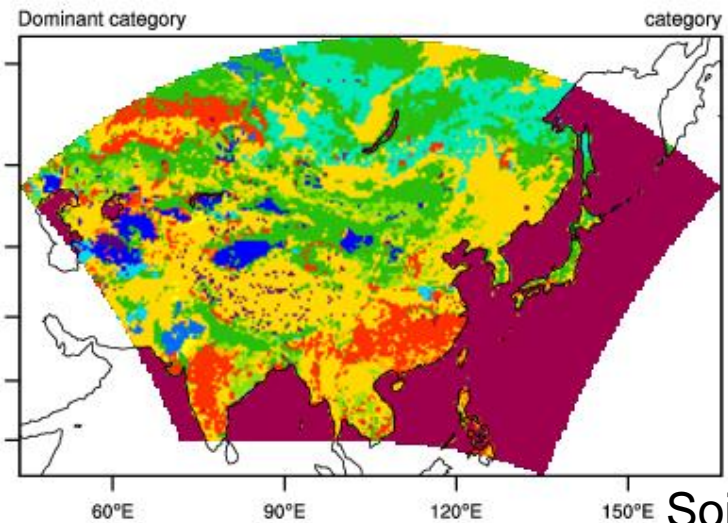
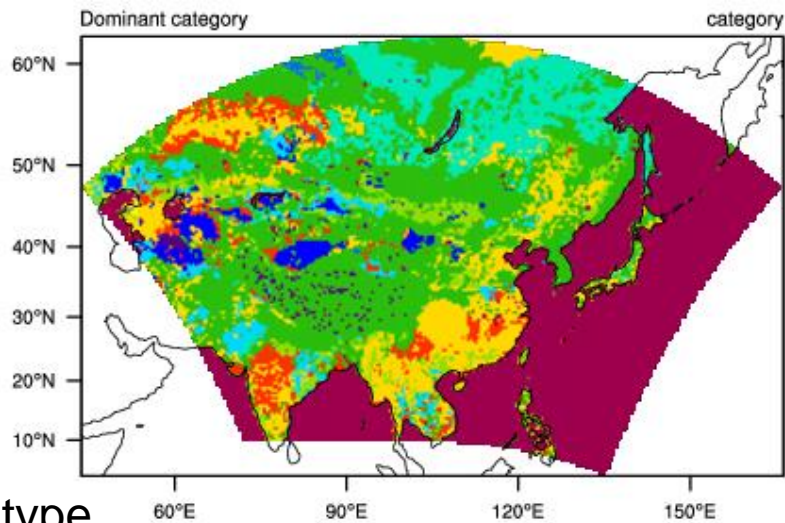
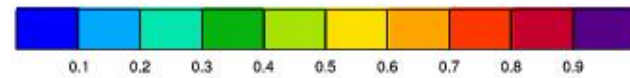
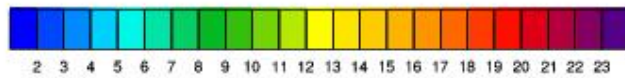


Using the window channel to retrieve the emissivity, interpolated to nearby frequency channels

# Land use and soil category



Land use



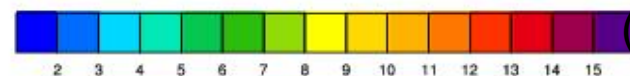
Soil type

(0-30CM)

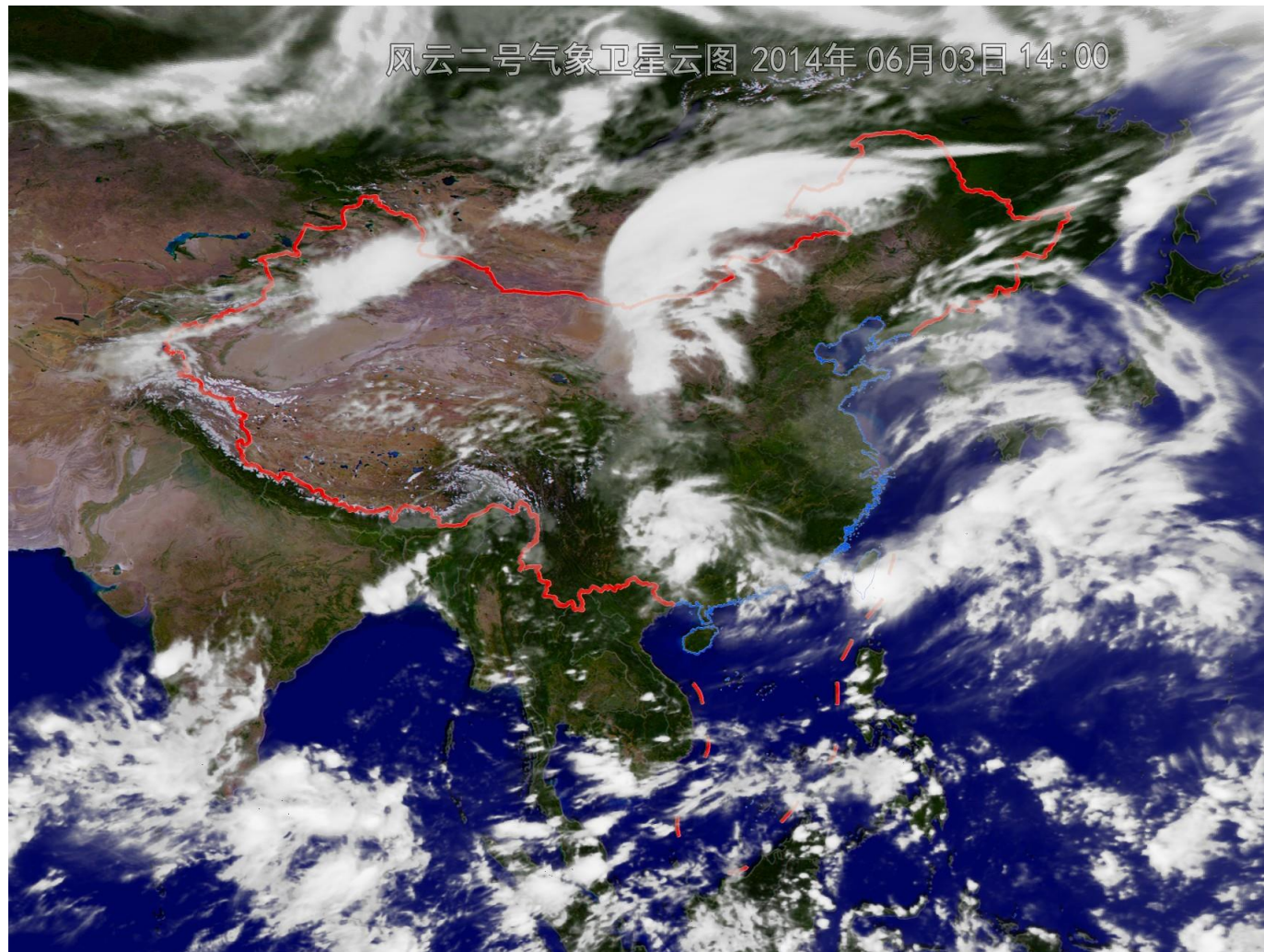


Soil type

(30-60CM)

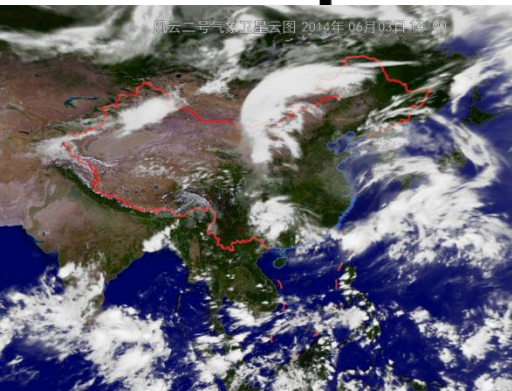
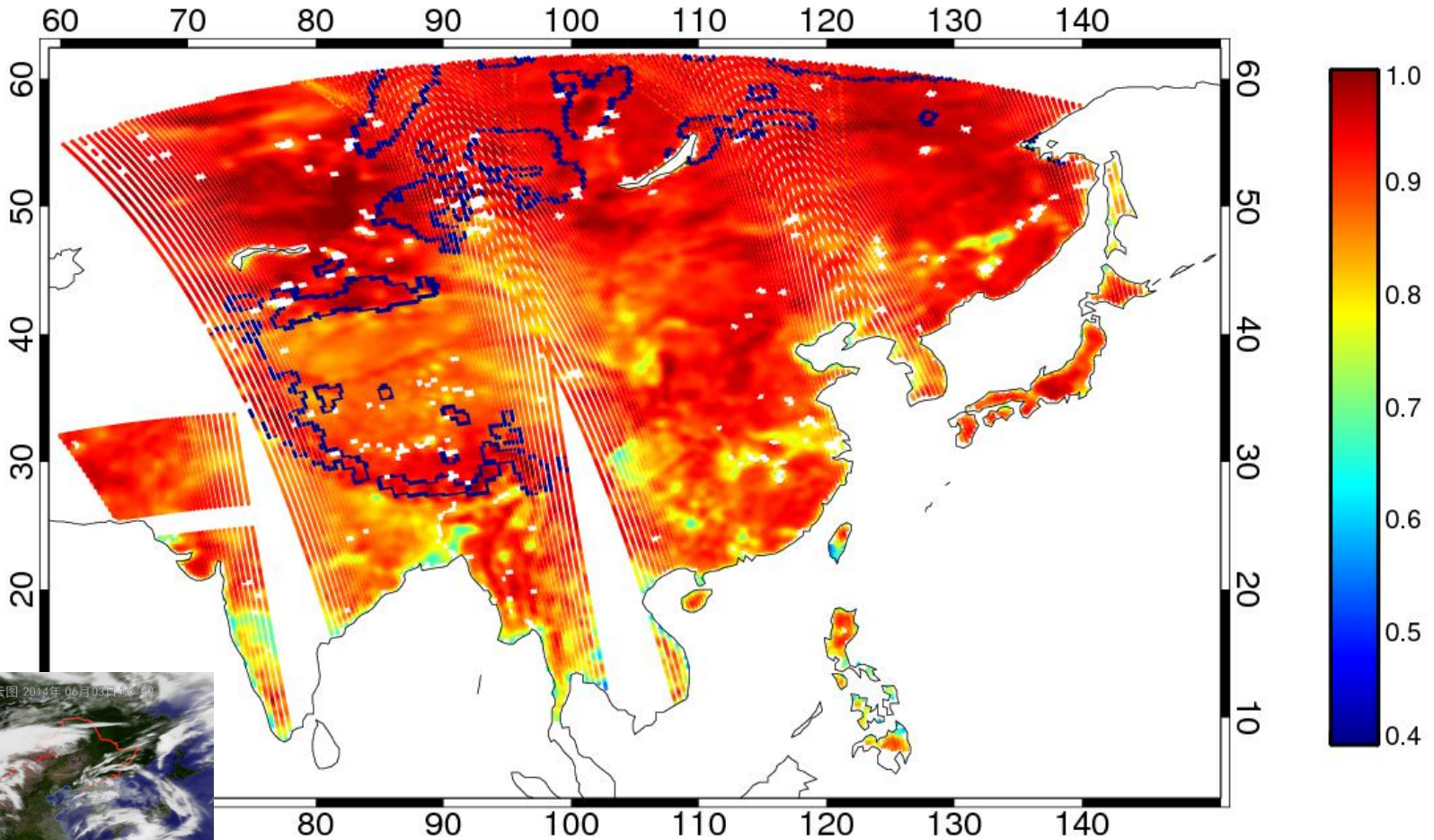


# Case study: 06Z 3 June, 2014



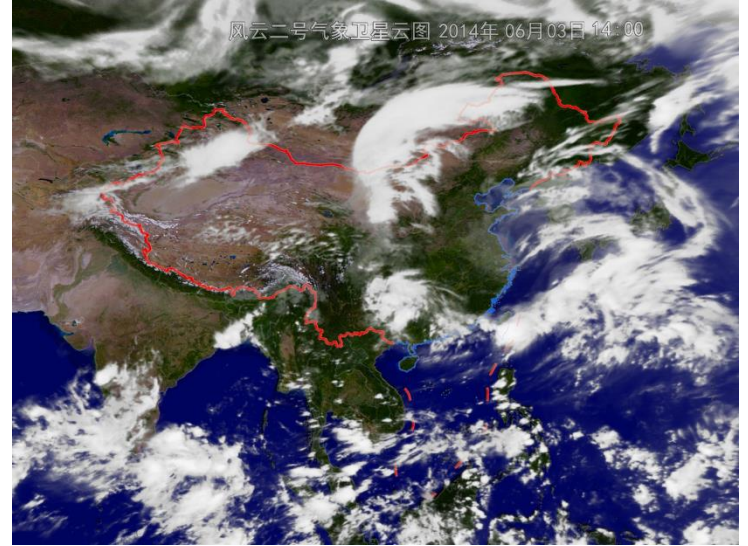
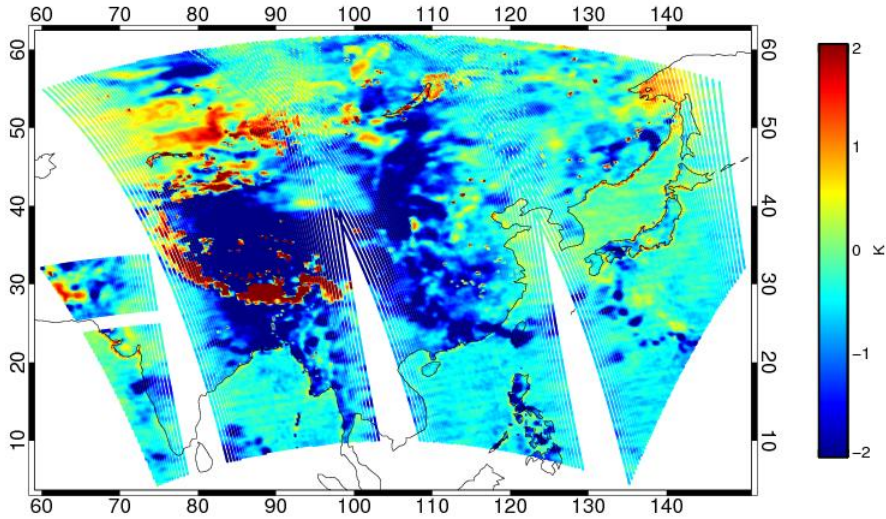
# Emissivity Retrieval (ATMS Ch4)

$$\varepsilon_{\alpha} = \frac{R_{\alpha} - R_u - \tau R_d}{\tau(R(T_s) - R_d)}$$

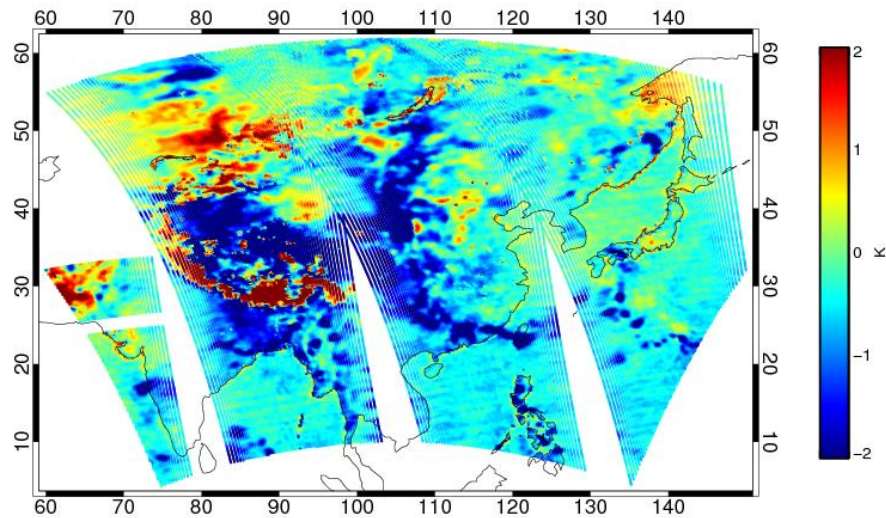


# Es impact on O-B (ch7,54.4GHz)

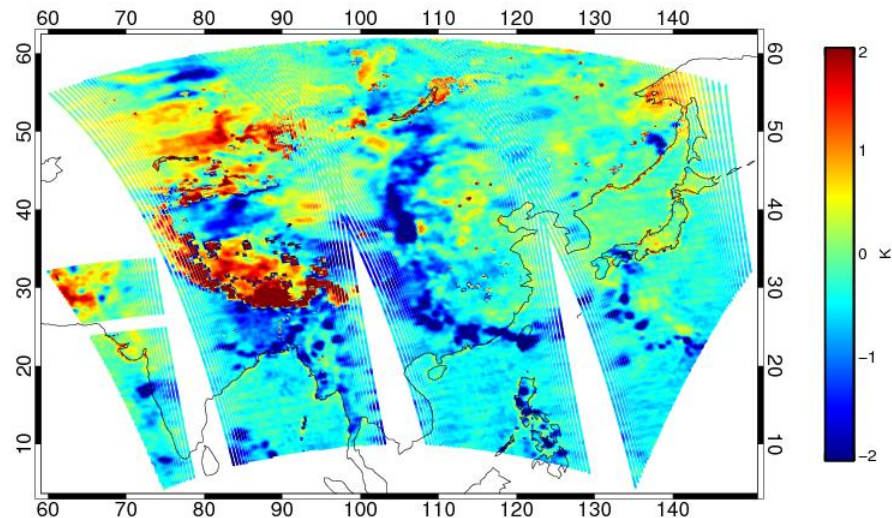
CRTM\_BASE



TESEM

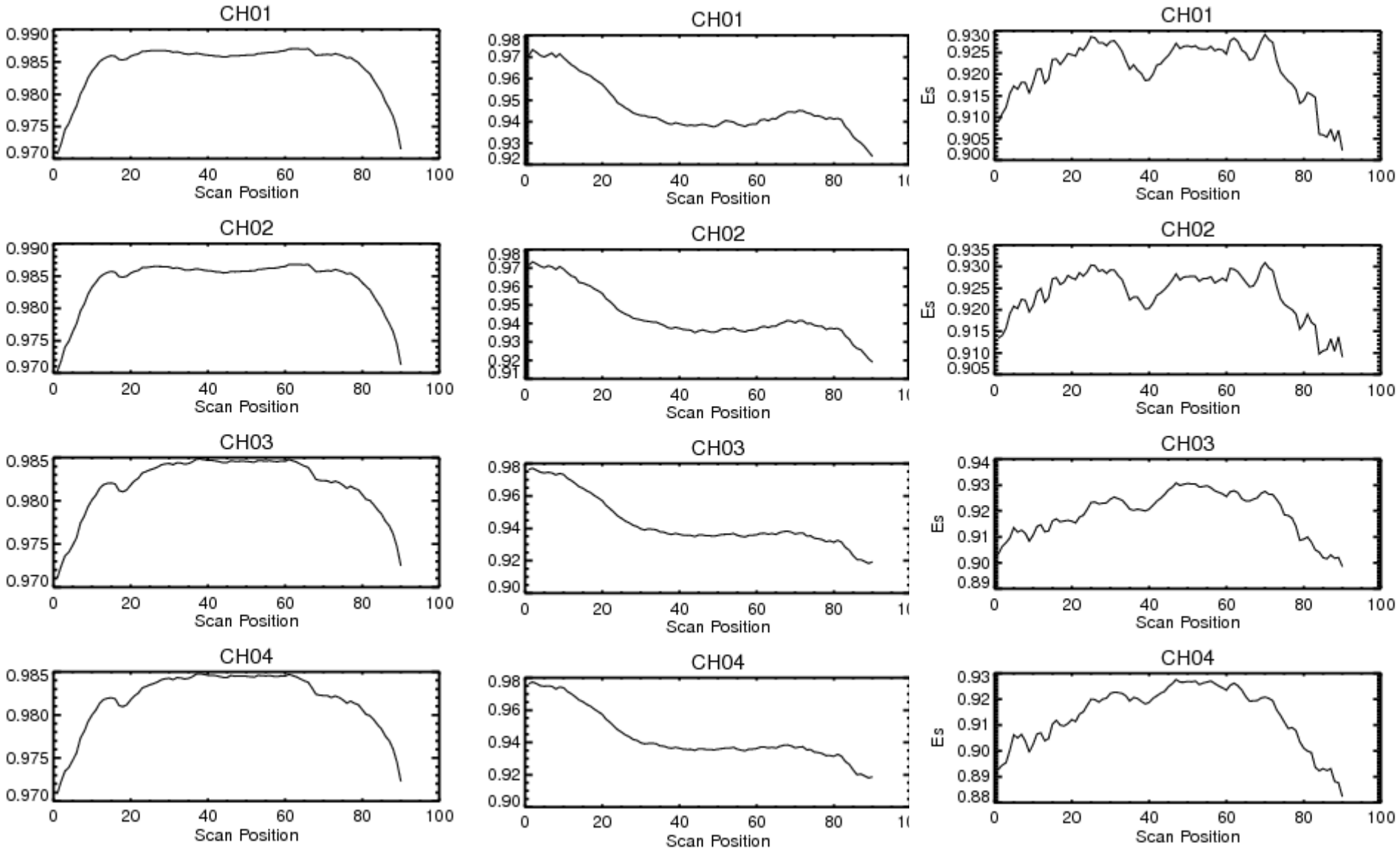


Window channel retrievalCH4

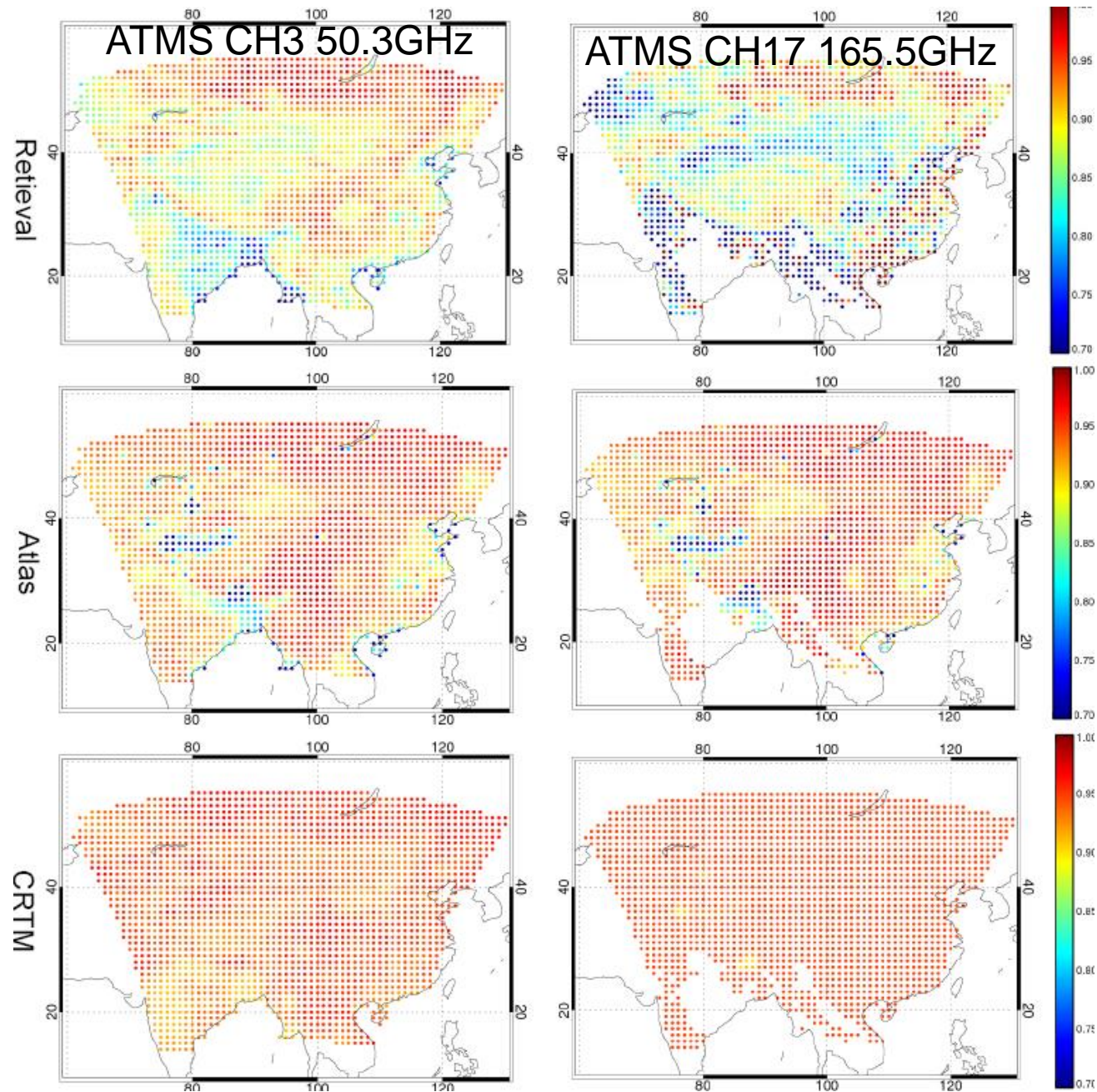




# Emissivity scan angle dependence



# Mean Emissivity (20120801~20120807)



# Impact of emissivity scheme on O-B (ATMS)

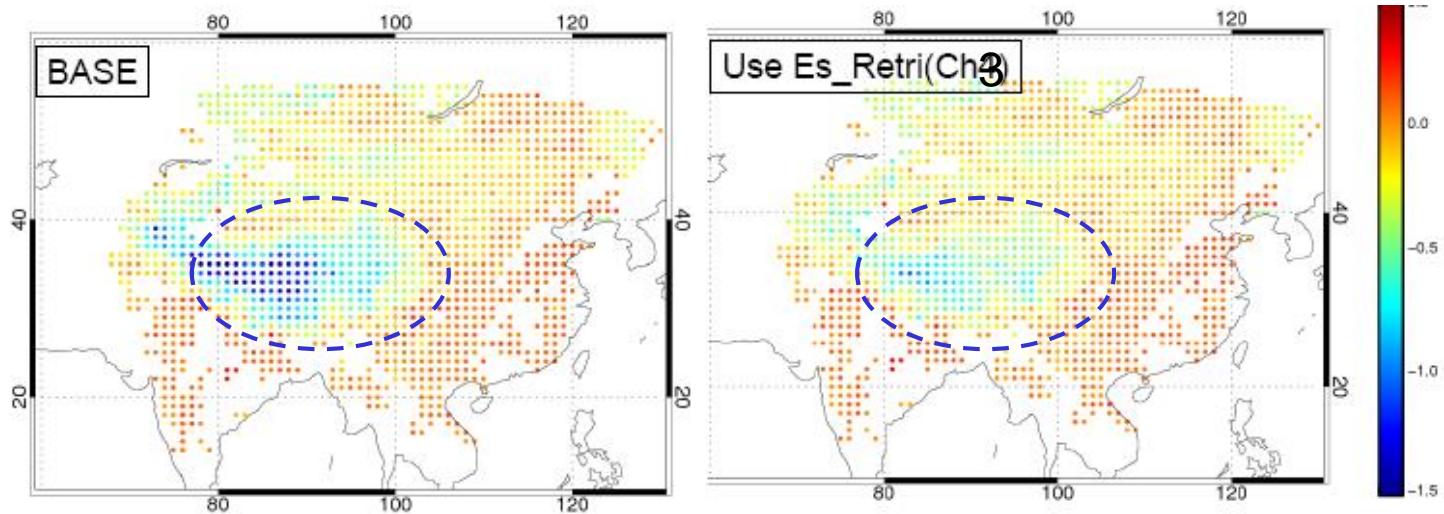


Fig.3: <O-B>, August 1-7,2012. ATMS CH7 54.4GHz

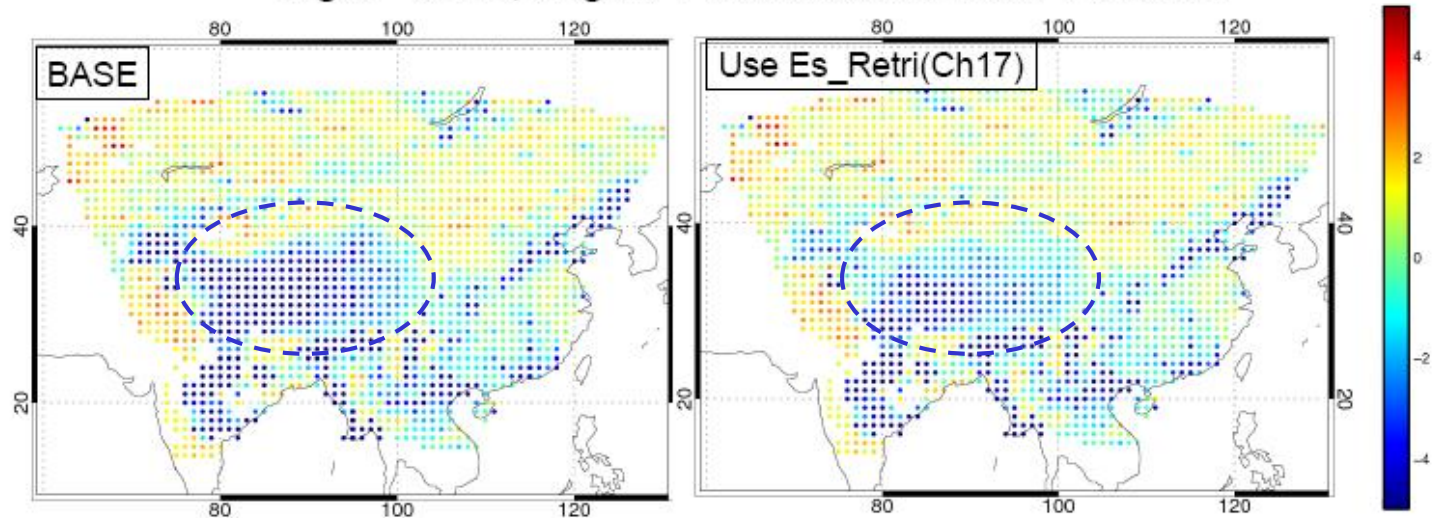
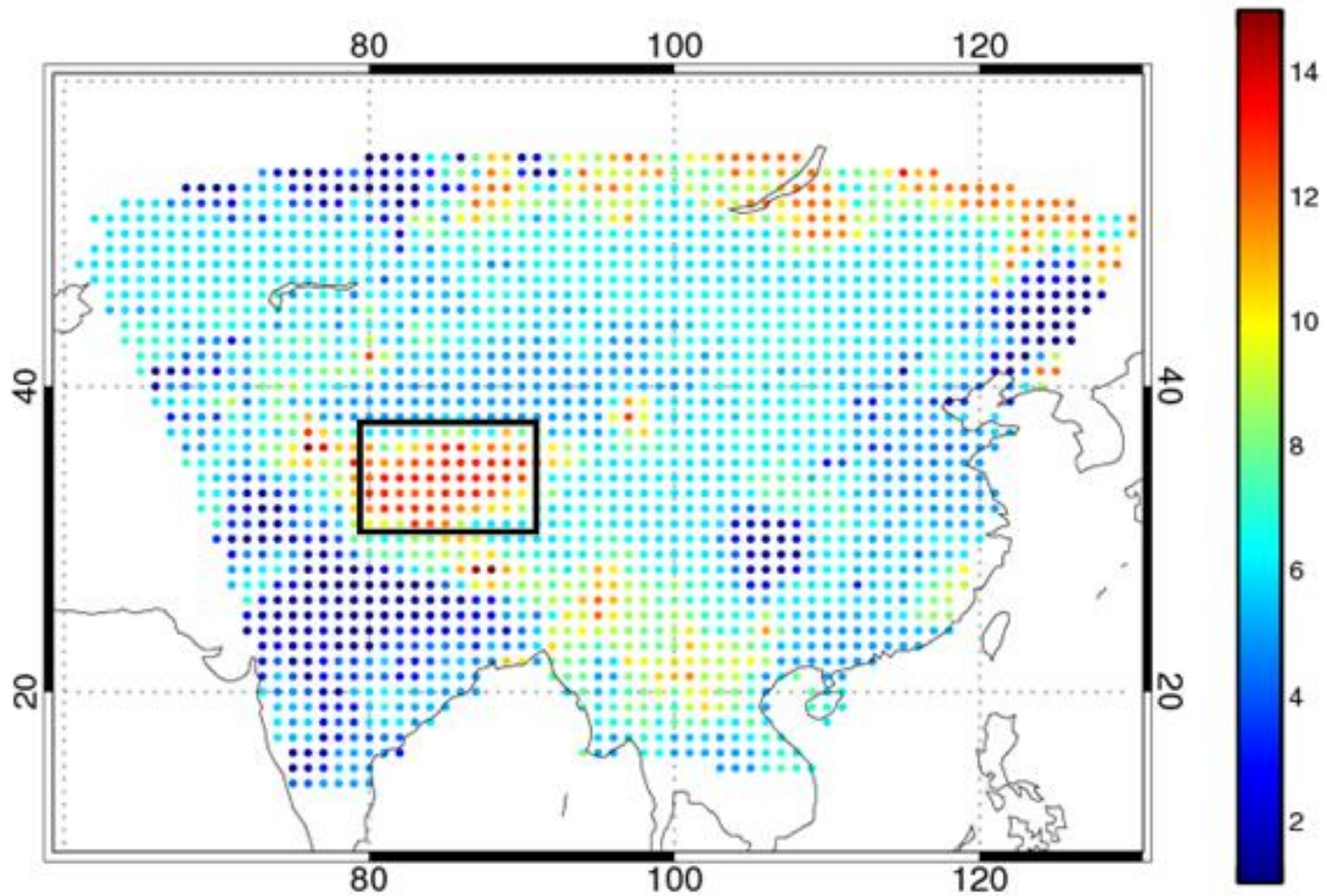


Fig.4: <O-B>, August 1-7,2012, ATMS CH18  $183 \pm 7$ GHz

# Type 13 over Tibetan Plateau



# O-B and active obs. number

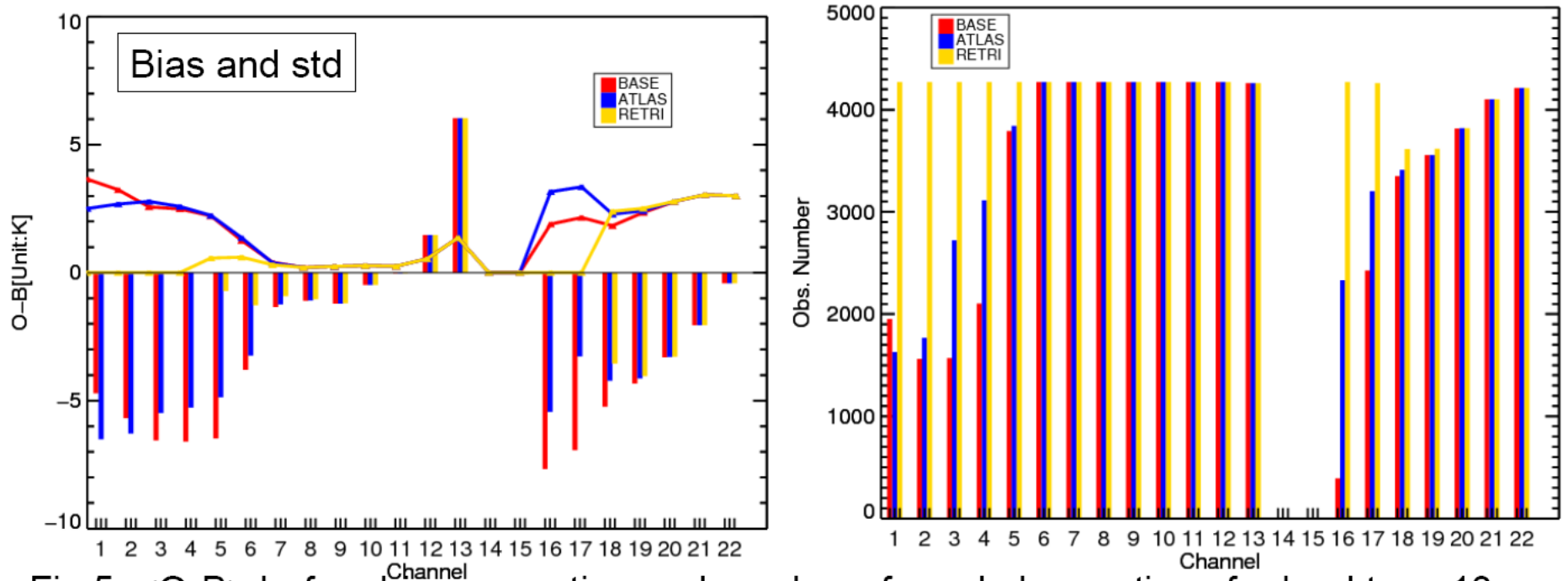


Fig.5: <O-B> before bias correction and number of used observations for land type 13 over Tibetan Plateau.

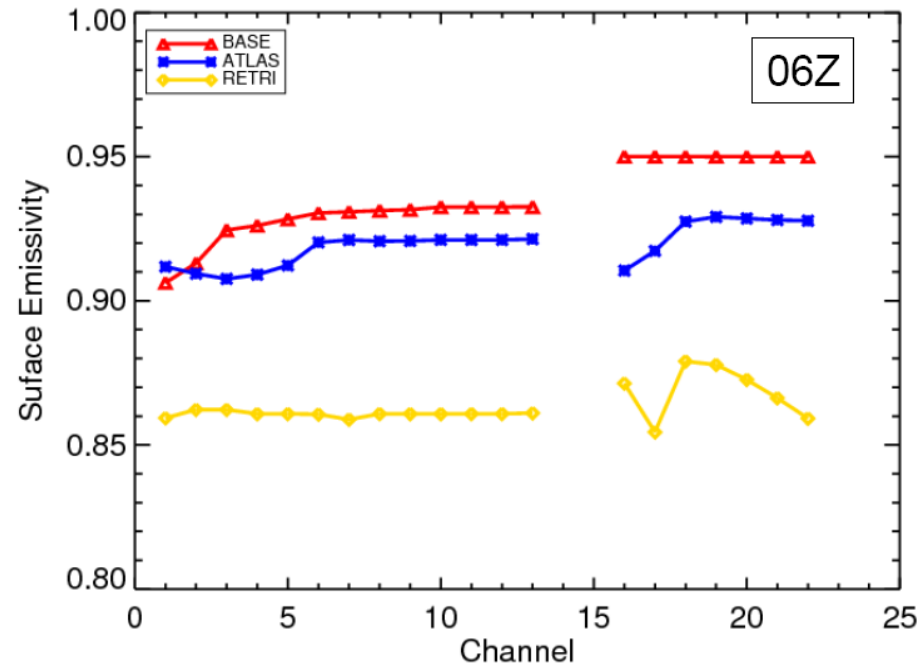
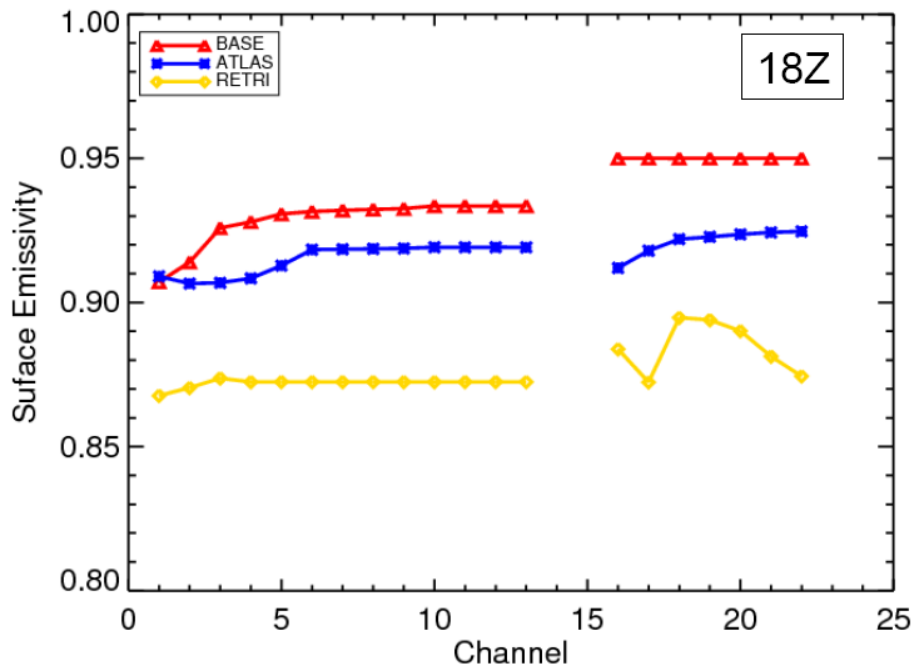


Fig.7: Mean surface emissivity for land type 13 over Tibetan Plateau in the three schemes at 18Z (2AM, local time) and 06Z(2PM,local time)

# How to improve the physical model?

**Table 1.** Mean Emissivity and Its Standard Deviation for Bare Soil<sup>a</sup>

Frequency, GHz	Mean <i>h</i> -pol		Bias <i>h</i> -pol <i>M</i> – <i>S</i>	Mean <i>v</i> -pol		Bias <i>v</i> -pol <i>M</i> – <i>S</i>	Standard Deviation			
	<i>M</i>	<i>S</i>		<i>M</i>	<i>S</i>		<i>h</i> -pol		<i>v</i> -pol	
			<i>M</i>			<i>S</i>	<i>M</i>	<i>S</i>		
4.9	0.7509	0.7484	–0.0025	0.8868	0.9127	–0.0259	0.0740	0.0866	0.0333	0.0331
10.4	0.8430	0.8207	0.0223	0.9007	0.9233	–0.0226	0.0482	0.0608	0.0293	0.0203
21.0	0.9035	0.8717	0.0318	0.9178	0.9253	–0.0075	0.0349	0.0387	0.0230	0.0160
35.0	0.9068	0.8952	0.0116	0.9151	0.9254	–0.0103	0.0339	0.0264	0.0242	0.0150
94.0	0.9354	0.9259	0.0095	0.9438	0.9376	0.0062	0.0209	0.0200	0.0135	0.0141

Reported parameters: viewing angle, 50°; temperature range, 0°C to 25°C; soil moisture range, 12–45%. Specified parameters: roughness rms, 0.25; clay and sandy fraction, 0.9 and 0.1, respectively; soil and solids density, 1.18 and 2.65 g cm<sup>3</sup>, respectively.

<sup>a</sup>Symbols “*v*-pol” and “*h*-pol” represent vertical and horizontal polarization, respectively. “*M*” and “*S*” are denoted for the measurements and

**Table 2.** Mean Emissivity and Its Standard Deviation for Short Grass

Frequency, GHz	Mean <i>h</i> -pol		Bias <i>h</i> -pol <i>M</i> – <i>S</i>	Mean <i>v</i> -pol		Bias <i>v</i> -pol <i>M</i> – <i>S</i>	Standard Deviation			
	<i>M</i>	<i>S</i>		<i>M</i>	<i>S</i>		<i>h</i> -pol		<i>v</i> -pol	
			<i>M</i>			<i>S</i>	<i>M</i>	<i>S</i>		
4.9	0.9284	0.8887	0.0397	0.9395	0.9330	0.0029	0.0076	0.0060	0.0115	0.0123
10.4	0.9508	0.9345	0.0163	0.9565	0.9451	0.0114	0.0075	0.0056	0.0079	0.0080
21.0	0.9440	0.9471	–0.0031	0.9409	0.9501	–0.0092	0.0114	0.0045	0.0101	0.0062
35.0	0.9474	0.9500	–0.0026	0.9428	0.9519	–0.0091	0.0095	0.0034	0.0083	0.0059
94.0	0.9424	0.9507	–0.0083	0.9477	0.9518	–0.0041	0.0082	0.0023	0.0097	0.0046

Reported parameters: viewing angle, 50°; grass height, 5–10 cm; temperature range, >0°C; soil moisture range, 13–60%. Specified parameters: roughness rms, 0.25; clay and sandy fraction, 0.9 and 0.1, respectively; soil and solids density, 1.18 and 2.65 g cm<sup>3</sup>, respectively; leaf area index, 1.5 and leaf thickness, 0.15 mm; leaf orientation, random ( $g = 0.5$  for *v*- and *h*-pol); canopy gravimetric water content, 0.55–0.8.

# **Impact of assimilation microwave radiances over land**

## **● Typhoon Tembin in 2012**

- **Importance of Mid-latitude weather system for Typhoon Track Forecasts**
- **Better use of data in Central Asia, Better Typhoon Track Forecasts**

## **● Heavy rainfall in 2007 (Jina “718” )**

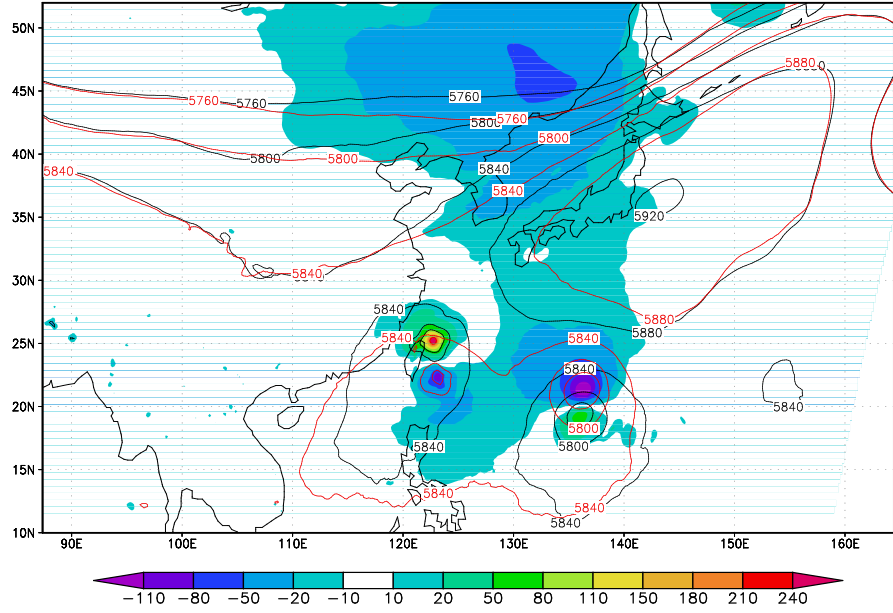
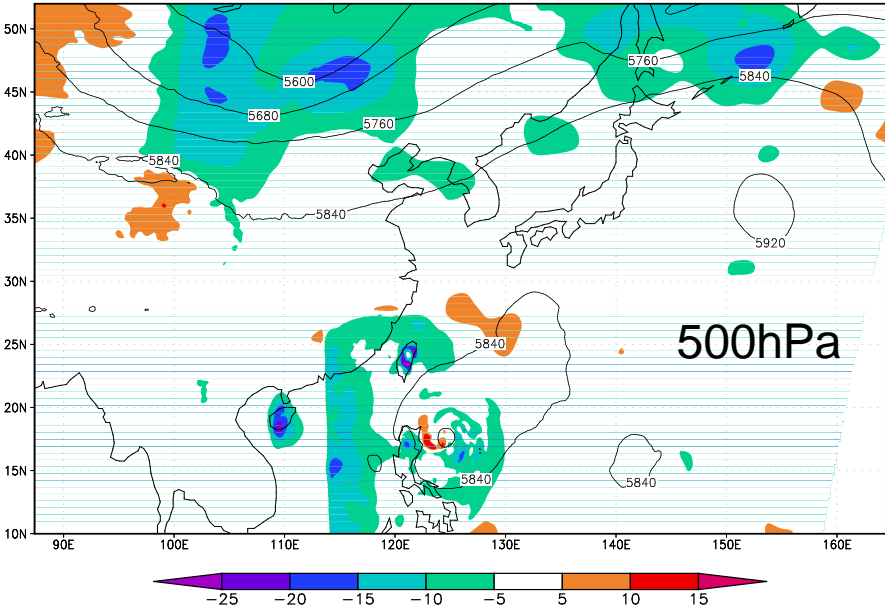
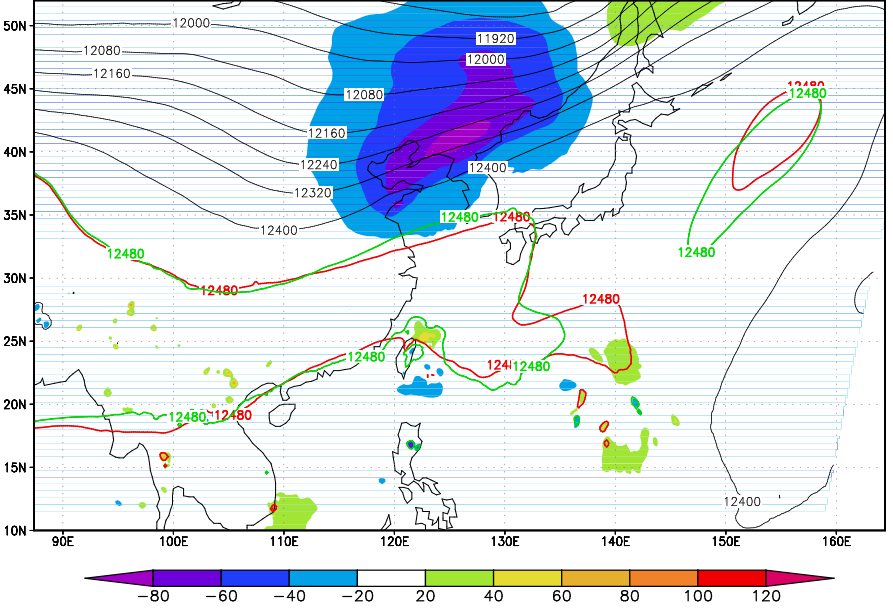
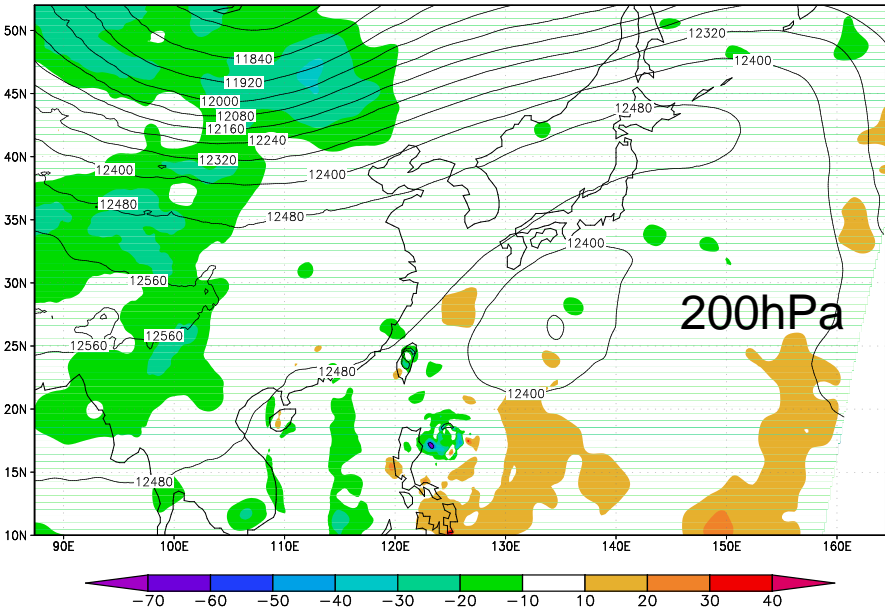
- **Importance of Moisture information from satellite over land**
- **Clear Sky Radiances Assimilation**



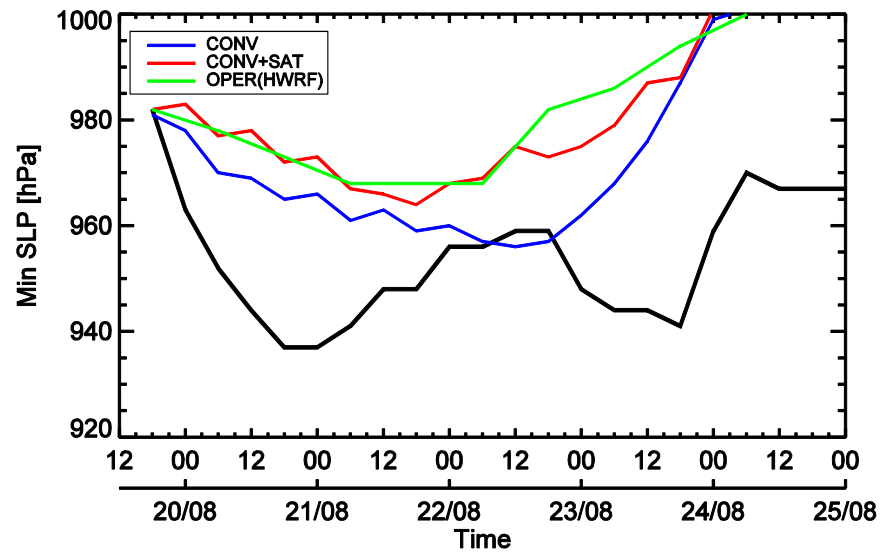
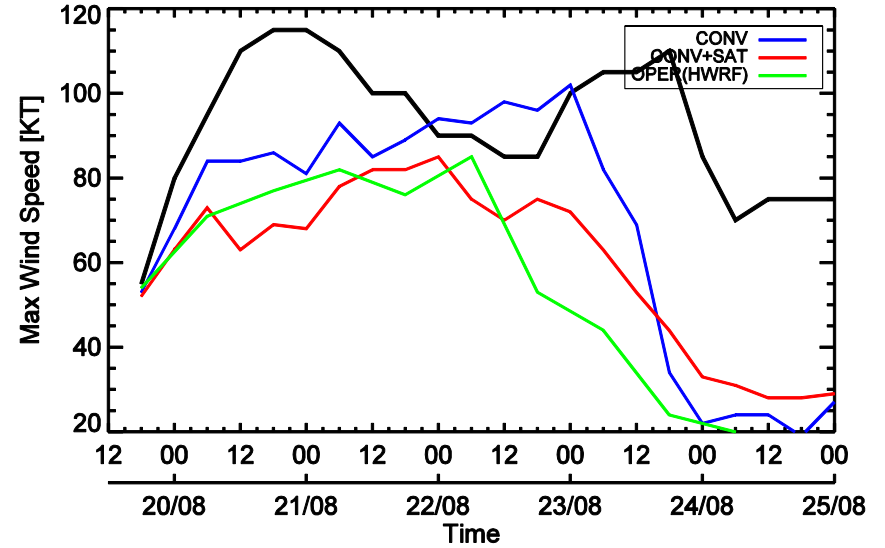
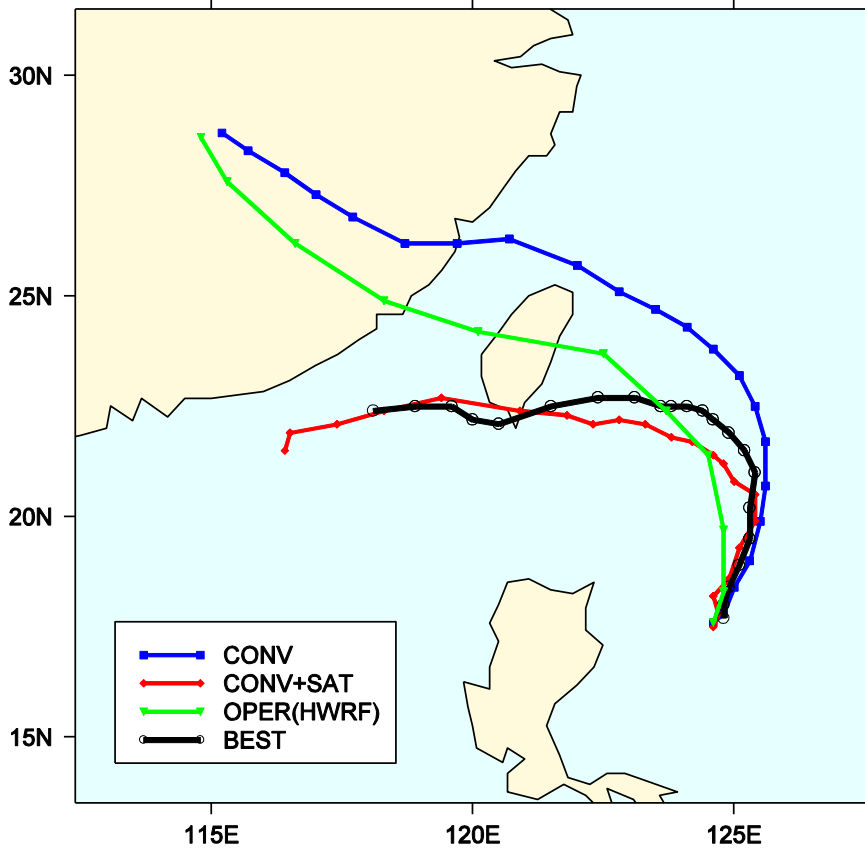
# Use of microwave radiances over land

T=0

T=72H

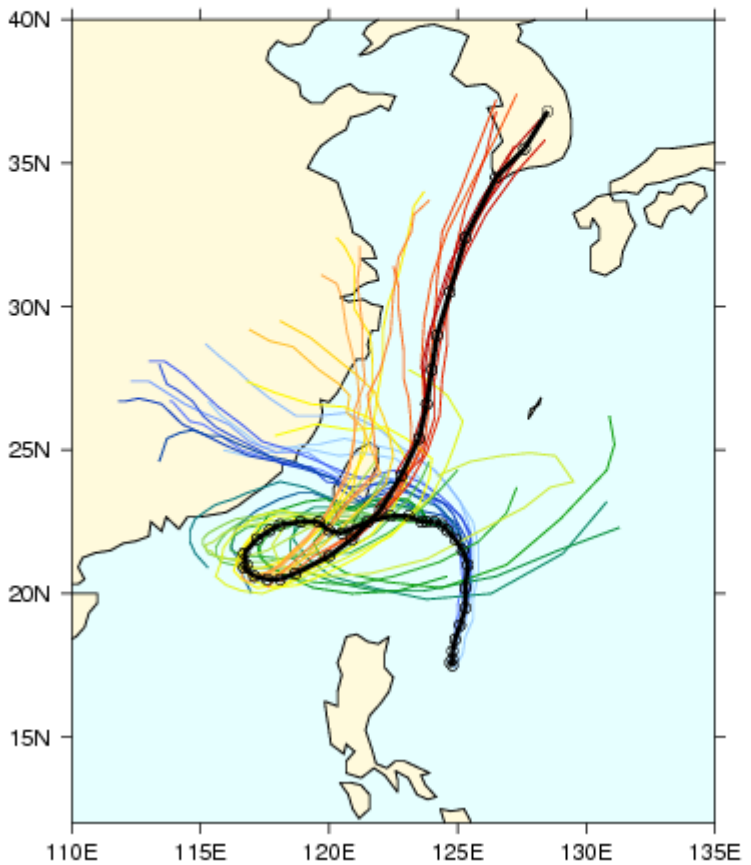


# 2012081918



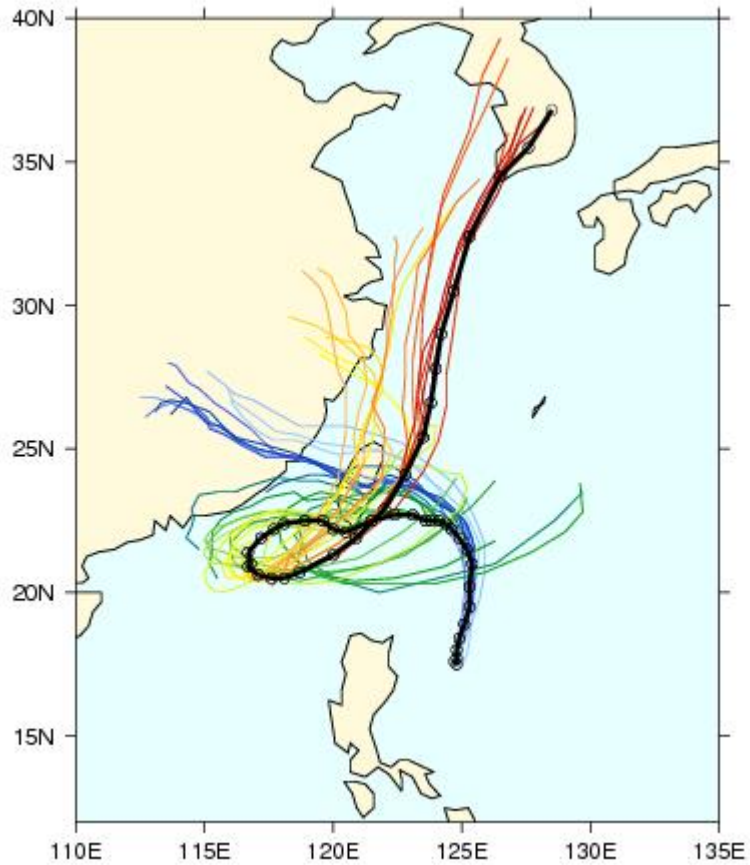
# Impact of ATMS over land on TEMBIN Track forecasts

CONV

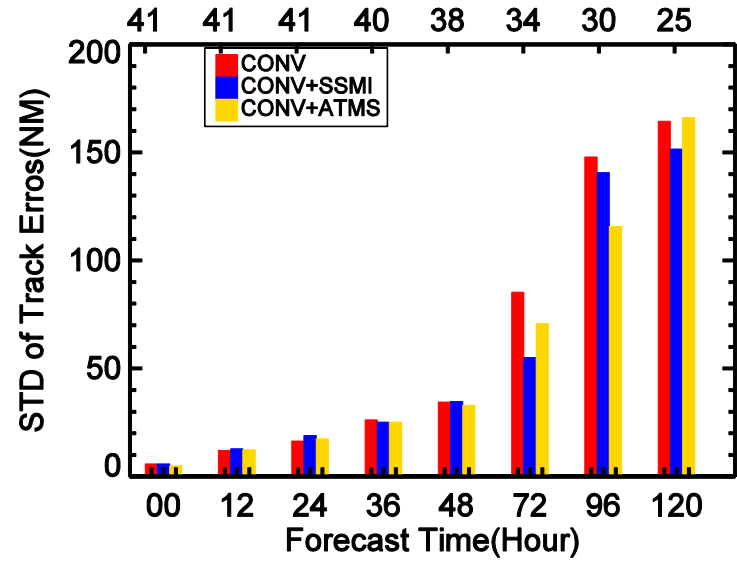
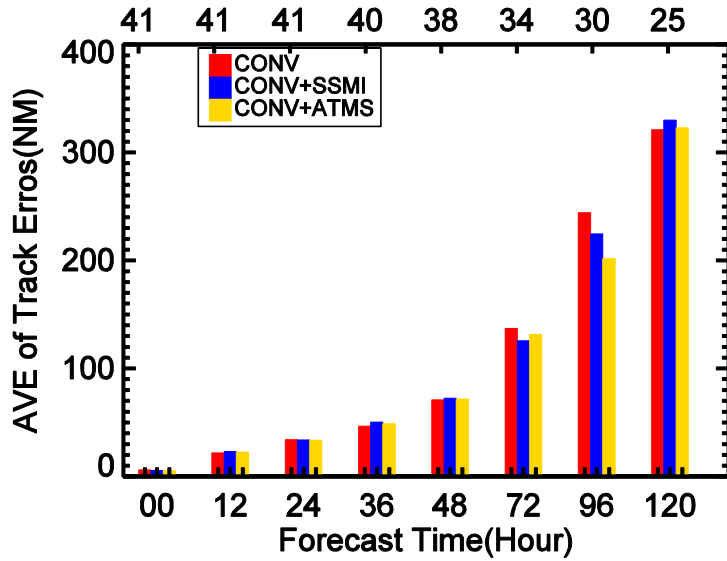


- 2012082818
- 2012082812
- 2012082806
- 2012082800
- 2012082718
- 2012082712
- 2012082706
- 2012082700
- 2012082618
- 2012082612
- 2012082606
- 2012082600
- 2012082518
- 2012082512
- 2012082506
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- 2012082418
- 2012082412
- 2012082406
- 2012082400
- 2012082318
- 2012082312
- 2012082306
- 2012082300
- 2012082218
- 2012082212
- 2012082206
- 2012082200
- 2012082118
- 2012082112
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- 2012082000
- 2012081918
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- 2012081906

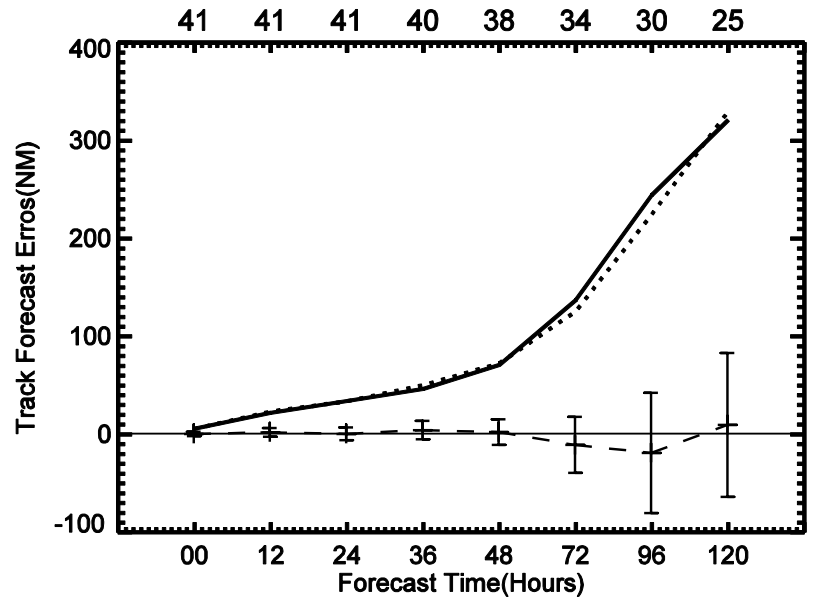
CONV+AMSUA(land)



# Track Error



SOLID: CONV  
 DOTTED: CONV+SSMIS\_img



# Future Plan

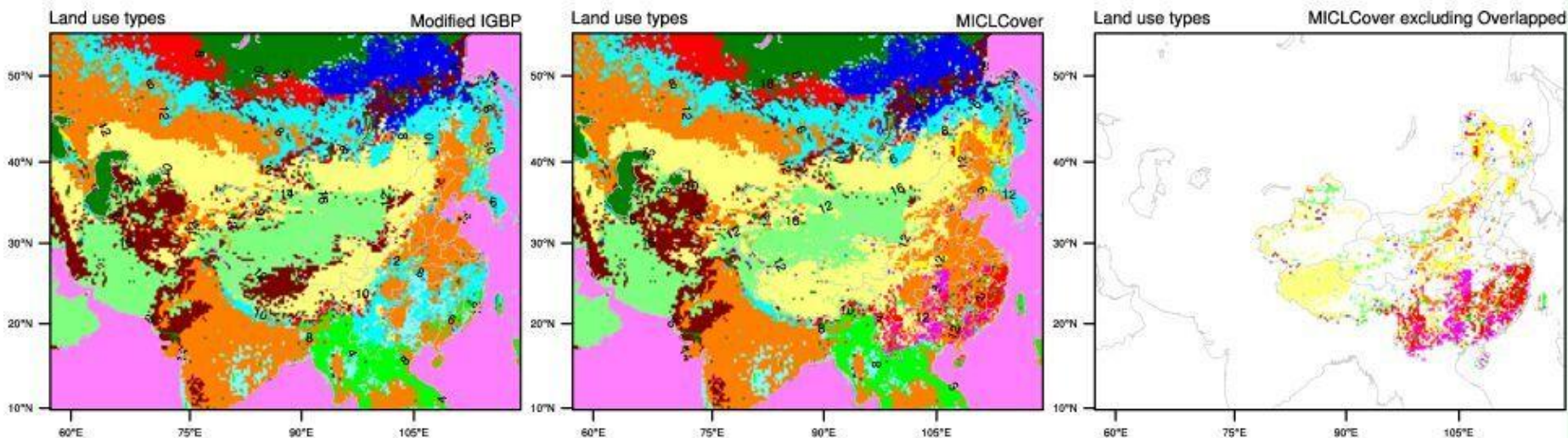
- **Improved Emissivity Physical model with local correction**
  - Update of land use and soil type datasets, **sub-pixel**
- **Cloud detection over land**
  - Scattering or Emission Based method ? Using Imager ?
- **Hyper-spectral IR sounder**
  - **Surface sensitive channels**
- **Focus on severe weather over Asia**
  - Vortex and Local heavy rainfall
- **Use of Satellite data in GRAPES-MESO**
  - More frequent observations (GIIRS)
- **Coupled Data Assimilation**
  - Emissivity (control variable?)

# Land Use

**Modified IGBP** MODIS 20-category vegetation (land-use) data

**MICLCover** (Multi-source Integrated Chinese Land Cover) data (1km by 1km)

<http://westdc.westgis.ac.cn/data/a4262c8a-1543-49c3-9d12-47722f3395f4>



- |                        |                       |                   |                       |                       |                        |
|------------------------|-----------------------|-------------------|-----------------------|-----------------------|------------------------|
| 1 Evergreen Needleleaf | 4 Deciduous Broadleaf | 7 Open Shrublands | 10 Grasslands         | 13 Urban and Built-up | 16 Bare Soil and Rocks |
| 2 Evergreen Broadleaf  | 5 Mixed Forest        | 8 Woody Savannas  | 11 Permanent Wetlands | 14 Cropland Mosaics   | 17 Water Bodies        |
| 3 Deciduous Needleleaf | 6 Closed Shrublands   | 9 Savannas        | 12 Croplands          | 15 Snow and Ice       | 18 Tundra              |

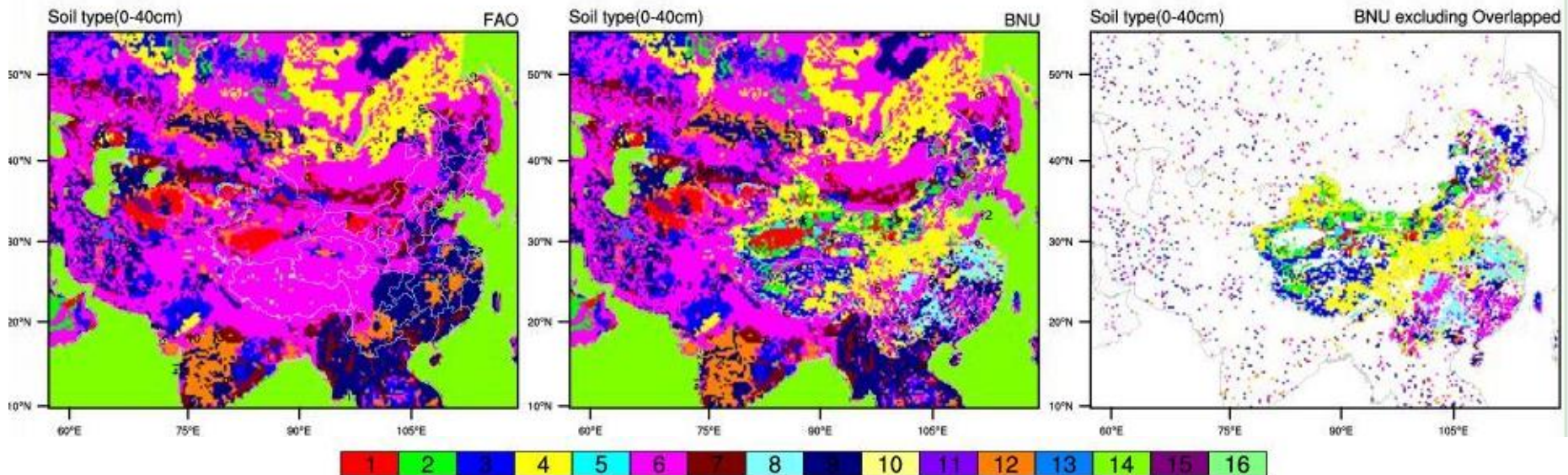
# Soil type

\*Hybrid STATSGO/FAO (30-second for CONUS /5-minute elsewhere) Soil Texture

\*Soil texture classified from the datasets of particle-size distribution over China developed by Beijing Normal University (BNU) (1km by 1km):

<http://globalchange.bnu.edu.cn/research/soil>

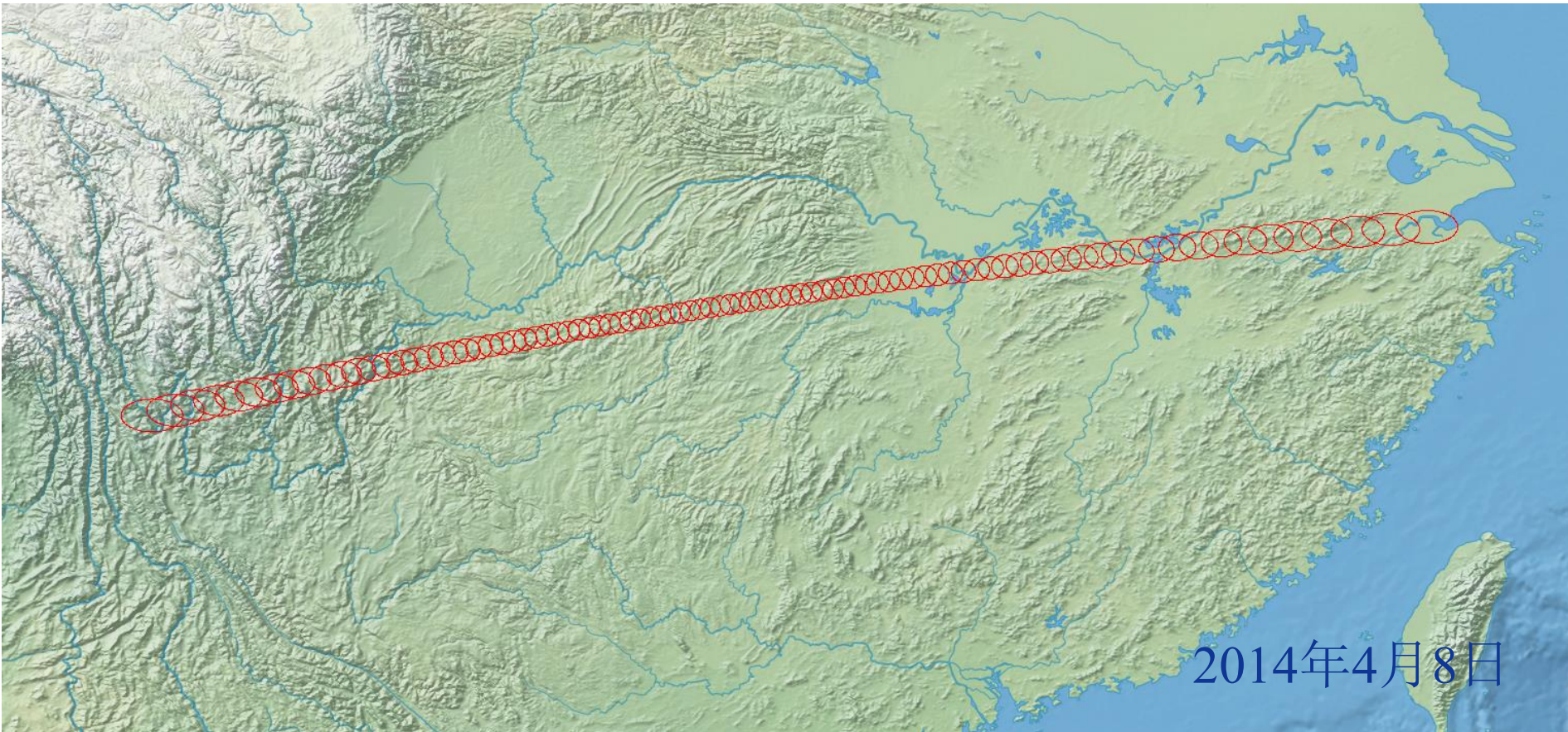
Land-Atmosphere Interaction Research Group at Beijing Normal University



- |              |             |                   |               |                     |
|--------------|-------------|-------------------|---------------|---------------------|
| 1 Sand       | 4 Silt Loam | 7 Sandy Clay Loam | 10 Sandy Clay | 13 Organic Material |
| 2 Loamy Sand | 5 Silt      | 8 Silty Clay Loam | 11 Silty Clay | 14 Water            |
| 3 Sandy Loam | 6 Loam      | 9 Clay Loam       | 12 Clay       | 15 Bedrock          |

# FOV of FY3C MWTS as an example

- **Inputs for physical emissivity model** roughness, clay and sandy fraction, soil and solids density, leaf area index, leaf thickness、 leaf orientation,
  - **sub pixel information**
  - **Antenna pattern**

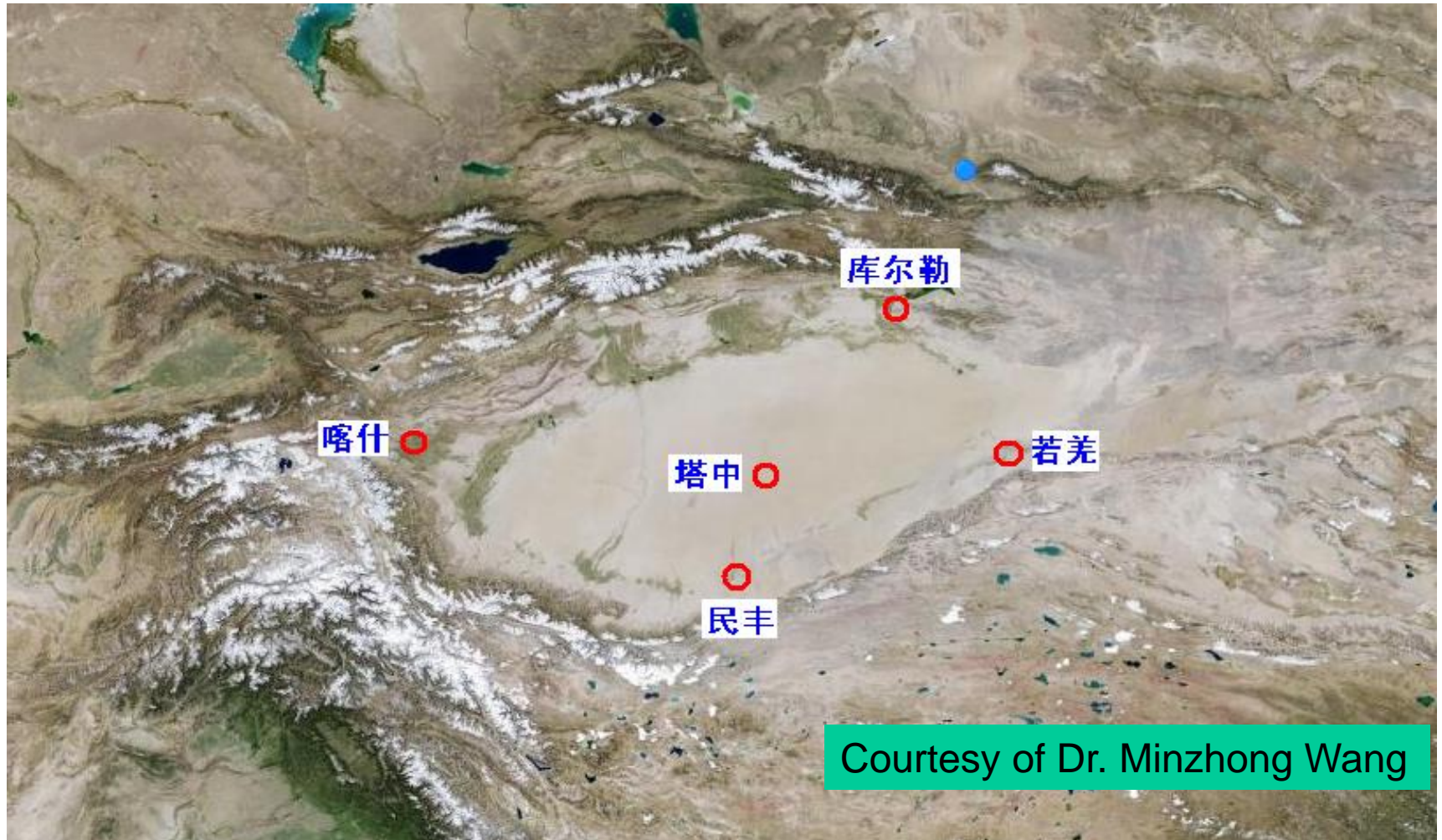


2014年4月8日



# Validation of satellite data using in-situ observations

- Bias correction, Ts Error, Emissivity, ...



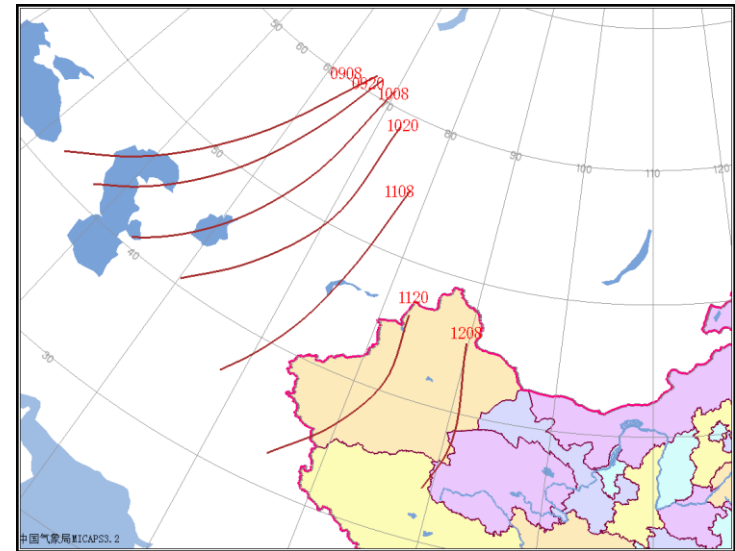
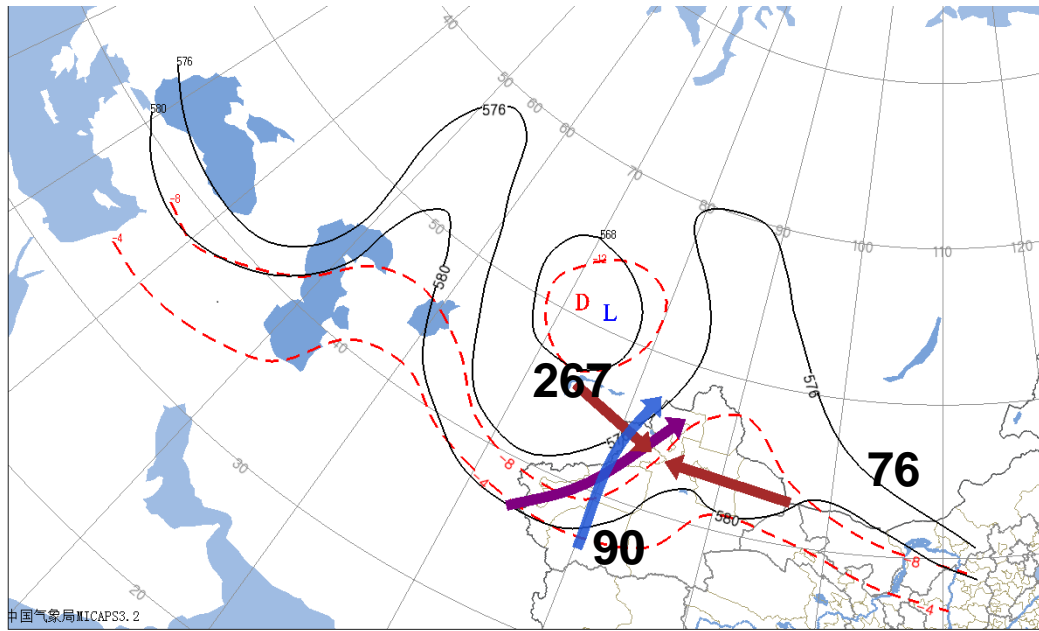
# Improve the analysis of water vapor transportation by assimilation of satellite data

Courtesy of Dr. Lianmei Yang

Winds : AMVs(FY2G, Meteosat)

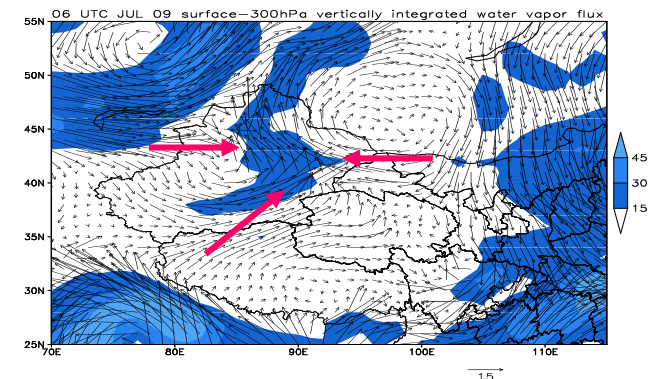
Moisture: MHS,ATMS,MWHS II(FY3),MWRI(FY3),IASI,AIRS,CrIS, GPS PW

Temperature: AMSU-A,ATMS



## Surface-300hPa water vapor flux

2007070712-2007071012(UTC)  
(267,90,76)\*10<sup>9</sup> Ton



# Conclusions and Discussions

- There is large uncertainty over East Asia analysis
- **The effective use of surface sensitive radiances is important**
- Better description of the surface characteristics is fundamental
- **Looking forward to further cooperation on surface emissivity**

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