

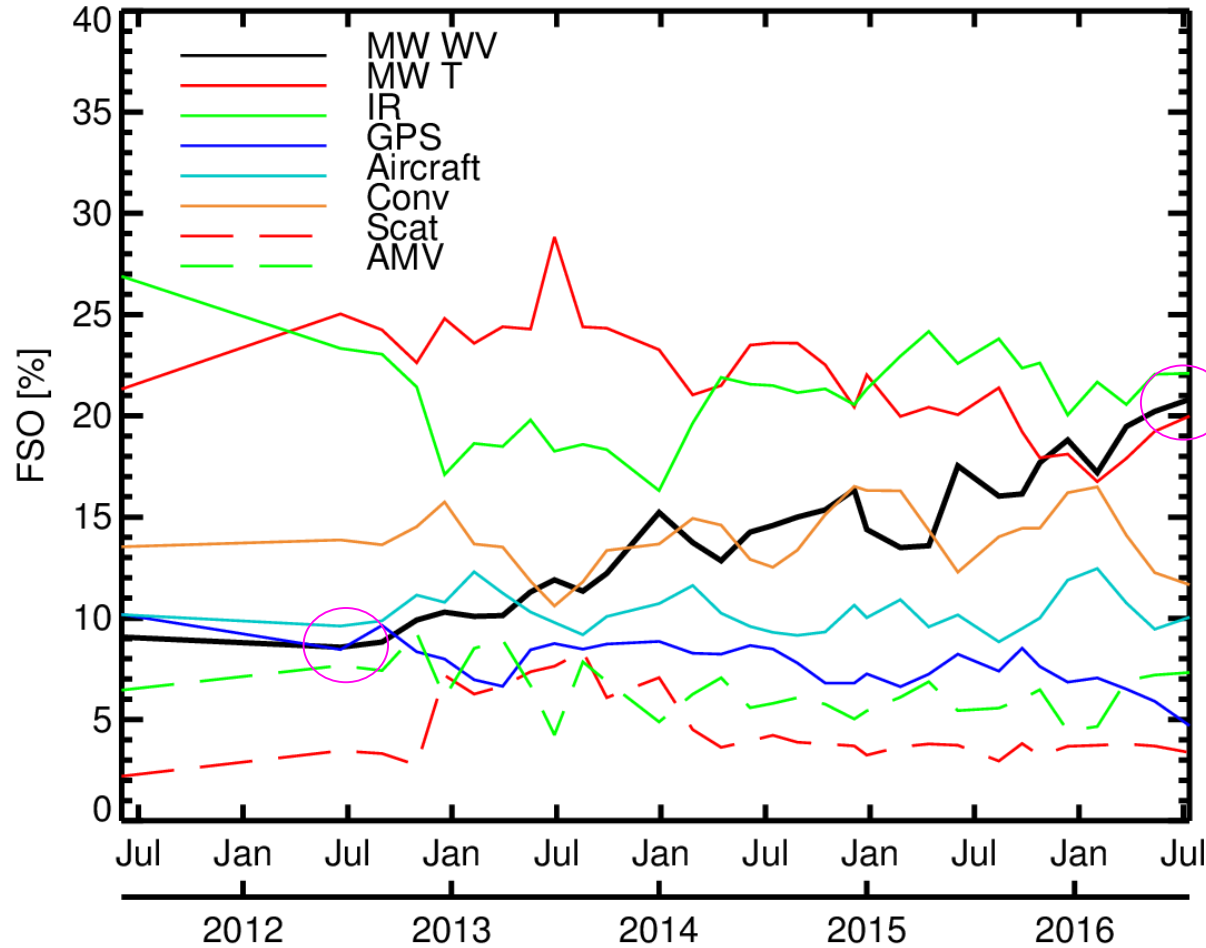
# All-sky assimilation in the tropics: improving cloud and precipitation forecasts

Alan Geer<sup>1</sup>, Katrin Befort<sup>1</sup> and Philippe Chambon<sup>2</sup>

1. ECMWF

2. Météo France

# Forecast sensitivity (FSO) of major observing systems in ECMWF operations



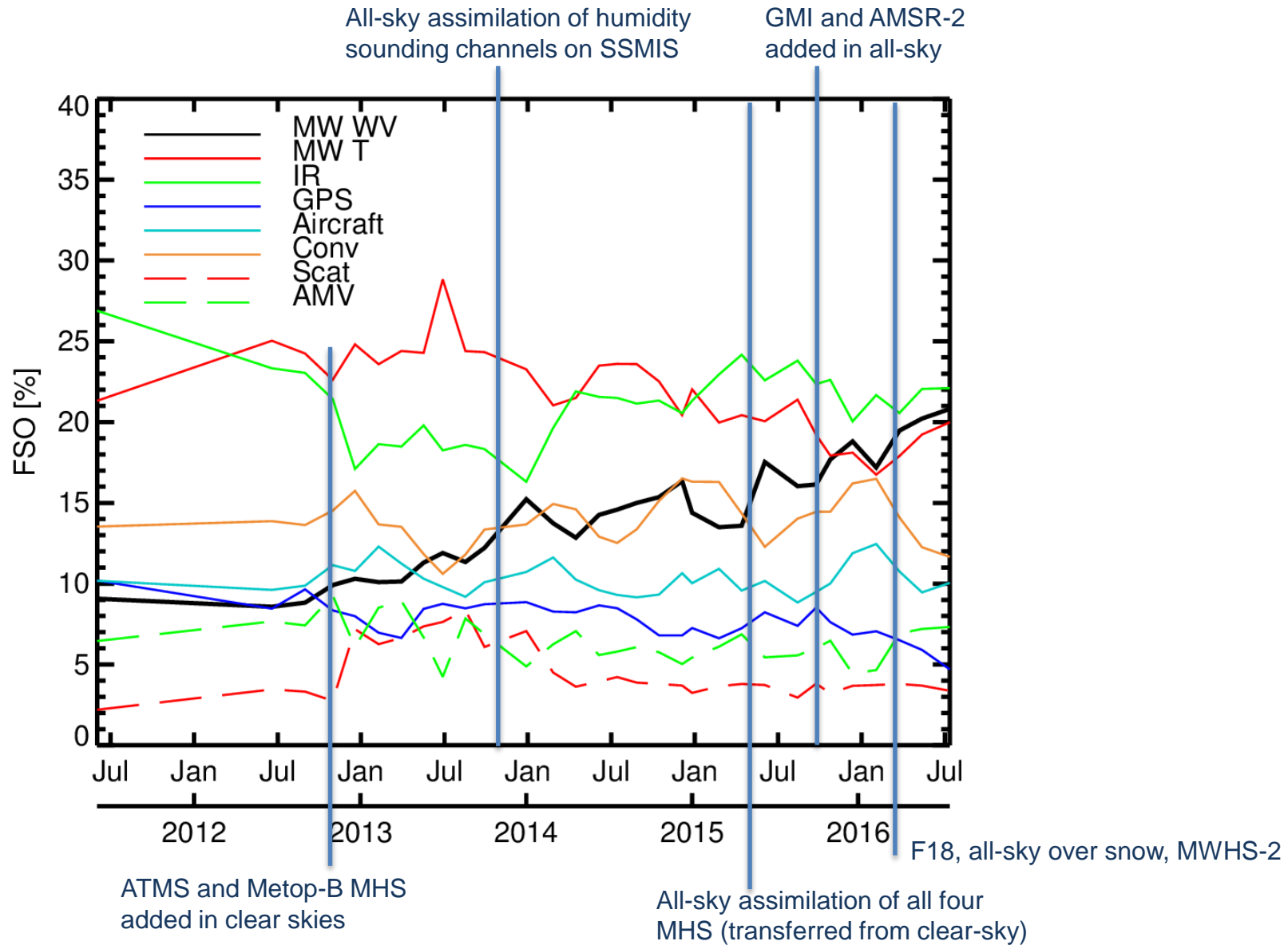
**Summer 2006**  
(from Cardinali, 2009)

Microwave WV	6.2 %
Microwave T	35.5 %
Infrared	28.0 %

**August 2016**

Microwave WV	20.4%
Microwave T	20.1 %
Infrared	21.9 %

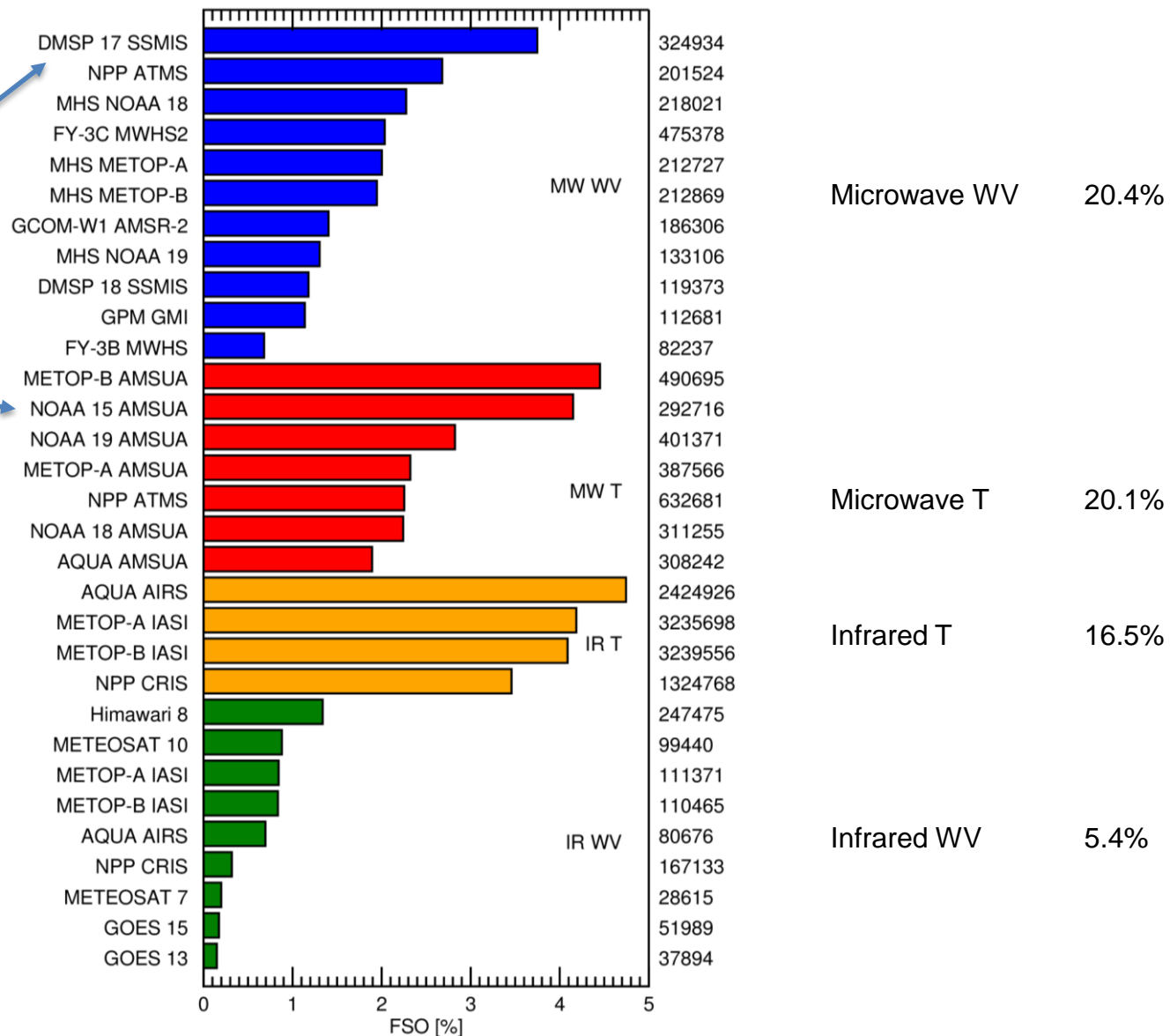
# What's happened recently?



# FSO of satellite radiances, August 2016

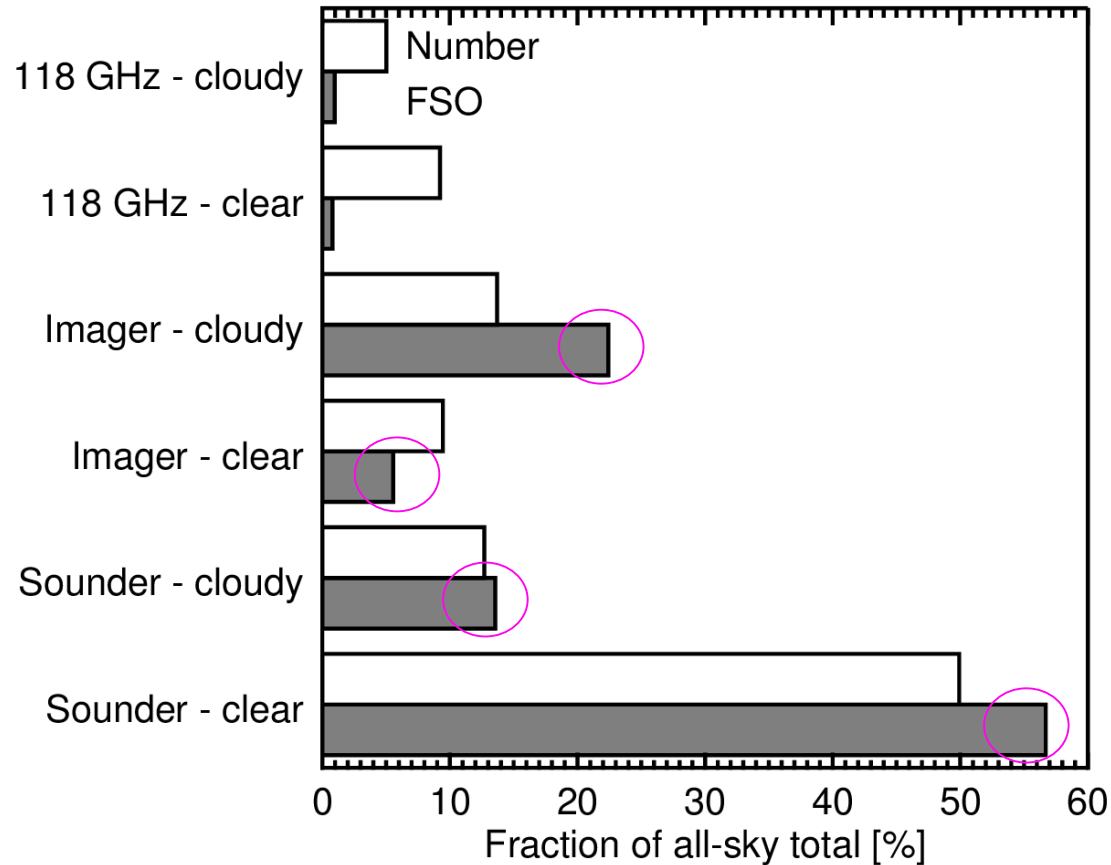
100% = full operational observing system

An SSMIS (combining imaging and humidity sounding channels) is nearly equivalent to the best of the temperature-sounding AMSU-As



# Importance of cloudy and precipitating scenes

100% = 9 all-sky instruments



**Imagers:** Cloudy and precipitating scenes give more FSO than clear-sky scenes

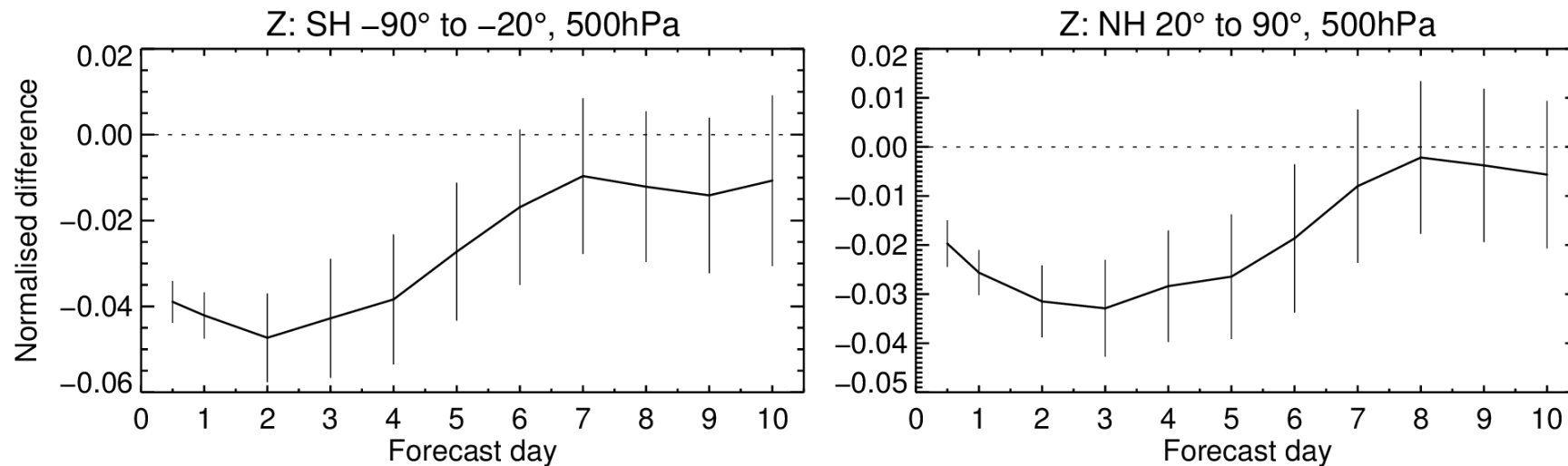
**Sounders:** Cloudy and precipitating scenes have same per-obs FSO as clear-sky scenes

# High FSO => real improvements in medium-range synoptic forecasts

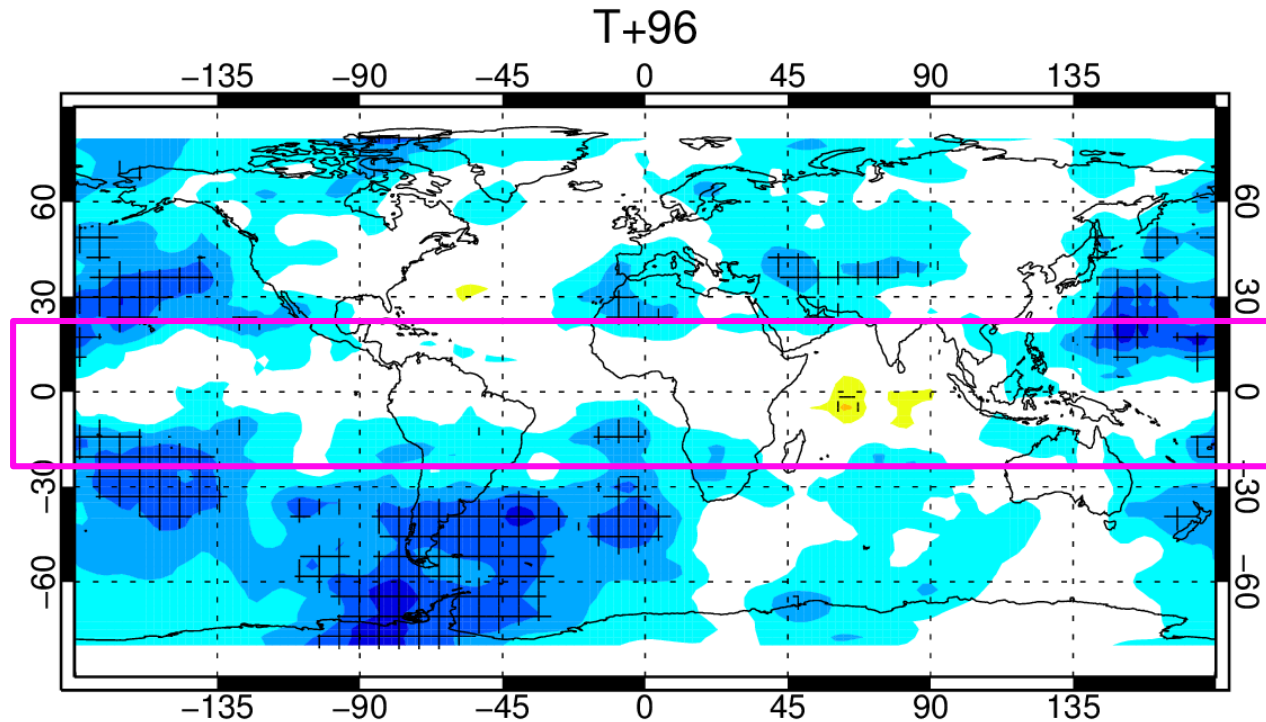
**Mechanism:** 4D-Var can infer dynamical initial conditions from observed WV, cloud and precipitation

26-Feb-2015 to 13-Sep-2015 from 380 to 399 samples. Verified against own-analysis.

Confidence range 95% with AR(2) inflation and Sidak correction for 4 independent tests



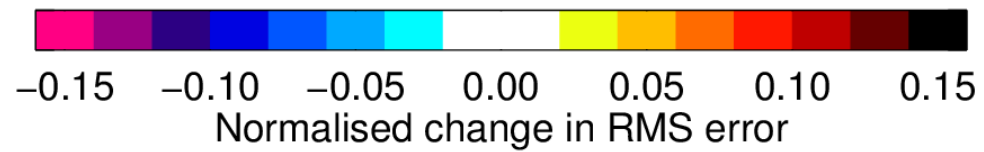
— All-sky GMI, AMSR2, MHS and SSMIS – No allsky control



Normalised change in RMSE of 500hPa geopotential: all-sky on – all-sky off

February – September 2015, using 399 samples. Cross hatching indicates 95% significance

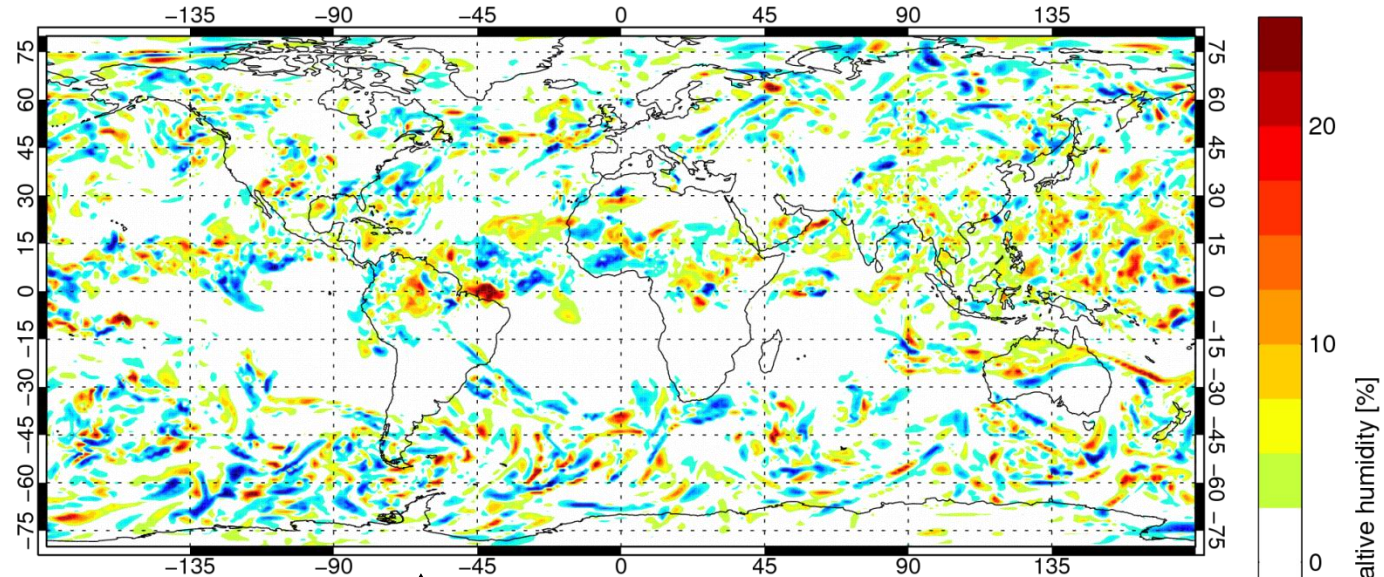
What about the tropics?



# Humidity increments at 500hPa

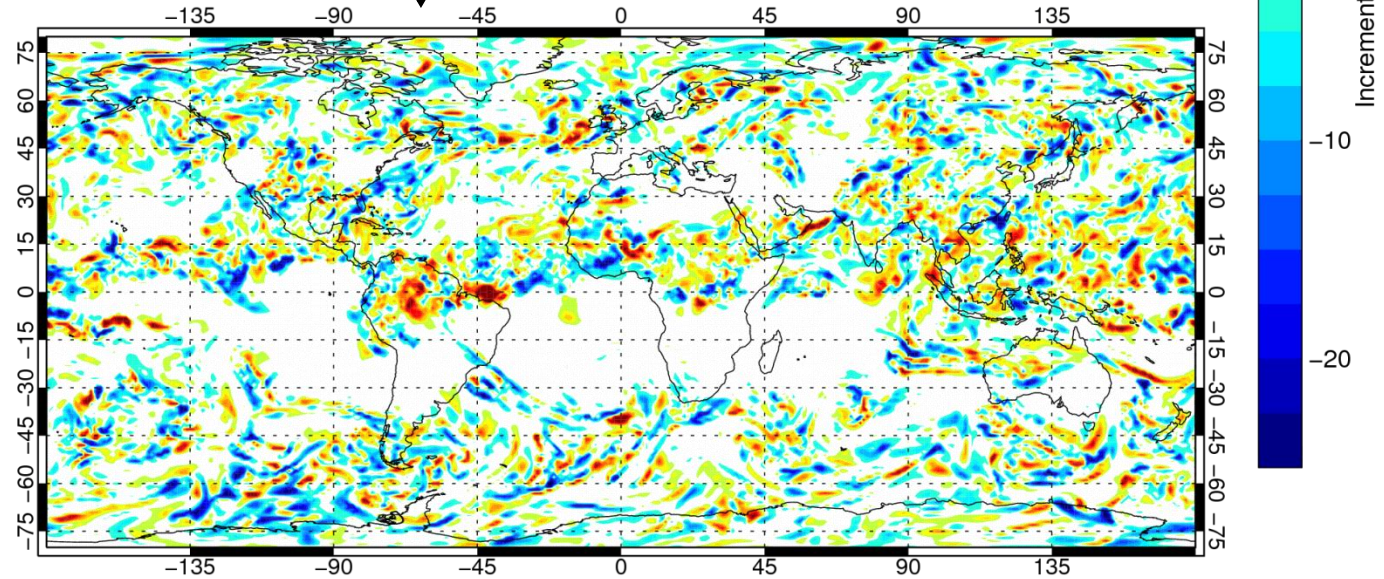
06Z: 9h into the assimilation window

All-sky WV  
sounding only:  
4 MHS, 1 SSMIS



↕ correlation: 0.72

Full observing  
system  
Including all-sky  
WV



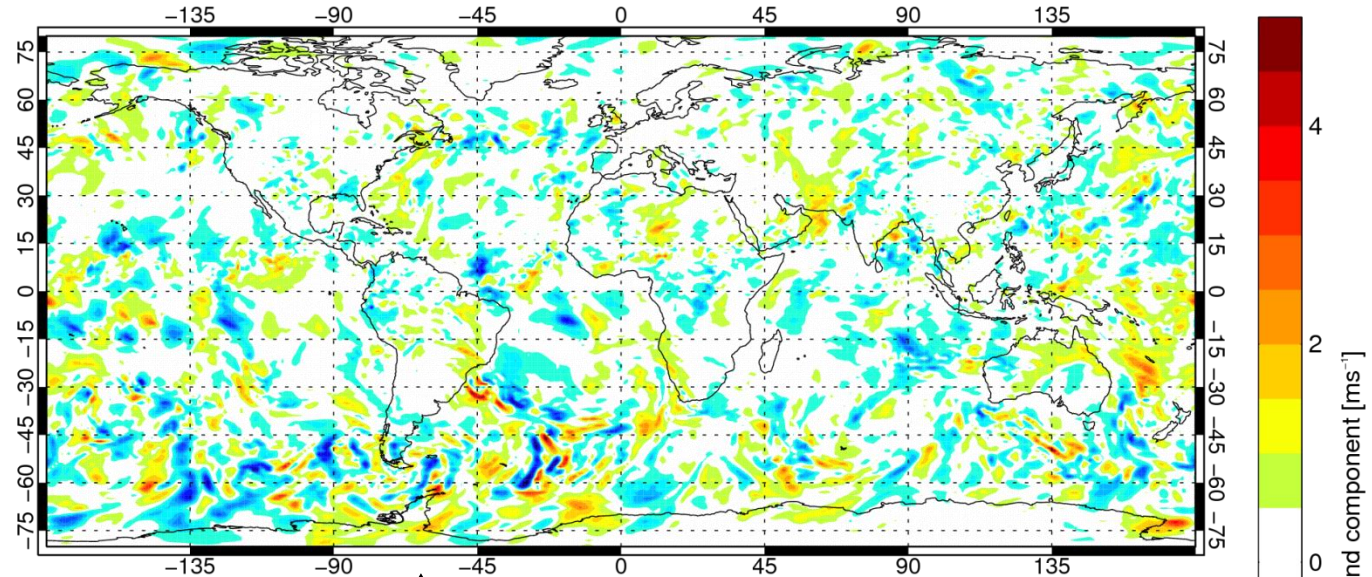
Increment in relative humidity [%]



# v-wind increments at 500hPa

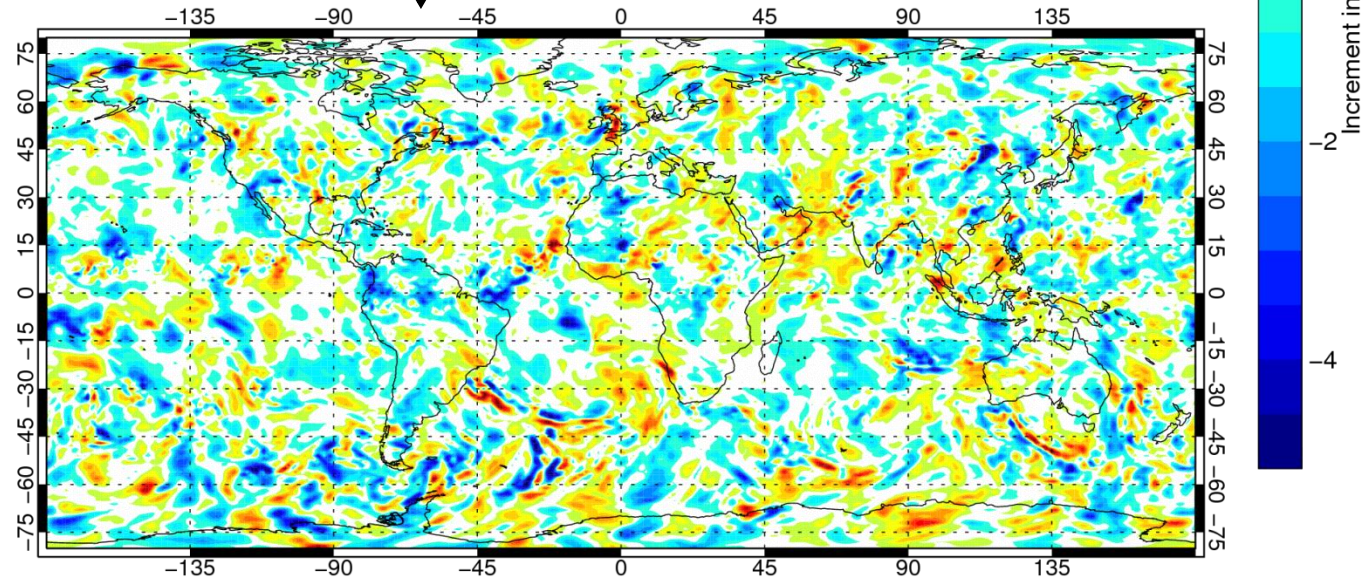
06Z: 9h into the assimilation window

All-sky WV  
sounding only:  
4 MHS, 1 SSMIS



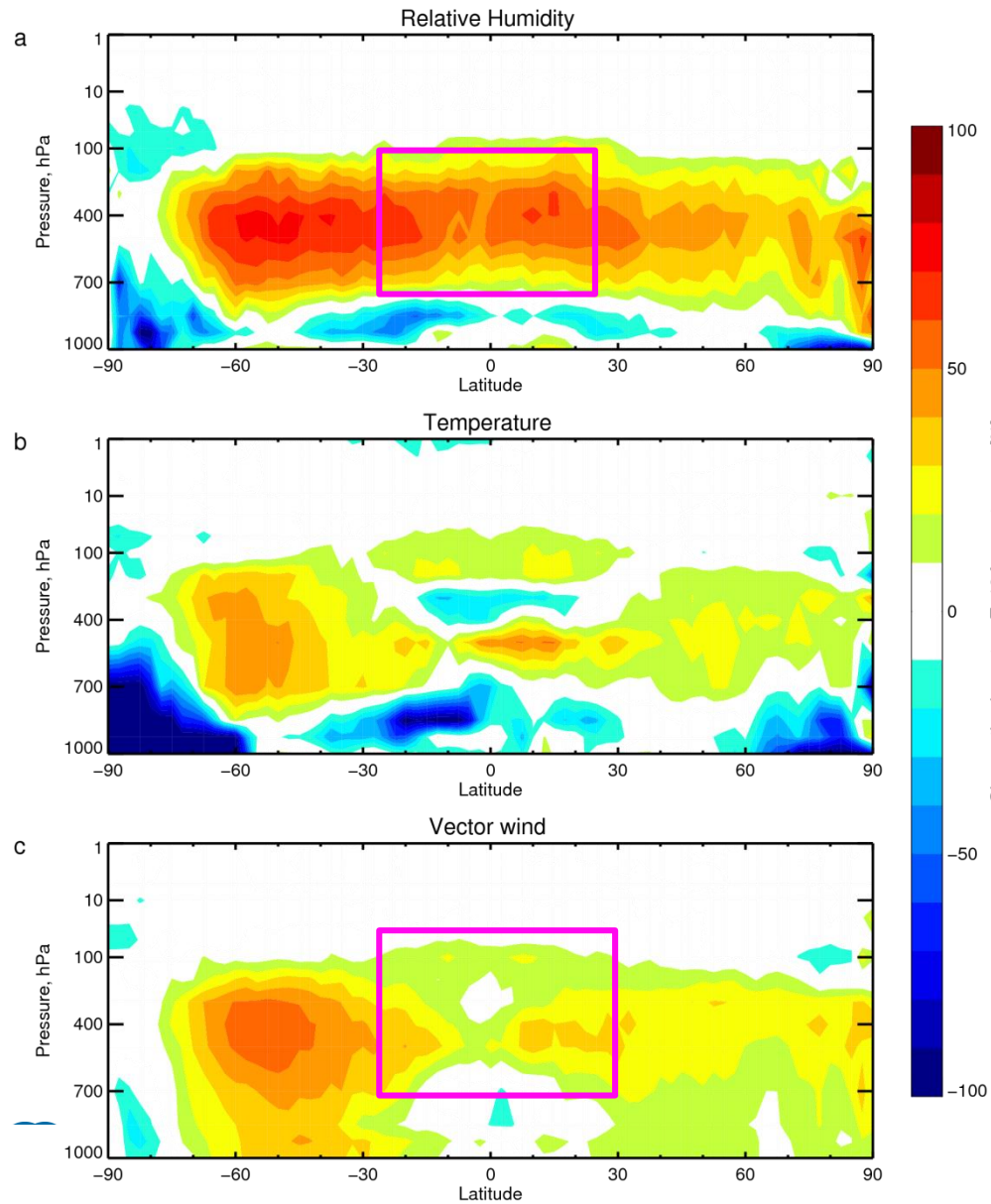
↕ correlation: 0.58

Full observing  
system  
Including all-sky  
WV



# Assimilate only all-sky WV sounding observations (4 MHS, 1 SSMIS)

66 different analyses and forecasts, always from a full-observing system FG

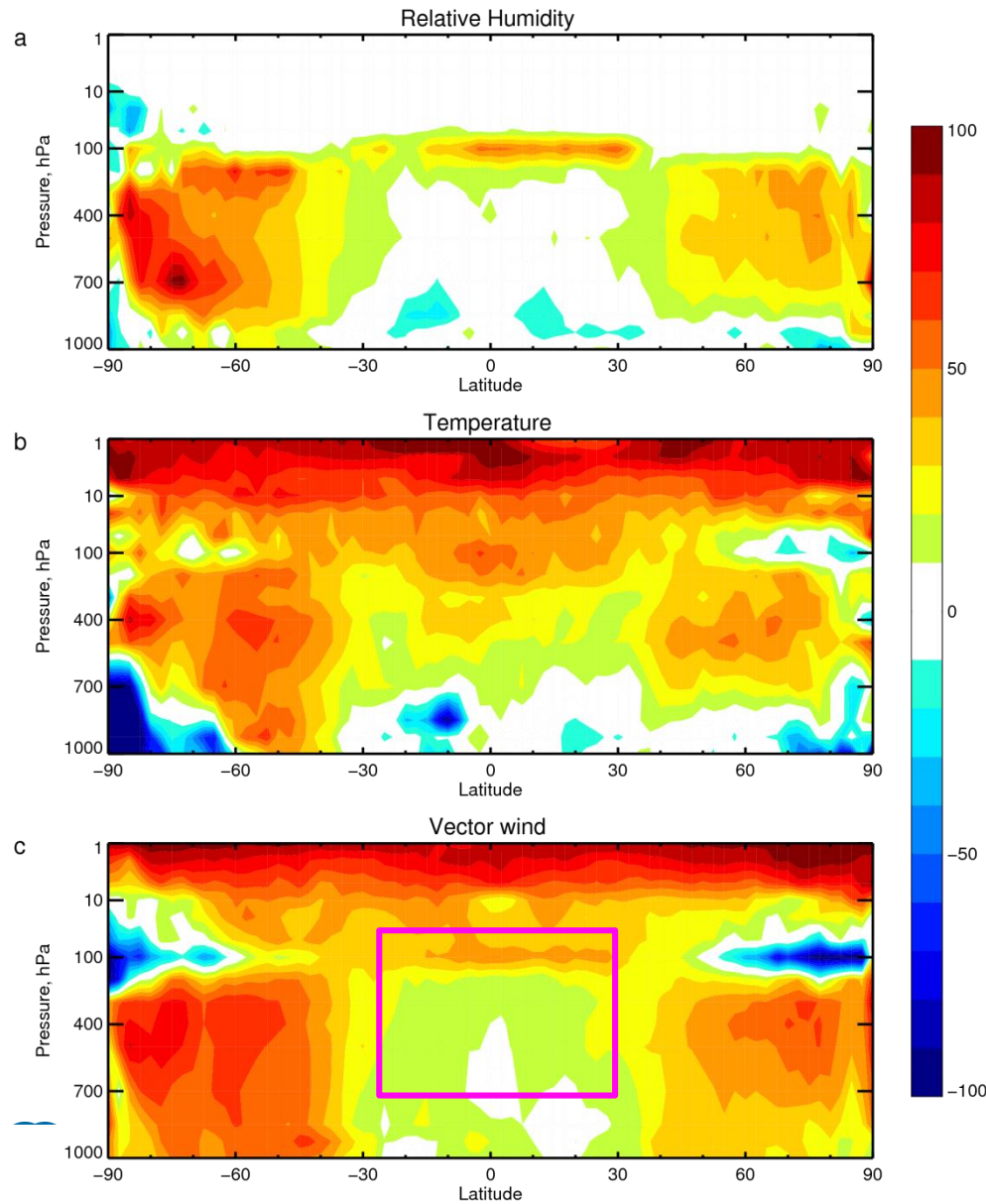


## T+12 RMS forecast error reduction

100% = full observing system  
0% = no observations  
-100% = worse than that!

# Assimilate only microwave T-sounding obs (6 AMSU-A, ATMS)

66 different analyses and forecasts, always from a full-observing system FG

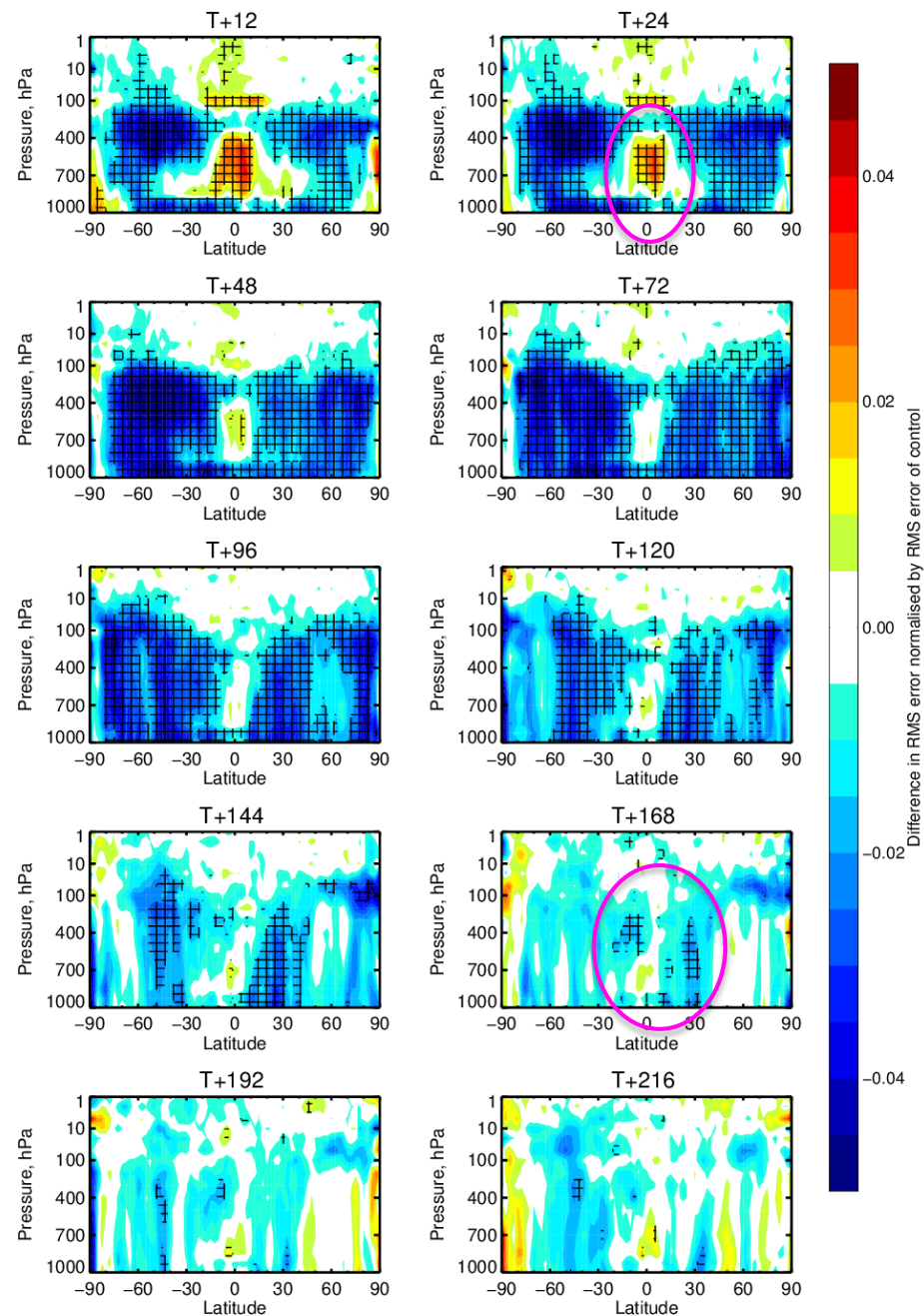


## T+12 RMS forecast error reduction

100% = full observing system  
0% = no observations  
-100% = worse than that!

# Does all-sky assimilation benefit tropical winds?

## Vector wind verification against own-analysis



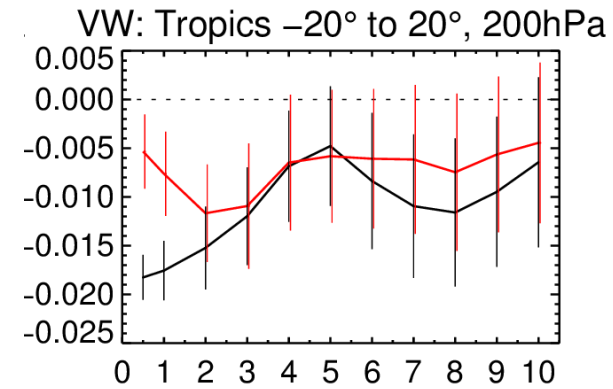
Day 1 “degradation”

vs.

Day 8: significant improvements

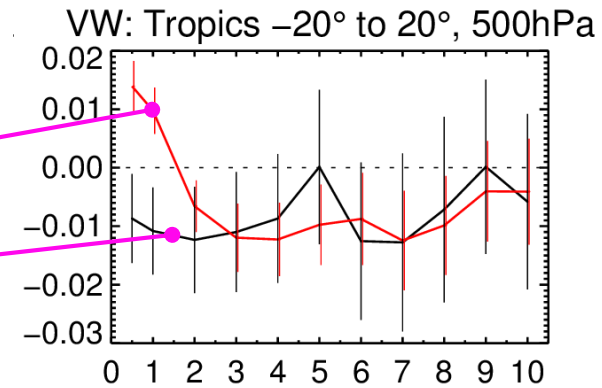
# Impact of all-sky observations on tropical winds

Change in RMS forecast error relative to control

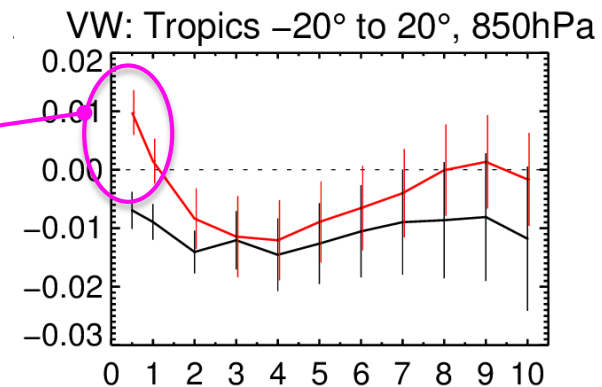


Verified against:

- own analysis
- SATOB observations

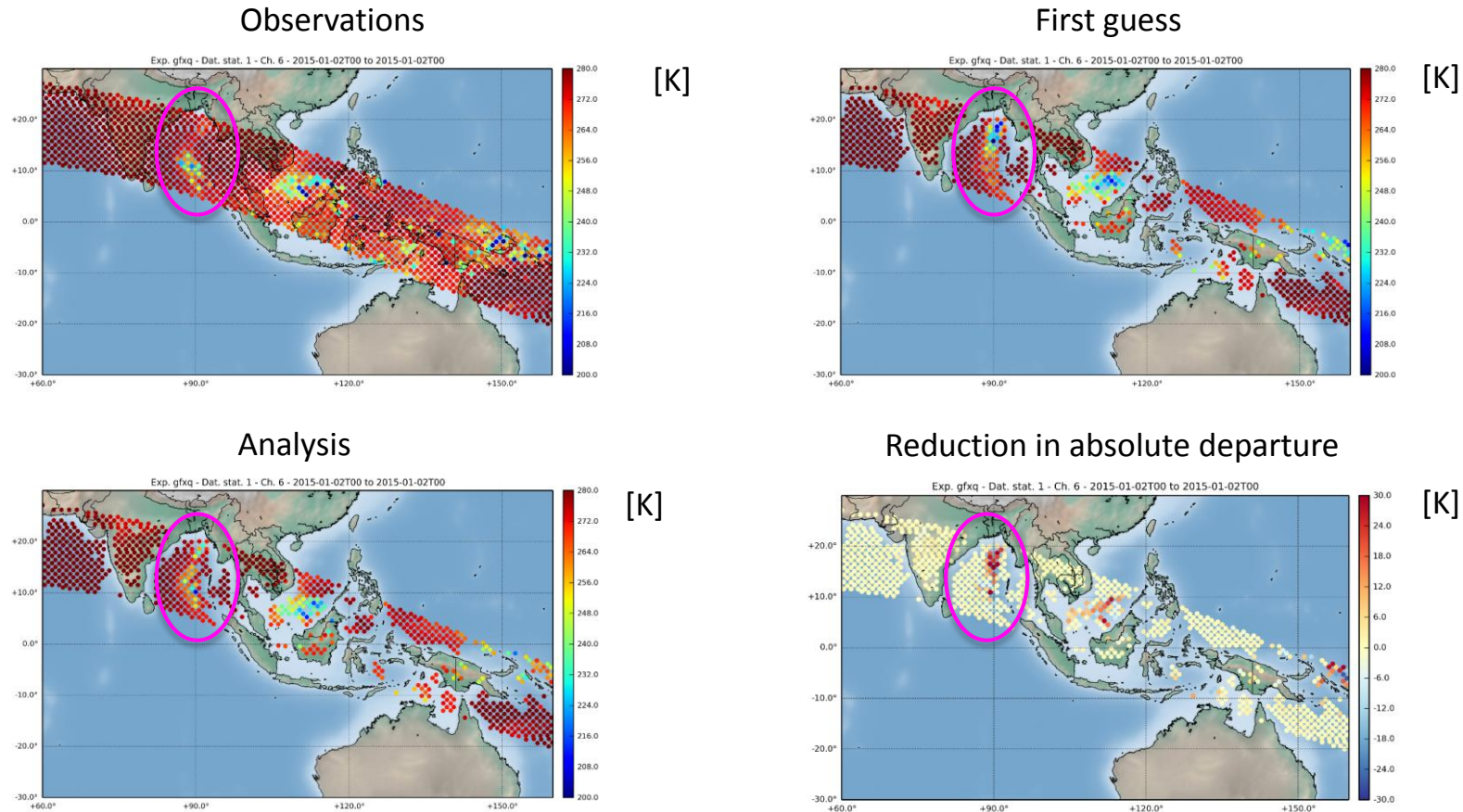


Early-range “degradation” is a verification artefact



# SAPHIR – tropical sensor with multiple overpasses per day

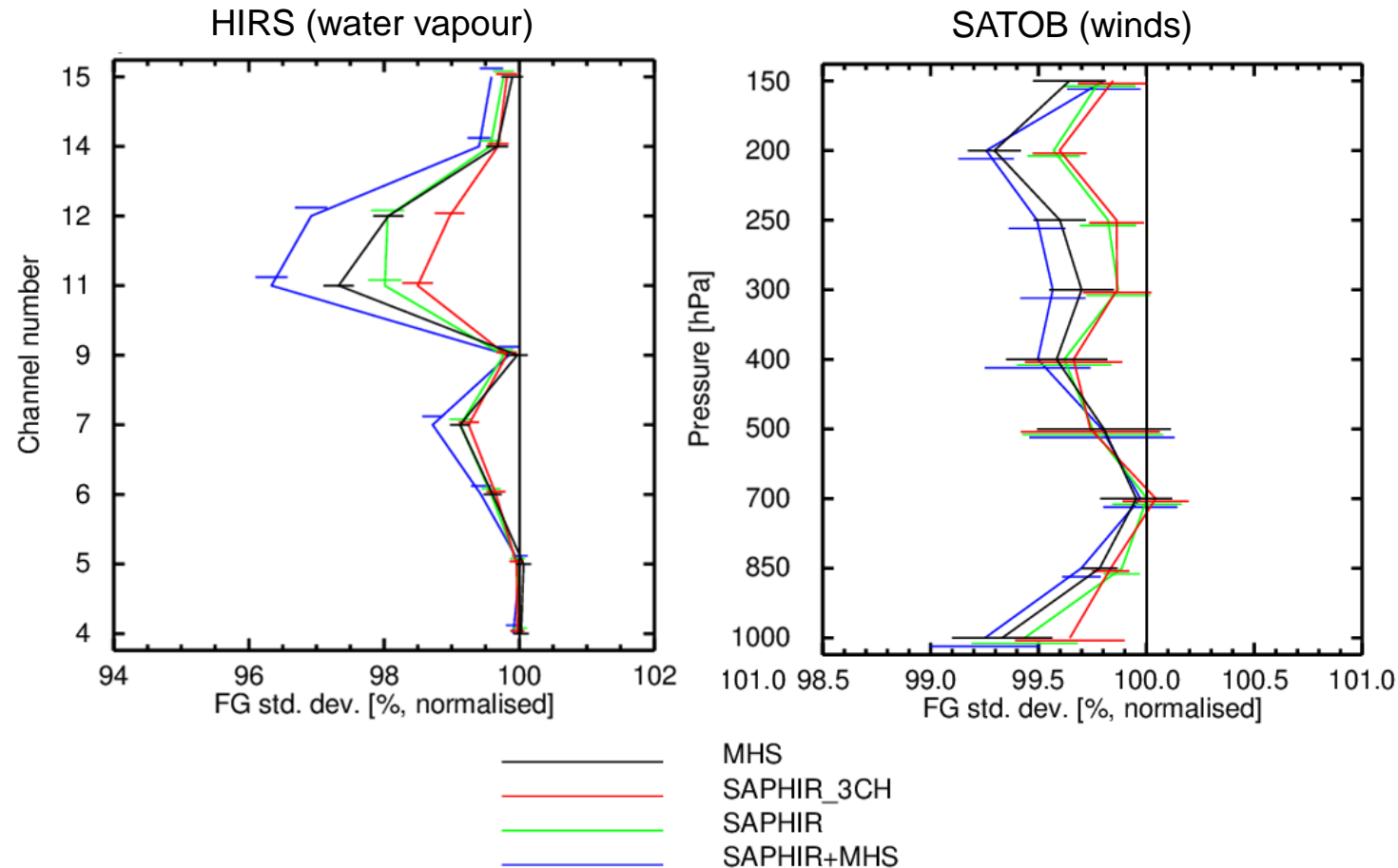
- MeghaTropiques satellite in 20° inclination orbit
- SAPHIR instrument has 5 183 GHz channels sensitive to humidity, cloud and precipitation through the troposphere
- Will be assimilated in all-sky conditions at ECMWF next year



# Tropical obstats: FG standard deviations

baseline: 7 microwave WV instruments + rest of global observing system. MHS removed in tropics

in tropics add: 4 MHS or 1 SAPHIR, or 4 MHS and SAPHIR

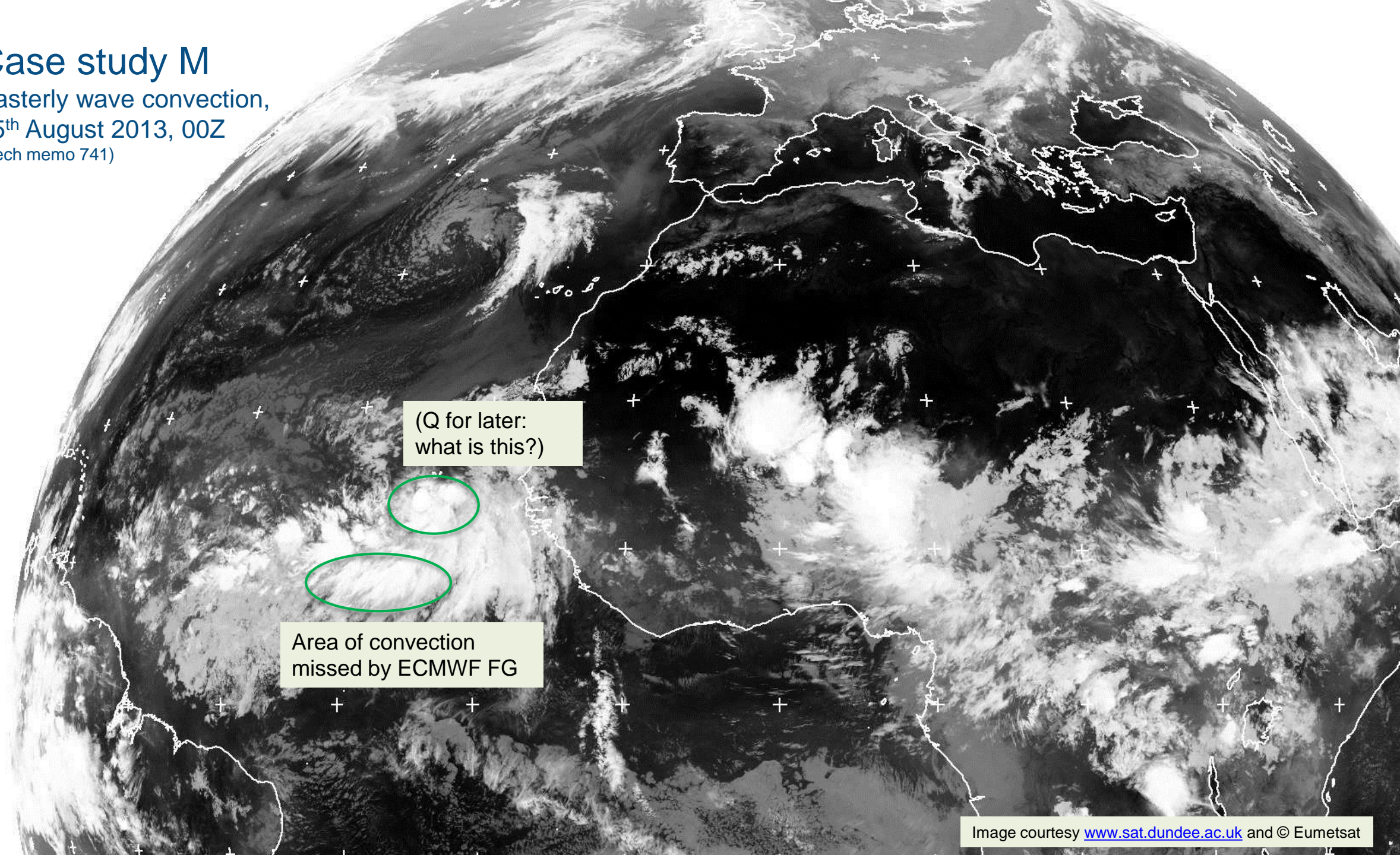


SAPHIR impact approaches that of the 4 MHS sounders in the tropics

SAPHIR adds information even on top of 11 existing sensors

# Case study M

Easterly wave convection,  
15<sup>th</sup> August 2013, 00Z  
(Tech memo 741)



(Q for later:  
what is this?)

Area of convection  
missed by ECMWF FG

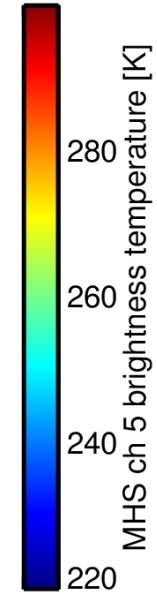
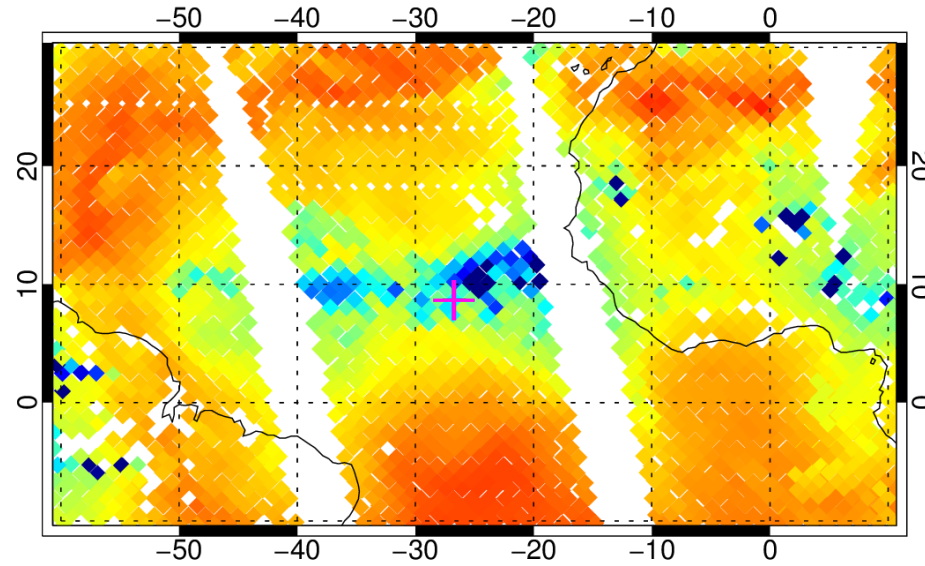


# MHS channel 5 brightness temperatures

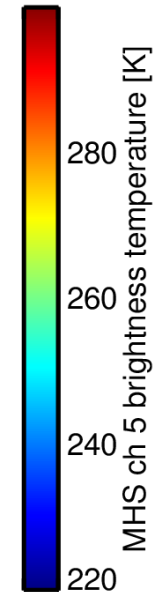
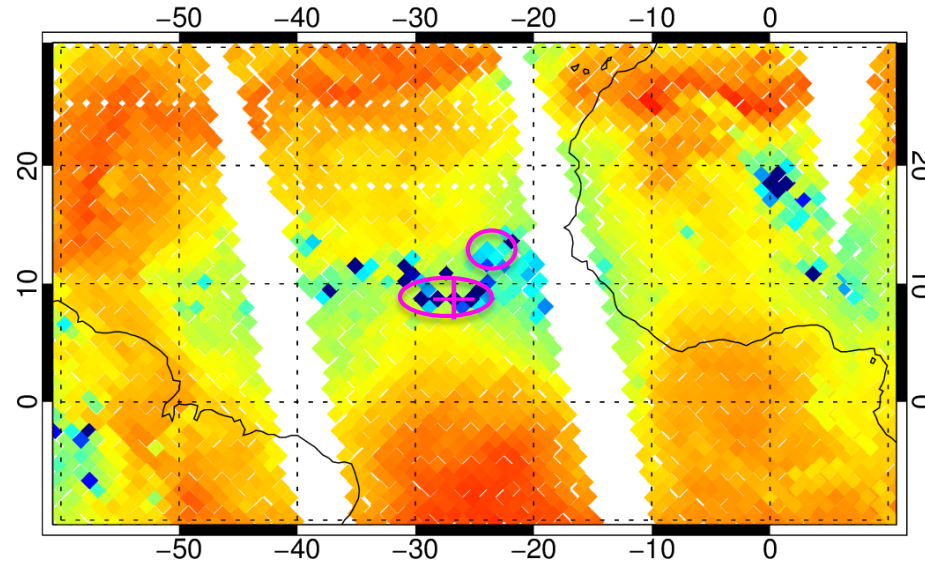
very low TB = hail/ graupel/ aggregates  
in convective cores

Single observation test  
with extra weight on  
the observation

First guess



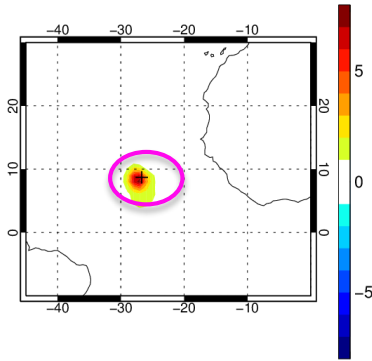
Observations



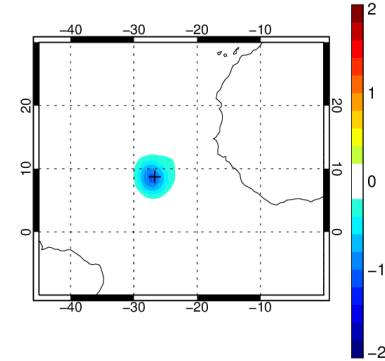
# Model increments: single obs

21Z  
(analysis  
time)

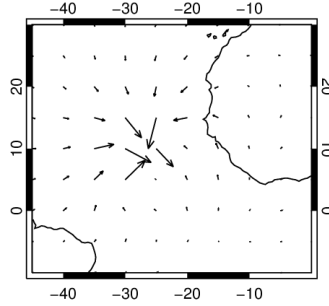
Column WV [ $\text{kg}/\text{m}^2$ ]



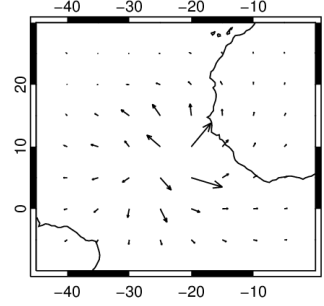
Sfc. pressure [hPa]



Low-level winds  
(850 hPa)



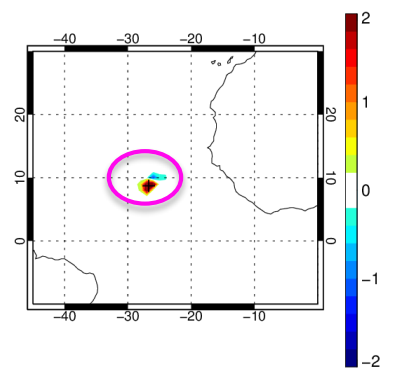
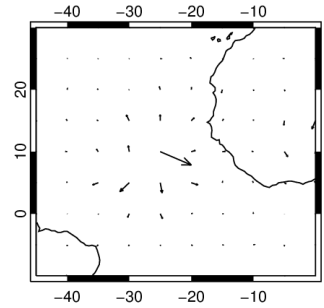
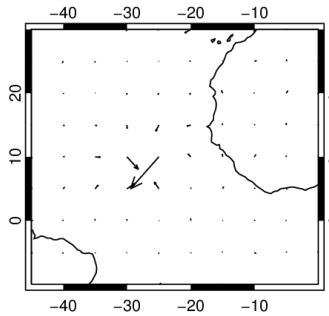
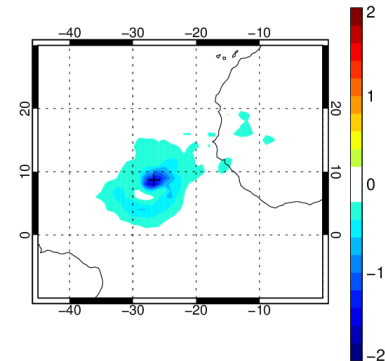
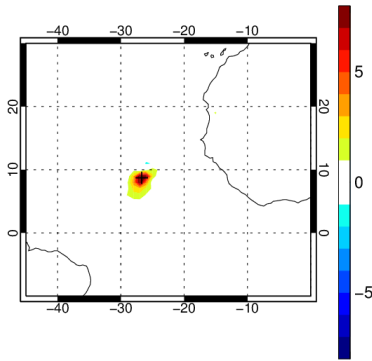
Upper-level winds  
(100 hPa)



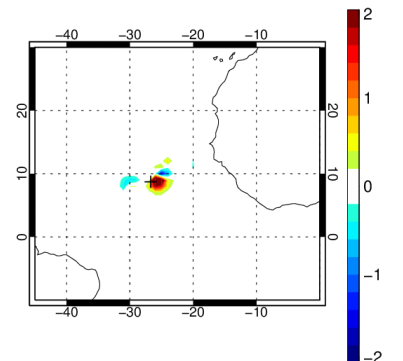
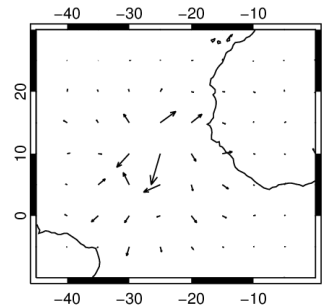
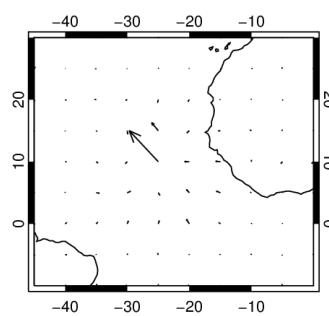
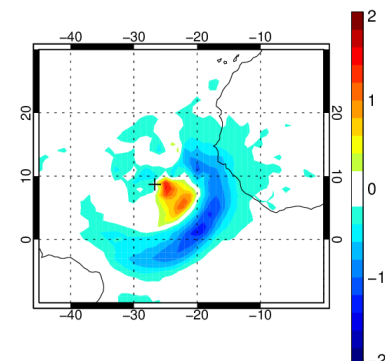
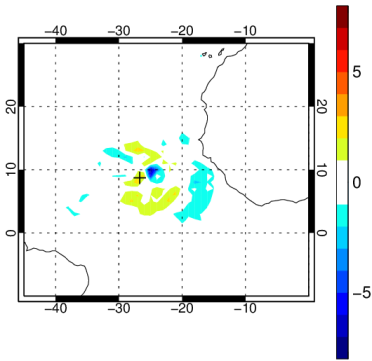
Column rain [ $\text{kg}/\text{m}^2$ ]

N/A

00Z (obs  
time)



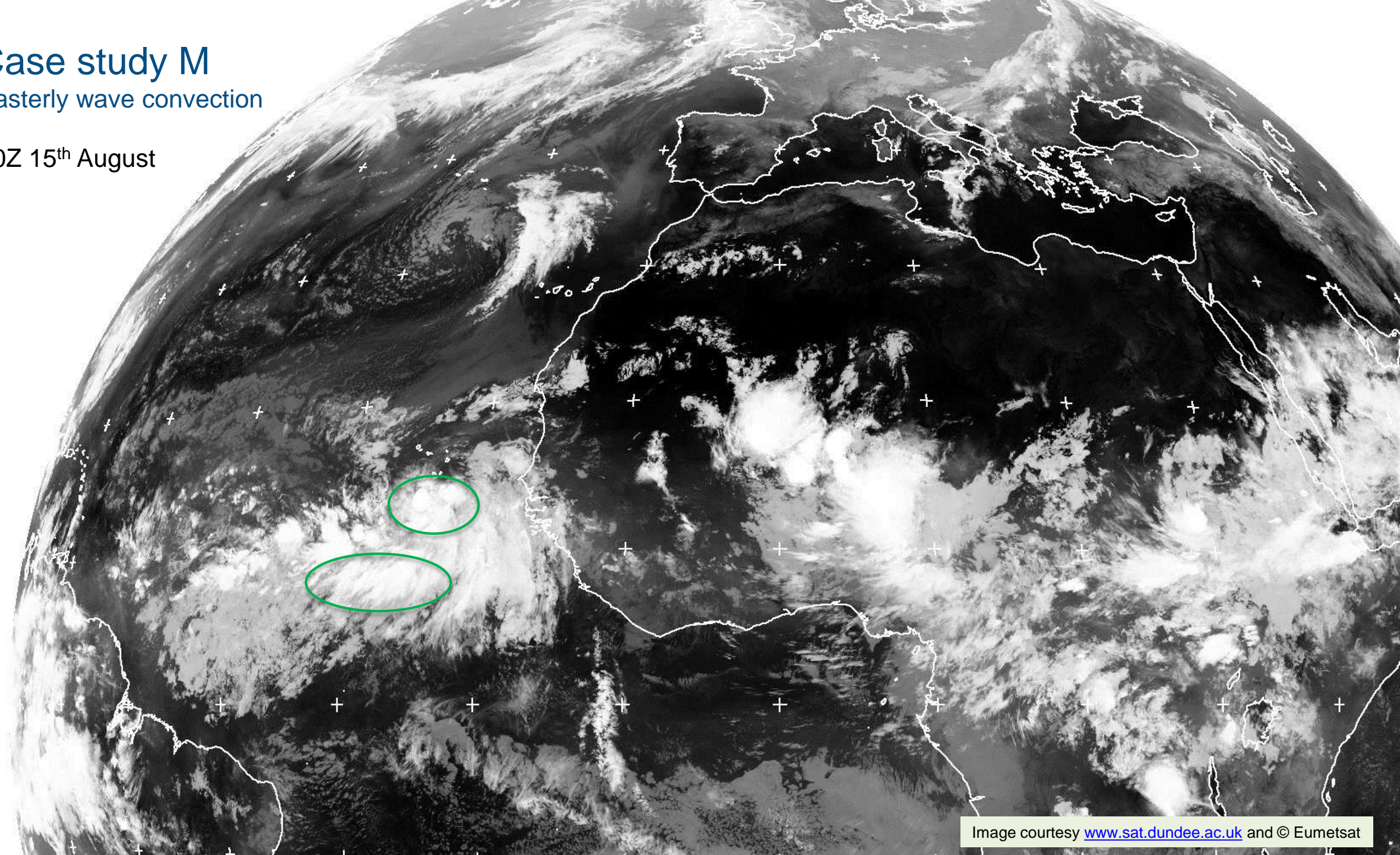
09Z



# Case study M

## Easterly wave convection

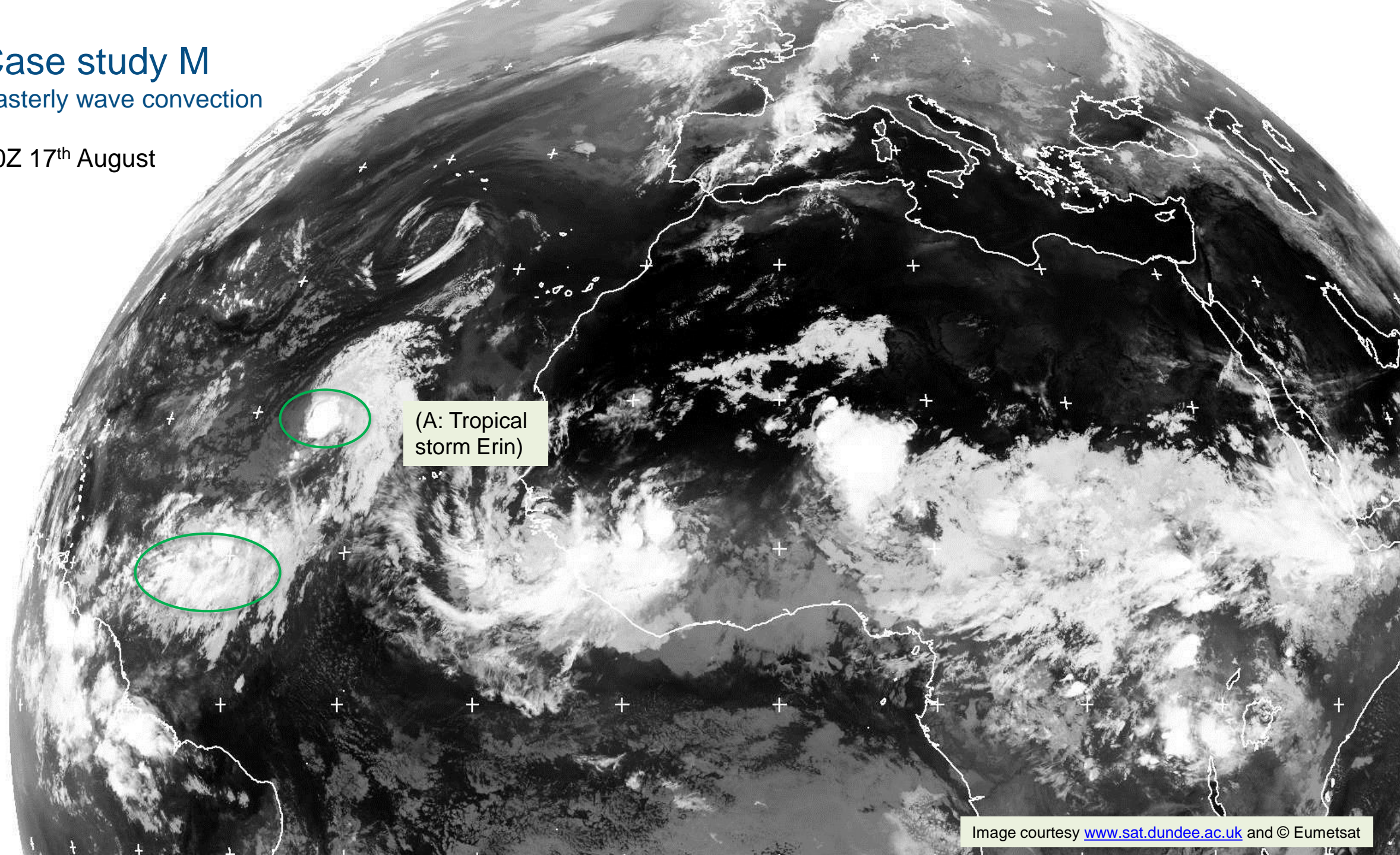
00Z 15<sup>th</sup> August



# Case study M

## Easterly wave convection

00Z 17<sup>th</sup> August



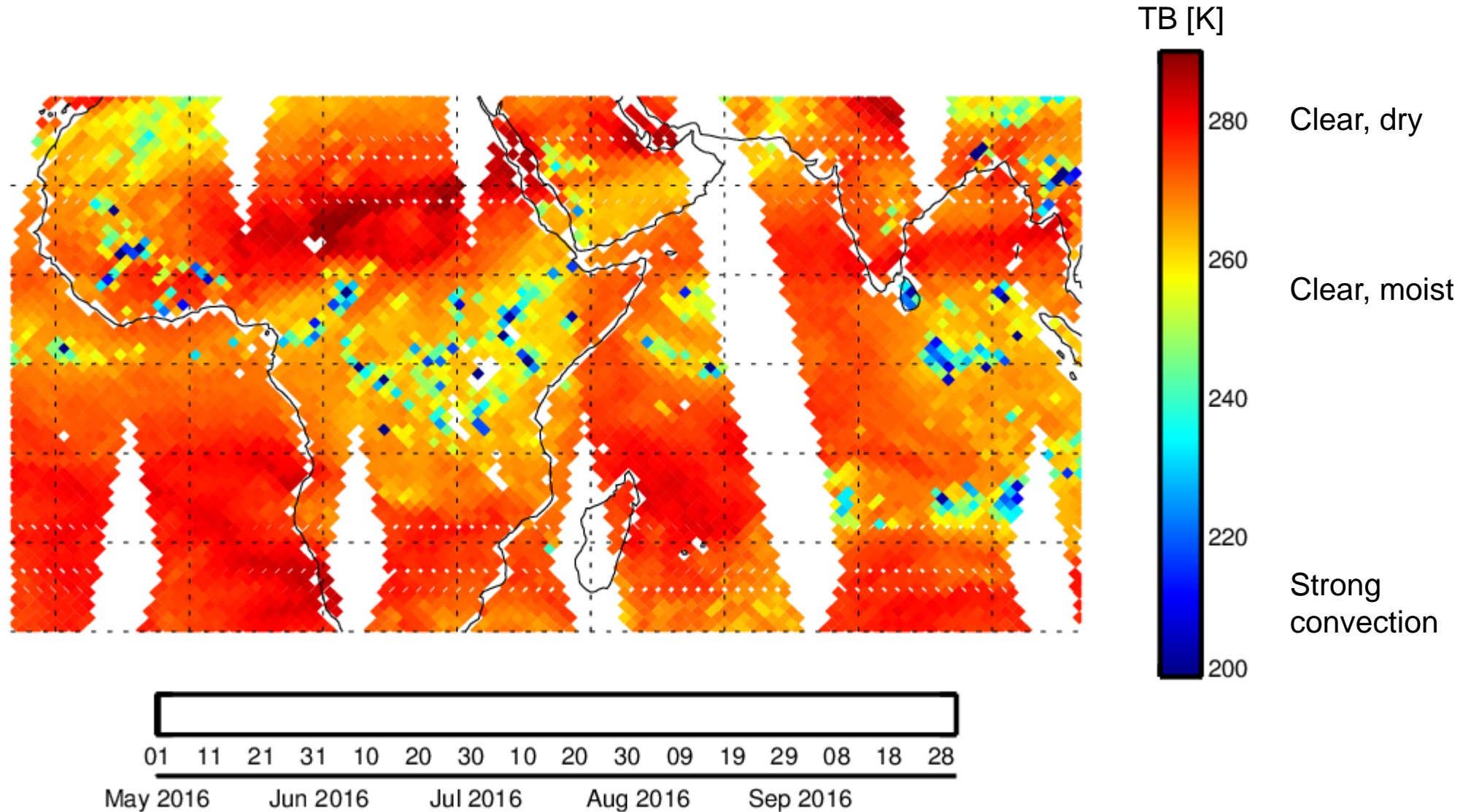
(A: Tropical storm Erin)

# Boreal summer: monsoon and easterly waves

May to September 2016

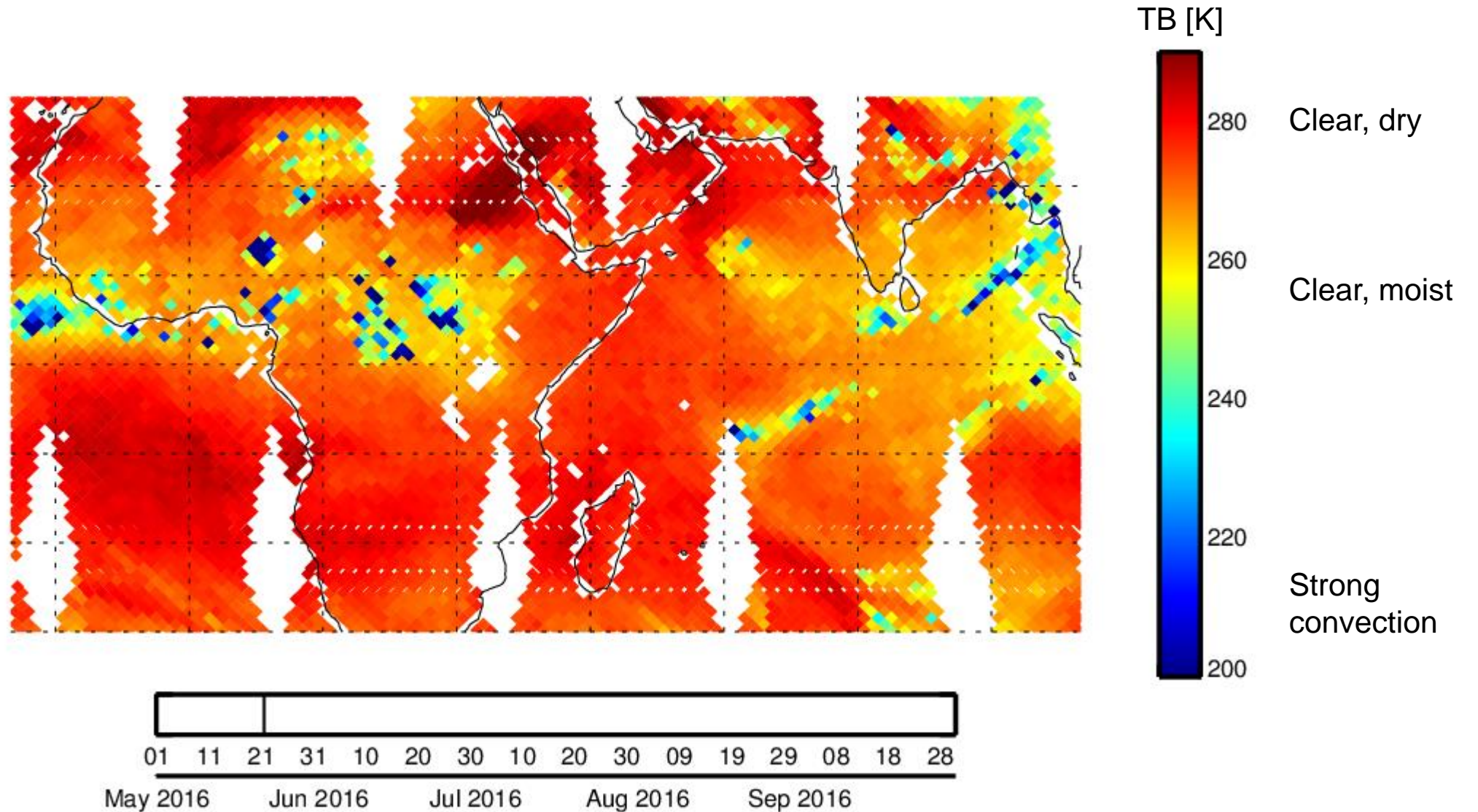
# May – September 2016 at 183 GHz

SSMIS F-17 ch 9 ( $183 \pm 7$  GHz) - 6am / 6pm LST coverage



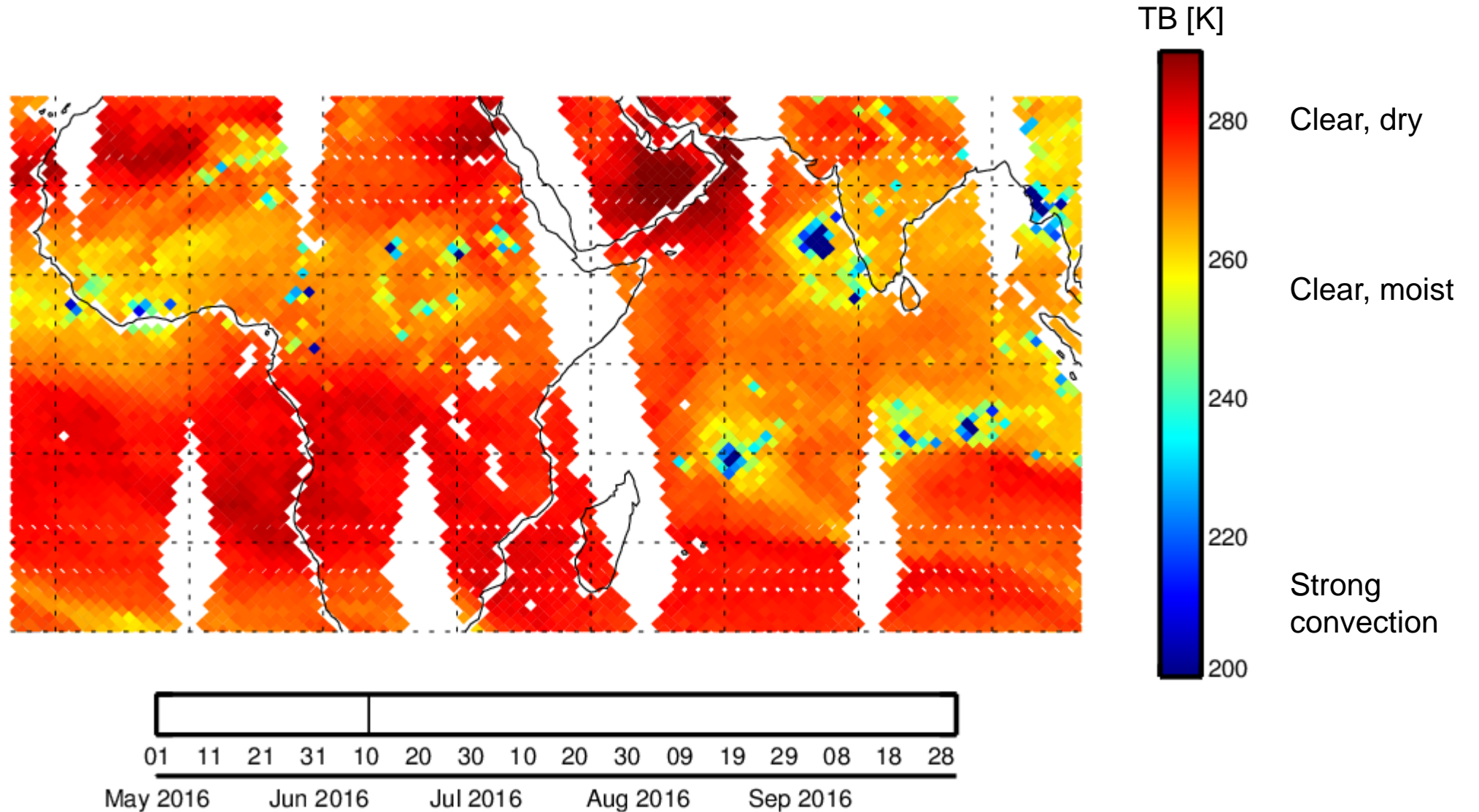
# May – September 2016 at 183 GHz

SSMIS F-17 ch 9 ( $183 \pm 7$  GHz)



# May – September 2016 at 183 GHz

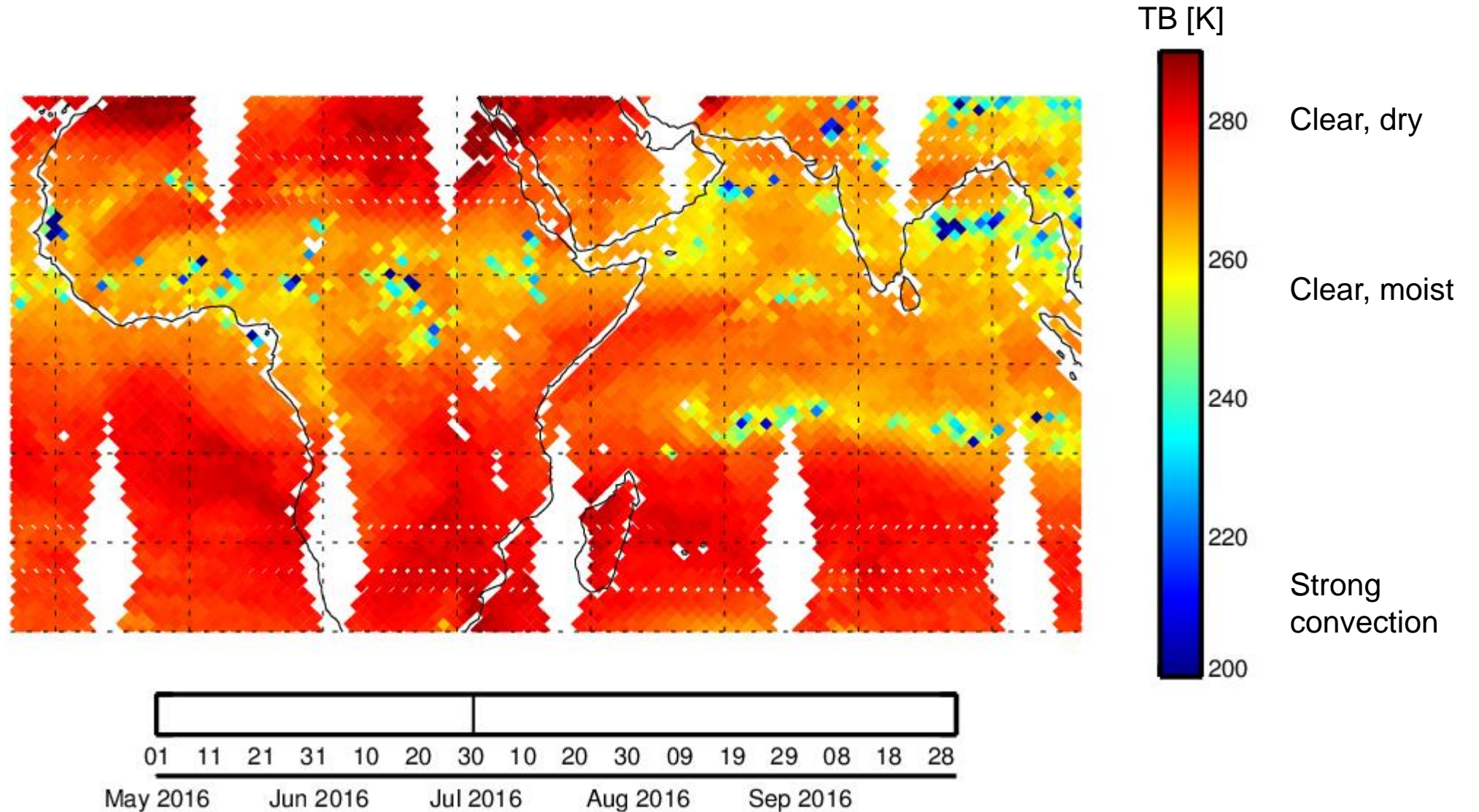
SSMIS F-17 ch 9 ( $183 \pm 7$  GHz)





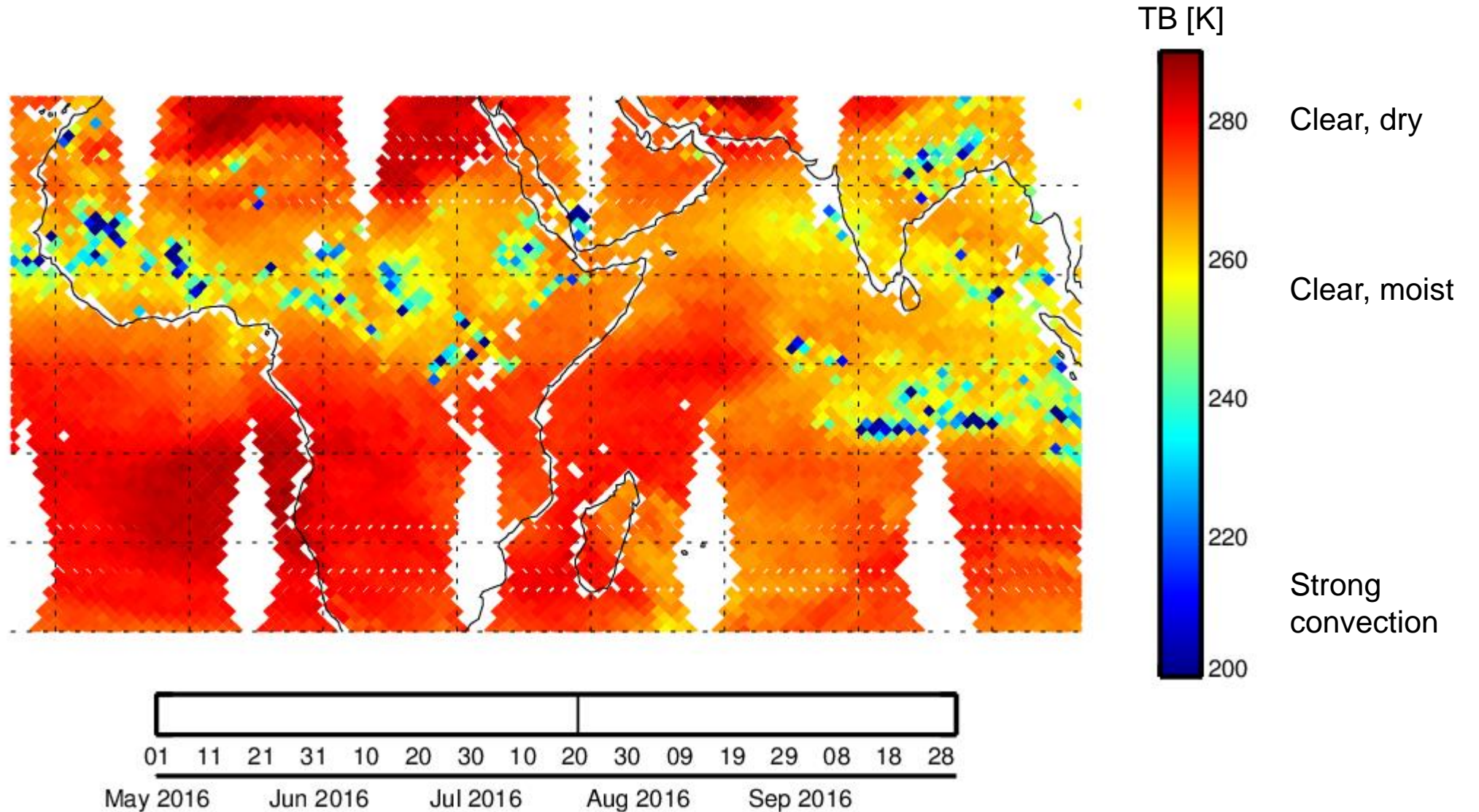
# May – September 2016 at 183 GHz

SSMIS F-17 ch 9 ( $183 \pm 7$  GHz)



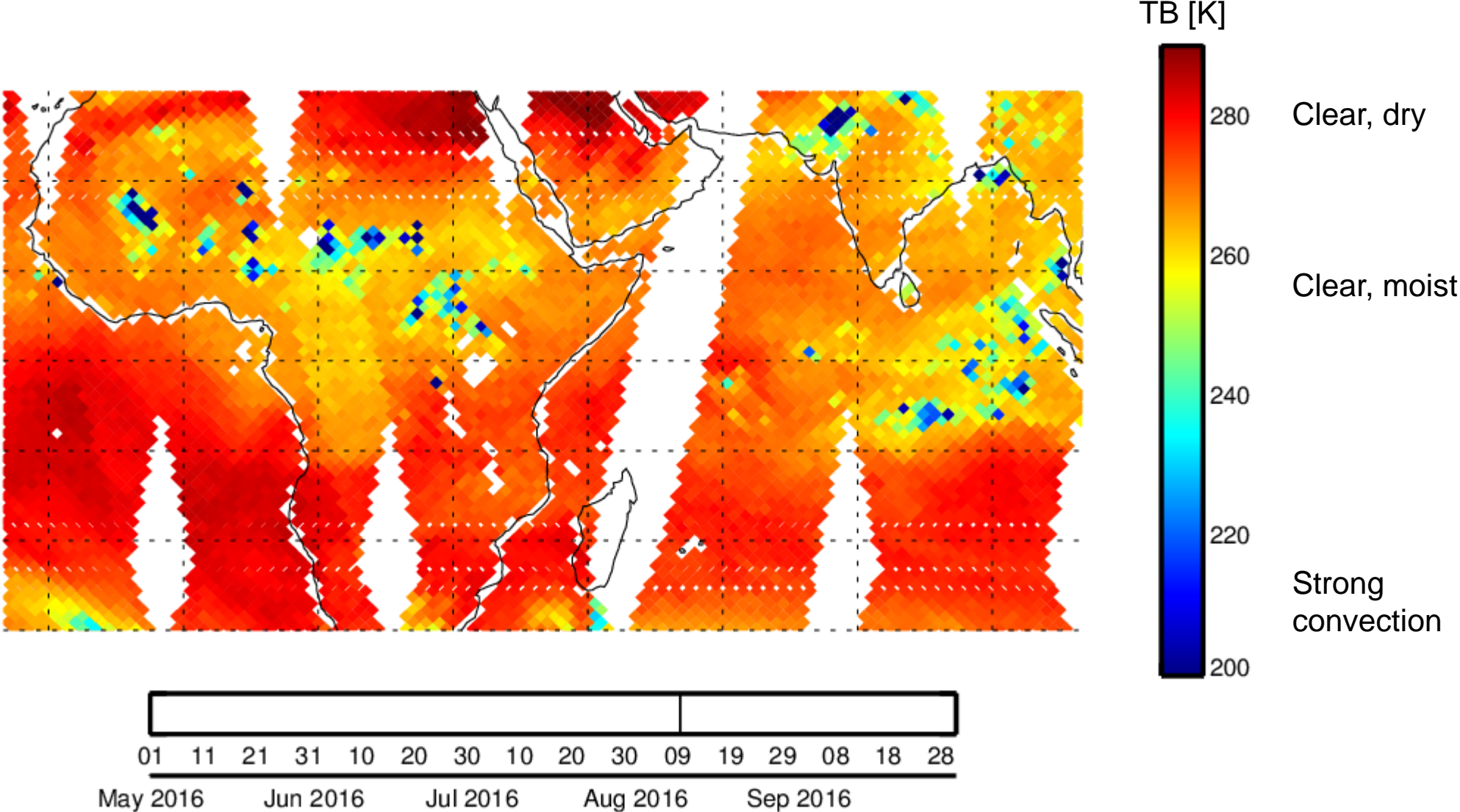
# May – September 2016 at 183 GHz

SSMIS F-17 ch 9 ( $183 \pm 7$  GHz)



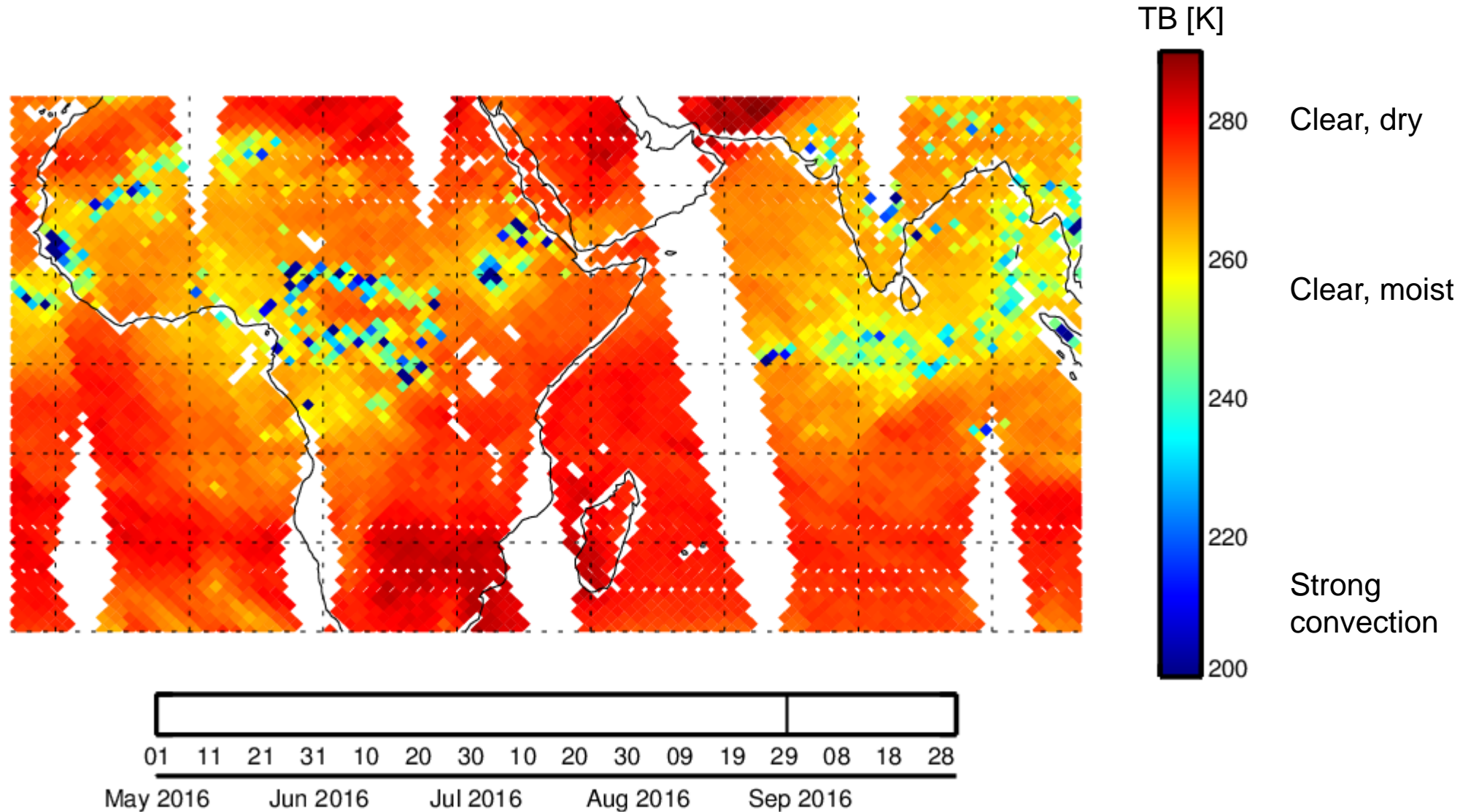
# May – September 2016 at 183 GHz

SSMIS F-17 ch 9 (183 ± 7 GHz)



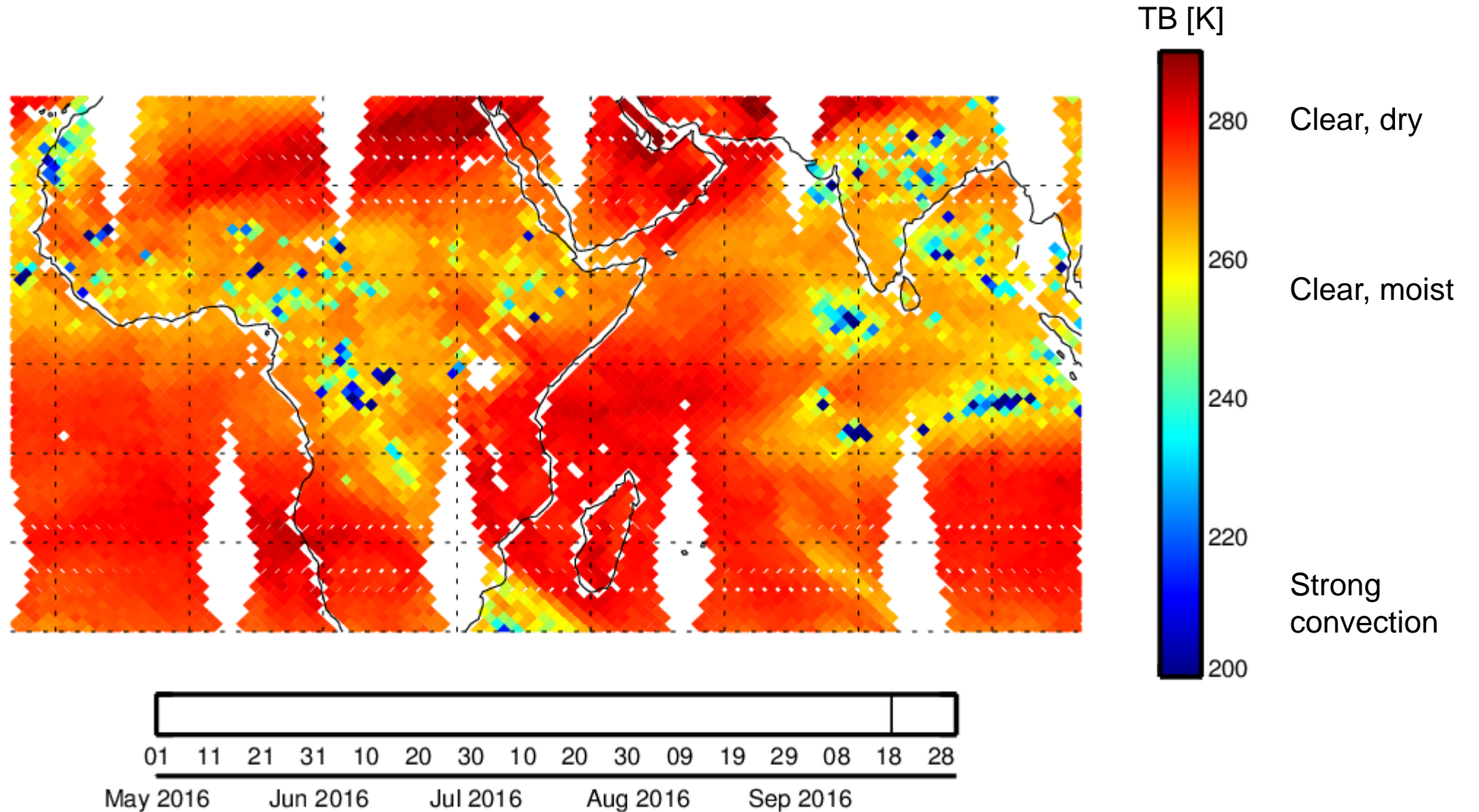
# May – September 2016 at 183 GHz

SSMIS F-17 ch 9 ( $183 \pm 7$  GHz)



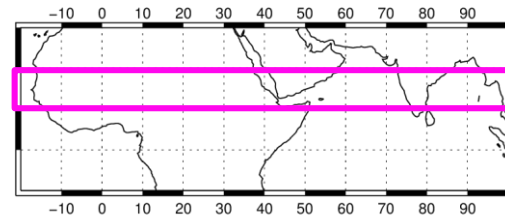
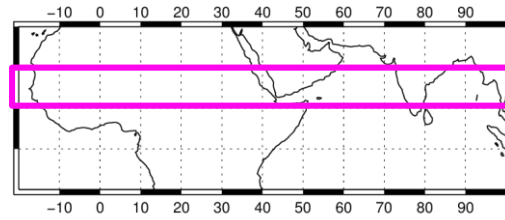
# May – September 2016 at 183 GHz

SSMIS F-17 ch 9 ( $183 \pm 7$  GHz)

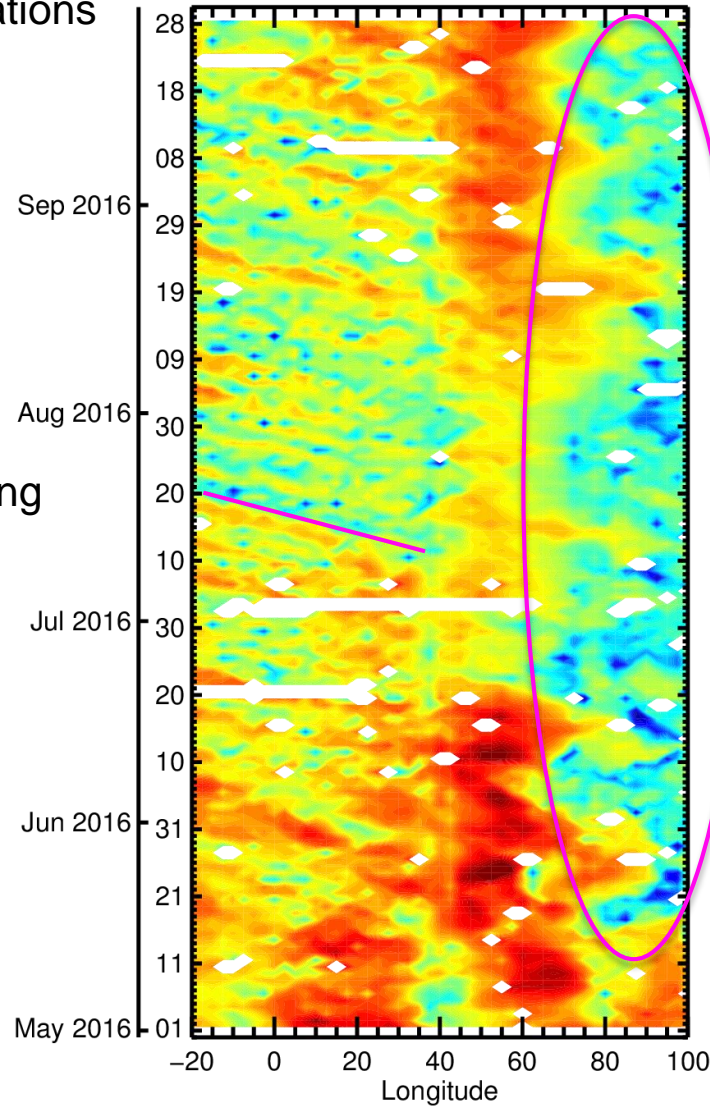




# May-September 2016



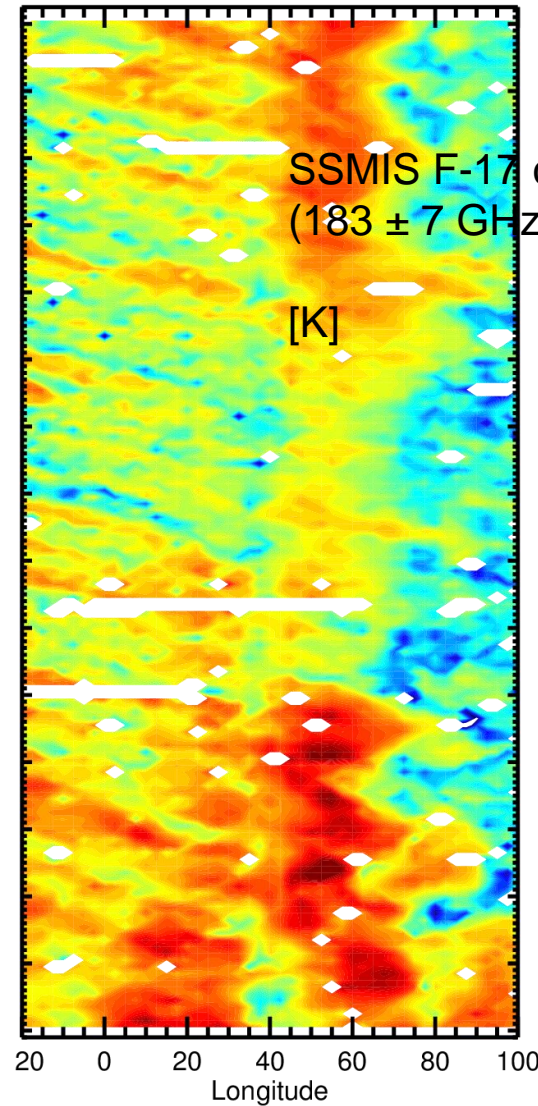
Observations



Easterly waves bringing rain to the Sahel

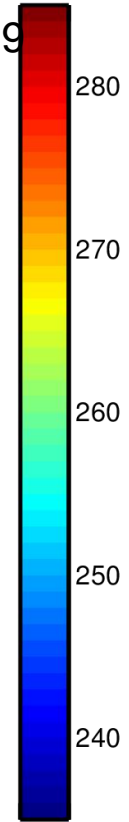
Asian monsoon

First guess

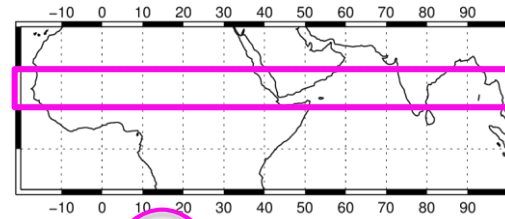
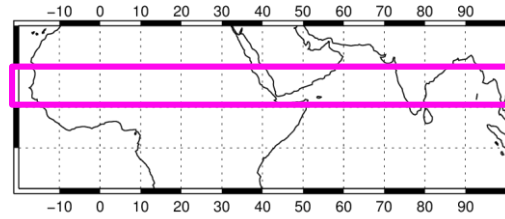


SSMIS F-17 ch 9  
( $183 \pm 7$  GHz)  
[K]

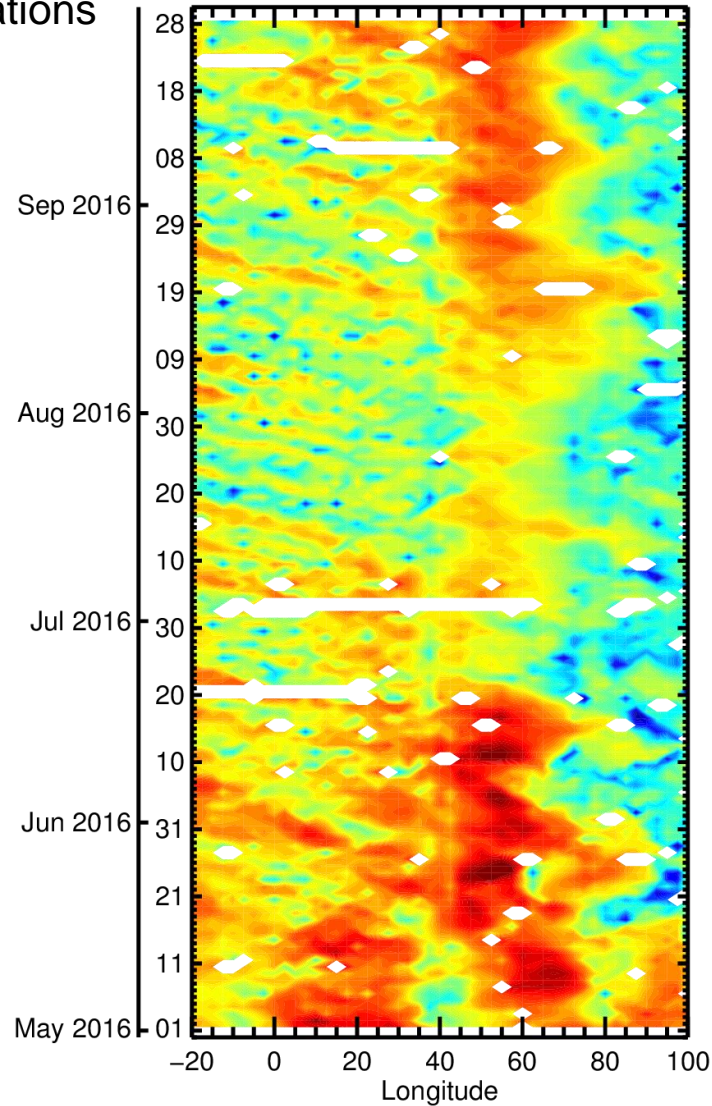
SSMIS F-17 ch 9  
( $183 \pm 7$  GHz)  
[K]



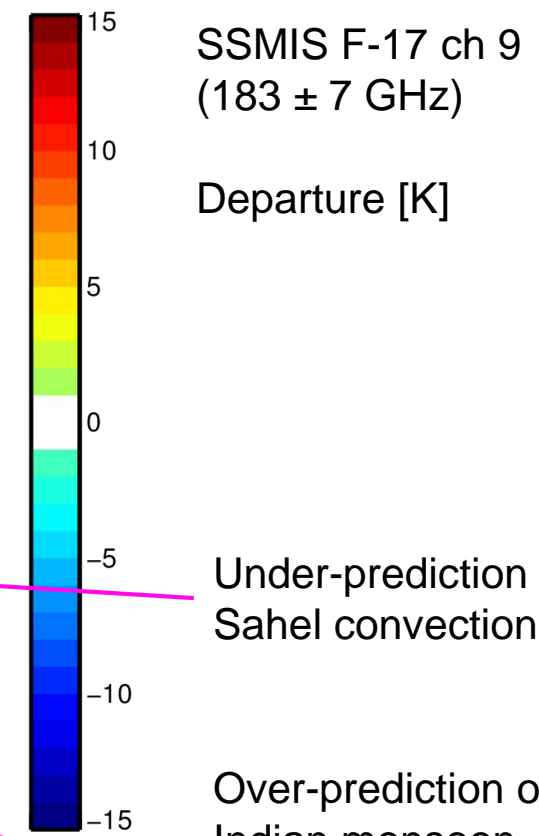
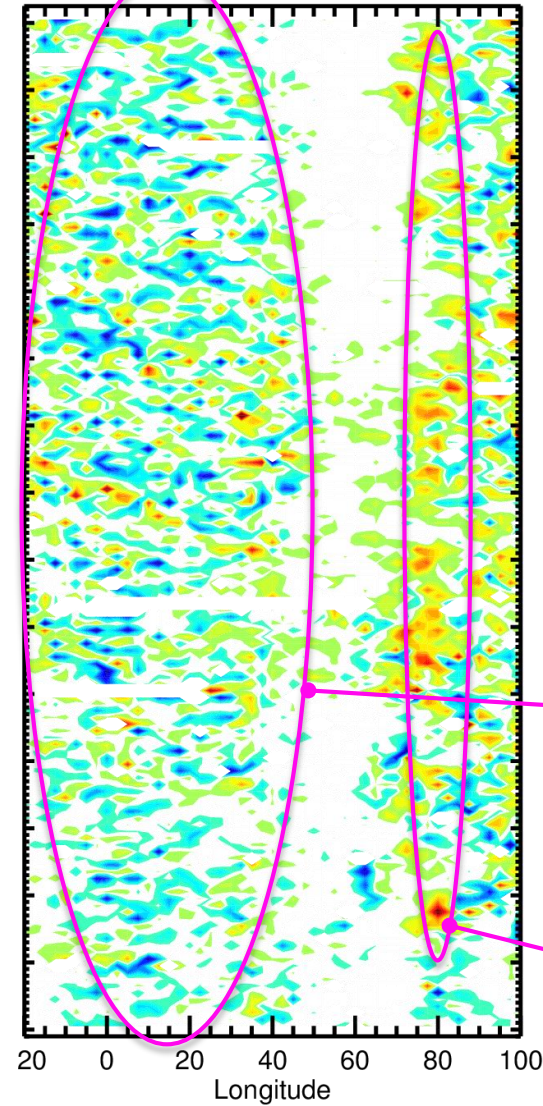
# May-September 2016



Observations



Obs - first guess



SSMIS F-17 ch 9  
(183 ± 7 GHz)

Departure [K]

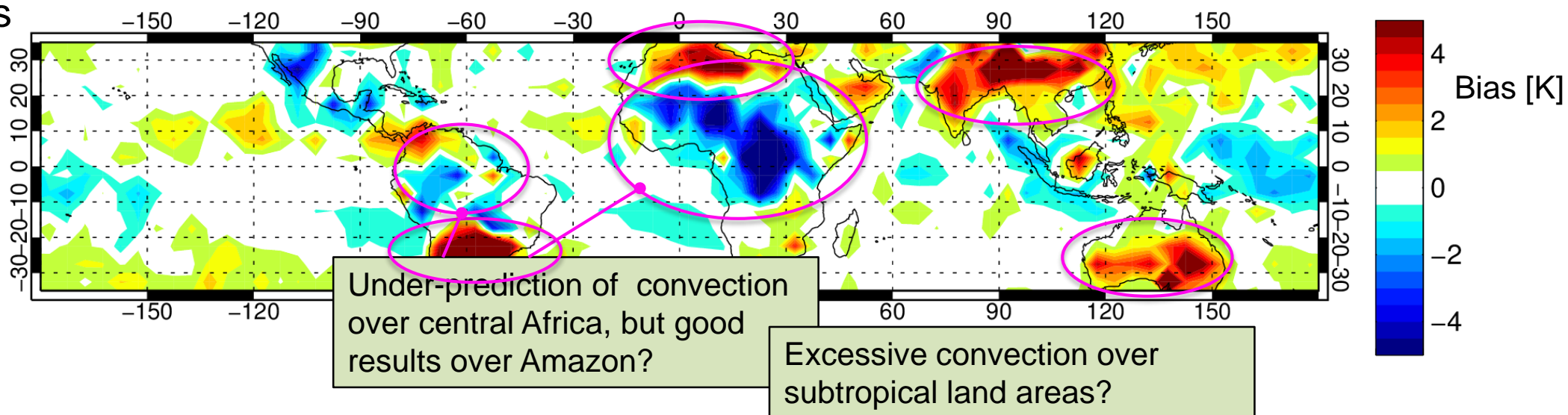
Under-prediction of  
Sahel convection?

Over-prediction of  
Indian monsoon  
convection?

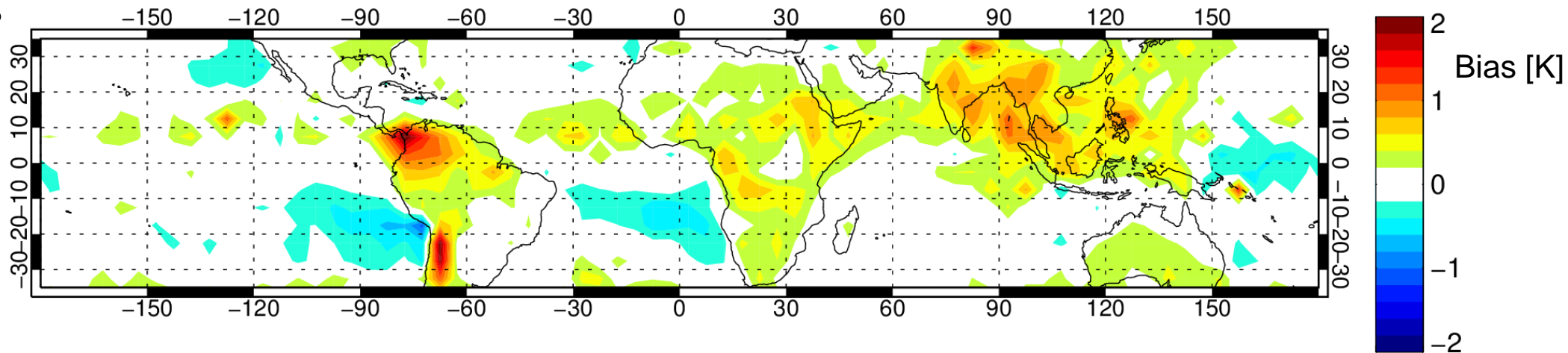


# May-September SSMIS ch. 9 mean bias (after VarBC)

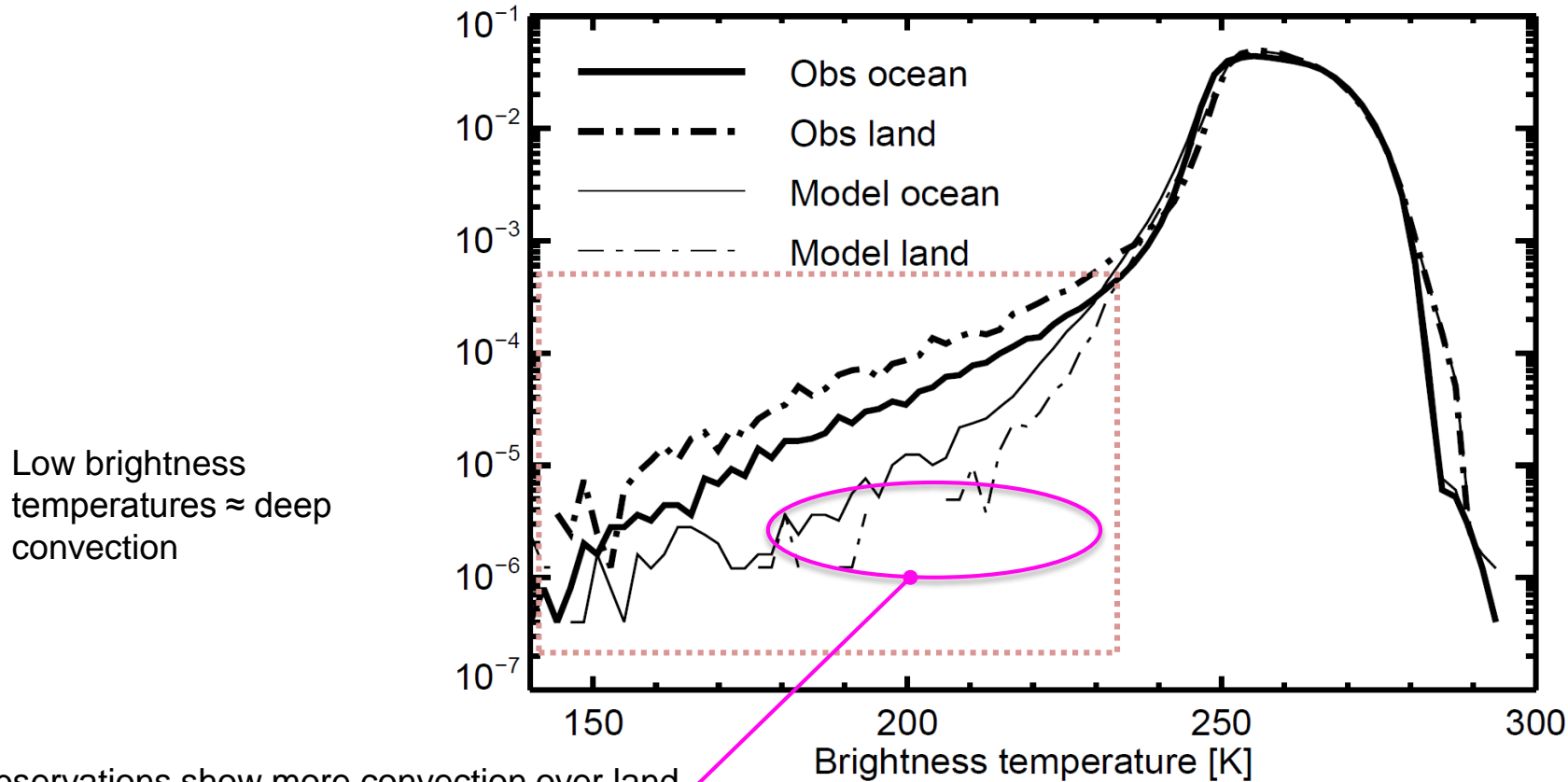
## Cloudy scenes



## Clear scenes



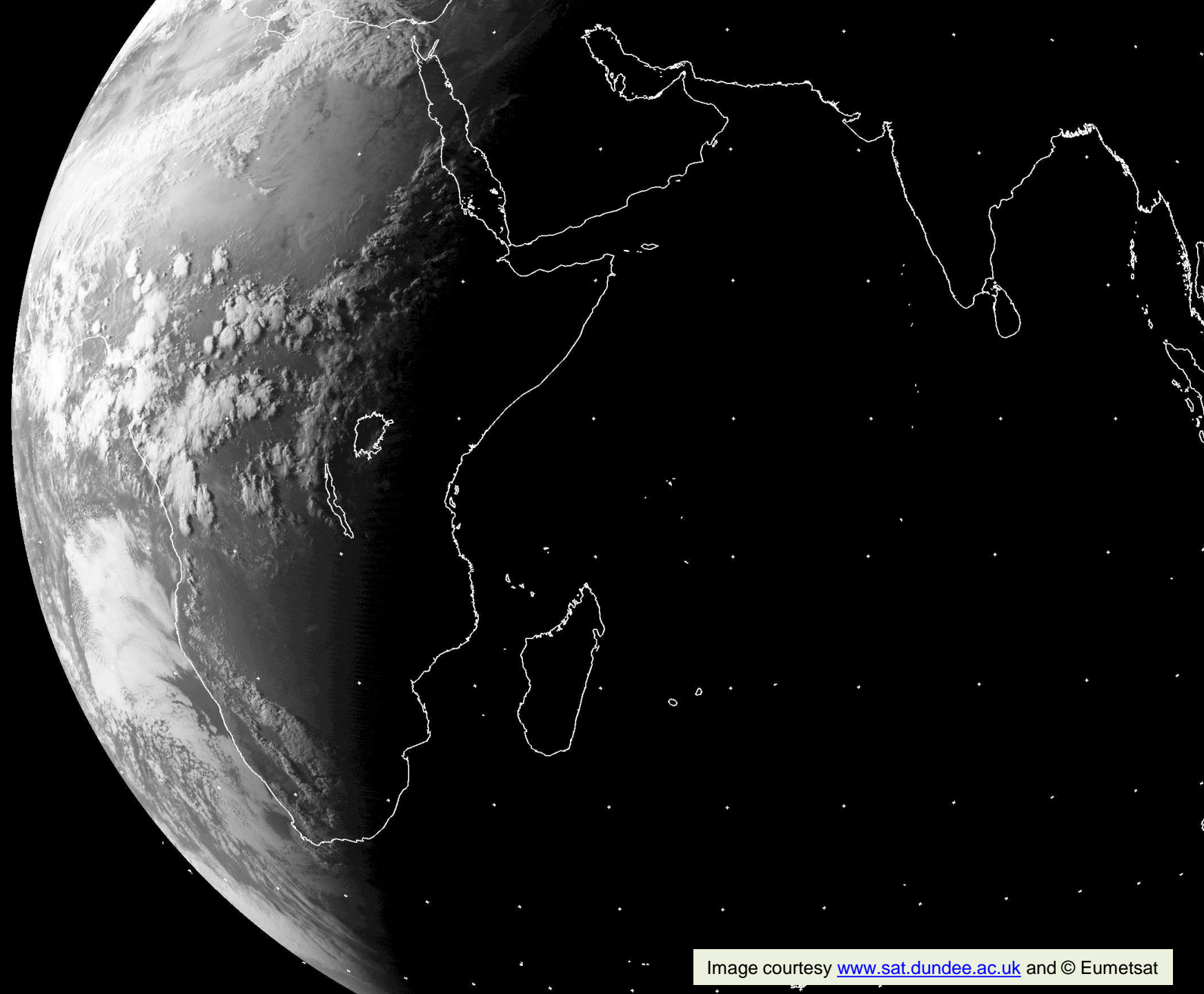
# Simulated vs. observed brightness temperatures at $183\pm 1$ GHz



From Geer and Baordo (2014) using sector snowflake over land and ocean

# Evening mesoscale convection

May 7<sup>th</sup> 2016, ~4.30pm

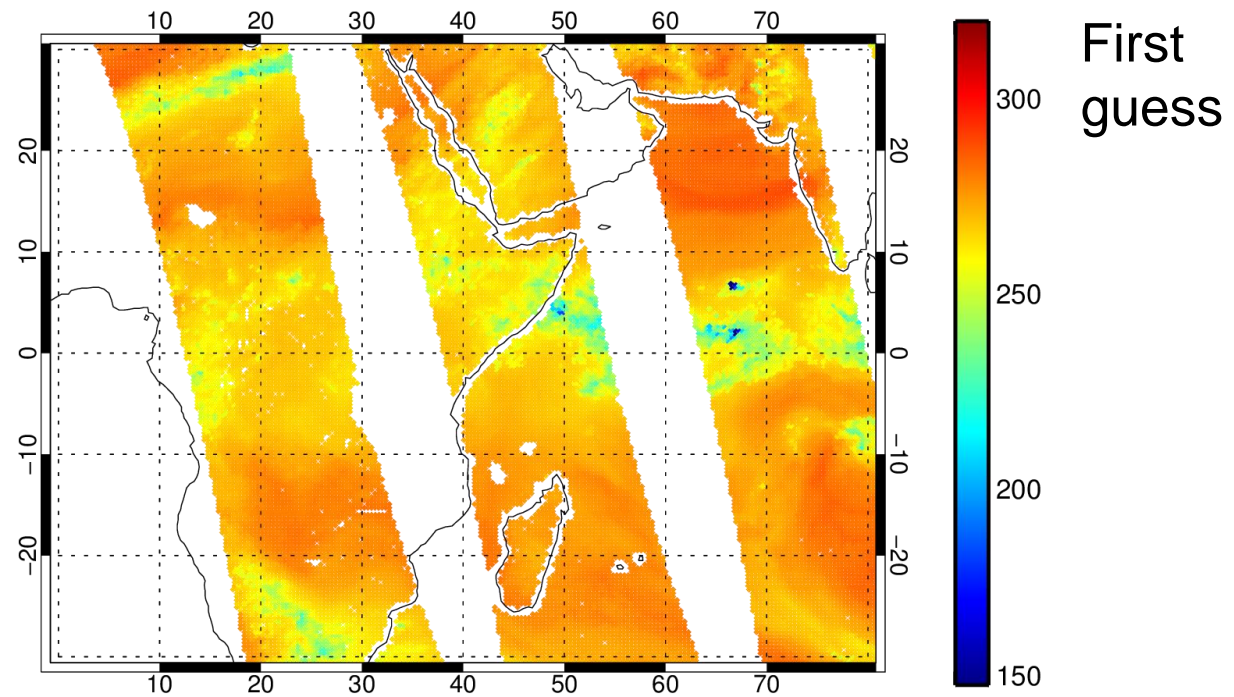
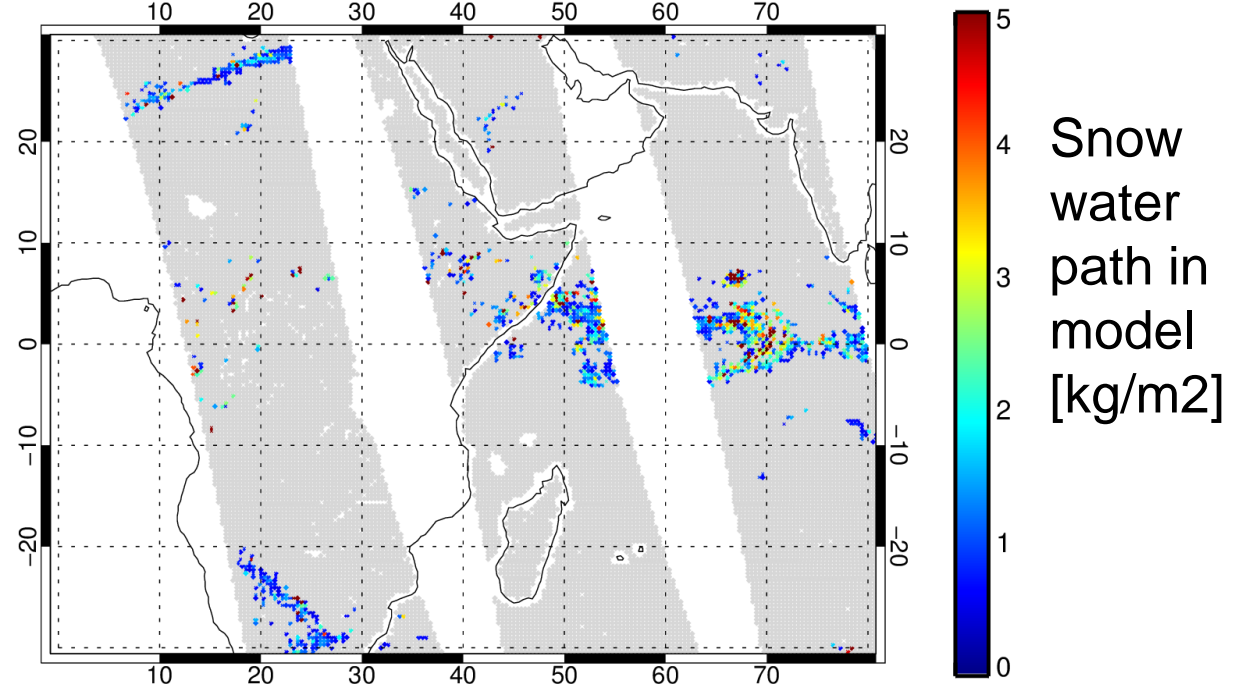
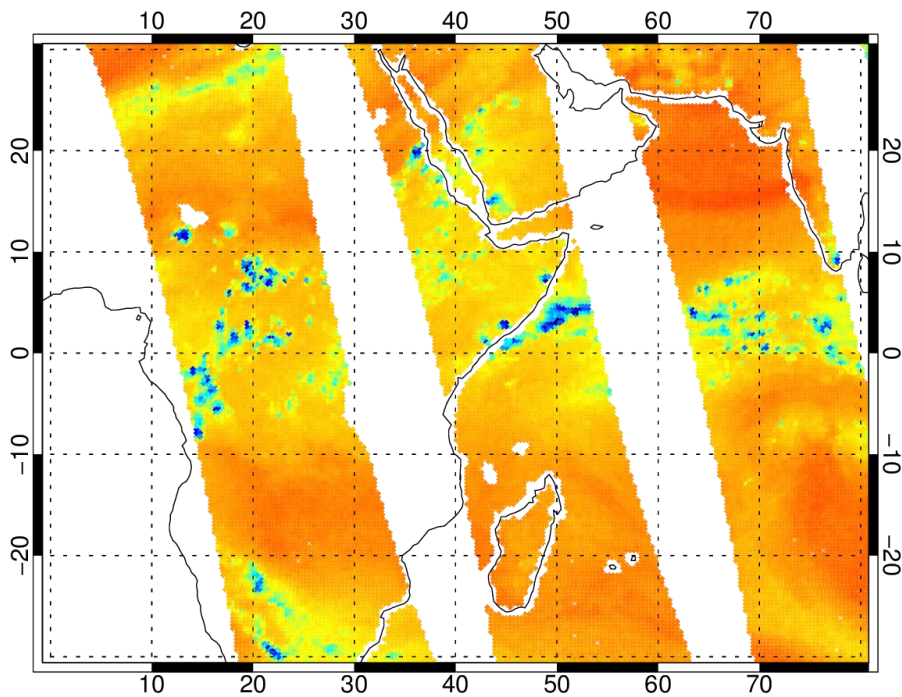


# Evening mesoscale convection

SSMIS ch.9, May 7<sup>th</sup> 2016, ~6pm local time

- 40km superobs (8x usual data density)
- In model, turn off cloud fraction kludge over land surfaces (use effective cloud fraction as for ocean)

Obs



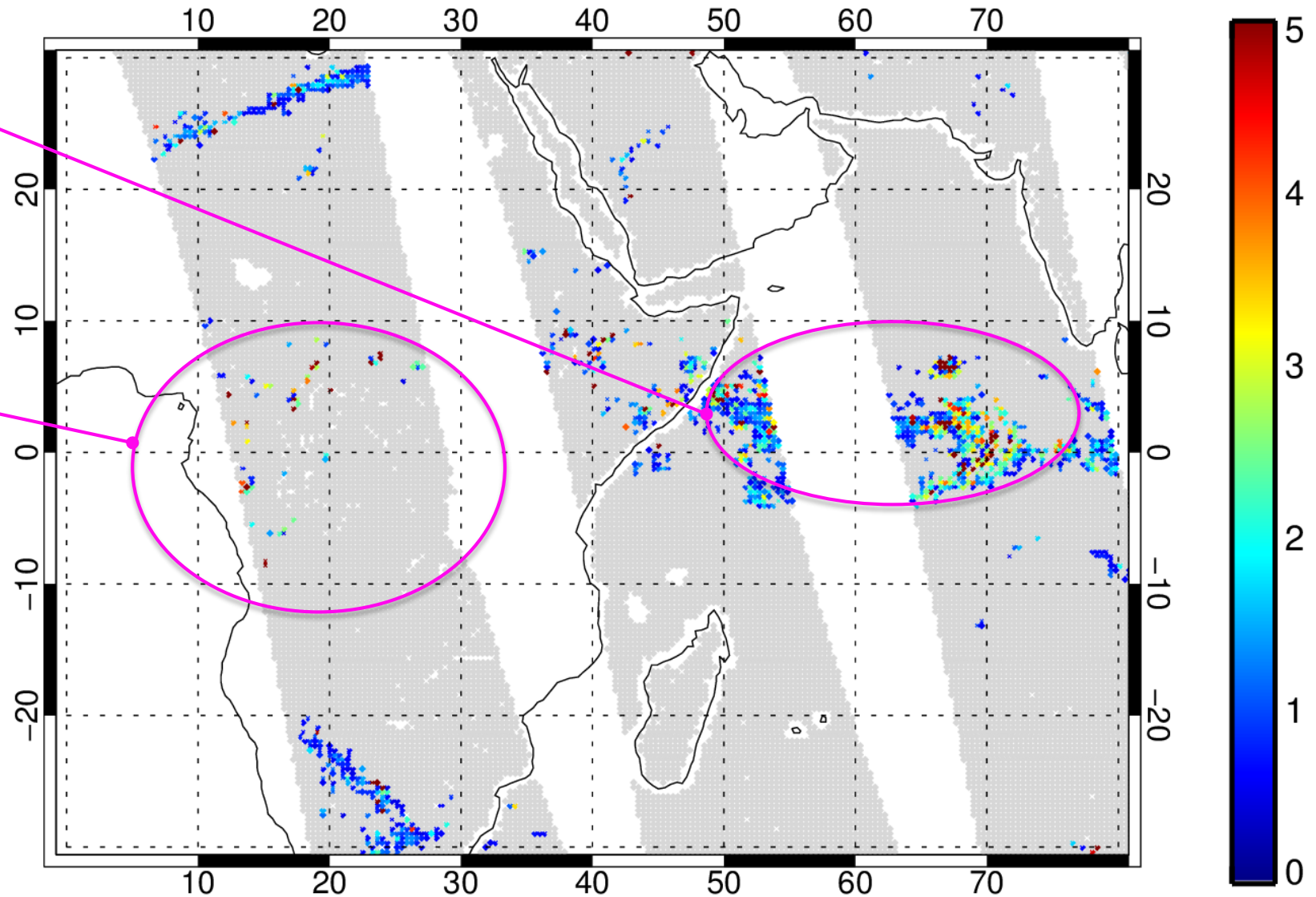
# Convective issues in the forecast model

SSMIS locations, May 7<sup>th</sup> 2016, ~6pm local time

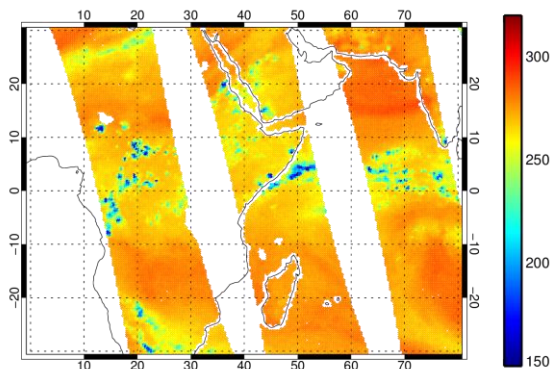
Snow water path  
in model [kg/m<sup>2</sup>]

Over ocean, model creates realistic  
organised convection systems  
(~100km scale)

Over central Africa, convection is too  
sparse, too disorganised and on too  
small scales (<40km) Or is the party  
already over?



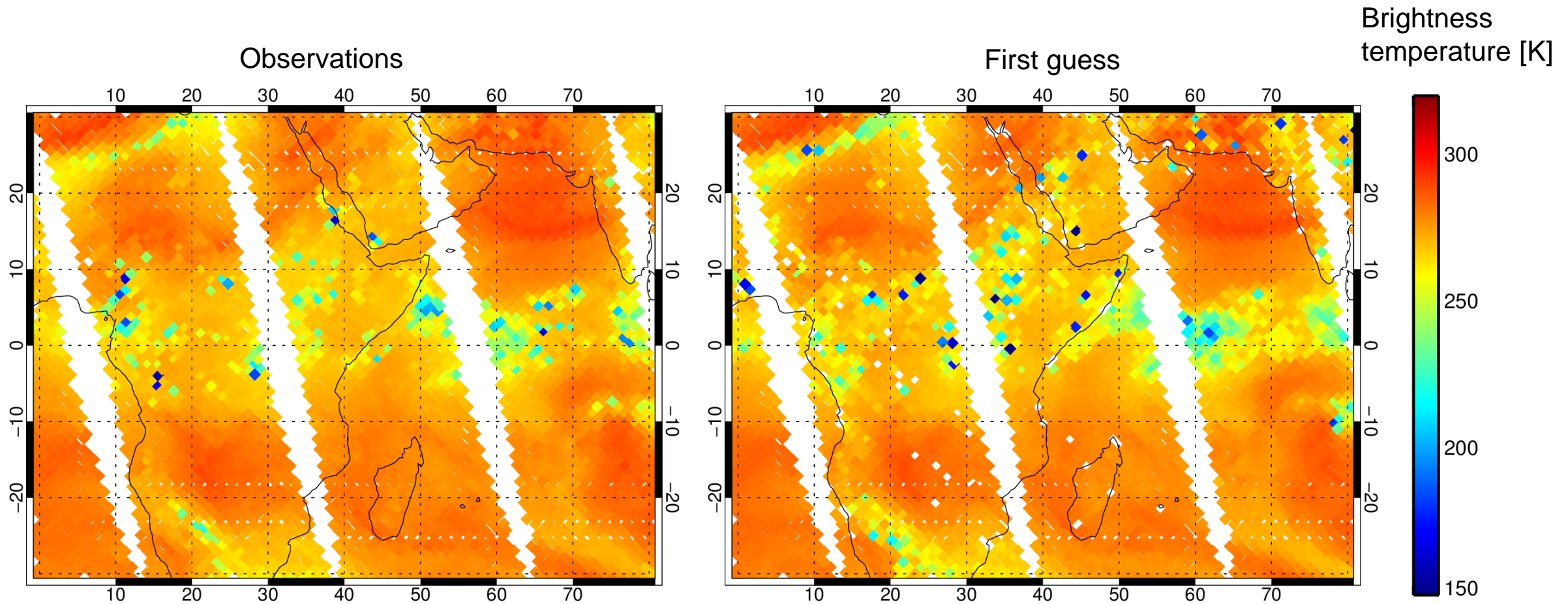
Observations



# Convective issues in the forecast model

NOAA-19 MHS locations, May 7<sup>th</sup> 2016, ~3pm local time

Wind back the clock 3 hours and go back to using the Cmax cloud fraction kludge to boost simulated “convection”



# Diurnal cycle with SAPHIR ch5 (183±7 GHz) Sahel

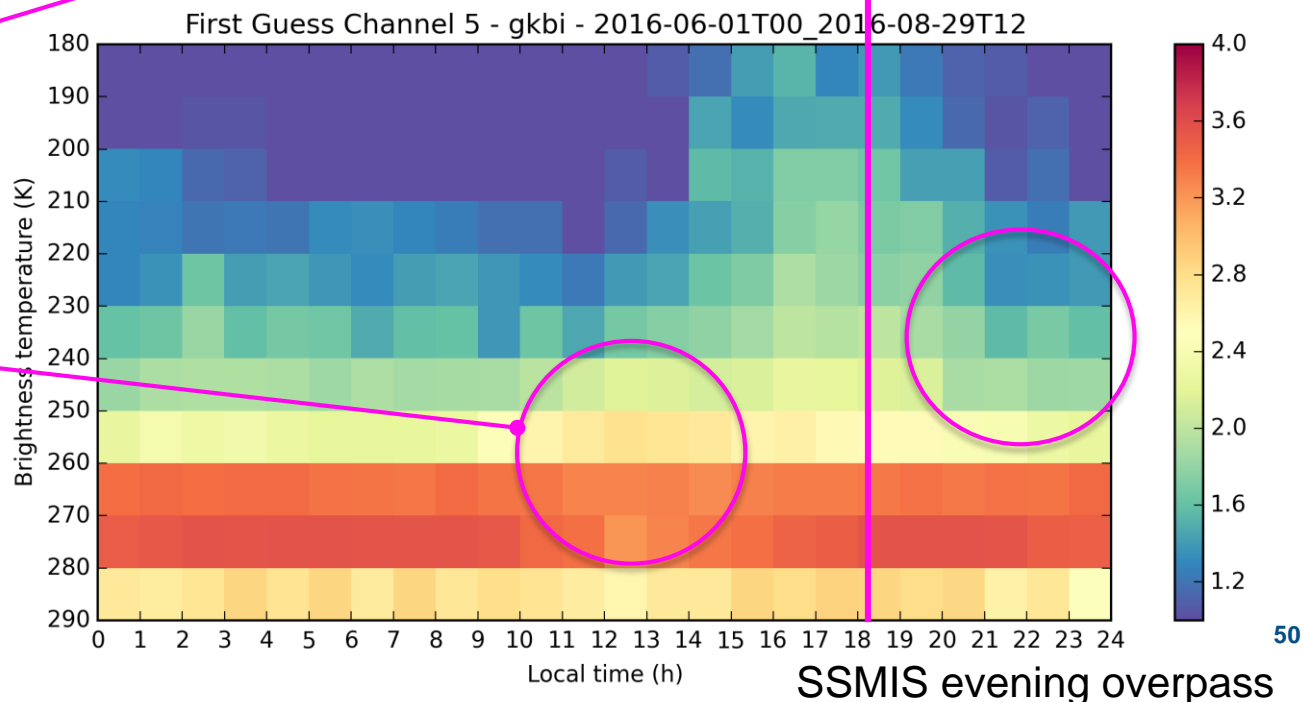
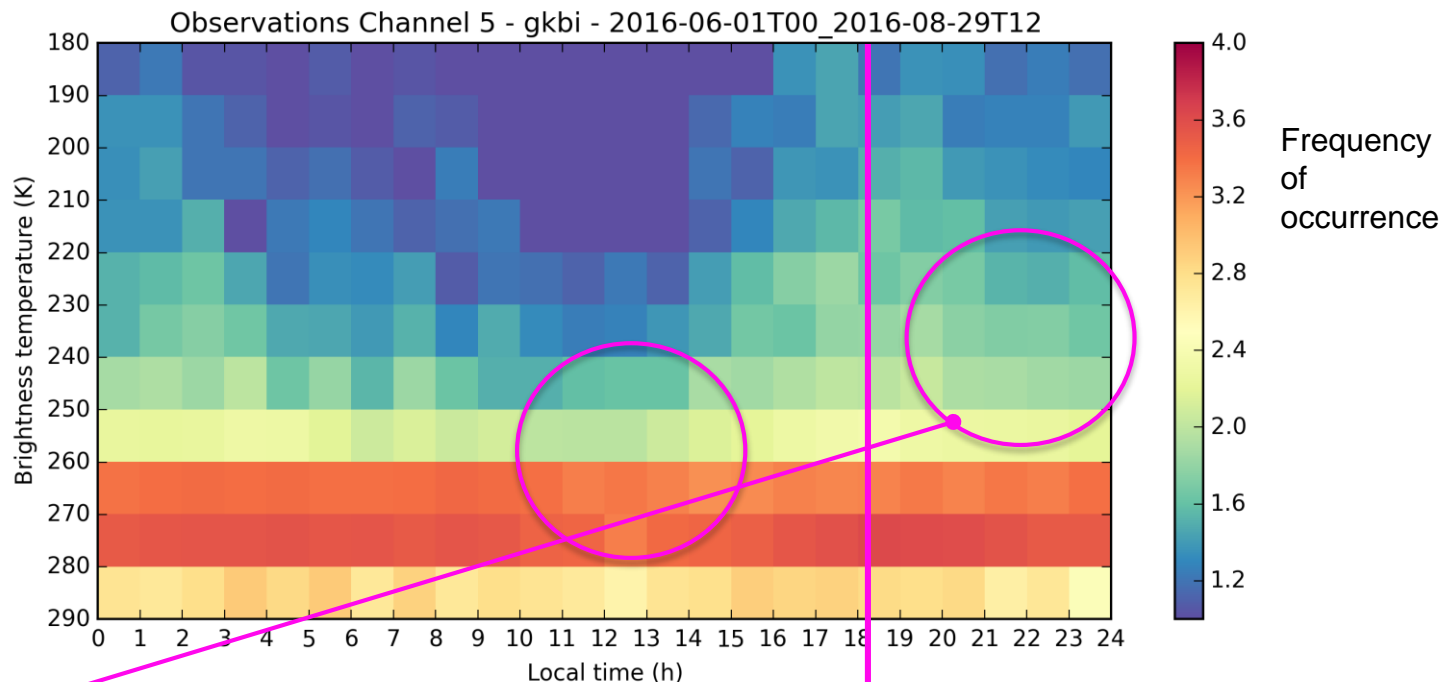
Land surfaces, 1<sup>st</sup> June – 29<sup>th</sup> August 2016  
(Cmax kludge used, artificially boosting effect of model convection on Tb)

Low Tb = deep convection

Clear skies

Overnight convective activity observed but lacking in model

Early convective peak in model, though without intense convection



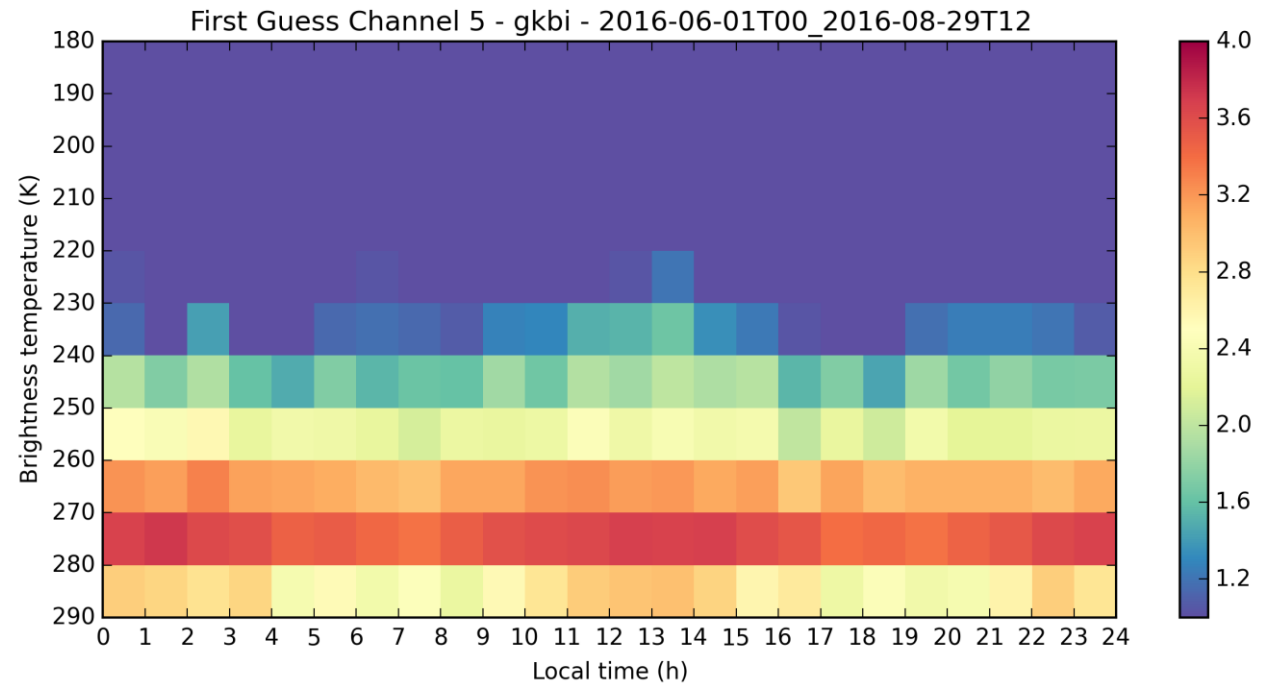
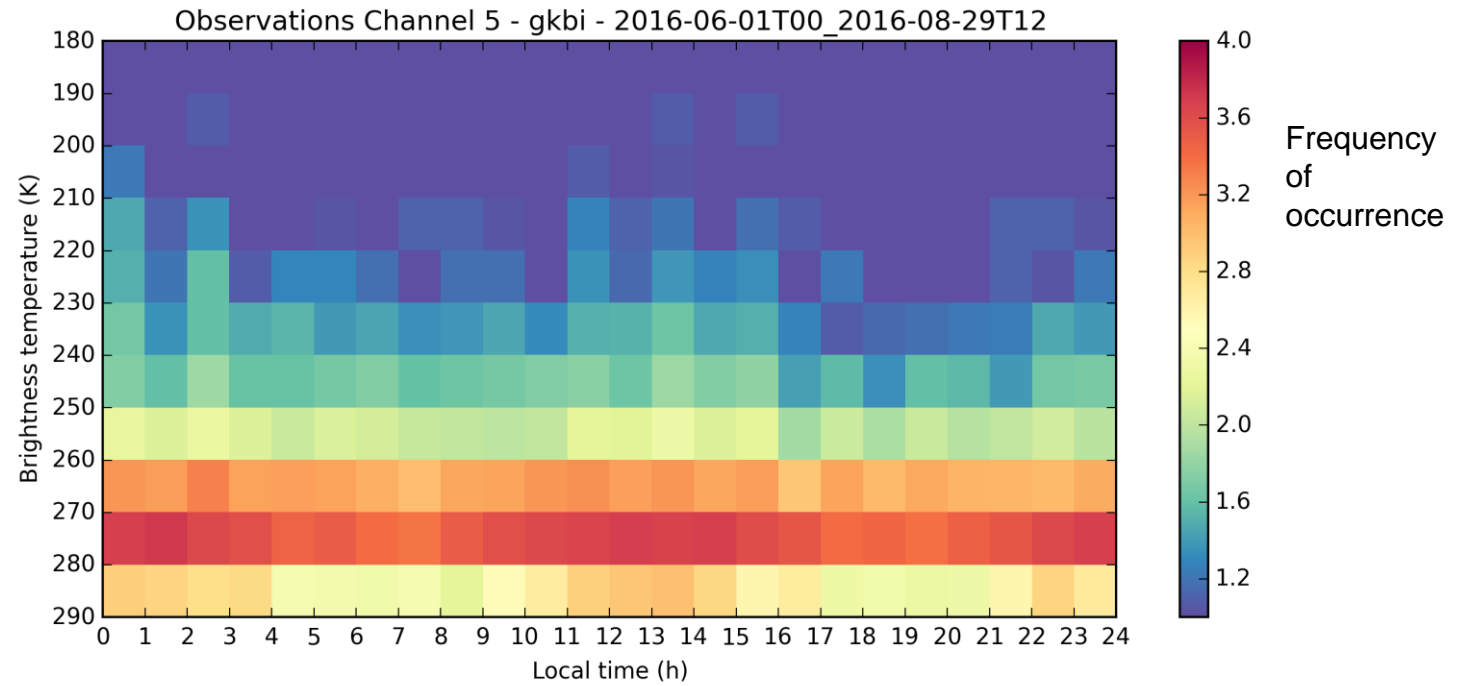
# Diurnal cycle with SAPHIR ch5 (183±7 GHz) Indian ocean, ITCZ

1<sup>st</sup> June – 29<sup>th</sup> August 2016  
Ocean surfaces, no cloud fraction kludge required

Low Tb = deep convection

Clear skies

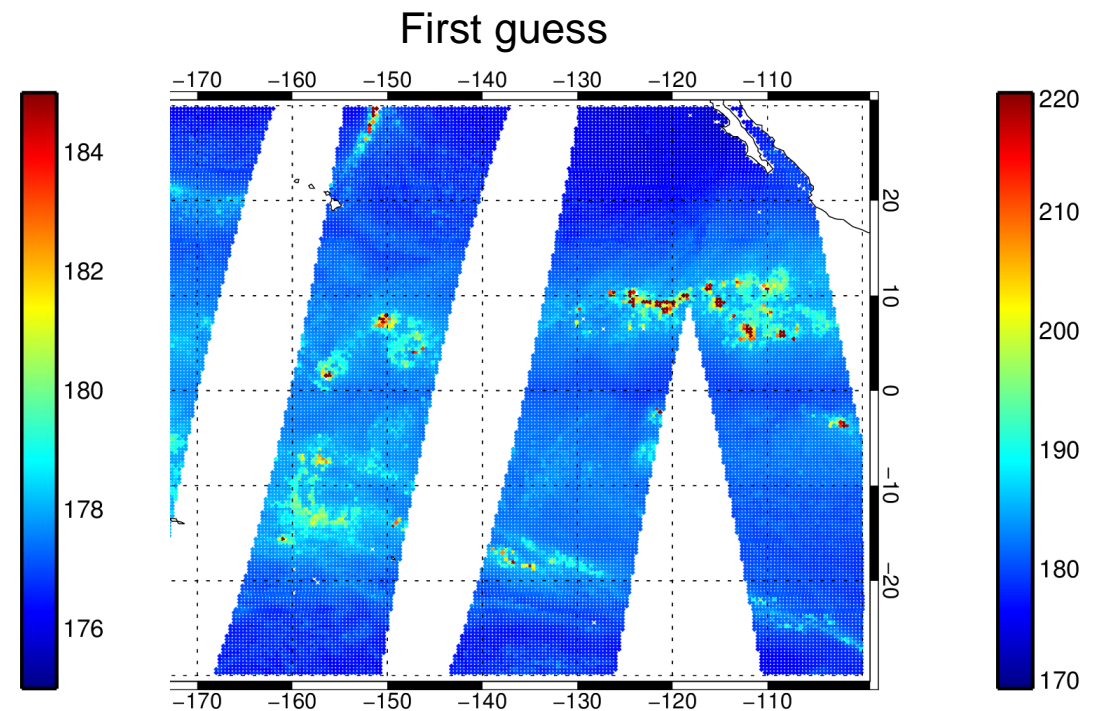
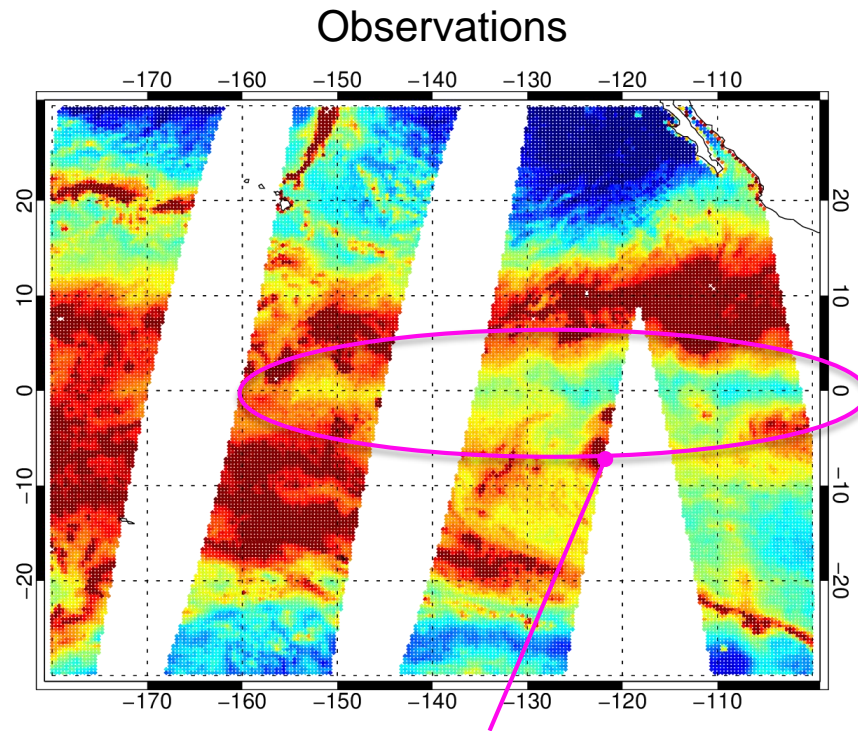
Continuous convective activity through the day, reasonably represented by model, if not to its full intensity.





# Briefly... from 183 GHz (deep convective frozen particles) to 10 GHz over ocean (warm Tb = heavy rain)

AMSR2 10 GHz v-pol, 8<sup>th</sup> May 2016



Cold tongue – low SSTs – tropical instability waves

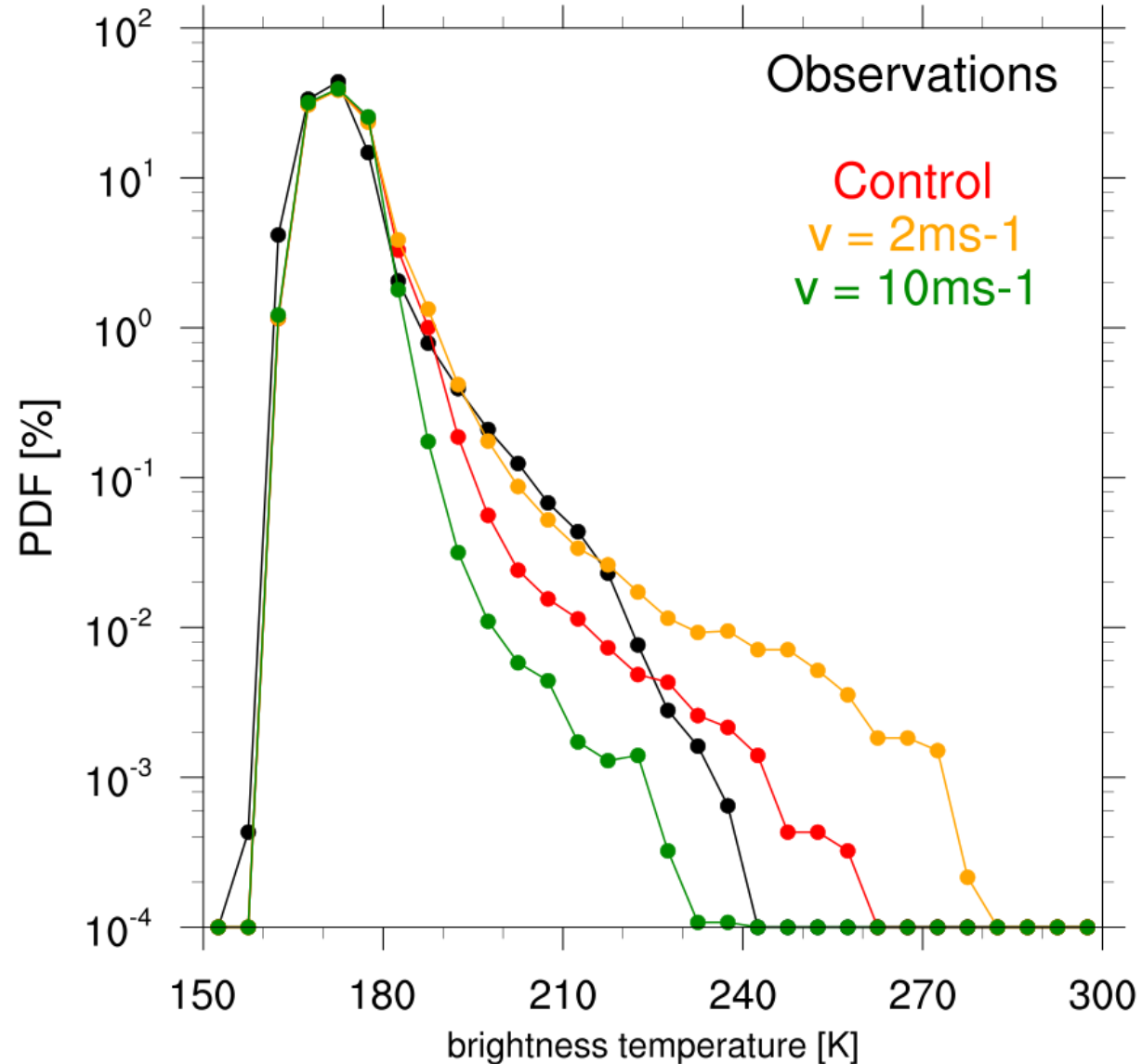
# Sensitivity to radiative transfer assumptions

Scale-matching: important for small-scale intense features

PSD: unimportant?

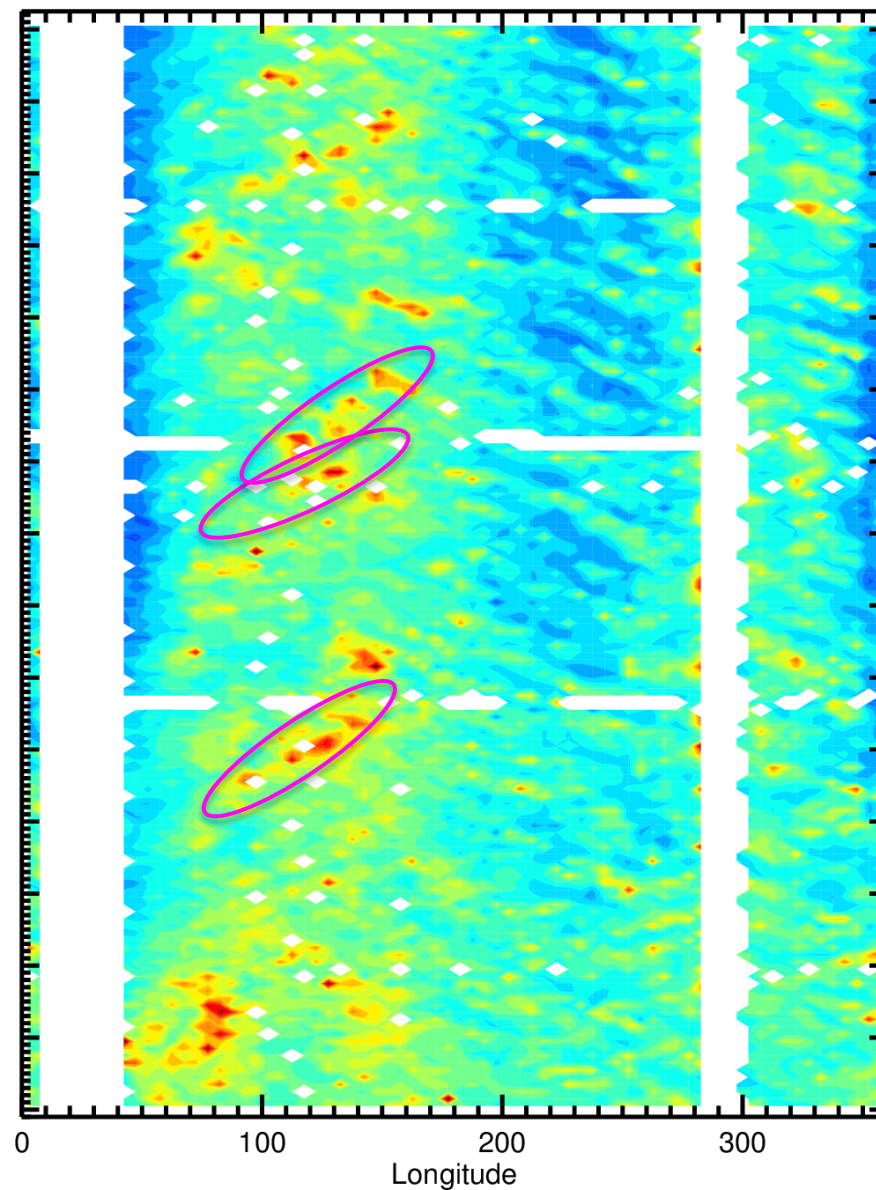
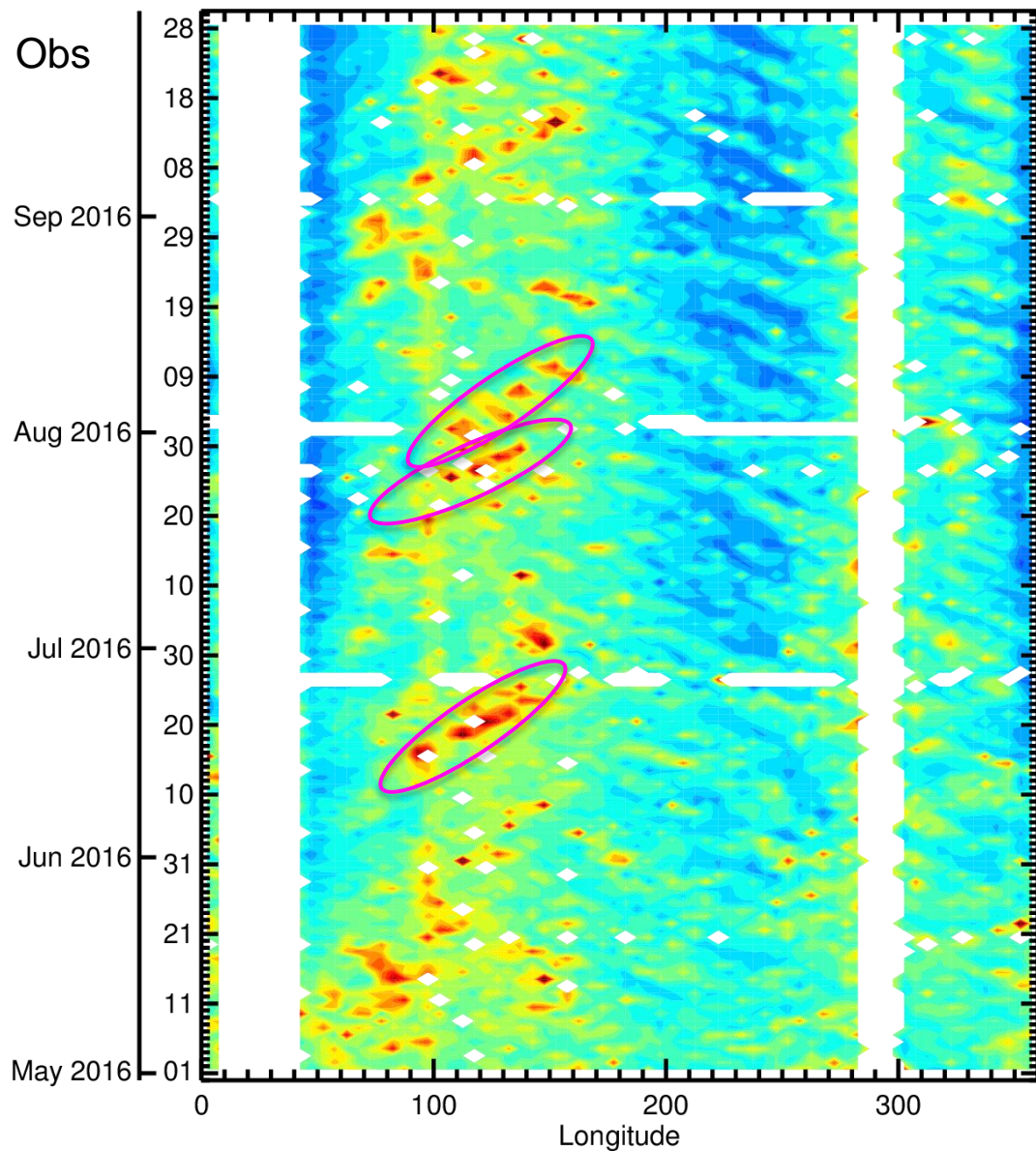
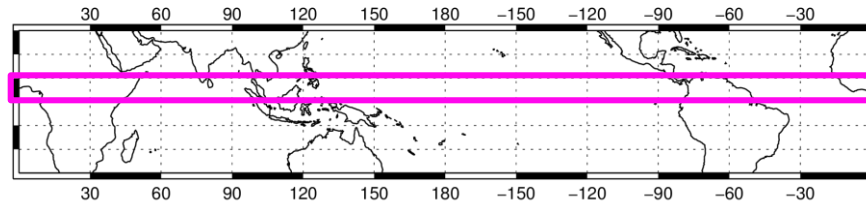
Conversion of convective flux to density (though with unrealistically large uncertainty range)

Most important (not shown): assumed sub-grid precipitation fraction in convection

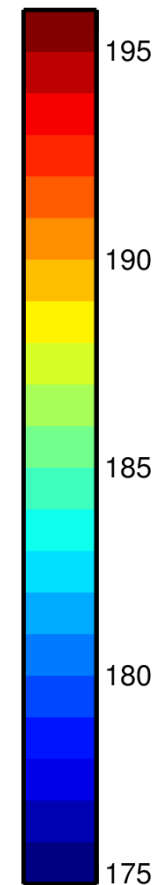


# Kelvin waves? 10 GHz ~ rain

Better than the balloon results...?



FG



# Conclusions

- All-sky assimilation of microwave imagers and humidity sounders benefits moisture and wind analyses in the tropics
  - useful moisture and wind increments are being inferred from observations of convection
  - better methods are required for tropical forecast verification
- Over-ocean convective activity (proxy: 183 GHz scattering from big frozen particles in the convective core)
  - reasonably well modelled (is model over ocean already “mesoscale convection system resolving?”)
- African land convective activity
  - too sparse, too disorganised, too early
- Issues for further study include:
  - understand convection problems over Africa
  - it’s time for better modelling of sub-FOV heterogeneity

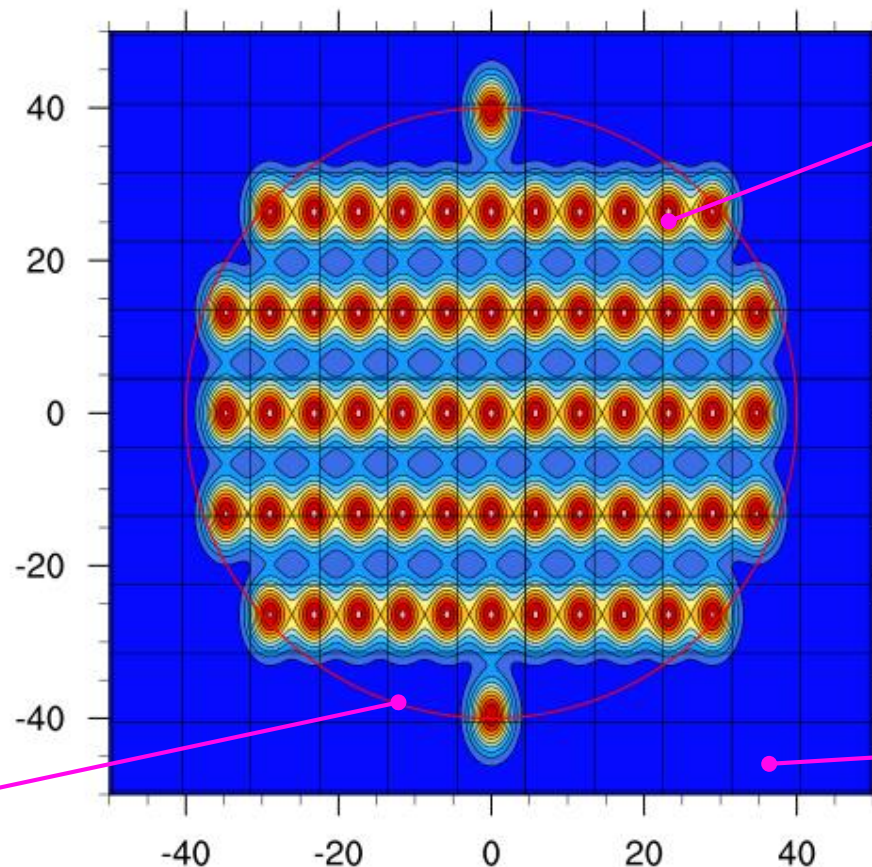
# Preview: advanced superobbing and field of view modelling

**First guess:** simulated from multiple model grid points to provide “independent column approximation” radiative transfer

**Observation:** superobbed onto a standard field of view (e.g. 40km radius)

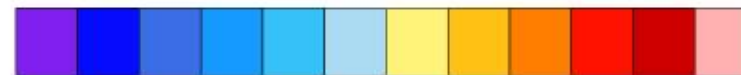
40km superobbing radius

km from superob centre



89 GHz raw fields of view

T1279co model grid box (9km)



0 0.1 0.2 0.3 0.4 0.5 0.6 0.7 0.8 0.9 1

Response function