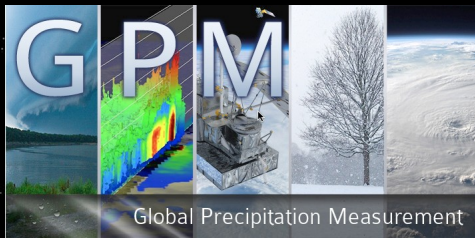


Estimating Non-Raining Surface Parameters to Assist GPM Constellation Radiometer Precipitation Products



≈ a dozen brightness temperatures, not independent



orientation
crystals
cloud
shallow
snow
dry
freezing level
temperature
terrain
deep
shape
size
graupel
precipitation profile
moisture
rain
surface
mixed phase
environment

Joe Turk, Jet Propulsion Laboratory,
California Institute of Technology, Pasadena, CA

4th Workshop on Remote Sensing and Modeling of Surface Properties
14-16 March 2016, Grenoble, France

© 2016 California Institute of Technology
Government sponsorship acknowledged

GPM Land Surface Working Group (LSWG)

- ☐ Meetings/Presentations
- ☐ Data

- ☐ Documents
- ☐ Publications and References

Current event

* Monthly Telecon: Feb. 17, 2016, 10:00 AM

- [Documents folder](#)

About LSWG

LSWG is a community group of scientists working on land surface-related topics to support GPM. Current co-chairs are Joe Turk (JPL) and Christa Peters-Lidard (GSFC).



With contributions from:

*P. Kirstetter, L. Li, Z. Haddad,
J. Munchak, W. Berg, S.
Ringerud, Y. Tian. Y. You*

*and the GPM Land Surface
Working Group*

<http://lswg.umd.edu>

jturk@jpl.nasa.gov

Future CGMS Land Surface Working Group (Steve English's presentation earlier today)

Land surface modeling and observations are a cross-cutting theme extending across current five CGMS WG's, eg

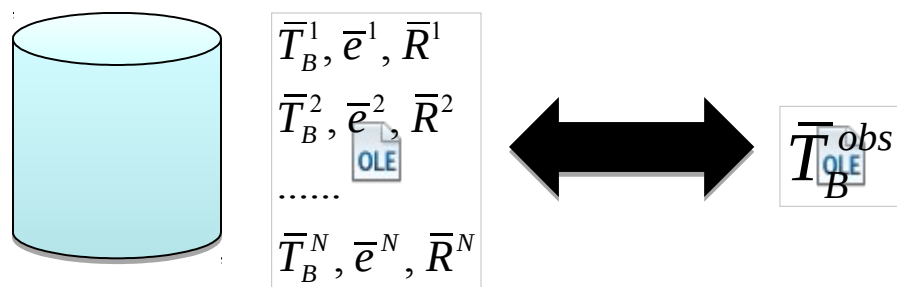
- IPWG: longstanding action items on cold season, complex terrain (esp problematic for snow/drizzle)- Oct 2016 snowfall workshop in Bologna
- IWWG: surface winds closer to coasts, proposed wind+currents missions
- IROWG: increased exploitation of land/ocean surface reflections

Action items from WG's useful for strengthening science objectives for future space missions, e.g NASA's ongoing (2017) Decadal Survey

Topics are often specific, but common themes and challenges ("weather" lies between the surface and each observing platform), WG's use each others data and products

Why is this work needed?

- The information content within space-based precipitation radar/radiometer observations is insufficient to describe the environmental and surface state controlling the precipitation process physics.
- Retrieval process brings in a-priori simulations and ancillary data, in order to apply common physics across all platforms/sensors. Places a heavy burden on the “realism” of the Z and TB simulations.
- For simulations the MW surface emissivity vector needs to be specified for each sensor type, alongside associated thermodynamic state.
- And for retrievals, some way of “connecting” to the properties used for creating each database profile



A-priori

Observations

“connect” surface and environmental conditions to corresponding conditions within the a-priori collection

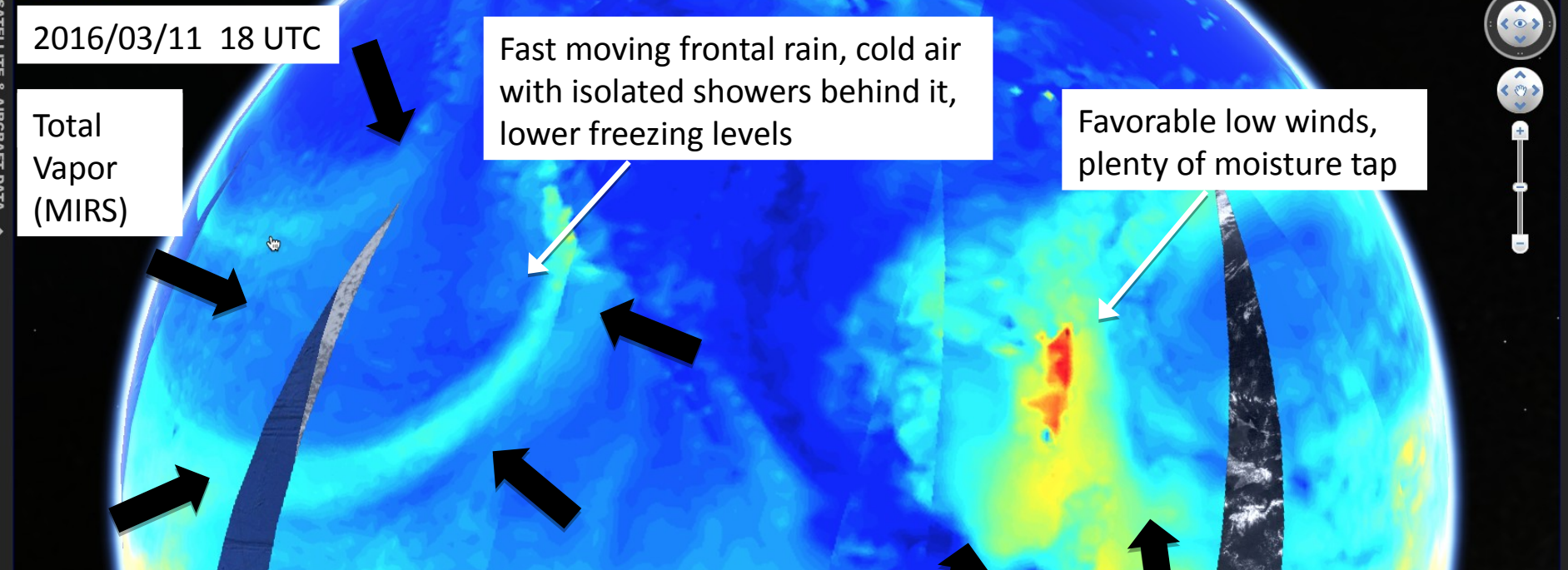
Current GPM-GPROF does this thru a “classification index”

HURRICANE AND SEVERE STORM SENTINEL [HS3]

Tropical Cyclone Information System > HS3 Portal

2016-03-11 18:00:00

The current time: Fri, 11 Mar 2016 22:29:19 GMT



2016/03/11 18 UTC

Total Vapor (MIRS)

Fast moving frontal rain, cold air with isolated showers behind it, lower freezing levels

Favorable low winds, plenty of moisture tap

COLD FRONT WHIPPING THROUGH THE FORECAST AREA TODAY WITH A SHORT 1-2 HOUR BURST OF INTENSE RAIN AND A COUPLE OF HOURS OF LIGHTER RAIN ON EITHER SIDE. **FRONT** WILL CONTINUE INTO LA COUNTY THROUGH THE AFTERNOON AND SHOULD EXIT THE CWA BY SUNSET. SNOW LEVELS AROUND 6000 FT BUT WILL BE LOWERING LATER THIS AFTERNOON AND OVERNIGHT. SHOWERS TONIGHT EXPECTED TO BE CONFINED MAINLY TO THE MOUNTAINS AND CENTRAL COAST AS NORTHWEST FLOW TAKES OVER. COULD BE SOME LIGHT ACCUMULATIONS OVER THE GRAPEVINE LATER TONIGHT AS NORTHERLY FLOW PUSHES MOISTURE UP THE NORTH FACING SLOPES.

DRY CONDITIONS EXPECTED SATURDAY WITH **SUNNY TO PARTLY CLOUDY** SKIES. LOCALLY GUSTY NORTHWEST WINDS IN THE MOUNTAINS AND BELOW PASSES AND CANYONS.

MOISTURE ASSOCIATED WITH A SYSTEM WELL TO THE NORTH WILL SLIDE SOUTH ALONG THE CENTRAL COAST SUNDAY WITH SOME LIGHT SHOWERS POSSIBLE NORTH OF PT CONCEPTION. ADDITIONAL **MOISTURE** WILL ARRIVE MONDAY AND EARLIER **NAM** RUNS HAD INDICATED A LITTLE BETTER CHANCE OF SOME PRECIP IN THE SOUTH, HOWEVER THE 18Z **NAM** HAS DRIED OUT WITH MUCH MORE OF A NORTHERLY COMPONENT, MATCHING WHAT THE **GFS** HAS BEEN SHOWING ALL ALONG. SO MONDAY IS LOOKING DRY NOW BUT WILL LEAVE IN LOW **POPS** AND SEE IF MODELS SETTLE ON THIS DRIER SOLUTION.

424
FXUS64 [unclear] IX 111250
AFDLIX [unclear]

AREA FORECAST DISCUSSION
NATIONAL WEATHER SERVICE NEW ORLEANS LA
650 AM CST FRI MAR 11 2016

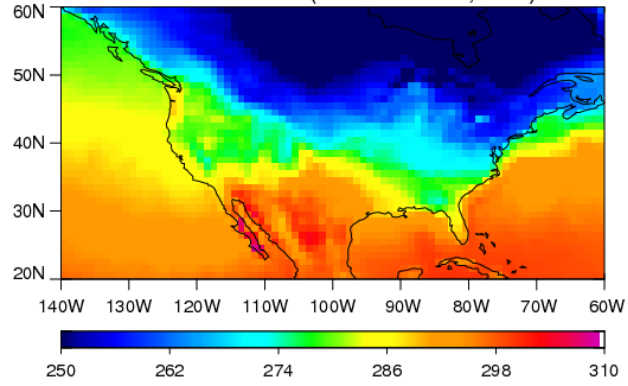
...**SOUNDING** DISCUSSION...

VERY MOIST **ATMOSPHERE** WITH A RECORD **PRECIPITABLE WATER** VALUE OF 2.11 INCHES /OLD RECORD FOR DATE/TIME WAS 1.62 INCHES/. WINDS FROM 1300 TO 3300 FEET ARE AVERAGING BETWEEN 40 AND 50 KNOTS ALLOWING FOR PERSISTENT...EXCELLENT **MOISTURE ADVECTION**. AS A RESULT...RAIN RATES HAVE BEEN VERY EFFICIENT. THERE IS NOT A LOT OF DIRECTIONAL **SHEAR** IN THE LOWER HALF OF THE **ATMOSPHERE** WITH THE WINDS PRIMARILY FROM THE SOUTH-SOUTHEAST OR SOUTH SO THE VERY MOIST AIR WILL REMAIN OVER THE AREA.

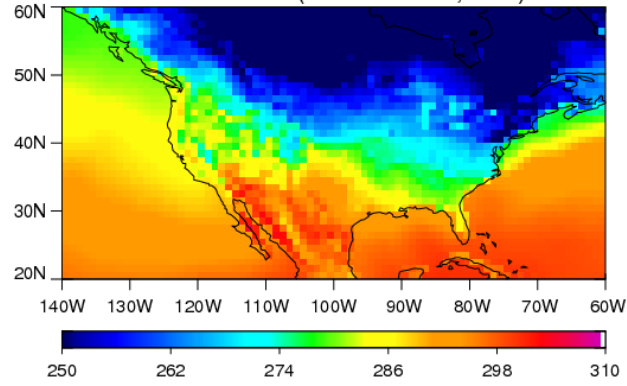
12Z BALLOON INFO: A SUCCESSFUL FLIGHT LASTING 67 MINUTES AND TRAVELING 43 MILES DOWNRANGE BURSTING NEAR POPLARVILLE.

(Figure courtesy of Dr. Wes Berg, Colorado State Univ.)

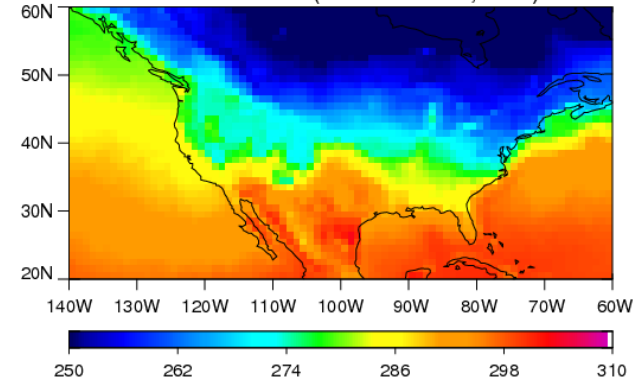
ECMWF Tskin (01 Mar 2014, 00Z)



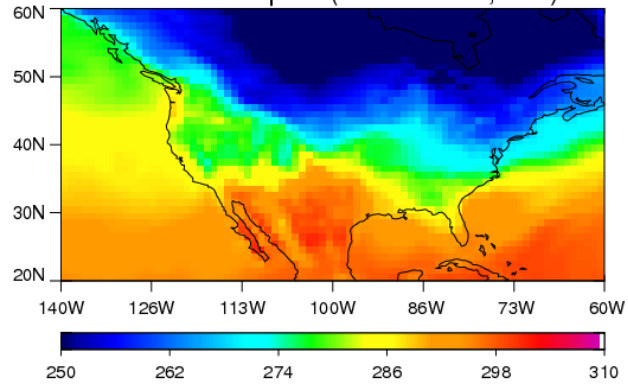
GDAS Tskin (01 Mar 2014, 00Z)



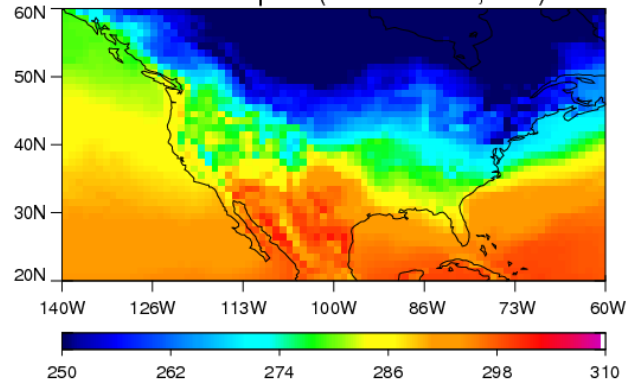
GANAL Tskin (01 Mar 2014, 00Z)



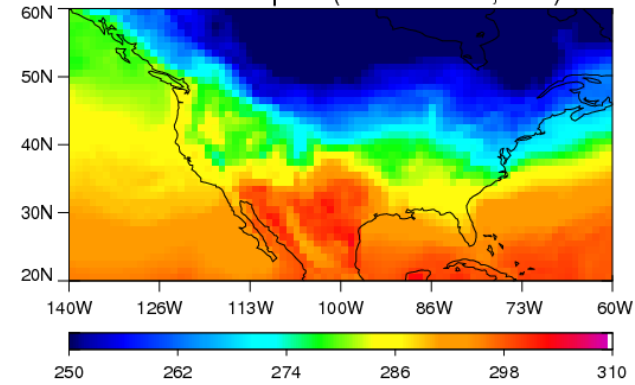
ECMWF Temp2m (01 Mar 2014, 00Z)



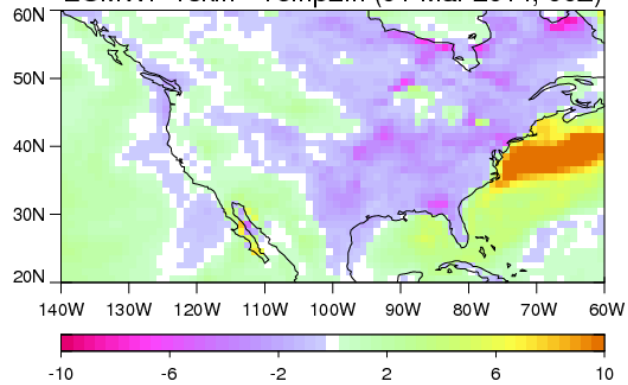
GDAS Temp2m (01 Mar 2014, 00Z)



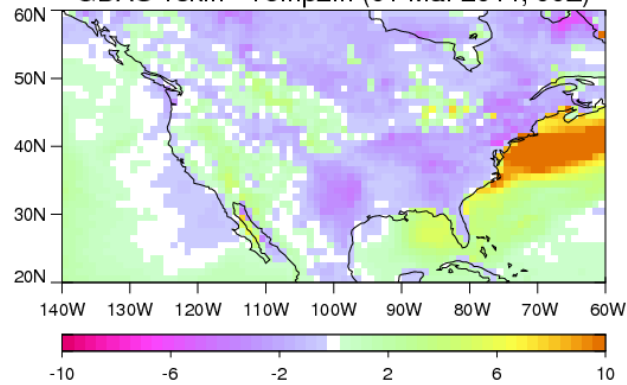
GANAL Temp2m (01 Mar 2014, 00Z)



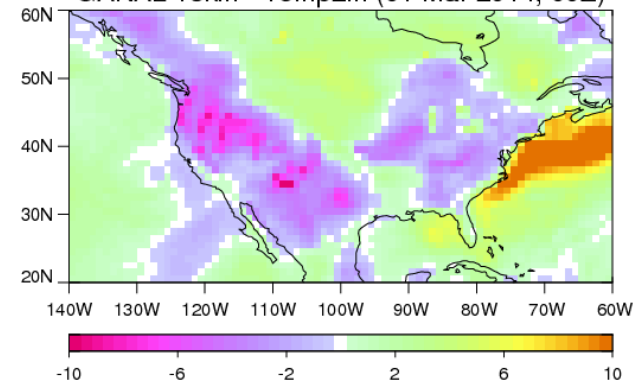
ECMWF Tskin - Temp2m (01 Mar 2014, 00Z)



GDAS Tskin - Temp2m (01 Mar 2014, 00Z)

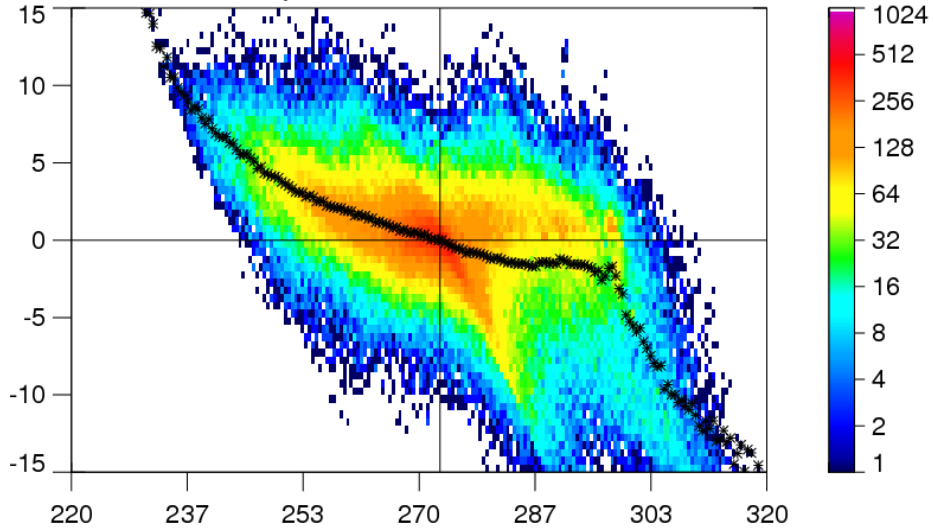


GANAL Tskin - Temp2m (01 Mar 2014, 00Z)

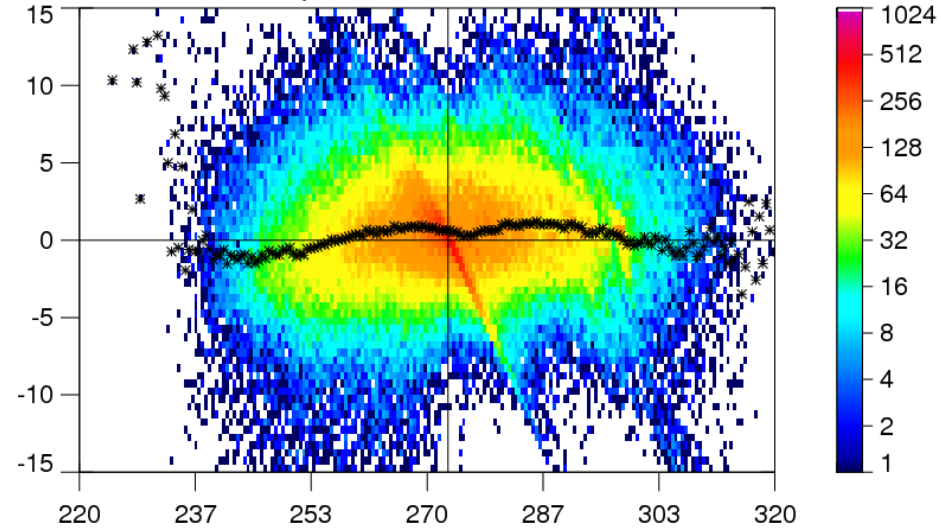


(Figure courtesy of Dr. Wes Berg, Colorado State Univ.)

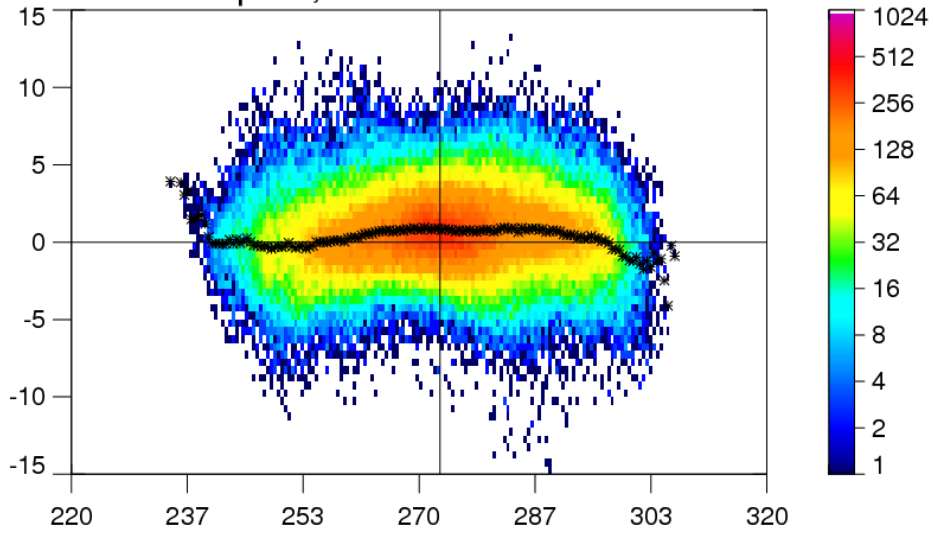
Tskin, ECMWF vs. GANAL



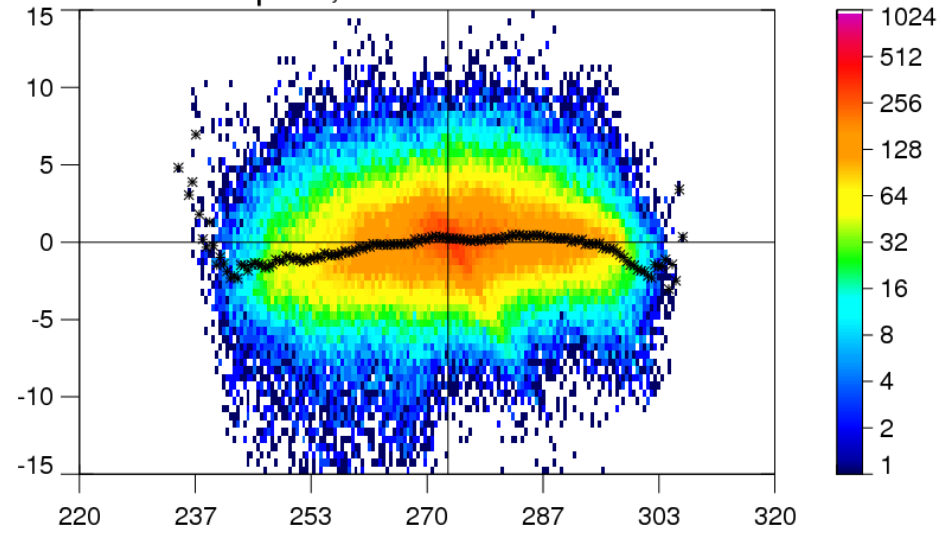
Tskin, ECMWF vs. GDAS



Temp2m, ECMWF vs. GANAL

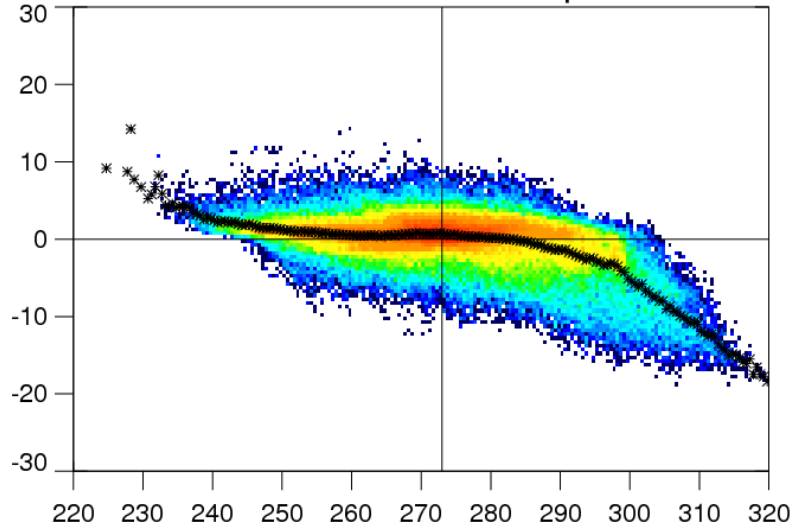


Temp2m, ECMWF vs. GDAS

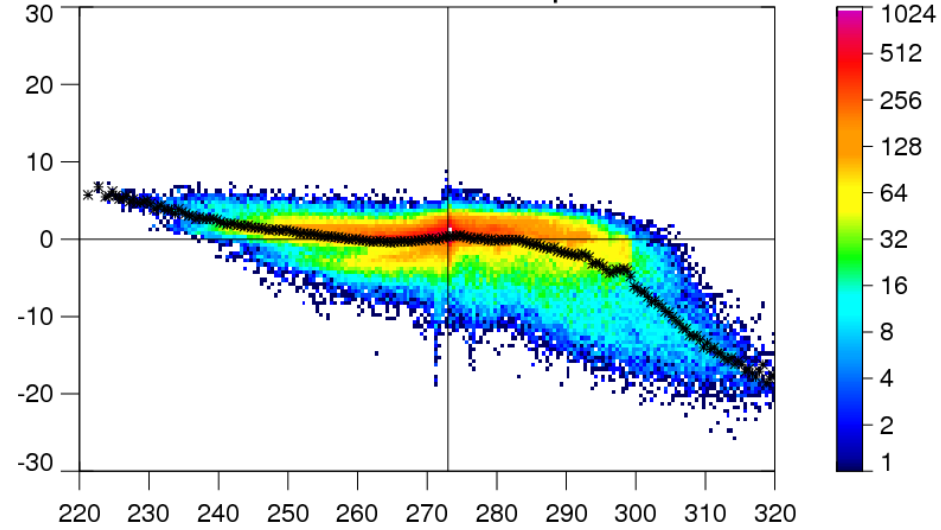


(Figure courtesy of Dr. Wes Berg, Colorado State Univ.)

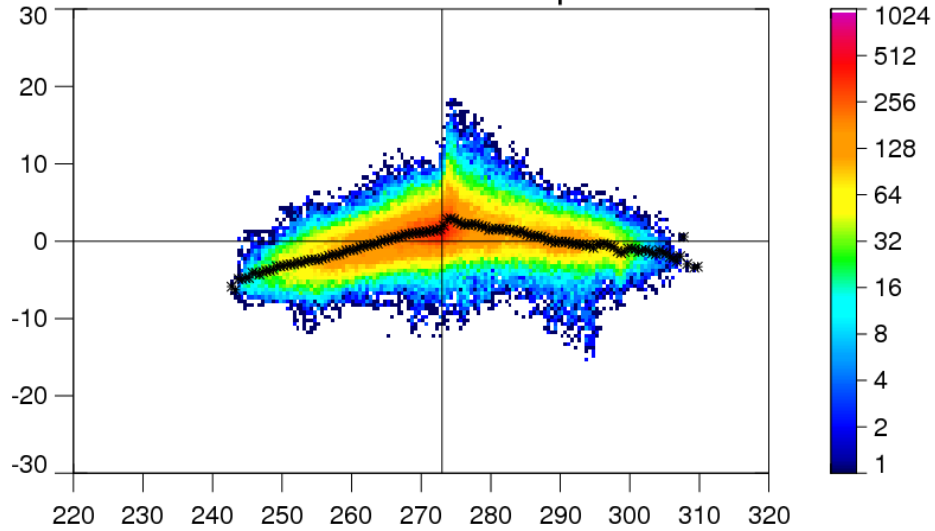
ECMWF Tskin - Temp2m



GDAS Tskin - Temp2m



GANAL Tskin - Temp2m



Using GMI/DPR Observations for Constraining Constellation Precipitation Estimates

Most of the time it is not raining, and the surface can be studied from these observations, in light of previous conditions

Can we extract some “range” of surface and environmental conditions directly from the observations, to *lessen* dependencies upon model sources?

Use DPR Ku/Ka-band capability to discriminate “no-cloud” GMI scenes, relative to the sensitivity at Ka-band (fully accepting that DPR is *not* a cloud radar)

Historical Context: Grody's 1991 Scattering Index (SI)

Uses the 22V SSMI observations to estimate the non-scattering contribution to the 85V observations

$$SI = F - TB_{85V}$$

$$F = a_0 + a_1 TB_{19V} + a_2 TB_{22V} + a_3 TB_{22V}^2$$

$SI > 10 \rightarrow$ scattering materials



Various multispectral tests for discriminating snow, ice, desert, precipitation

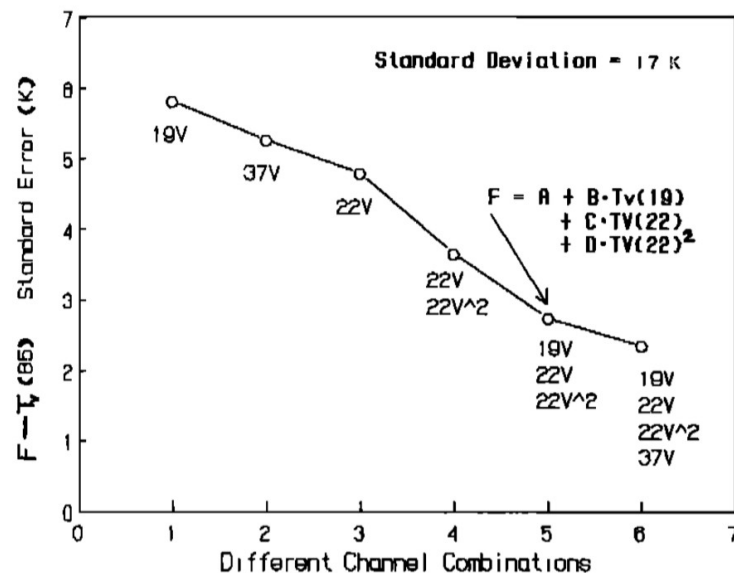
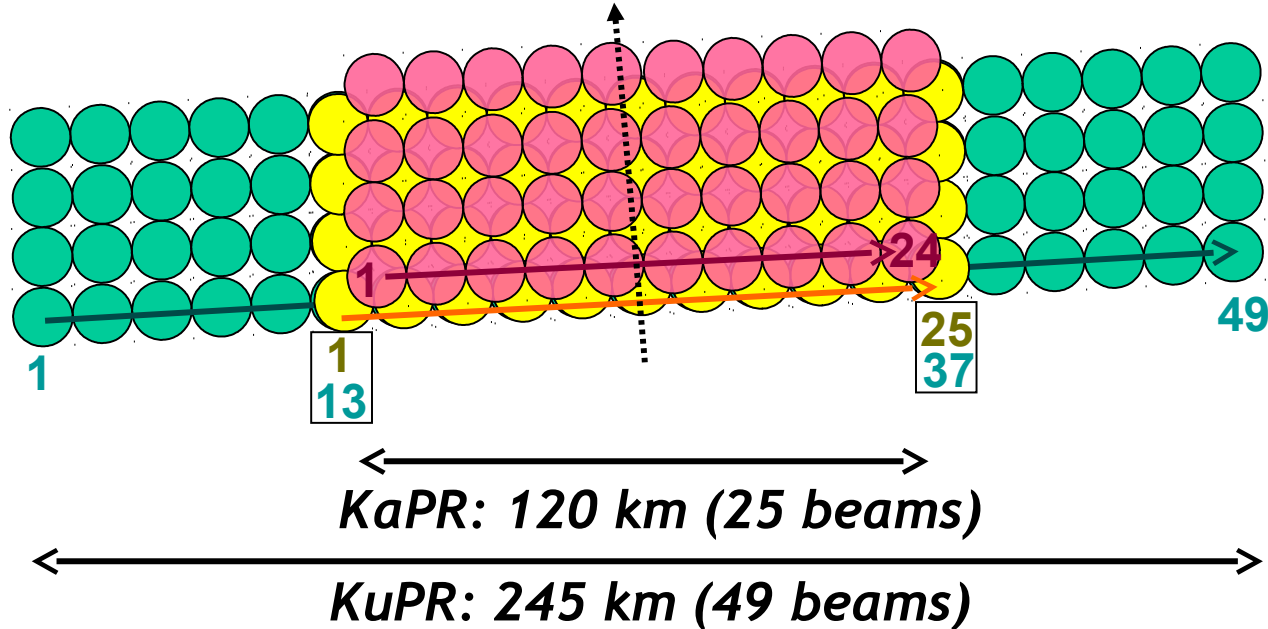


Fig. 3. Standard error of the estimated 85-GHz vertically polarized measurement, F , as derived using different combinations of the lower-frequency SSMI channels. The plot shows the errors relative to the actual measurements, $F - T_v(85)$, for different channel combinations. Results are based on a global data set of nonscattering materials over land and ocean.

Concept of the DPR antenna scan

- *Ku-PR footprint (Normal scan, NS)* : $\Delta z = 250 \text{ m}$
- *Ka-PR footprint (Matched-scan with Ku, MS)* : $\Delta z = 250 \text{ m}$
- *Ka-PR footprint (High-sensitivity beam, HS)* : $\Delta z = 500 \text{ m}$



In the interlacing scan area (●), the KaPR can measure snow and light rain in a high-sensitivity mode with a double pulse width.

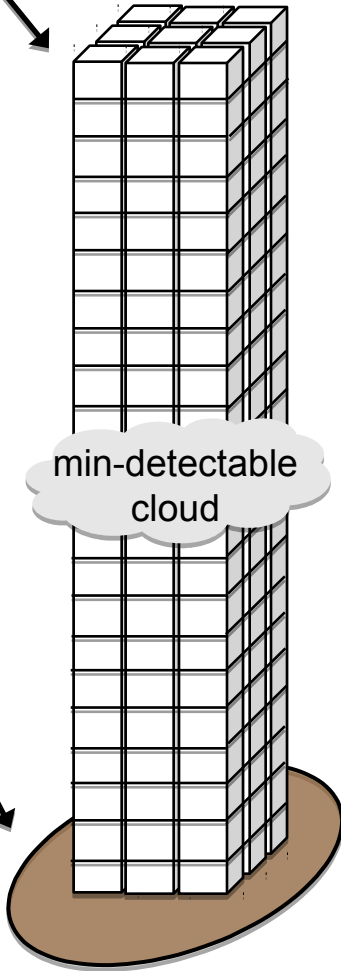
The synchronized matched beam (●) is necessary for the dual-frequency algorithm.

Using DPR for Radiometer Scene Discrimination

3x3 DPR profiles
surrounding each
GMI

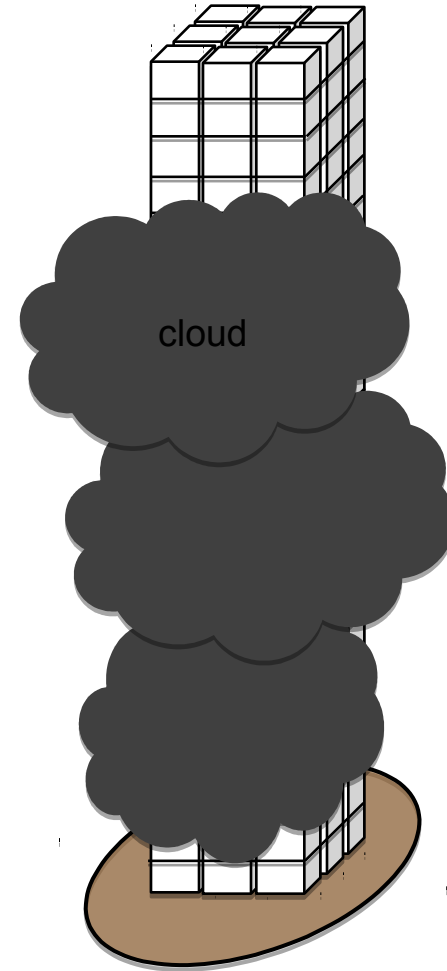
4x4-km,
250-m
vertical

37-GHz
resolution



$Z(Ku) < 15$ dB and
 $Z(Ka) < 15$ dB and
 $Z(Ka-HS) < 15$ dB
(all bins) → "no cloud"

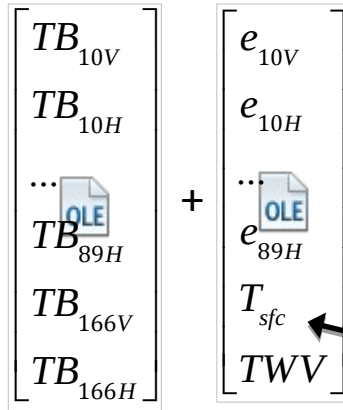
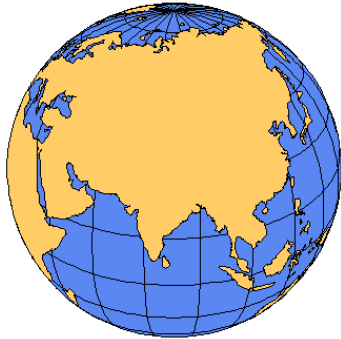
-----→
*increased likelihood
cloudiness*



N bins where $Z(Ku) > 20$ dB as a proxy for
increased level of cloudiness and
precipitation
 $N > 20$ → "low probability"
 $N > 50$ → "medium probability"
 $N > 100$ → "high probability"

Analysis Matched GMI/DPR Data

Extensive, diverse collection from 1+ year of GMI “no-cloud” emissivity vectors everywhere within ± 65 degree latitude, without regard to the surface type



Principal component analysis :

$$\vec{u} = [E]^T \vec{e}$$

$$[\Lambda] = [E]^{-1} [S_x] [E]$$

$$\vec{e} \equiv [E] \vec{u}$$

$$\vec{e} \cong [E] \hat{u}$$

If there was some way to estimate each principal component from the observations, then the emissivity vector \vec{e} could be *approximately* reconstructed from the TB observations

Tsfc and total vapor added

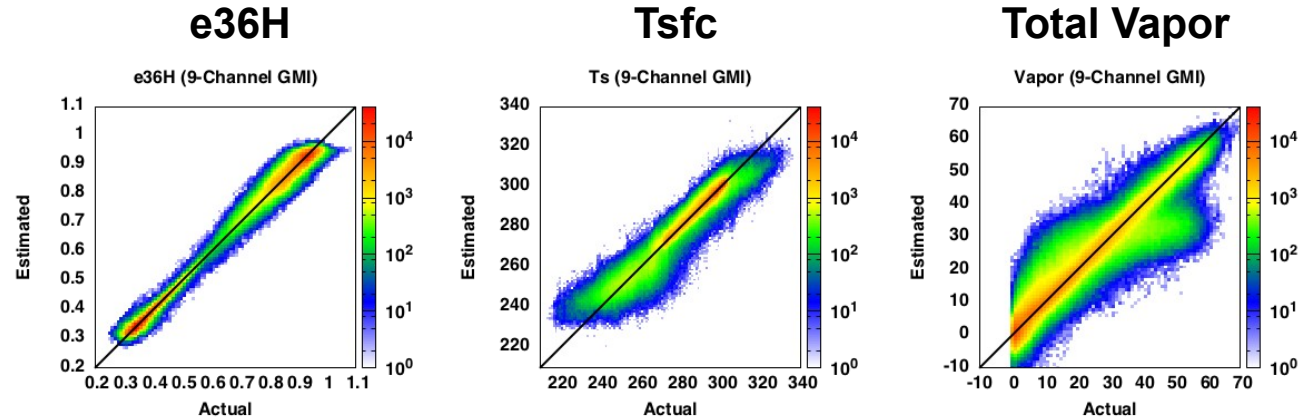
Assume nonlinear TB combinations and polarization ratios “carry” the information on the surface properties

$$u_i = a_0 + \sum_{j=1}^N a_j TB_j + \sum_{j=1}^N \sum_{k=j}^N b_{jk} TB_j TB_k + \sum_{j=1}^3 c_j PR_j \quad i = 1, 9$$

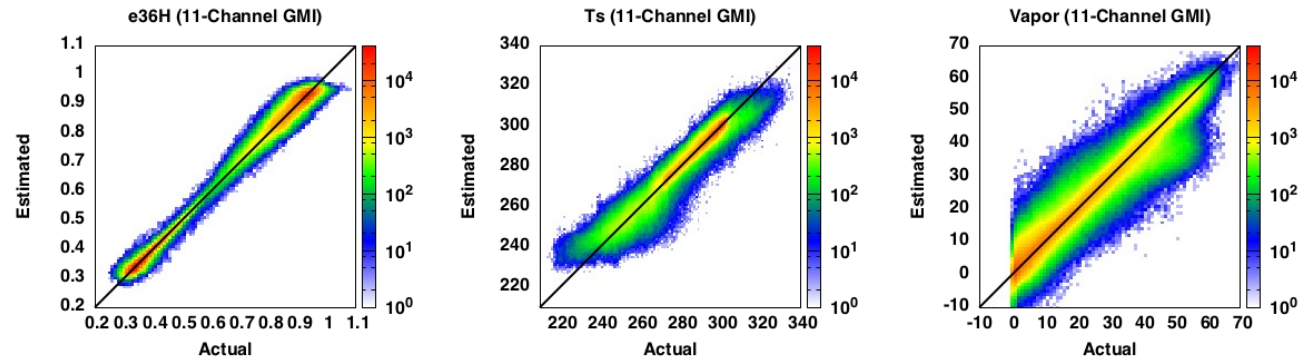
$$PR_j = (TB_j^V - TB_j^H) / (TB_j^V + TB_j^H) \quad j = 1, 3$$

TB-Reconstructed Emissivity State Vector

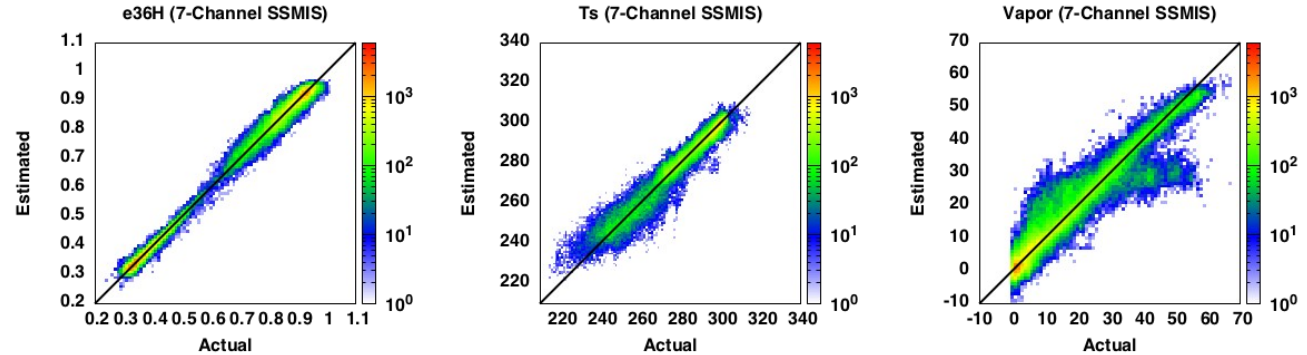
N=9 (10-89 GHz)
High water vapor over
land underestimated



N=11 (10-166 GHz)
Improvement in over-
land total vapor with
inclusion of 166 GHz
channels



**N=7 (19-85 GHz
SSMIS)**
SSMIS (no 10 GHz)
dataset from 1-year of
F17-GPM 15-min
coincidences



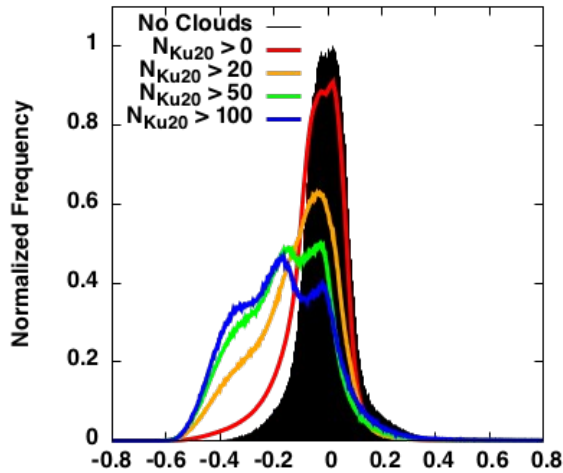
Discrimination Performance

$N_{Ku} > 20$ dB in column

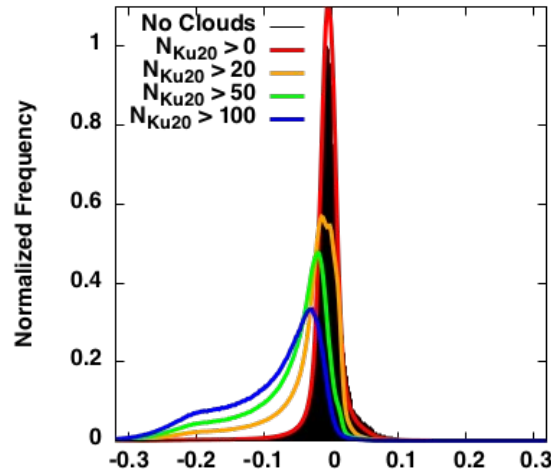
$N_{Ku} > 0$ $N_{Ku} > 20$ $N_{Ku} > 50$ $N_{Ku} > 100$

3 PC-based discriminant, using 9-channels in the regression, is a good compromise, also since S2 (166, 183 GHz) channels not always available

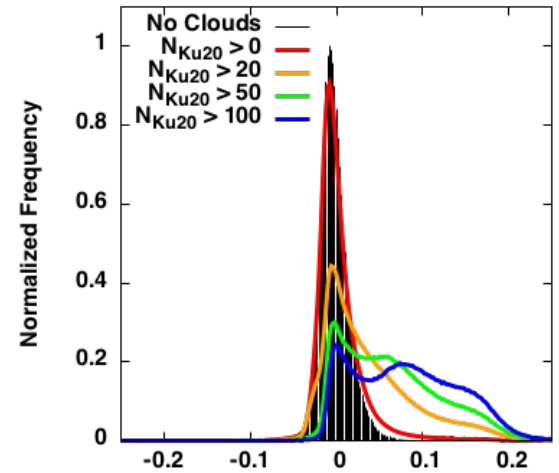
Histogram of Mean-Subtracted PC 4



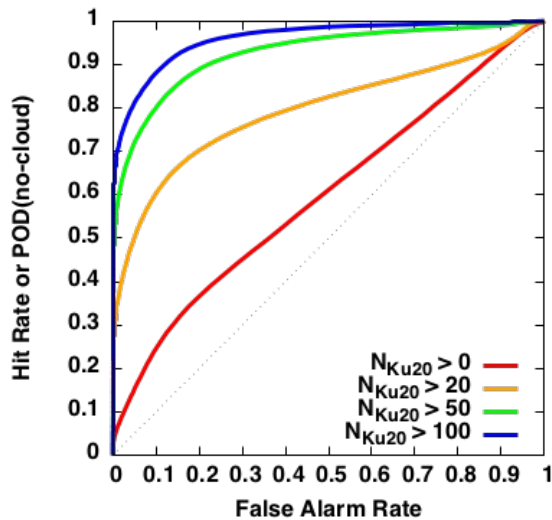
Histogram of Mean-Subtracted PC 6



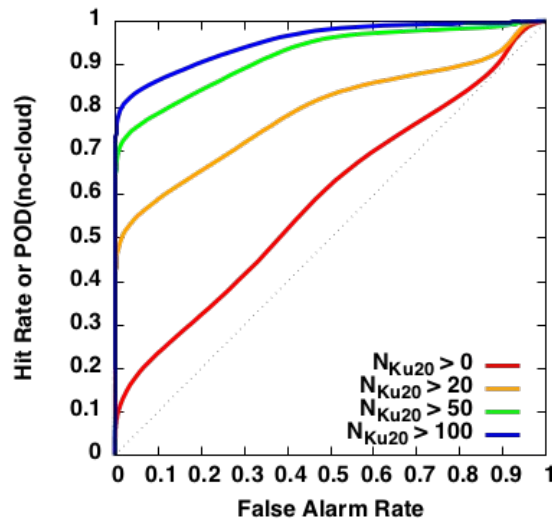
Histogram of Mean-Subtracted PC 7



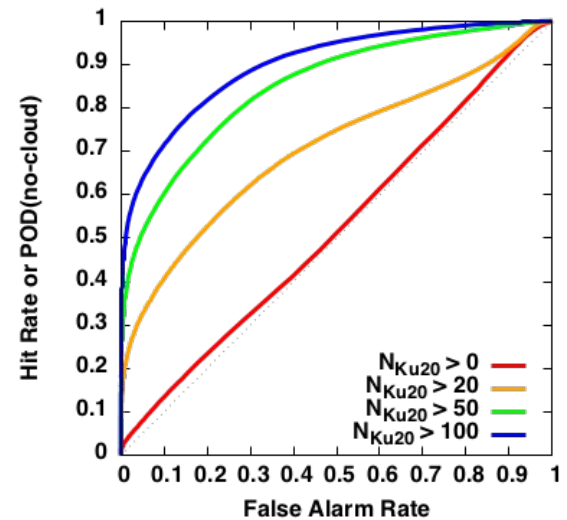
No-Cloud Discrimination (9-Channel GMI)



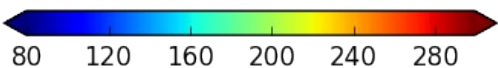
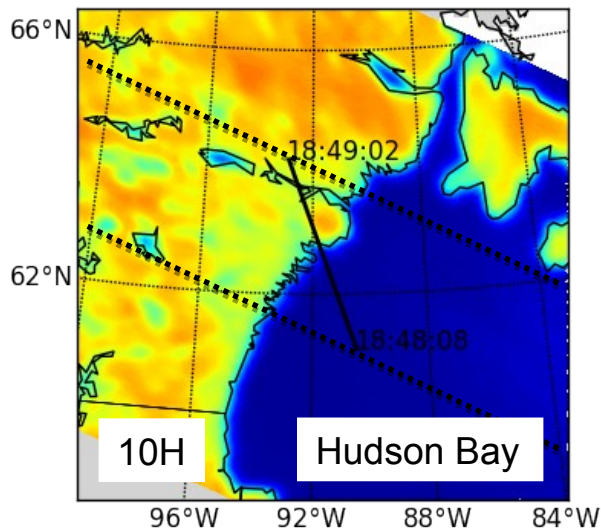
No-Cloud Discrimination (11-Channel GMI)



No-Cloud Discrimination (7-Channel SSMIS)

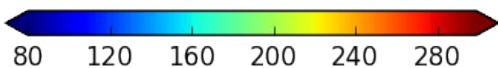
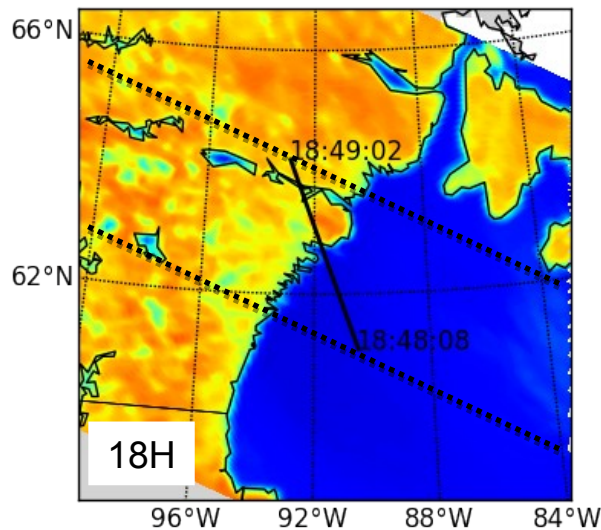


2014/09/22 18:48:08 - 18:49:02



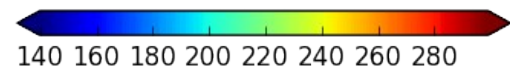
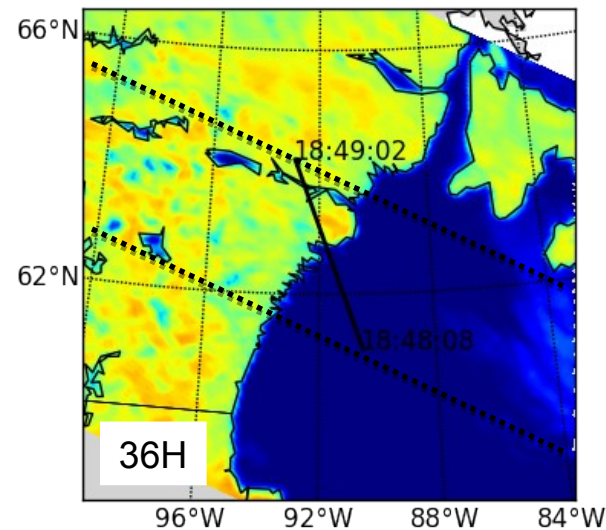
GMI 10H GHz (K)

2014/09/22 18:48:08 - 18:49:02



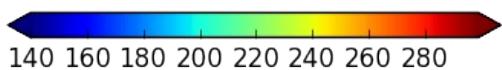
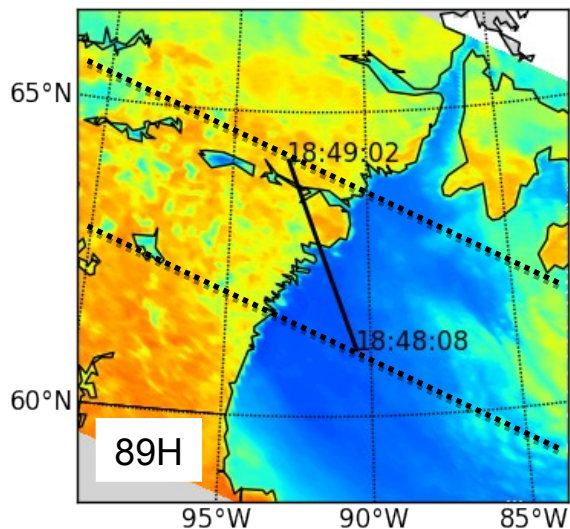
GMI 18H GHz (K)

2014/09/22 18:48:08 - 18:49:02



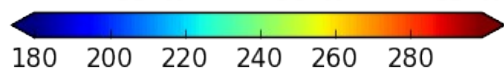
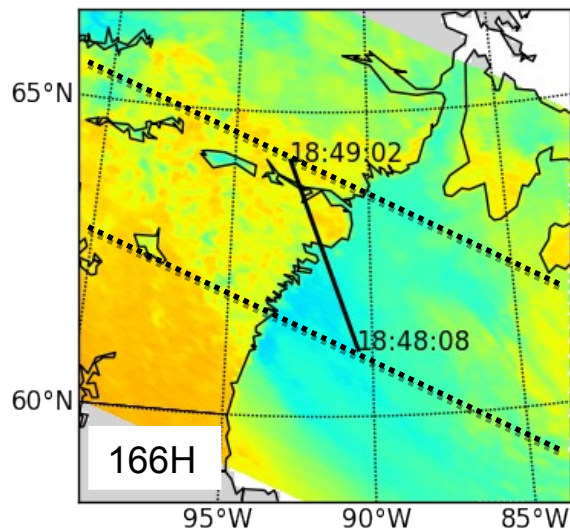
GMI 36H GHz (K)

2014/09/22 18:48:08 - 18:49:02



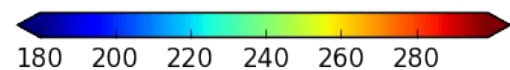
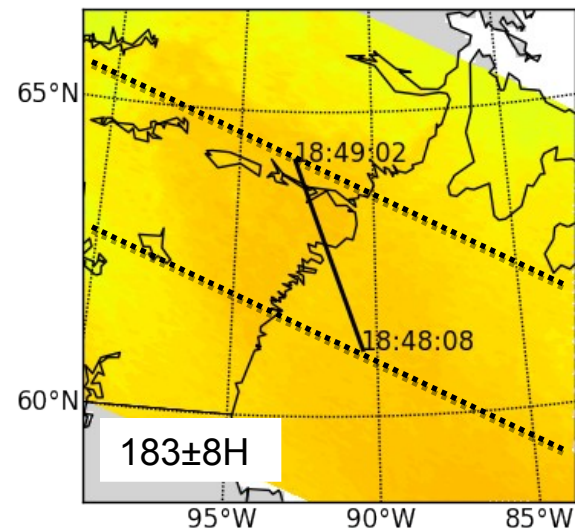
GMI 89H GHz (K)

2014/09/22 18:48:08 - 18:49:02



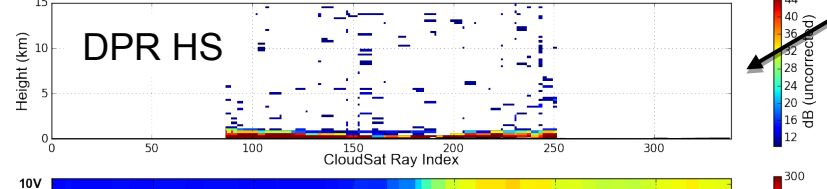
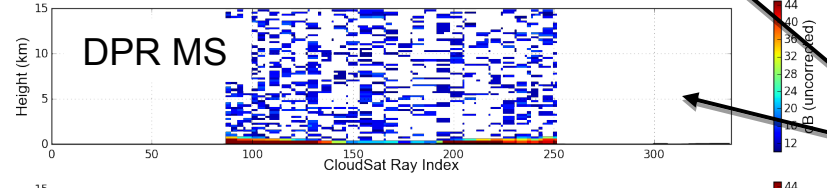
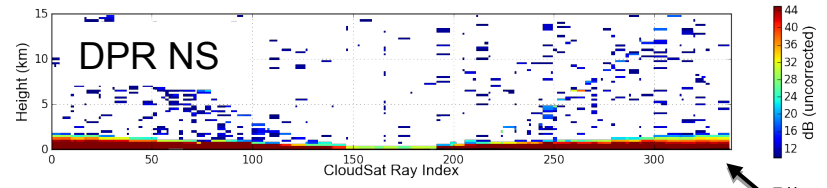
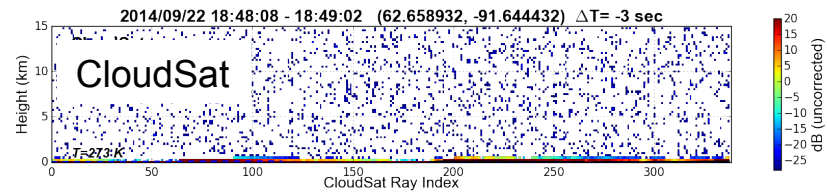
GMI 166H GHz (K)

2014/09/22 18:48:08 - 18:49:02

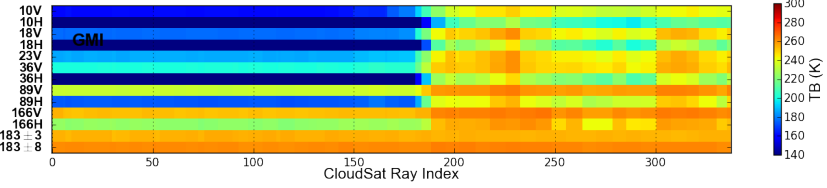


GMI 183 ± 8 GHz (K)

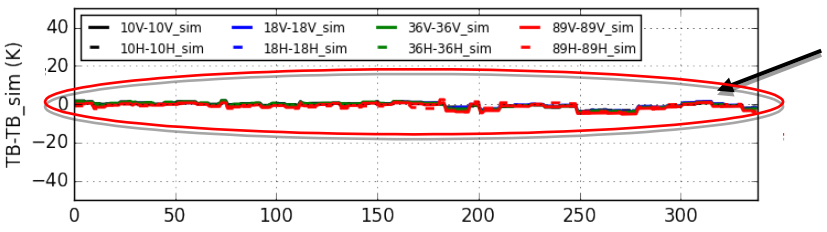
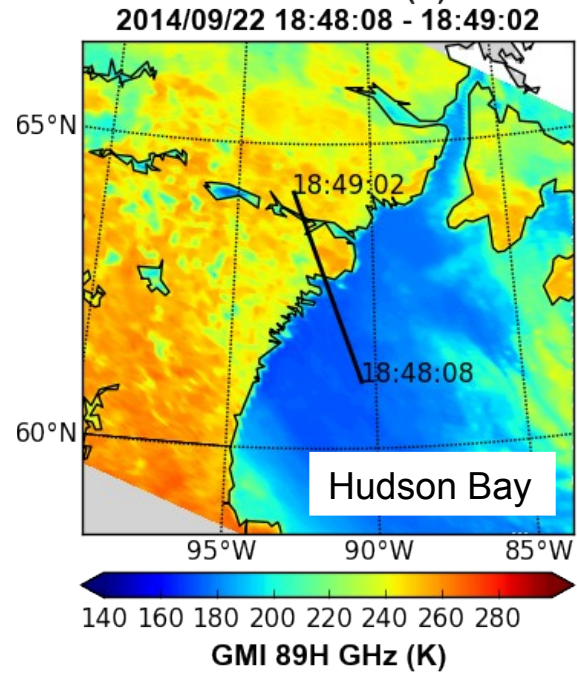
GPM+CloudSat Coincidence 22 September 2014 Hudson Bay Land-Water



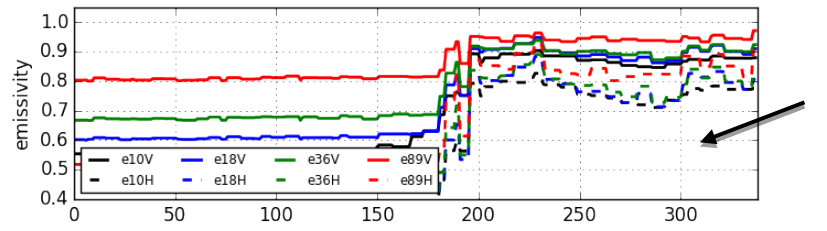
No clouds evident in all three DPR scans



Trace of all 13 GMI channels

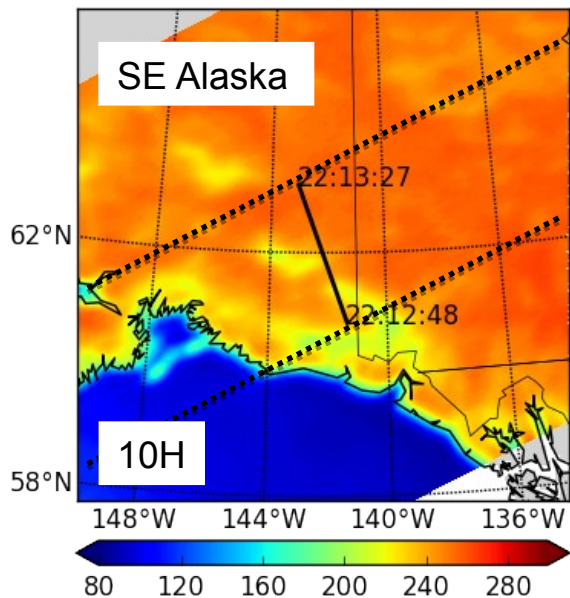


Simulated TB difference (using ECMWF) Near seamless land-coast-water transition across all 9 GMI (S1) channels



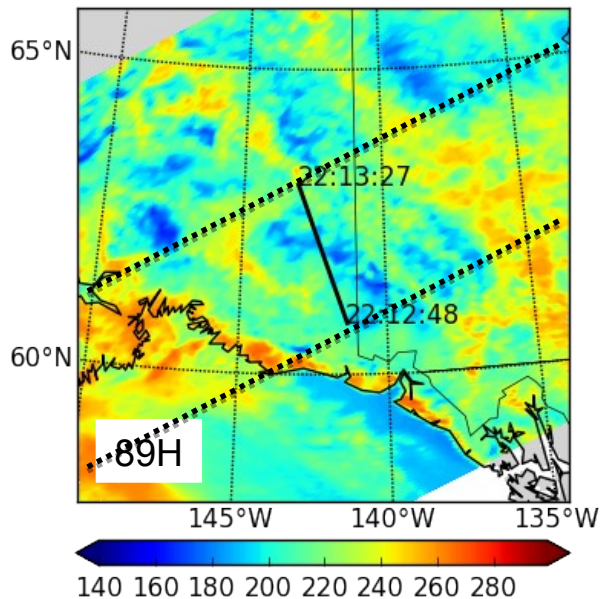
Resultant emissivity at first 9 GMI (S1) channels

2015/02/20 22:12:48 - 22:13:27



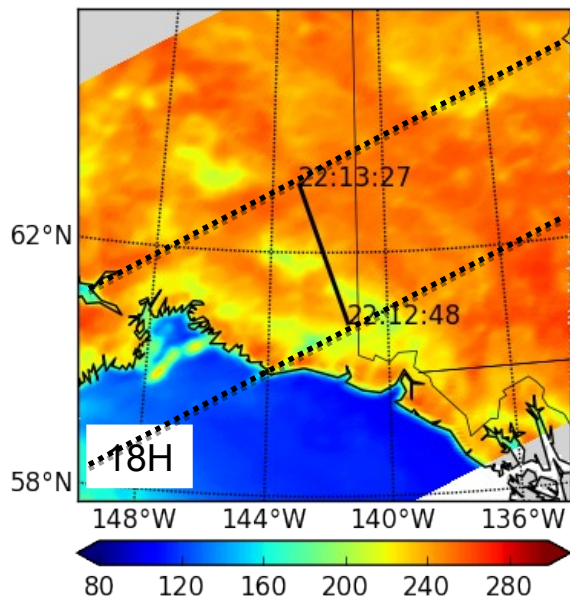
GMI 10H GHz (K)

2015/02/20 22:12:48 - 22:13:27



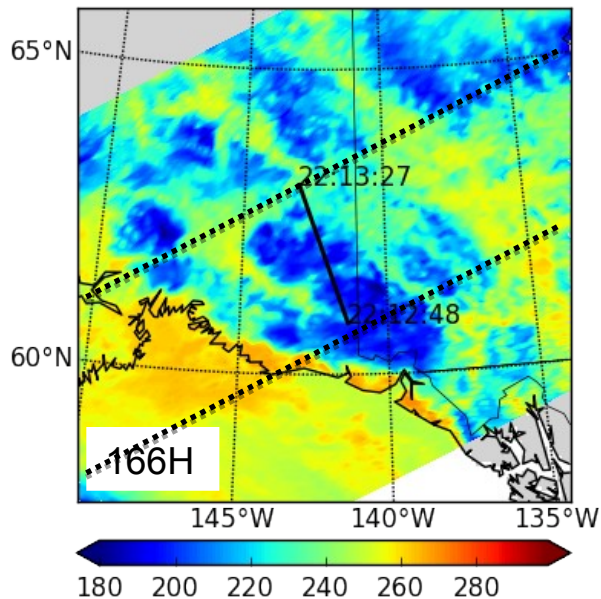
GMI 89H GHz (K)

2015/02/20 22:12:48 - 22:13:27



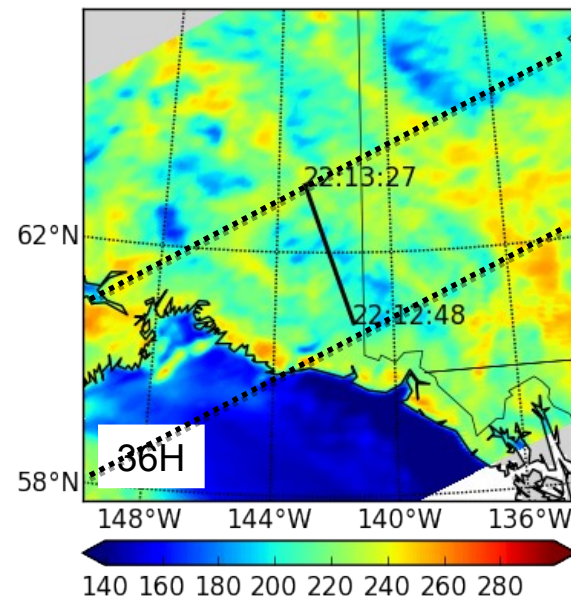
GMI 18H GHz (K)

2015/02/20 22:12:48 - 22:13:27



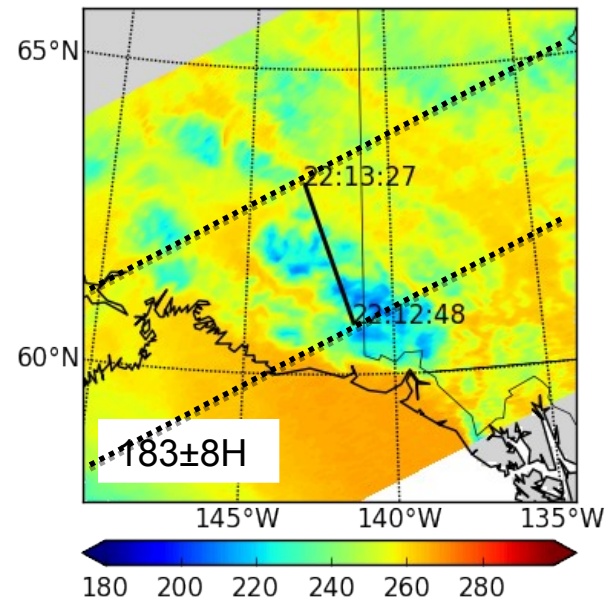
GMI 166H GHz (K)

2015/02/20 22:12:48 - 22:13:27



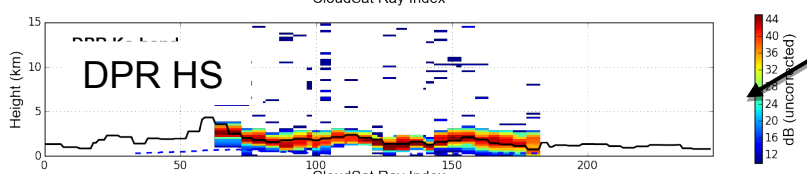
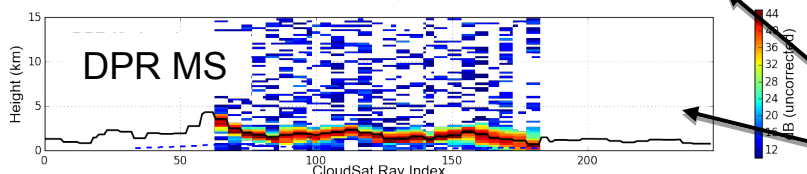
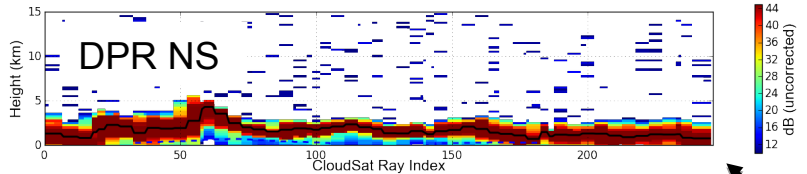
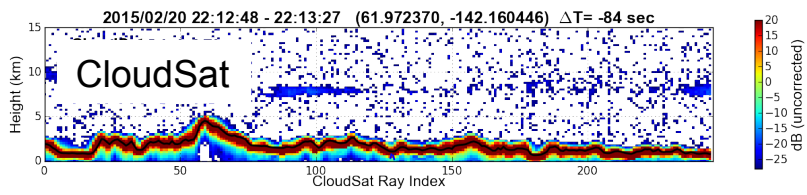
GMI 36H GHz (K)

2015/02/20 22:12:48 - 22:13:27

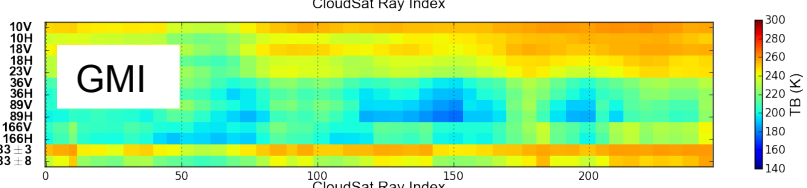


GMI 183 ± 8 GHz (K)

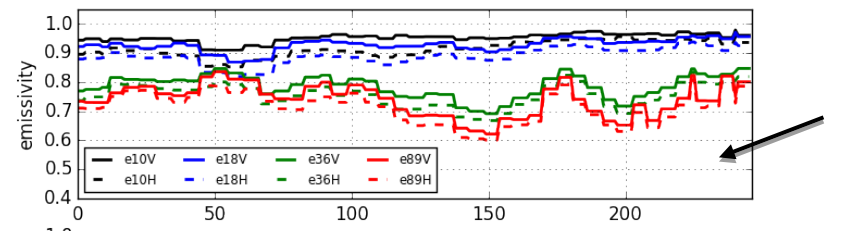
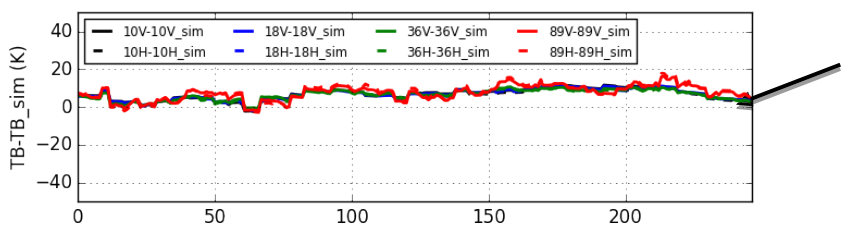
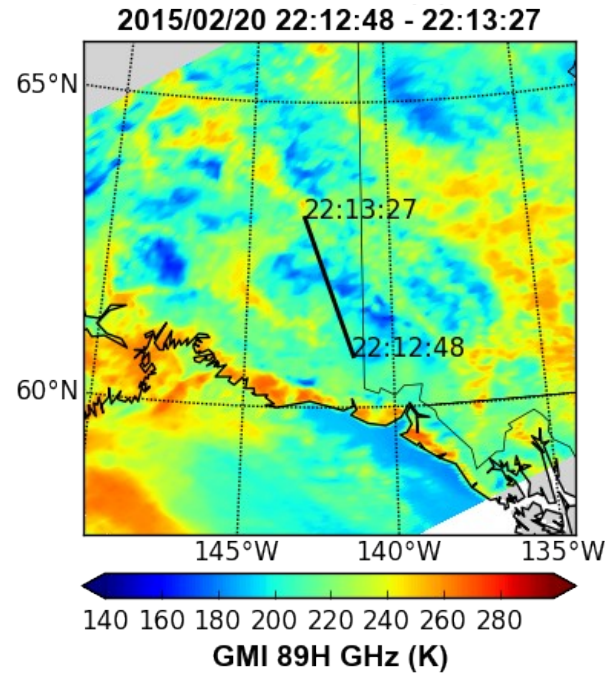
GPM+CloudSat coincidence 20 February 2015 Alaska winter mountainous terrain



No clouds evident in all three DPR scans

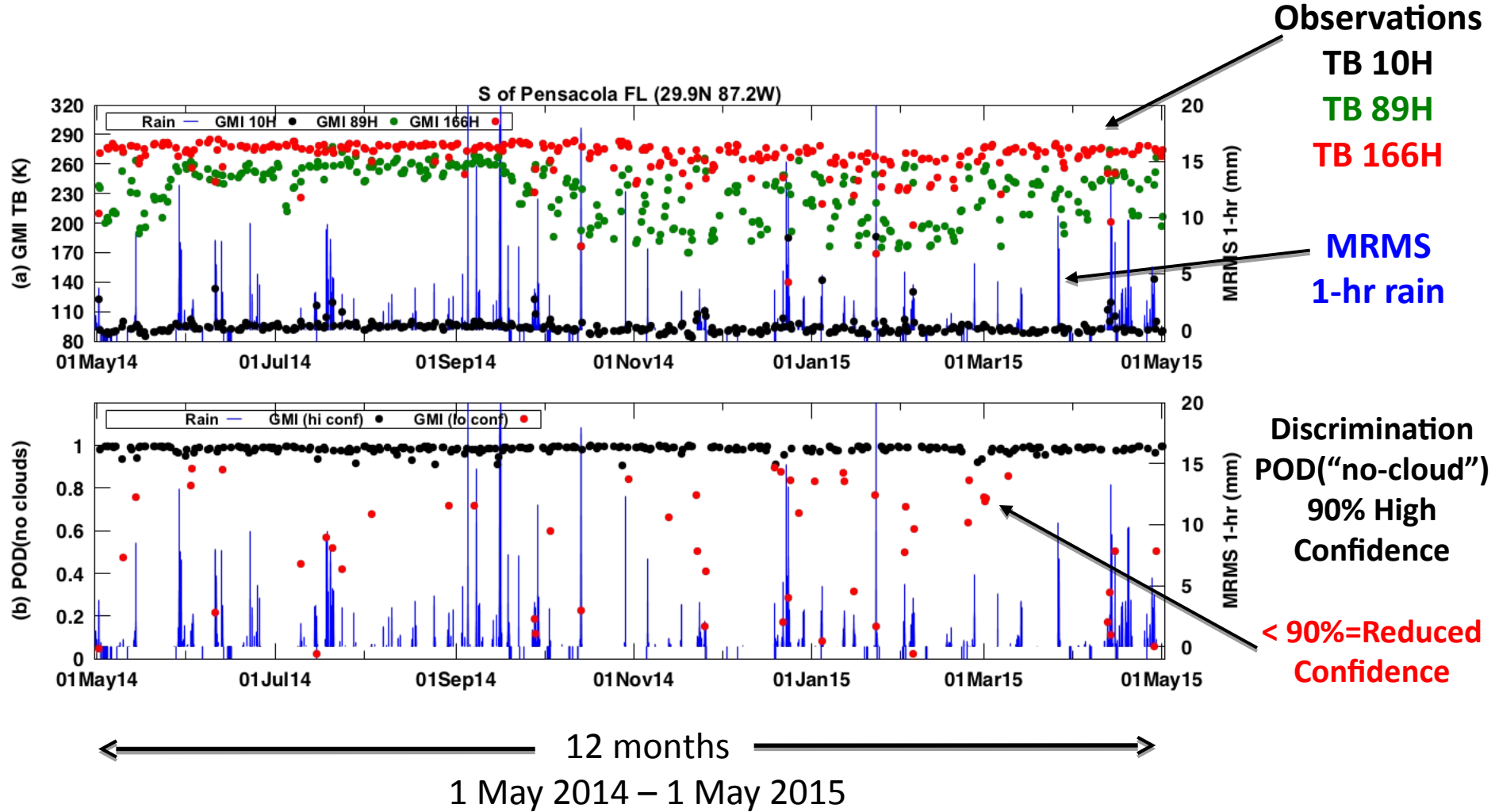


Trace of all 13 GMI channels



Extension to 166 GHz being examined for very dry cold scenes

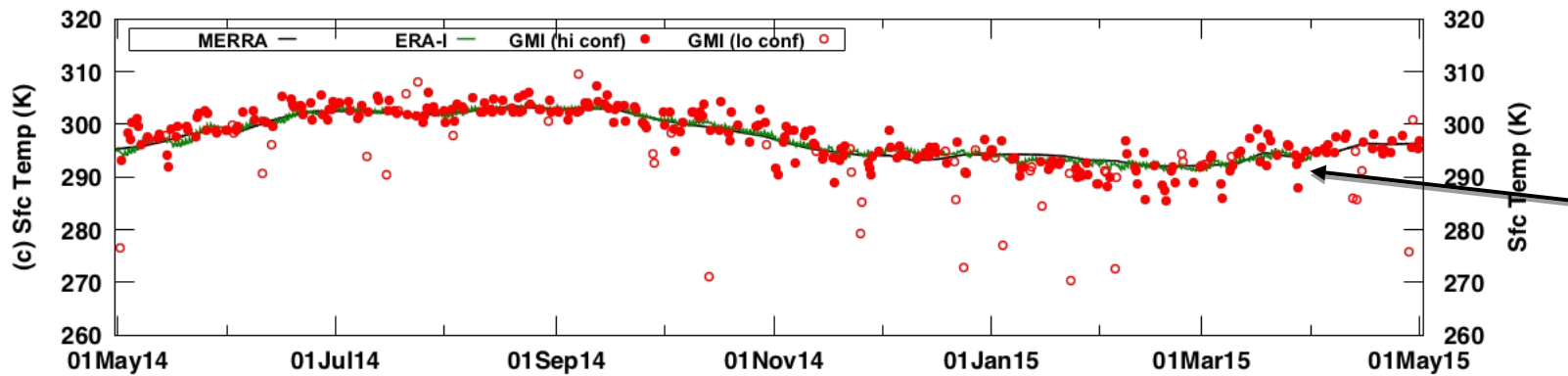
Rain/Emissivity State Timeseries near a point: S of Pensacola, FL, US



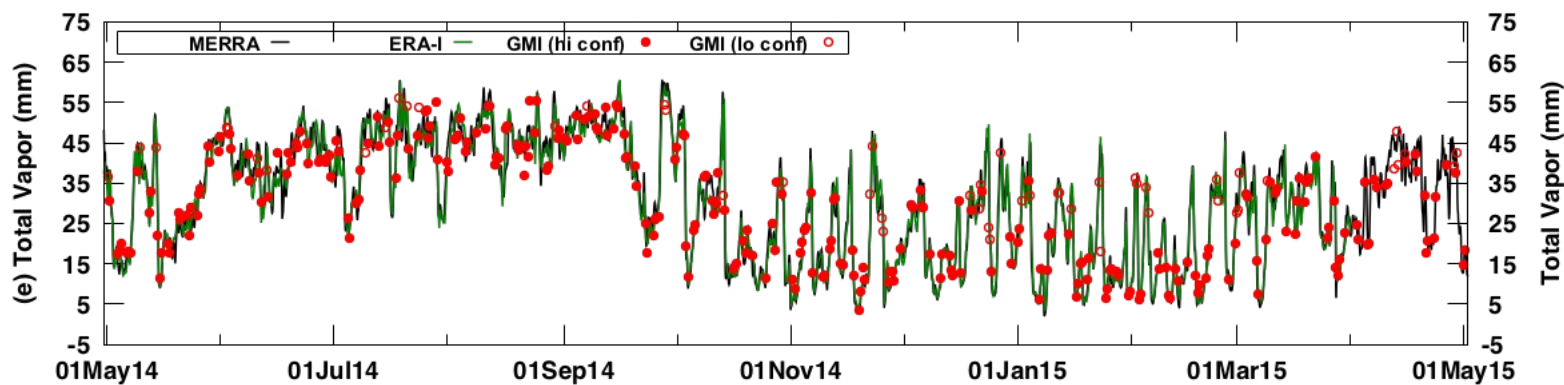
Mid-Latitude, Over-Water, No Coastal/Mixed Pixel Conditions

Rain/Emissivity State Timeseries near a point: S of Pensacola, FL, US

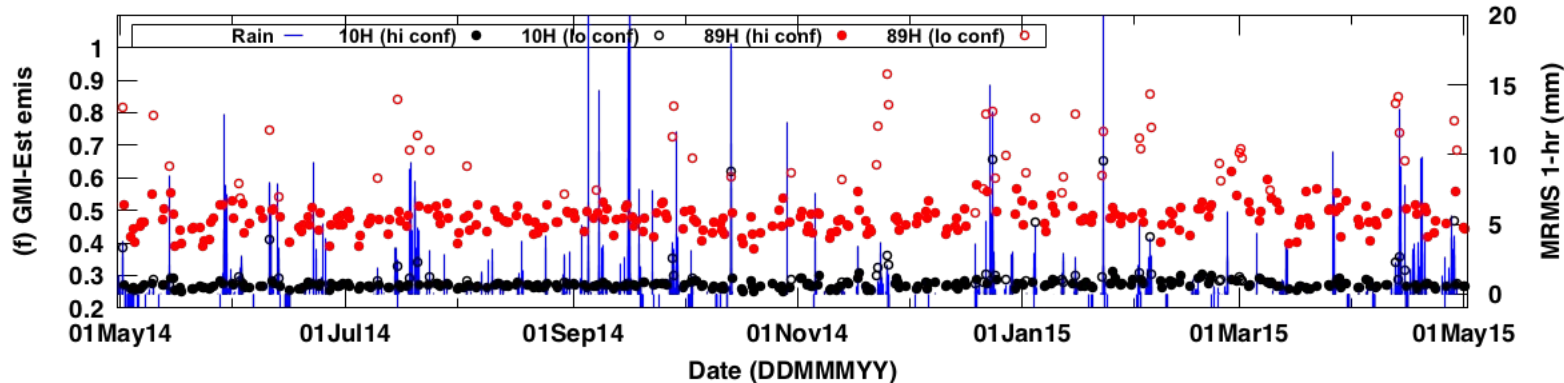
Closed Circles= High Confidence, Open Circles= Reduced Confidence



MERRA Ts
ERA-I Ts
Est. Ts



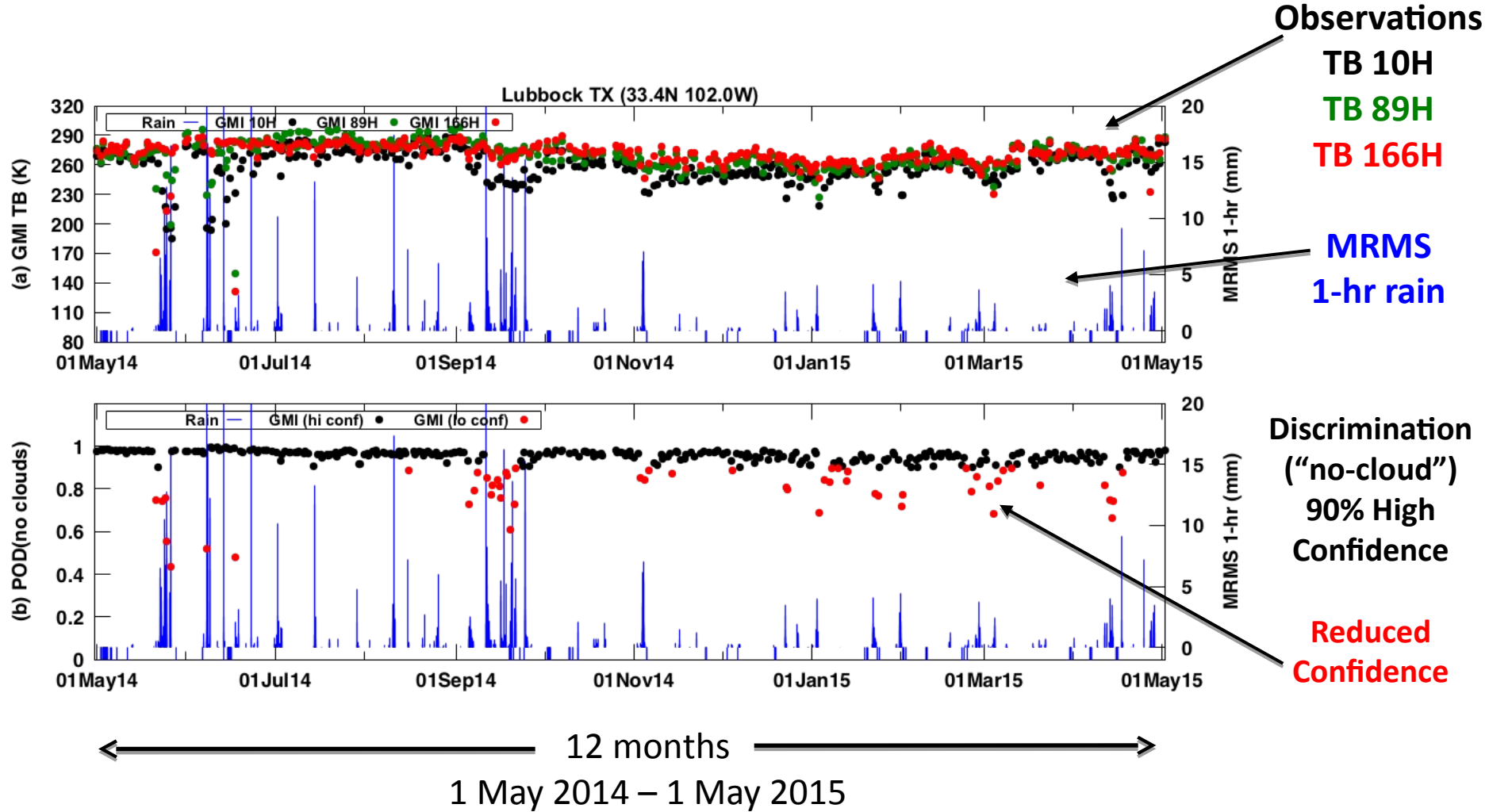
MERRA Tvp
ERA-I Tvp
Est. Tvp



Est. e10H
Est. e89H

MRMS
1-hr rain

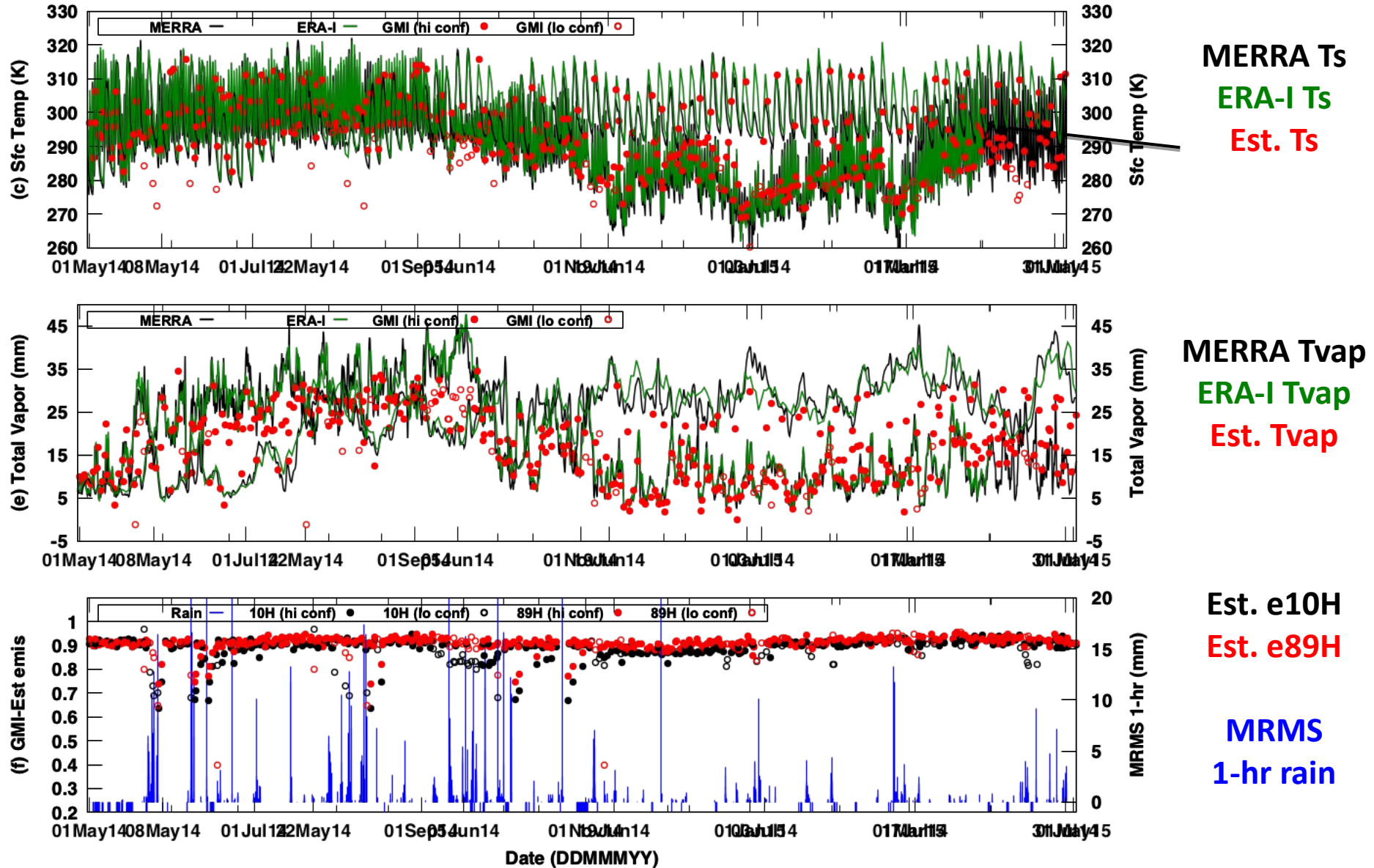
Rain/Emissivity State Timeseries near a point: West of Lubbock, TX, US



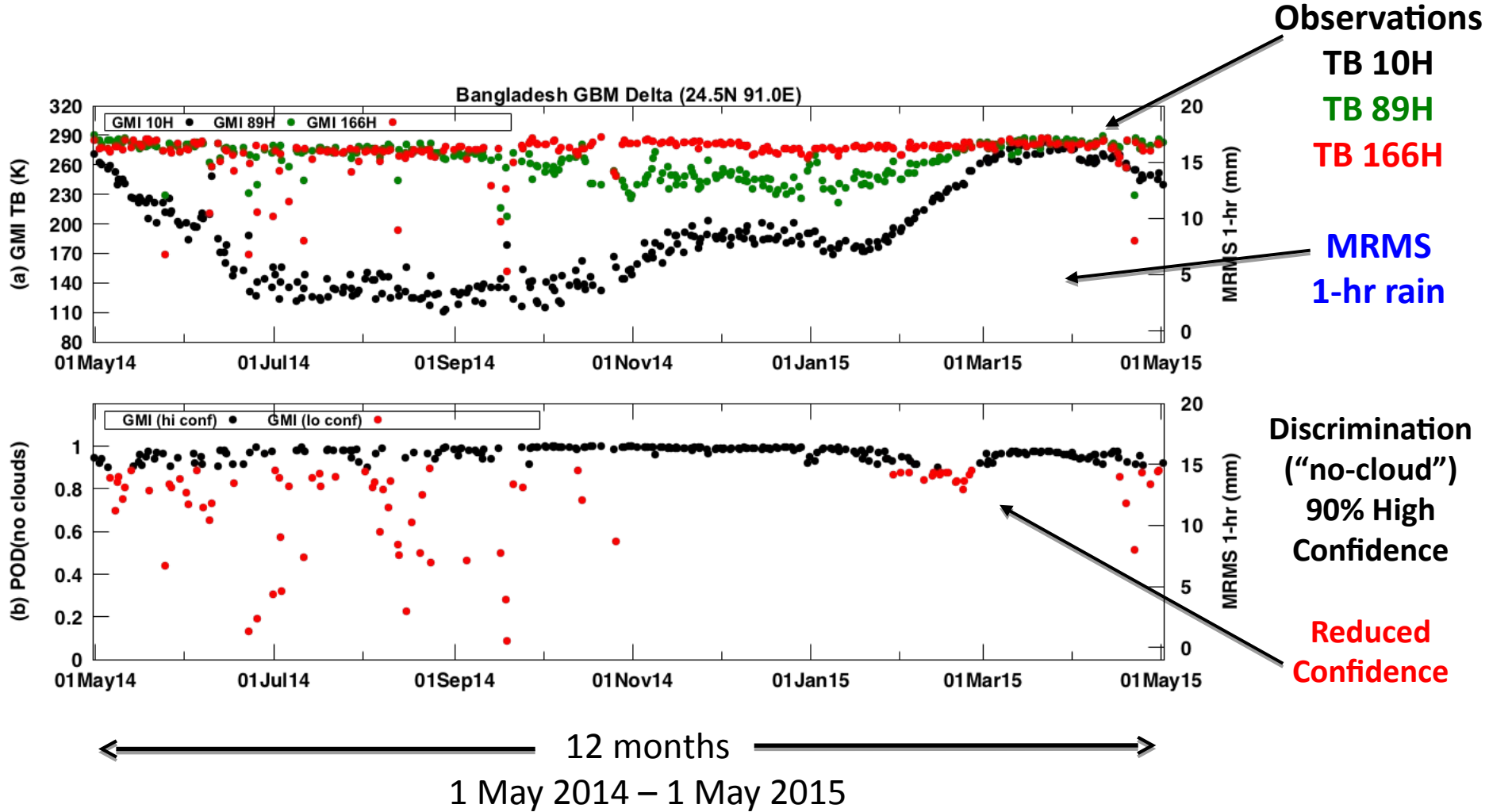
Soil type and scrub-like vegetation exhibit rapid rain response and dry-down

Rain/Emissivity State Timeseries near a point: West of Lubbock, TX,

Closed Circles= High Confidence, Open Circles= Reduced Confidence



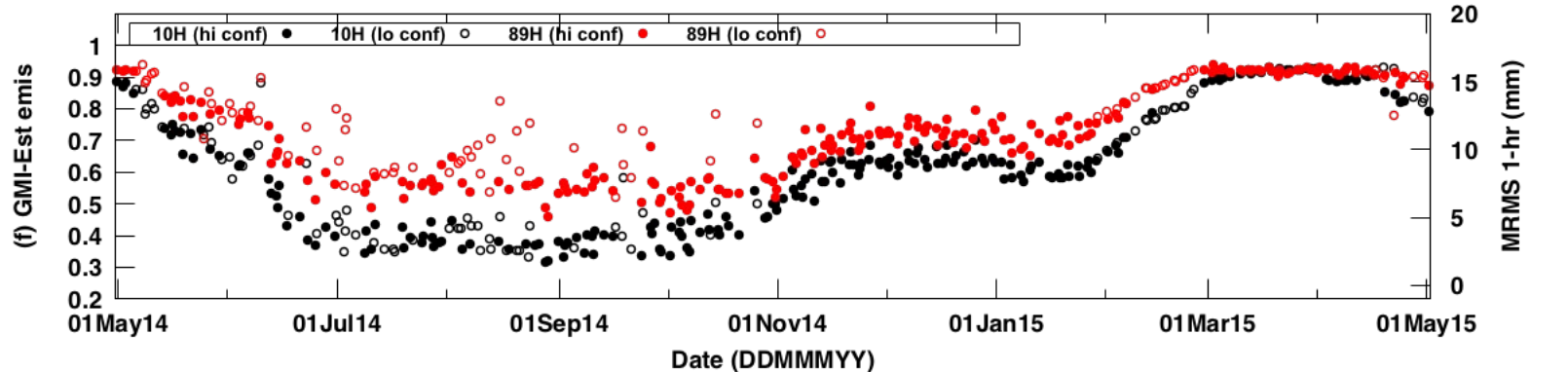
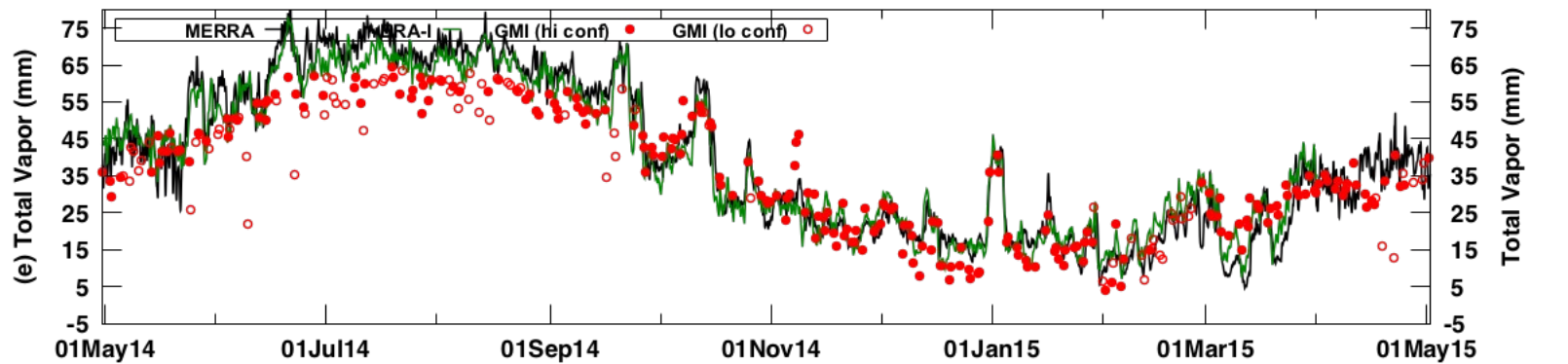
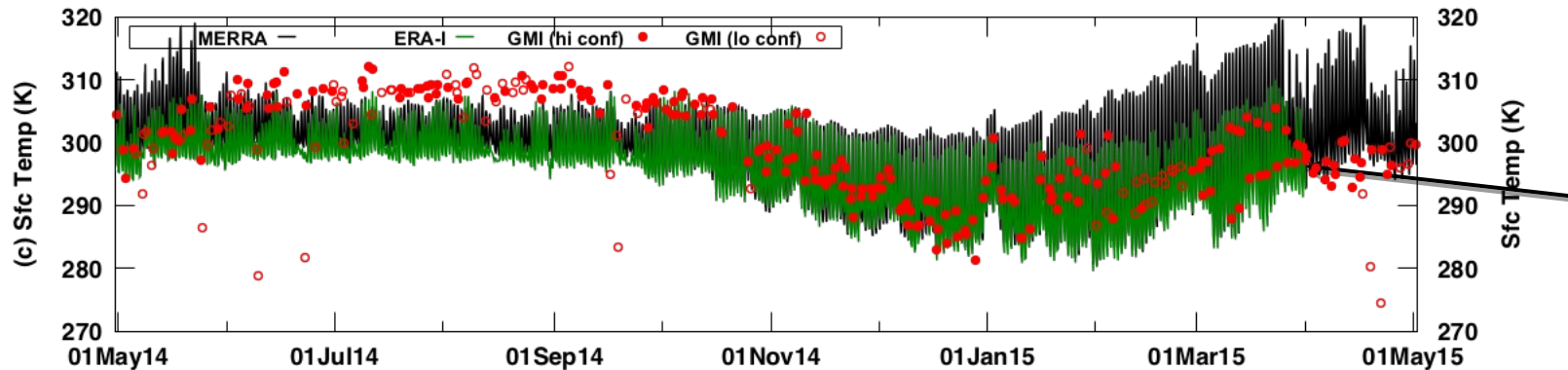
Meghna River, Bangladesh, Seasonal Wetland ("Haor")



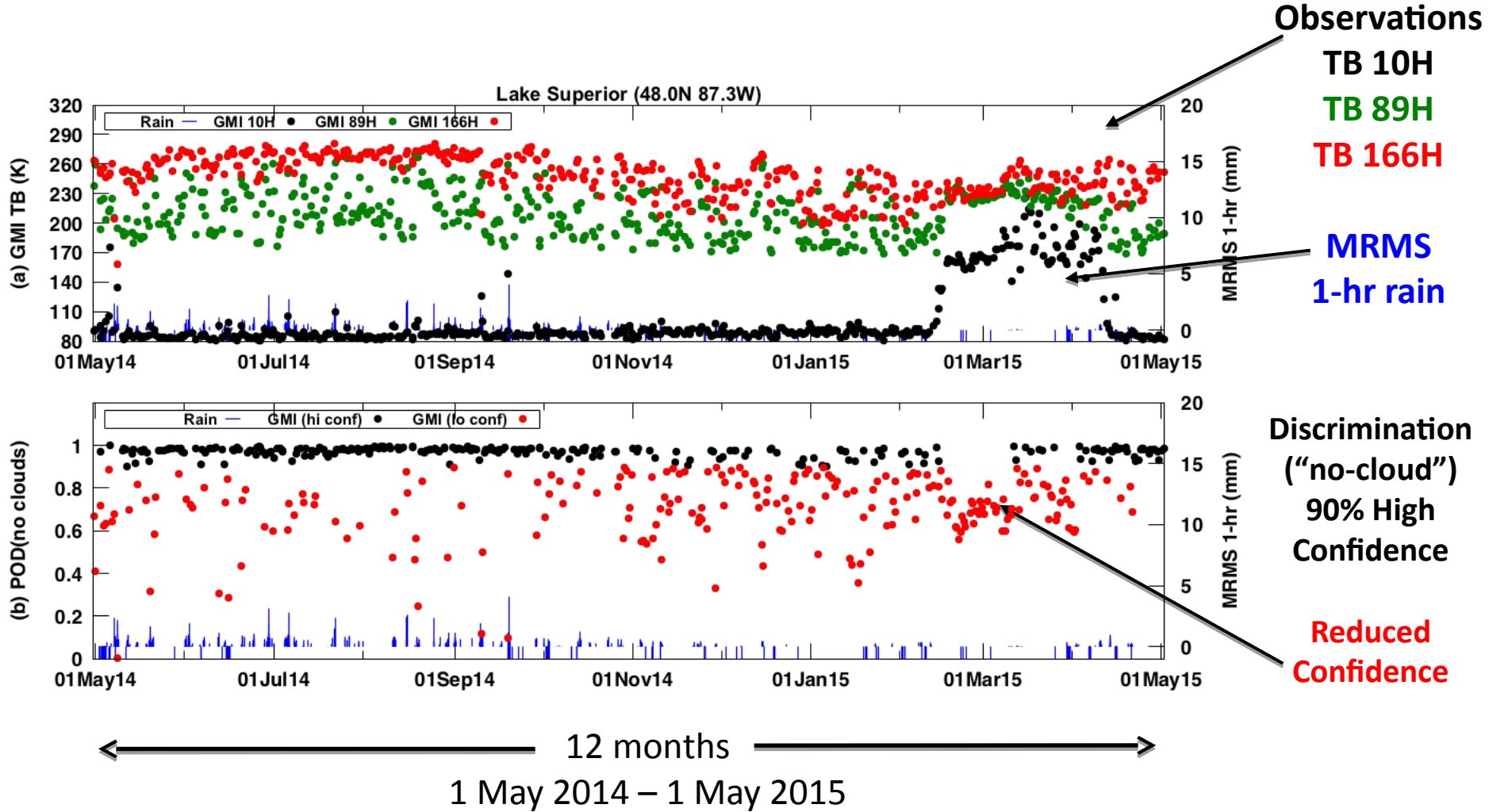
Can also experience rapid emissivity change across inundated areas

Meghna River, Bangladesh, Seasonal Wetland ("Haor")

Closed Circles= High Confidence, Open Circles= Reduced Confidence



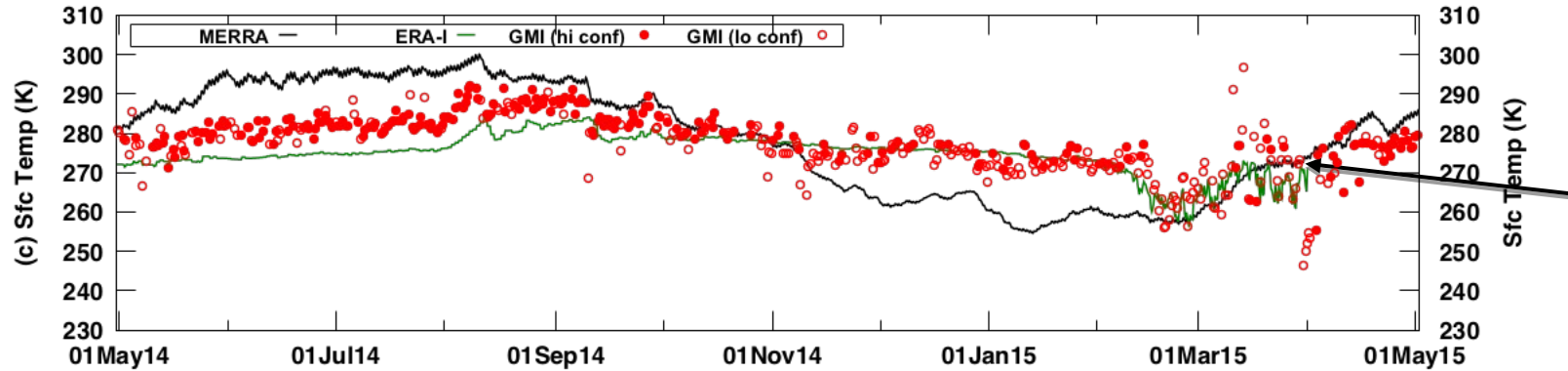
Middle of Lake Superior, US/Canada



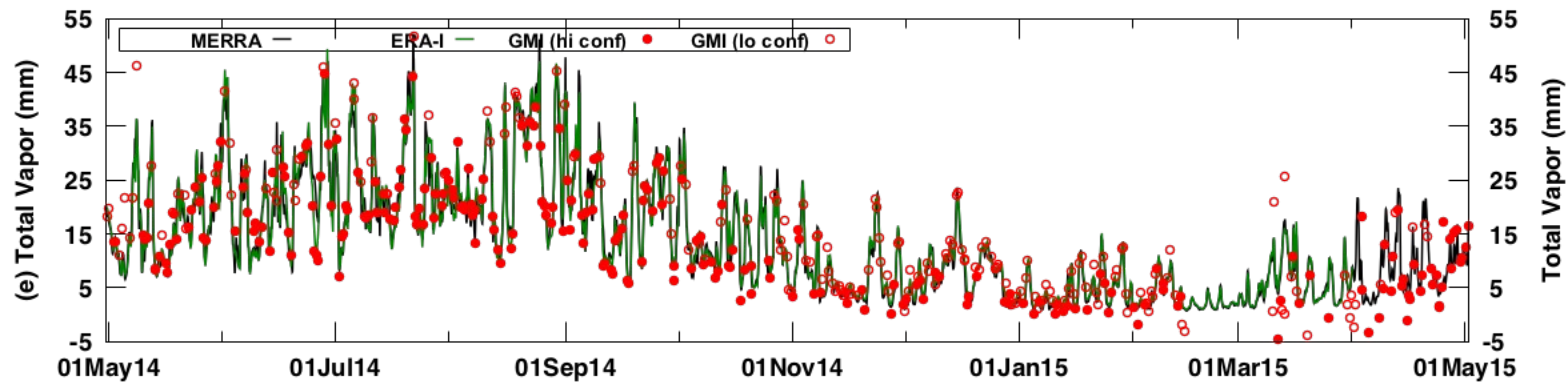
Inland Water Throughout Freeze-Thaw Conditions

Middle of Lake Superior, US/Canada

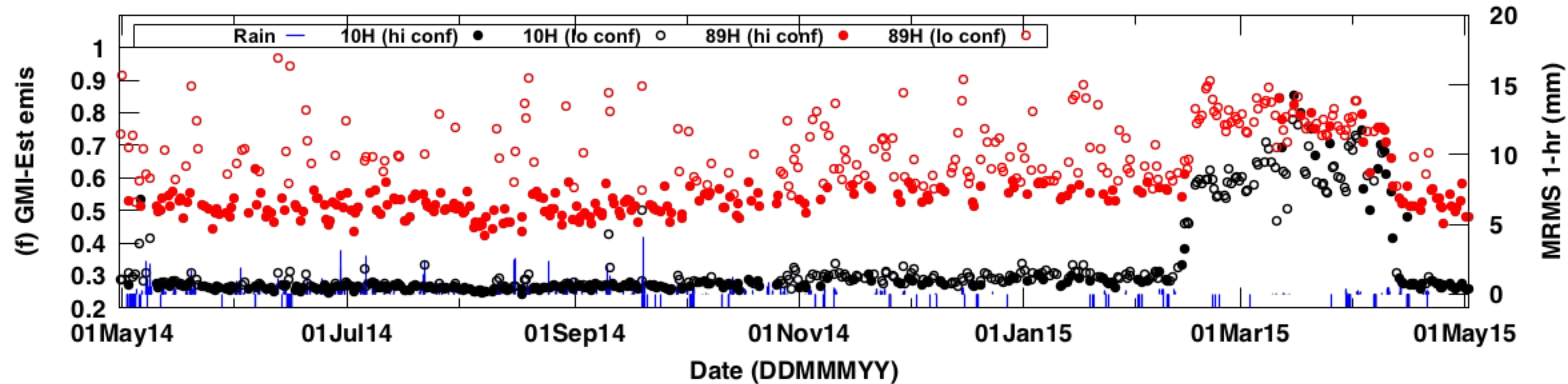
Closed Circles= High Confidence, Open Circles= Reduced Confidence



MERRA Ts
ERA-I Ts
Est. Ts

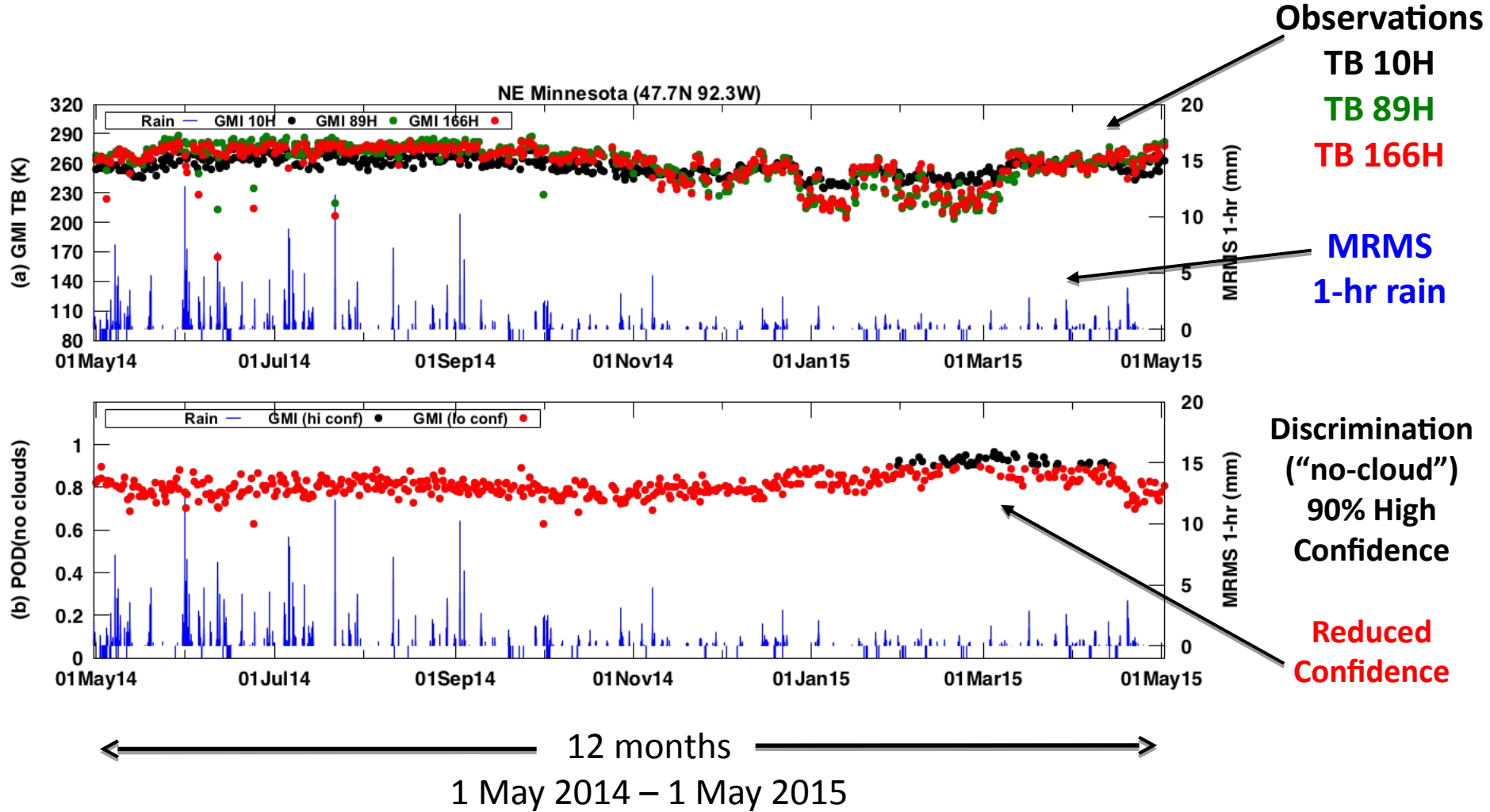


MERRA Tvp
ERA-I Tvp
Est. Tvp



Est. e10H
Est. e89H
MRMS
1-hr rain

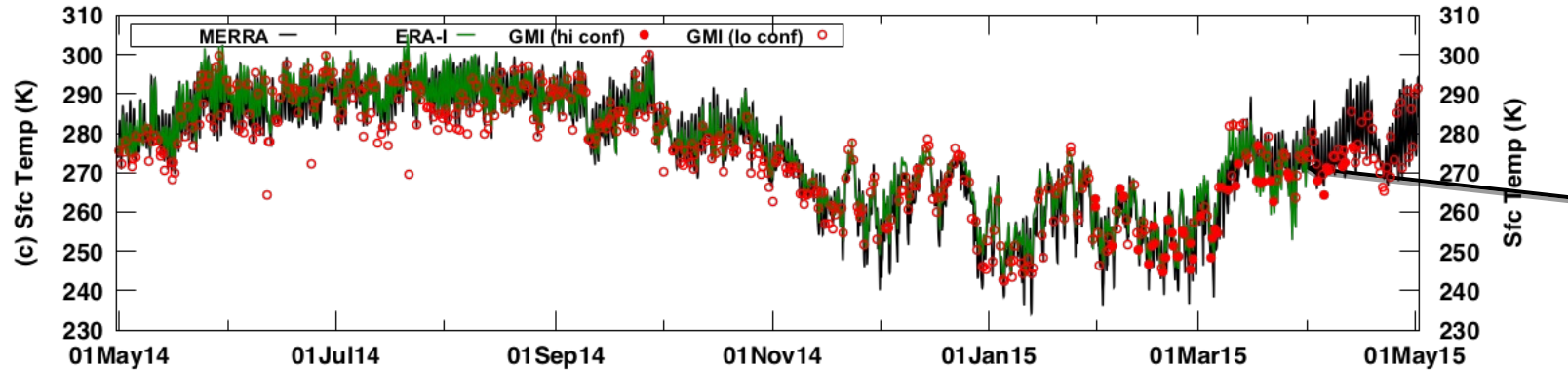
Northern Minnesota Forest, US



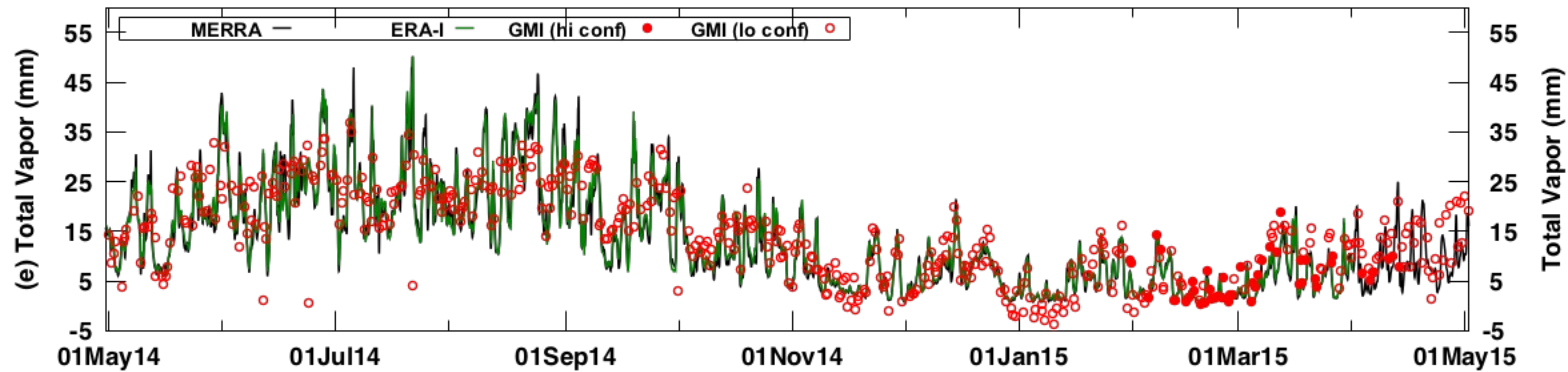
Cold surface, snowcover in cold season

Northern Minnesota Forest, US

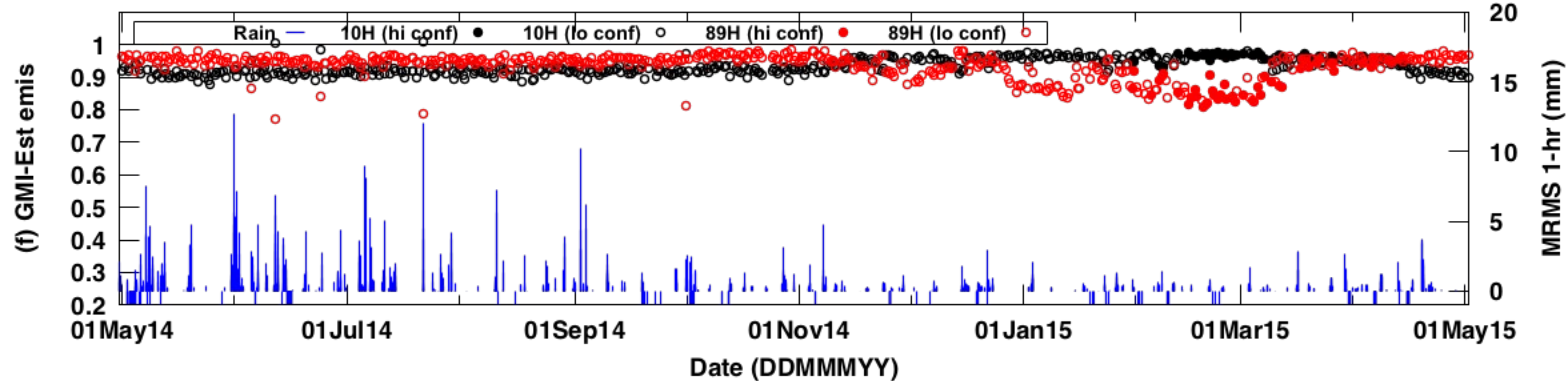
Closed Circles= High Confidence, Open Circles= Reduced Confidence



MERRA Ts
ERA-I Ts
Est. Ts



MERRA Tvp
ERA-I Tvp
Est. Tvp



Est. e10H
Est. e89H

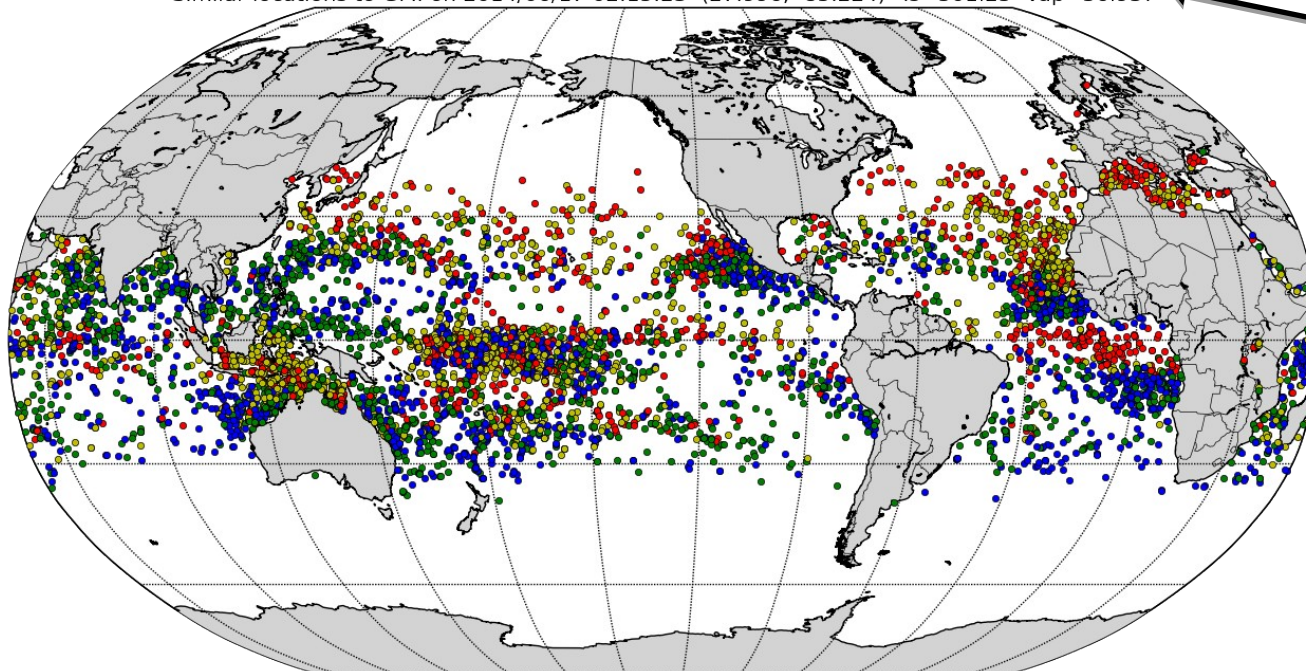
MRMS
1-hr rain

Applicability to Database Search: Example from Over-Ocean Warm SST

Similar locations to GMI on 2014/06/17 02:15:23 (27.996, -85.224) Ts=301.25 Vap=36.937

Gulf of Mexico
17 June 2014

DJF MAM
JJA SON



Search for "nearby" entries in leading EOF-space:

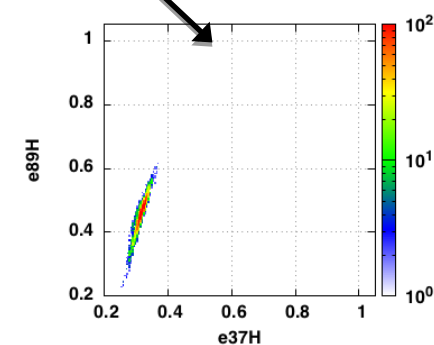
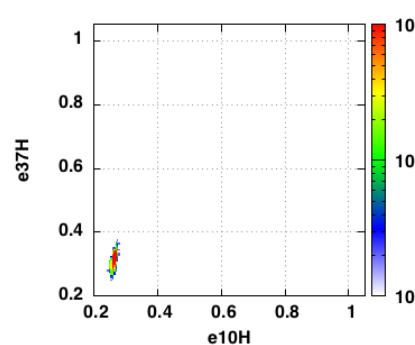
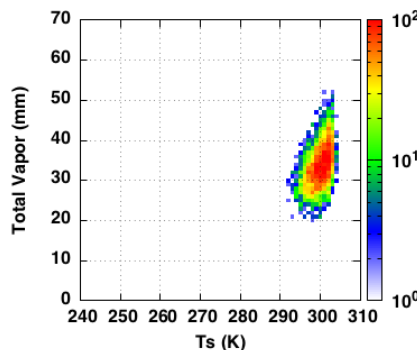
$$r = \sqrt{\frac{1}{N} \sum [(u^{obs} - u^{sim}) / \sigma_i]^2} \quad N=3$$

Throughout the process, the only time that latitude/longitude was ever consulted, was to plot the points on the map

Associated co-variability in emissivity

Associated co-variability in Tsfc and WV state variables

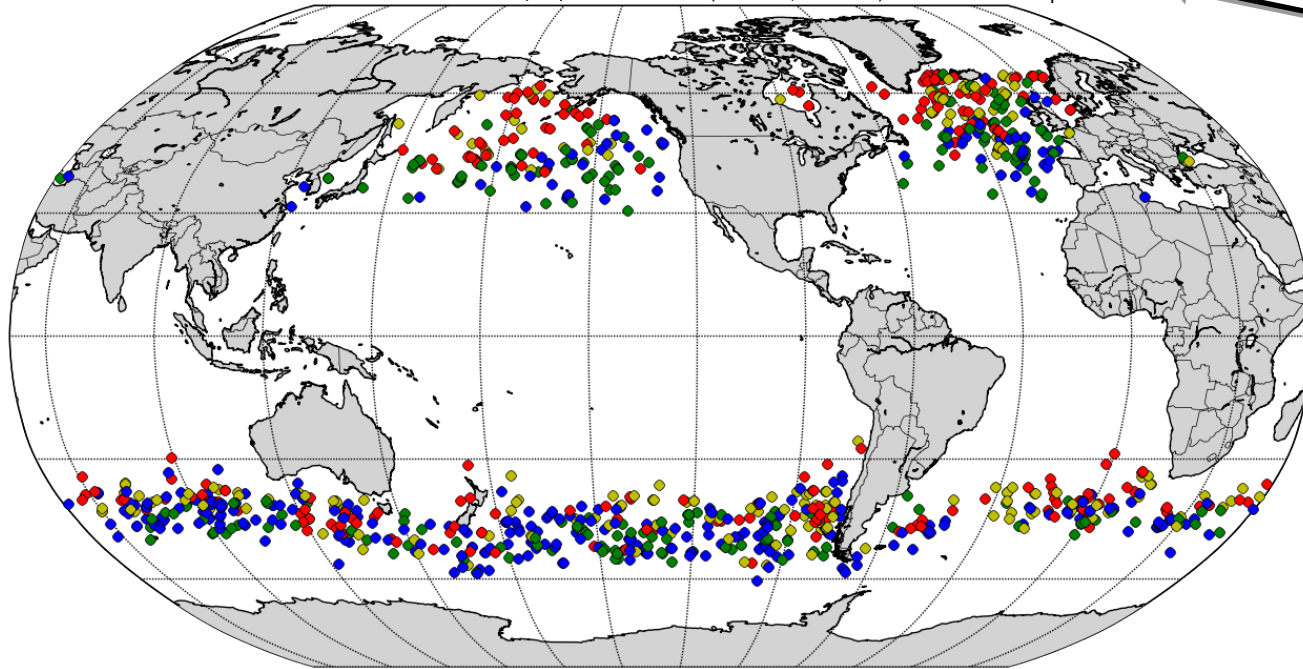
suggests possible alternate ways to index databases (transformation of variables)



Applicability to Database Search: Example from Midlatitude Inland Water

Similar locations to GMI on 2015/03/17 08:43:44 (38.598, 51.182) $T_s=286.04$ $Vap=15.93$

Center of the Caspian Sea
17 March 2015



DJF MAM
JJA SON

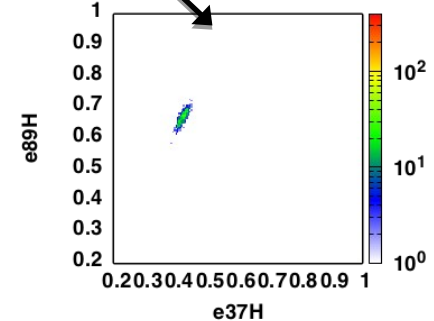
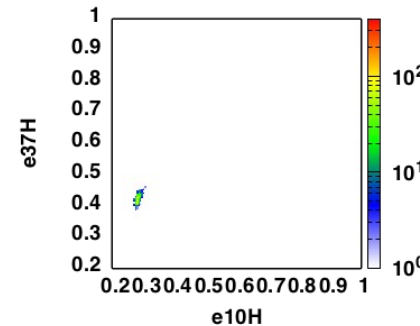
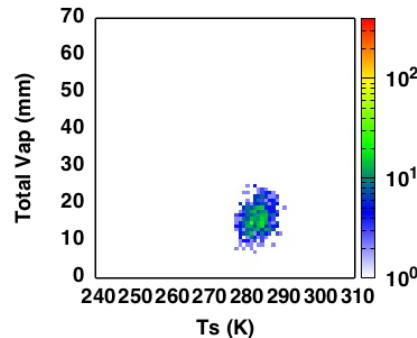
Search for "nearby" entries in leading EOF-space:

$$r = \sqrt{\frac{1}{N} \sum [(u^{obs} - u^{sim}) / \sigma_i]^2} \quad N=3$$

Throughout the process, the only time that latitude/longitude was ever consulted, was to plot the points on the map

Associated co-variability in emissivity

Associated co-variability in T_{sfc} and WV state variables



suggests possible alternate ways to index databases (transformation of variables)

Applicability to Database Search: Example from Bare Soil-Like, Daytime

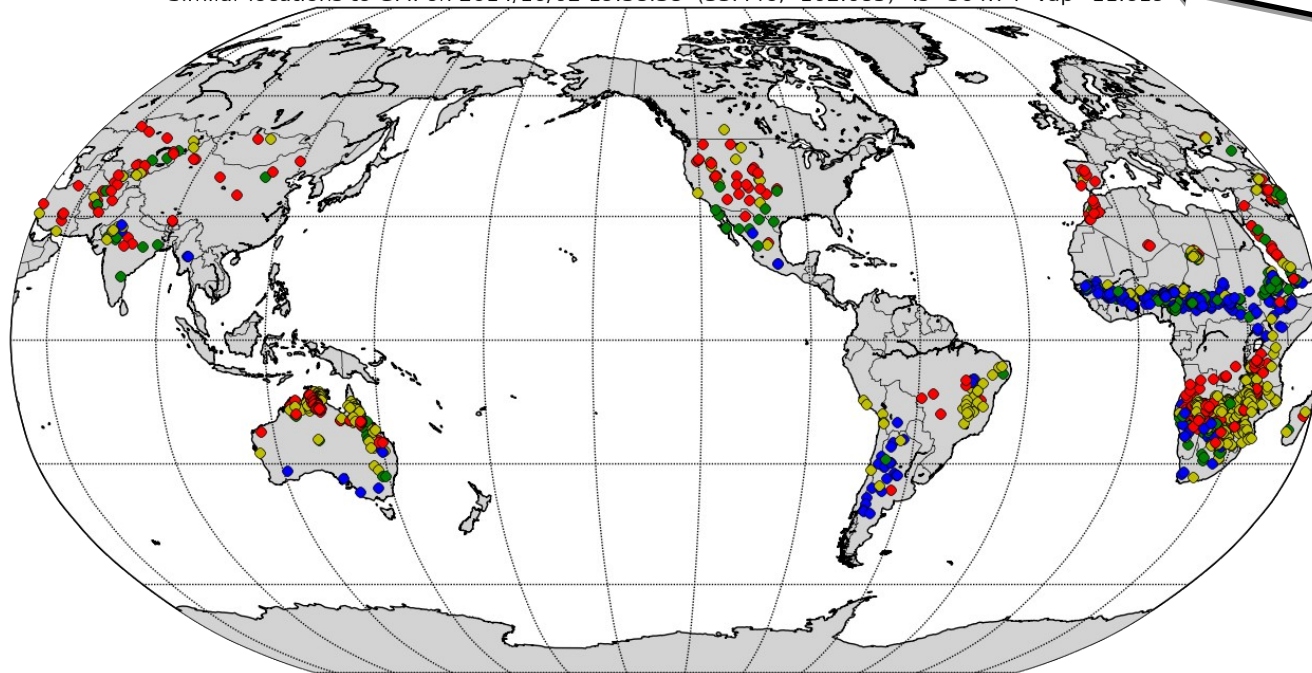
Similar locations to GMI on 2014/10/02 19:38:38 (33.446, -102.685) Ts=304.74 Vap=11.619

**West Texas
2 October
2014**

DJF MAM
JJA SON

Search for “nearby”
entries in leading
EOF-space:

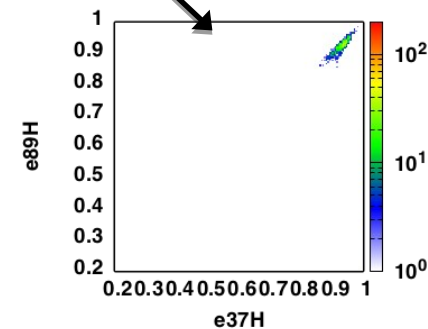
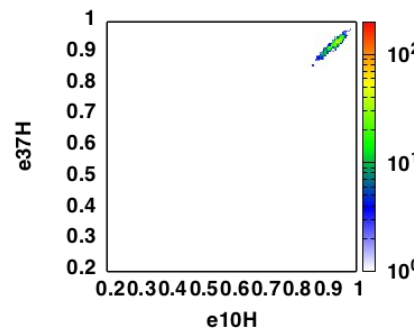
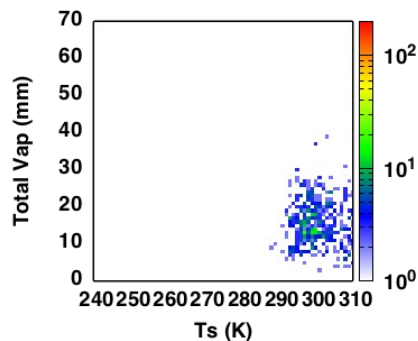
$$r = \sqrt{\frac{1}{N} \sum [(u^{obs} - u^{sim}) / \sigma_i]^2} \quad N=3$$



Throughout the process, the only time that latitude/longitude was ever consulted, was to plot the points on the map

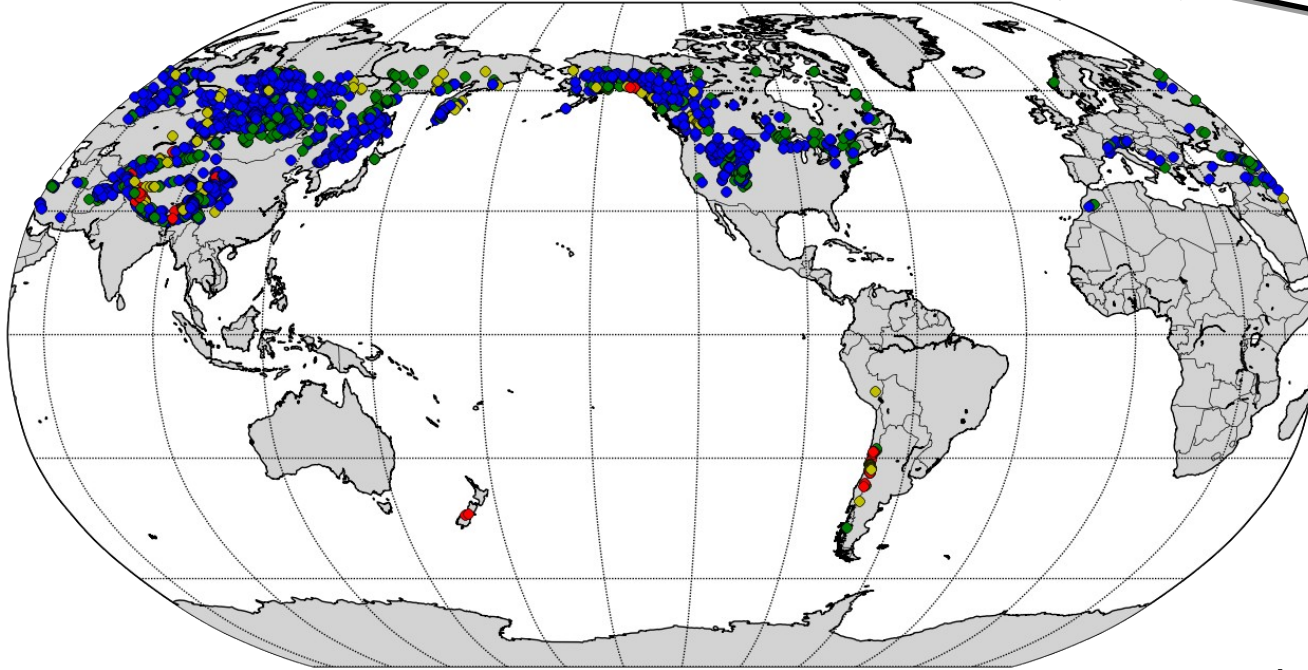
Associated co-variability in emissivity

Associated co-variability in Tsfc and WV state variables



Applicability to Database Search: Snow Covered, Cold, Dry

Similar locations to GMI on 2015/03/01 14:25:25 (47.599, -92.467) Ts=259.15 Vap=1.755



NE Minnesota,
snow-covered
1 March 2015

DJF MAM
JJA SON

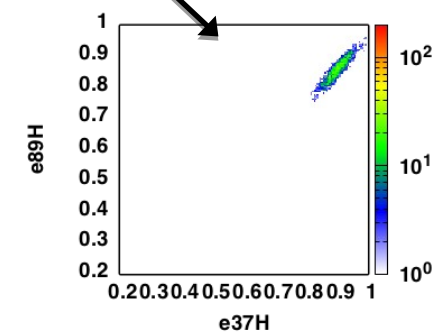
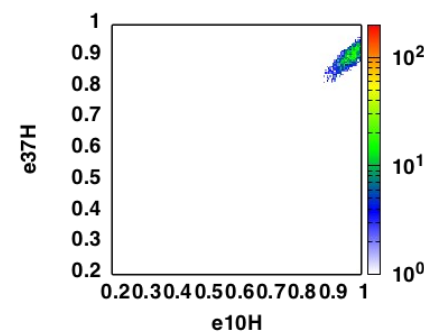
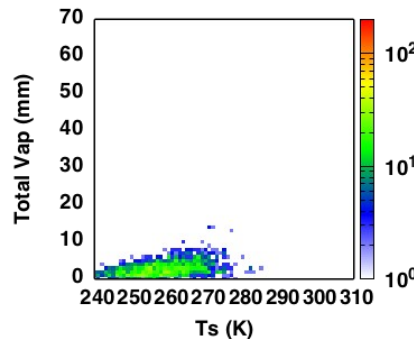
Search for “nearby”
entries in leading
EOF-space:

$$r = \sqrt{\frac{1}{N} \sum [(u^{obs} - \bar{u}) / \sigma_i]^2} \quad N=3$$

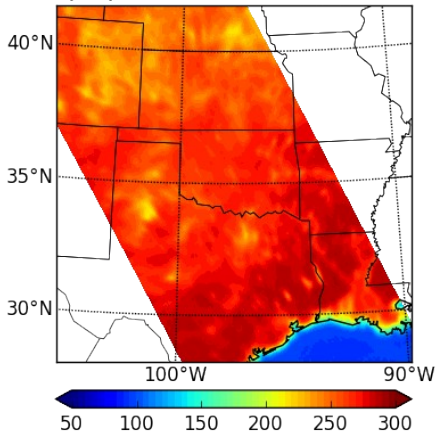
Throughout the process, the only time that latitude/longitude was ever consulted, was to plot the points on the map

Associated co-variability in
emissivity

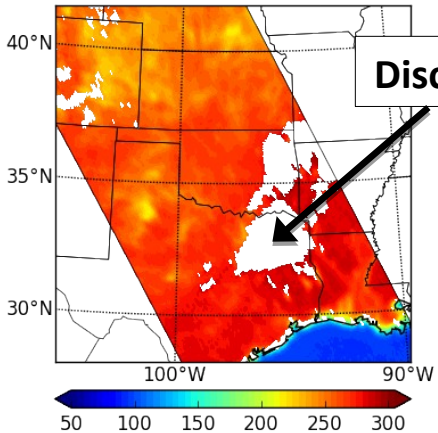
Associated co-variability
in Tsfc and WV state
variables



2015/05/11 0252 UTC GMI 10H GHZ

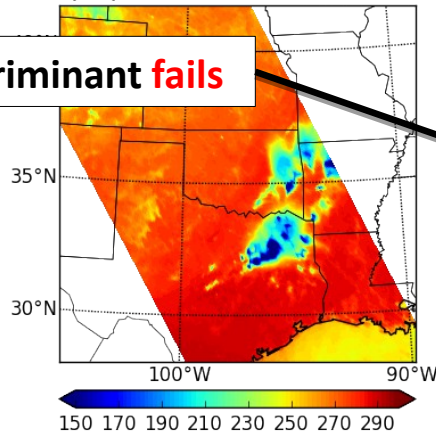


Simulated 10H GHZ

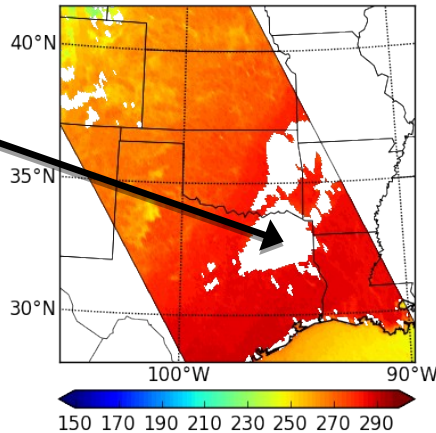


Discriminant fails

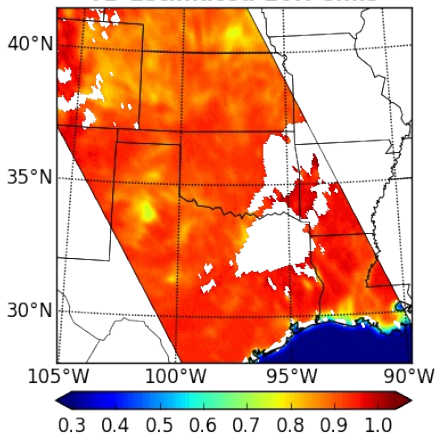
2015/05/11 0252 UTC GMI 89H GHZ



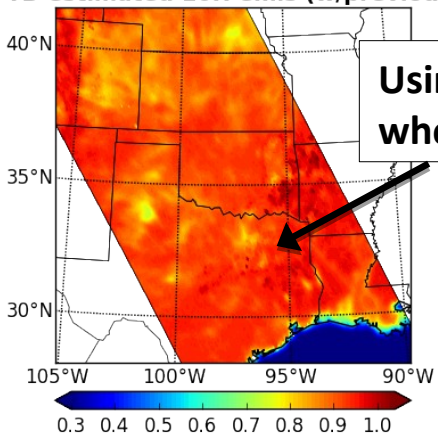
Simulated 89H GHZ



TB-Estimated 10H emis

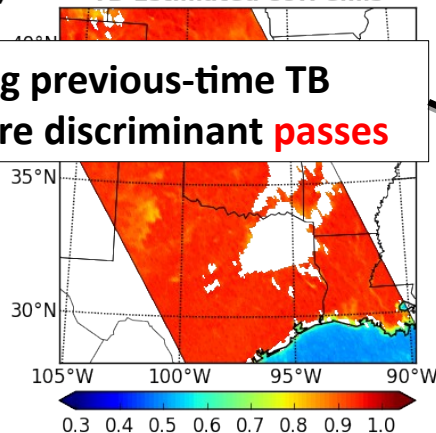


TB-estimated 10H emis (w/previous)

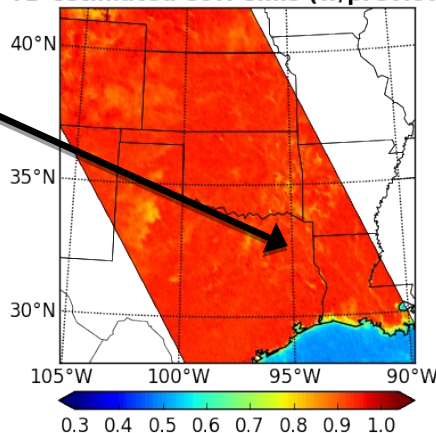


Using previous-time TB where discriminant passes

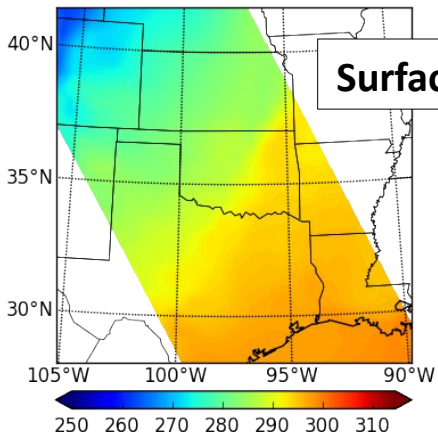
TB-Estimated 89H emis



TB-estimated 89H emis (w/previous)

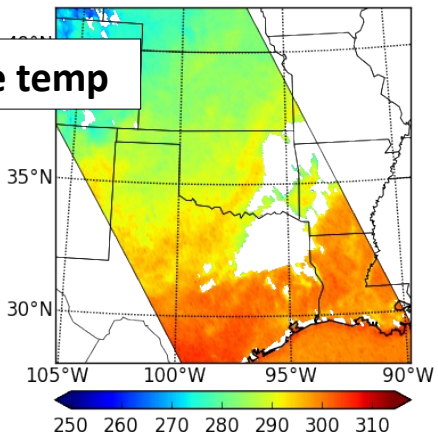


Model Tsfc

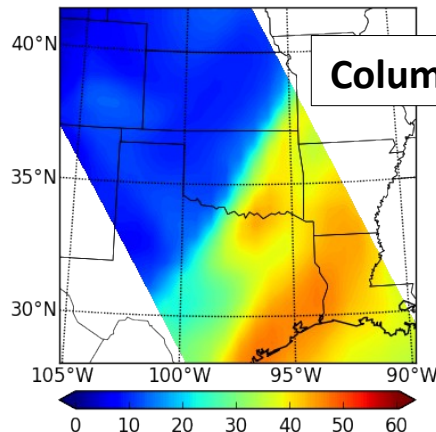


Surface temp

TB-Estimated Tsfc

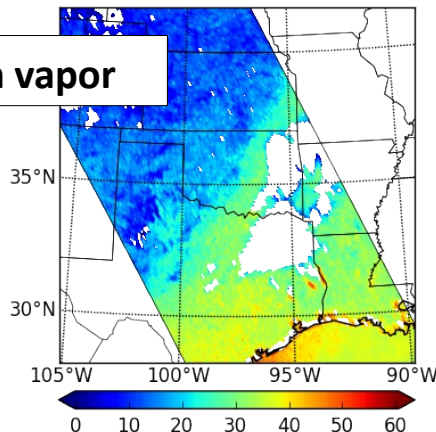


Model TWV



Column vapor

TB-Estimated TWV



Current Efforts

Further evaluate emissivity vector formulation for stratifying/searching existing GPM a-priori databases (transformation of variables to different search index space)

Further evaluate utility of 166 GHz channels for cold-season (< 10 mm vapor) precipitation using GPM-CloudSat (W-band) coincidence dataset, , to better guide GPM snowfall and light rain TB simulations

Offline version of GPROF-GPM to test and evaluate use of observationally-based emissivity vector in forward TB radiometer simulations

3-freq (Ku/Ka/W-band) Advanced Precipitation Radar (APR-3) data and MW radiometer during OLYMPEX (Nov-Dec 2015)