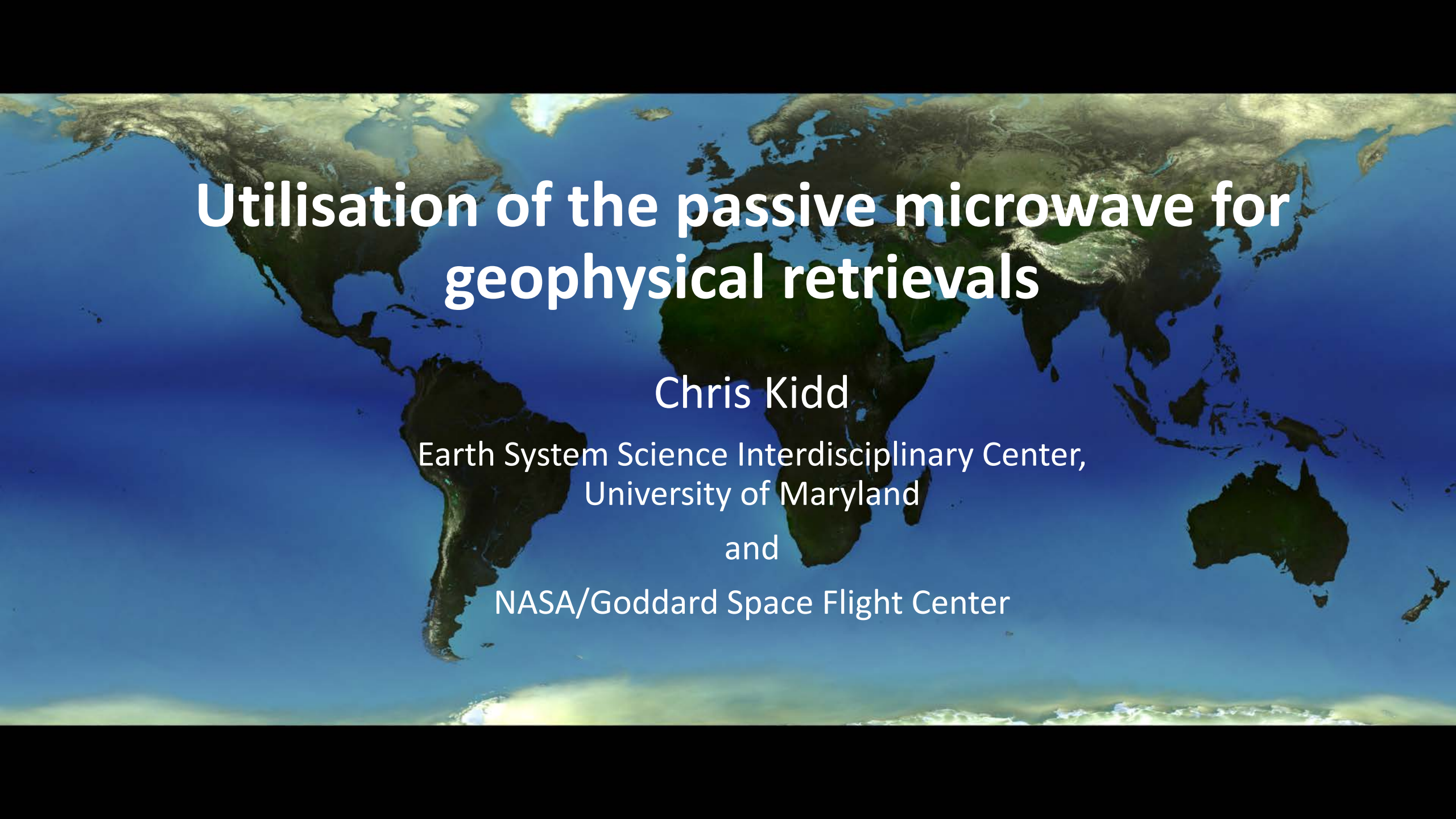


A satellite image of Earth showing the Western Hemisphere, including North and South America, the Atlantic Ocean, and parts of Europe and Africa. The text is overlaid on this image.

# Utilisation of the passive microwave for geophysical retrievals

Chris Kidd

Earth System Science Interdisciplinary Center,  
University of Maryland

and

NASA/Goddard Space Flight Center

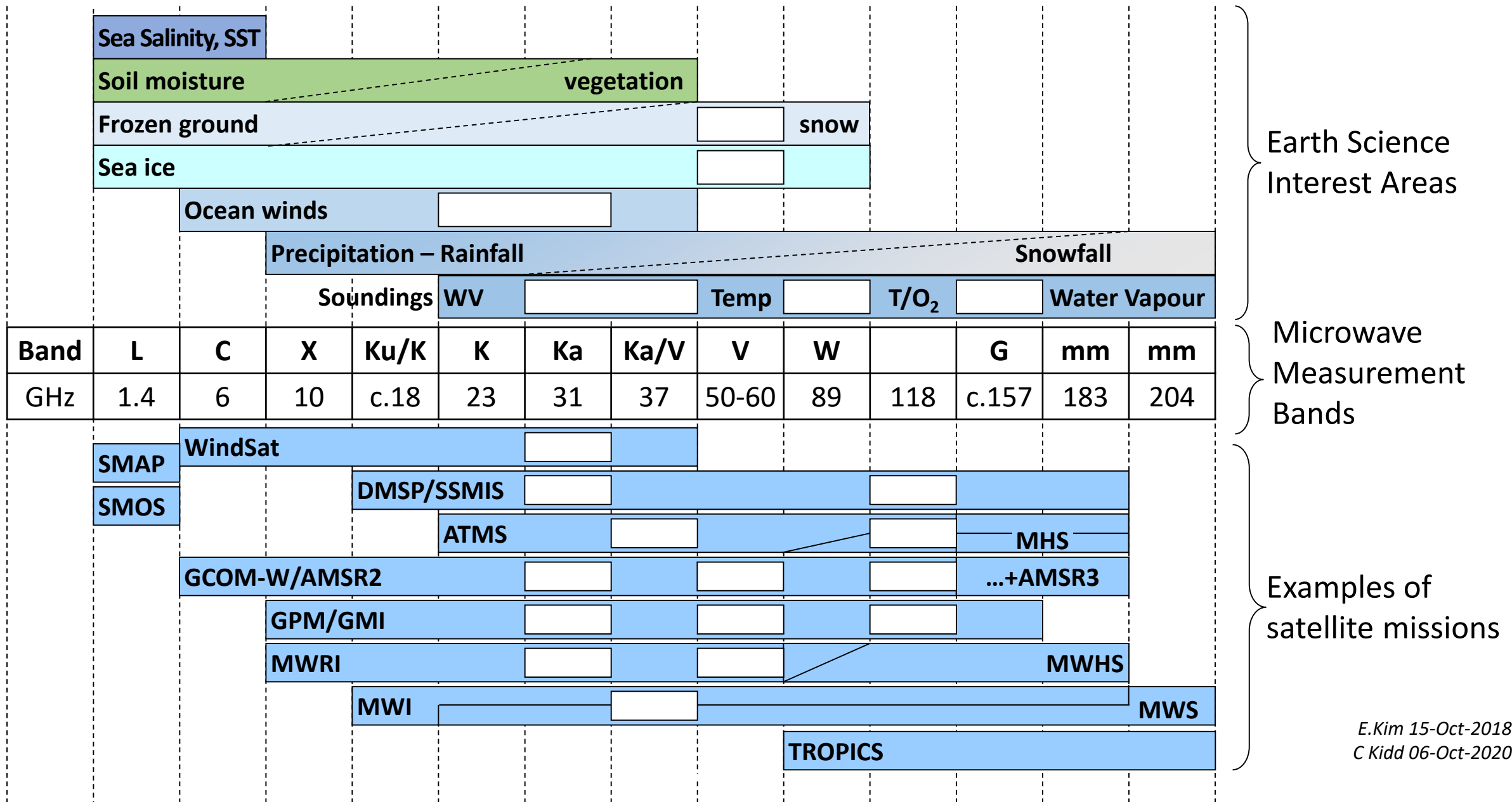
# Introduction

- Passive microwave observations of the Earth have been available since the 1960's, with long-term data availability since the 1970's.
- They provide all-weather observations which relate to geophysical properties of the surface and atmosphere.
- Frequencies from ca.10-50 GHz provide the 'core' channels for Earth observation, complemented by other frequencies.

This talk will cover:

- Background to mid-frequency passive microwave observations
- Examples of geophysical retrievals
- Retrieving precipitation, including channel selection

# Passive Microwave Science, Bands, & Satellite Sensors



# Mid-frequency Passive Microwave channels and uses

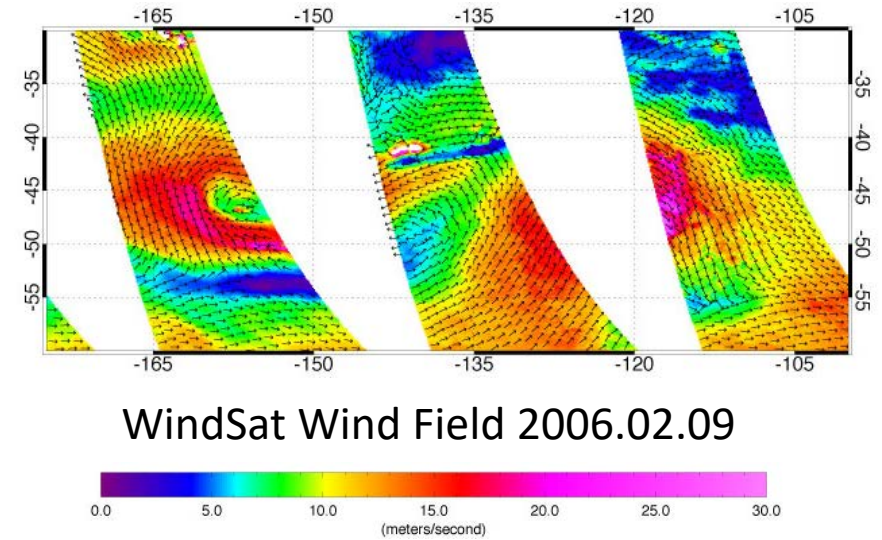
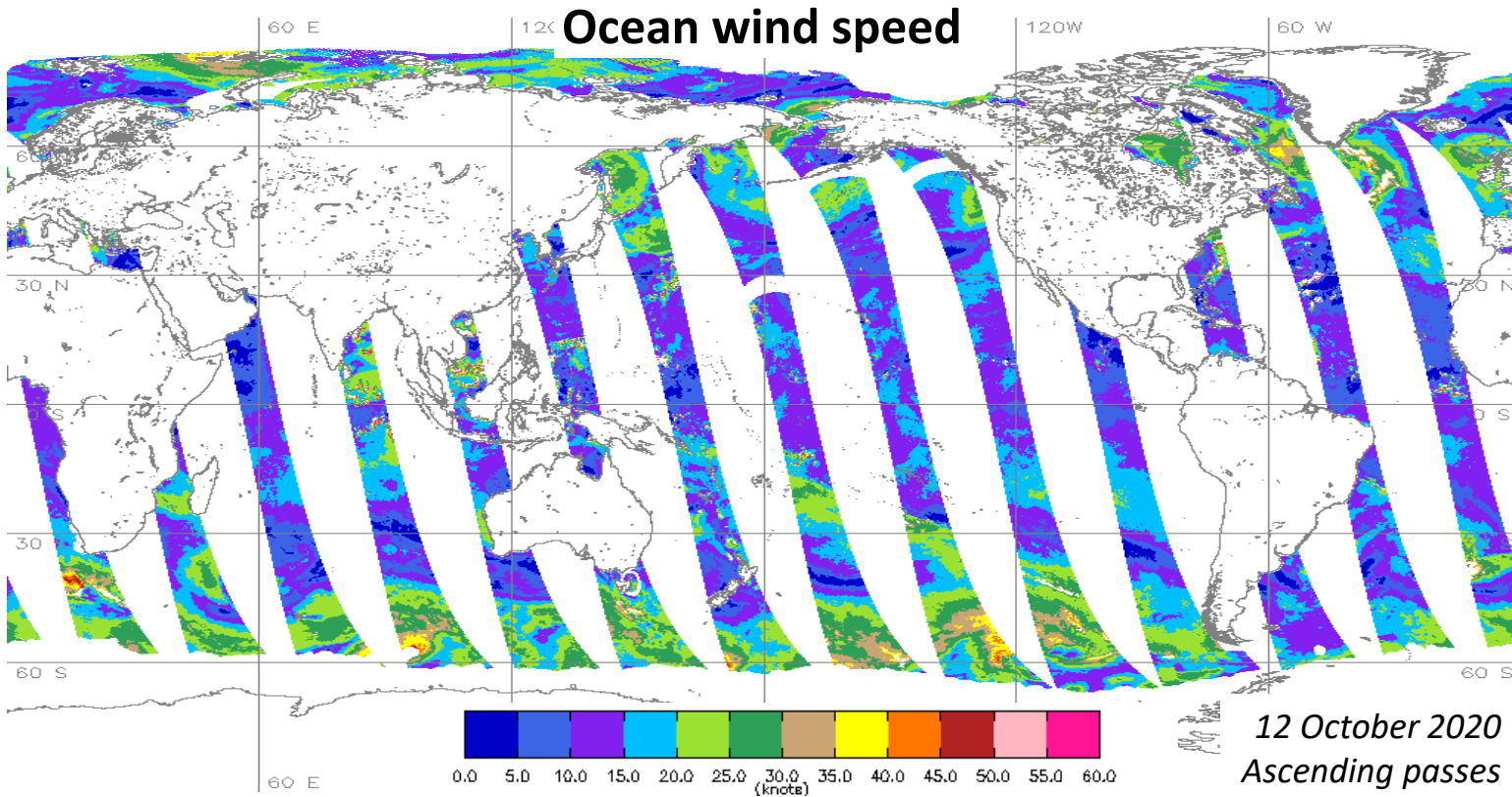
| Frequency                          | Active/Passive | Purpose                                     | Use/Sensors                                                                                                                                                                  |
|------------------------------------|----------------|---------------------------------------------|------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| 10.6-10.7 GHz                      | Passive        | Window                                      | Low frequency passive microwave channels used for soil moisture, snow/ice and over ocean liquid precipitation (e.g. AMSR-2, GMI)                                             |
| 13.256-13.8 GHz                    | Active         | Scatterometer<br>Altimeter<br>Precip. Radar | Numerous narrow-band channels used for scatterometers (e.g. SCAT, Rapidscat) and altimeters (e.g. OSCAT, Poseiden), together with precipitation radars (PR, DPR, Rainradar). |
| 18.0/18.7 GHz<br>19.35 GHz         | Passive        | Window                                      | Low-mid passive microwave channels used for soil moisture, snow/ice and over ocean liquid precipitation (e.g. AMSR-2, GMI)                                                   |
| 21.0 GHz<br>22.235 GHz<br>23.8 GHz | Passive        | Water vapour                                | Water vapour channel used in conjunction with other passive microwave channels for geophysical retrievals and correction of altimeter data.                                  |
| 31.4 GHz                           | Passive        | Window                                      | Mid passive microwave channels used for snow/ice and ocean/land precipitation retrievals (e.g. AMSU-A, MWS <sup>e</sup> , ATMS)                                              |
| 34.0 GHz                           | Passive        | Window                                      | Mid passive microwave channel used in support of altimeter measurements (e.g. AMR)                                                                                           |
| 35.5 GHz<br>35.75 GHz              | Active         | Altimeter<br>Precip.Radar                   | Altimeter and Ka-band precipitation radar (e.g. KaRIN, DPR)                                                                                                                  |
| 36.5-37.0 GHz                      | Passive        | Window                                      | Mid passive microwave channels used for snow/ice and ocean/land precipitation retrievals (e.g. AMSR-2, GMI) and in support of Altimeter measurements (e.g. MWR).             |
| 42.0/48.0 GHz                      | Passive        | Window                                      | Passive microwave channels for geophysical retrievals (e.g. MTVZA-GY)                                                                                                        |

# Sensor categories

Satellite-based sensors utilising passive microwave frequencies for Earth Observation:

- ***Imaging instruments***: radiometers using primarily window channels to observe (primarily) the Earth surface, with a wide swath with mapping capabilities, typically conically-scanning;
- ***Sounding instruments***: radiometers focusing upon the atmospheric absorption bands (e.g. WV, O<sub>2</sub>) for observing atmospheric parameters with a wide swath, typically cross-track scanning;
- ***Active instruments***: primarily nadir-viewing or narrow-swath altimeters or scatterometers for surface parameters, but also precipitation/cloud radars to provide vertical information;
- ***Single beam instruments***: radiometers used in support of the altimeters and scatterometers.

# Ocean Products



## WindSat

| Freq. | Polarisation      | Notes                   |
|-------|-------------------|-------------------------|
| 6.8   | V,H               | Used to correct for SST |
| 10.7  | V,H $\pm 45$ ,L,R |                         |
| 18.7  | V,H $\pm 45$ ,L,R |                         |
| 23.8  | V,H               | Used to correct for WV  |
| 37.0  | V,H $\pm 45$ ,L,R |                         |

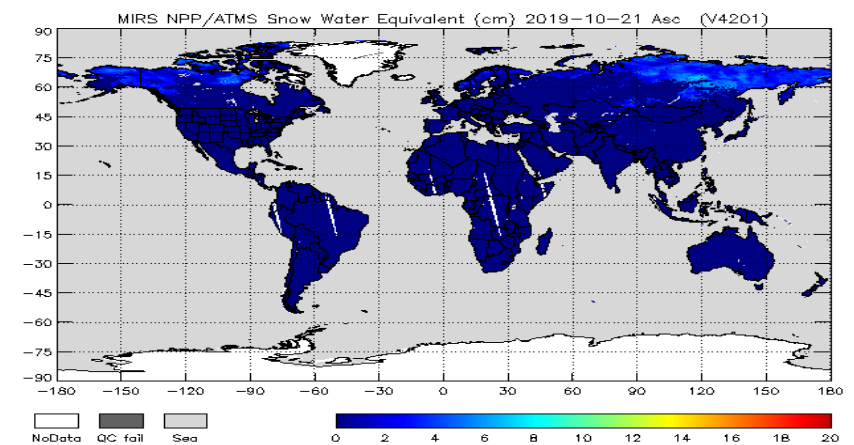
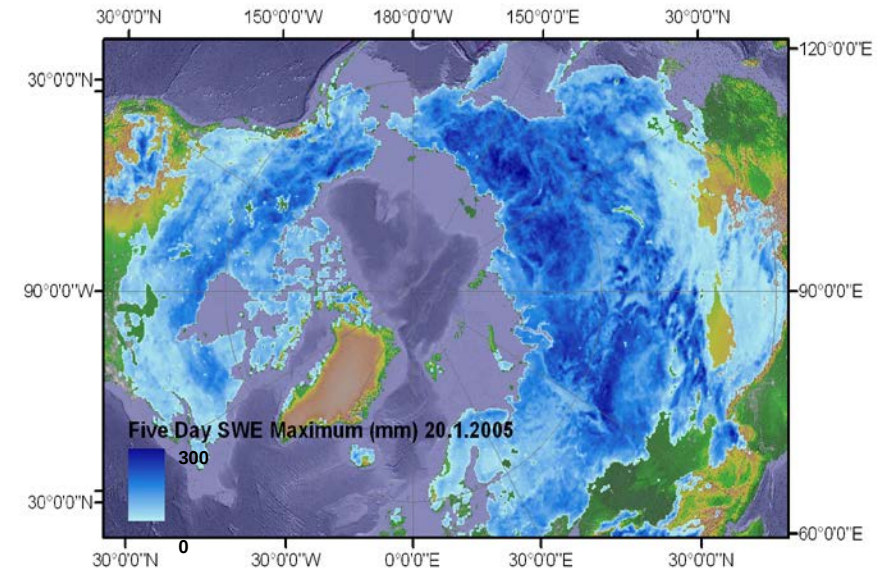
Other products include soil moisture, sea surface temperature, land surface temperature, and vegetation mass.

# Snow cover extent and characteristics

PMW essential for snow depth & snow water equivalent products (seasonal snow on land):

- only truly global technique (although poor over mountainous & forested areas); existing + planned PMW satellites provide global coverage ~daily
- Initially developed in 1980s, still routinely used for civil & military operational products (US & int'l)

- *dry snow scatters*: more SWE → more volume scattering → colder TBs (extinction of TB from underlying soil); *wet snow emits*: no longer a function of SWE, TB approaches 273K blackbody
- Freqs  $\leq 10$  GHz tend to not be sensitive enough to volume scattering for global typical SWE amounts ( $<60$ cm, or  $\sim 1.8$ m depth)
- Freqs  $> 37$  GHz saturates for SWE  $> 50$  cm, too sensitive to surface scattering (not a function of SWE), and atmospheric conditions
- Optimum freqs for most snow conditions: 18 & 37 GHz; TB difference reduces dependence on other factors such as grain size; 10 GHz can assist with deep snow; 89 GHz is used to mask out very thin snow



E.Kim 10/13/20

# Snow cover products

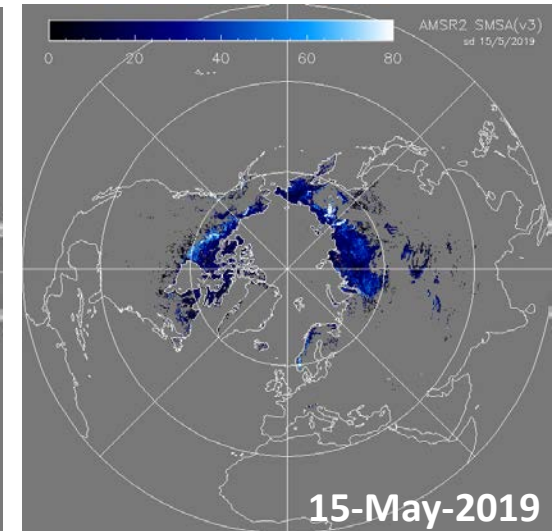
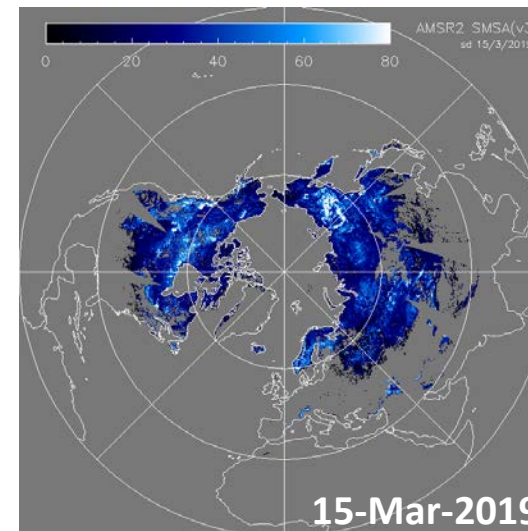
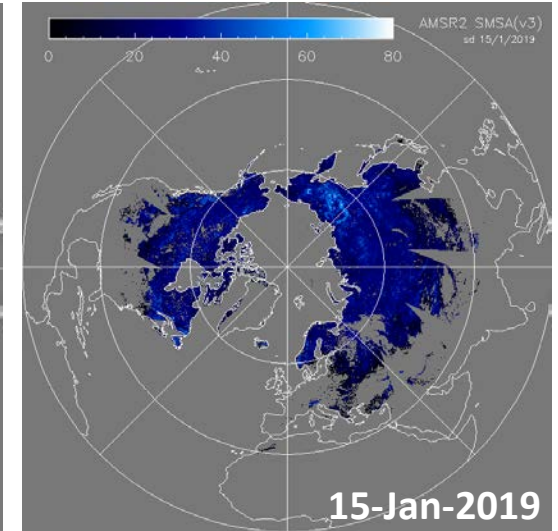
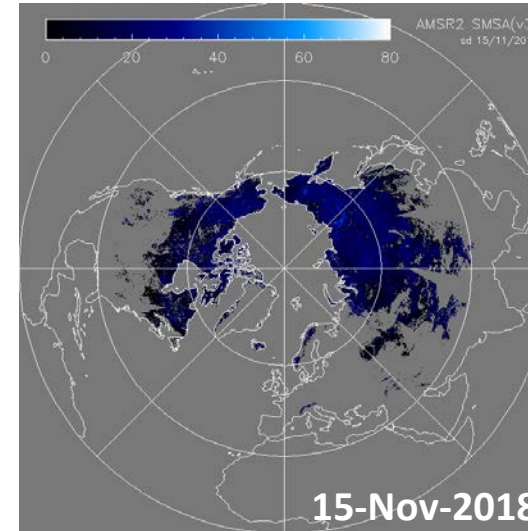
## AMSR-2 based retrievals

*Model-based sequential daily multi-channel approach – each channel responds differently to the characteristics of snow on the surface*

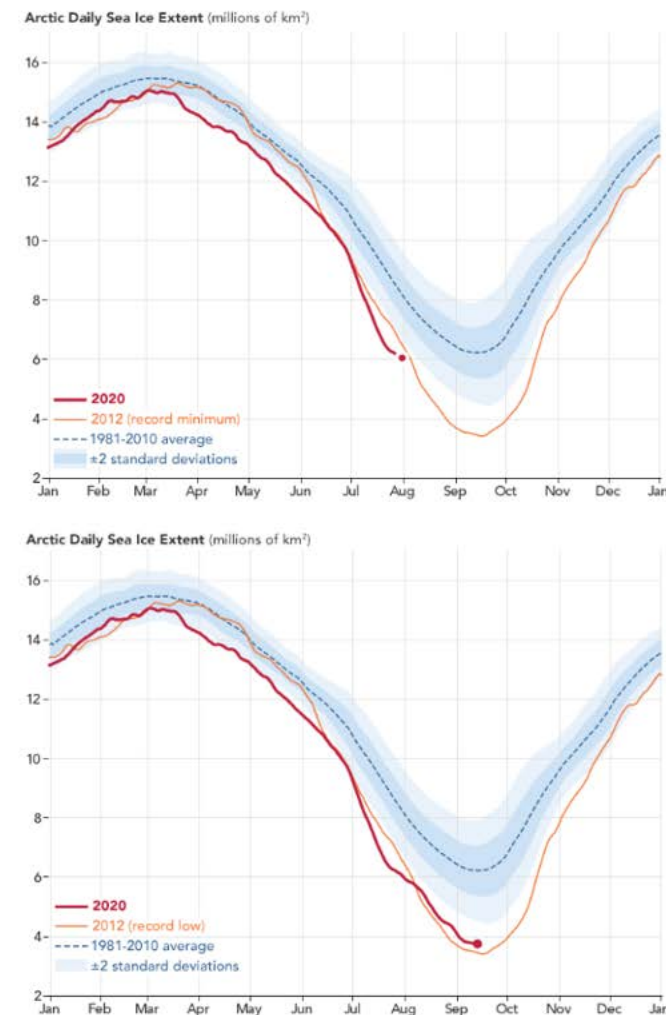
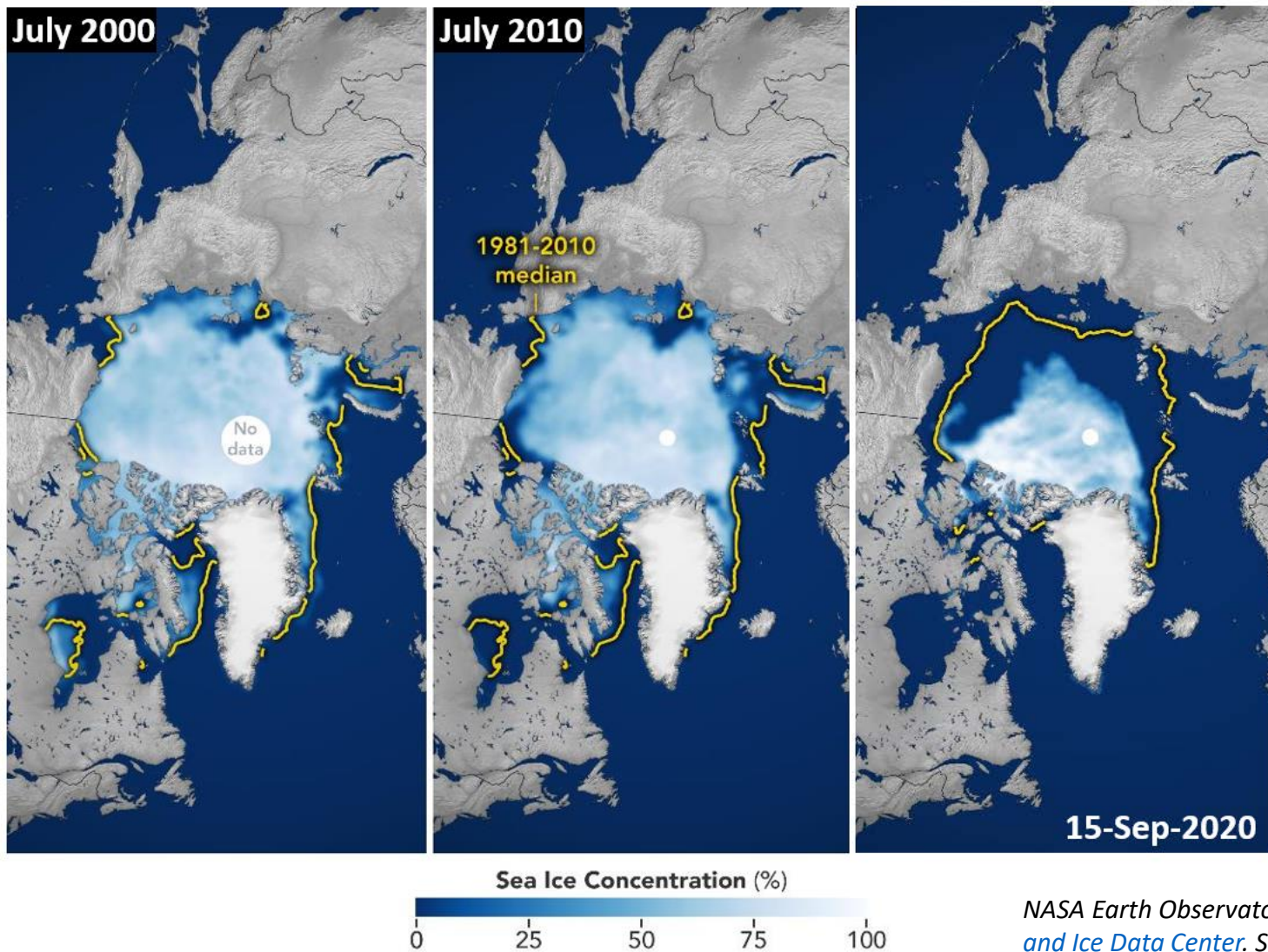
- AMSR2 Tbs (10, 18, 22, 36, 89 GHz)
- Static ancillary data
  - Land Ocean Ice Mask (MODIS LC)
  - Forest transmissivity map (Li *et al.*, 2018)
  - DEM Global – mountains (UNEP definition)
  - Water fraction (global water bodies)
- DMRT-ML (QCA-CP) radiative transfer model



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# Monitoring sea ice extent



NASA Earth Observatory images by [Joshua Stevens](#), using data from the [National Snow and Ice Data Center](#). Story by [Kathryn Hansen](#), and includes reporting by Kate Ramsayer.

<https://earthobservatory.nasa.gov/images/147306/arctic-sea-ice-reaches-second-lowest-extent>

# Precipitation retrievals

- *Why is precipitation important?* It is vital to understanding the Earth System and for societal benefits: we depend upon fresh water.
- *Why use satellites (and why not use models)?* Satellites provide global coverage (rain gauges essentially land-only), and models do not, so far, capture the subtleties of precipitation (e.g. diurnal cycle).
- *Why not use visible/infrared from geostationary?* GEO observations provide frequent and regular observations, these are of the cloud tops, not of the precipitation falling from the clouds.
- *Why use the passive microwave?* PMW observations respond more directly to the hydrometeors within the atmosphere, allowing more direct measurements of surface precipitation to be made.

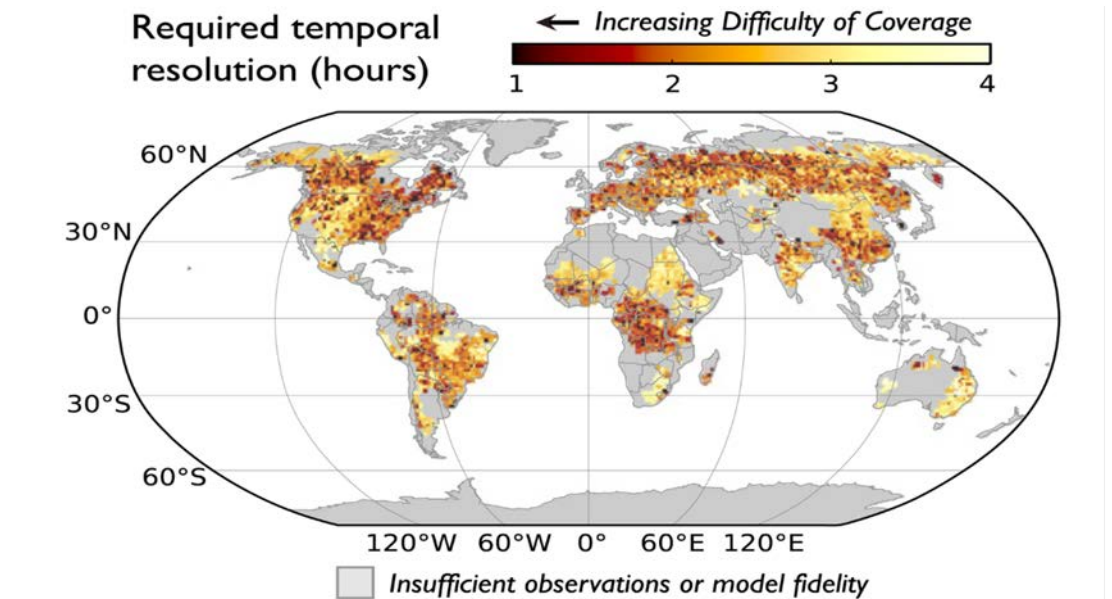
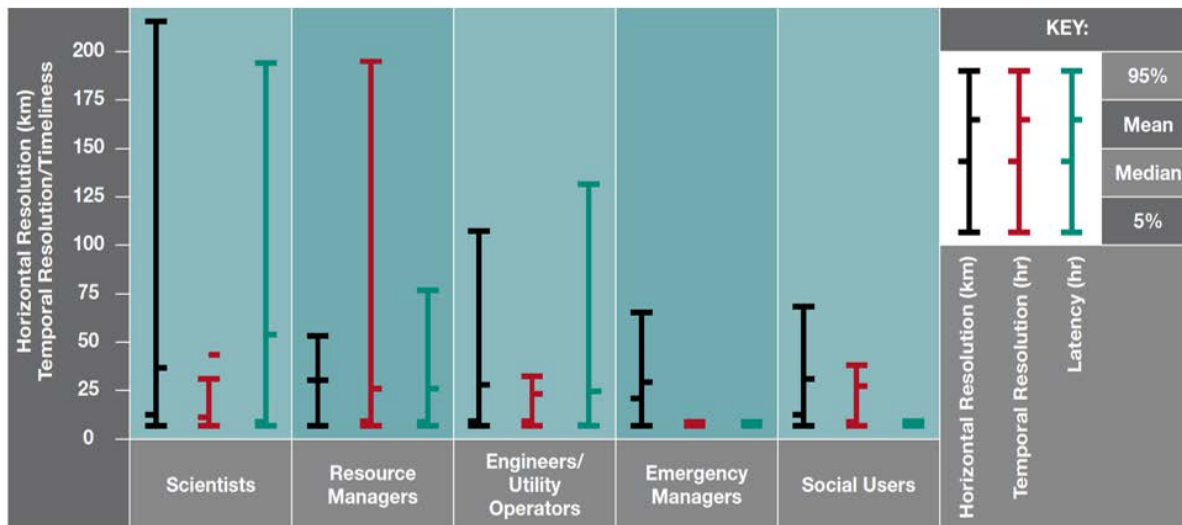
# Addressing user requirements

## GEO Task US-09-01a: *Precipitation Data Characteristics and User Types*

- Spatial resolutions from 5-cm to 1000-km (median c.0.63 to 5-km)
- Temporal resolutions from 1-min to 30-days (median c.15-min to 1-hour)
- Latency from 1-min to 60-days (median c.1-min to 30-mins)

Crucially – **large range of requirements for a large range of users** – whose requirements are not necessary the same across user domains.

User requirements (GEO 2020, Fig 2)

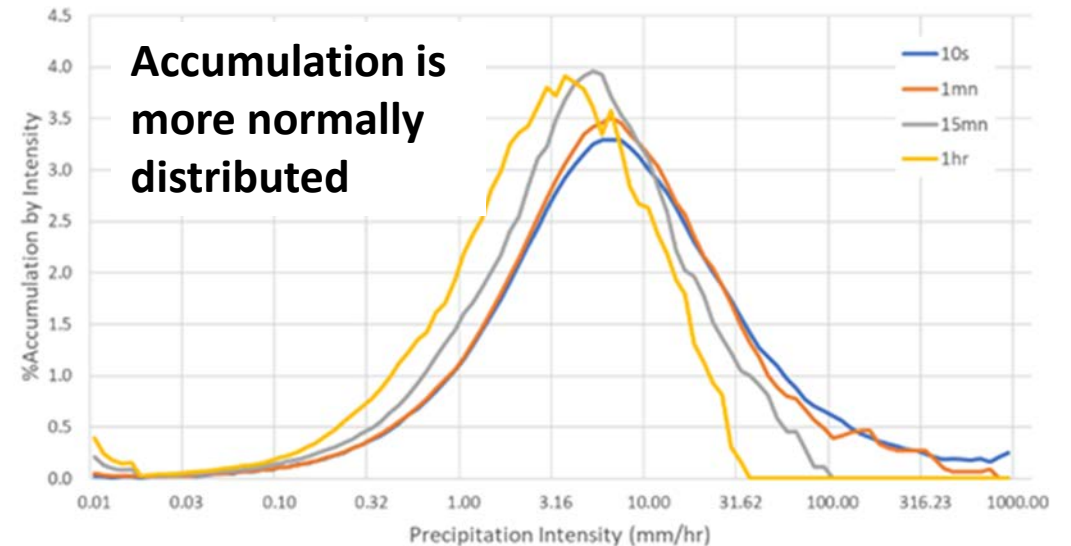
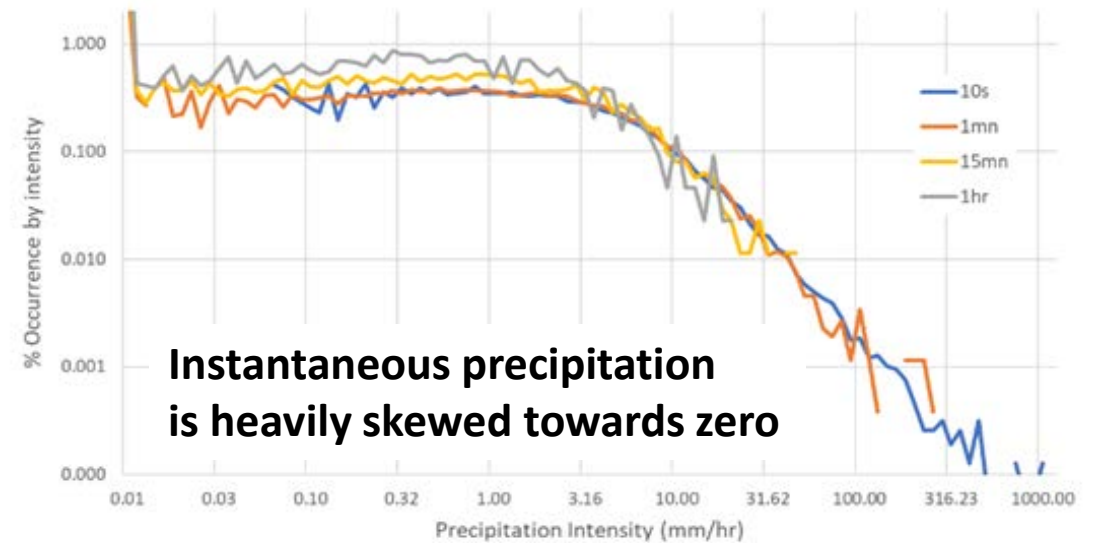
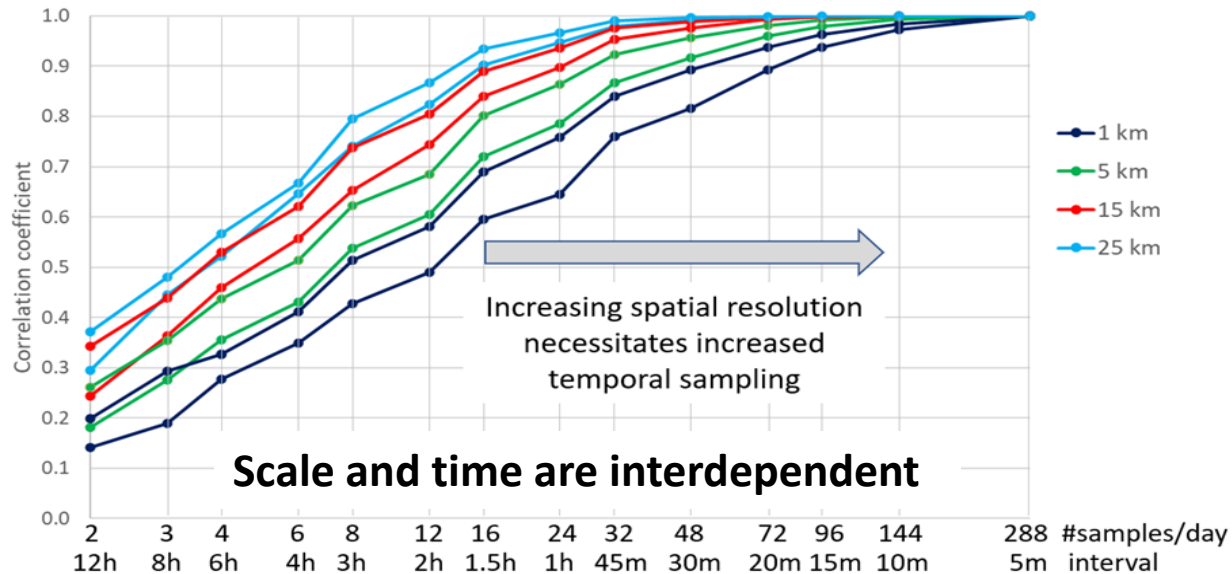


# Understanding Precipitation

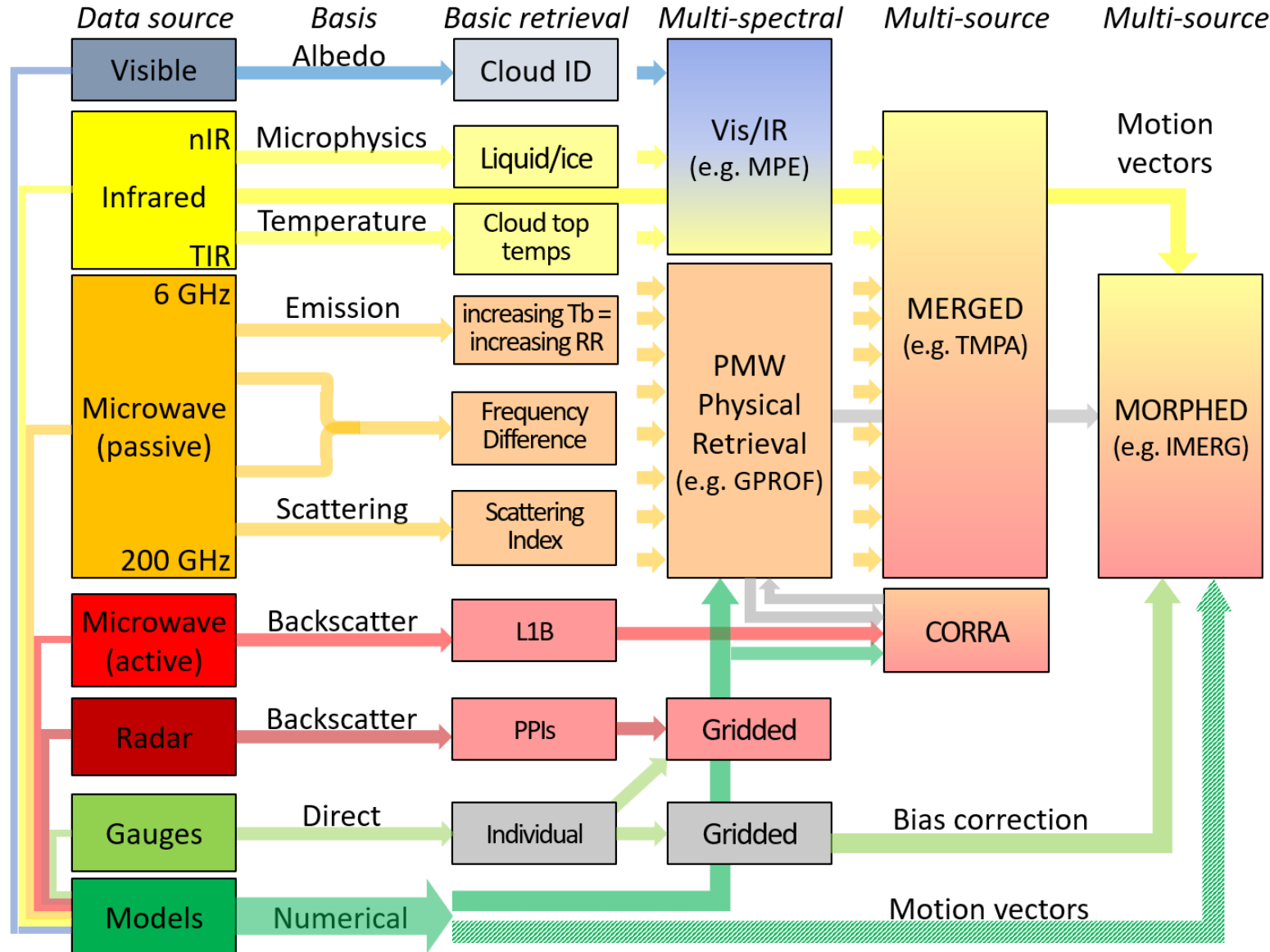
Fundamental to any type of measurement is an understanding of the properties and characteristics of what is being measured.

Precipitation – both rain and snow:

- is highly variable in time and space;
- has intensities heavily skewed towards zero;
- has characteristics that vary by location.



# Satellite precipitation estimation



Retrieval precipitation from satellite observations is complex:

Very variable over time and space – good sampling is essential;

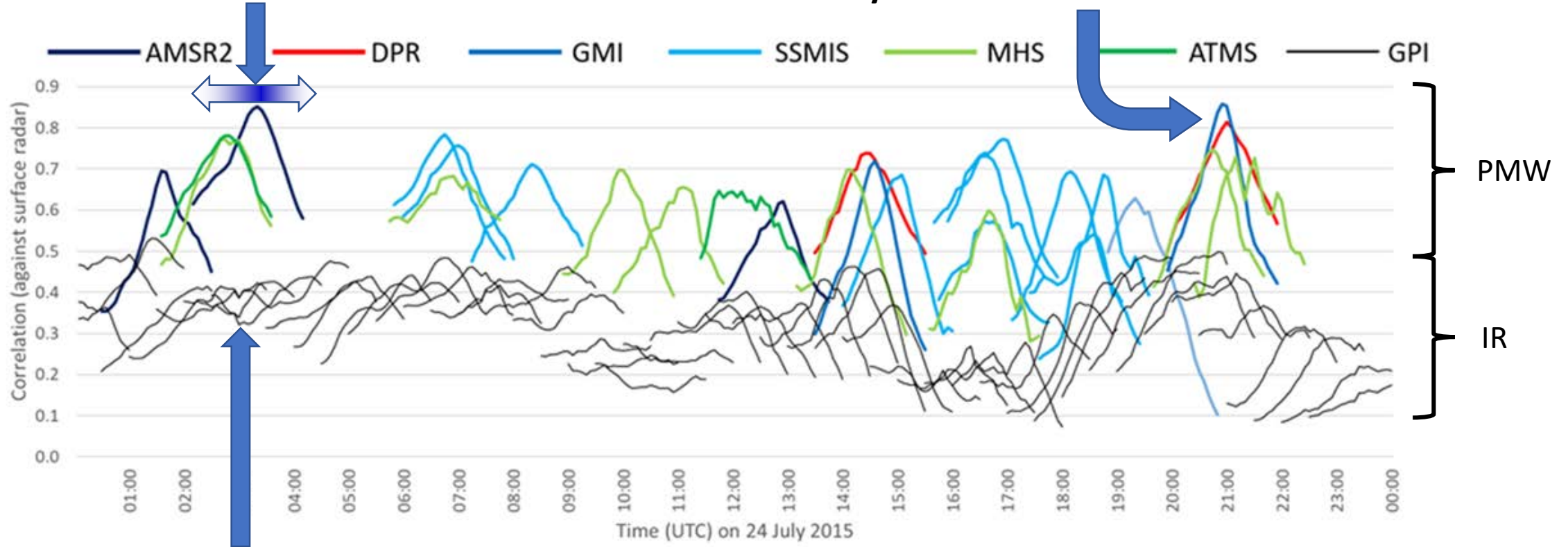
Range of precipitation properties and characteristics is large (cloud, rainfall, snowfall, hail).

**Requires a multi-spectral, multi-satellite, multi-sensor approach**

# Temporal sampling of precipitation

Satellite:surface correlations  
peak at time of observation

correlations decline markedly  
away from time of observation



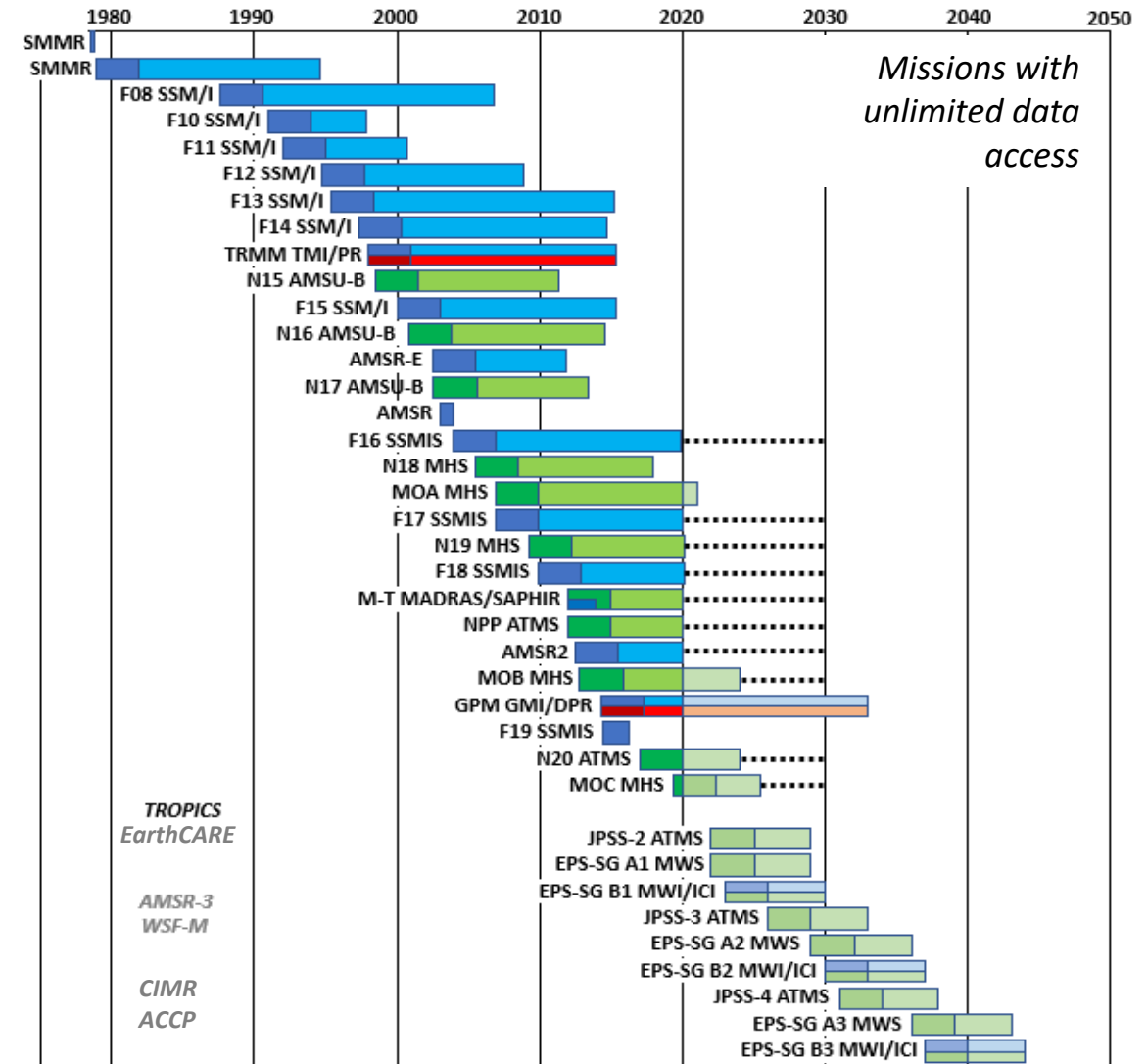
IR-only retrievals never  
match those of the PMW

Sufficient temporal sampling required to  
capture the variability of precipitation

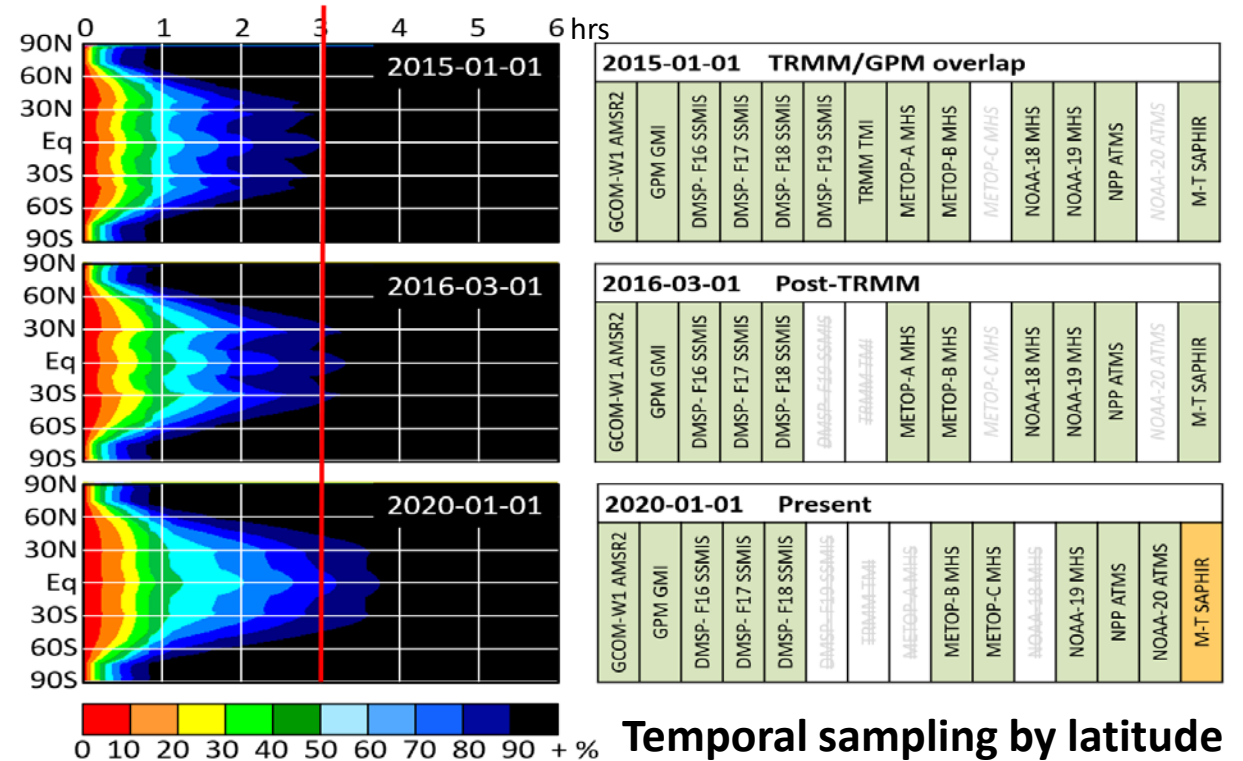
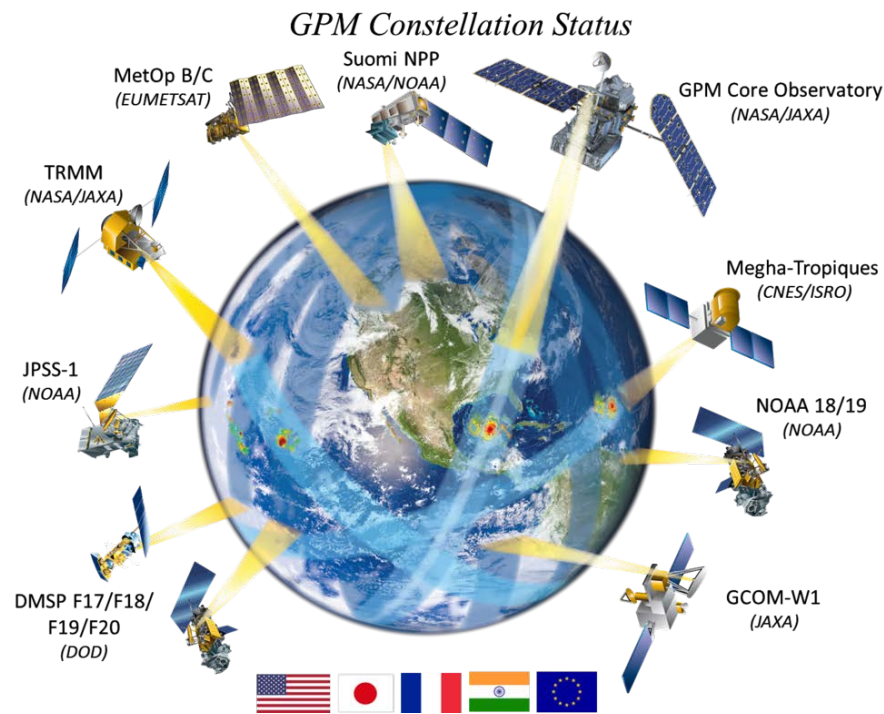
# Satellite Precipitation Heritage

- First imaging meteorological satellite – TIROS-1 (1960)
- Relatively long history of precipitation-capable missions with ESMR-5/6 (1972/5), SMMR (1978), SSMI (1987)
- Only two precipitation-specific missions, TRMM (1997-2015) and GPM (2014-)

The precipitation science community has become very adept at adopting and utilizing a range of satellite observations to provide the necessary (temporal and spatial) products to meet user requirements.



# GPM constellation: 2015-present



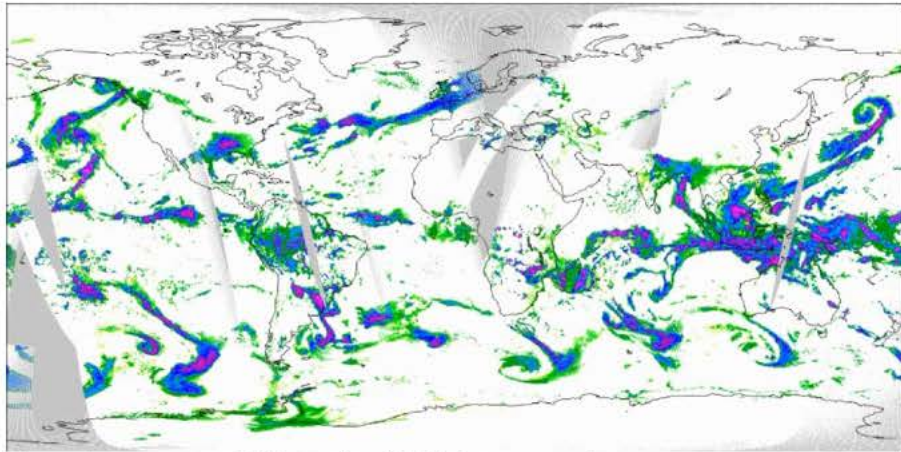
- GPM currently has about 12 precipitation-capable satellites, comprised of passive microwave imagers and sounders as well as a precipitation radar;
- Baseline sampling goal is 3-hourly 90% of the time, but has degraded over last 5 years;
- Combined with geostationary IR data allows 30-min, 10-km products to be generated.

# Measuring Global Precipitation

*Exploiting multi-satellite, multi-sensor retrievals*

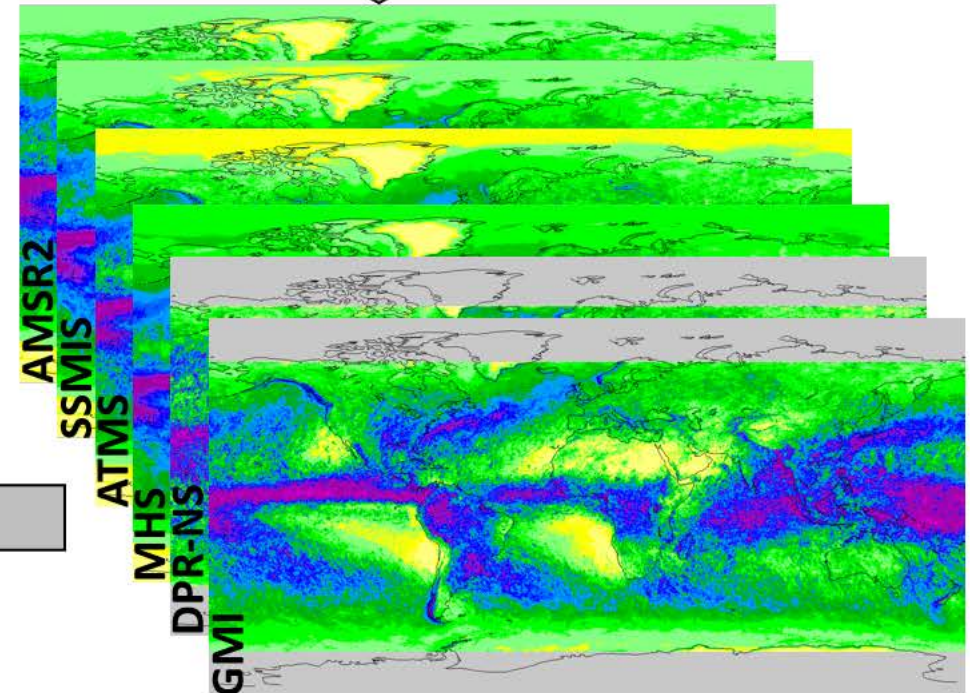


Instantaneous snapshots of precipitation



Products at 30-min/10-km or better

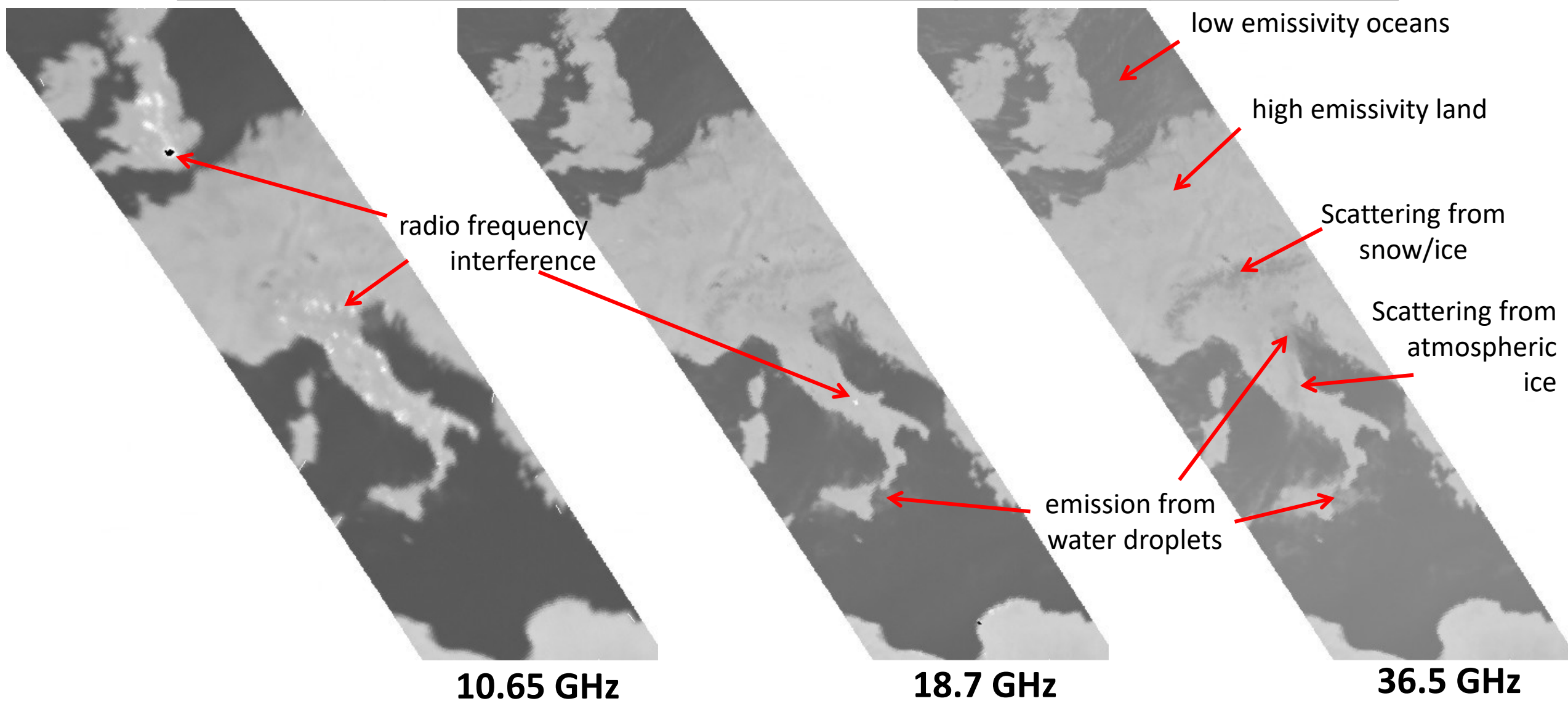
Consistent retrieval  
scheme across all sensors



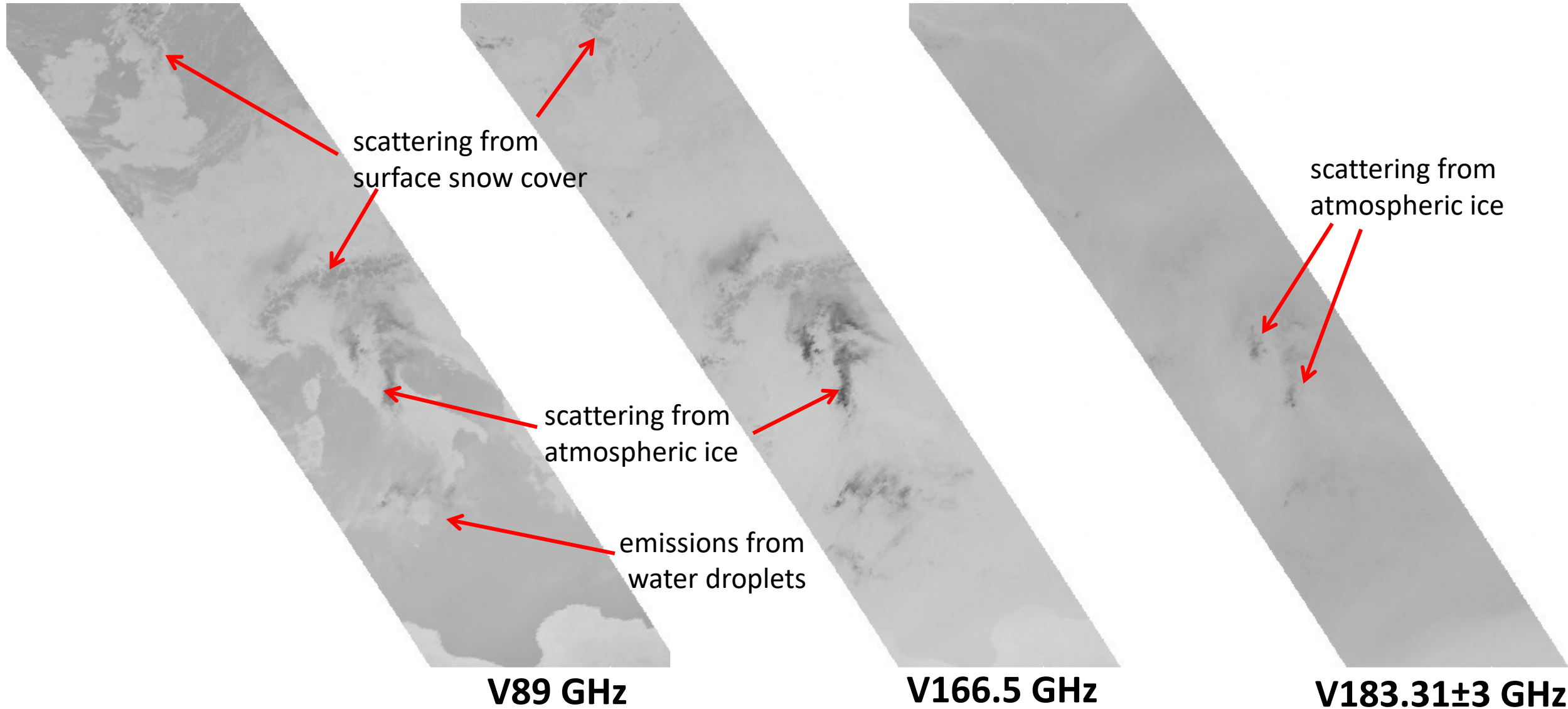
# Passive Microwave sensor characteristics

| Sensor               | SSMIS                      | AMSR2                    | TMI                      | GMI                       | MHS                        | SAPHIR                   | ATMS                       |
|----------------------|----------------------------|--------------------------|--------------------------|---------------------------|----------------------------|--------------------------|----------------------------|
| Satellite            | DMSP-F16,<br>F17, F18, F19 | GCOMW1                   | TRMM                     | GPM                       | NOAA18,19,<br>MetOp-A, B   | Megha-<br>Tropiques      | NPP                        |
| Type                 | Conical                    | Conical                  | Conical                  | Conical                   | Cross-track                | Cross-track              | Cross-track                |
| frequencies          | -                          | 6.925/7.3VH              | -                        | -                         | -                          | -                        | -                          |
|                      | -                          | 10.65VH                  | 10.65VH                  | 10.65VH                   | -                          | -                        | -                          |
|                      | 19.35VH                    | 18.70VH                  | 18.70VH                  | 18.70VH                   | -                          | -                        | -                          |
|                      | 22.235V                    | 23.80VH                  | 23.80VH                  | 23.80V                    | -                          | -                        | 23.8                       |
|                      | 37.0VH                     | 36.5VH                   | 36.5VH                   | 36.5VH                    | -                          | -                        | 31.4                       |
|                      | 50.3-63.3VH                | -                        | -                        | -                         | -                          | -                        | 50-3-57.3                  |
|                      | 91.65VH                    | 89.0VH                   | 89.0VH                   | 89.0VH                    | 89V                        | -                        | 87-91                      |
|                      | 150H                       | -                        | -                        | 165.6VH                   | 157V                       | -                        | 164-167                    |
|                      | 183.31H                    | -                        | -                        | 183.31V(2)                | 183.31H (2)                | 183.31H(6)               | 183.31(5)                  |
|                      | -                          | -                        | -                        | -                         | 190.31V                    | -                        | -                          |
| Sampling resolution  | 12.79 km XT<br>12.59 km AT | 4.65 km XT<br>4.28 km AT | 4.74 km XT<br>13.10km AT | 5.13 km XT<br>13.19 km AT | 16.87 km XT<br>17.62 km AT | 6.73 km XT<br>9.86 km AT | 16.06 km XT<br>17.74 km AT |
| Retrieval resolution | 50 x 40 km                 | 19x11 km                 | 26 x 21 km               | 16 x 10 km                | 15.88 x 15.88 km           | 10 x 10 km               | 16 x 16 km                 |

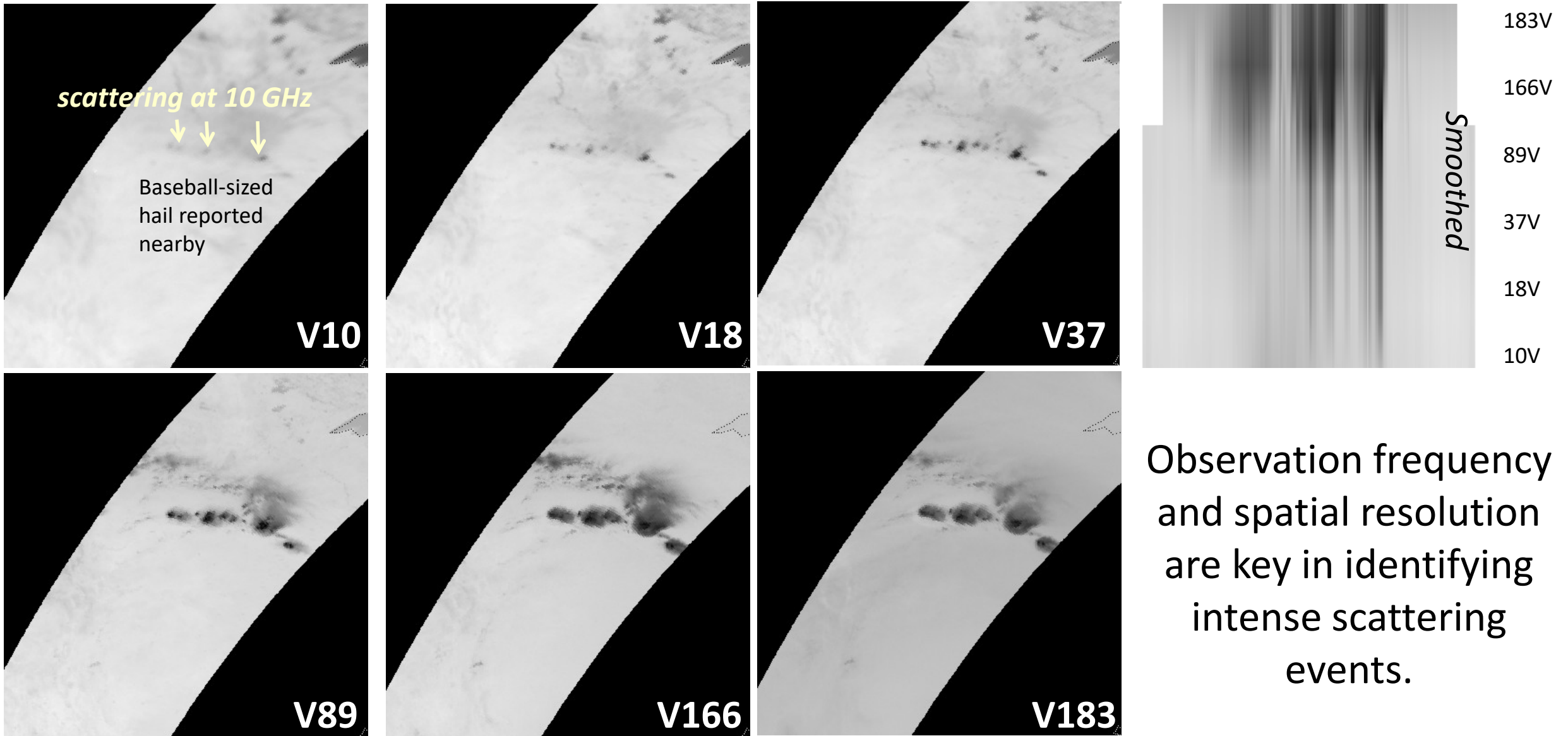
# Low frequency GMI channels – generally emission



# High frequency GMI channels – generally scattering



# Low frequency scattering – GMI 20140603-S205848 Nebraska



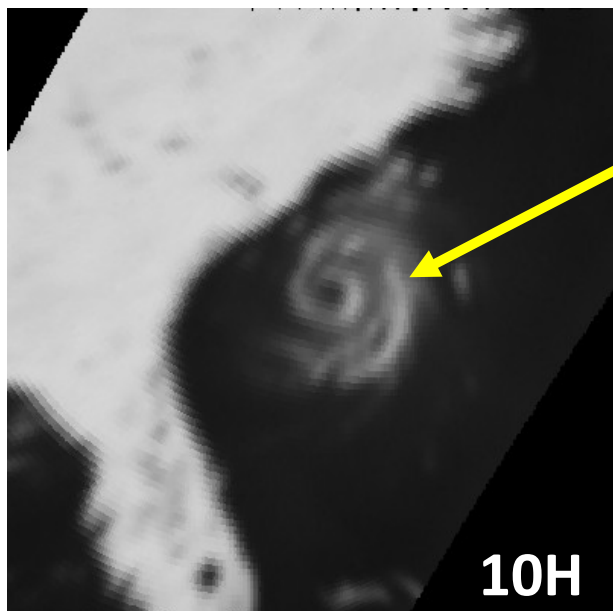
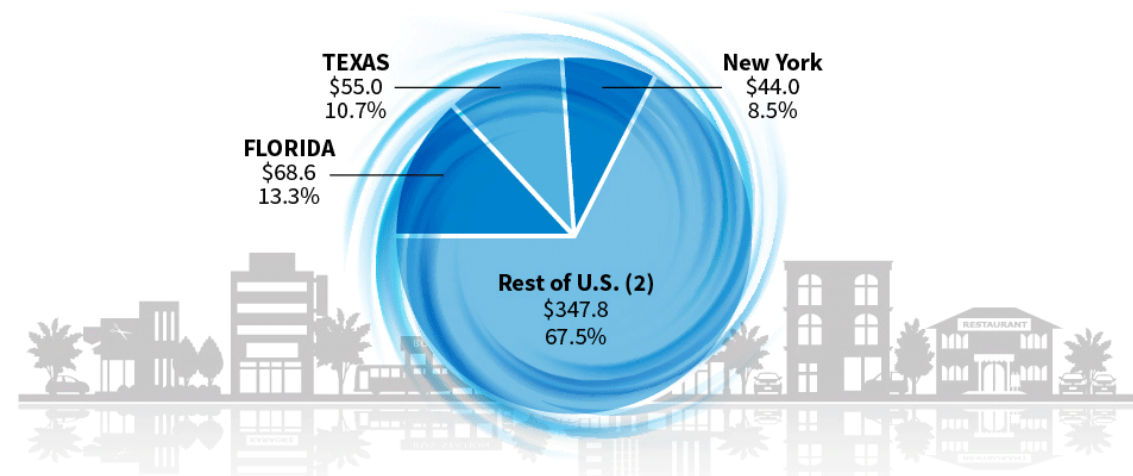


# HURRICANES: Catastrophic Losses

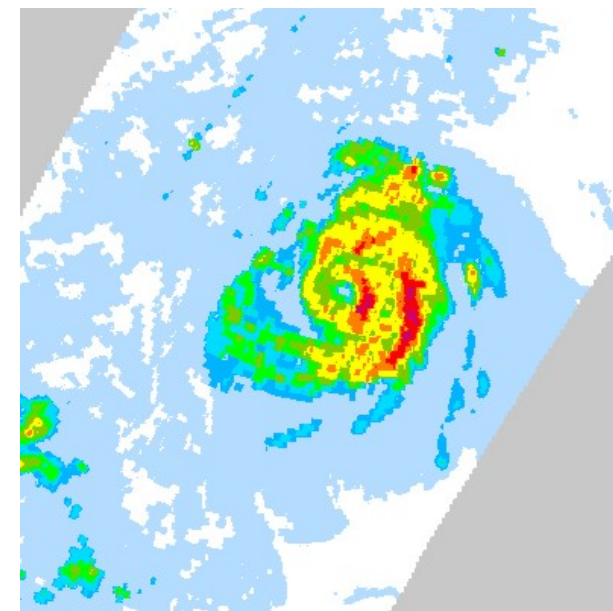
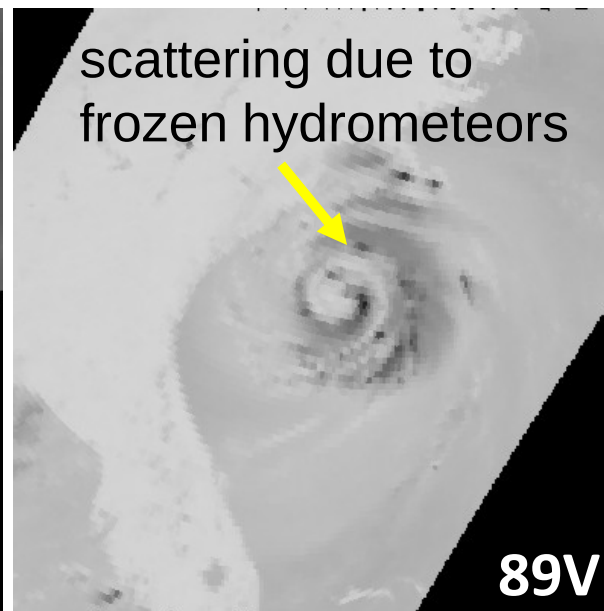
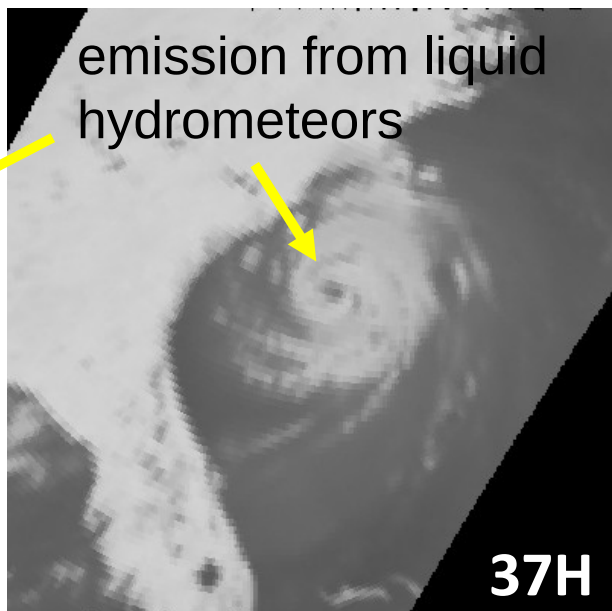
Insured Losses, 1986-2015, Adjusted for Inflation

**Total** \$515.4 billion

Source: Insurance Institute

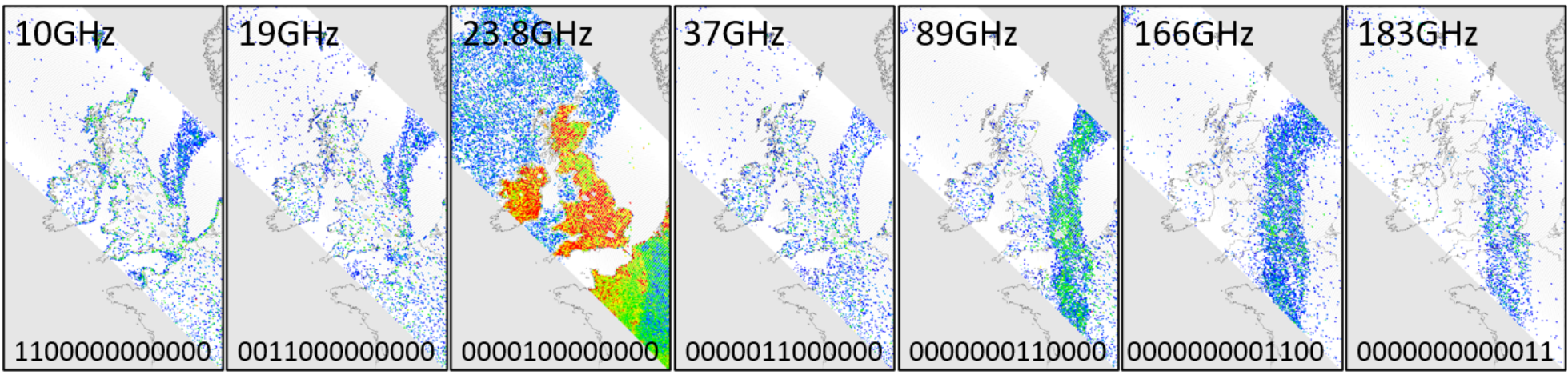


GMI 3 July 2014 at 11:38Z

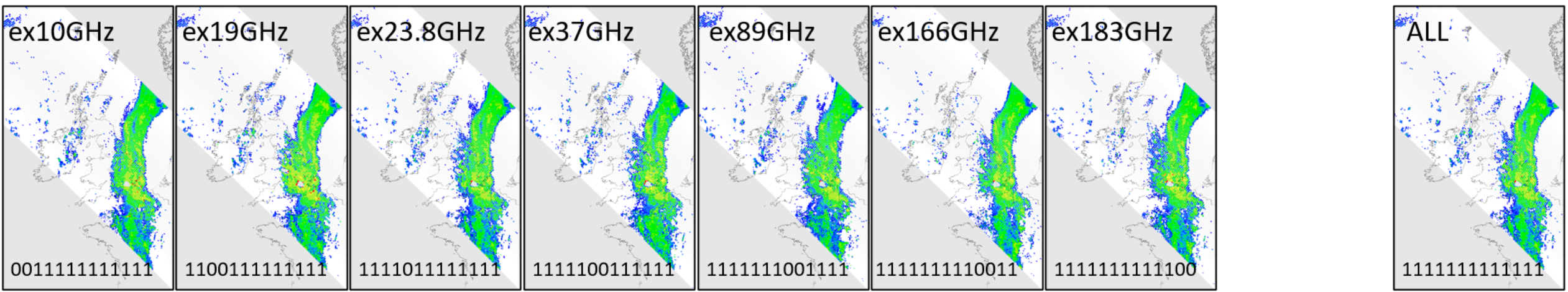
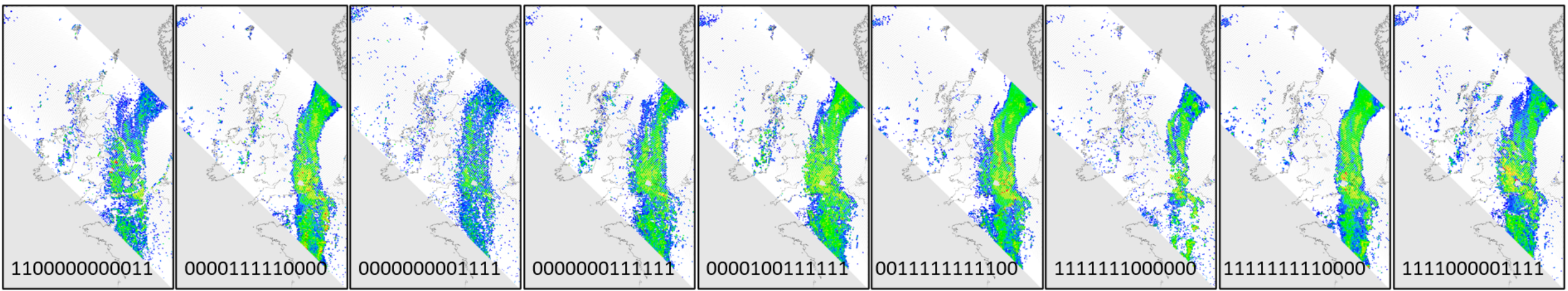


GPROF2014 retrieval

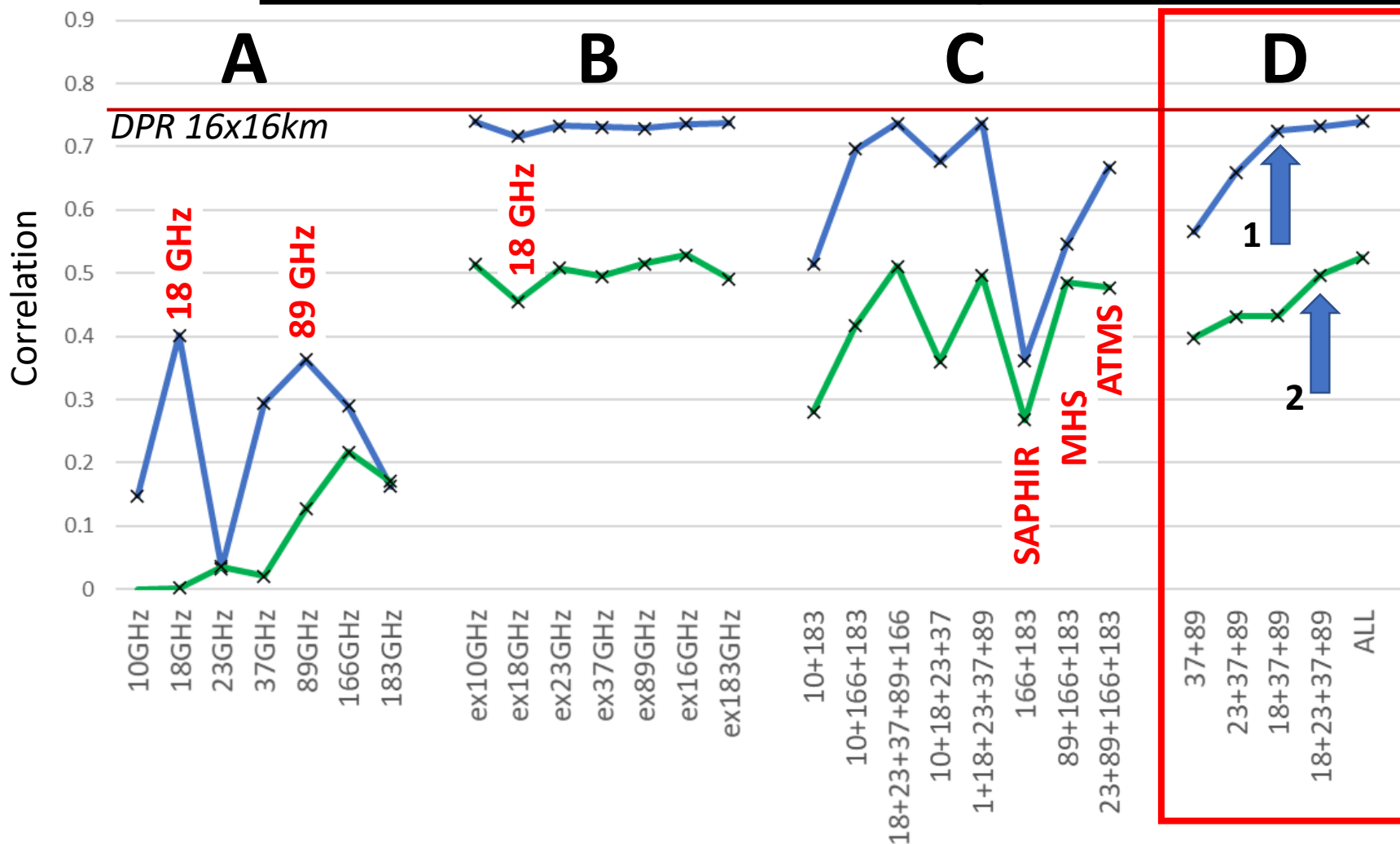
## Hurricane Arthur Category 2 storm



**Which channels?**  
 channel selection/  
 denial experiment  
 for precipitation  
 retrievals from GMI



# Channel combination performance: Correlation



- Channel combinations of GMI observations
- GMI:DPR database
- Closest observation: database entry
- Validation against UK radar network

<sup>1</sup>Over ocean the 18+37+89 combination is nearly as good as all channels (10-183 GHz)

<sup>2</sup>Over land the addition of the 23 GHz channel improves the 18+37+89 combination.

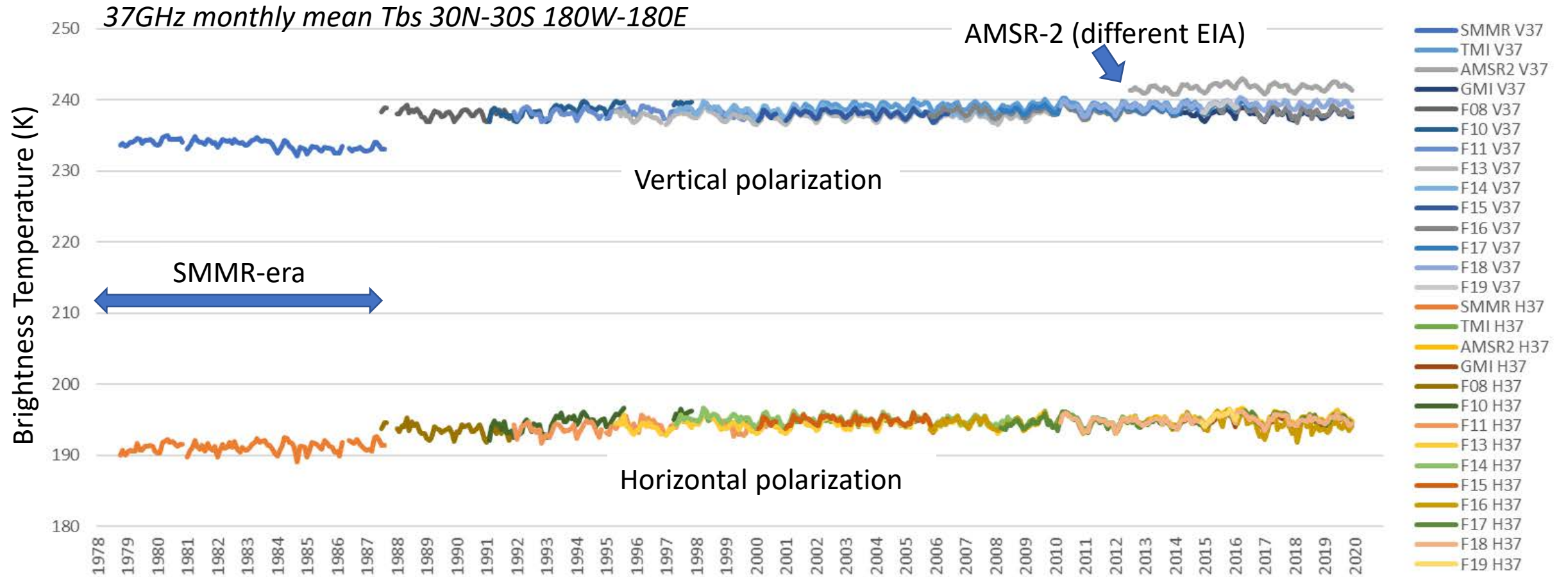
# Brightness Temperature Data Records

Satellite data records for the passive microwave now span over 40 years. Satellite observations are now:

- delivered in very near real time (e.g. GPM, within 30 minutes of observation), for near real time retrieval of geophysical parameters for applications including emergency planning;
- processed for high-quality research-grade data for long-term 'climate-scale' retrievals for monitoring and assessing changes in the Earth System;
- provide an accuracy to within a few  $1/_{10}$ 's K – necessary to meet the exacting requirements of climate-scale applications and studies.

Long term stability is crucial

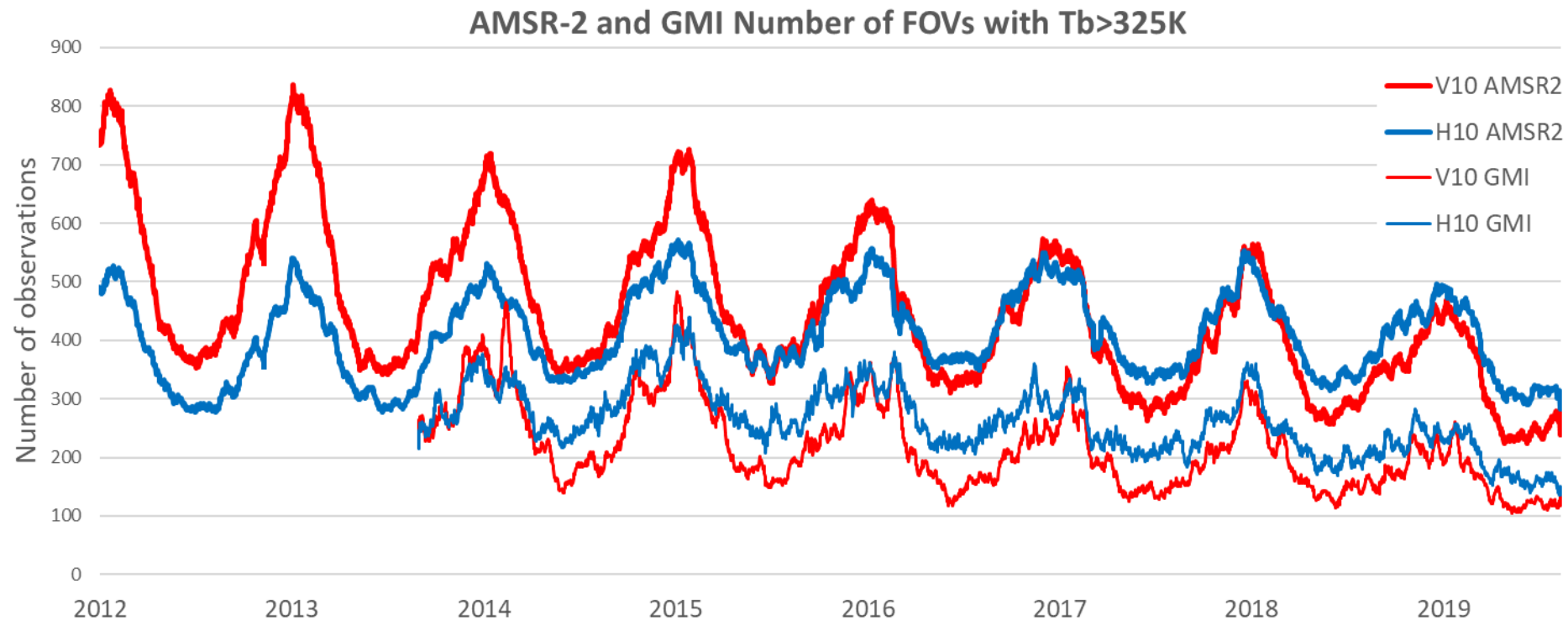
# Brightness Temperature Climate Data Records



Long term records very good: differences arise from orbits drifting across time of day, differences in Earth Incidence Angles (EIA) and slight differences in frequencies. (*SMMR did not have any robust calibration*).

# Passive Microwave Radio Frequency Interference

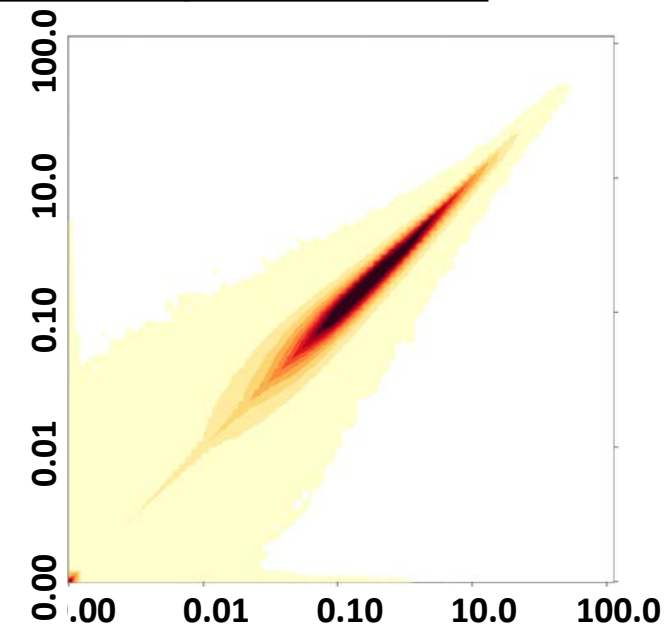
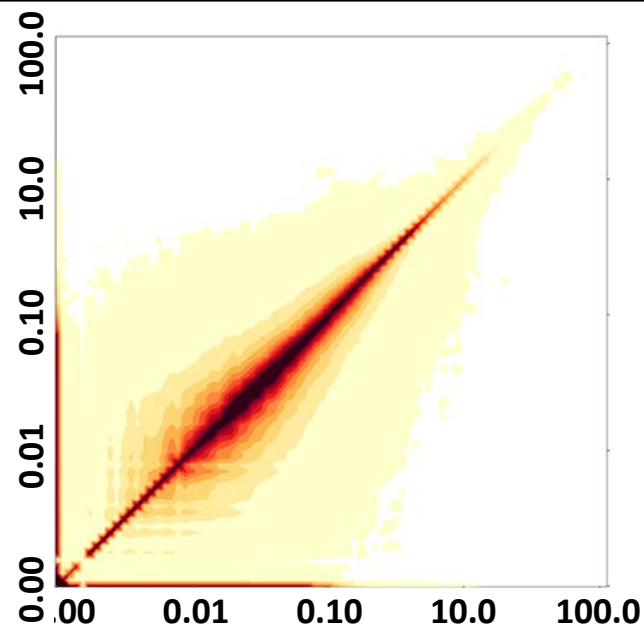
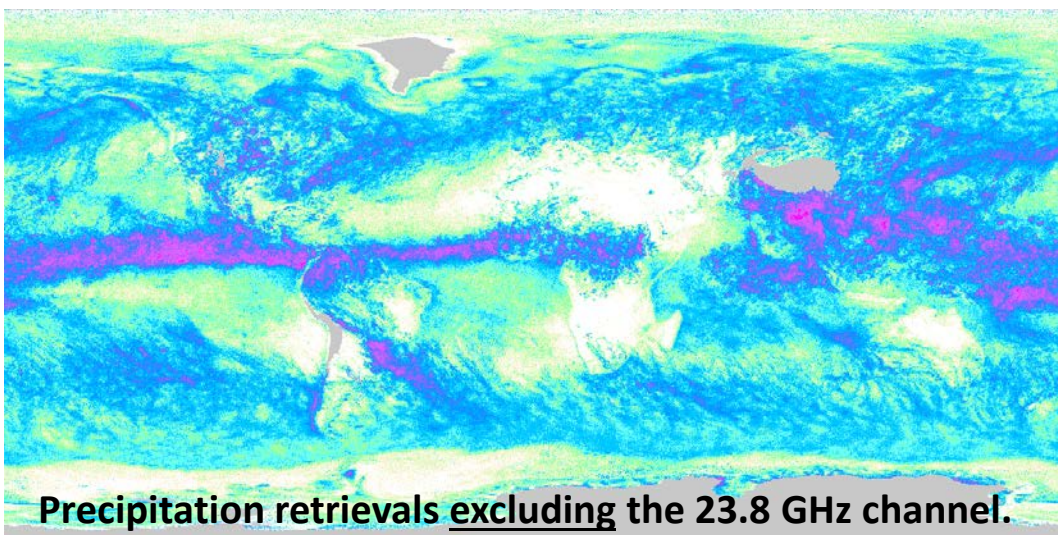
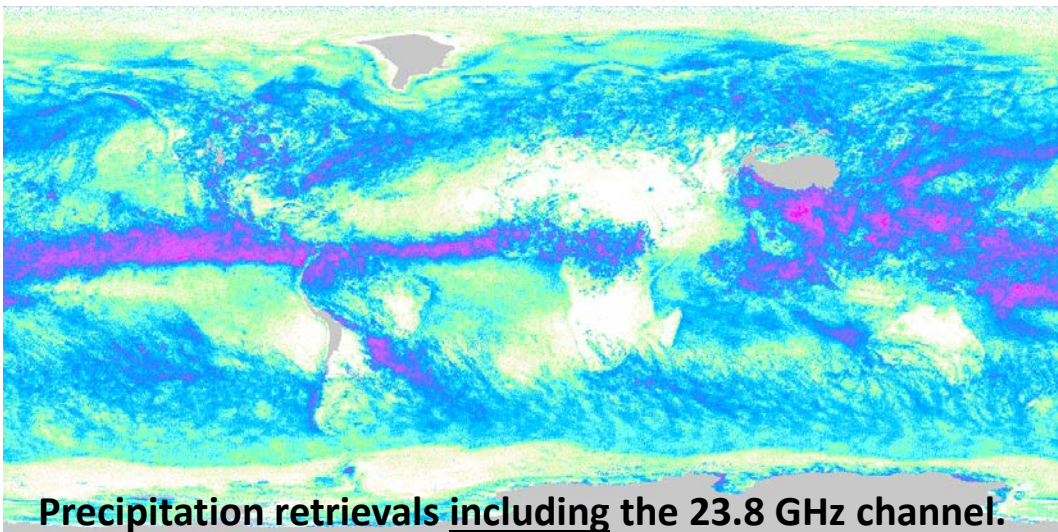
RFI has been a problem at the lower frequency channels of 6.9 and 10.65 GHz and is an increasing problem at 18.7 GHz: some are improving, some not. Both AMSR-2 and GMI are observing fewer  $T_b > 325K$  on a global scale.



Addressing interference is crucial when dealing with climate-scale records.

# Contributions by the 23.8 GHz channel to precipitation

NOAA NPP ATMS sensor July 2015



Instantaneous precipitation retrievals with/without the 23.8 GHz channel. (NOAA NPP ATMS, July 2015).

Monthly precipitation totals with/without the 23.8 GHz channel. (NOAA NPP ATMS, July 2015).

**Differences are often subtle: excluding the 23.8 GHz on ATMS (for example) would be equivalent to an increase in noise resulting from a loss of about 37.5% of the number of observations. In the context of the GPM constellation, this would equate to a loss of more than 4 (out of 11) satellites.**

# Conclusions

Many geophysical variables can be retrieved from PMW observations:

- Sea ice extent, concentration and age; surface snow extent and type;
- Sea surface temperature, wind speed and direction;
- Precipitation, liquid water, clouds, water vapour;
- Soil moisture, vegetation, surface temperature.

Crucially,

- Retrieval schemes utilise all available channels – but rely heavily upon the ‘core’ mid-range frequencies;
- Multi-frequency observations are needed to provide robust retrievals;
- For climate-scale records accuracy is paramount, both in the original brightness temperature climate data record and in the retrieved products.