



## GPM Product Evaluations, Algorithms, and Processes: GV in the Post-Launch and Extended Mission



Walt Petersen, Earth Science Branch, ST-11, NASA-MSFC



Todd Berendes, Brenda Dolan, Patrick Gatlin, Pierre Kirstetter, Lynn McMurdie, Dmitri Moisseev, Robert Morris, Leo Pio D'Aderrio, Silvia Puca and HSAF GV, Merhala Thurai, Ali Tokay, Annakaisa von Lerber, Jianxin Wang, David Wolff, Joe Zagrodnik.....and the remainder of the **GV Team!**

- Requirements and reference comparisons
- DSD consistency
- Snow water equivalent
- Orographic Precipitation
- IMERG



## Leaving off from 2016/17.....

# GPM “Core” Satellite Science Requirements

### (Termed “Level -1” or “L1”)

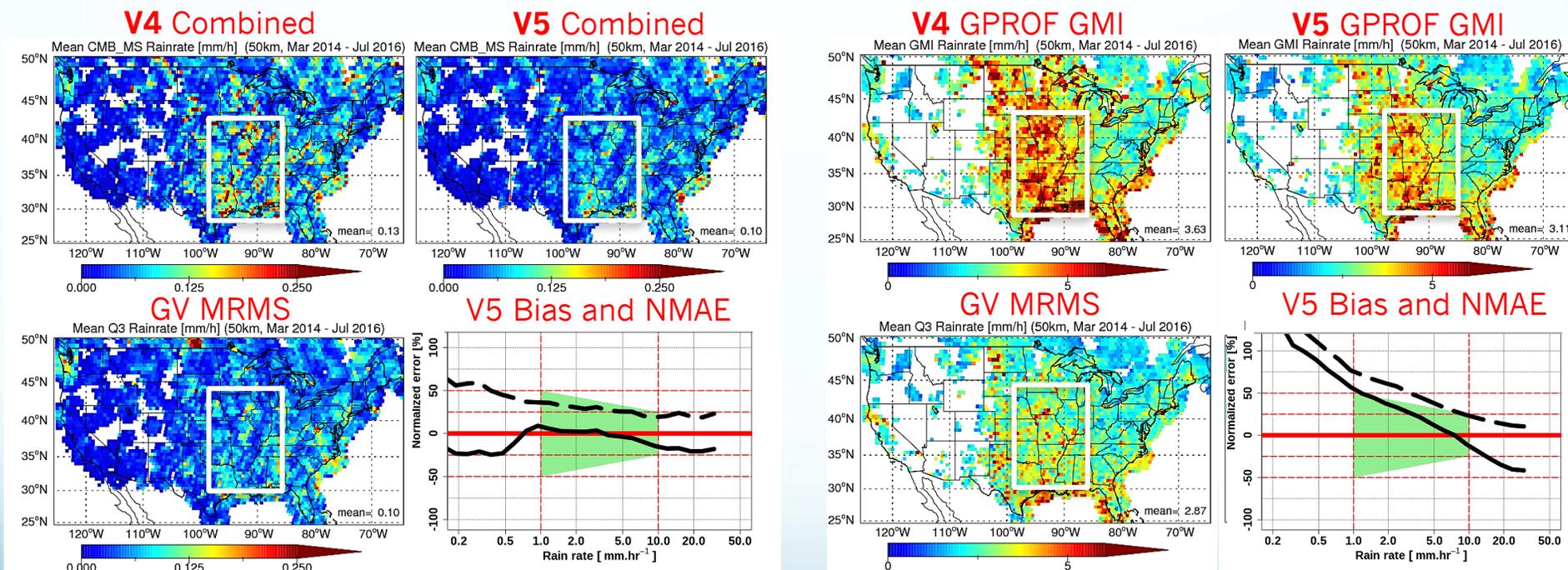
- DPR: *quantify rain rates between 0.22 and 110 mm hr<sup>-1</sup> and demonstrate the detection of snowfall at an effective resolution of 5 km.*
- GMI: *quantify rain rates between 0.22 and 60 mm hr<sup>-1</sup> and demonstrate the detection of snowfall at an effective resolution of 15 km.*
- Core observatory radar estimation of the Drop Size Distribution (DSD)- specifically, *D<sub>m</sub> to within +/- 0.5 mm.* [note- no N<sub>w</sub> requirement]
- Core observatory *instantaneous* rain rate estimates at a resolution of 50 km with *bias and random error < 50% at 1 mm hr<sup>-1</sup> and < 25% at 10 mm hr<sup>-1</sup>, relative to GV*



# Rain: General Behavior for L1 (50 x 50 km)



CONUS Mar 14 – July 16: GV MRMS vs. Combined MS, and GMI GPROF **V4 and V5**  
(Liquid only, RQI > 0.9; GMI-GPROF- Conditioned on 0.2 mm/hr threshold at FOV)



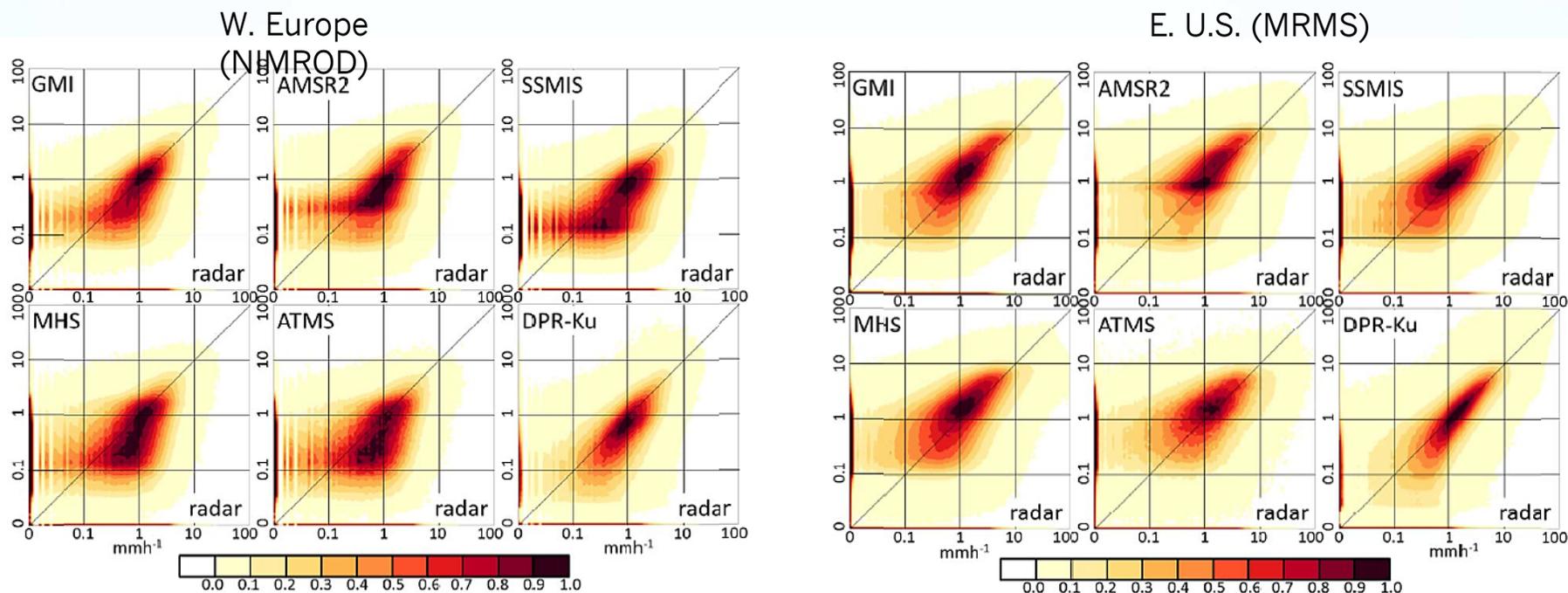
- Marked improvement in Combined Algorithm from V4 to V5; L1 Requirement is met!
- V5 Radar-based products (both DPR and CMB) in good agreement with MRMS; GPROF V5 in "MCS alley" still a little high, but *bias* and *RE* not necessarily uniform by region or rain rate.



## What about differing regimes? E. U.S. to W. Europe



Carefully-selected gauge-corrected radar (NIMROD, MRMS) estimates at 15 km scale



Need to continue to expand larger scale "reference" comparisons in other regions of the globe

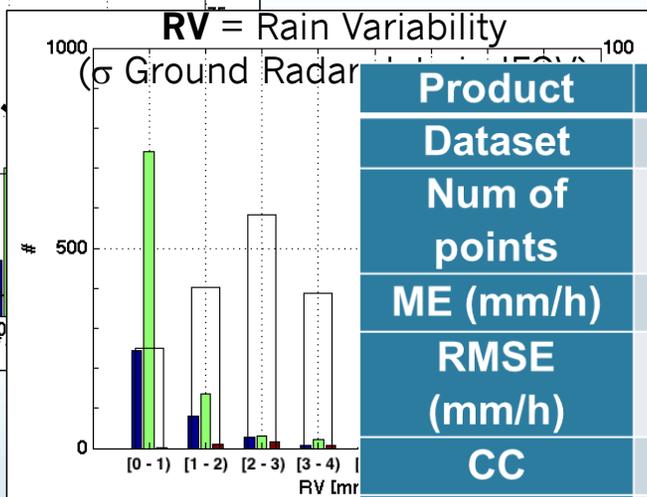
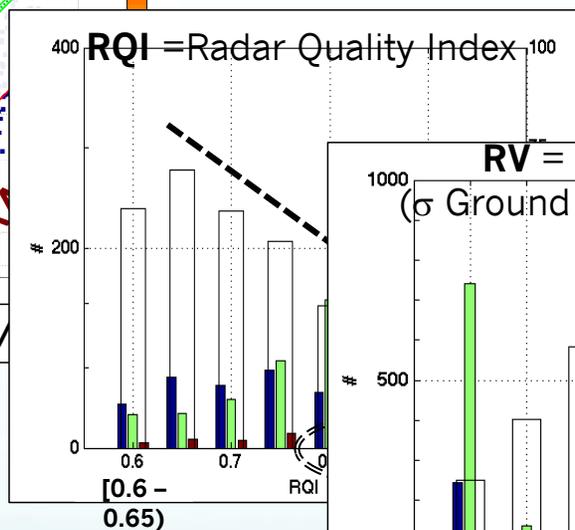
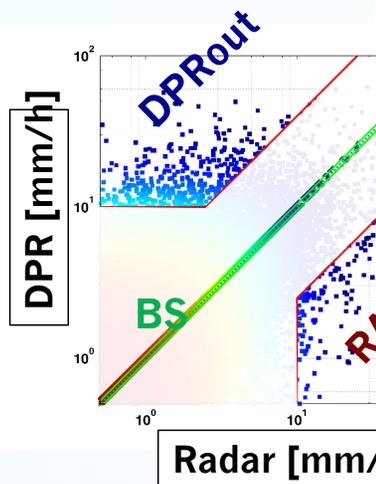
Kidd et al., 2017, QJRMMS



# HSAF/Italy: DPR NS Comparisons and Sensitivity to GV data Conditioning

Quality-controlled Italy Radar-Gauge Network Data (HSAF 1x1 km grid every 10 minutes)

We need more diverse regional/global GV-satellite data comparisons- but the comparisons *must* consider quality metric(s) of GV data.....



**Filter on RQI >0.8,  
RV < 5 (mm/hR)**

"Whole" dataset

How do outliers/error change with RQI?

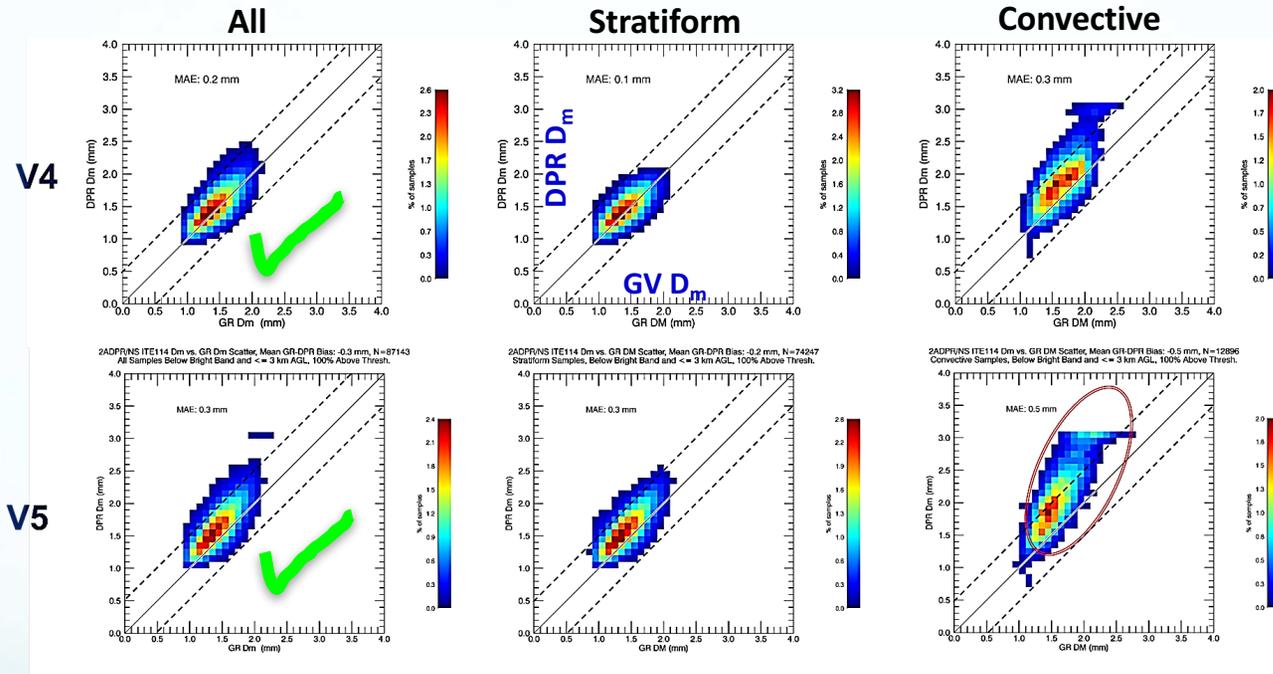
How do outliers/error change with  $\sigma$ ?

Product	DPR NS		
Dataset	Whole	Filtered	$\Delta\%$
Num of points	19,597	13,468	-31%
ME (mm/h)	0.32	<b>0.16</b>	-50%
RMSE (mm/h)	4.50	<b>2.89</b>	-36%
CC	0.41	<b>0.52</b>	+27%
FSE (%)	159	<b>111</b>	-30%
POD (%)	93	<b>93</b>	0%
FAR (%)	6	<b>1</b>	-83%



# L1 Requirement DSD: Continental Scale VN-GPM Comparisons

DPR MS **V4, V5**  $D_m$  vs. **GV Radar**  $D_m$



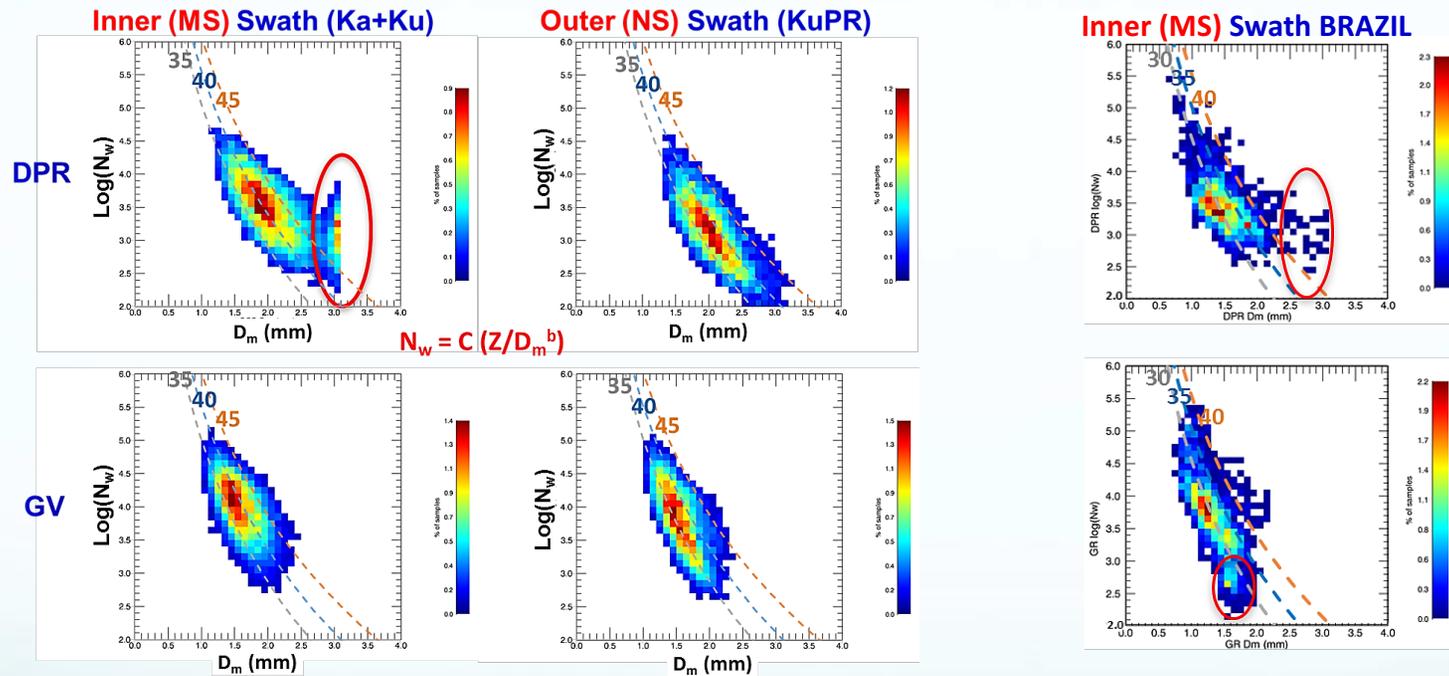
**Science requirement: V4 and V5 meet requirement (but more positive bias in V5)**

• **Core observatory radar estimation of the Drop Size Distribution (DSD)- specifically,**

- In stratiform precipitation, V5 DPR is about  $\sim 0.2$  mm higher than GV ( =  $\sim 0.2$  dB cold bias in ZDR), but.....  
 *$D_m$  to within  $\pm 0.5$  mm*
- **2ADPR Convective  $D_m$  bias in V5 increases non-uniformly, secondary mode in convective  $D_m$  at 3 mm(?)**



## Closer look at V5 DPR MS: Convective $N_w$ vs. $D_m$ against GV



Smaller sample number but similar behavior in Brazil S-band radars

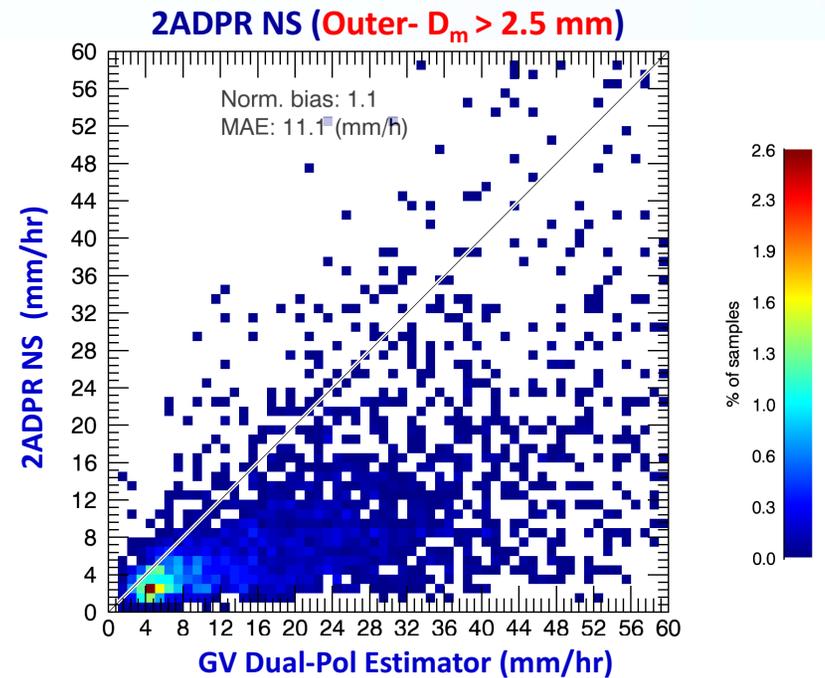
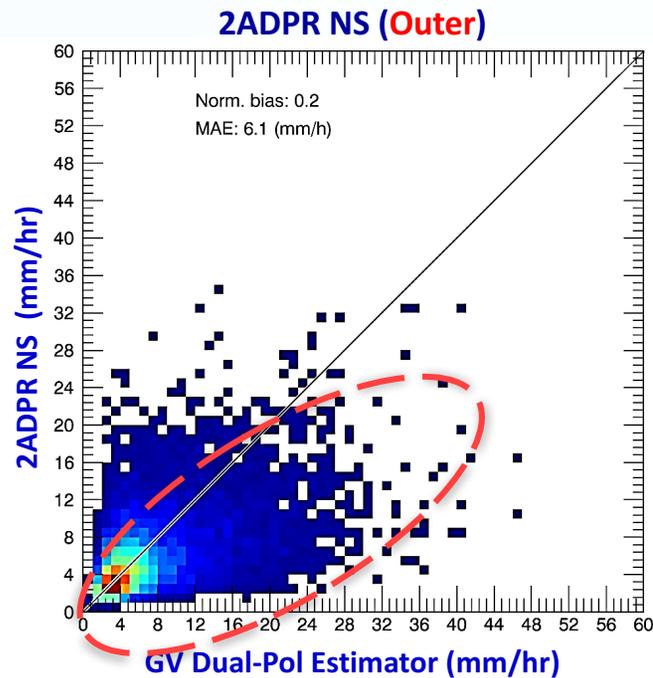
- DPR  $D_m$  bias = lower  $N_w$  vs GV, but variability along Z-isopleths is similar to GV (radar and 2DVD)



# Impacts of Increasingly Positive $D_m$ Bias in Convective Rain



Marked low bias against GV rain rates when DPR-Identified large drop regimes occur



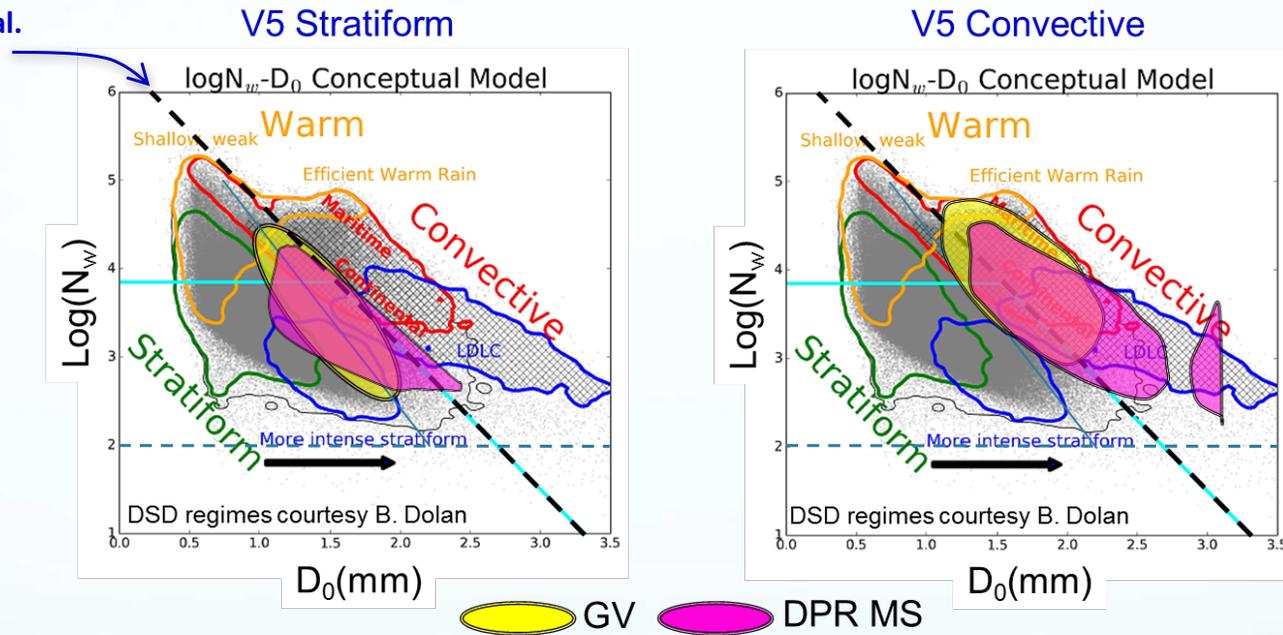
Only 10-20% of total sample, impacts one arm of the much larger DPR-GV comparison scatter.....but there nonetheless



# DPR MS and GV in Disdrometer Space $D_m$ and $N_w$



C/S Separation line  
(e.g., Thompson et al. 2015, Thurai et al., 2015, Bringi et al., 2009)



- V5 MS fits GV sample space (Assuming  $D_m \approx D_0$ ) physical behavior qualitatively.....though, overlap between C/S exists.....sensitivity to how C/S is partitioned

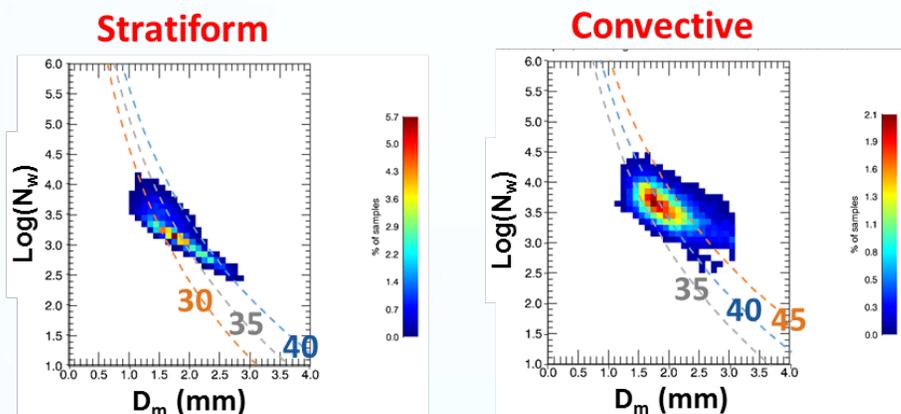
Also see Dolan et al., 2017, JAS (submitted)



## Combined Algorithm: MS Swath with GV (DSD, Rain, Z...)

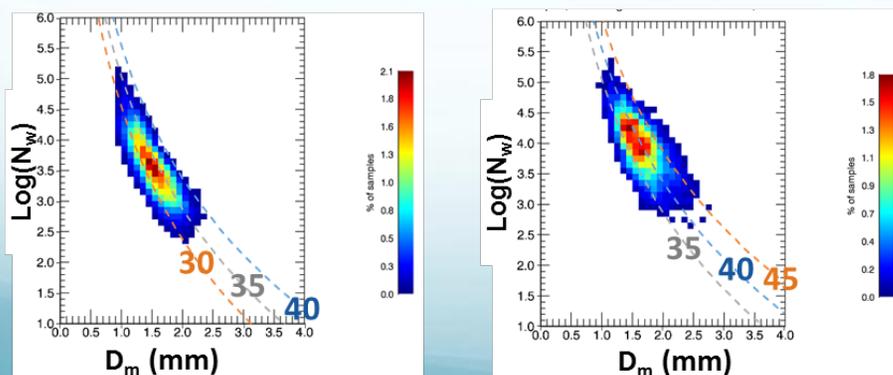


CMB

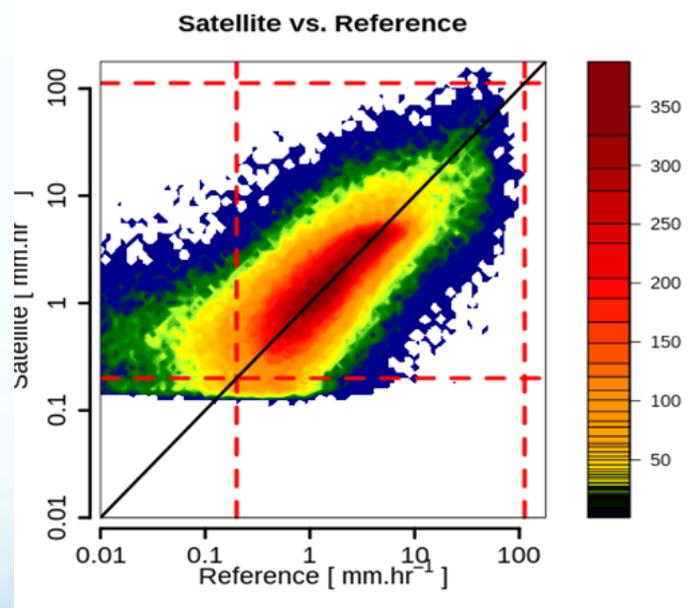


$$N_w = C (Z/D_m^b)$$

GV



- $N_w$  vs.  $f(D_m, Z)$  trend (slope) is different from GV and DPR for approximately the same precipitation sample.....

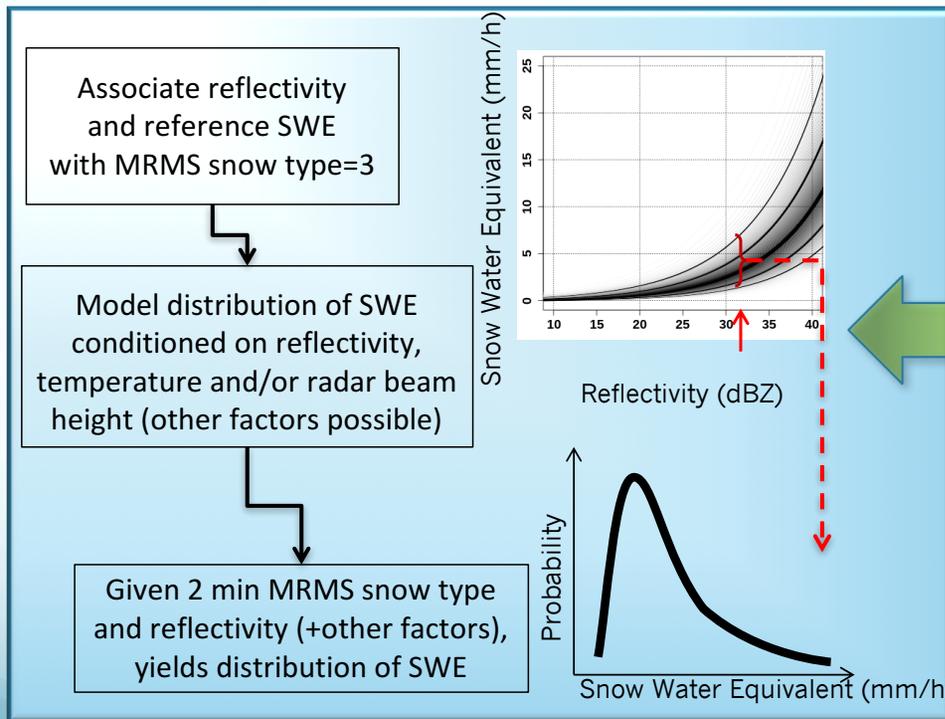


- Yet rain rate estimates are pretty robust!

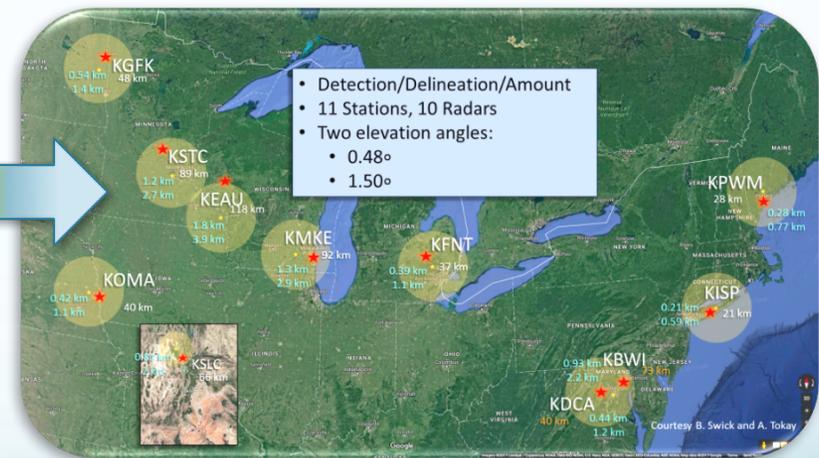


# Improving Snow Water Equivalent (SWE) Rate estimates for a "Reference" MRMS L2 and L3 SWE dataset

Probabilistic SWE using Radar Observations and Ground Stations



Verifying GV-MRMS Probabilistic QPE in L2 (instantaneous) and L3 (30 minute accumulation) Products



ASOS: Weighing gauges,  $T_{sfc}$ ,  $T_w$ , present weather + sounding/model profiles....

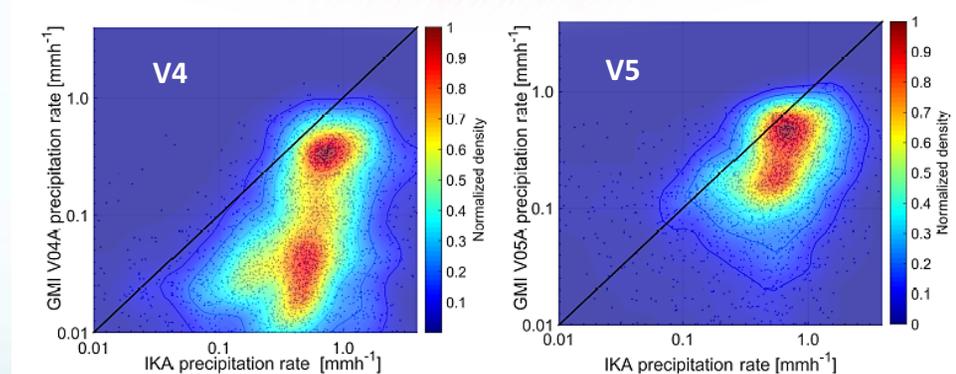
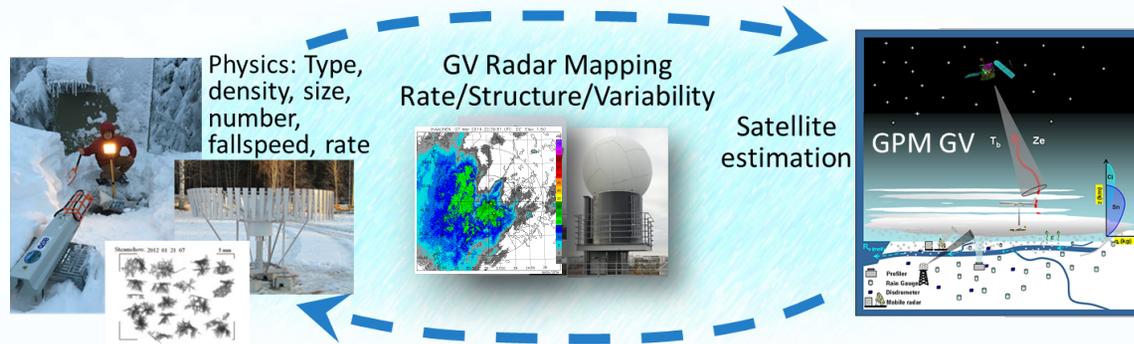
Kirstetter, P.E., J.J. Gourley, Y. Hong, J. Zhang, S. Moazamigoodarzi, C. Langston, A. Arthur, 2015: Probabilistic Precipitation Rate Estimates with Ground-based Radar Networks. *Water Resources Research*, **51**, 1422–1442. doi:10.1002/2014WR015672



# Snow Water Equivalent Rates: GMI-GV: Hyttiala Finland Site



Concept:  
Case-by-case SWER maps  
adjusted for dominant  
snow process, compared  
to regional network, then  
used for overpass  
comparison

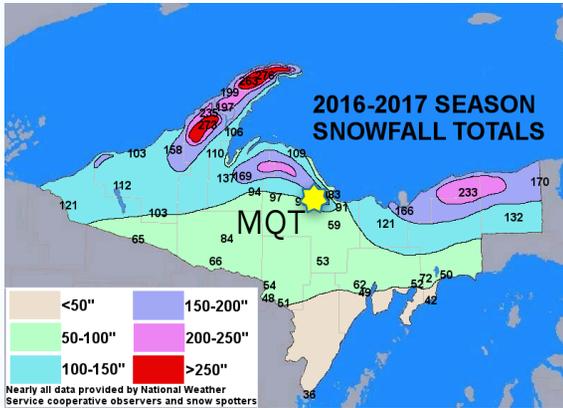


V5 GPROF snowfall improved bias relative to V4 over Finland GV site.

Gridded datasets from Finland overpass subset available: Cf. GPM GV Website

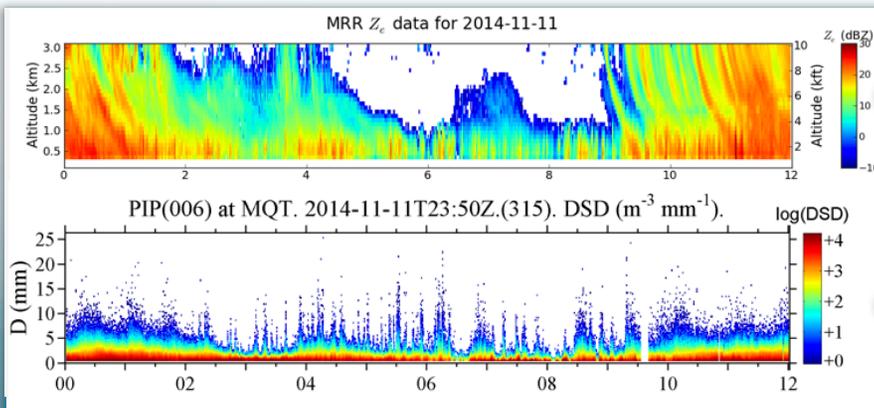
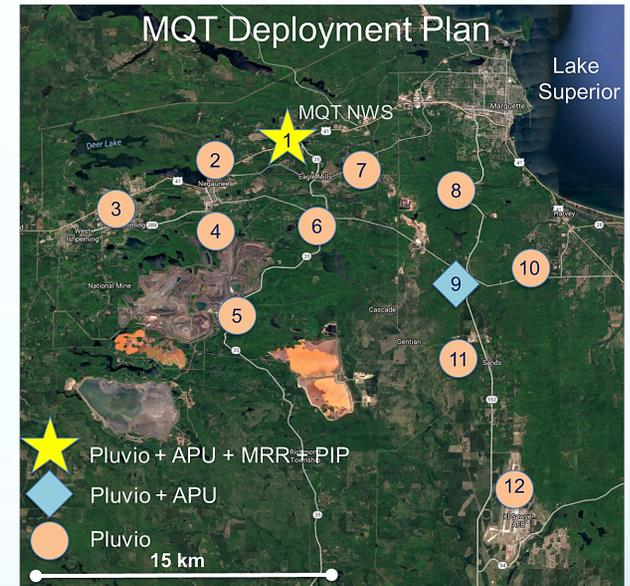


# GMI/DPR Footprint Snowfall Variability



- Partner: Marquette, MI NWS
- 3+ years MRR + PIP observations
- Large annual snowfall amounts
- Different snowfall modes (frontal, lake effect, orographic, combination)

## Making a "footprint" Reference



Micro Rain Radar (MRR)



Precip. Imaging Package (PIP)

- 12 Pluvio-2, 2 APU (present weather), PIP and MRR
- Attempting winter 17/18 install



# ICE-POP: International Collaborative Experiment – PyeongChang Olympics-Paralympics 2018



- KMA-lead, WMO-sponsored winter precipitation research/forecast demonstration project (Jan-Mar. 2018)
- Main Objective: Improve understanding and prediction of orographic falling snow

**NASA Objective(s):** Collaborate with interagency/international partners to:

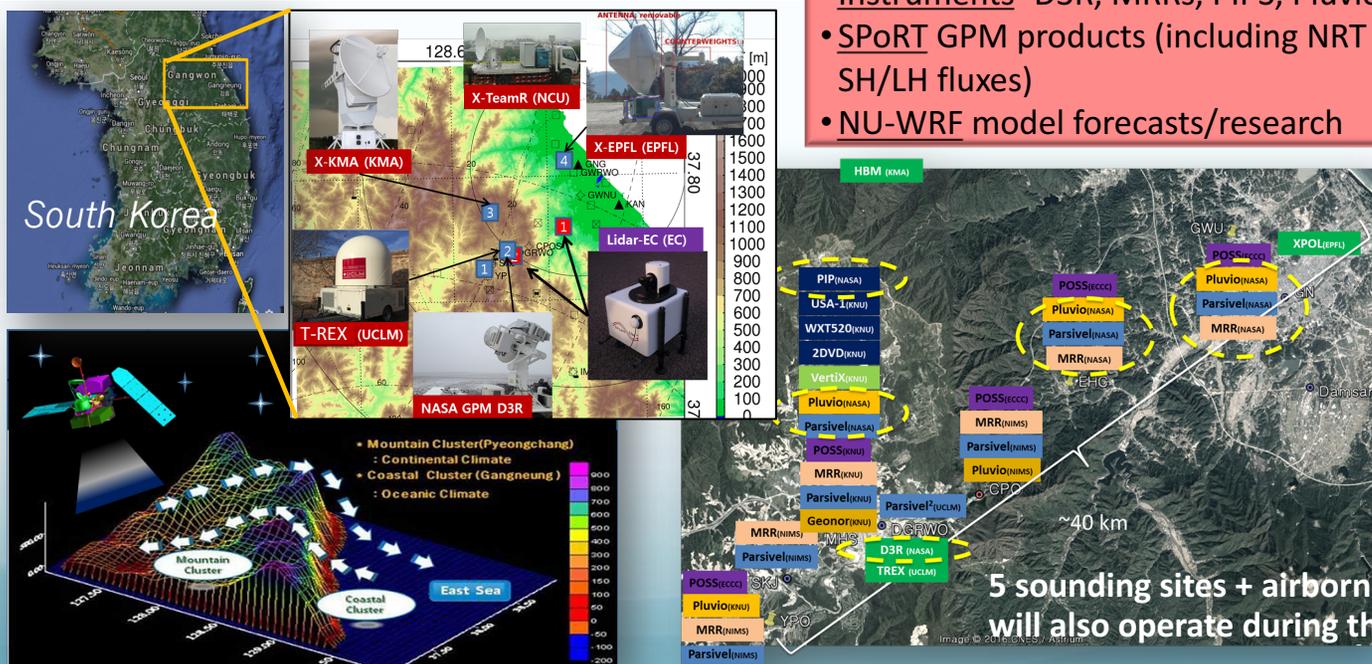
- Evaluate and Improve GPM estimates of orographic snow
- Test and improve NWP, cloud model orographic snow physics
- Serve/test new satellite products in decision support environment

### NASA Contributions:

- Instruments- D3R, MRRs, PIPS, Pluvios, Parsivels
- SPoRT GPM products (including NRT surface SH/LH fluxes)
- NU-WRF model forecasts/research

Coast to mountain SW-NE instrument transect/clusters

Addressing larger synoptic scale cyclone and cold-air northeasterly ocean-mountain snow events



5 sounding sites + airborne dropsondes will also operate during the IOP

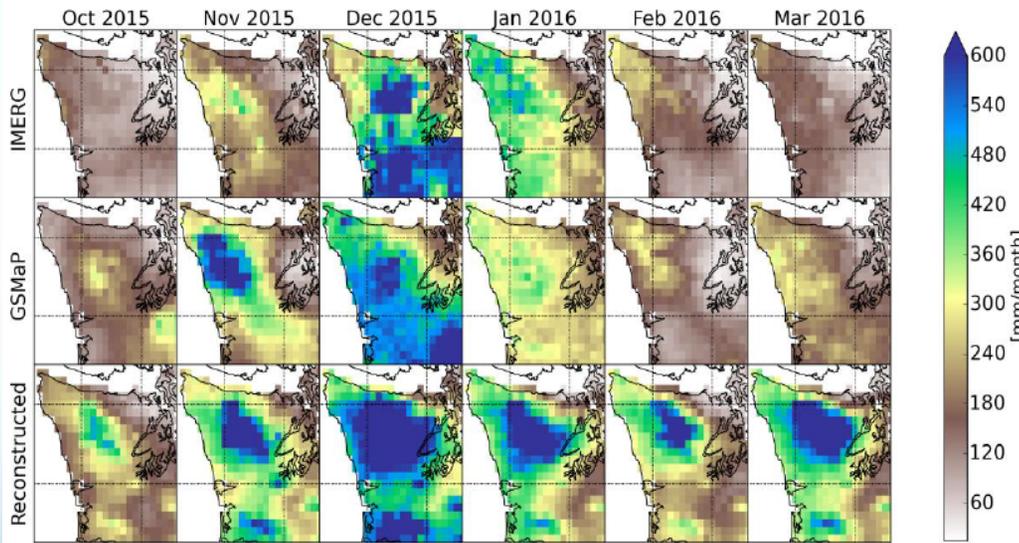


# Orographic Seasonal Precipitation: Verifying Multi-Sat. Estimates



Create a "best" estimate: Combine OLYMPEX [gauges], regional gauges, SNOTEL, MRMS, MRMS-MM and constrain with ASO and VIC model

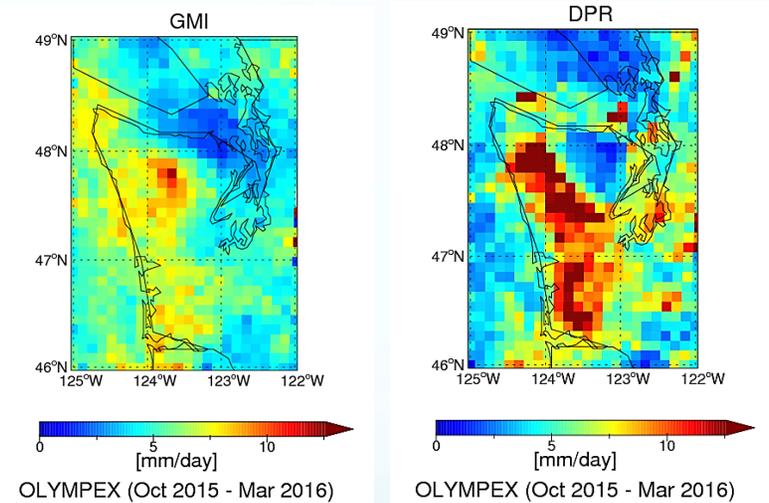
Compare to IMERG, GSMAP



Cao et al., 2017, JHM (in press)

GSMAP low (about 52% of Reconstructed)  
IMERG lower (about 43% of Reconstructed)

GMI, DPR (Oct-Mar. mm/day)



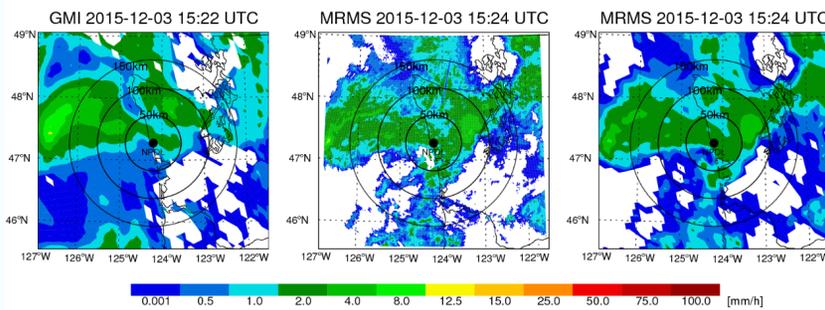
Patterns similar, GMI lowest,  
DPR closest to reconstructed,  
but still low "Ballpark"



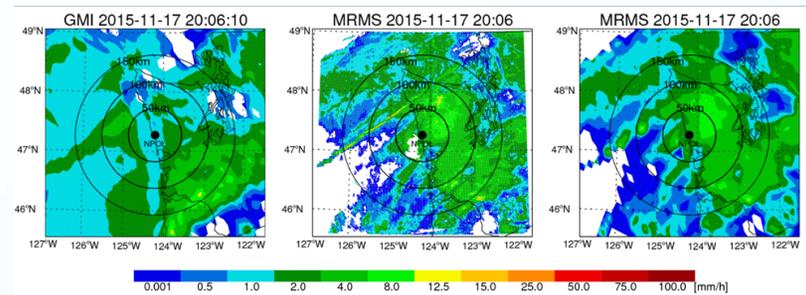
# OLYMPEX Orographic Precipitation Challenges



### Pre-Frontal/Warm-Sector mix

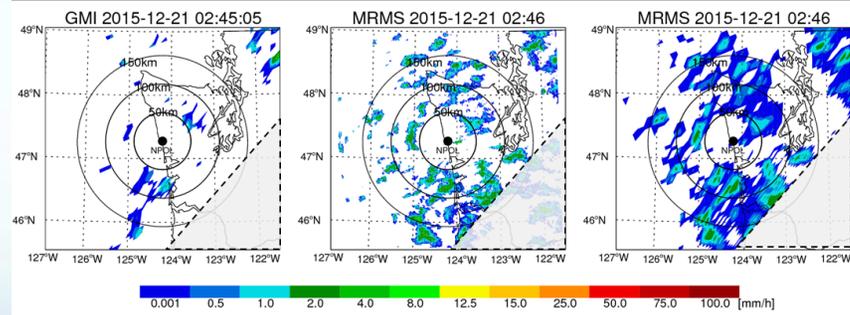


### Warm-SectorAR and Prefrontal



Reasonably good!

### Post frontal



Challenge at coastline and into higher terrain

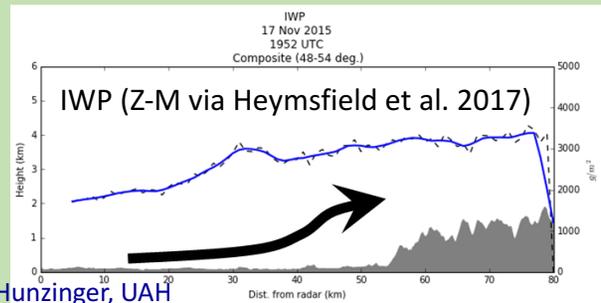
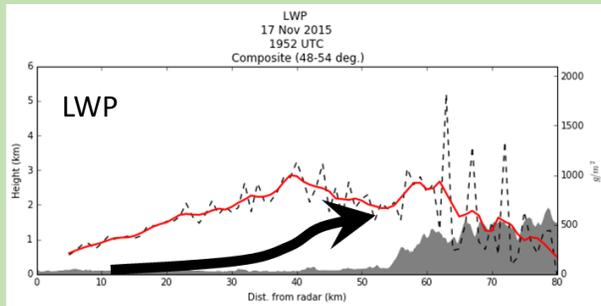
We are often, but not always in the "ballpark"

Challenge of smaller precipitation elements

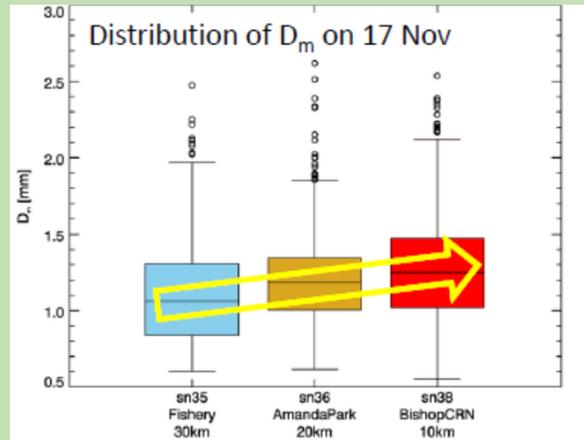
## GPROF



# OLYMPEX Orographic Precipitation Process

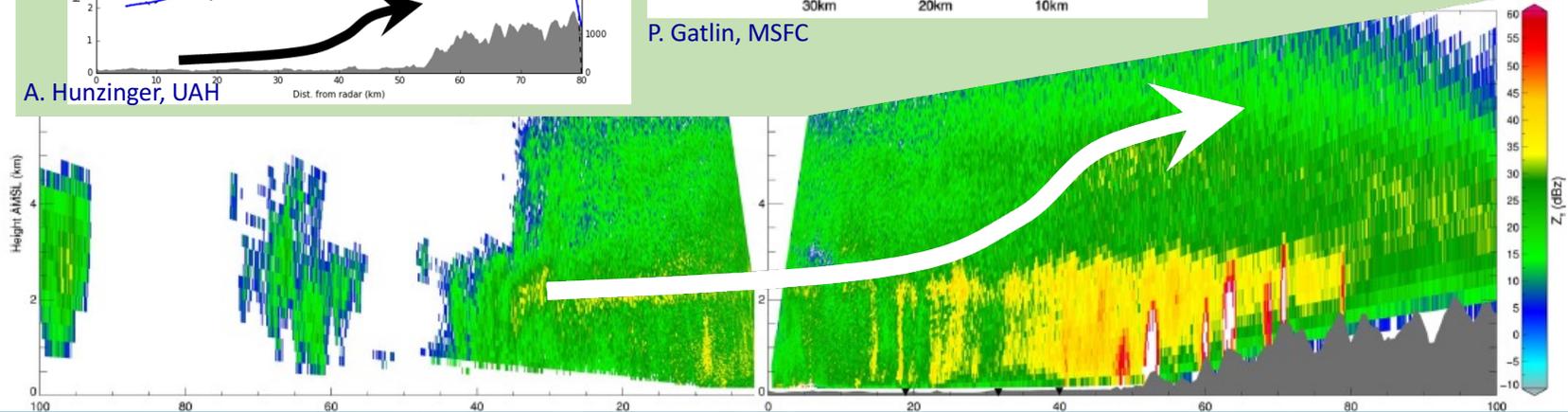


A. Hunzinger, UAH



P. Gatlin, MSFC

Orographic impacts on DSD and column precipitation processes



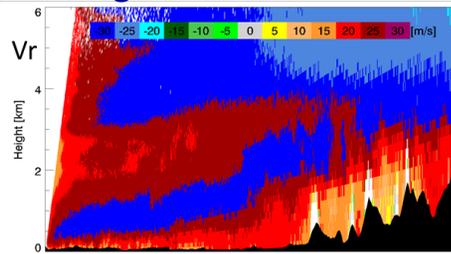
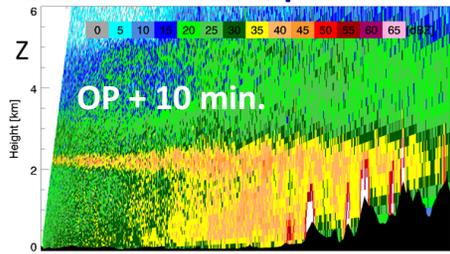


# OLYMPEX Orographic Field Campaign Challenges: Profiles

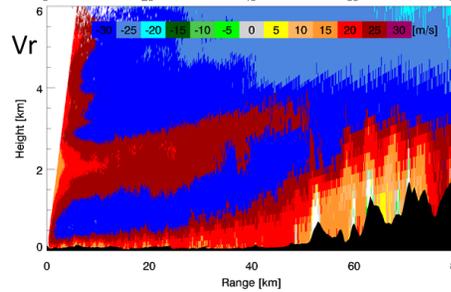
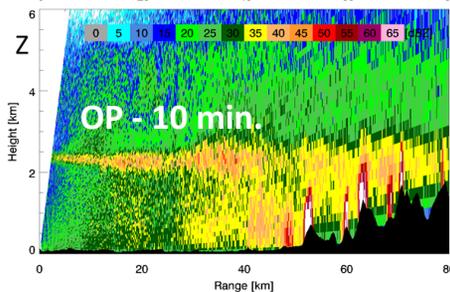


NPOL and DPR 2001 UTC 17 November 2015  
Atmospheric River, flooding rain event

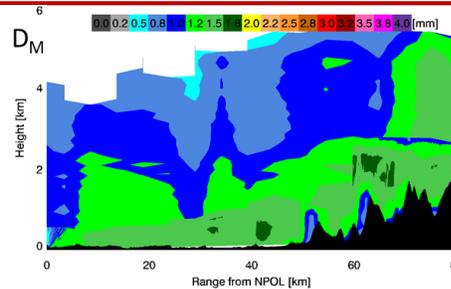
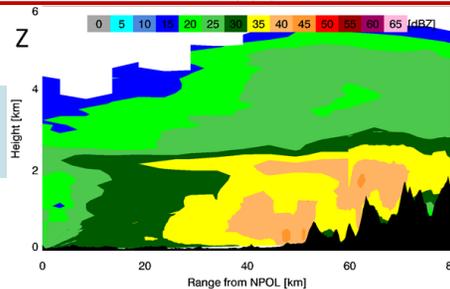
NPOL  
RHI



NPOL  
RHI

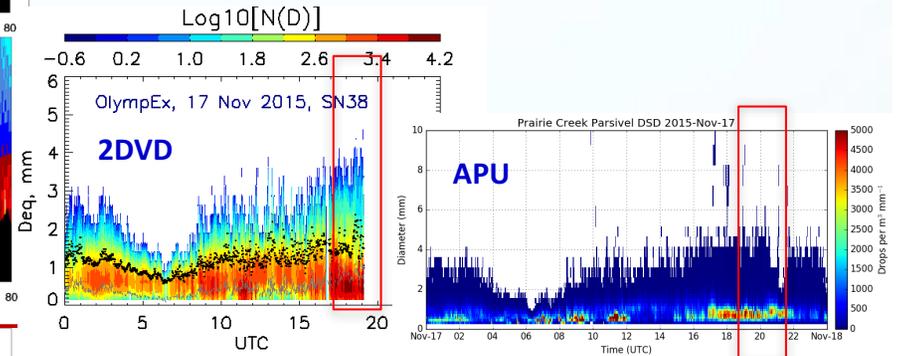


DPR  
+NPOL



An Important part of the rain profile/process in these heavy rain events occurs at elevations (temperatures) not well sampled by the DPR (GMI)

Profile base: Broadening of the DSD through collision-coalescence in forced lift



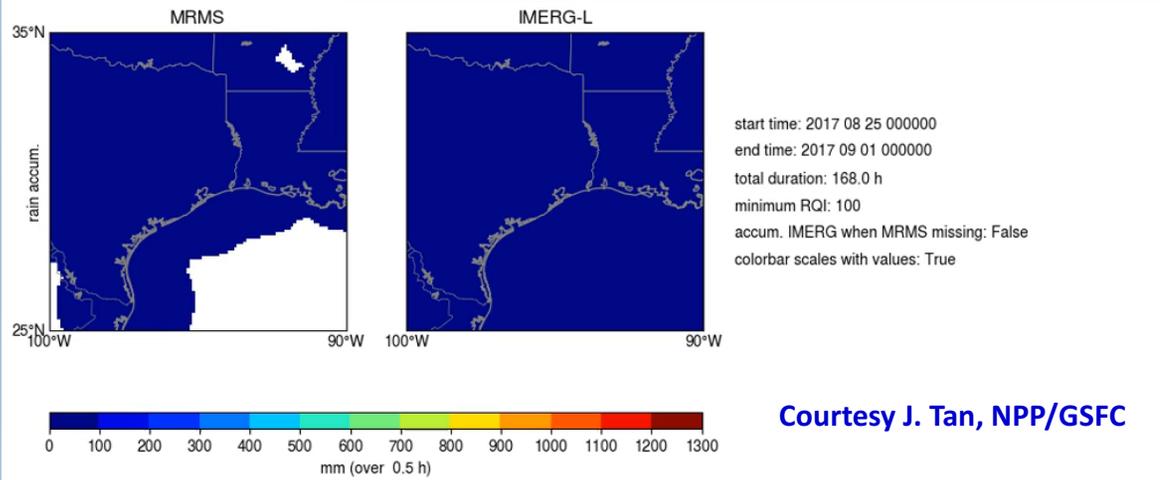
GV "sees" the process- but how do we best exploit the information to "help" algorithms?



# IMERG in Hurricane Harvey

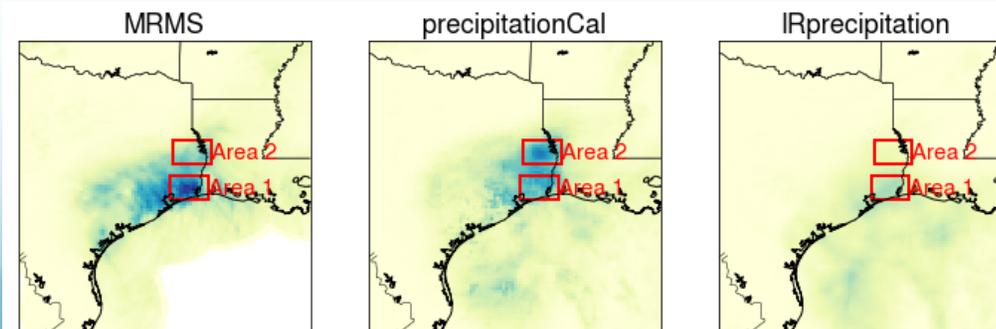


## Hurricane Harvey August 2017



Courtesy J. Tan, NPP/GSFC

Why the error pattern in IMERG?



- IR- universally low
- PMW (HQprecip)- low at coast (area-1), high inland (area-2)
- Combination drives error pattern



# Summary

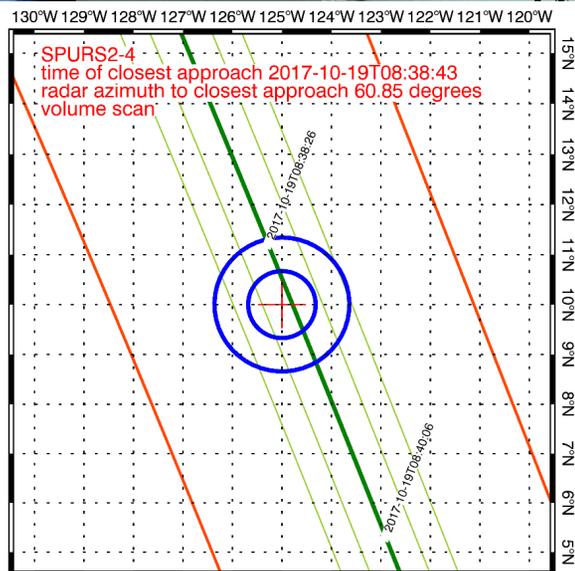


- Level 1 requirements satisfied using select CONUS data.....however, exploration of high quality data from other locations is also needed- where do/don't things work (and why)?
- Extended mission and slower cadence to algorithm version updates permits more GV field and supporting dataset analysis with anticipated impact to algorithms
- Themes for extended mission:
  - Globally-diverse, but *carefully considered, reference* precipitation datasets
  - GV field data and analysis of profile physics for algorithms
  - Improved snow water equivalent estimation (ground and aloft)- datasets for algorithm benchmarks
  - Orographic precipitation- benchmark datasets, processes relevant to satellite algorithms
  - IMERG validation- broaden effort, establish a suite of core statistics/approaches for routine and timely monitoring

# Thanks!

*Maiden Voyage of the CSU-SEAPOL Radar to  
NASA SPURS2 Campaign (S. Rutledge et al.)*

Dual-pol data over  
Tropical E. Pacific





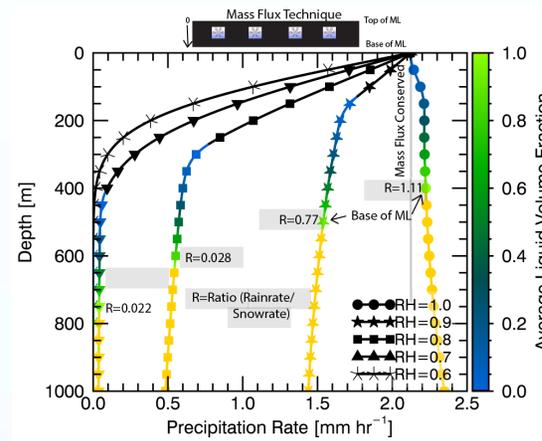


# Testing Snowfall Rate Relationships Using Airborne Field Observations

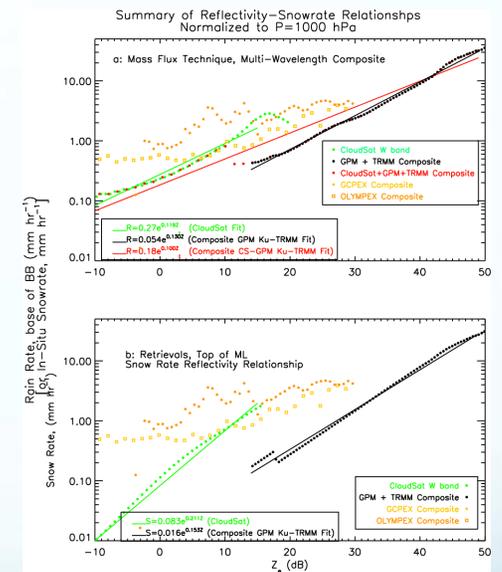
## OLYMPEX and GCPEX



- Composite ice water content and snowfall rate relationships developed for W, Ka and Ku bands
  - *direct (OLYMPEX and GCPEX in situ microphysical + airborne radar collocation)*
  - Mass flux approaches (*conservation of water mass from top of ML to below ML*) using Z from TRMM, CloudSat and GPM; i.e., W, Ka, Ku bands).
- Mass flux relationships compared most favorably to in situ microphysical data



MF approach sensitive to ML RH- but error estimated < 25%



MF approach better represents OLYMPEX and GCPEX observed relationships than satellite-retrievals

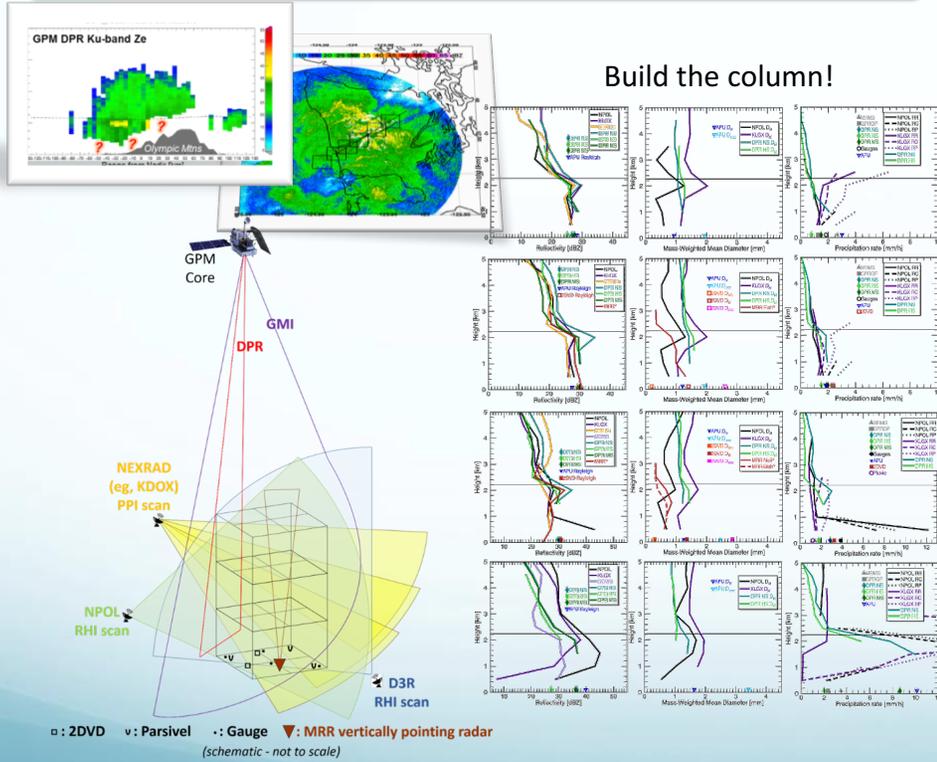
Heymsfield et al., 2017, JAS, in press



# New Tools and Dataset Mods: Columns for DPR and GPROF

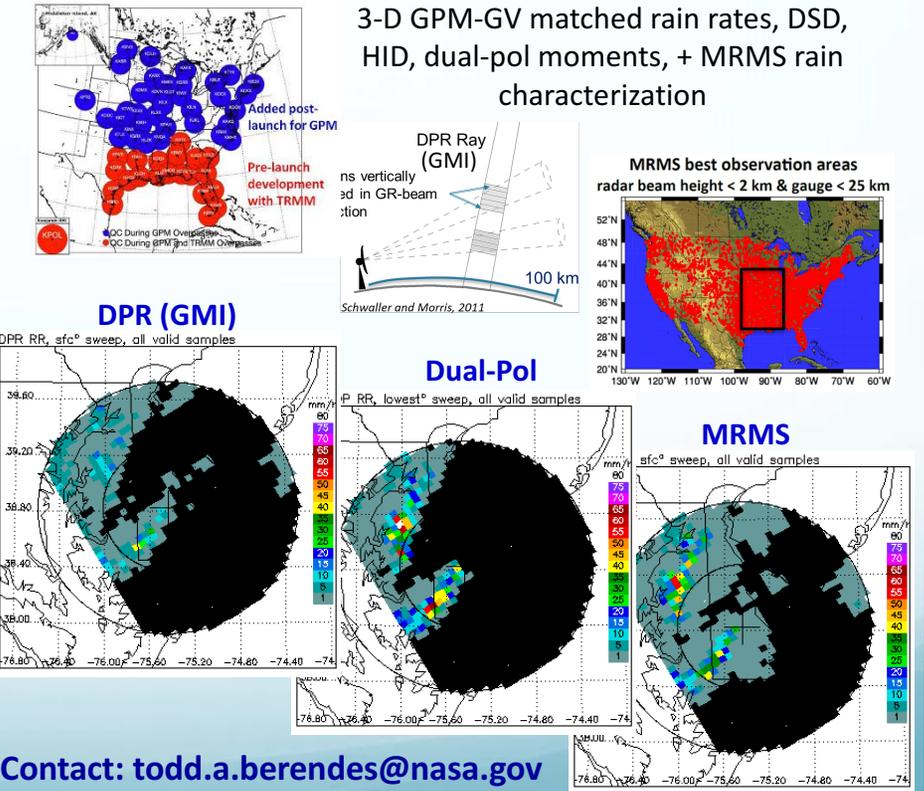


System for Integrating Multi-platform data to Build the Atmospheric Column (SIMBA) Data Fusion Framework



Contact: [Stepanie.m.wingo@nasa.gov](mailto:Stepanie.m.wingo@nasa.gov)

## MRMS Merged with Validation Network Dataset



Contact: [todd.a.berendes@nasa.gov](mailto:todd.a.berendes@nasa.gov)



## Demonstrating Snow "Detection" and Rain-Snow "Delineation"



MRMS "reference" data. Heidke Skill Score (HSS) used to balance hits, misses, false alarms, correct rejects.

Delineation: Skill at separating rain/snow (MRMS determines "type").

Detection: At what threshold rate do we "see" snow?

V5

Product	Detection HSS / Threshold	Delineation HSS
GMI GPROF	0.36 / 0.58 mm hr <sup>-1</sup>	0.85
DPR MS	0.49 / 0.58 mm hr <sup>-1</sup>	0.66
CMB MS	0.57 / 0.63 mm hr <sup>-1</sup>	0.67
DPR NS	0.43 / 0.58 mm hr <sup>-1</sup>	0.65
KuPR	0.44 / 0.58 mm hr <sup>-1</sup>	0.65



- Detection threshold ~ 0.6 mm/hr for radar and radiometer
- Radar skill delineating rain/snow *at* the surface a bit lower than radiometer- somewhat expected.



# Data

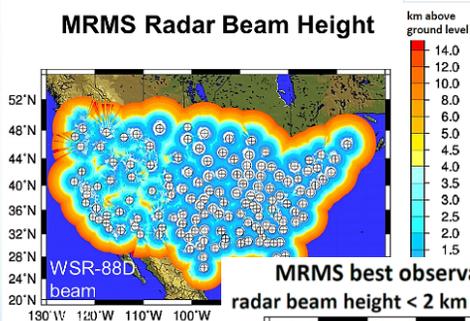
<http://gpm-gv.gsfc.nasa.gov/>



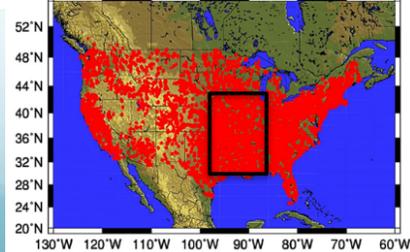
## 1) NOAA Multi-Radar Multi-Sensor (MRMS) Precipitation Rates

- Gauge bias-corrected radar estimates of precip **rate and type**
- 0.01° / 2 minute resolution
- Quality-constrained "reference" subsets created

MRMS Radar Beam Height

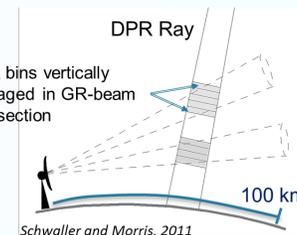
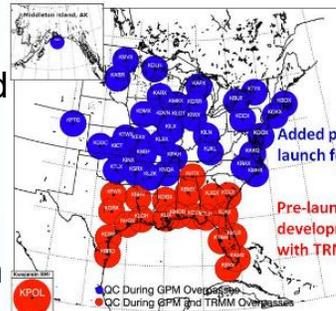


MRMS best observation areas  
radar beam height < 2 km & gauge < 25 km



## 2) Validation Network

- QC'd 3-D radar volumes and variables geo-matched to DPR sample volumes and GMI footprints
- 65 US + numerous research and international radars



## 3) Field campaign and Extended Site observations

- Disdrometer sites/network datasets from GPM GV and partners

