

# A Column-based Multi-platform Assessment of Atmospheric River Events Observed in Complex Terrain During the NASA GPM OLYMPEX Field Campaign

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Image: Steven Sander

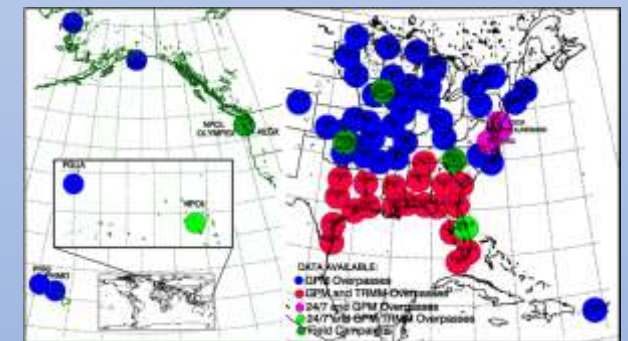


# GPM/GV Field Efforts: Platform Diversity

- GPM Core Observatory
  - Dual-frequency Precipitation Radar (DPR)  
Ka-/Ku-band (35.5/13.6 GHz, 125/245 km swaths)
  - GPM Microwave Imager (GMI)  
13-channels 10-183 GHz (885 km swath)
- Constellation Partners (JAXA, NOAA, DOD, EUMETSAT, CNES, ISRO)
- Multi-agency Field Campaigns
  - Meteorology/geography/topography
- **Research need:** single, integrative framework to “build” the atmospheric column with targeted, multi-sensor data

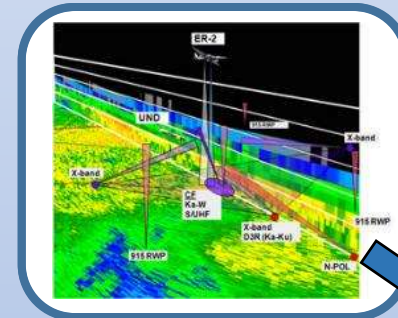


+ other partner observing networks

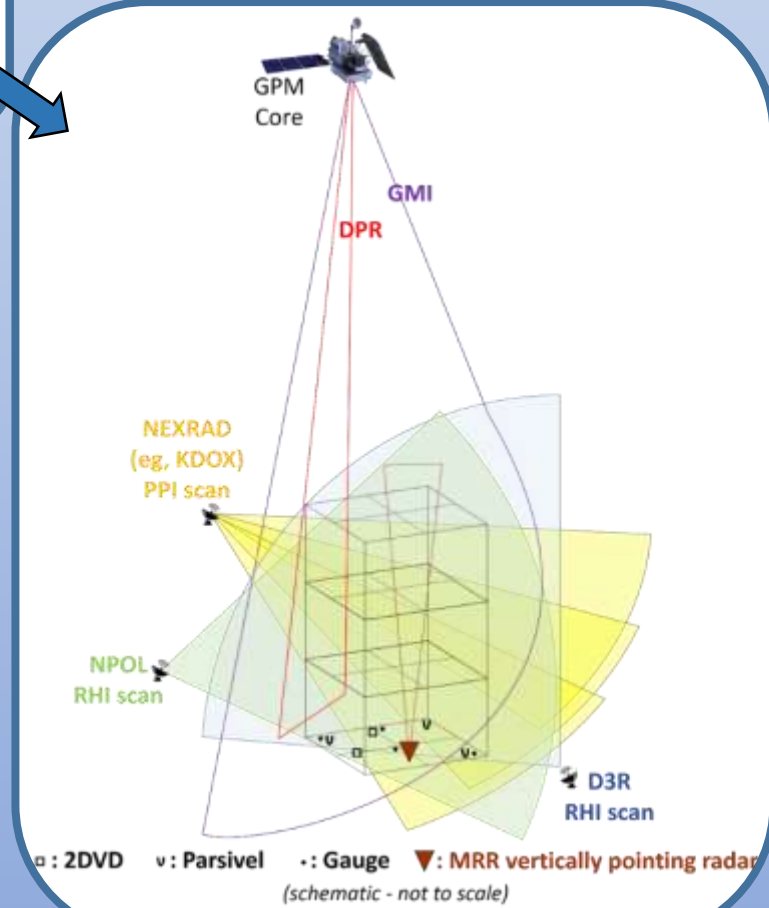
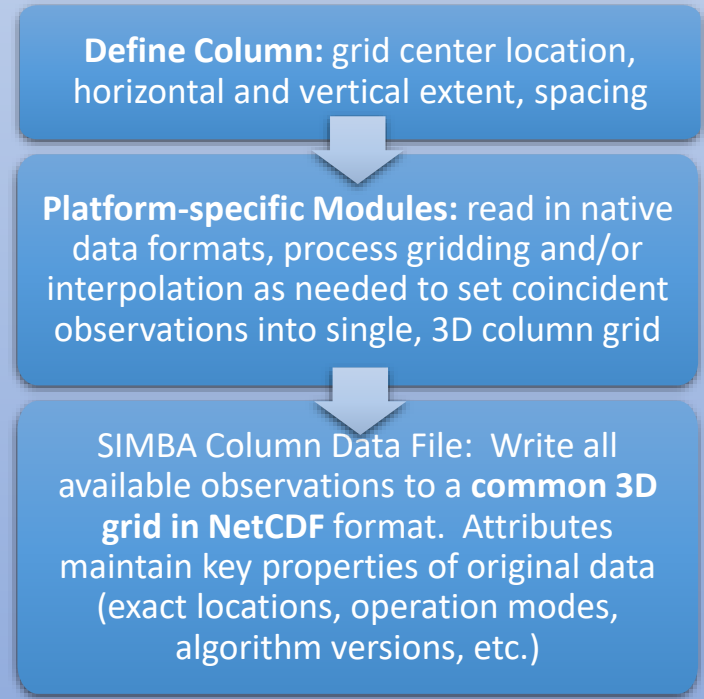


# System for Integrating Multi-platform data to Build the Atmospheric column (SIMBA)

- Synthesizes concomitant GPM GV precipitation observations to single 3-D grid
- Modules support various data platforms and format types
  - Ground-based scanning, profiling radars
    - NPOL, 88D, D3R, DOW, MRR
  - Point measurements: gauges, disdrometers
    - Tipping bucket, Pluvio, Parsivel, 2DVD
  - GPM Satellite (DPR, GMI)
  - Soundings
  - MRMS QPE
- Attributes preserve info from native files



*SIMBA enables more efficient precipitation science by fusing GPM GV data to a common grid*



# System for Integrating Multiplatform Data to Build the Atmospheric Column

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SPECIAL  
Global Precipitation Measurement (GPM)  
COLLECTION

## The System for Integrating Multiplatform Data to Build the Atmospheric Column (SIMBA) Precipitation Observation Fusion Framework

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### ABSTRACT

Researchers now have the benefit of an unprecedented suite of space- and ground-based sensors that provide multidimensional and multiparameter precipitation information. Motivated by NASA's Global Precipitation Measurement (GPM) mission and ground validation objectives, the System for Integrating Multiplatform Data to Build the Atmospheric Column (SIMBA) has been developed as a unique multisensor precipitation data fusion tool to unify field observations recorded in a variety of formats and coordinate systems into a common reference frame. Through platform-specific modules, SIMBA processes data from native coordinates and resolutions only to the extent required to set them into a user-defined three-dimensional grid. At present, the system supports several ground-based scanning research radars, NWS NEXRAD radars, profiling Micro Rain Radars (MRRs), multiple disdrometers and rain gauges, soundings, the GPM Microwave Imager and Dual-Frequency Precipitation Radar on board the *Core Observatory* satellite, and Multi-Radar Multi-Sensor system quantitative precipitation estimates. SIMBA generates a new atmospheric column data product that contains a concomitant set of all available data from the supported platforms within the user-specified grid defining the column area in the versatile netCDF format. Key parameters for each data source are preserved as attributes. SIMBA provides a streamlined framework for initial research tasks, facilitating more efficient precipitation science. We demonstrate the utility of SIMBA for investigations, such as assessing spatial precipitation variability at subpixel scales and appraising satellite sensor algorithm representation of vertical precipitation structure for GPM *Core Observatory* overpass cases collected in the NASA Wallops Precipitation Science Research Facility and the GPM Olympic Mountain Experiment (OLYMPEX) ground validation field campaign in Washington State.

SIMBA Development & Initial Applications published earlier this year in the *Journal of Atmospheric and Oceanic Technology*, as part of AMS's GPM Special Collection

- Synthesizes concomitant precipitation observations

- Modular and flexible

- Ground-based profilers

- Pointing gauges

- GPM

- Soundings

- MRMS QPE

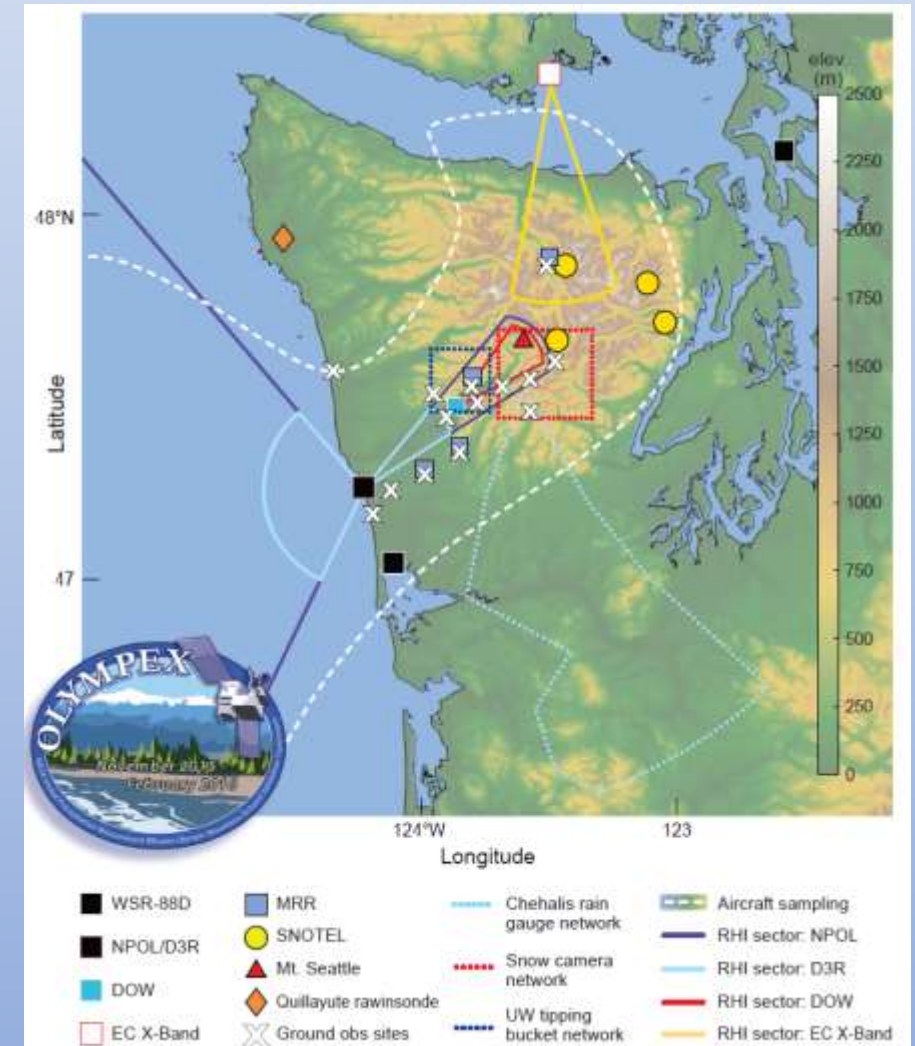
- Attributes preserve information from native files

More efficient science by fusing common grid



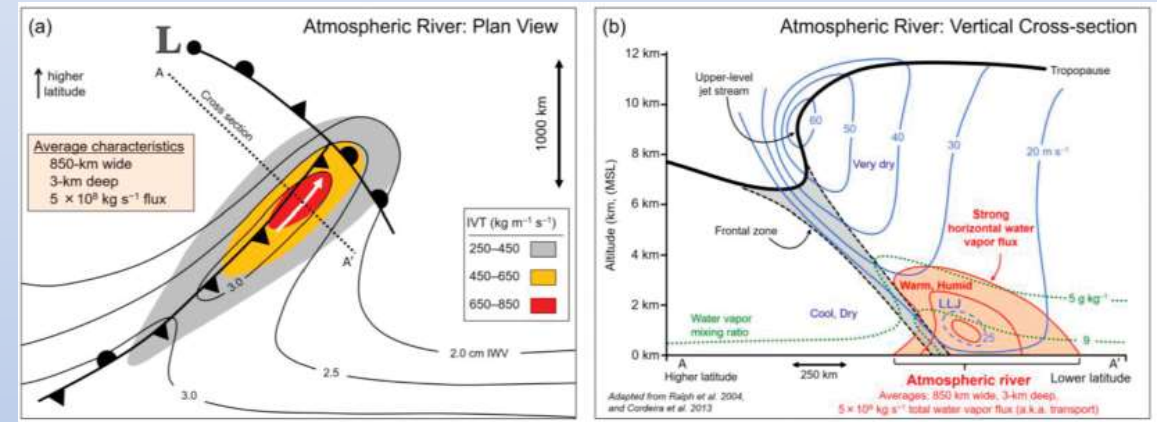
# Olympic Mountains Experiment (OLYMPEX)

- Land & topographic influence on Pacific frontal system precipitation evolution
- Impacts of **terrain** (and precip behavior in terrain) on satellite measurements
- Remote sensing & in-situ observations
  - Ground-based:
    - NPOL, D3R, DOW, MRRs, 88Ds
    - Disdrometers, gauges, particle imaging
  - Aircraft-based:
    - NASA DC-8, ER-2: dropsondes, GPM Core analog
    - UND Citation: microphysics probes
    - Aerosol Clouds Ecosystems (ACE) Radar Definition Experiment (RADEX)
  - Satellite-based:
    - 2<sup>nd</sup> post-launch field campaign for DPR/GMI

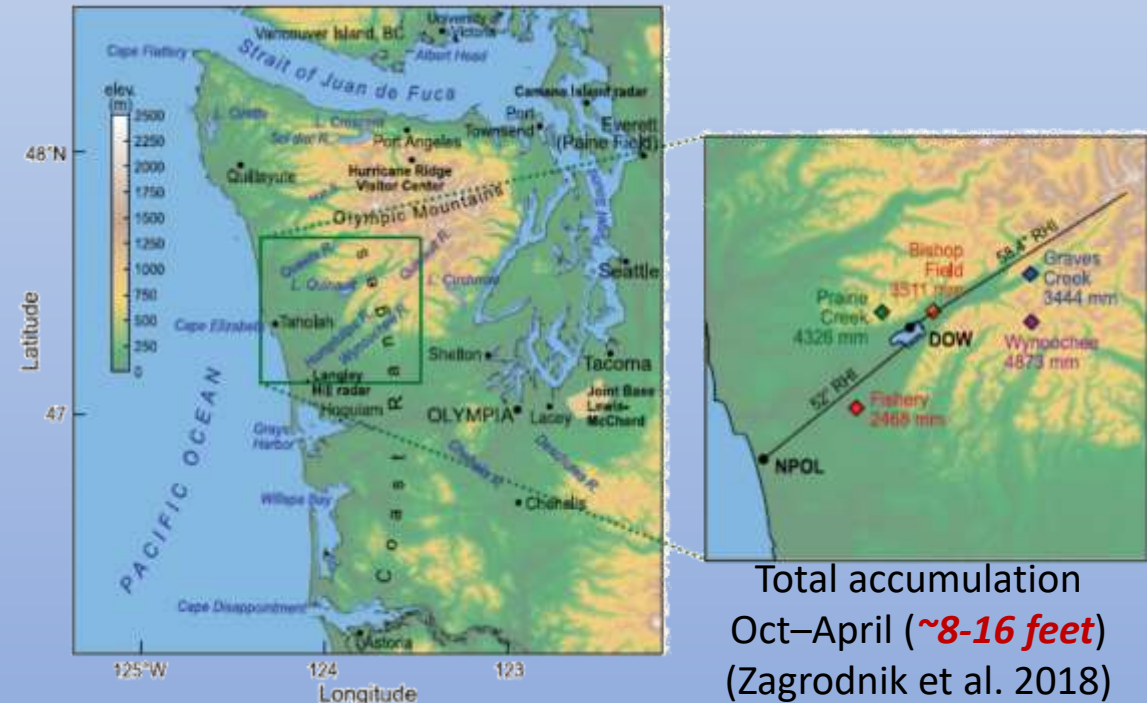


# Atmospheric Rivers

- Moisture plume, copious precipitation totals
  - > 2x fresh water as Amazon River
- Warm sector, flow orientation
  - Unblocked flow at terrain
- Orographic precipitation process modification
  - Seeder-feeder mechanism
  - Warm (non-brightband) rain
  - Riming via supercooled water
- Several ARs during OLYMPEX
  - Event totals: hundreds of mm



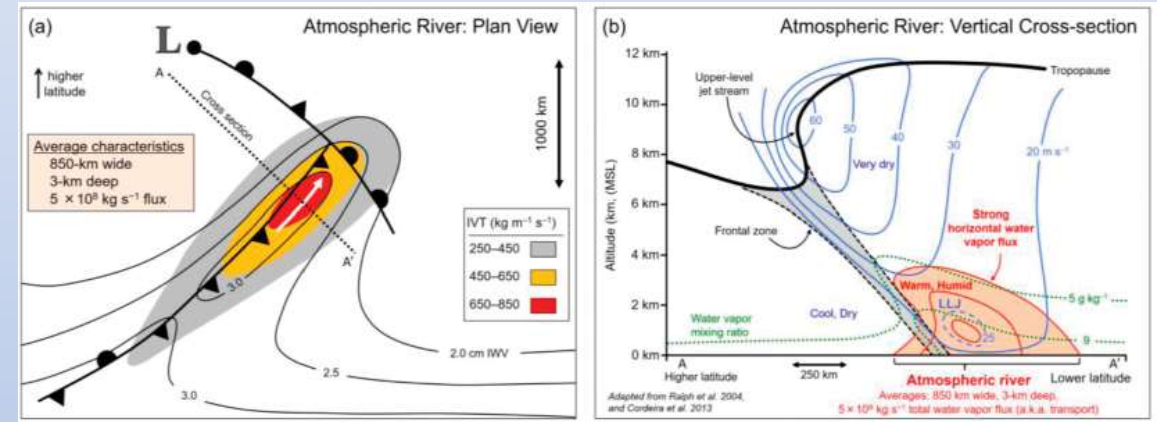
Horizontal & vertical AR structure schematics (Ralph et al. 2018)



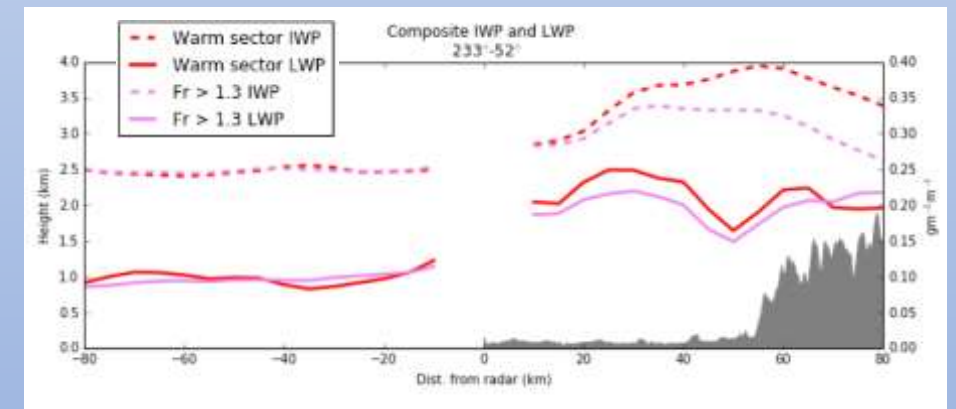
Total accumulation Oct–April (~8-16 feet) (Zagrodnik et al. 2018)

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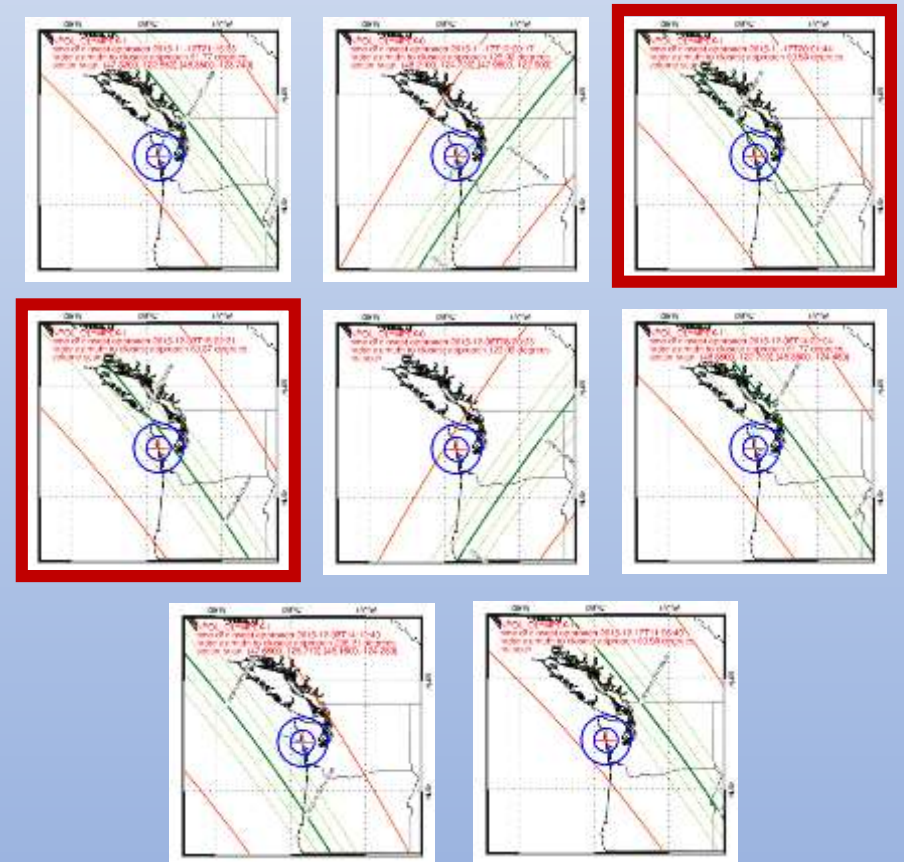


Land & topography **impact ice/liquid** precipitation processes – most pronounced in **unblocked/large Froude and warm sector** flow regimes (Petersen, Hunzinger, Gatlin 2018; *Poster H43F-2493*)

# Integrating GV Obs in SIMBA for OLYMPEX ARs

- SIMBA column files generated for 5 locations up terrain for OLYMPEX AR events:
  - 13 Nov 03-00 UTC (20%)
  - **17 Nov 10-21UTC (10%)**
  - **3 Dec 14-00 UTC (10%)**
  - 6-7 Dec 00-02 UTC (25%)
  - 8-9 Dec 13-10 UTC (20%)
  - 17 Dec 08-00 UTC (15%)
- Column grids:
  - 10 x 10 x 8 km extent
    - 5 km means
  - 500 x 500 x 250 m spacing
  - 5 min centered on NPOL
- Column sites:
  - 20 km SW of NPOL (O)
  - 12.5 km NE of NPOL (A)
  - Fishery (B), Neilton (C), Bishop (D)
    - MRR field sites
- NPOL RHI compositing: Z,  $D_M$ , RR (Chen et al. 2017)
- GPM V05A: GPROF, GMI, 2ADPR, 2BCMB

**8 GPM OPs**  
**2 with DPR**  
**WS / Fr > 1.3**



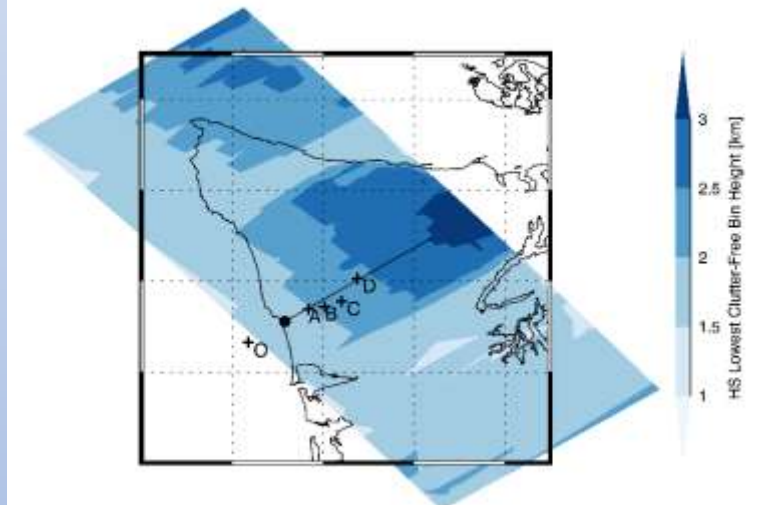


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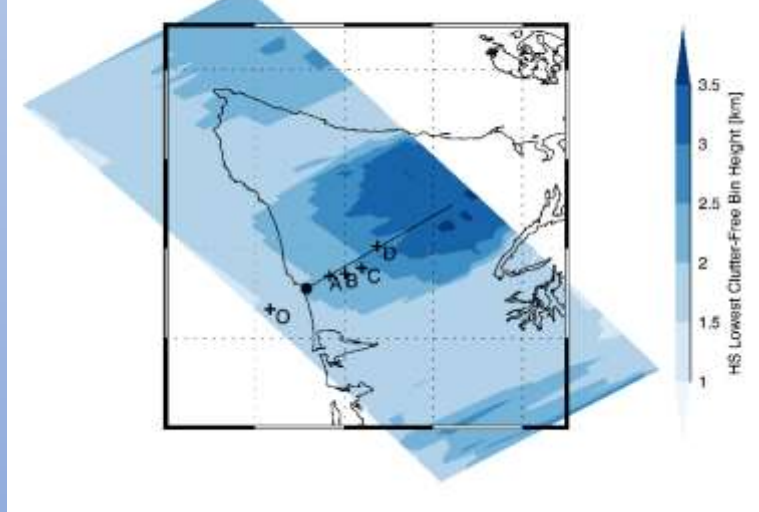
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***Complex terrain introduces complex challenges to observations, especially space-based***

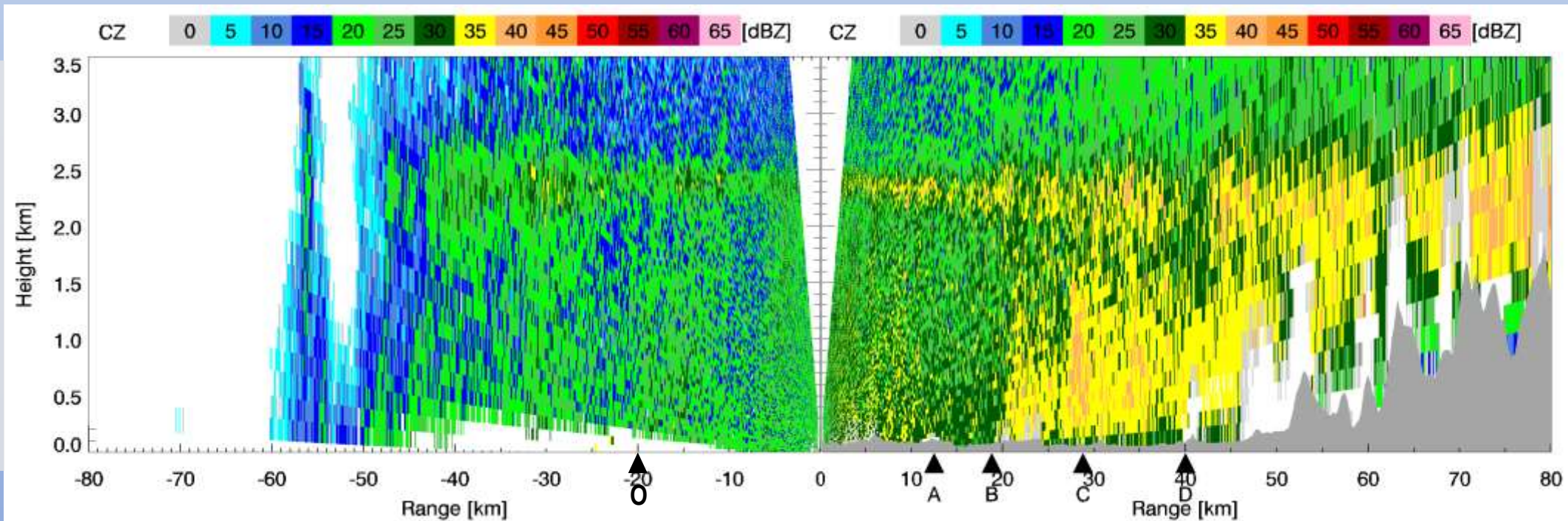
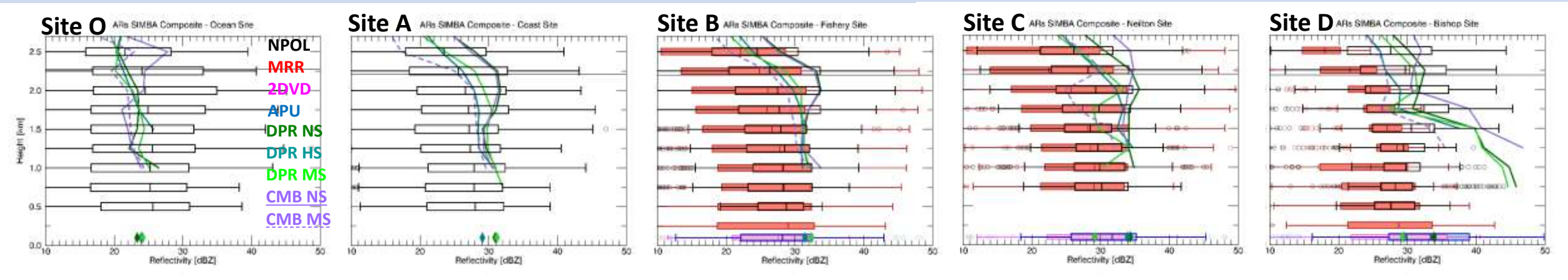
**17 Nov 2001 UTC DPR HS LCFB**



**3 Dec 1522 UTC DPR HS LCFB**

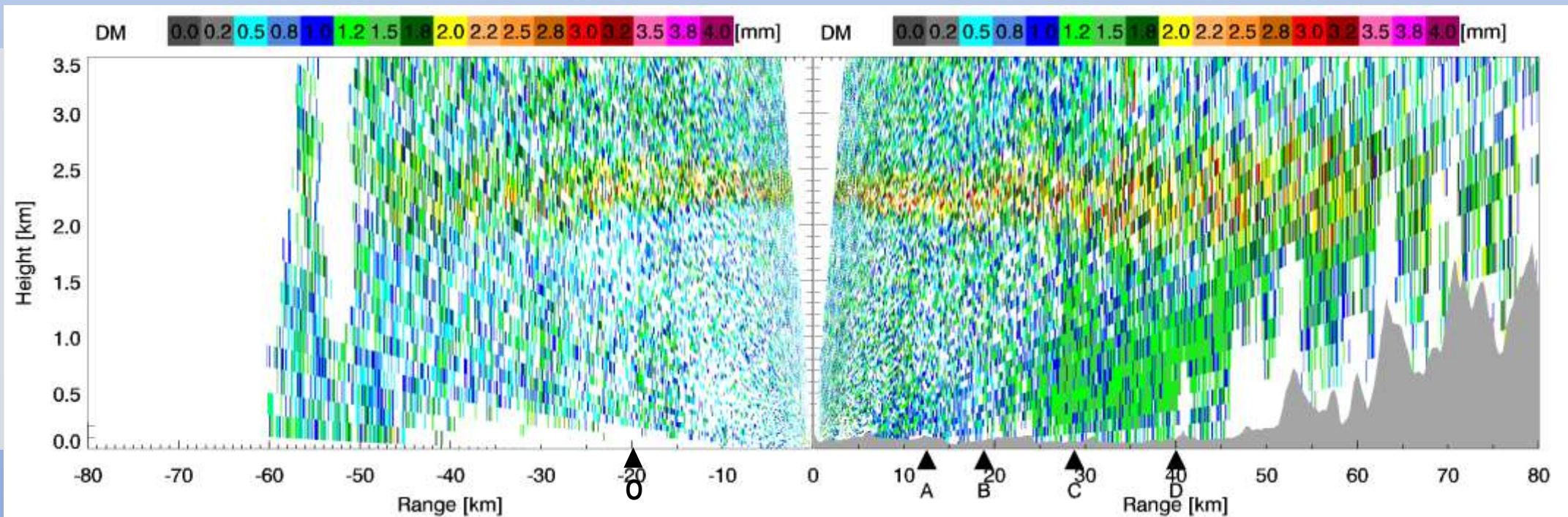
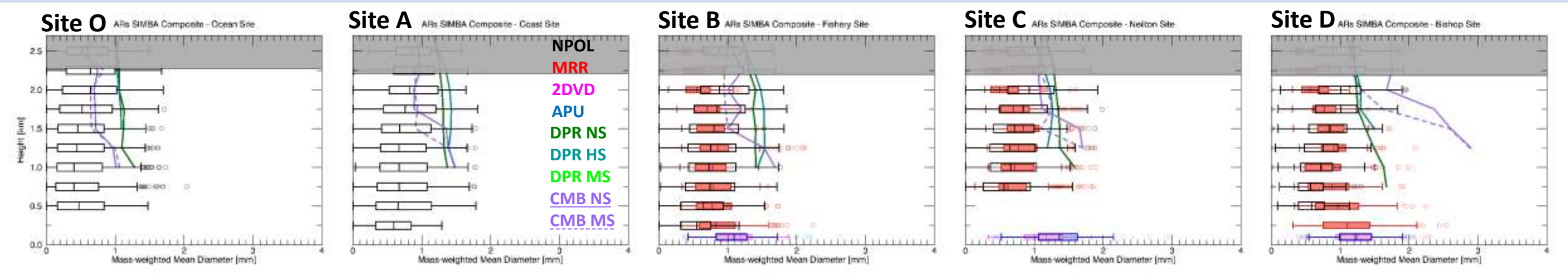


# ARs Composite: Reflectivity



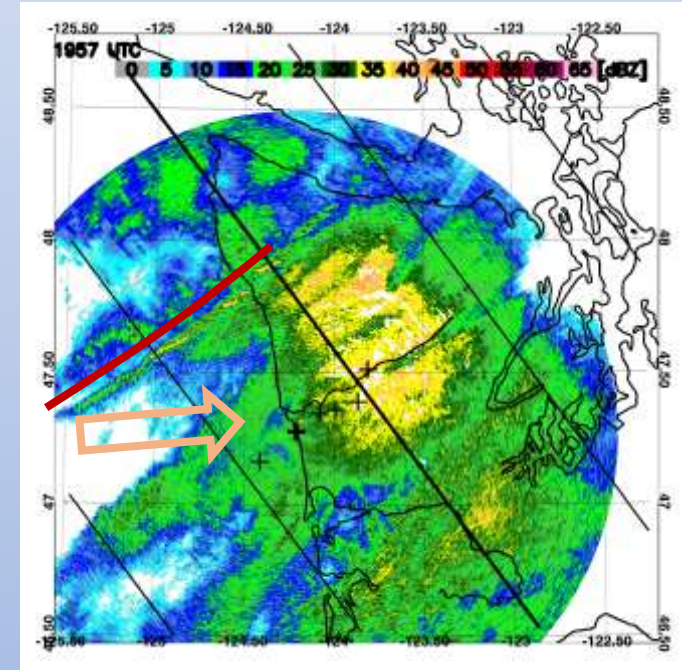
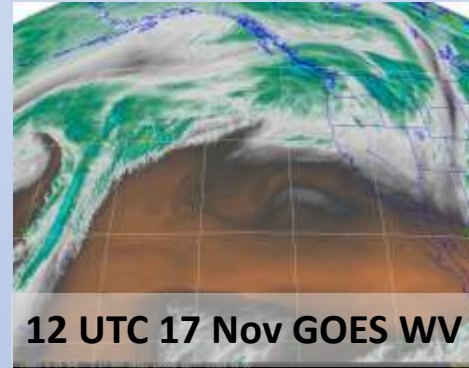
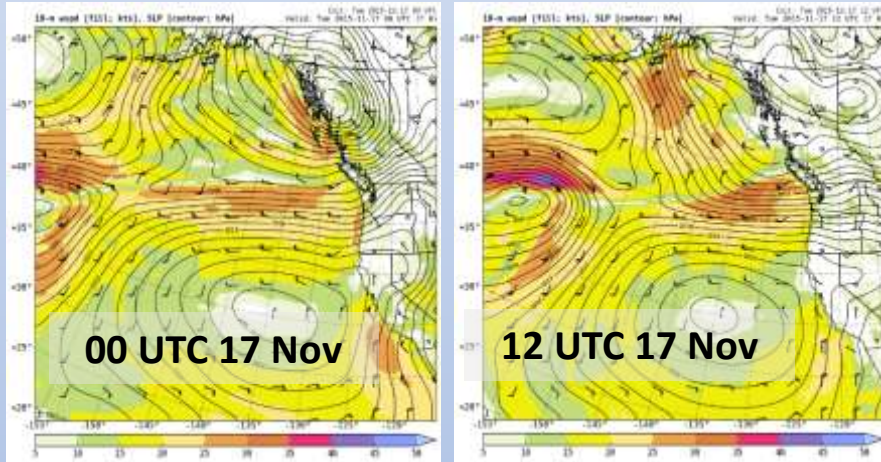
- Large spread – multiple events
- As approach terrain barrier:
  - DPR vs. CMB more different
- GPM vs. ground obs

# ARs Composite: $D_M$

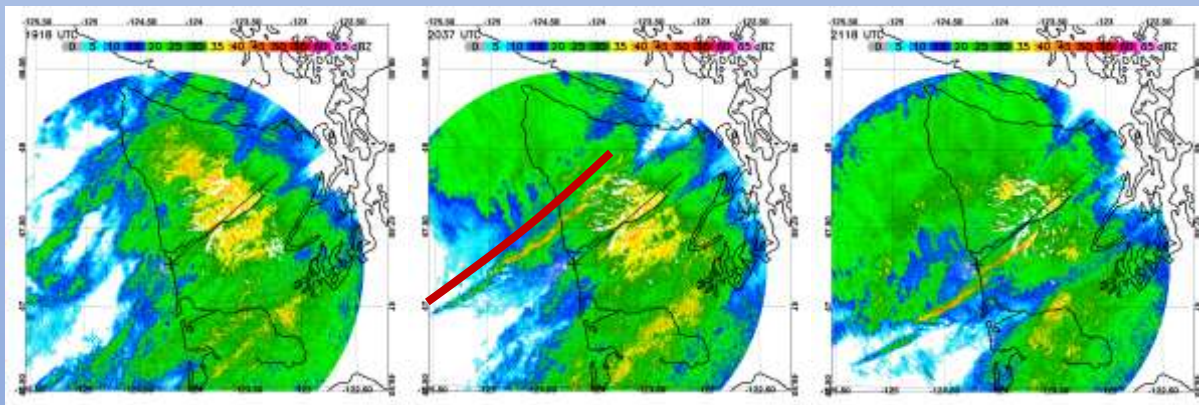


- **MRR** - below 0°C, drop size enhancement
- **DPR** vs. **CMB** as approach terrain barrier
- **MRR** vs. **NPOL** at inland sites

# OLYMPEX AR Event: 17 November 2015



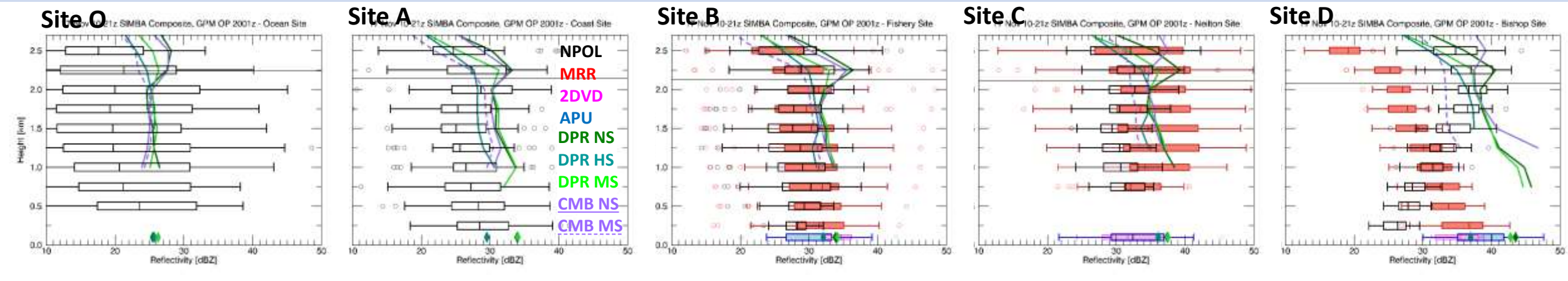
UW WRF+GFS Analyses: 10 m winds & SLP



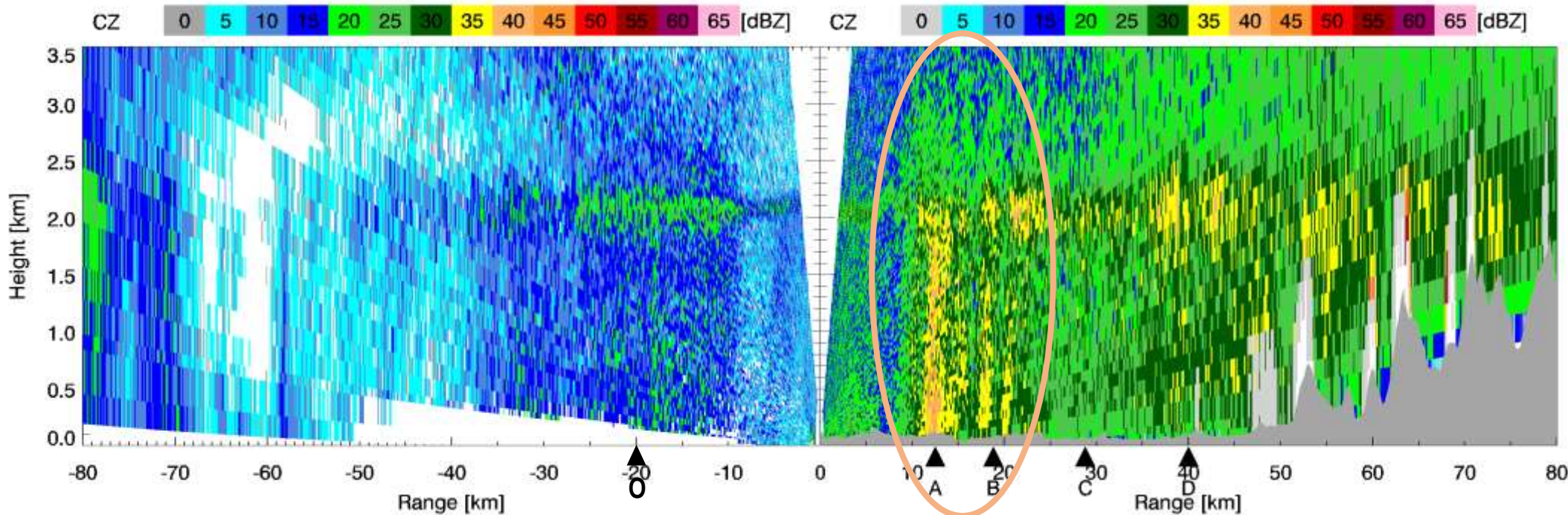
NPOL 1.5° Z

- **Westerly flow**, banner atmospheric river event
- Prominent stratiform, some embedded cells
- **200+ mm/24 h** in QRV (up to 60 mm leeward)
- **GPM DPR OP @ 2001**
- Later: FROPA/NCFR, into elongated sections as passed over land

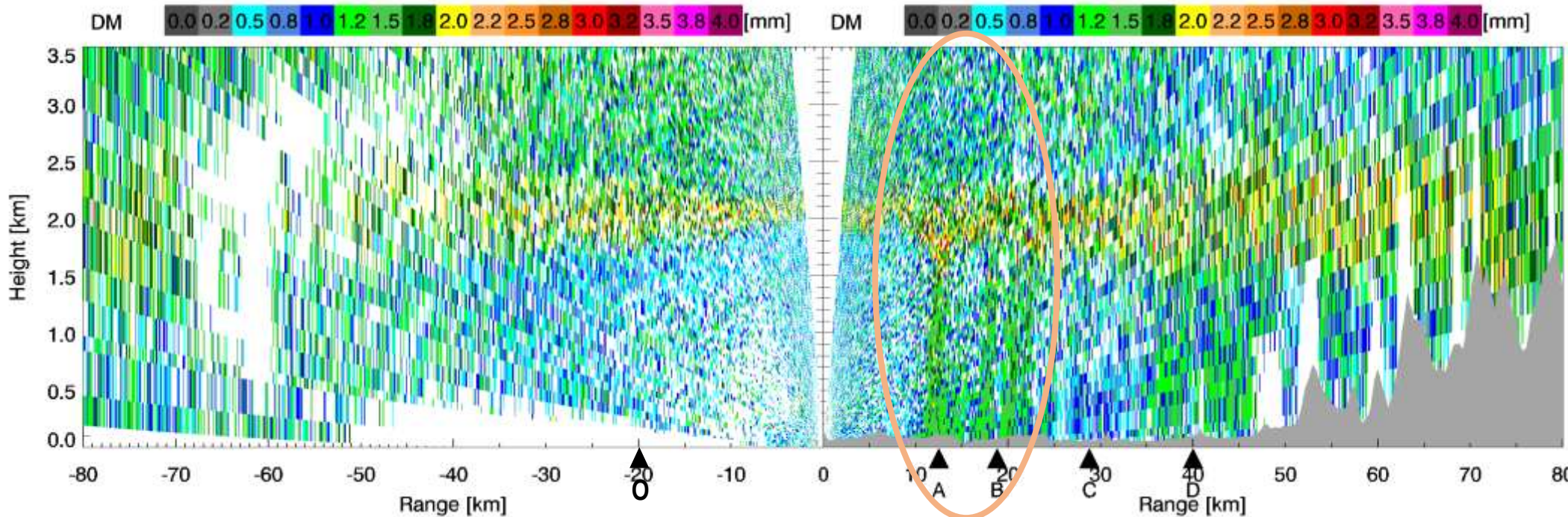
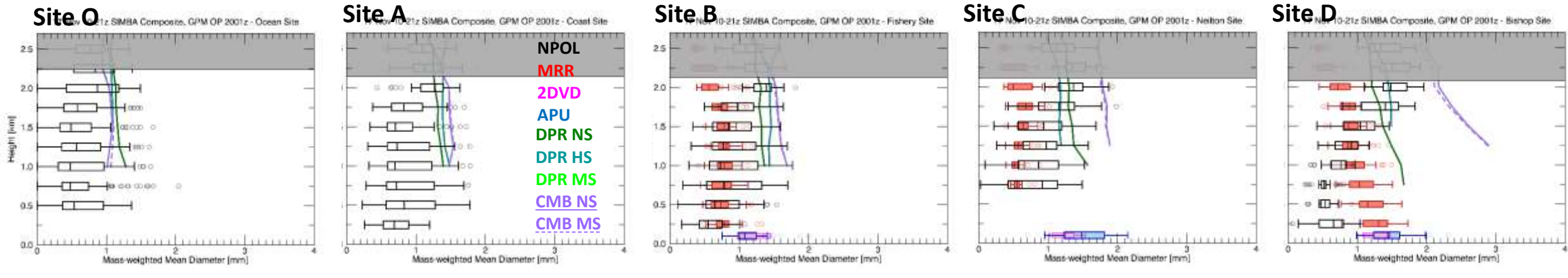
# 17 November: 10-21 UTC Composite Z



- Distinct preferred regions of enhancement ahead of terrain barrier
- DPR & CMB profiles more different in valley
- MRR vs. NPOL

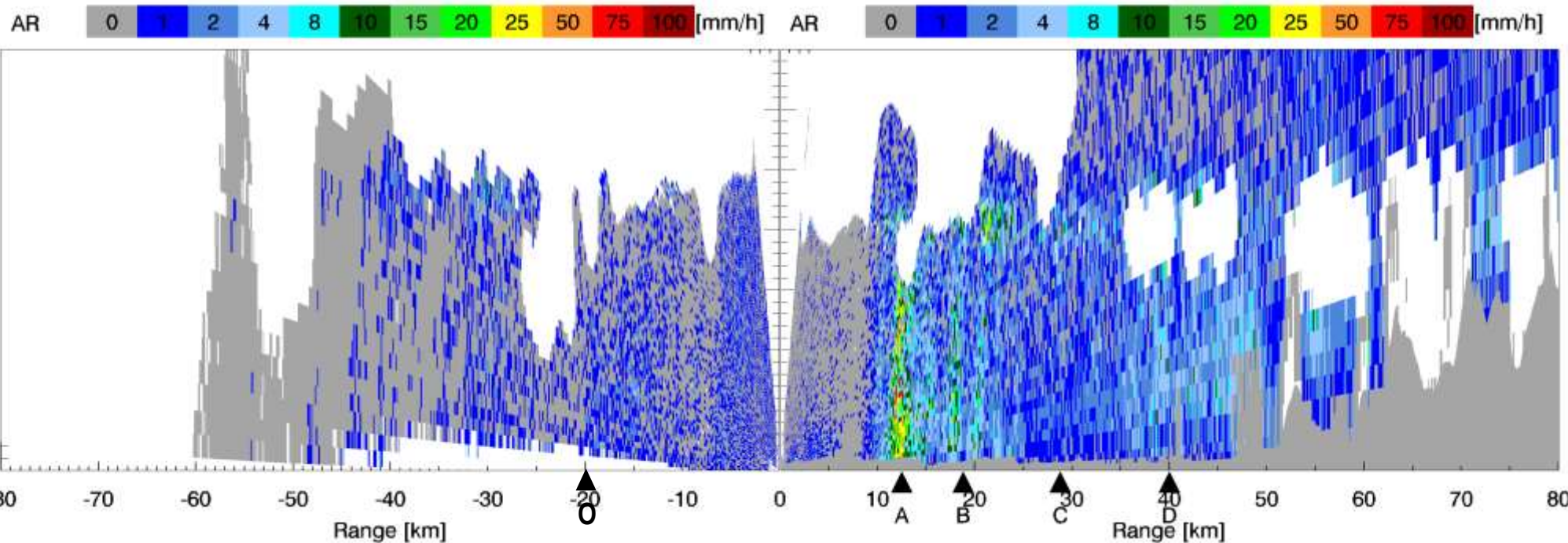
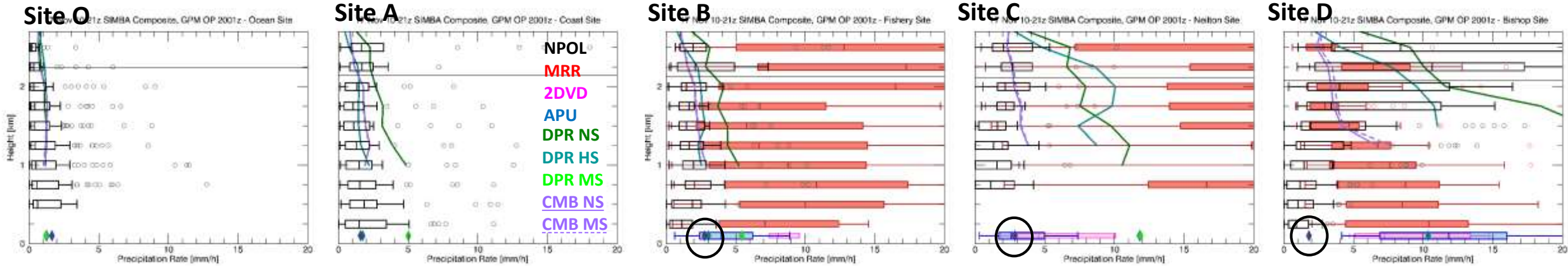


# 17 November: 10-21 UTC Composite $D_M$



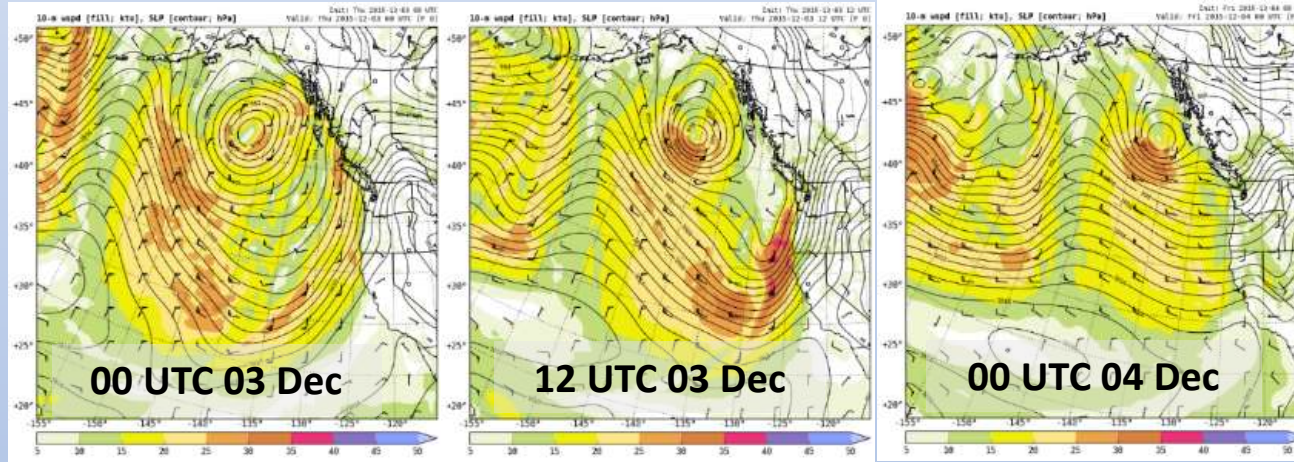
- Distinct preferred regions of enhancement
- Satellite profiles more different in valley-DPR, CMB overestimate
- MRR vs. NPOL

# 17 November: 10-21 UTC Composite RR

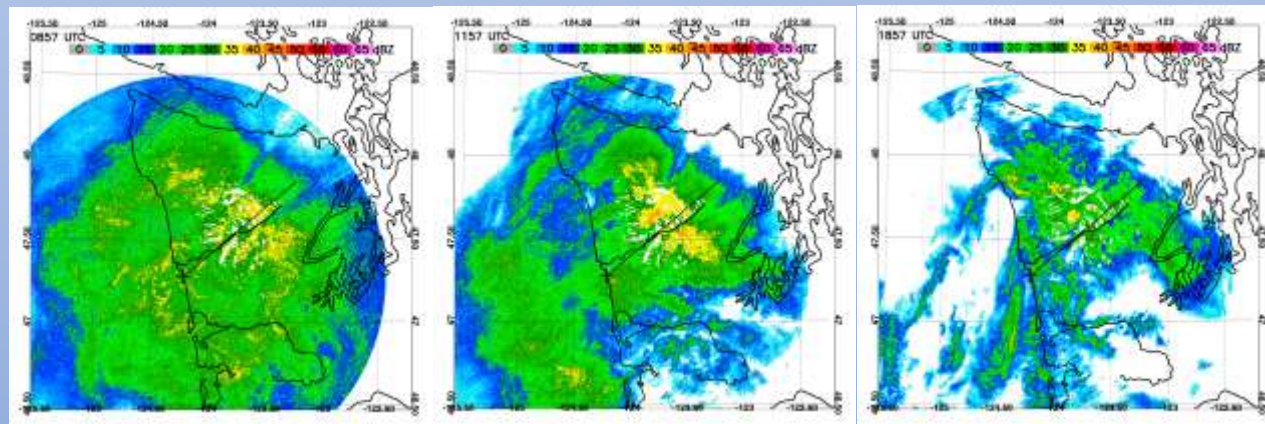


- Initial inland enhancement region most prominent (Z)
- Satellite, MRR issues in valley
- MRR vs. NPOL, MRR + disdos.
- GPROF underestimates

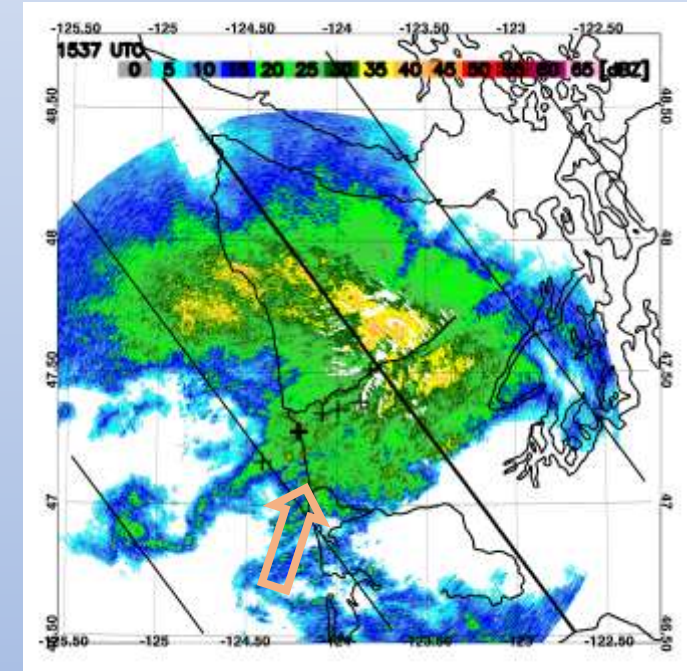
# OLYMPEX AR Event: 3 December 2015



UW WRF+GFS Analyses: 10 m winds & SLP



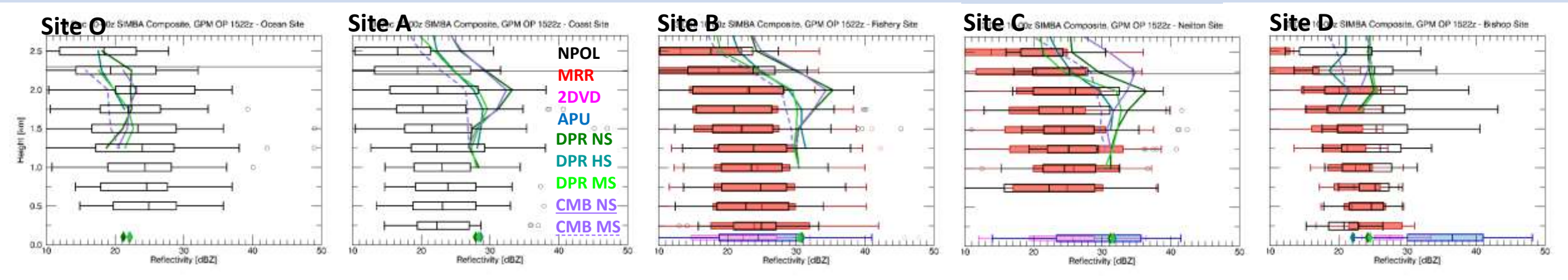
NPOL 1.5° Z



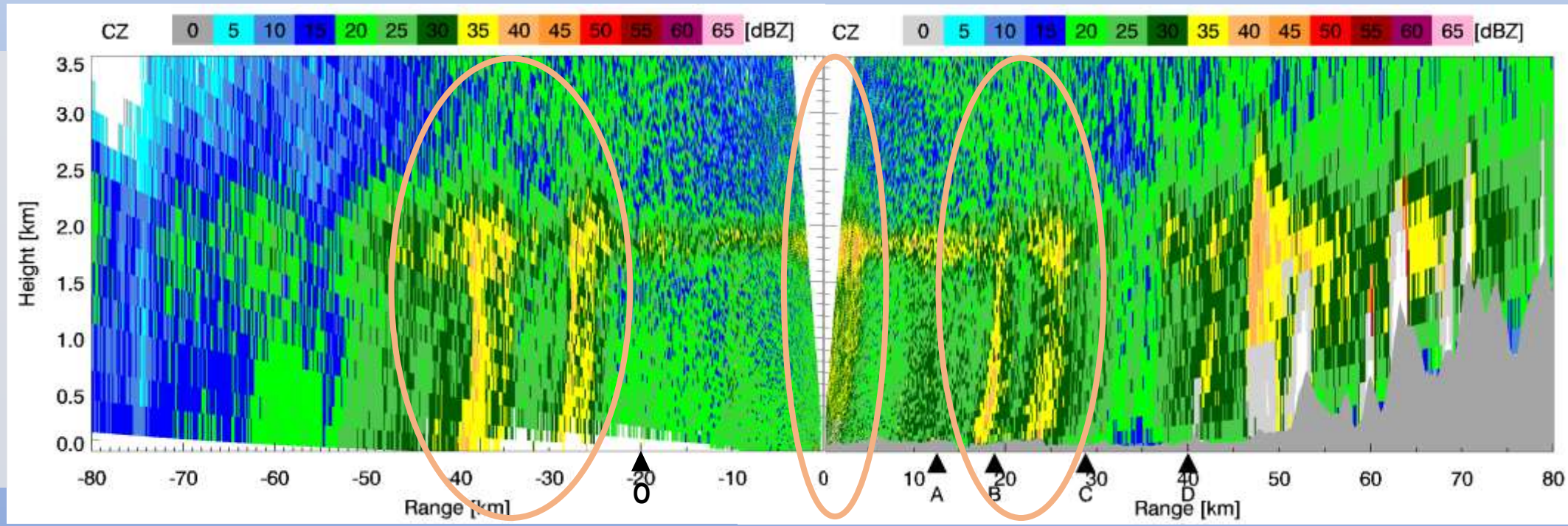
- Evolving system with shortwave trough
- ***Southerly component to flow***
- Early: Widespread stratiform, variability
- **GPM Core OP @ 1523**
- Ideal triple aircraft coordination
- Later: front-like shallow echo line with wind shift



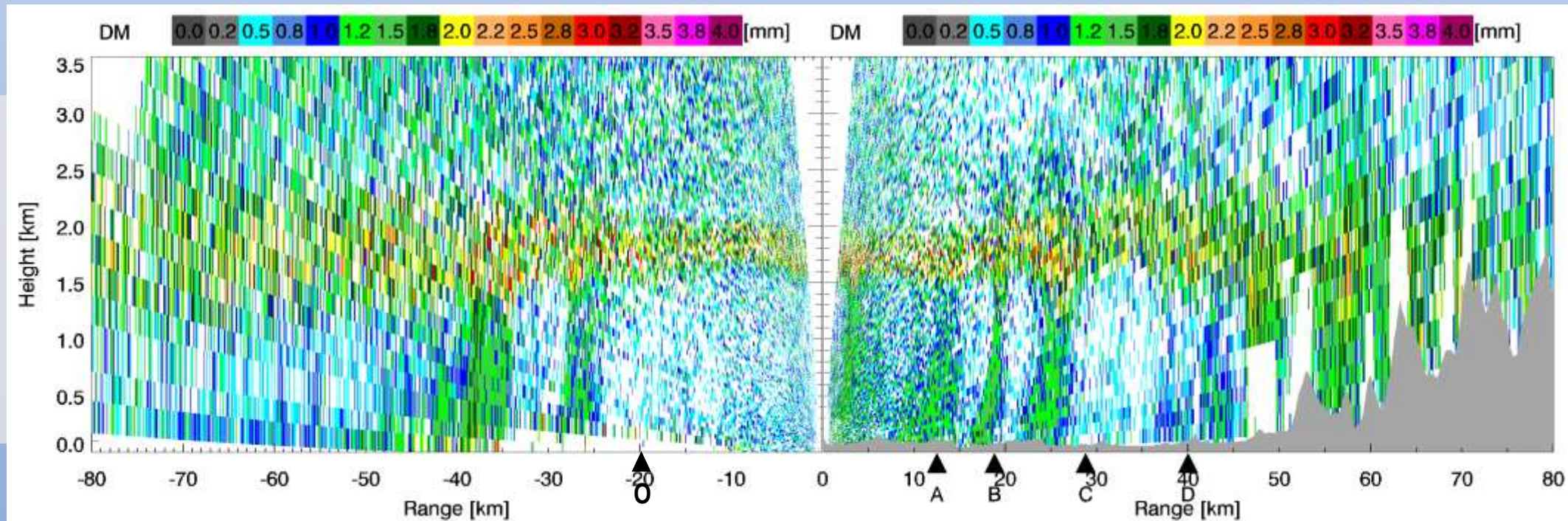
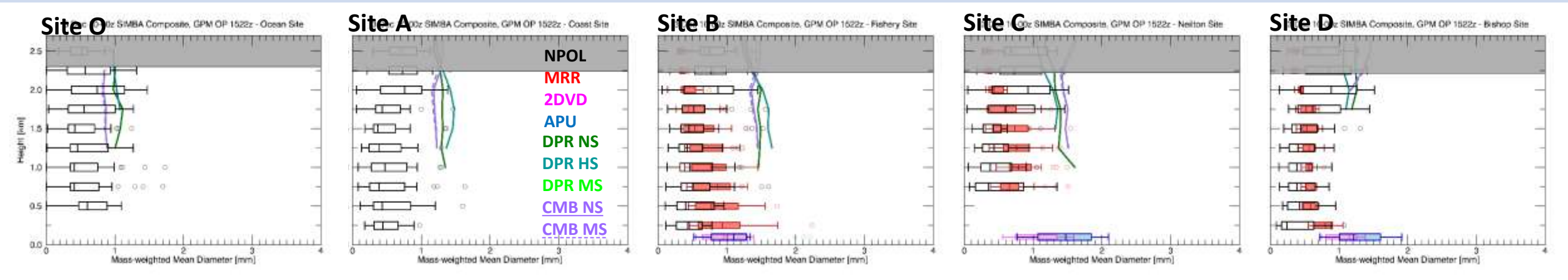
# 3 December: 14-00 UTC Composite Z



- Enhancement region locations – begin offshore
- **MRR** vs. **NPOL** – less discrepancy inland than for 17 Nov. composites
  - Flow orientation...

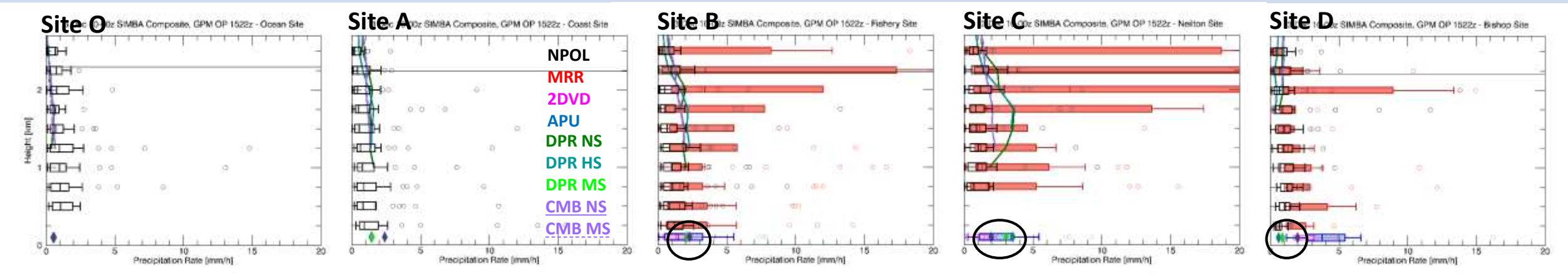


# 3 December: 14-00 UTC Composite $D_M$

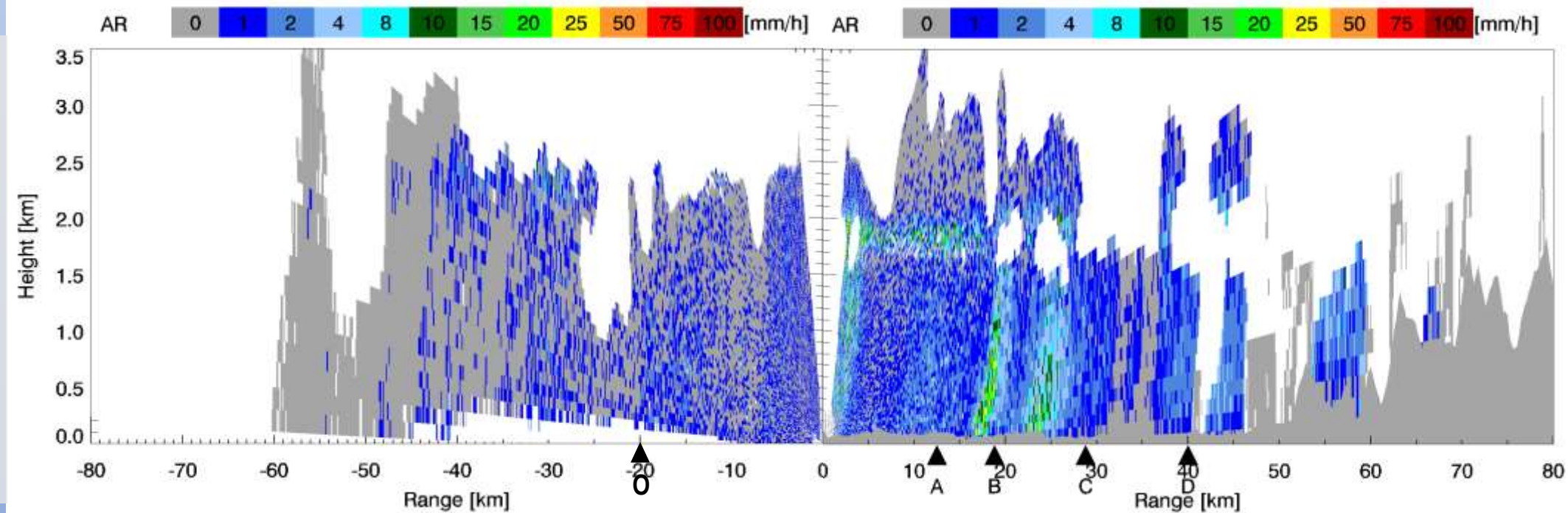


- DPR & CMB exceed ground-based IQR at all sites
- MRR trend opposite that of NPOL & nearer sfc ob values

# 3 December: 14-00 UTC Composite RR



- Composite rates generally more modest, still prefer regions
- Initial inland peak largest
- GPROF & DPR sfc values underestimate as move inland



# Additional perspective: Airborne Observations

- Continuing work:
  - Integrating airborne data
  - Ground-based HID + in situ
  - GPM Core + airborne “analogs”
- 12-13 Nov: Citation, DC-8
  - Legs across valley, GMI OP, NCFR
  - Variations in LWC aloft
- 3 Dec: Citation, DC-8, ER-2
  - Stacked legs/DPR OP, valley legs
  - Liquid water (including -20C)
- 8-9 Dec: DC-8, ER-2
  - Valley, GMI OP, offshore
  - Dropsondes - cross-AR structure



# Summary & Continuing Work

- OLYMPEX Atmospheric Rivers: GPM overpasses, Warm Sector /  $Fr > 1.3$ 
  - 6 events, over 100+h of obs, 8 GMI/2DPR Ops, 5 SIMBA sites
- *All Cases:*
  - Large variation of precipitation parameters
  - Enhancement at coast & as approach terrain barrier clear, but somewhat gradual
  - DPR aligns with ground-based observations **best over ocean**
- *17 Nov - Westerly flow case:*
  - Larger **MRR vs NPOL** discrepancy
  - More intense precipitation rates
  - Enhancement regions most prominent over land
- *3 Dec - Southerly component case:*
  - MRR & NPOL means better align
  - Generally lower precipitation rates
  - **Enhancement regions initiate offshore**

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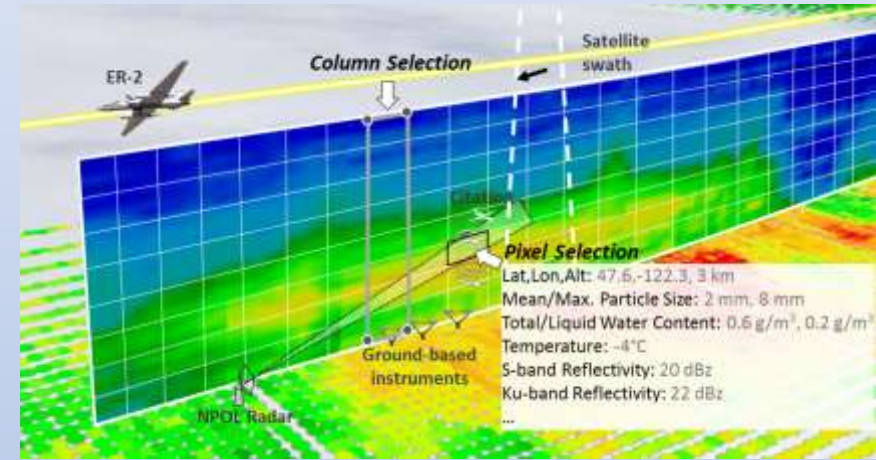
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  - **Enhancement regions initiate offshore**
- Processes, satellite-based observations involve more than below 0°C level
  - **ICE vs LIQ**, incorporating airborne data will improve analysis
  - Compositing with "analog" instruments
  - **PMW & CMB algorithm products** – impacts of ice and transition to higher terrain

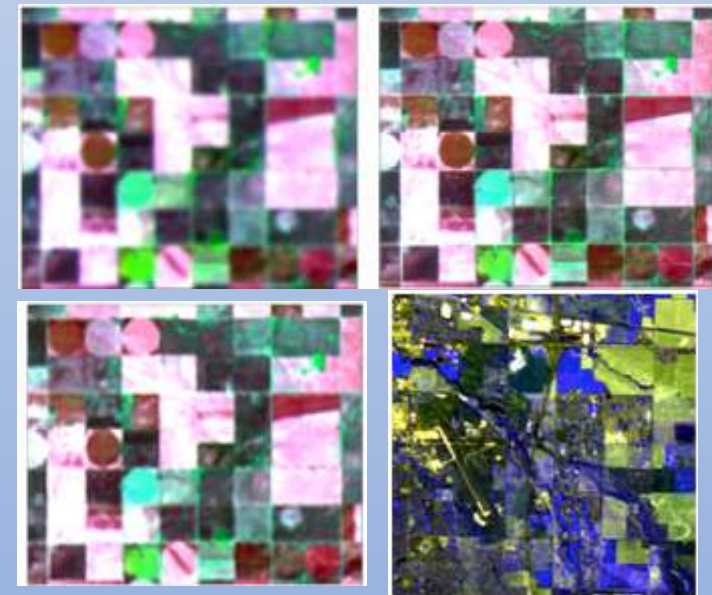


# Related Projects/ Ancillary Applications

- Long-term validation at WPRF
  - *Poster H43F-2470 (Thurs)*
- Visualization for Integrated Satellite, Airborne, and Ground-based data Exploration (VISAGE)
  - NASA AIST collaboration of UAH ITSC & MSFC/GHRC DAAC
  - *Poster IN51D-0609 (Fri)*
- Improving DPR spatial resolution via Machine Learning
  - Testing application of deep learning image resolution technology to satellite radar data
  - *Poster T31E-0363 (Wed)*



VISAGE concept schematic



Deep learning image resolution enhancement: input low, target high, output high res, output high res

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