

# **Radar microphysical retrievals and climatology of the vertical profiles of microphysical variables in different weather systems**

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Laboratory

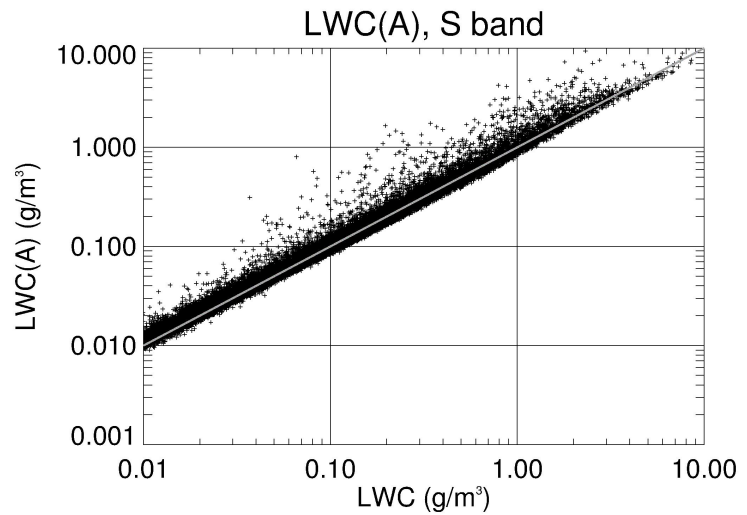
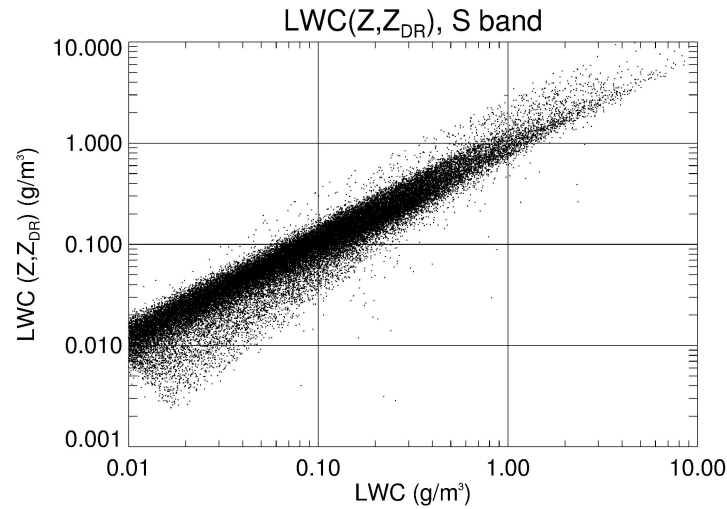
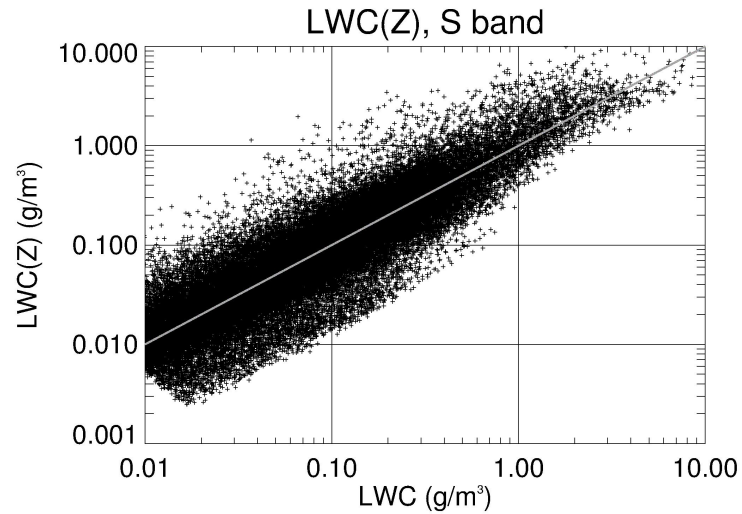
# Motivation

- The need to provide extensive observational reference for cloud modelers beyond very limited in situ microphysical data collected during field campaigns
- The need to improve microphysical parameterization in the NWP models using polarimetric radar observations
- The need to assimilate radar-derived microphysical parameters of hydrometeors to the NWP models
- The need for better quantification of precipitation using radar measurements (snow in particular)
- Recently introduced techniques for processing and visualization of the vertical profiles of radar variables and microphysical parameters such as QVP, RD-QVP, and CVP provide very efficient representation of the vertical storm structure and its evolution

## Key microphysical parameters to be determined

- Liquid water content of rain and snow / ice (LWC / IWC) ( $\text{g m}^{-3}$ )
- Mean volume diameter  $D_m = M_4/M_3$  (mm)
- Total number concentration  $N_t$  ( $\text{L}^{-1}$ )

# Radar estimates of liquid water content LWC



S band

$$LWC(Z) = 1.74 \cdot 10^{-3} Z^{0.64}$$

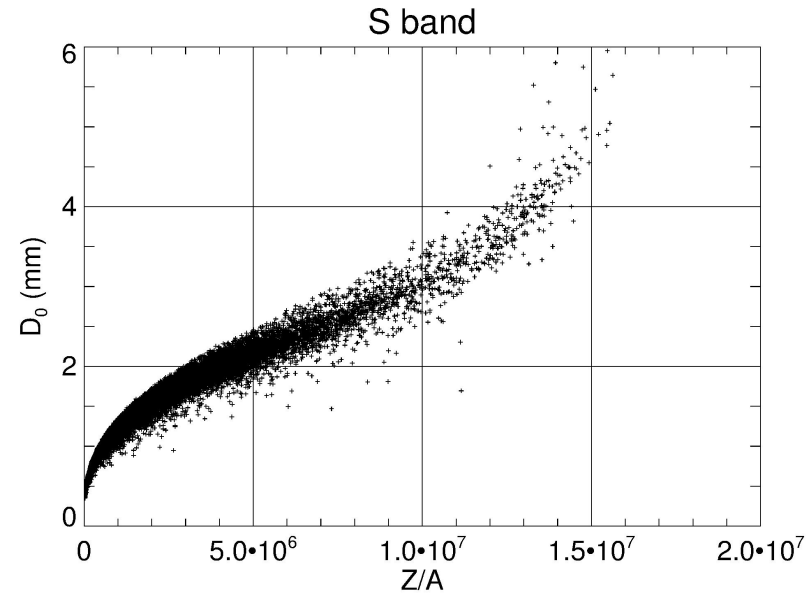
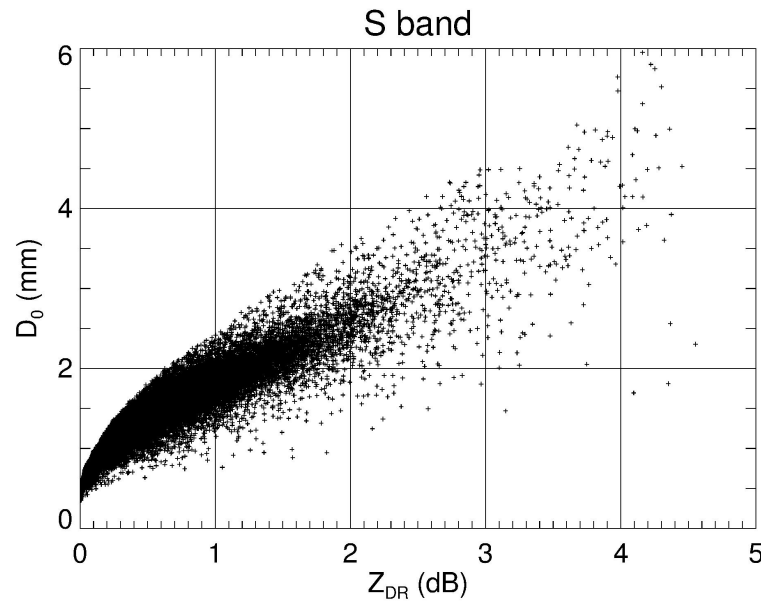
$$LWC(Z, Z_{DR}) = 1.38 \cdot 10^{-3} Z \cdot 10^{(-2.43 Z_{DR} + 1.12 Z_{DR}^2 - 0.176 Z_{DR}^3)}$$

$$LWC(A) = 115 A^{0.92}$$

$$[Z] = mm^6 m^{-3}, \quad [Z_{DR}] = dB, \quad [A] = dB / km, \quad [LWC] = deg / km$$



# Estimation of the mean volume diameter of raindrops $D_m$



Bringi and Chandrasekar (2001)

$$D_m = 1.62 Z_{DR}^{0.49}$$

Bringi et al. (2002)

$$D_m = 1.97 Z_{DR}^{0.49}$$

Brandes et al. (2002)

$$D_0 = 0.171Z_{DR}^3 - 0.725Z_{DR}^2 + 1.48Z_{DR} + 0.717$$

S band

T = 20°

$$D_m = 0.630 + 0.675x - 0.124x^2 + 0.0115x^3 - 0.00034x^4$$

$$x = \frac{Z}{A} 10^{-6}$$

$$[Z] = \text{mm}^6 \text{m}^{-3}, [Z_{DR}] = \text{dB}, [A] = \text{dB} / \text{km}, [D_m] = \text{mm}$$

Caveats:  $Z_{DR}$  should be well calibrated, A is a function of radar wavelength and temperature

## Estimation of the total number concentration of raindrops $N_t$

$$\log(N_t) = -2.37 + 0.1Z - 2.89Z_{DR} + 1.28Z_{DR}^2 - 0.213Z_{DR}^3$$

$Z$  is expressed in dBZ,  $Z_{DR}$  is in dB, and  $N_t$  is in  $L^{-1}$

# Relations for polarimetric microphysical retrievals in ice

$$(1) \quad IWC(K_{DP}, Z_{DR}) = 4.0 \times 10^{-3} \frac{K_{DP} \lambda}{1 - Z_{dr}^{-1}}$$

$$\rho_s = a D^{-1}$$

$$(2) \quad IWC(K_{DP}, Z) = 3.3 \times 10^{-3} (K_{DP} \lambda)^{0.67} Z^{0.33}$$

$$Z_{dr} = 10^{0.1 Z_{DR} (dB)}$$

$$Z_{DP} = Z_H - Z_V$$

$$(3) \quad D_m(K_{DP}, Z_{DP}) = -0.1 + 2.0 \left( \frac{Z_{DP}}{K_{DP} \lambda} \right)^{1/2}$$

$\lambda$  is the radar wavelength in mm

$$(4) \quad D_m(K_{DP}, Z) = 0.67 \left( \frac{Z}{K_{DP} \lambda} \right)^{1/3}$$

$Z$  is in  $\text{mm}^6 \text{m}^{-3}$

$Z_{DP}$  is in  $\text{mm}^6 \text{m}^{-3}$

$K_{DP}$  is in  $\text{deg/km}$

$$(5) \quad \log(N_t) = 3.39 + 2 \log(IWC) - 0.1 Z (dBZ)$$

$IWC$  is in  $\text{g m}^{-3}$

$D_m$  is in mm

$N_t$  is in  $\text{l}^{-1}$

Eqs. (1) and (3) are utilized if  $Z_{DR} > Z_{DR}^{(t)}$  and Eqs (2) and (4) are used otherwise ( $Z_{DR}^{(t)} = 0.4$  dB)

Estimates (1) and (3) are immune to the variability of the particles' shapes and orientations

# Assumptions and limitations

- Rain retrieval relations have been obtained for S band based on the simulations using large DSD dataset obtained in Oklahoma
- Ice retrieval relations have been derived assuming that snowflake / crystals is the dominant habit and high-density graupel / hail is absent
- Some of the ice retrieval relations are derived with certain assumptions about particle shape, orientations, and degree of riming
- Ice particles are assumed to be Rayleigh scatterers
- Ice retrieval relations are valid if a single habit dominates the mixture
- All retrievals are valid for particles larger than 0.05 – 0.1 mm
- Additional microphysical retrievals are possible in convective downdrafts but not updrafts

$$\rho_s(D) = 0.917 \text{ g/cm}^3 \quad D \times D_t \leq 1 \text{ mm} \quad IWC \sim M_3 \quad Z \sim M_6 \quad K_{DP} \sim M_3$$

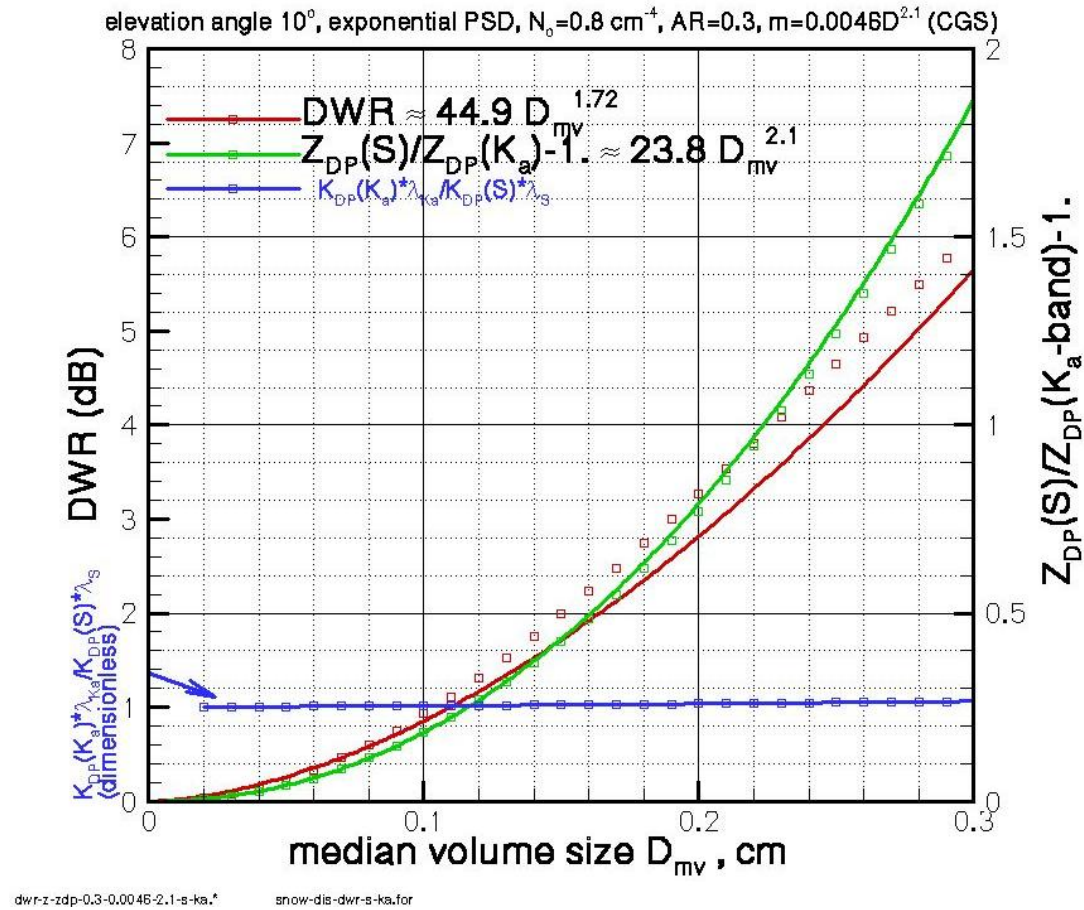
$$\rho_s(D) = 0.1 f_{rim} D^{-1} \quad D > D_t \quad f_{rim} = 1 / (1 - FR) \quad FR \text{ is rime mass ratio} \quad IWC \sim M_2 \quad Z \sim M_4 \quad K_{DP} \sim M_1$$

# Estimation of the mean volume diameter using dual-wavelength ratios (DWR)

## DWR (S, Ka)

$$DWR(S, Ka) = 44.9 D_m^{1.72}$$

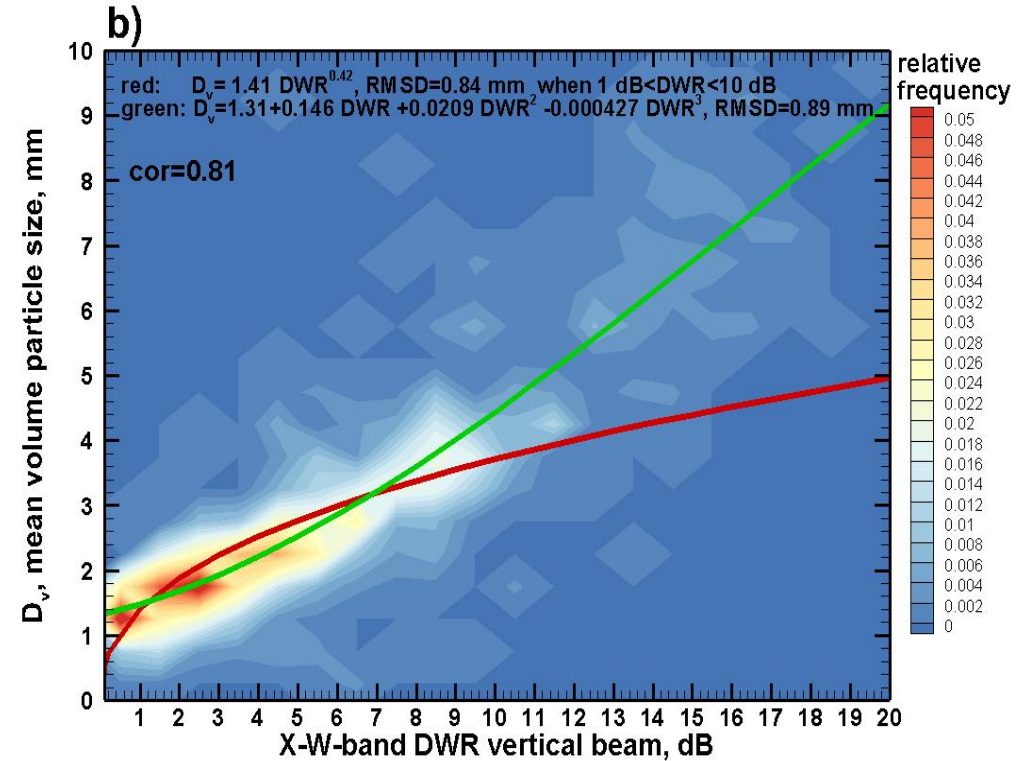
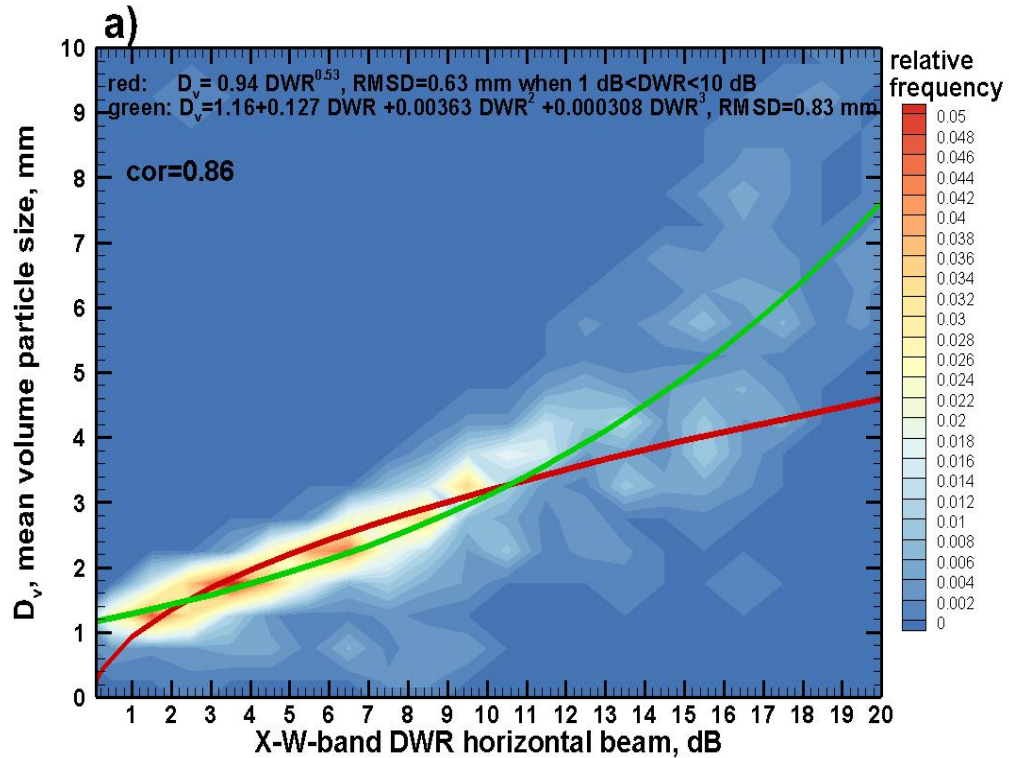
Courtesy of  
Sergey  
Matrosov



# DWR (X, W)

## Summary of all ICICLE flights

Matrosov et al. 2022



$$D_m = 1.16 + 0.127 DWR + 0.0063 DWR^2 + 0.000308 DWR^3$$

$$D_m = 1.31 + 0.146 DWR + 0.0209 DWR^2 + 0.000427 DWR^3$$



# Microphysics of landfalling hurricanes

Harvey 20170825-1500 UTC

Florence 20180915-1500 UTC

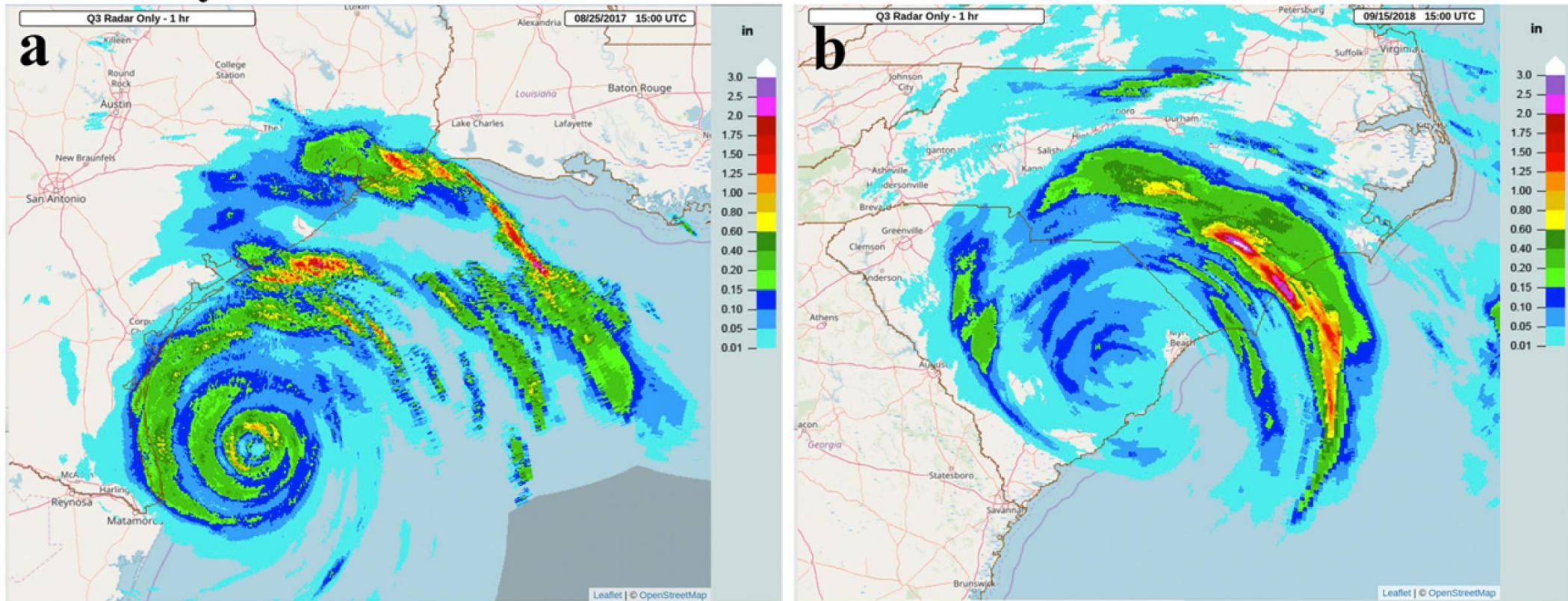
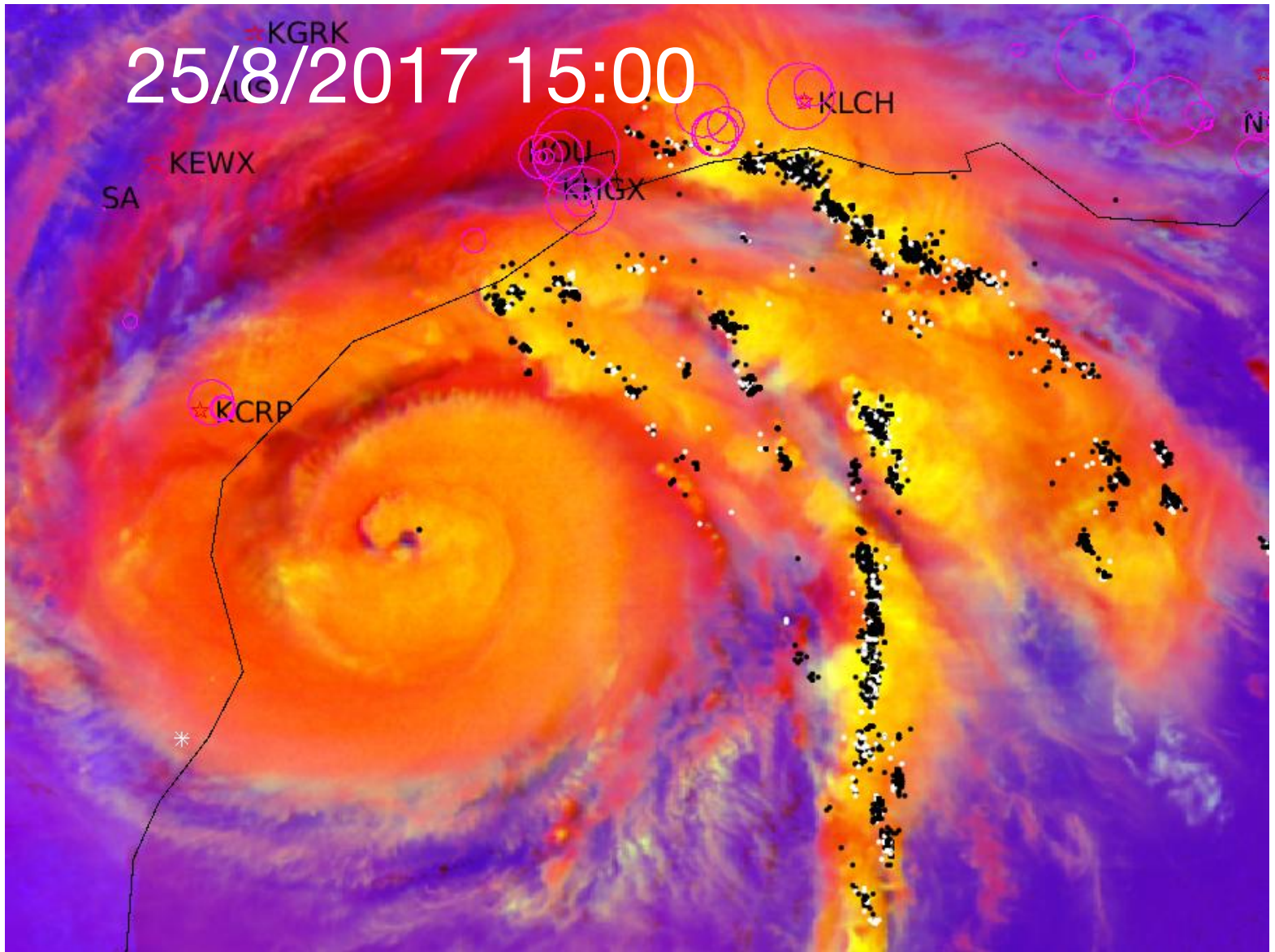


FIG. 3. The 1-h cumulative radar QPEs from MRMS for (a) Harvey for 1500–1600 UTC 25 Aug 2017 and (b) Florence for 1500–1600 UTC 15 Sep 2018





# Integration of the polarimetric radar, satellite, and lightning information

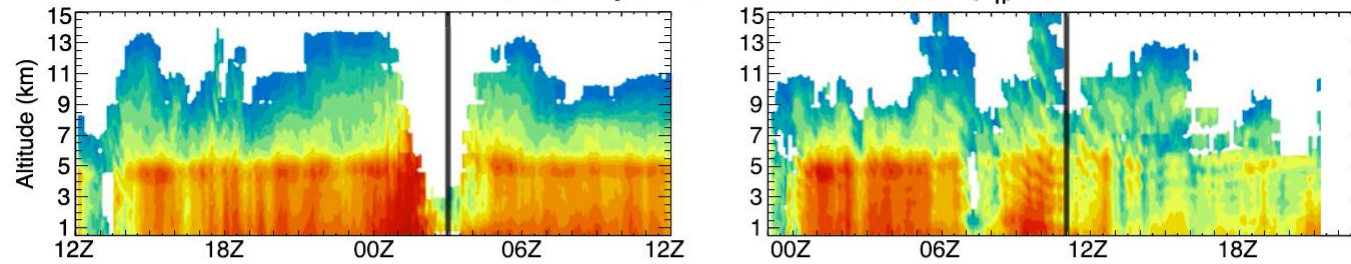
Hu, J., D. Rosenfeld, A. Ryzhkov, and P. Zhang, 2020: Synergetic use of the WSR-88D radars, GOES-R satellites, and lightning sensors to study microphysical characteristics of hurricanes. *J. Appl. Meteor. Clim.*, **59**, 1051 – 1068.



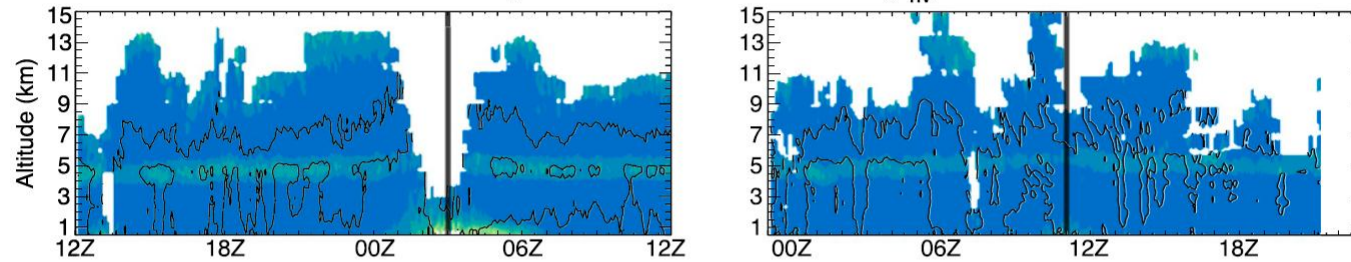
# Hurricane Harvey

# Hurricane Florence

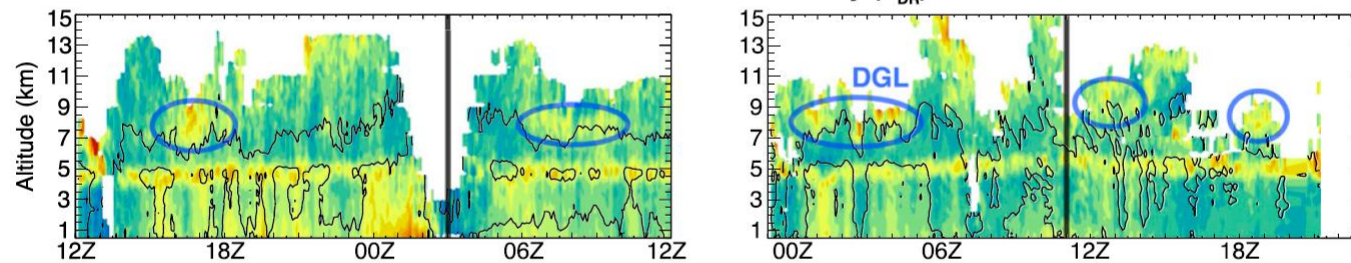
Radar Reflectivity at Horizontal Polarization ( $Z_H$ )



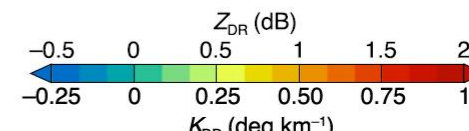
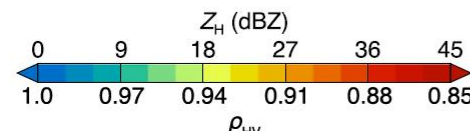
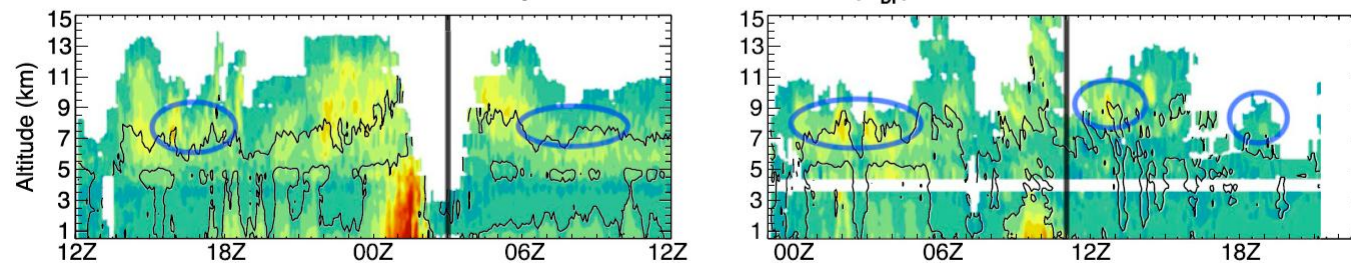
Copolar Correlation Coefficient ( $\rho_{HV}$ )



Differential Radar Reflectivity ( $Z_{DR}$ )



Specific Differential Phase ( $K_{dp}$ )



## CVPs of polarimetric radar variables for two hurricanes

Homeyer, C., A. Fierro, B. Schenkel, A. Didlake, G. McFarquhar, A. Ryzhkov, J. Basara, A. Murphy, J. Hu, 2021: Polarimetric signatures in landfalling tropical cyclones. *Mon. Wea. Rev.*, **149**, 131 – 154

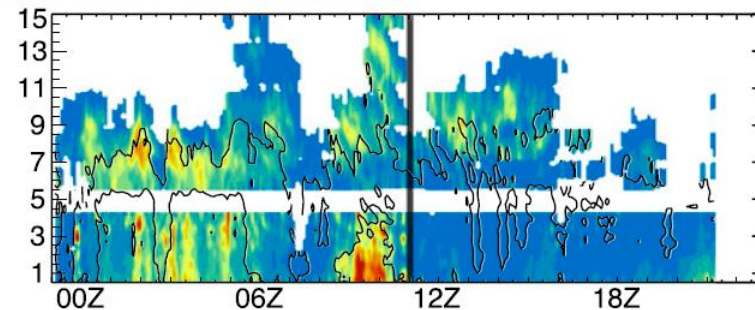
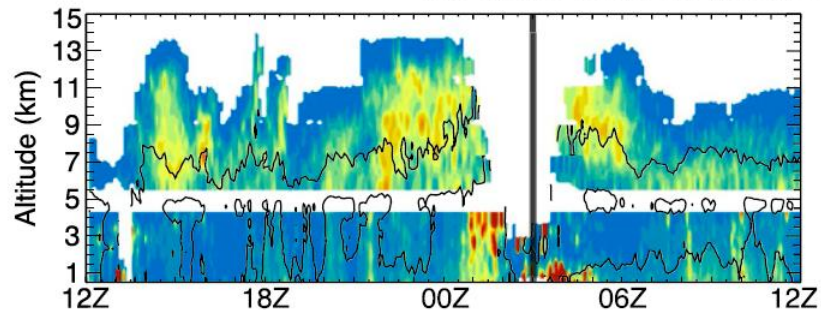
- Warm rain below the ML
- Upward displacement of the ML near the eyewall
- Abundance of small ice aloft



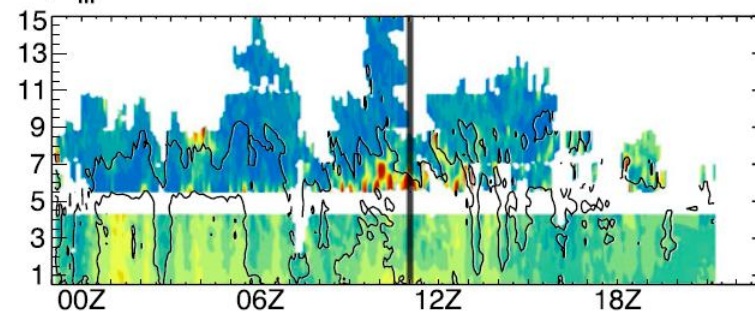
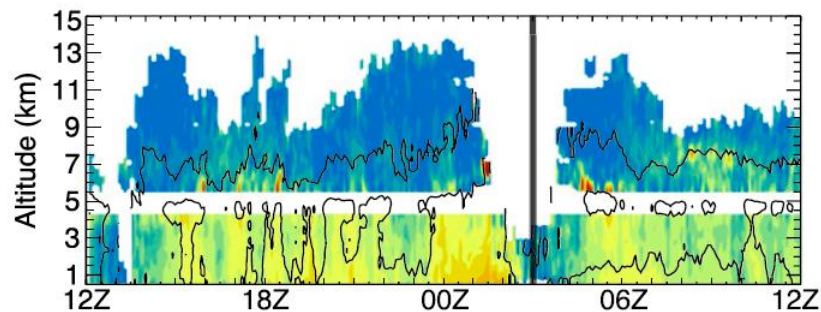
# Hurricane Harvey

# Hurricane Florence

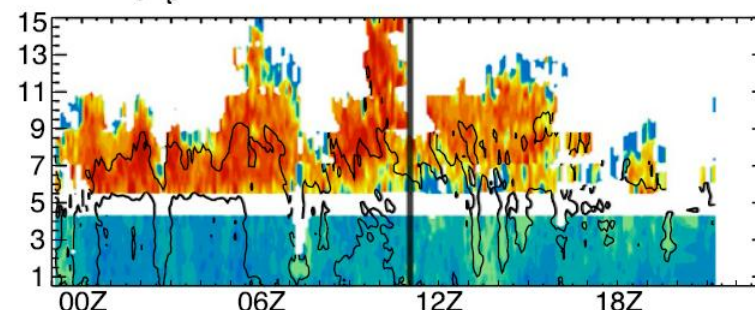
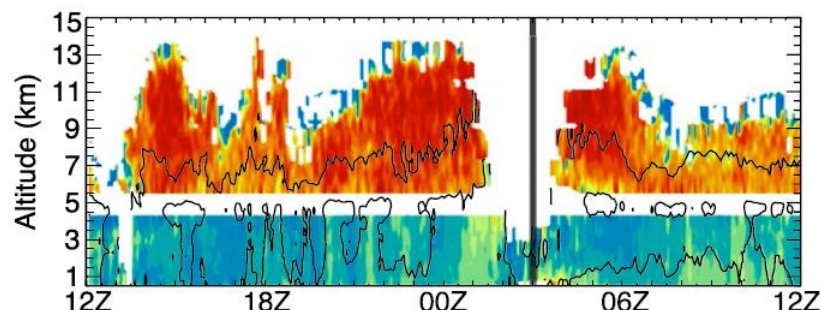
## Ice Water Content (IWC) & Liquid Water Content (LWC)



## Particle Size ( $D_m$ )



## Particle Concentration ( $N_t$ )



25 August 2017

26 August 2017

14 September 2018

IWC/LWC ( $\text{g m}^{-3}$ ) or  $D_m$  (mm)

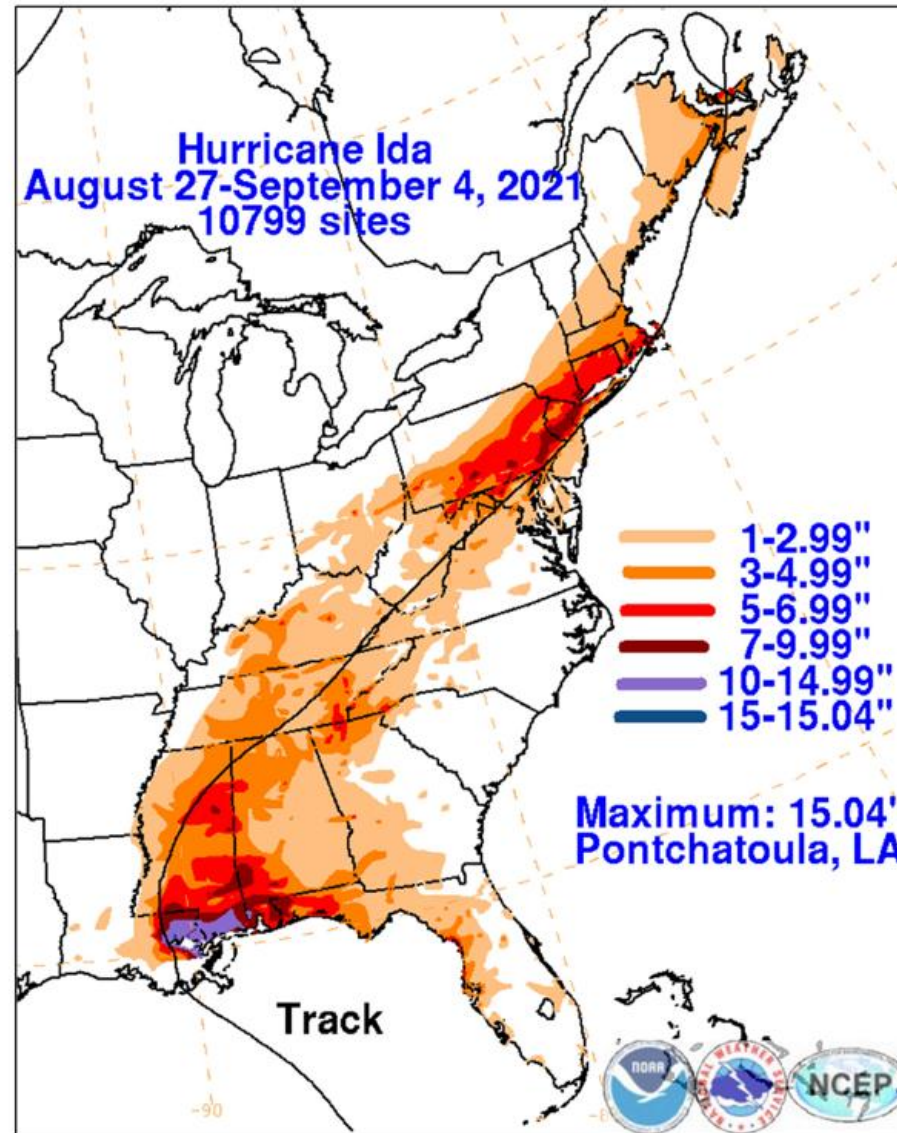


$N_t$  ( $\log_{10}(\text{L}^{-1})$ )

Homeyer et al. 2021

- Very high total number concentration of ice
- Small size of ice

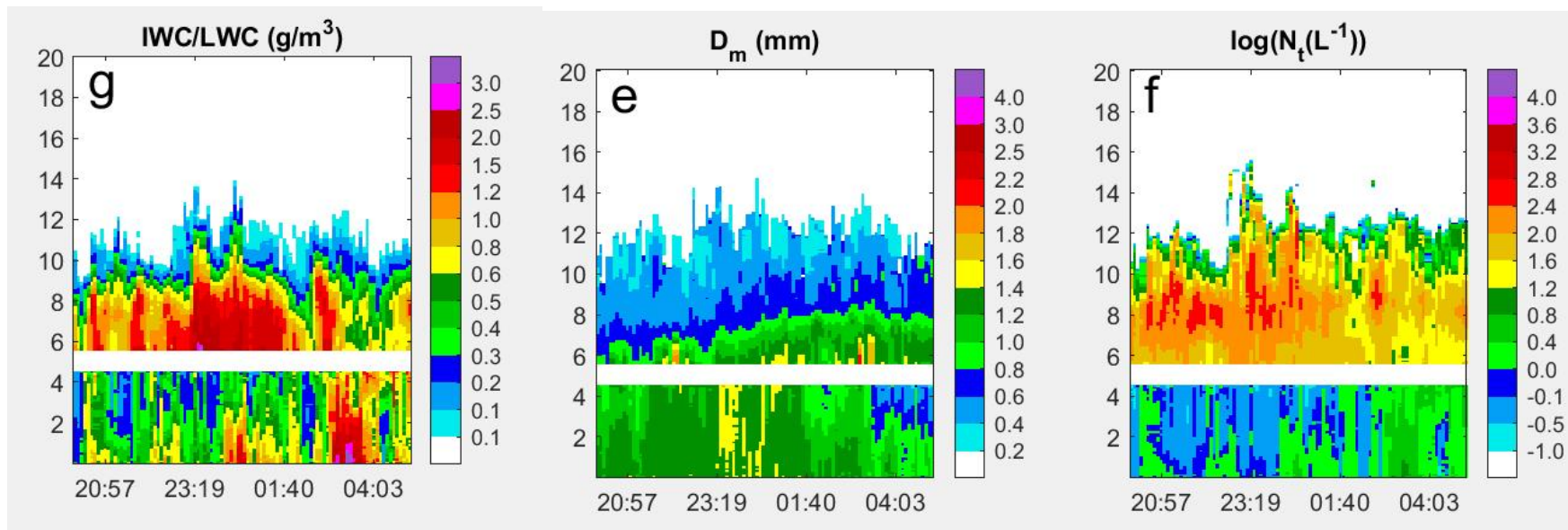
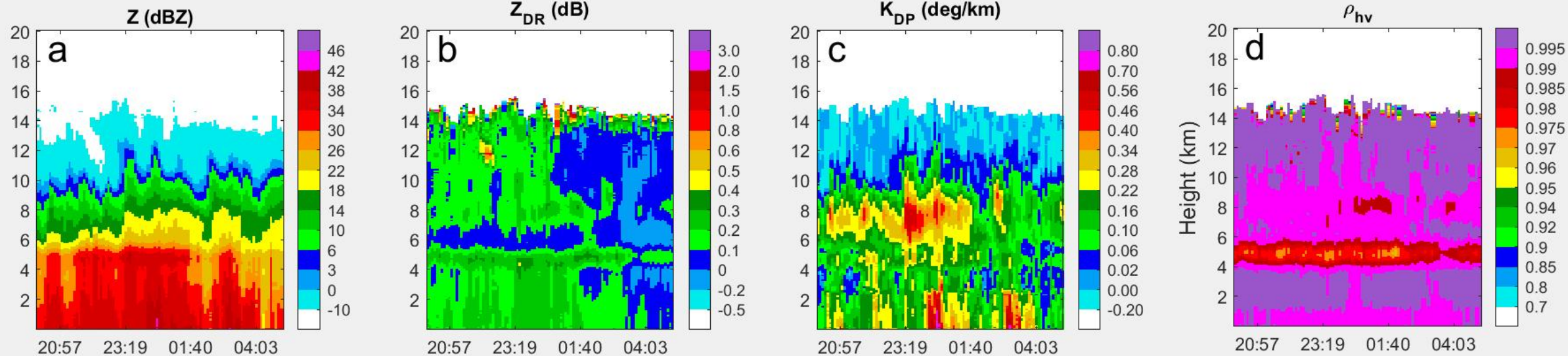
# Hurricane Ida track and rain amount





# Louisiana

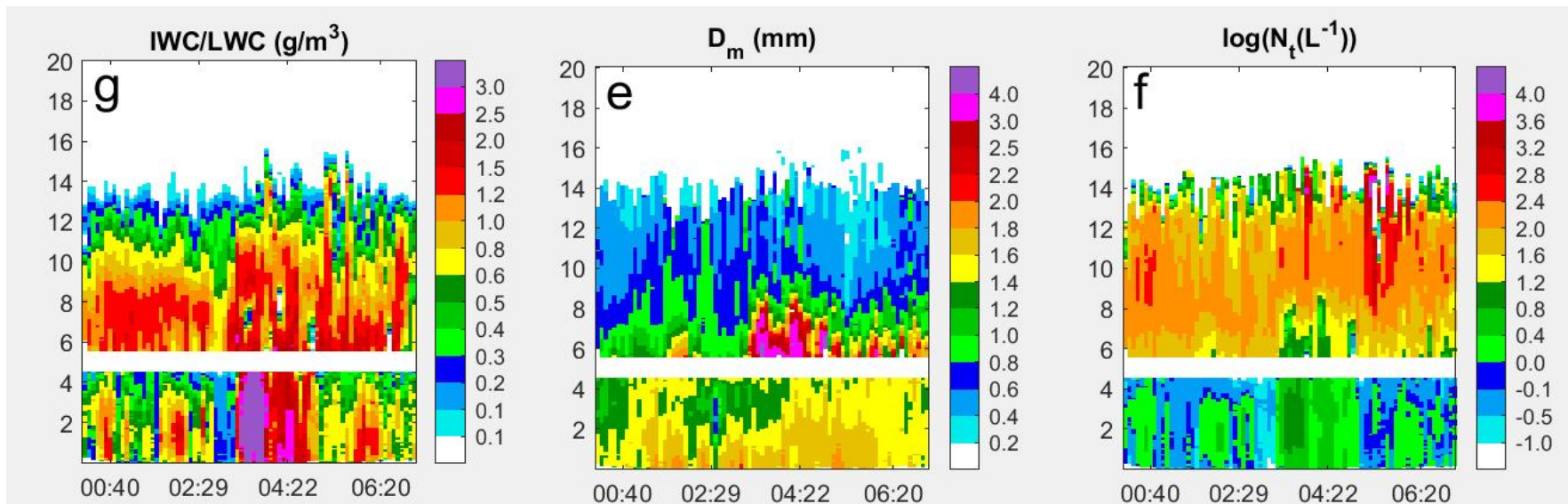
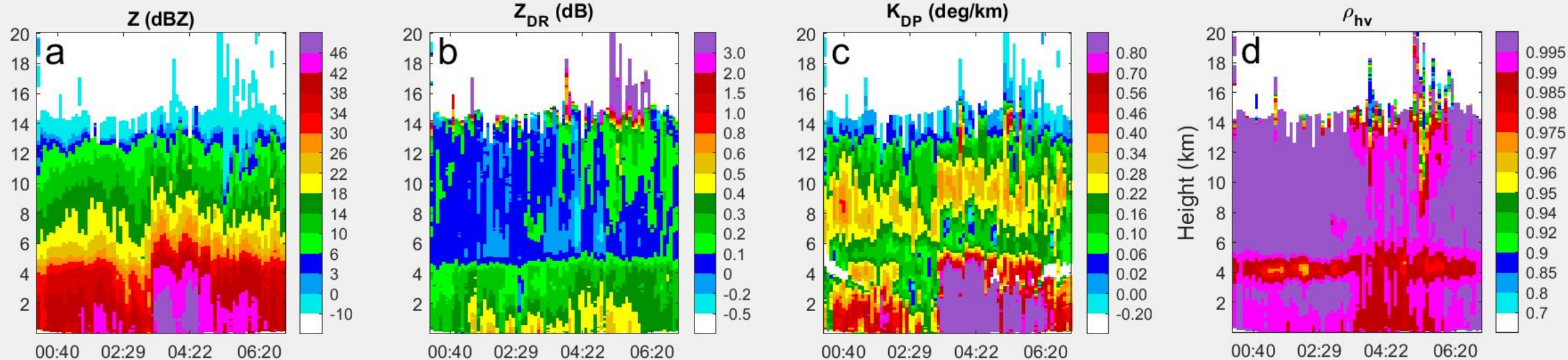
CVP KLIX 20210829 azi=20 km=20





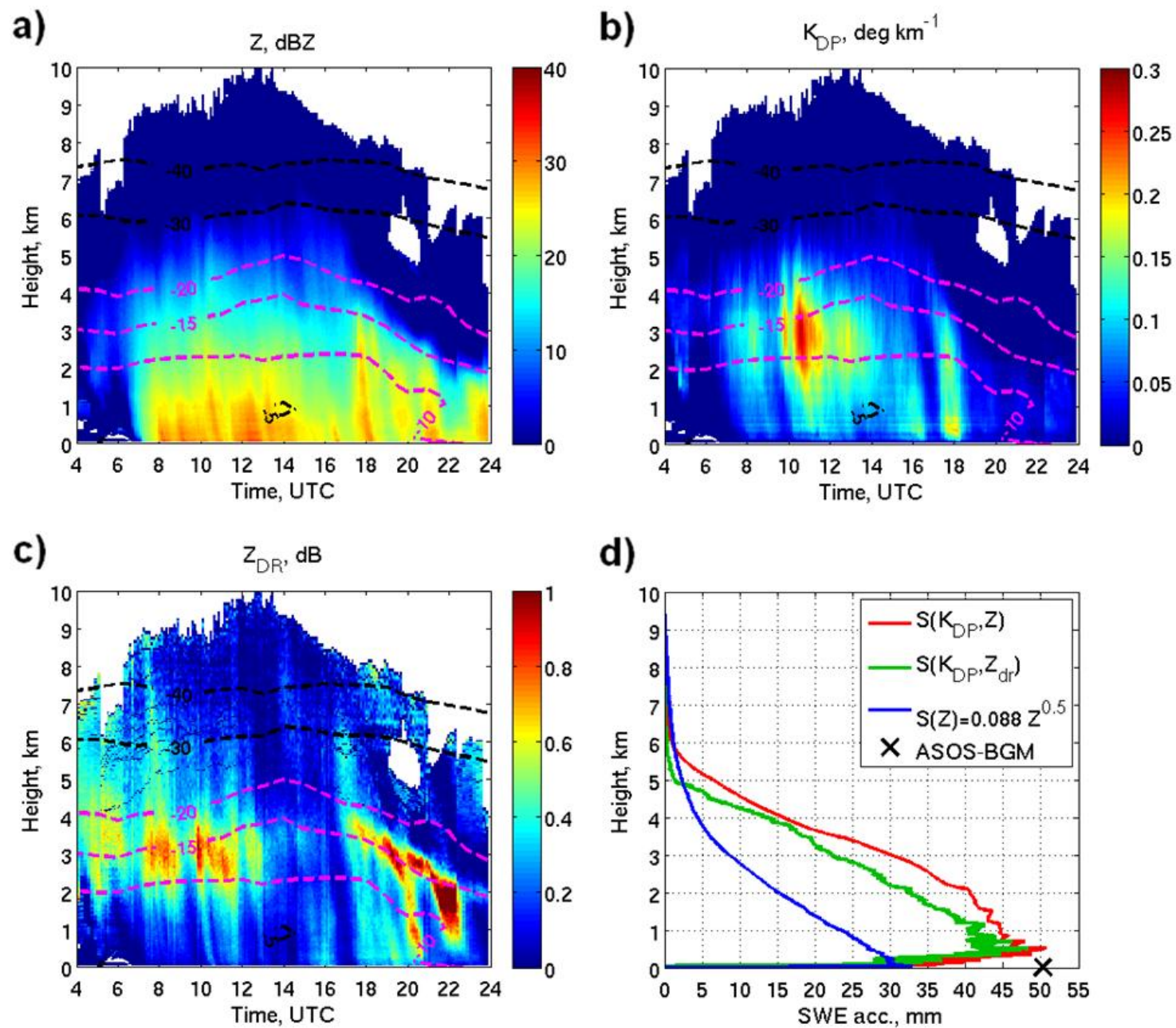
CVP KOKX 20210902 azi=20 km=20

NYC area



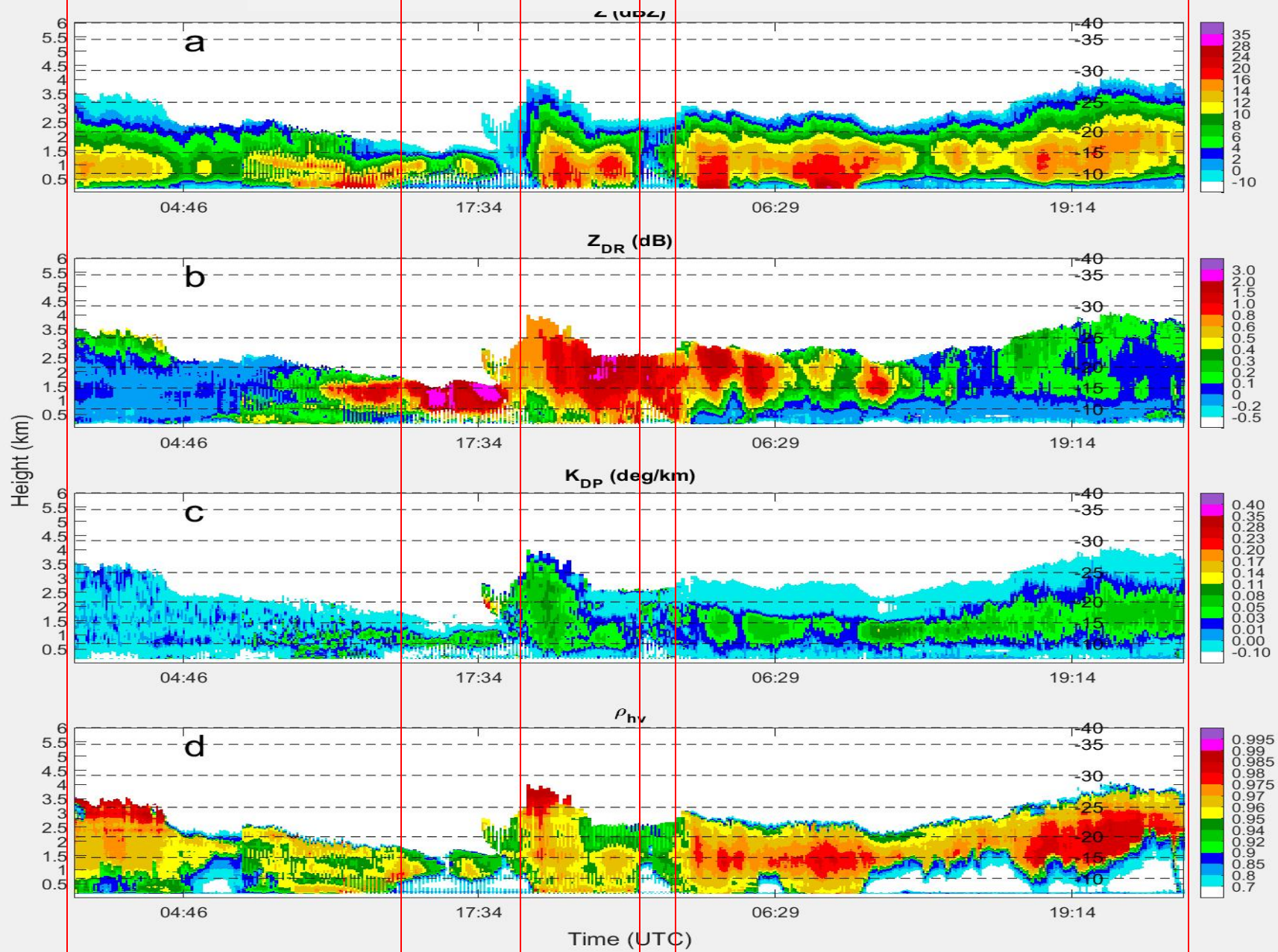
KBGM WSR-88D  
radar

Snowstorm Stella

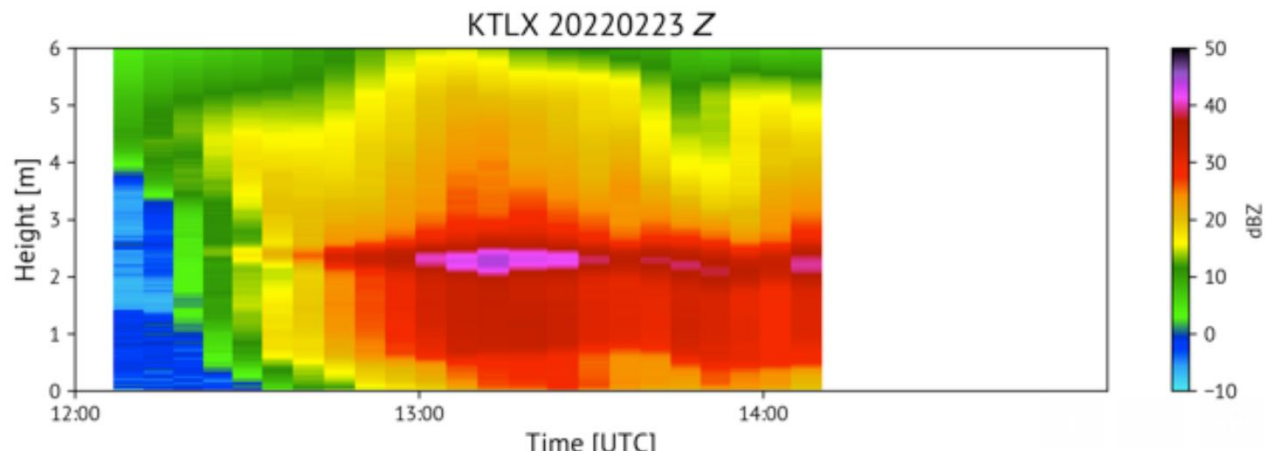




# Lake effect snow



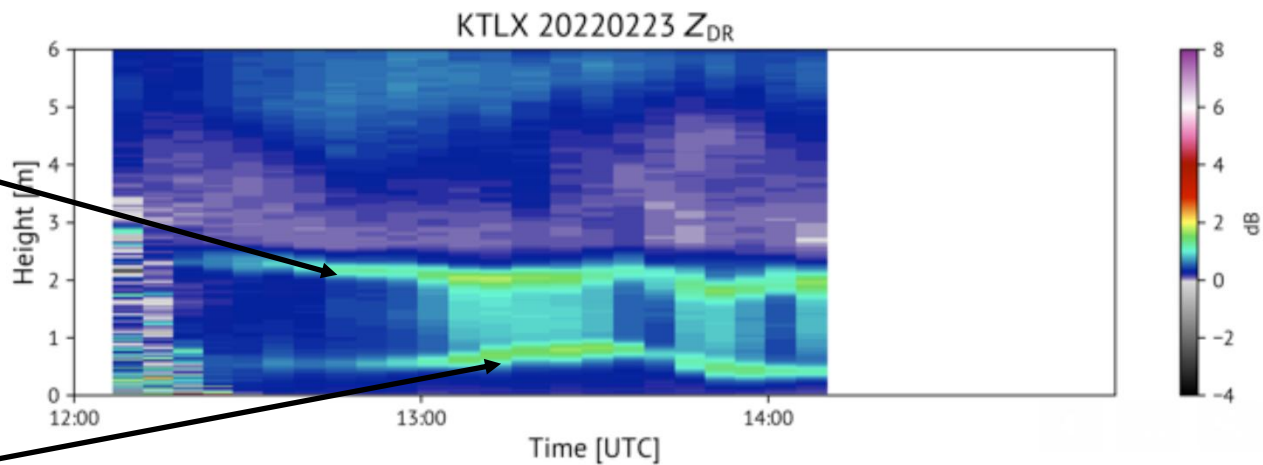
# Melting and refreezing layers (ML and RL)



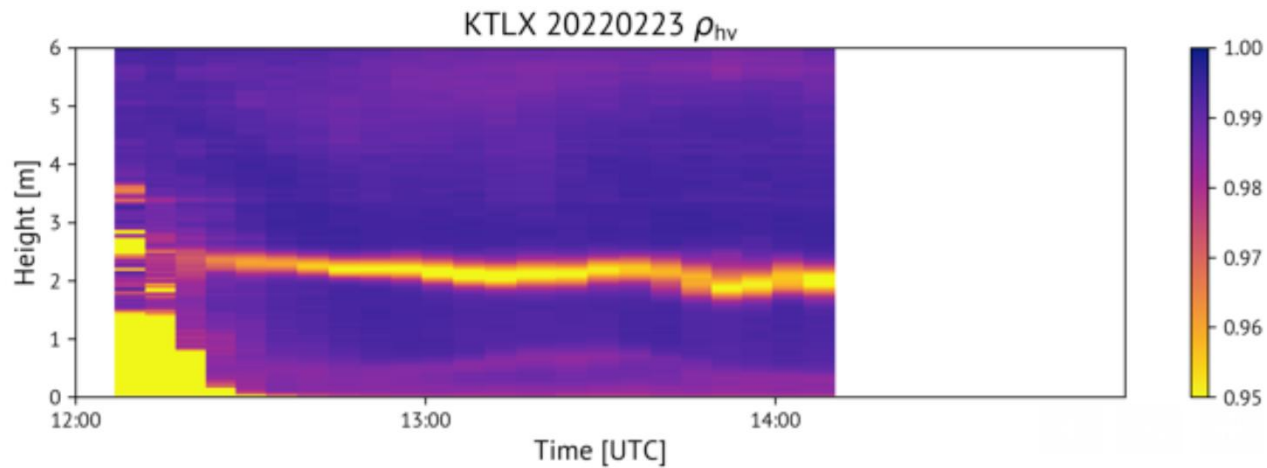
S band

Refreezing layer indicates transition from freezing rain to ice pellets

M  
L



RL





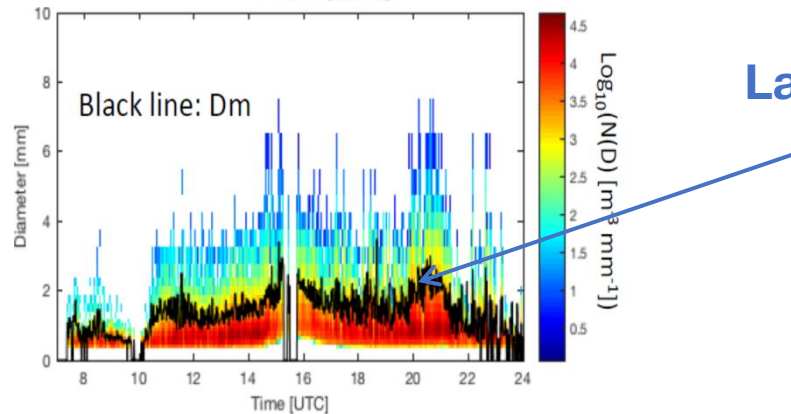
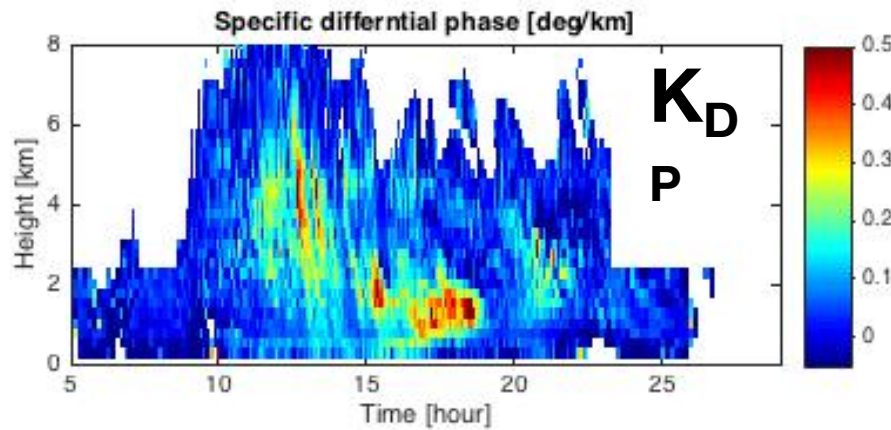
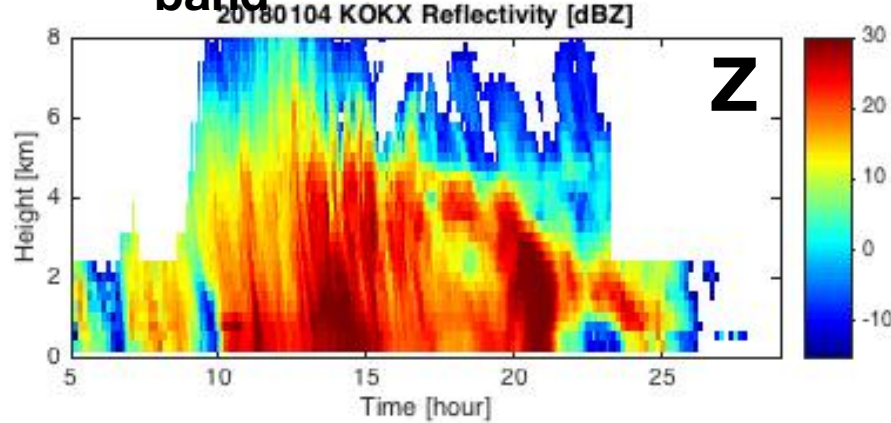
# Validation of the ice microphysical retrievals

Ground-based measurements at the Stony Brook University radar facility

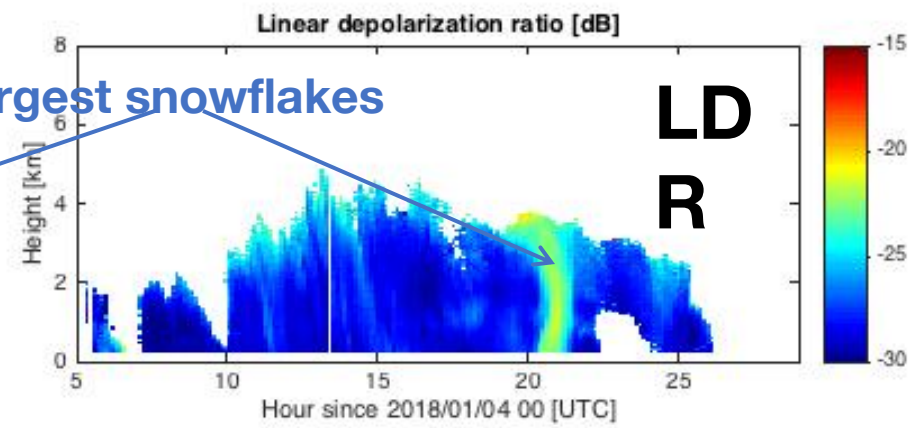
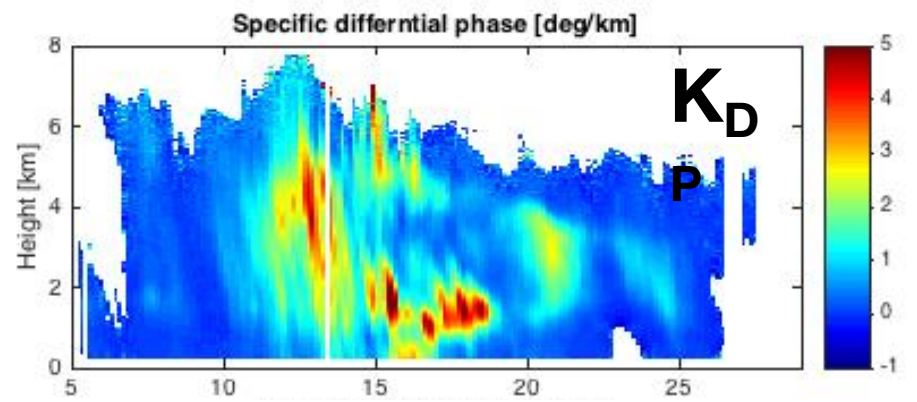
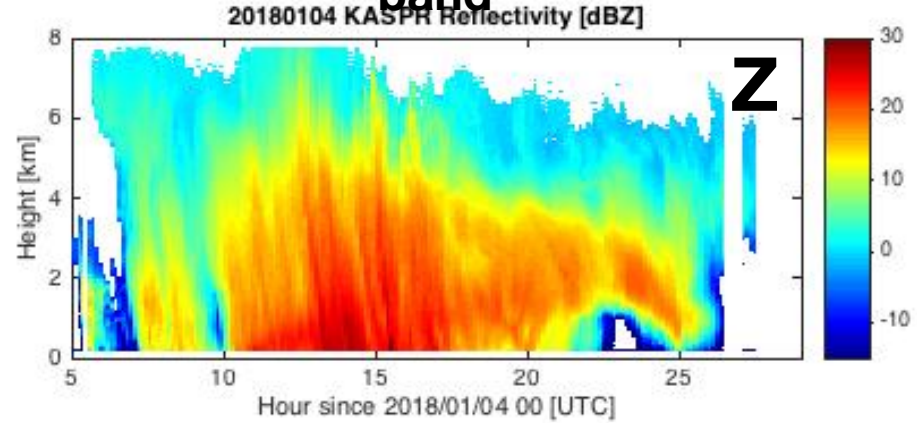
**Ka band / S band polarimetric radars**



# KOKX WSR-88D S band



# KASPR Ka band



Largest snowflakes

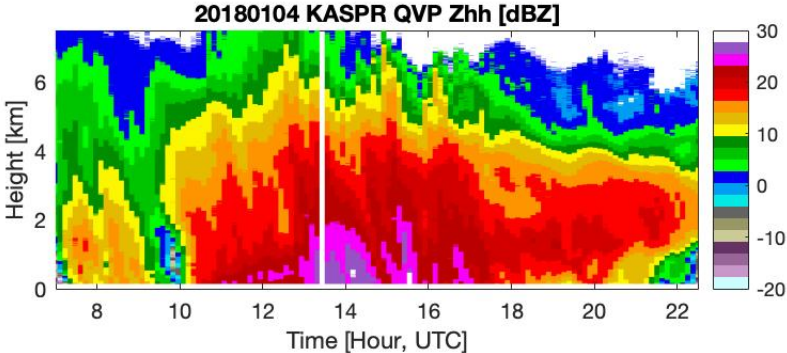
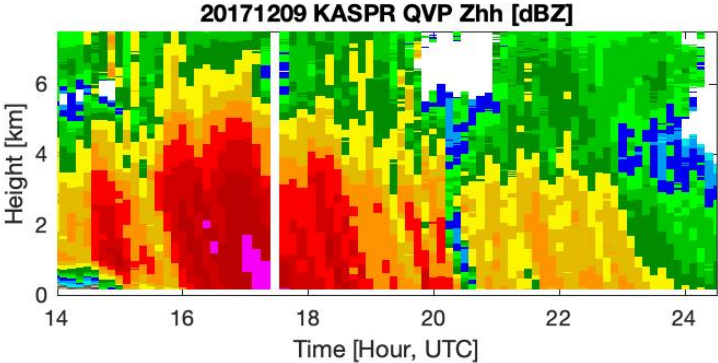
## Utilization of a short-wavelength radar in combination with a long-wavelength radar

- Polarimetric ice retrieval formulas are valid for Rayleigh scatterers and may not be applicable for snow at Ka band if  $DWR \gg 0$  dB
- Because  $K_{DP}$  is affected only by Rayleigh-size particles in the spectrum, the product  $K_{DP}\lambda$  is almost constant in a wide range of radar frequencies (Ka – S)
- There are two possible ways to make ice retrievals at Ka band
  - (1) Utilize  $K_{DP}\lambda$  measured at Ka band and  $Z$  and  $Z_{DP}$  measured at longer wavelength or
  - (2) Use Matrosov's formulas to correct  $Z$  and  $Z_{DP}$  at Ka band

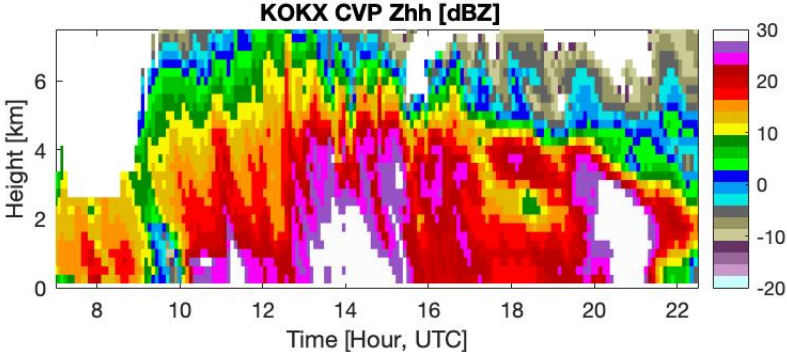
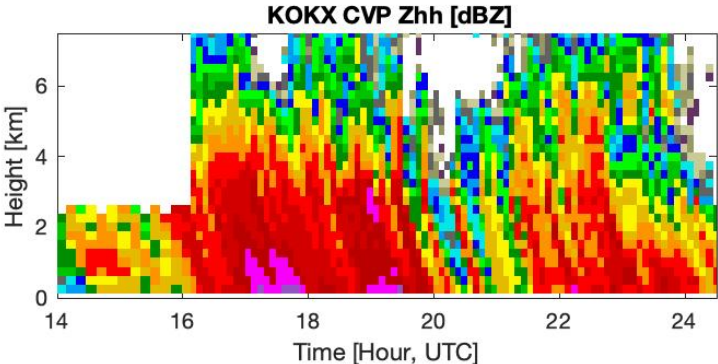


# Ka-band QVP and S-band CVP of Z and DWR for two snowstorms

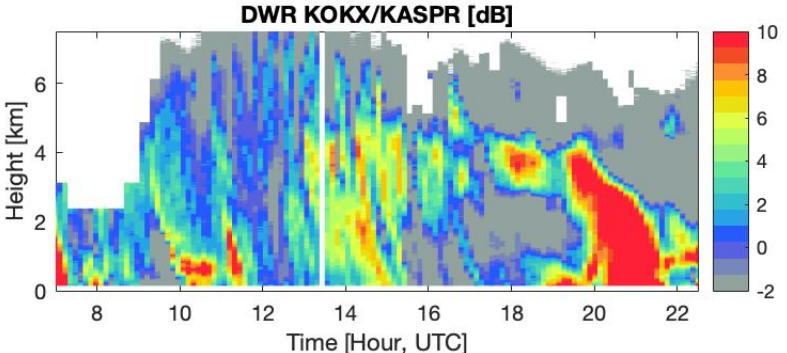
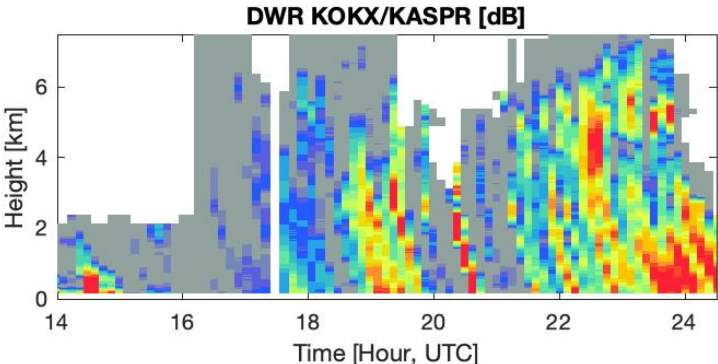
**Ka-band  
Z**



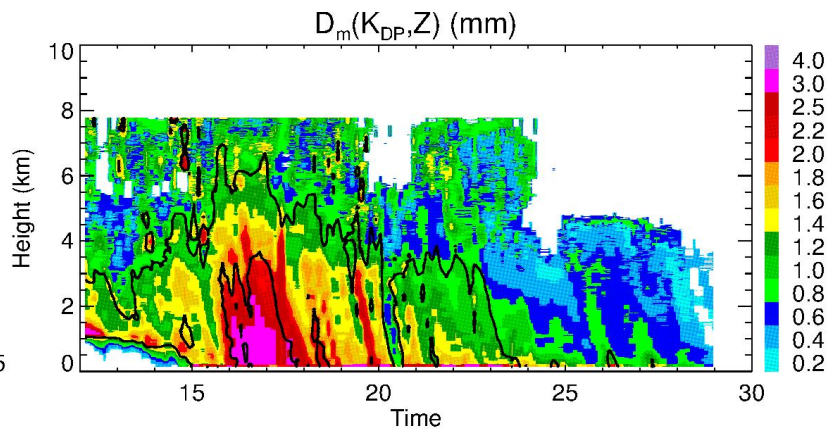
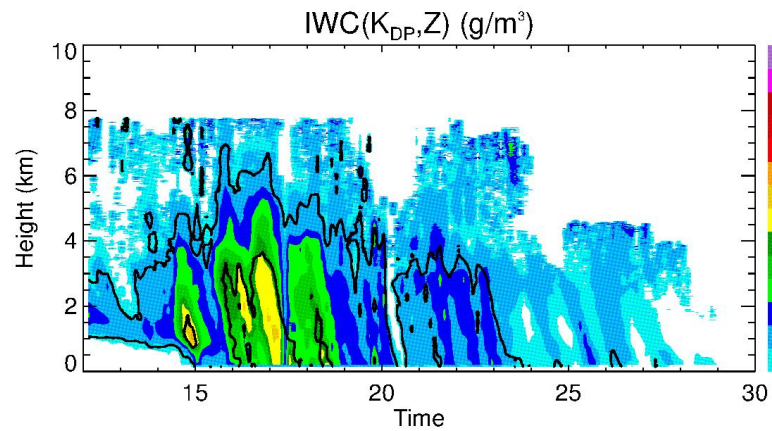
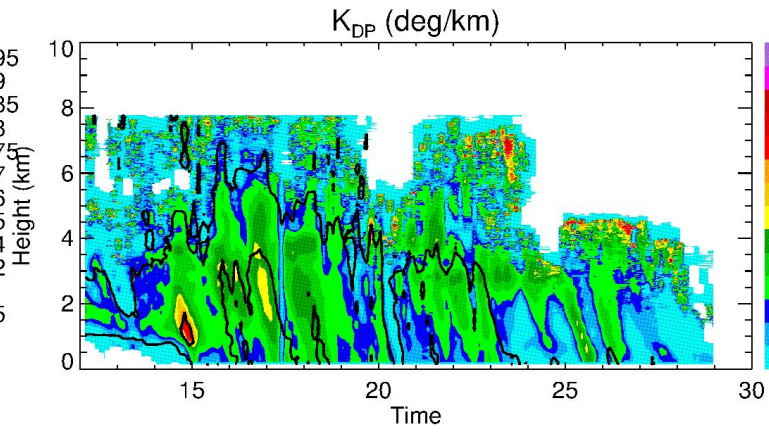
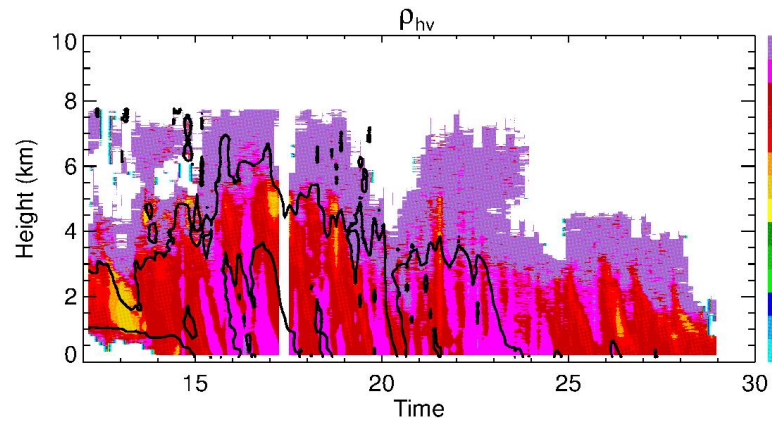
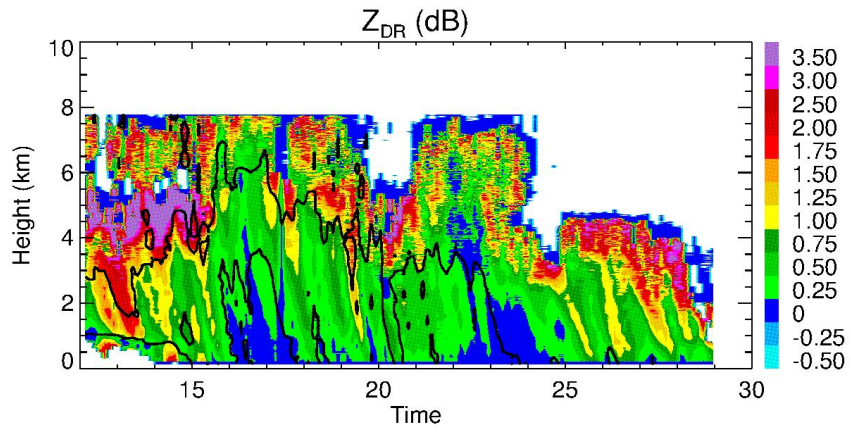
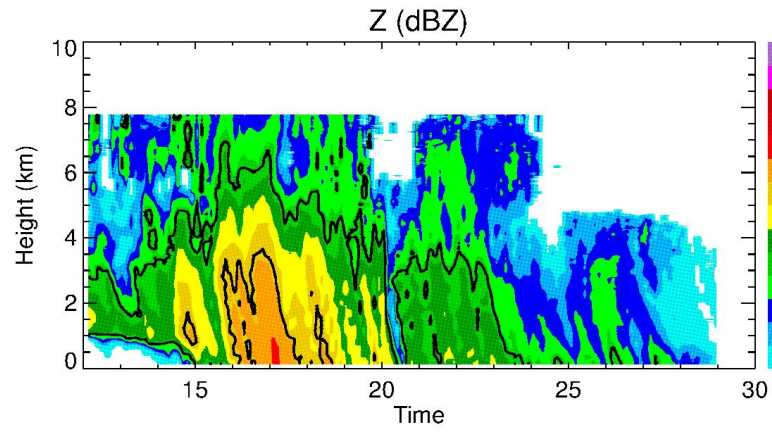
**S-band Z**



**DWR**



2017/12/09



**IWC and  $D_m$   
retrieved from  
Ka-band  
measurement  
S**



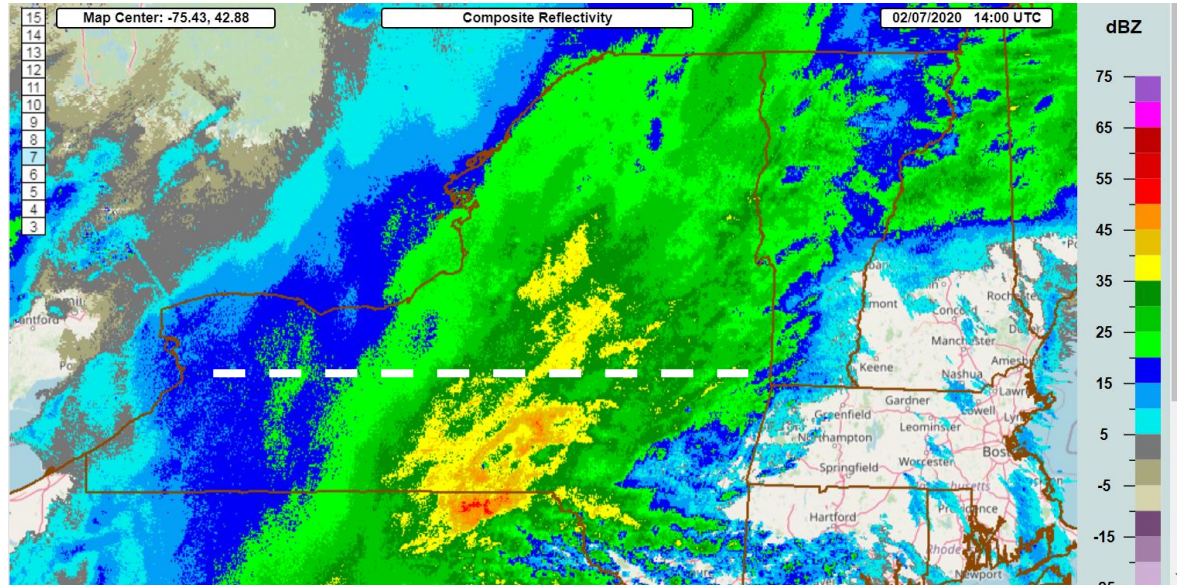
# IMPACTS

The Investigation of **M**icrophysics and **P**recipitation for **A**tlantic **C**oast-**T**hreatening **S**nowstorms

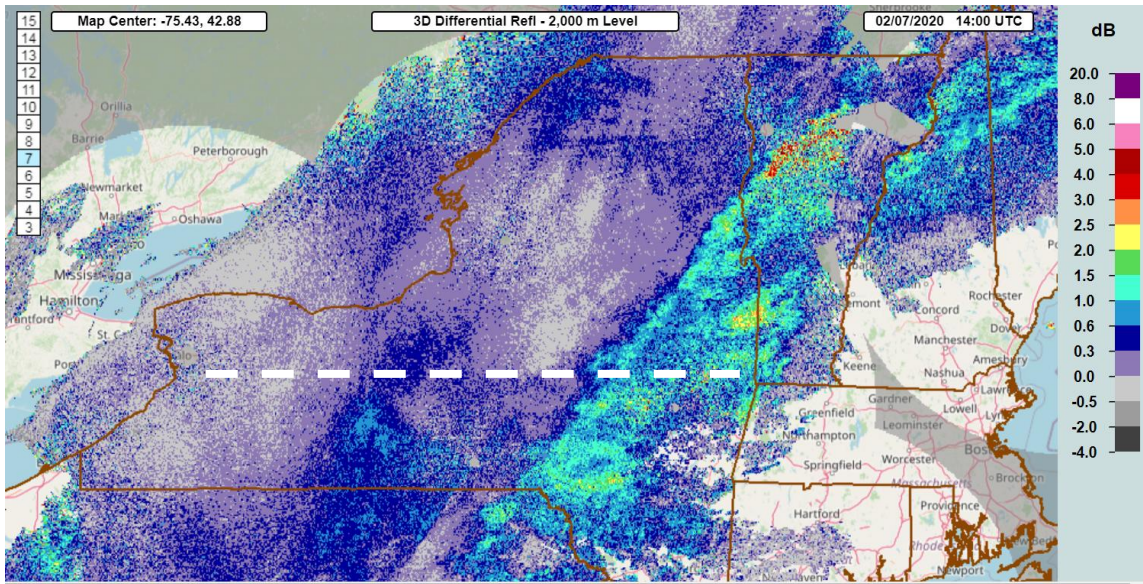
MRMS WSR-88D radar products for the IMPACTS flight on February 7, 2020 (leg 6)

The aircraft flight track is shown by a dashed line  
MRMS is the Multi-Radar Multi-Sensor integration platform

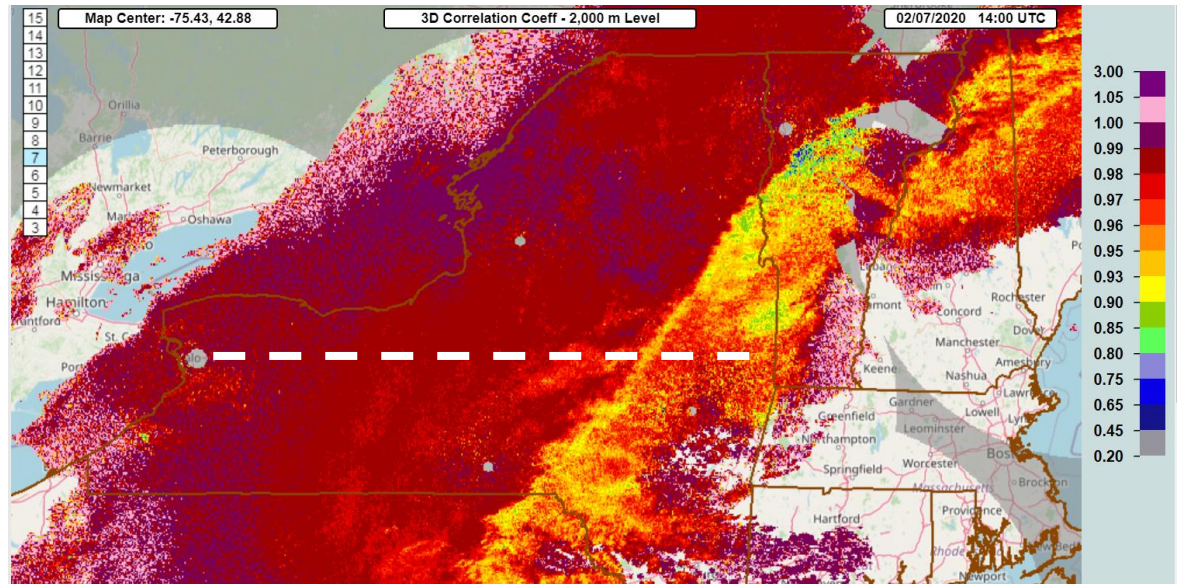
# Composite radar reflectivity



# Z<sub>DR</sub> at the 2 km altitude

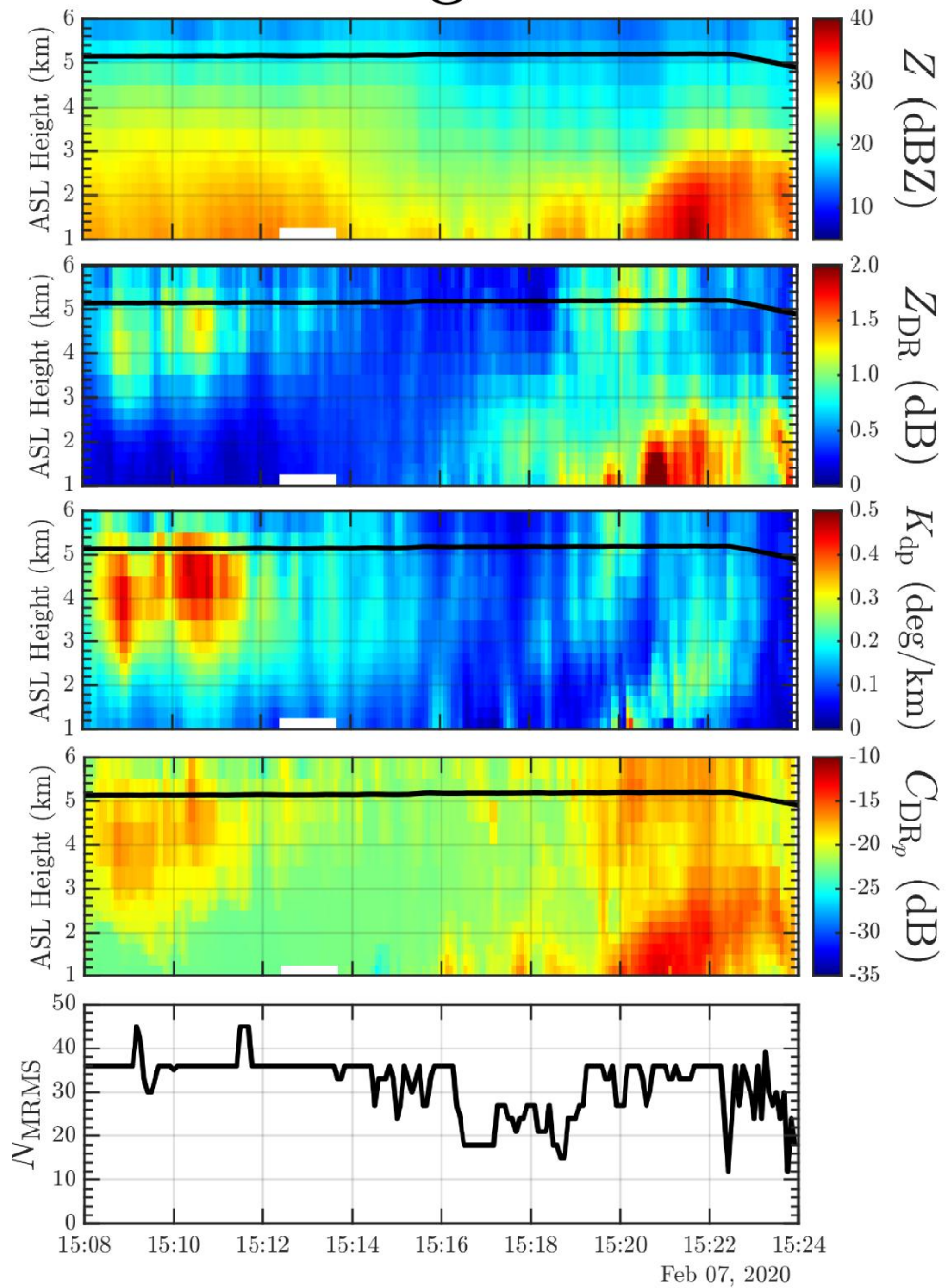


# CC at the 2 km altitude

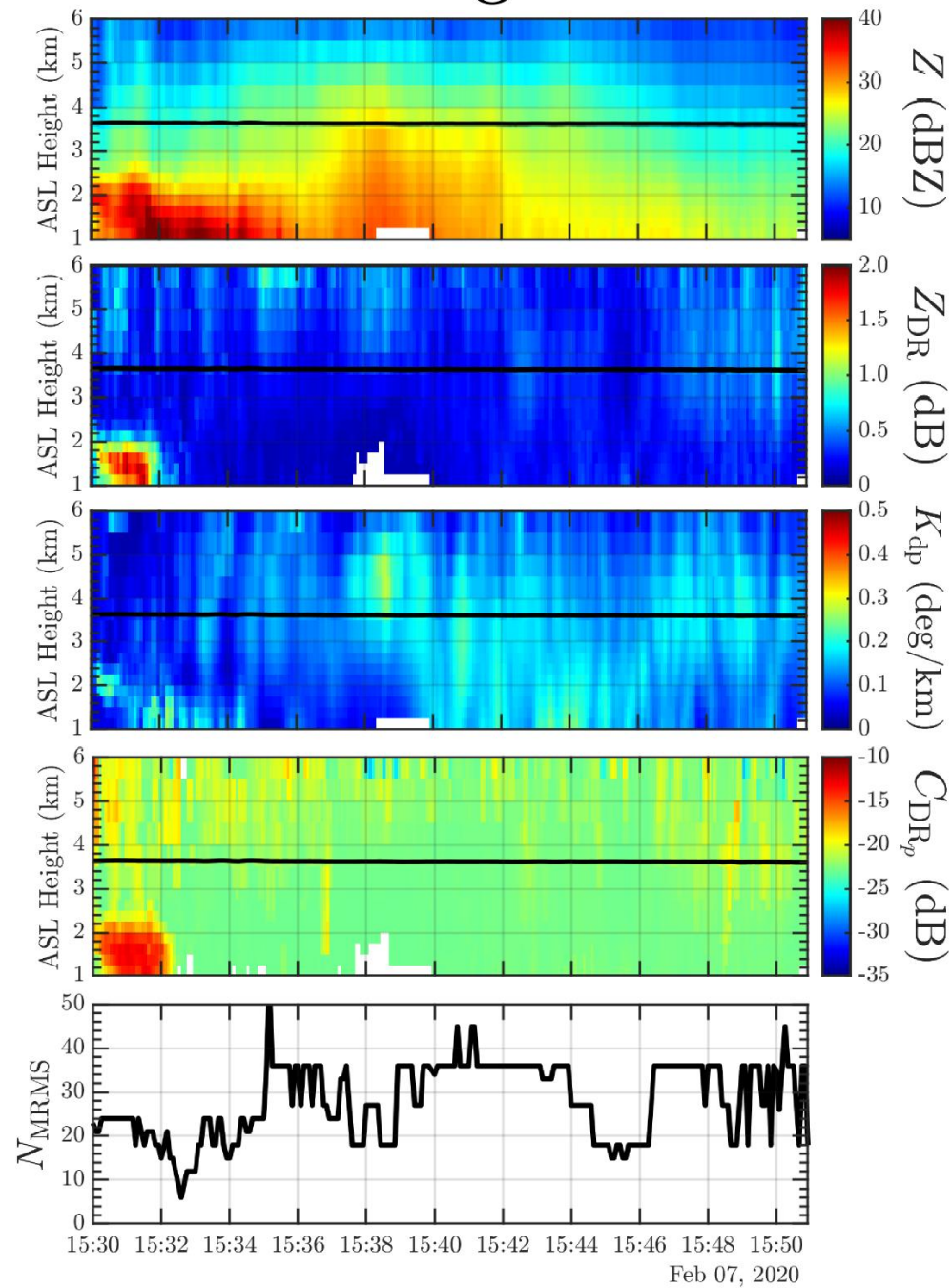




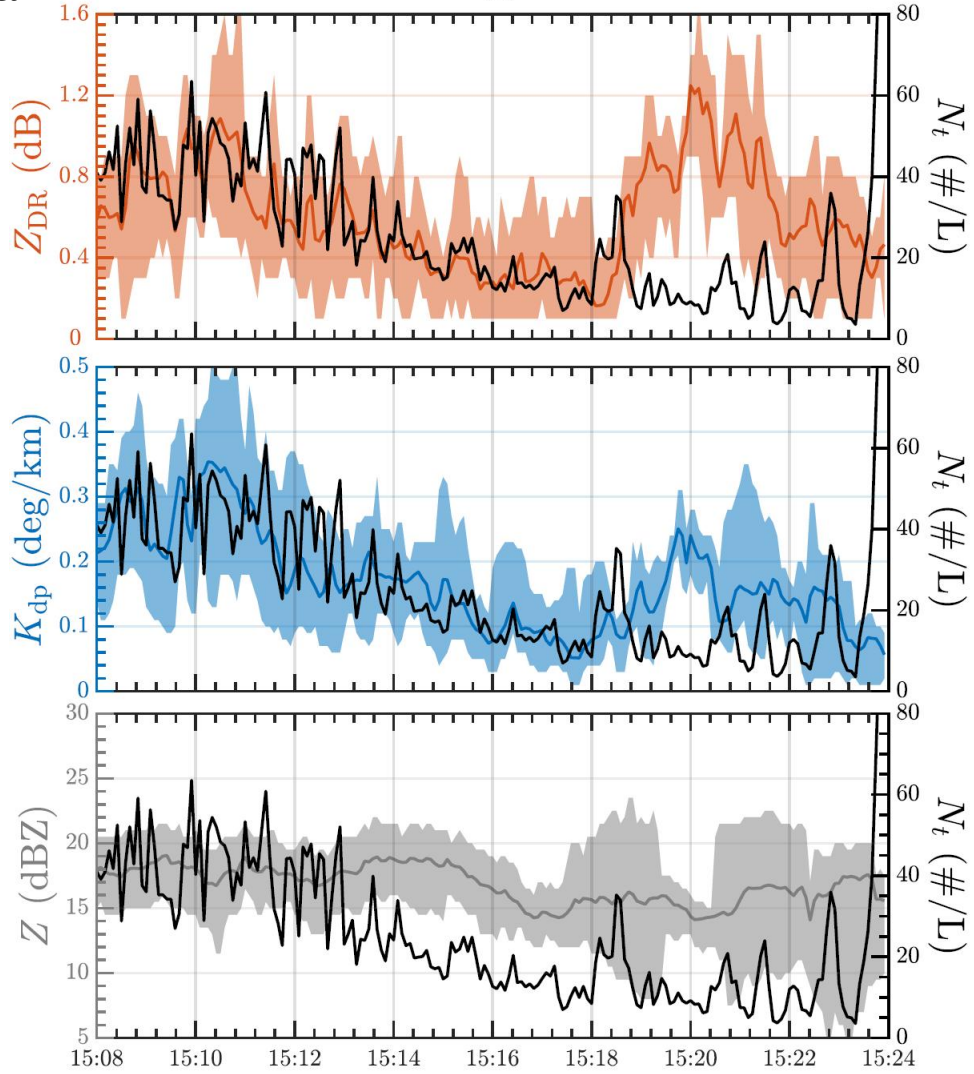
# Leg 1



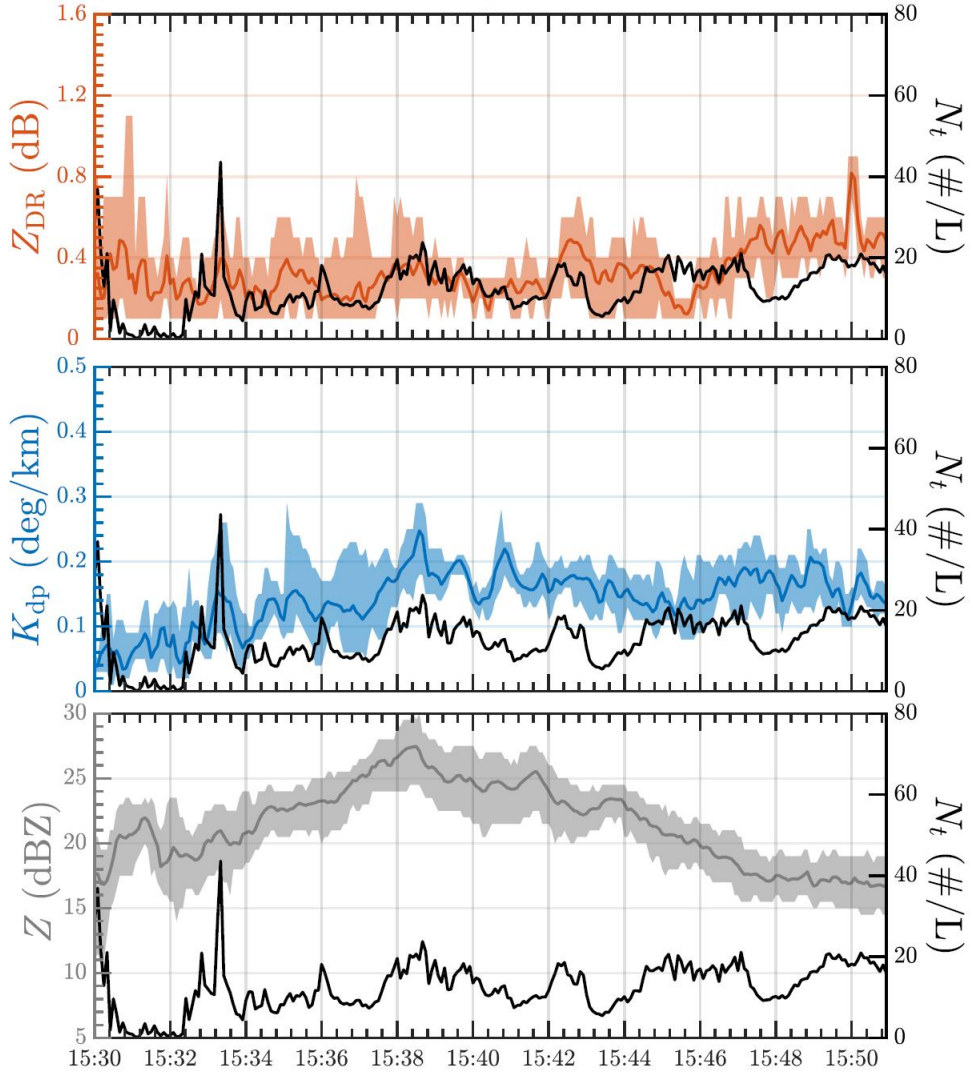
# Leg 2



Leg 1

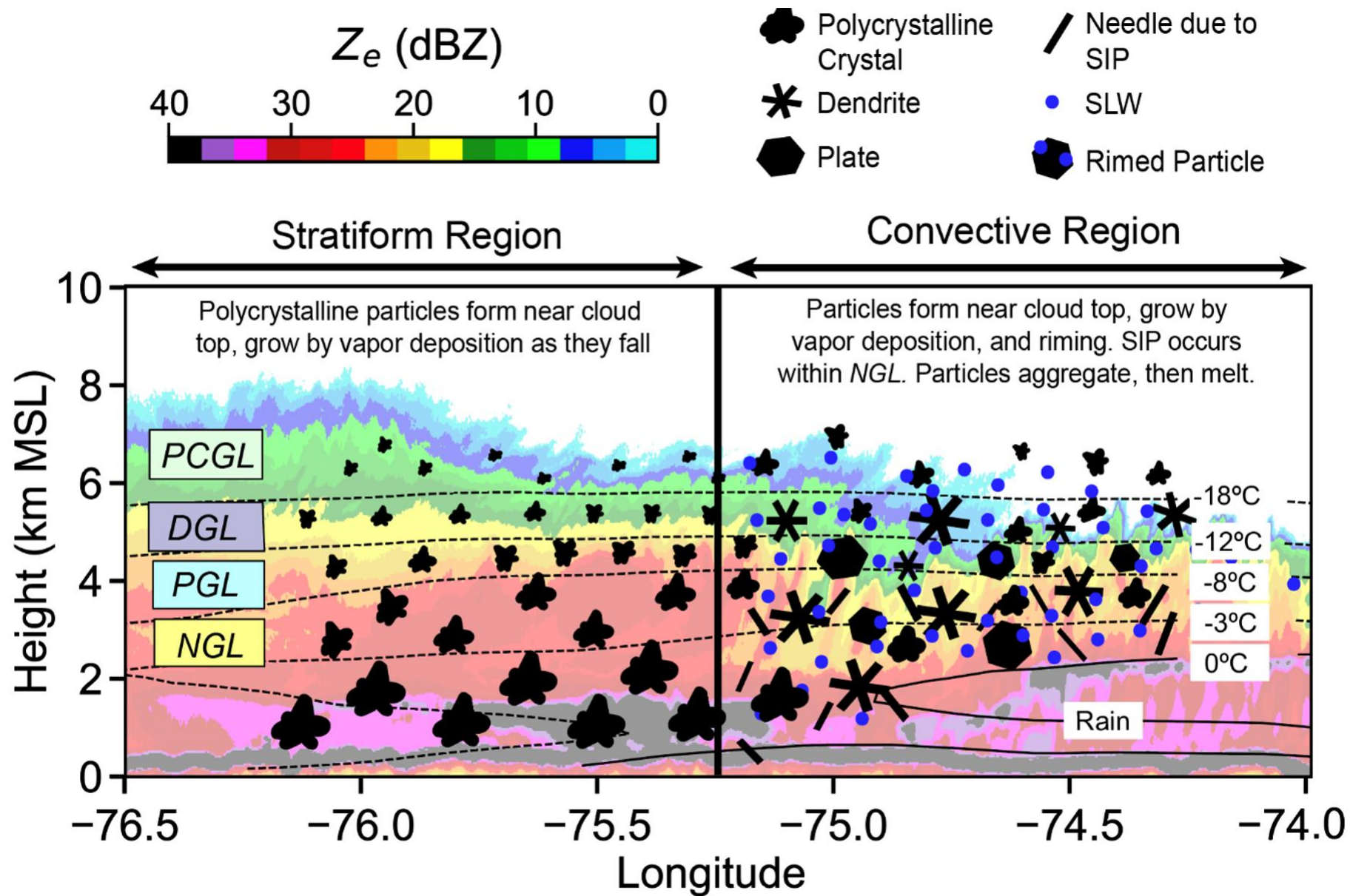


Leg 2



- $K_{DP}$  exhibits the best correlation with the total number concentration  $N_t$  of ice
- $Z$  does not correlate with  $N_t$  at all

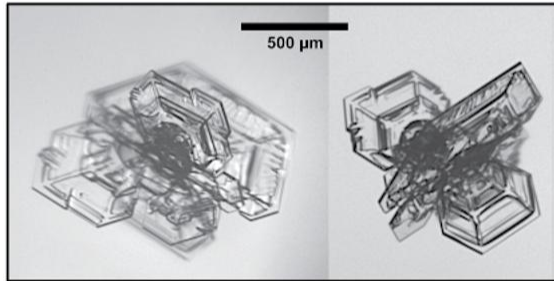




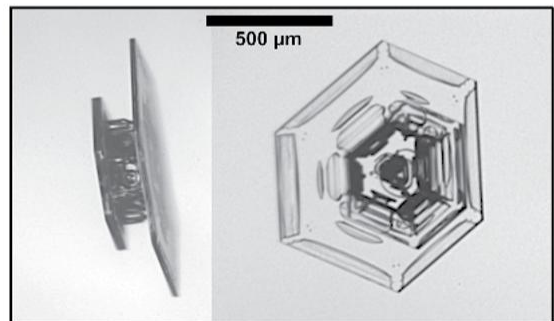
Common Habits in the Stratiform Region



Side Planes (76.8-83.5%)

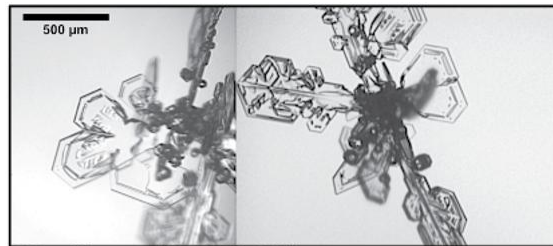


Polycrystalline Plates (6.3-8.9%)

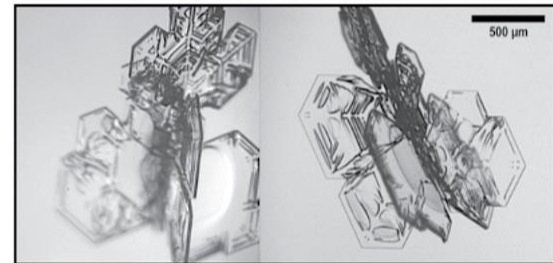


Other Plate-Like Habits (2.3-3.0%)

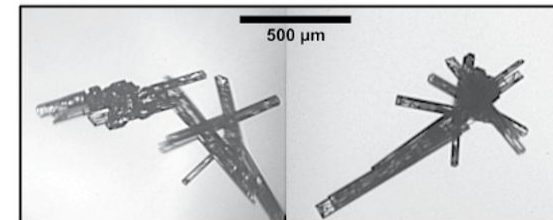
Common Habits in the Convective Region



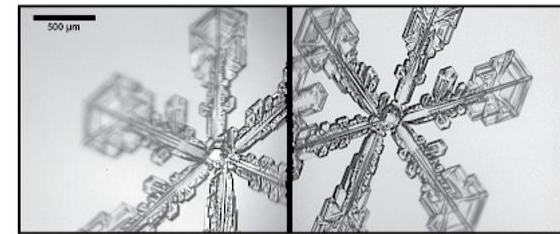
Side Planes (27.4-53.0%)



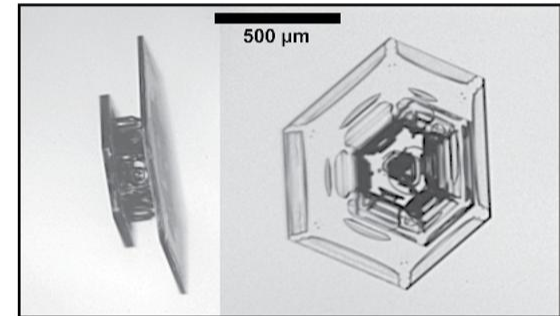
Other Polycrystalline Plates (16.9-37.0%)



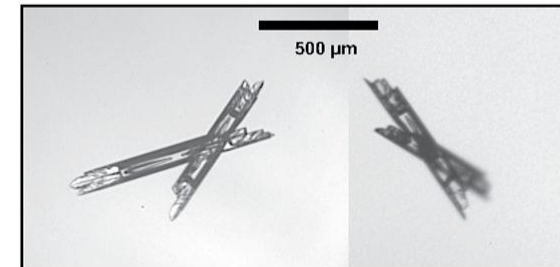
Columns (2.8-20.8%)



Dendrites (5.1-14.8%)



Other Plate-Like Habits (2.1-6.9%)



Needles (1.3-8.0%)

# Comparison with in situ aircraft observations in ice Preliminary results

- Polarimetric microphysical retrievals have been evaluated using in situ aircraft observations during 5 field campaigns so far

(1) HAIC – HIWC	French Guiana	Nguyen et al. (2019)
(2) MC3E	Oklahoma	Murphy et al. (2020)
(3) IMPACTS	US Northeast	Dunnavan et al. (2022)
(4) OLYMPEX	US Northwest	Blanke et al.
(2022) ?		
(5) ICICLE	US Midwest	?

- The results are generally encouraging
- The best results have been obtained with dedicated X-band polarimetric radars

# Climatology

Dataset includes 34 warm-season storms (13 continental MCSs, 10 maritime MCSs, and 11 land-falling hurricanes) and 22 snowstorms (synoptic and lake effect) observed with the WSR-88D radars

Separate statistics have been obtained: (a) “background” and (b) High Ice Water Content (HIWC)

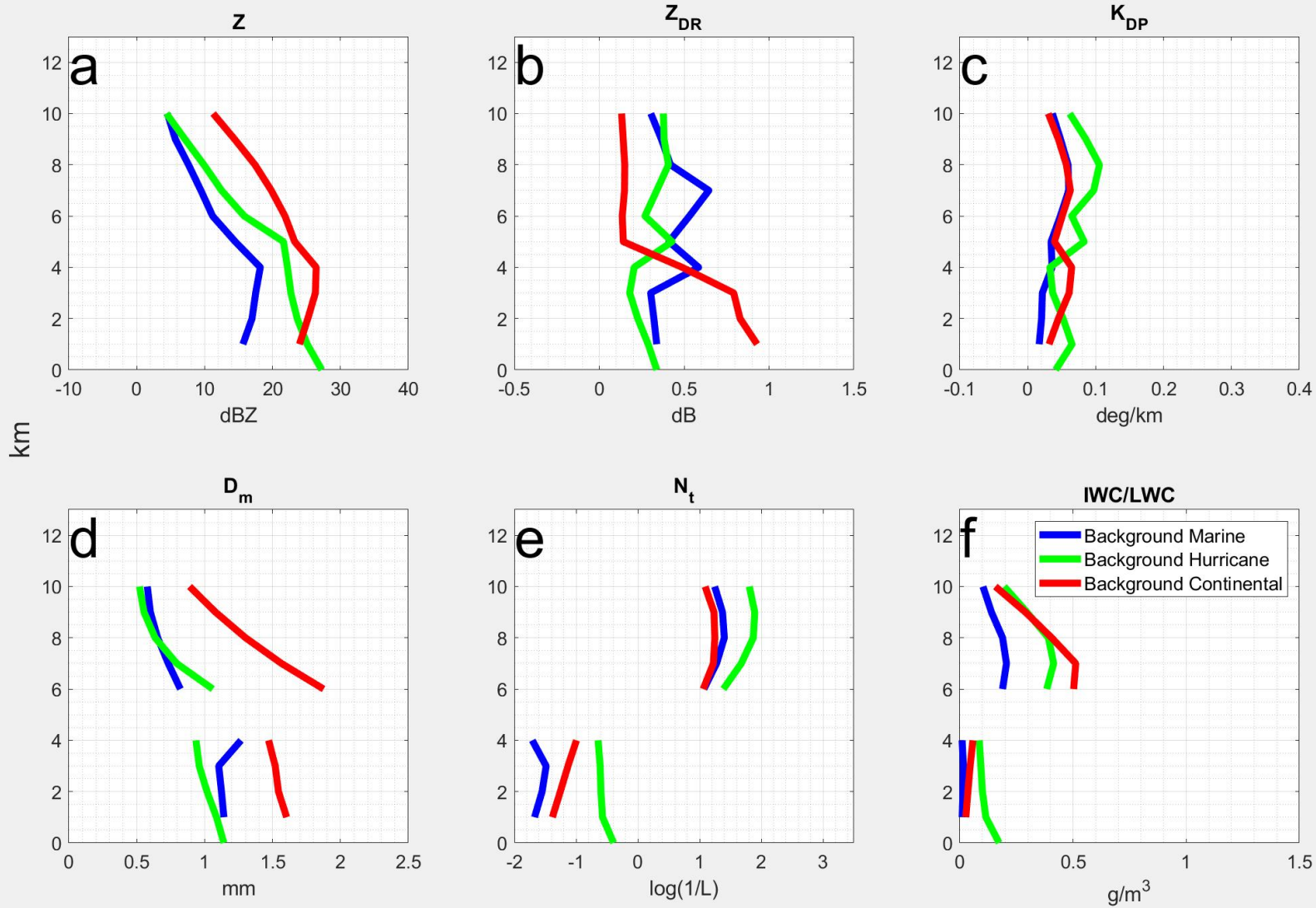
RD-QVPs and CVPs have been used to retrieve vertical profiles of polarimetric radar variables and microphysical parameters (IWC / LWC,  $D_m$ , and  $N_t$ )

Hu, J., and A. Ryzhkov, 2022: Climatology of the vertical profiles of polarimetric radar variables and retrieved microphysical parameters in continental / tropical MCSs and landfalling hurricanes. *J. Geophys. Res. Atmos.*, 127, e2021JD035498.



# Median vertical profiles. “Background” statistics.

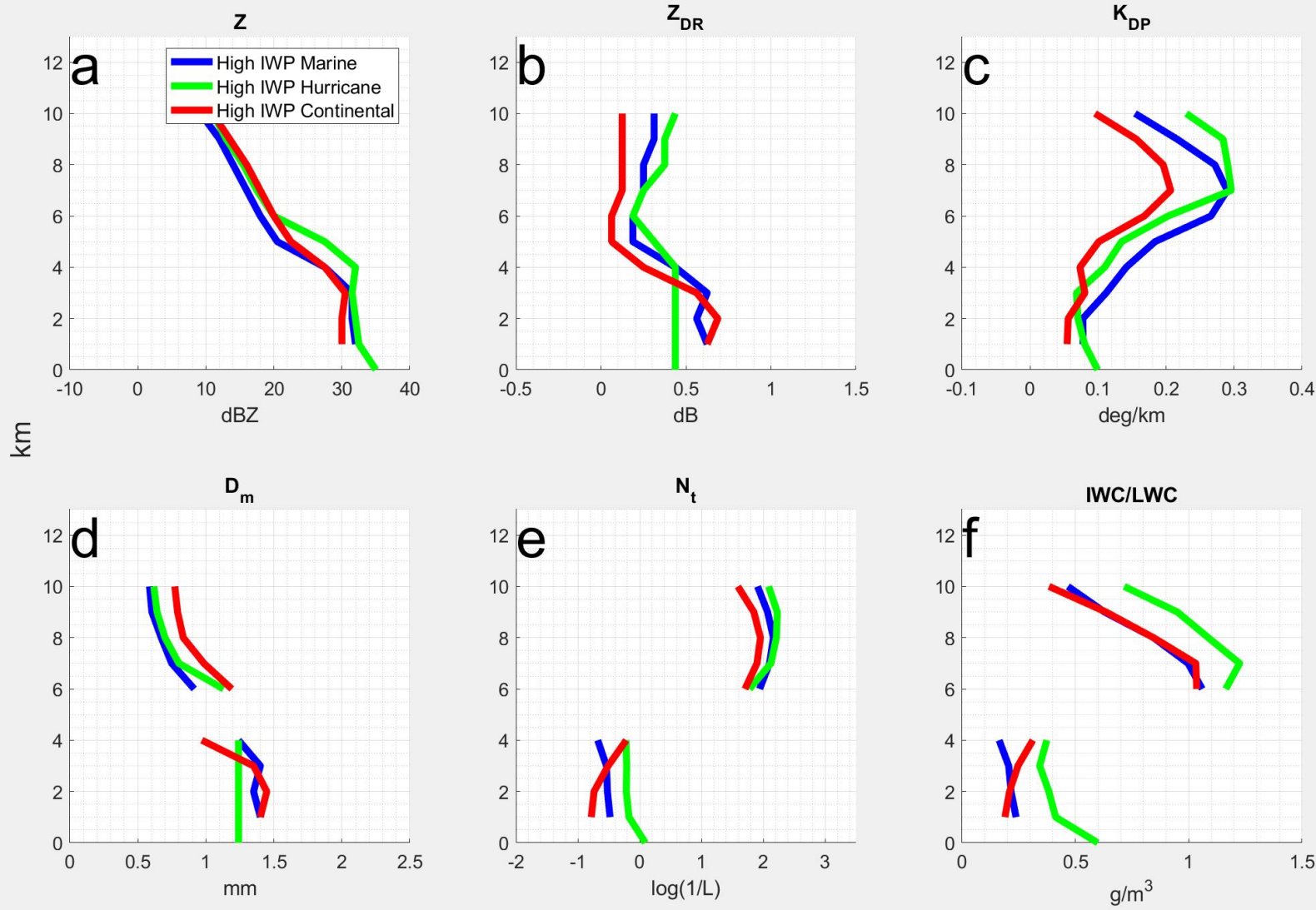
RD-QVP Marine & Hurricane & Continental



Ice particles in continental MCSs have larger size and lower concentration compared to the maritime storms

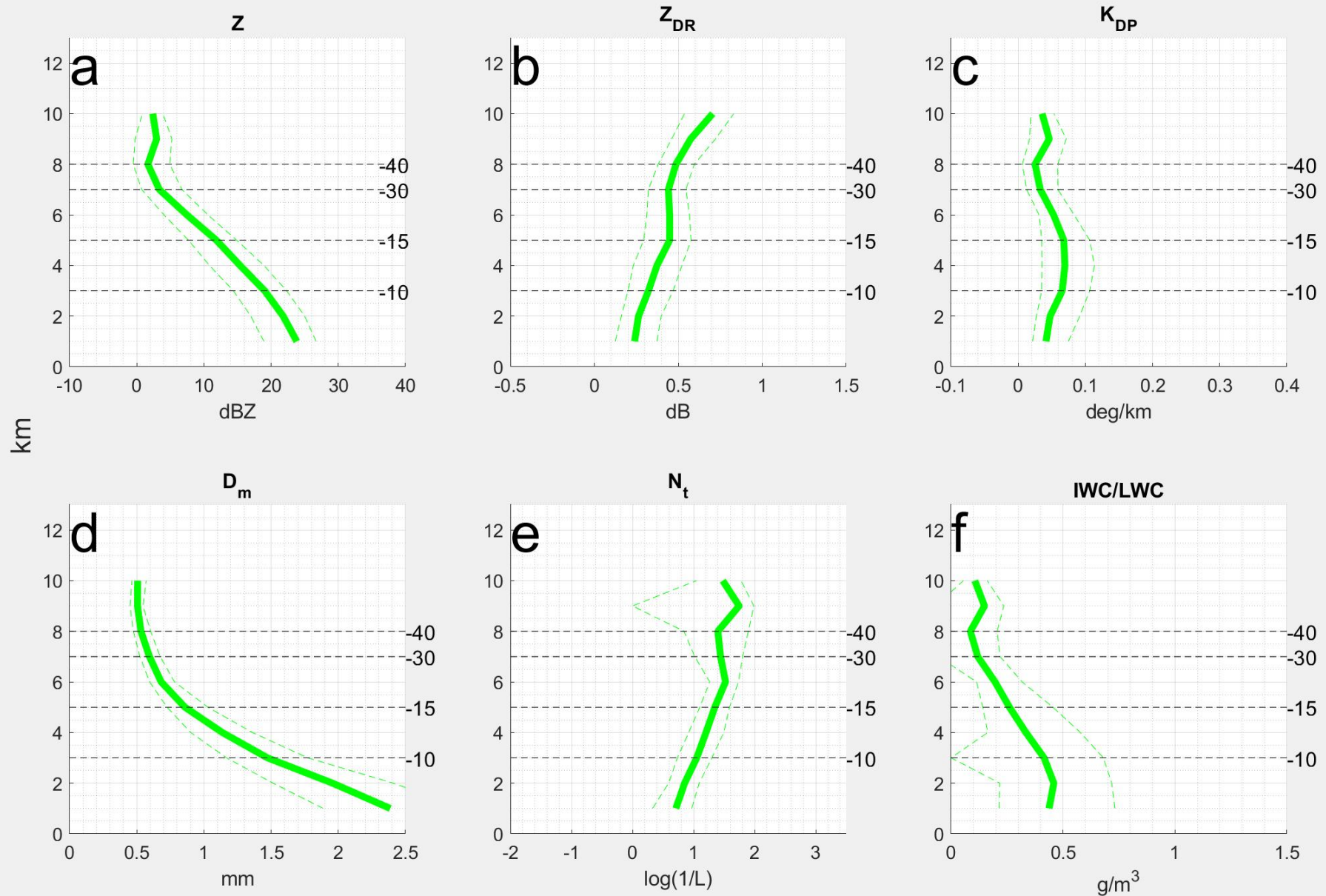
# Median vertical profiles. HIWC statistics.

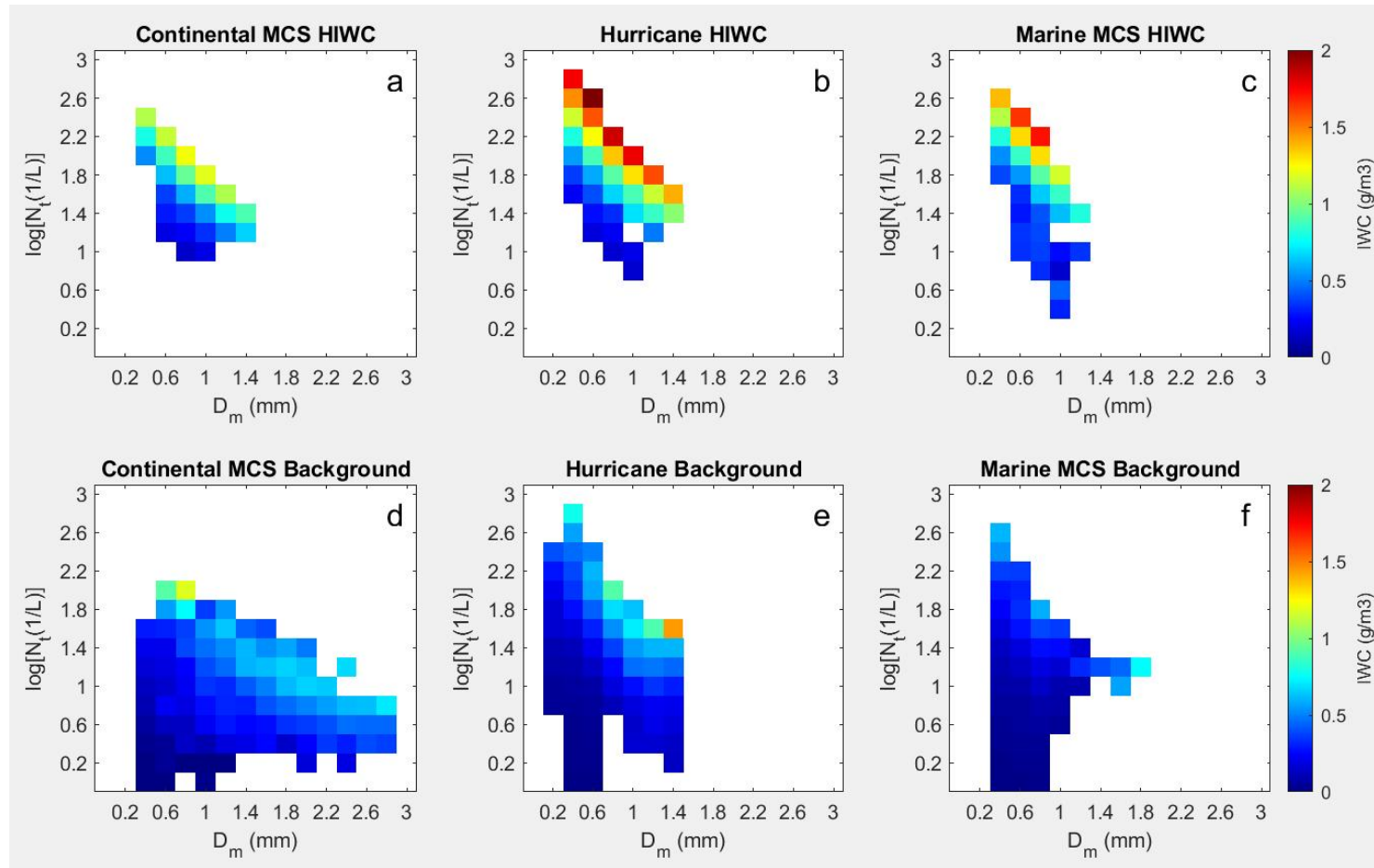
IWP Track Marine & Hurricane & Continental



High ice water content in the HIWC areas is primarily caused by a strong jump in a number concentration of ice particles rather than the increase of their size compared to the “background” environment

# Snowstorms (synoptic). "Background" statistics





The highest median values of IWC approaching  $1.5 - 2 \text{ g m}^{-3}$  are observed in the hurricanes and marine MCSs and these are primarily associated with the highest total number concentrations of ice  $N_t$  and smallest sizes of ice particle  $D_m$  (panels b and c). The continental MCSs reveal quite different pattern with noticeably lower median values of IWC even for HIWC cases (panels a and d).

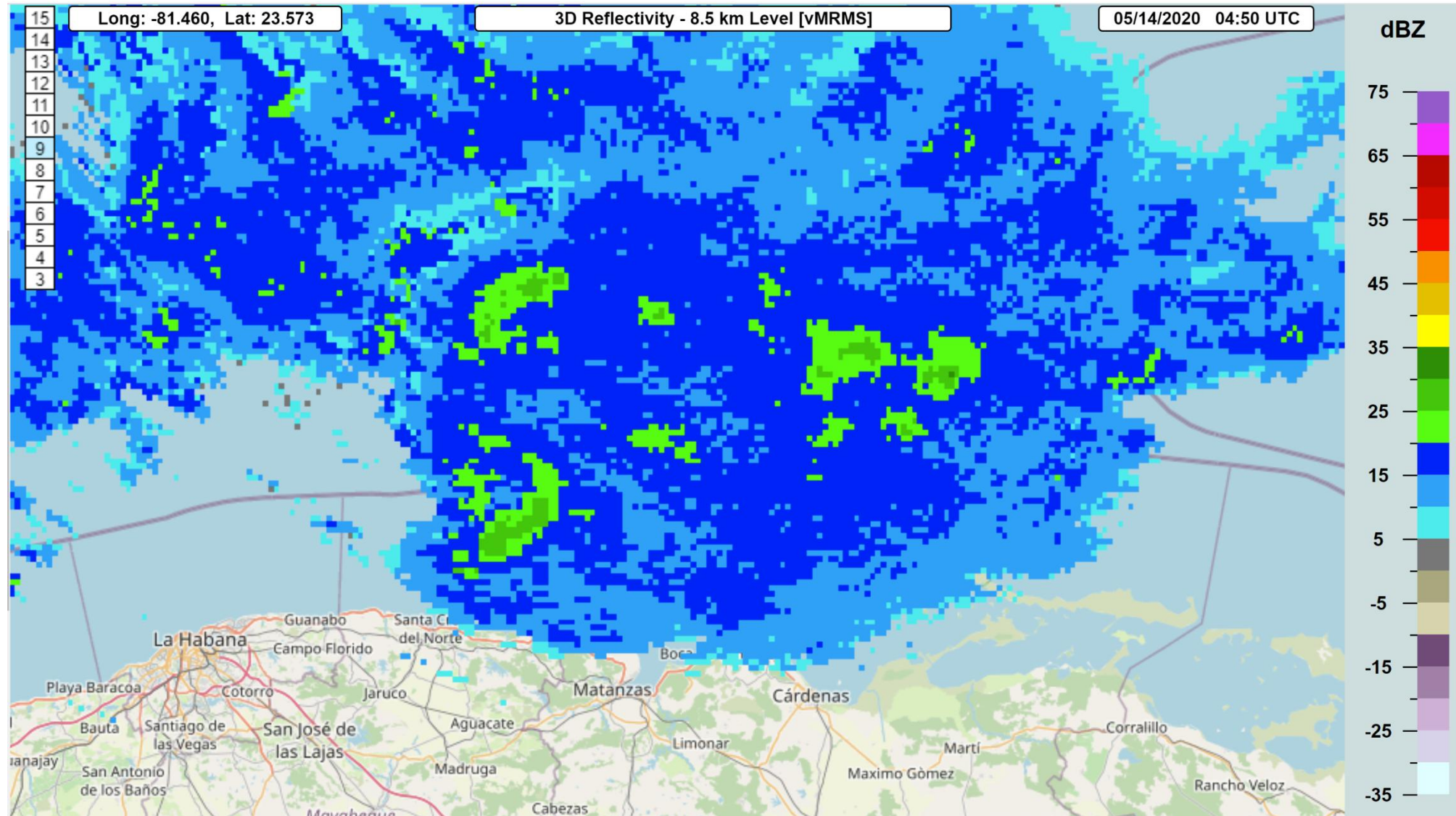


## Possible origins of high ice number concentration

- Intense homogeneous nucleation of liquid droplets at  $T < -37^{\circ}\text{C}$
- Secondary ice production (SIP) due to Hallett-Mossop process
- SIP caused by dendrite – graupel collisions in convective updrafts (deep continental convection) – V. Phillips et al.
- SIP caused by shattering of freezing raindrops lofted in convective updrafts (tropical storms) – A. Khain
- SIP caused by spontaneous breakup of dendrites in the dendritic growth layer – Korolev et al.
- SIP caused by sublimation of ice crystals

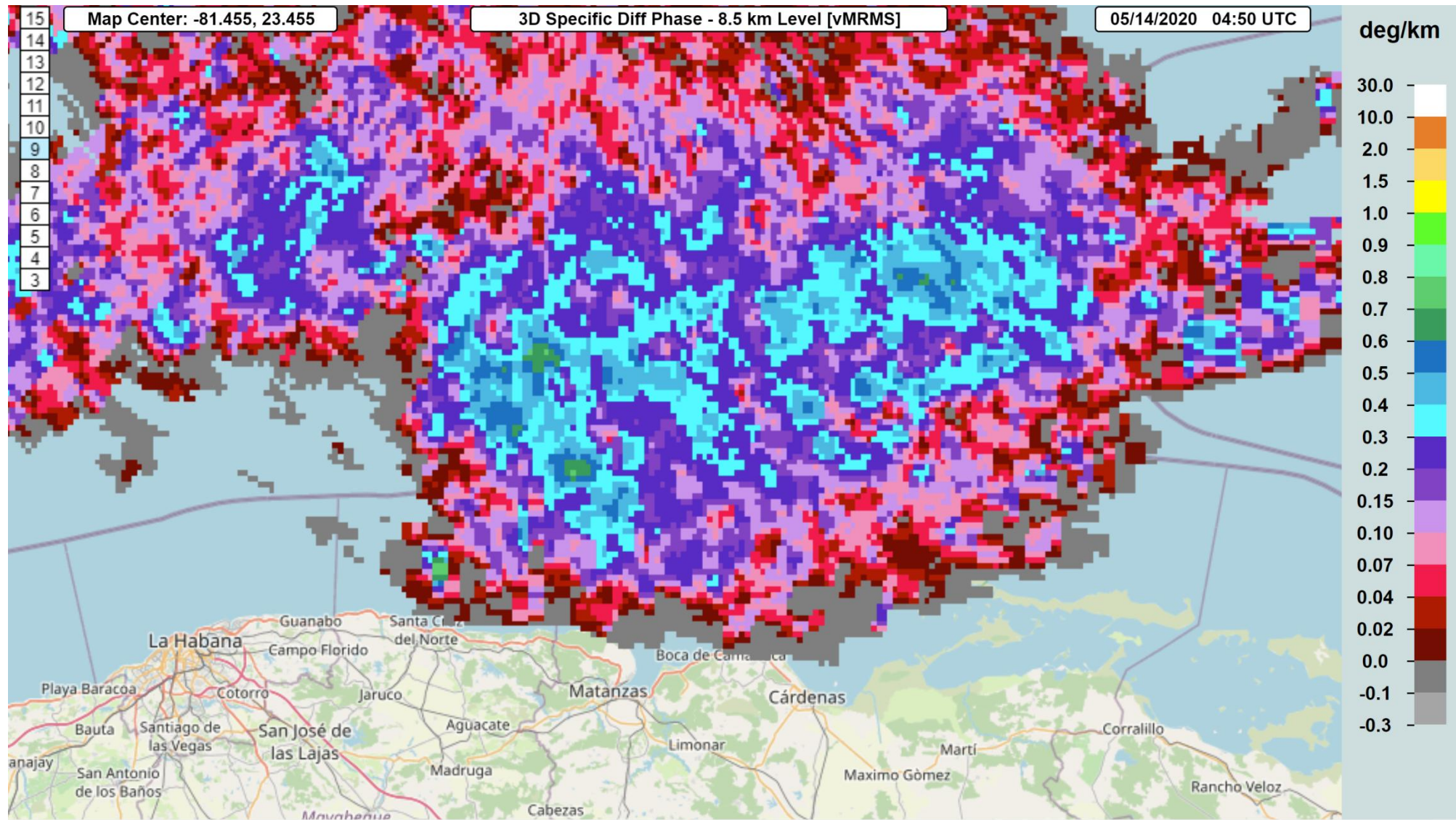
Maritime MCS on 2020/05/14  
observed by the WSR-88D  
radar at Key West

# Radar reflectivity at 8.5 km



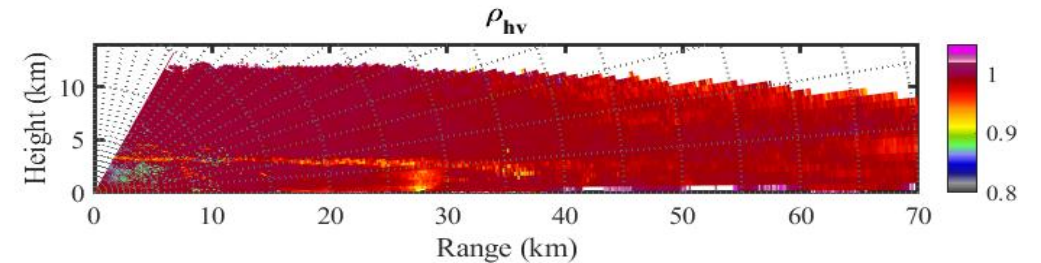
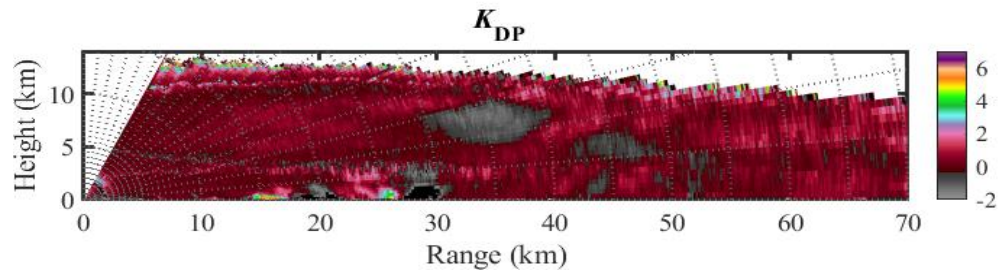
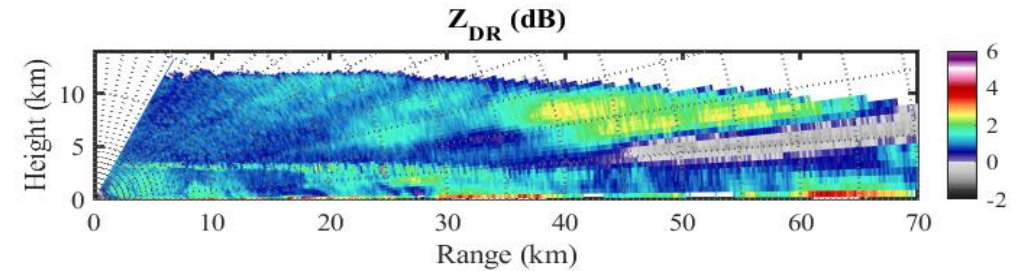
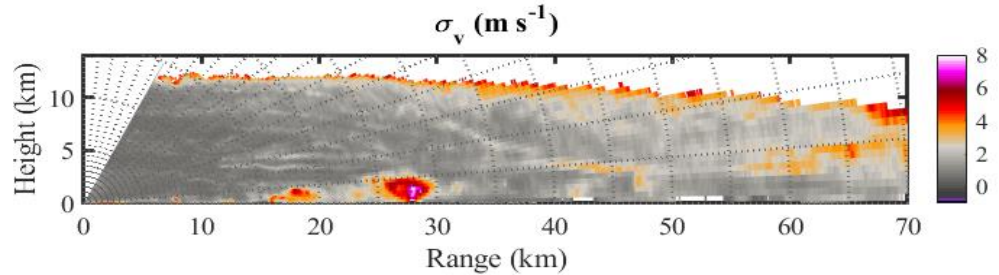
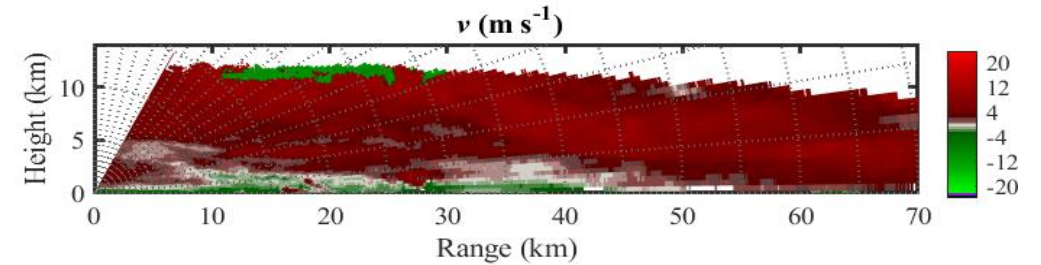
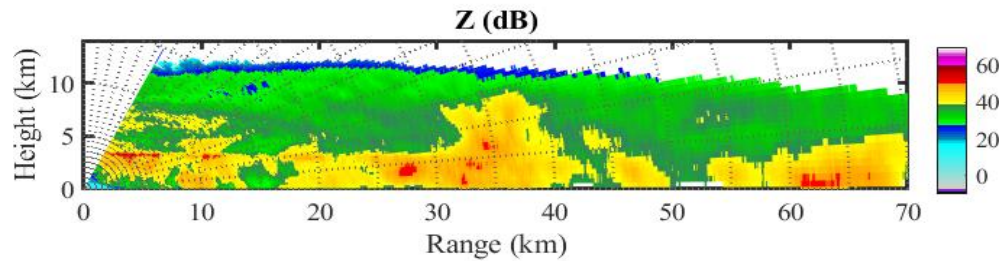


# Specific differential phase at 8.5 km



# 2021-09-30 17:49:08 - RHI at Az = 57

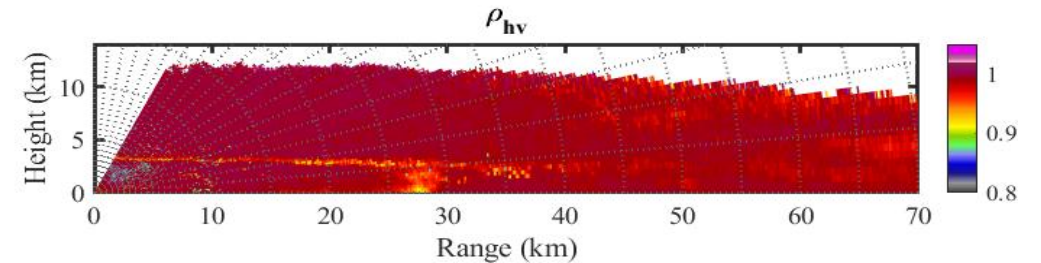
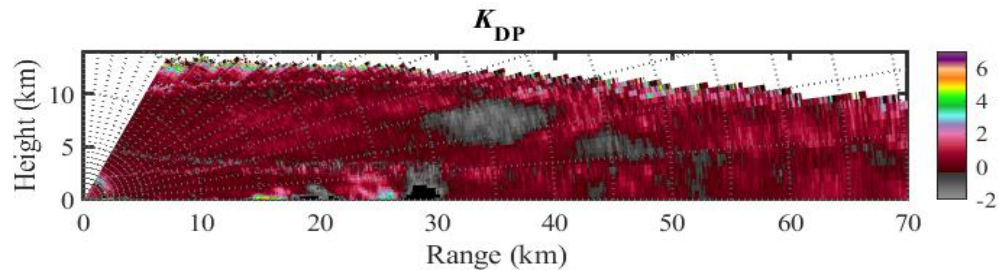
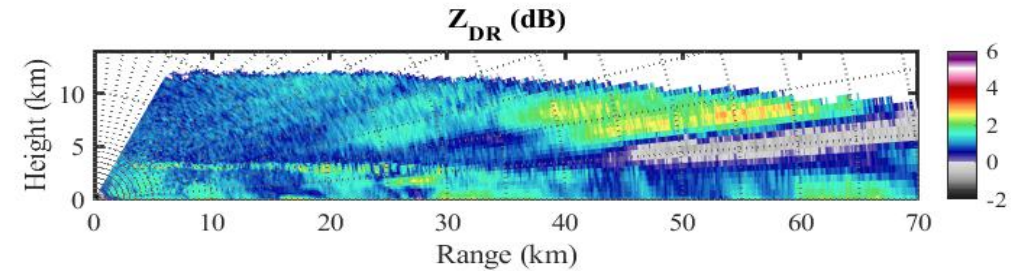
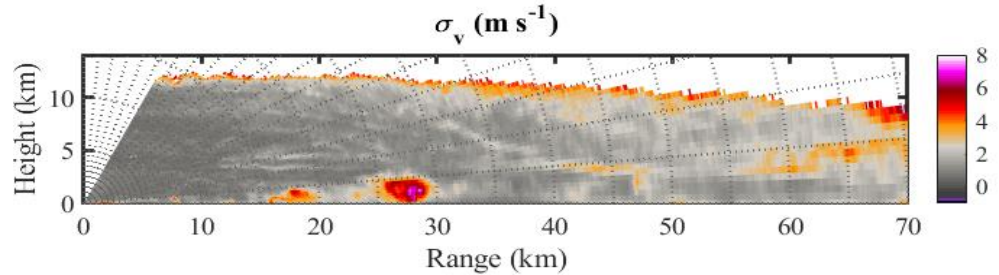
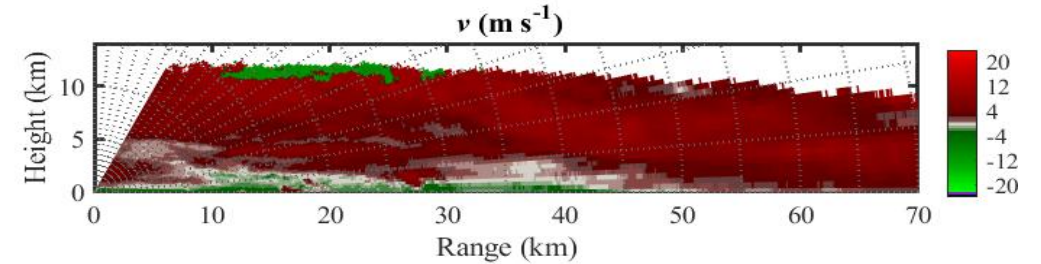
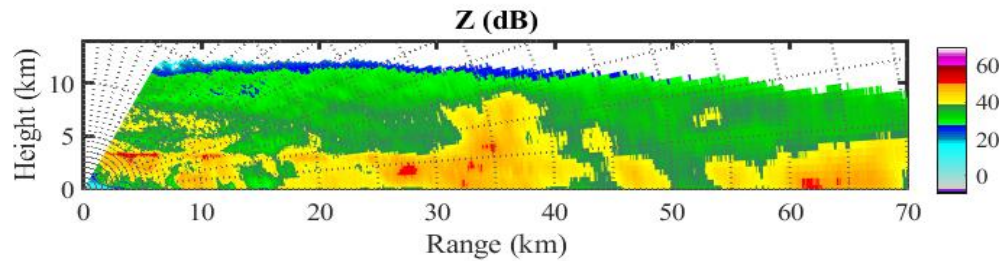
17:49:08 Z





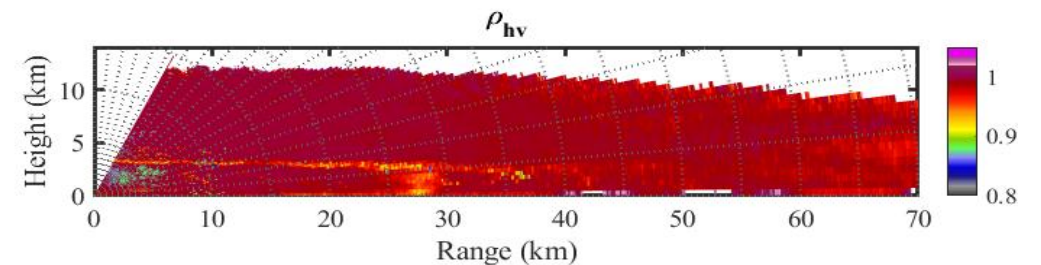
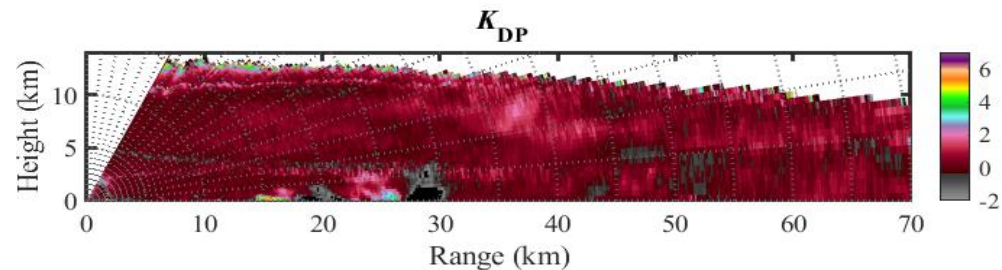
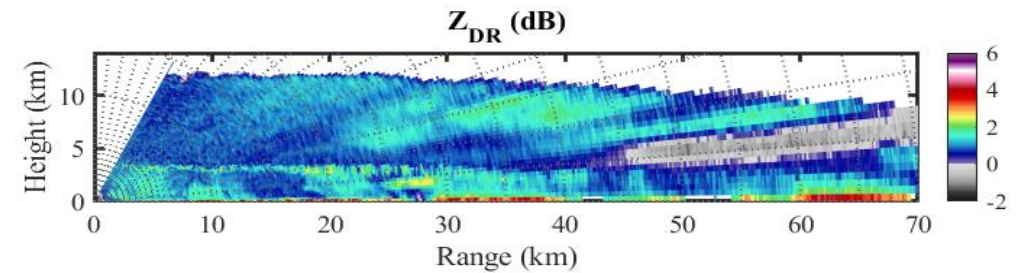
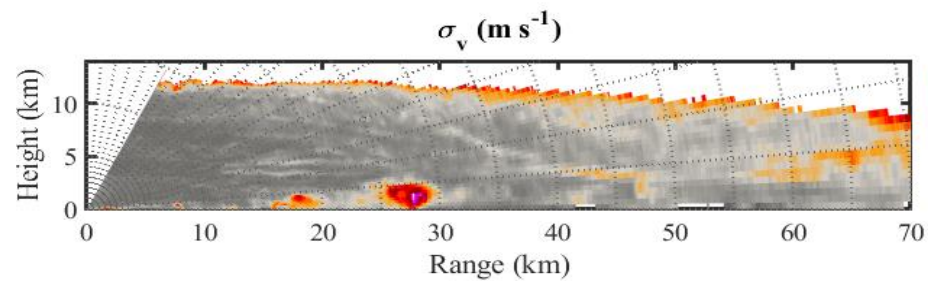
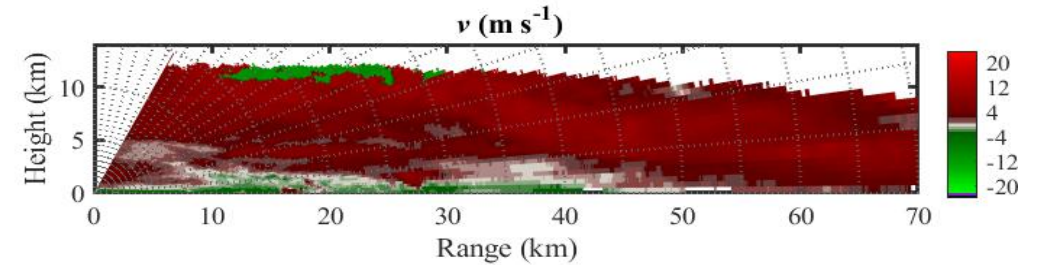
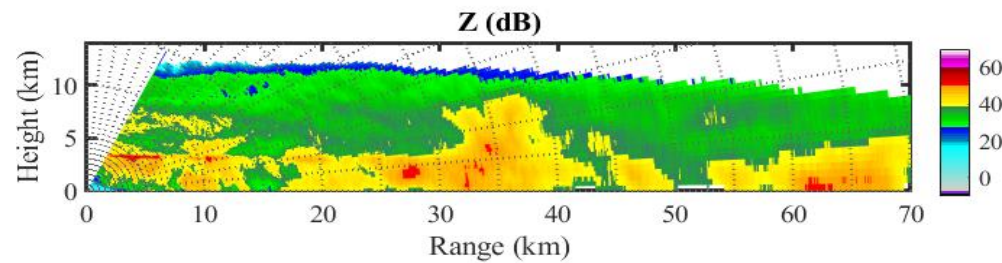
# 2021-09-30 17:49:13 - RHI at Az = 57

17:49:13 Z



# 2021-09-30 17:49:17 - RHI at Az = 57

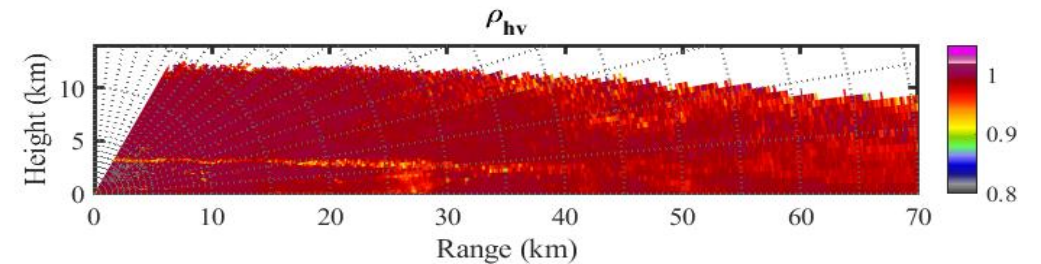
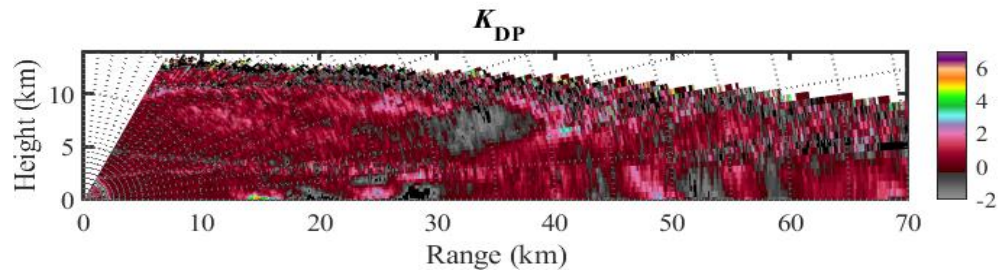
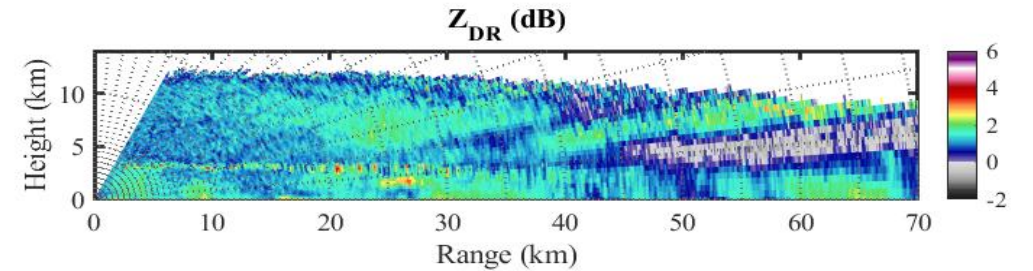
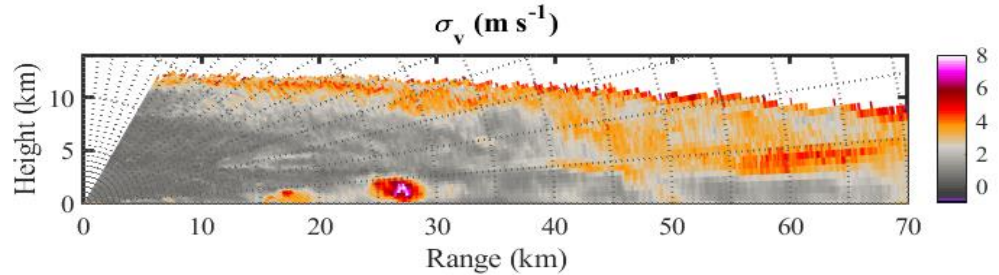
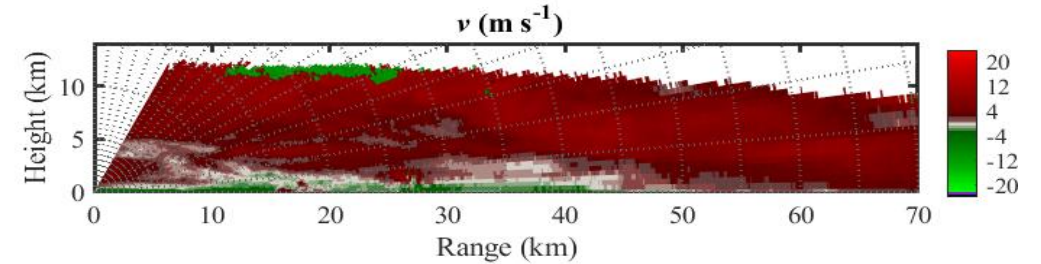
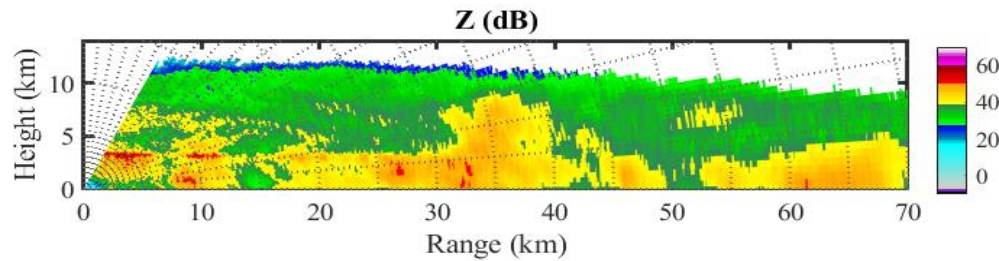
17:49:17 Z





# 2021-09-30 17:50:26 - RHI at Az = 57

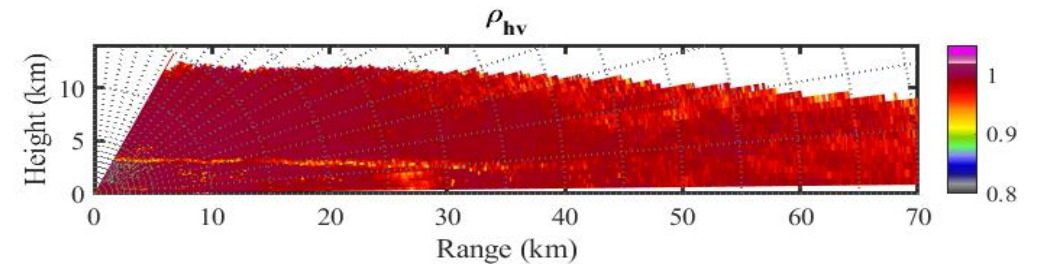
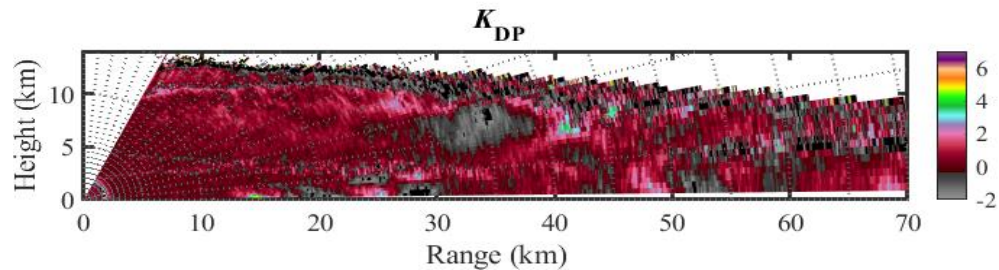
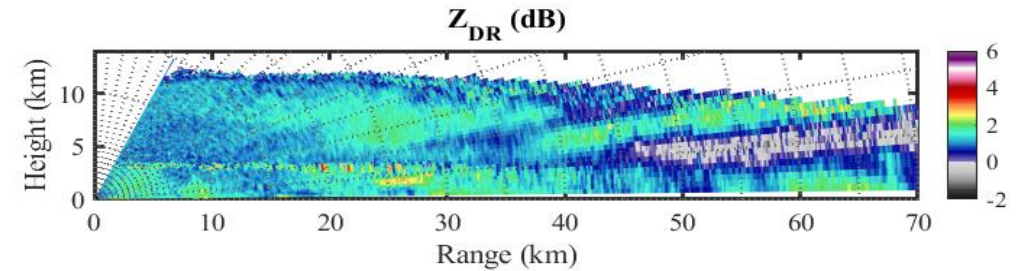
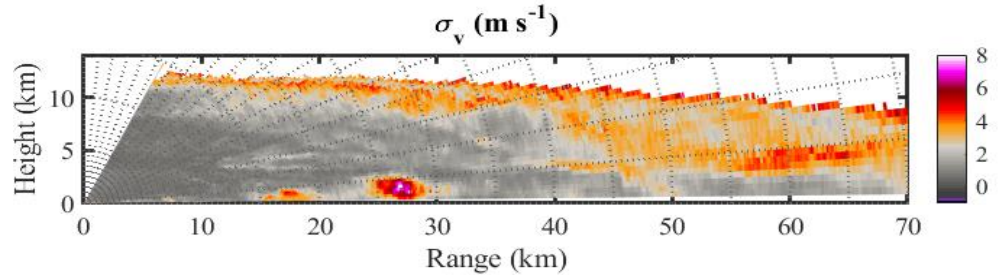
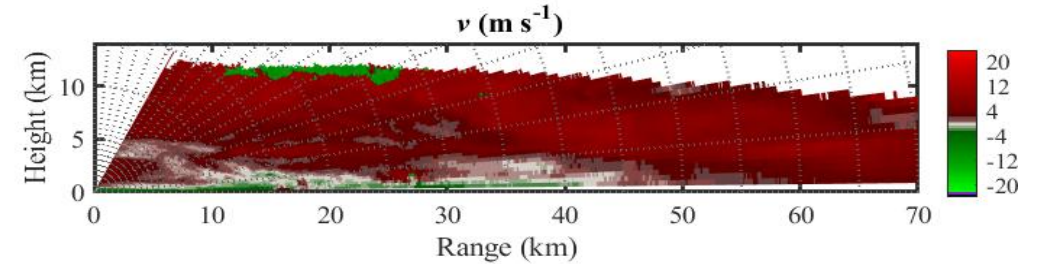
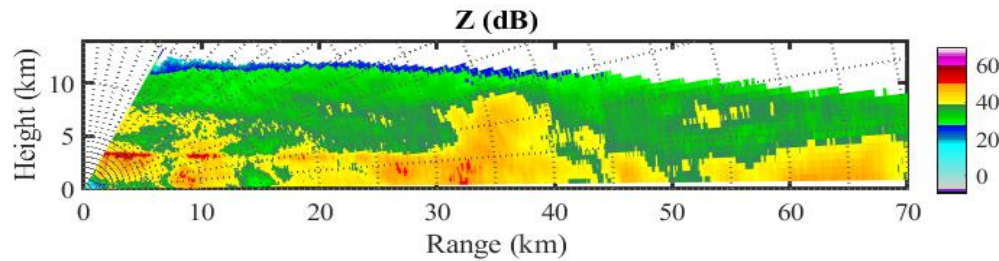
17:50:26 Z





# 2021-09-30 17:50:30 - RHI at Az = 57

17:50:30 Z



# 2021-09-30 17:50:35 - RHI at Az = 57

*Courtesy of David Schwartzman*

17:50:35 Z

