



# Impacts of Polarimetric Radar Data Assimilation on Typhoon Rainfall Nowcasting

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# Introduction



## Outline

- Characteristics of polarimetric radar observations
- Values and limitations of a polarimetric radar observation operator
- Impacts of polarimetric radar data assimilation on typhoon rainfall nowcasting

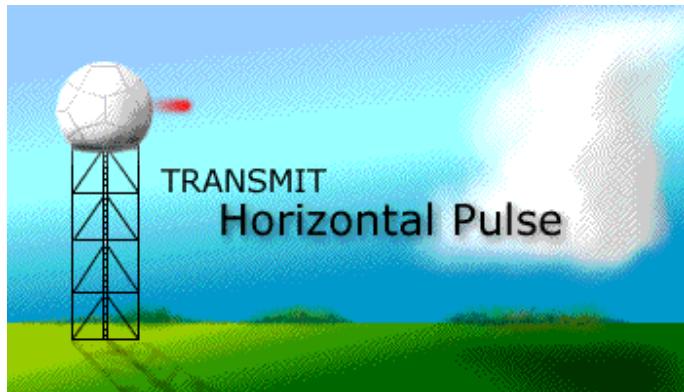
## Case

- Typhoon Soudelor (2015) near landfall in Taiwan
- Assimilation of the RCWF S-band polarimetric radar

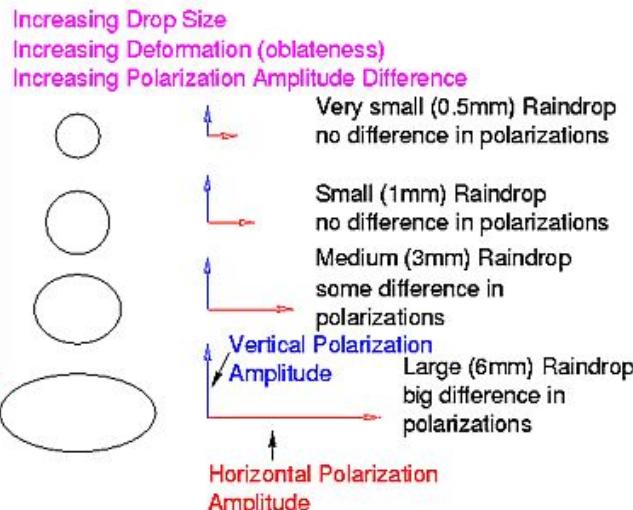
## Tools

- WRF-LETKF radar assimilation system (Tsai et al. 2014; Yang et al. 2020; Cheng et al. 2020; Wu et al. 2020; You et al. 2020)
- Polarimetric radar observation operator (Jung et al. 2008)

# Polarimetric radar



Source: CIMMS



Source: Chilbolton Observatory

Observation variable	Definition
$V_R$ Radial velocity	
$Z_H$ Reflectivity	$Z_H = 10 \log Z_{hh}$
$Z_{DR}$ Differential reflectivity	$Z_{DR} = Z_H - Z_V$
$\Phi_{DP}$ Differential phase	$\Phi_{DP} = \Phi_{hh} - \Phi_{vv}$
$K_{DP}$ Specific differential phase	$K_{DP} = \frac{1}{2} \frac{d\Phi_{DP}}{dr}$
$\rho_{HV}$ Copolar correlation coefficient	$\rho_{HV} = \frac{\langle S_{vv} S_{hh}^* \rangle}{\sqrt{\langle  S_{hh} ^2 \rangle \langle  S_{vv} ^2 \rangle}}$

## ■ Observation-related:

- Hydrometeor classification
- Quantitative precipitation estimation
- Quality control of radar data

## ■ Model-related:

- Forecast verification
- Evaluation of cloud microphysics schemes
- **Data assimilation**

State variables

Observation operator

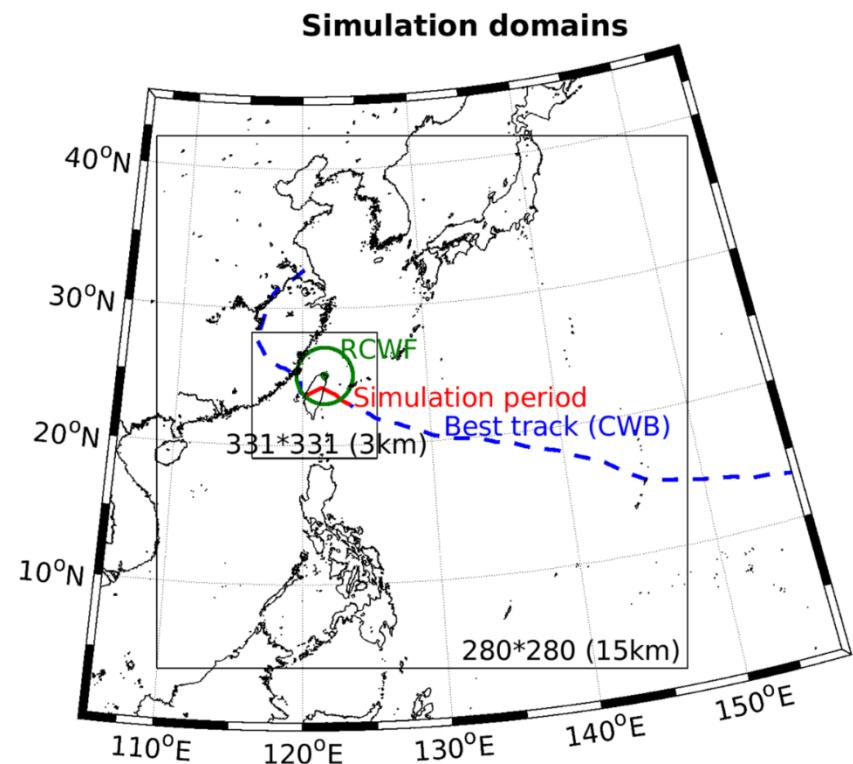
Polarimetric variables

# Model configuration

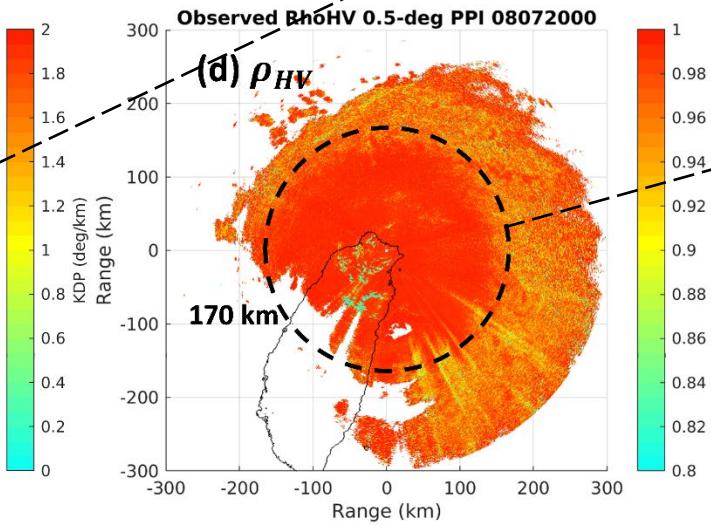
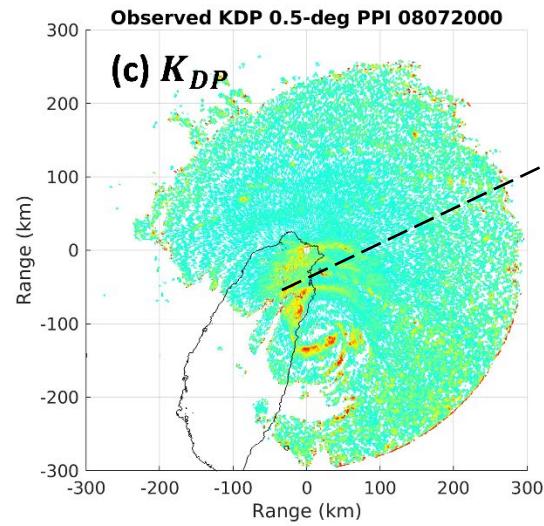
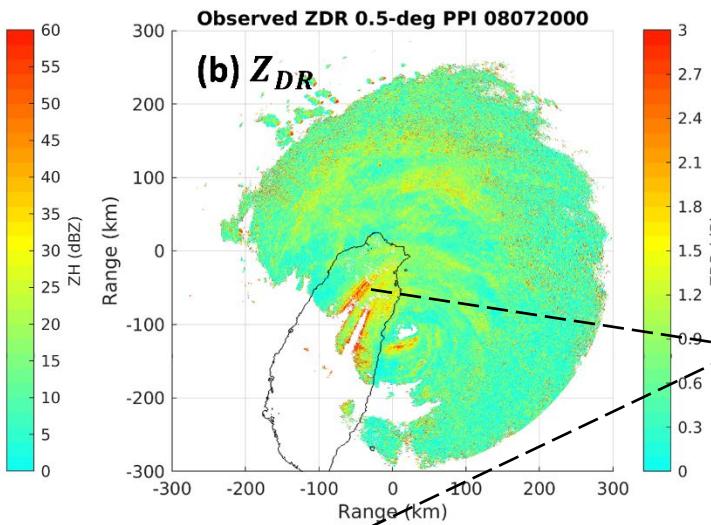
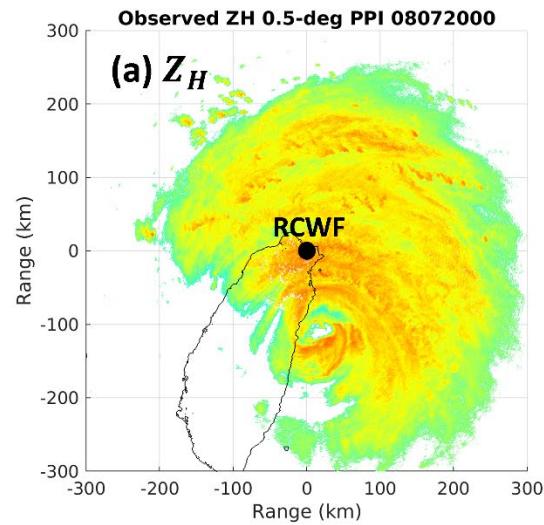


## WRF V4.0

Horizontal grids	280×280 (15 km) 331×331 (3 km)
Eta levels	45 (top at 30 hPa)
Cloud microphysics	<b>WDM6</b>
Longwave radiation	RRTM
Shortwave radiation	Goddard
Surface layer	MM5
Land surface model	Noah
Planetary boundary layer	YSU
Cumulus parameterization	Kain-Fritsch
Prognostic state variables	$u, v, w, \theta', \varphi', \mu', q_v, q_c,$ $q_r, q_i, q_s, q_g, N_{tc}, N_{tr}, N_{tn}$



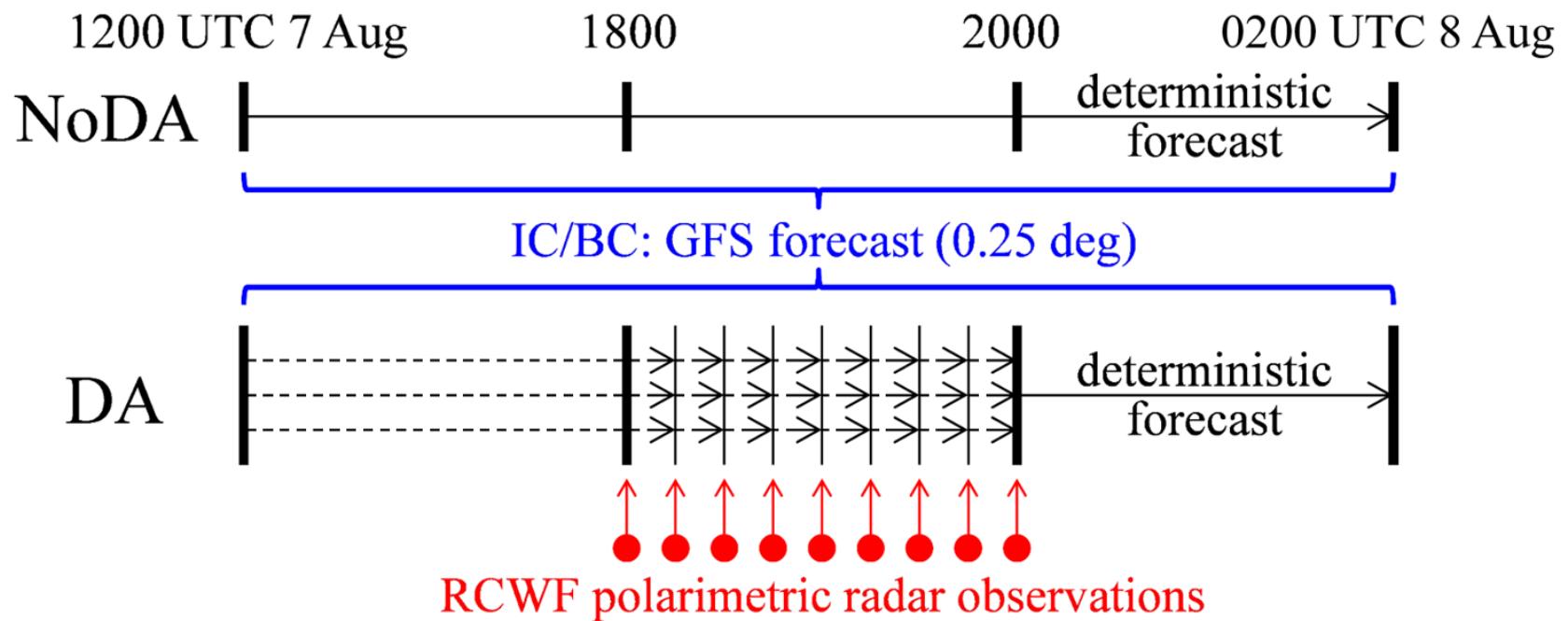
# Typhoon Soudelor (2015) near landfall



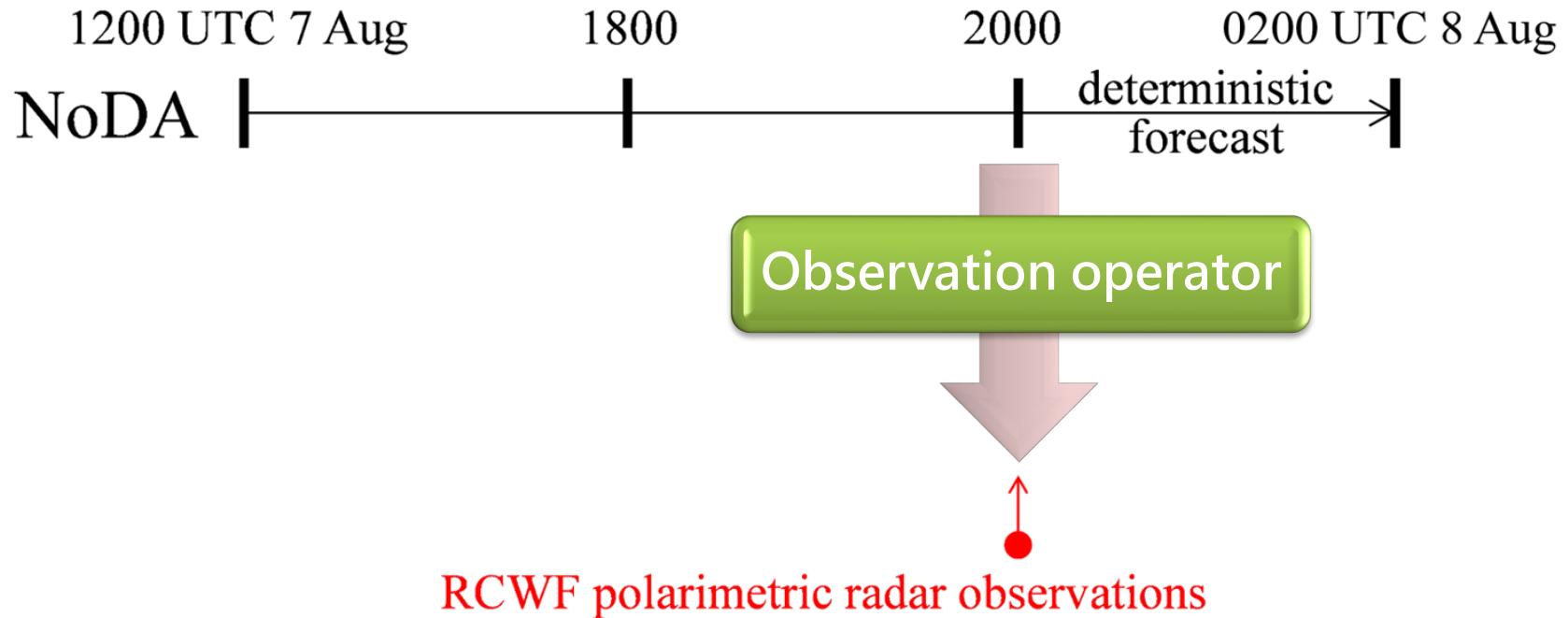
Melting layer at a  
4-km altitude

Orographic lifting

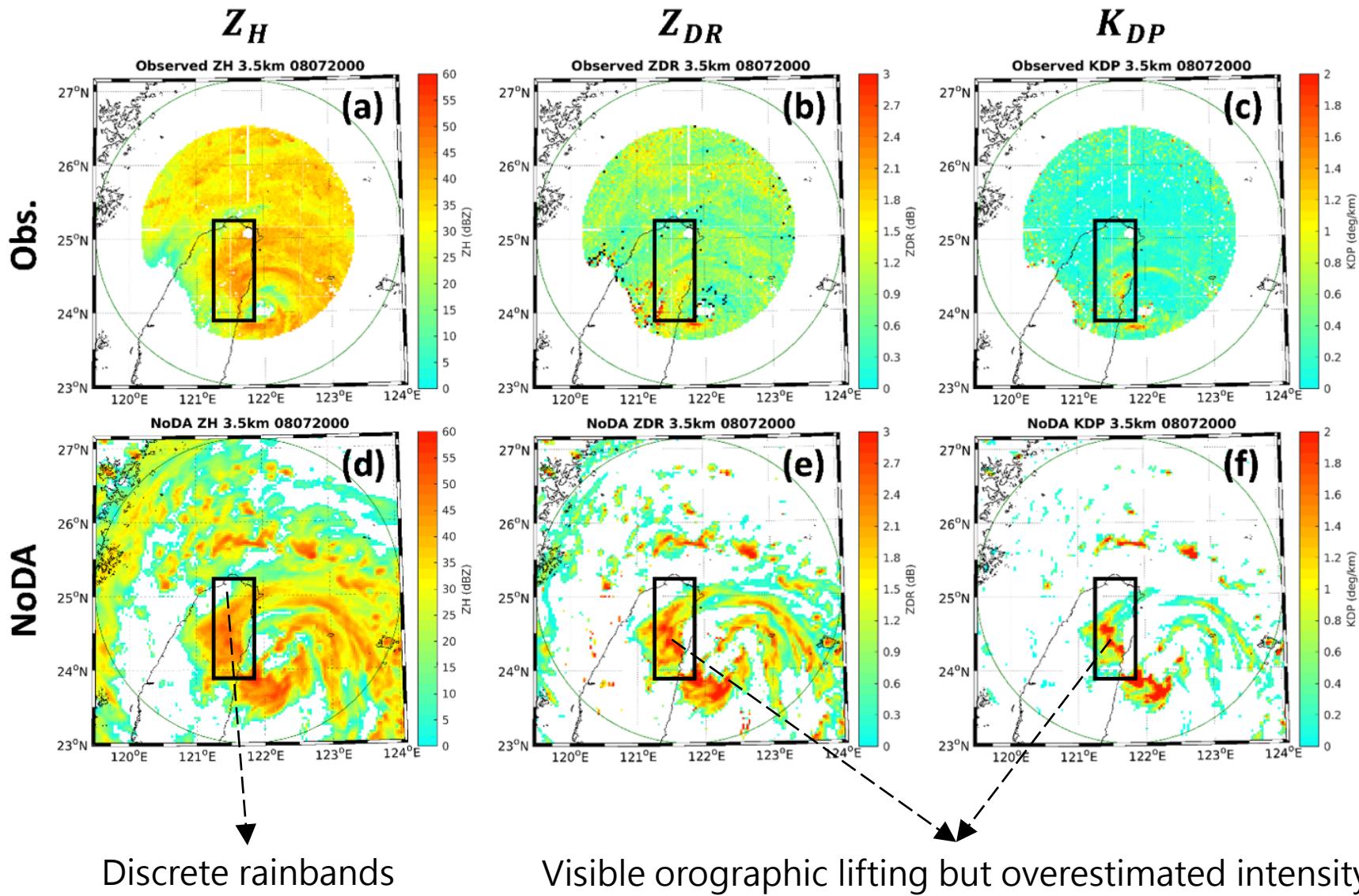
# Experimental design



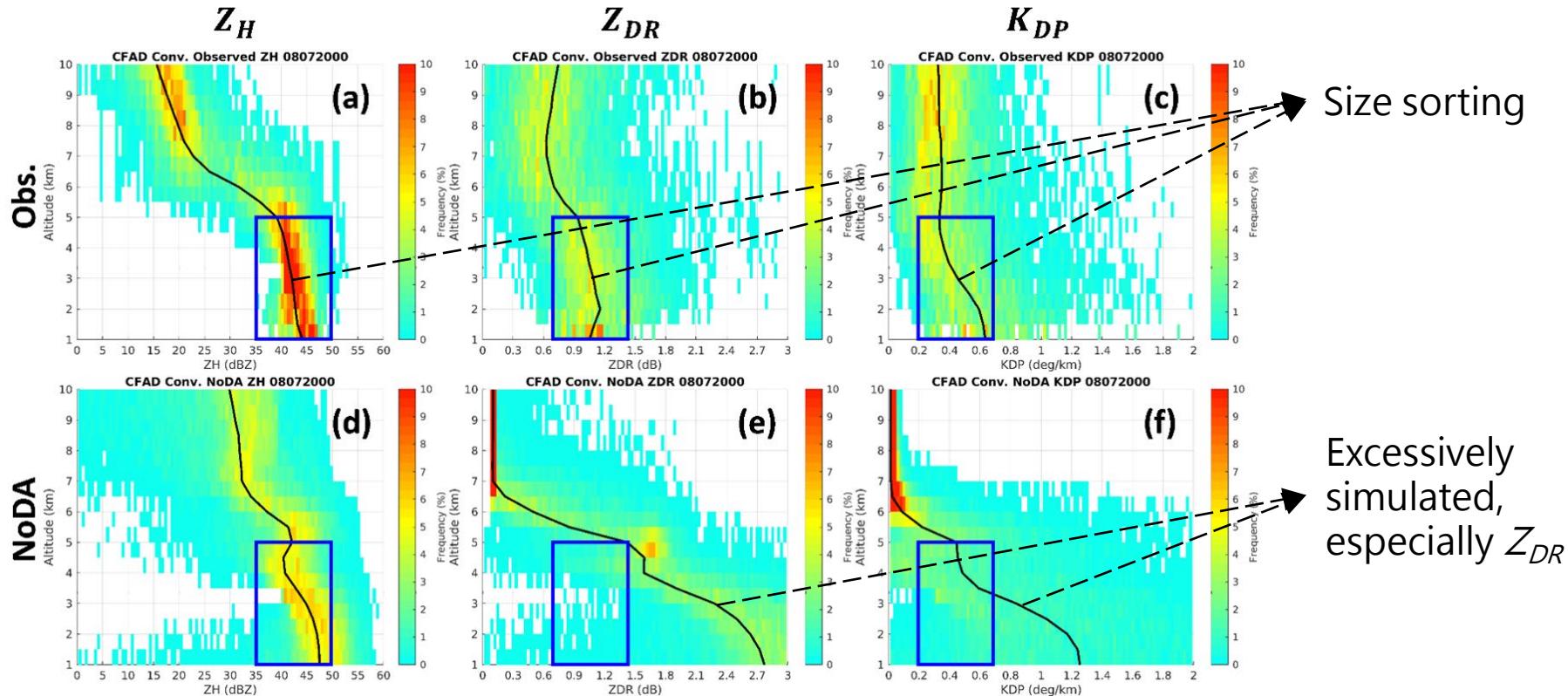
# Assessment of the observation operator



# CAPPI at a 3.5-km altitude



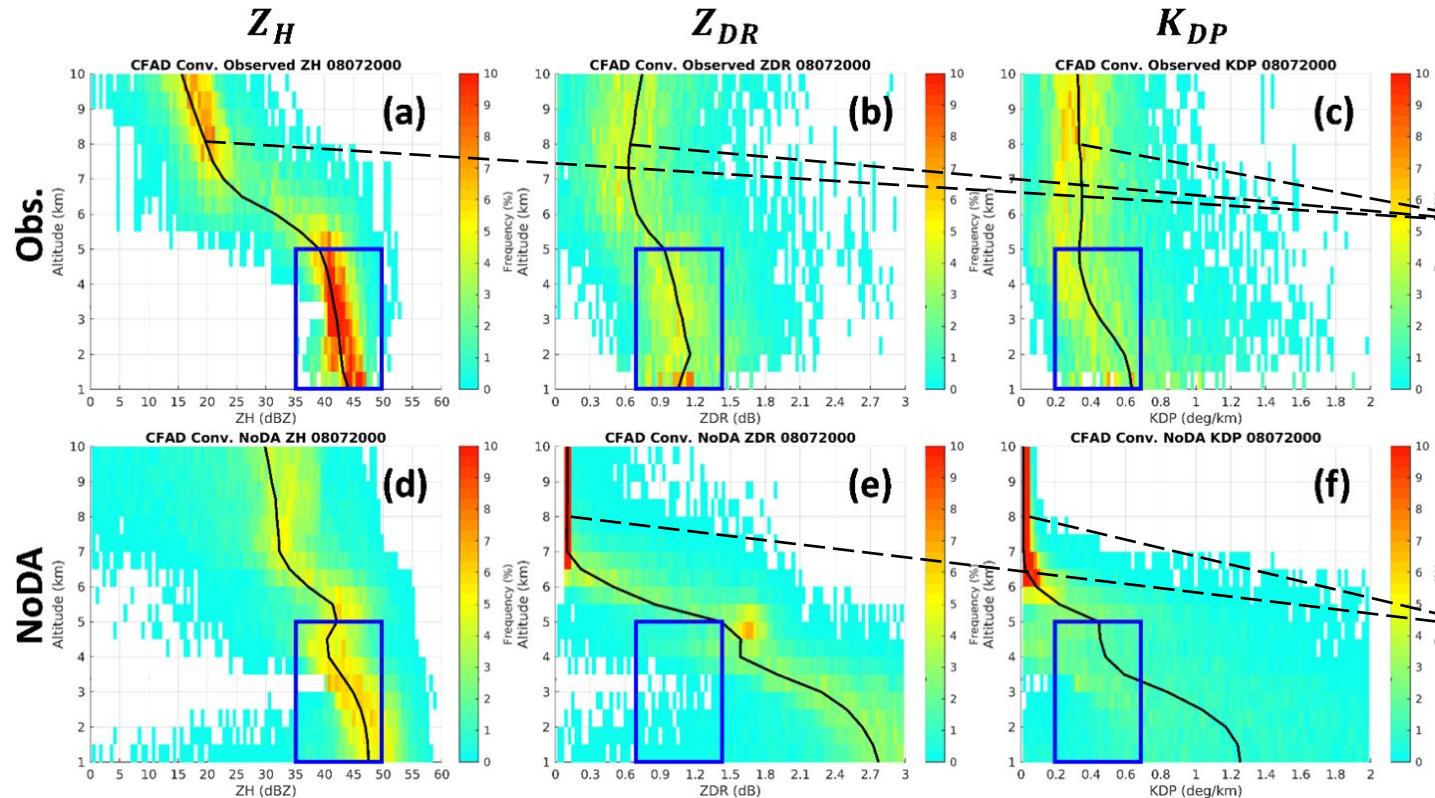
# CFAD in convective precipitation areas



## ■ Operator error source #1: unsuitable raindrop shape-size relation

- Overestimation is maximal for  $Z_{DR}$  (most directly related to the raindrop shape) and minimal for  $Z_H$  (least)
- Raindrops tend to be more spherical than theoretical ones in Zhang et al. (2001) according to Chang et al. (2009) observing 13 typhoons that struck Taiwan

# CFAD in convective precipitation areas



Lower values:  
widespread snow

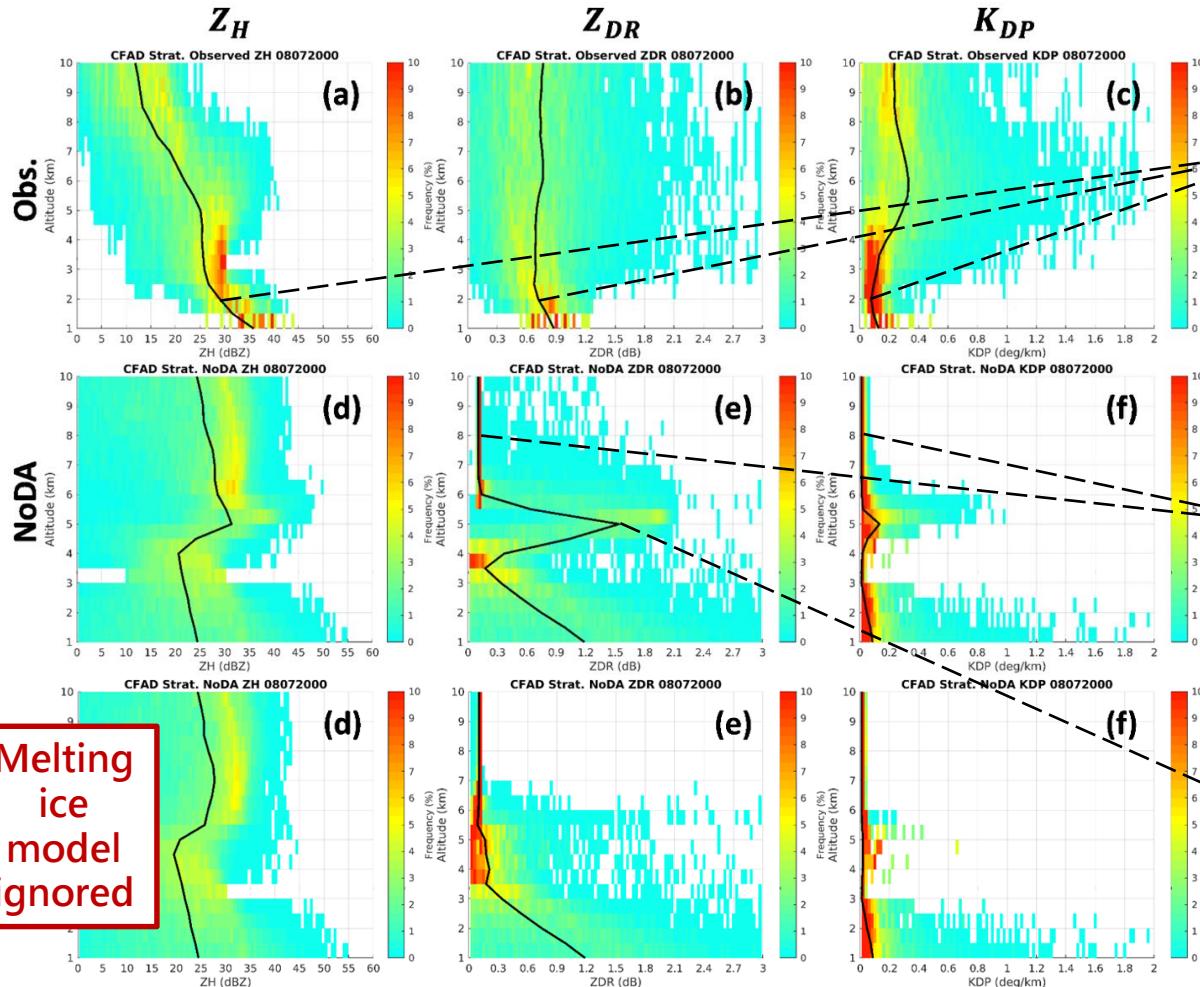
Higher values:  
supercooled water  
and mixed-phase  
hydrometeors

Serious  
underestimation

## ■ Operator error source #2: limitations for ice-phase hydrometeors

- Snow, graupel, and hail are all treated as ice ellipsoids with the same axis ratio
- Mie scattering may be more realistic for hailstones than Rayleigh scattering
- Ice crystals could be observable when they are vertically aligned by electric fields

# CFAD in stratiform precipitation areas



Shallower size sorting

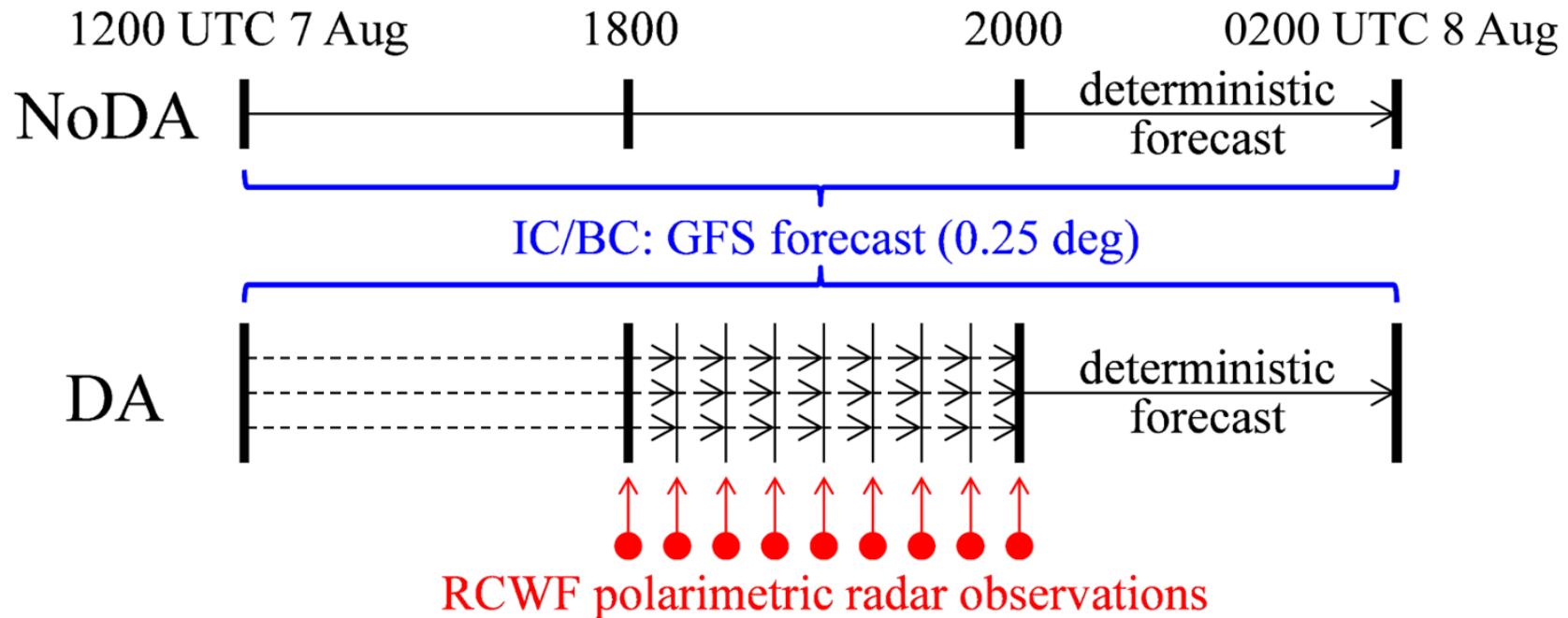
Smaller and more spherical raindrops

Aforementioned limitations

Excessive bright band signature

- Operator error source #3: unsuitable melting ice model

# Data assimilation experiments



Time (UTC)	Procedure of DA experiments
1200	40-member ensemble perturbed via the random-cv of WRF 3DVar
1200–1800	Spin-up period
1800–2000	Nine LETKF assimilation cycles at a 15-min interval
2000–0200	Deterministic forecast using the analysis ensemble mean

# Data assimilation experiments



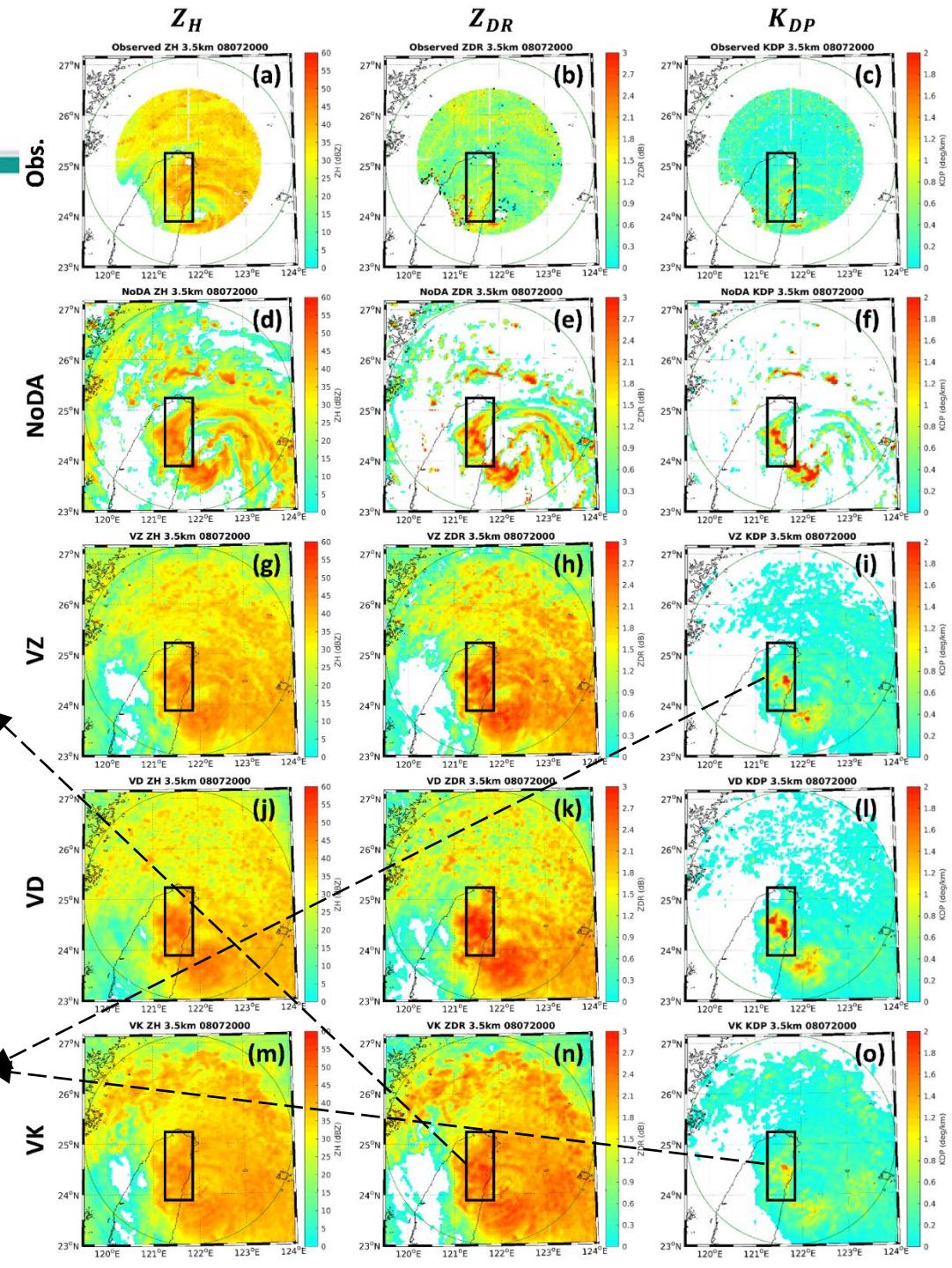
Name	Assimilated radar variables
NoDA	None
V	$V_r$
VZ	$V_r \ Z_H$
VD	$V_r \ Z_{DR}$
VK	$V_r \ K_{DP}$
VZD	$V_r \ Z_H \ Z_{DR}$
VZK	$V_r \ Z_H \ K_{DP}$
VZDK	$V_r \ Z_H \ Z_{DR} \ K_{DP}$

# CAPPI at a 3.5-km altitude

VZ, VD, and VK all correct the discrete rainband pattern

VK slightly mitigates the overestimation of  $Z_{DR}$

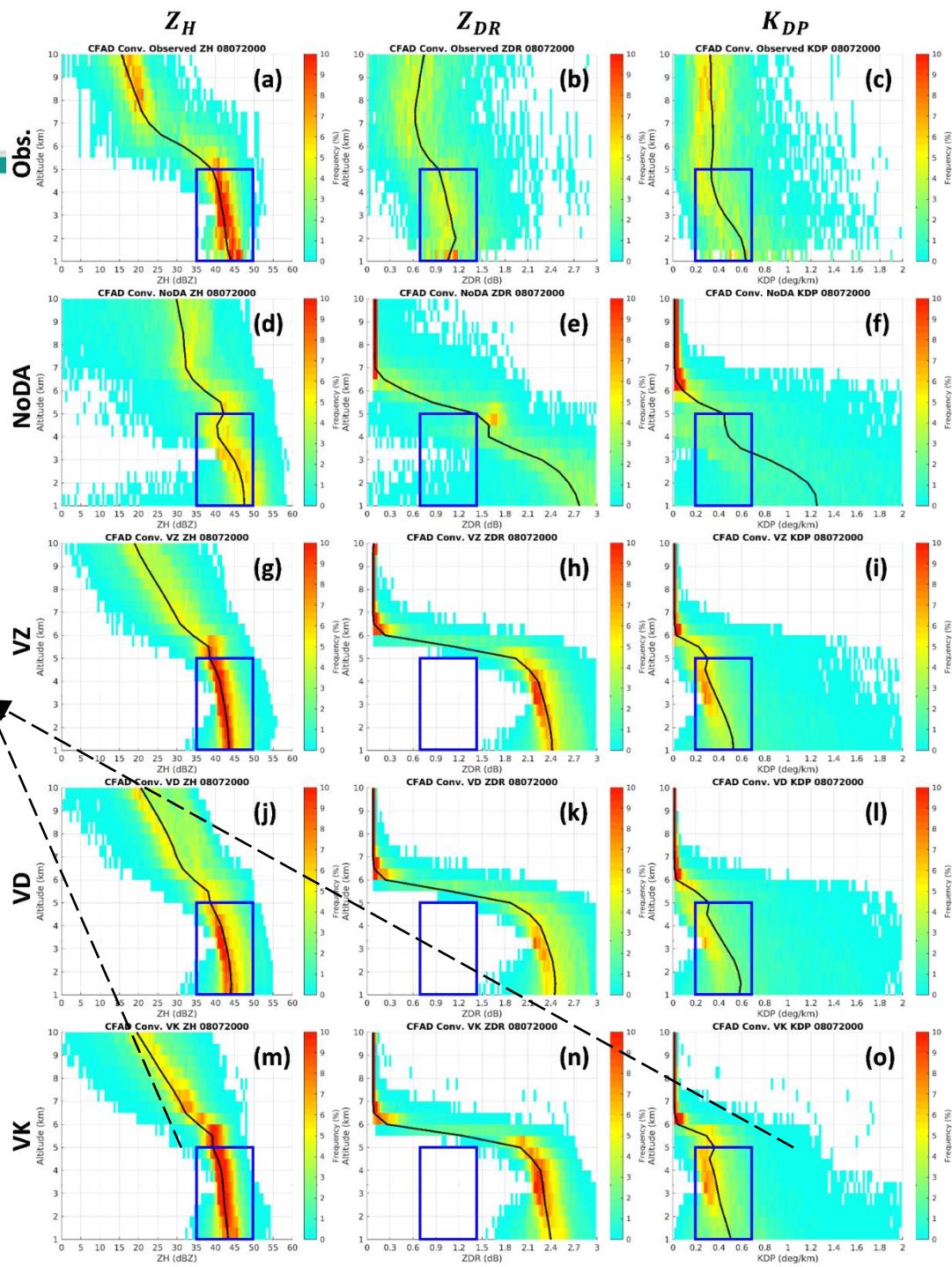
VZ and VK, especially the latter, correct the overestimation of  $K_{DP}$



# CFAD in convective precipitation areas

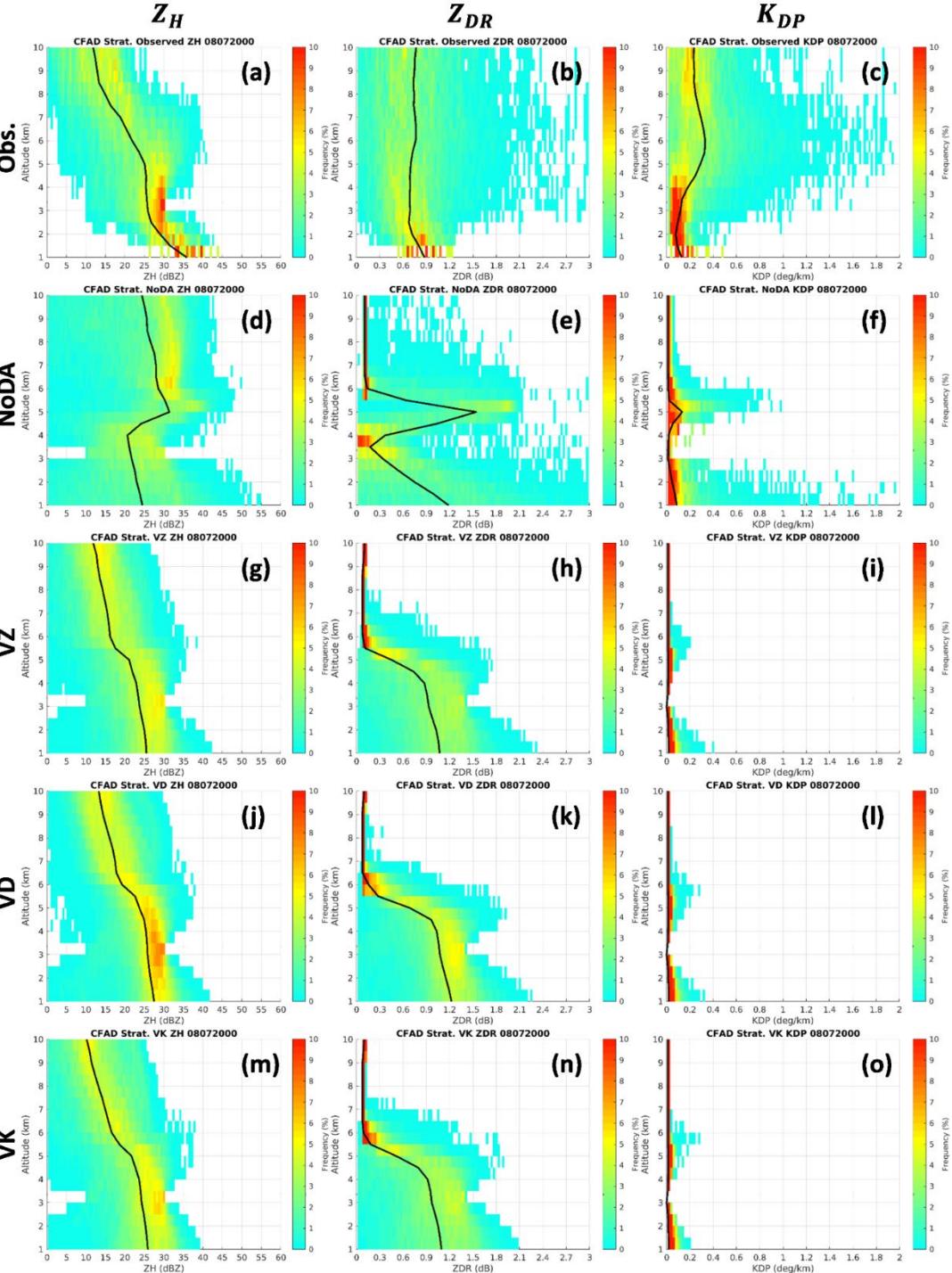
VZ, VD, and VK all correct the excessive increasing trend for  $K_{DP}$  at lower levels

VK shows the most realistic dispersion for the whole spectra of  $Z_H$  and  $K_{DP}$



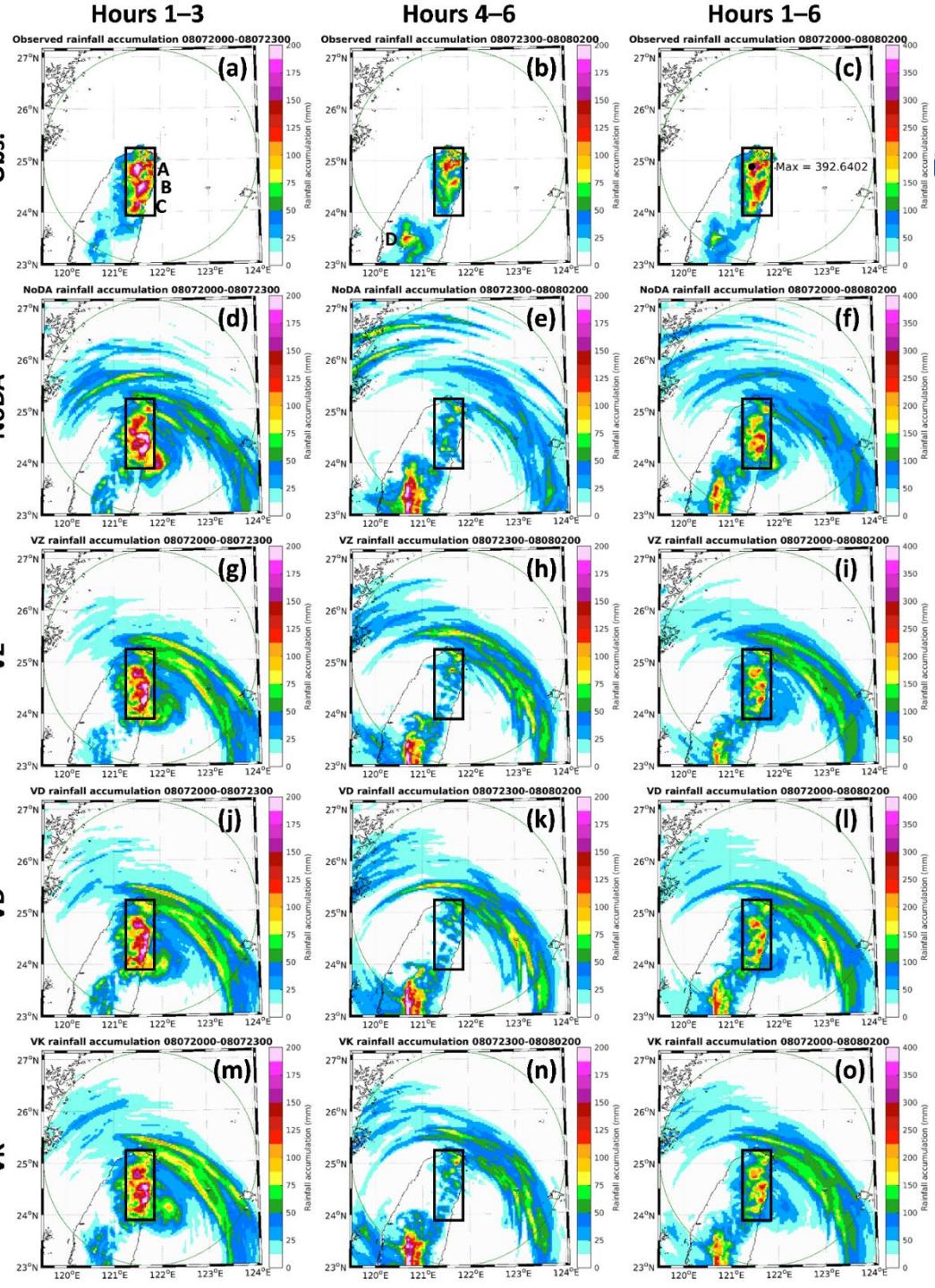
# CFAD in stratiform precipitation areas

VZ, VD, and VK all correct the excessive bright band signature for  $Z_H$  and  $Z_{DR}$



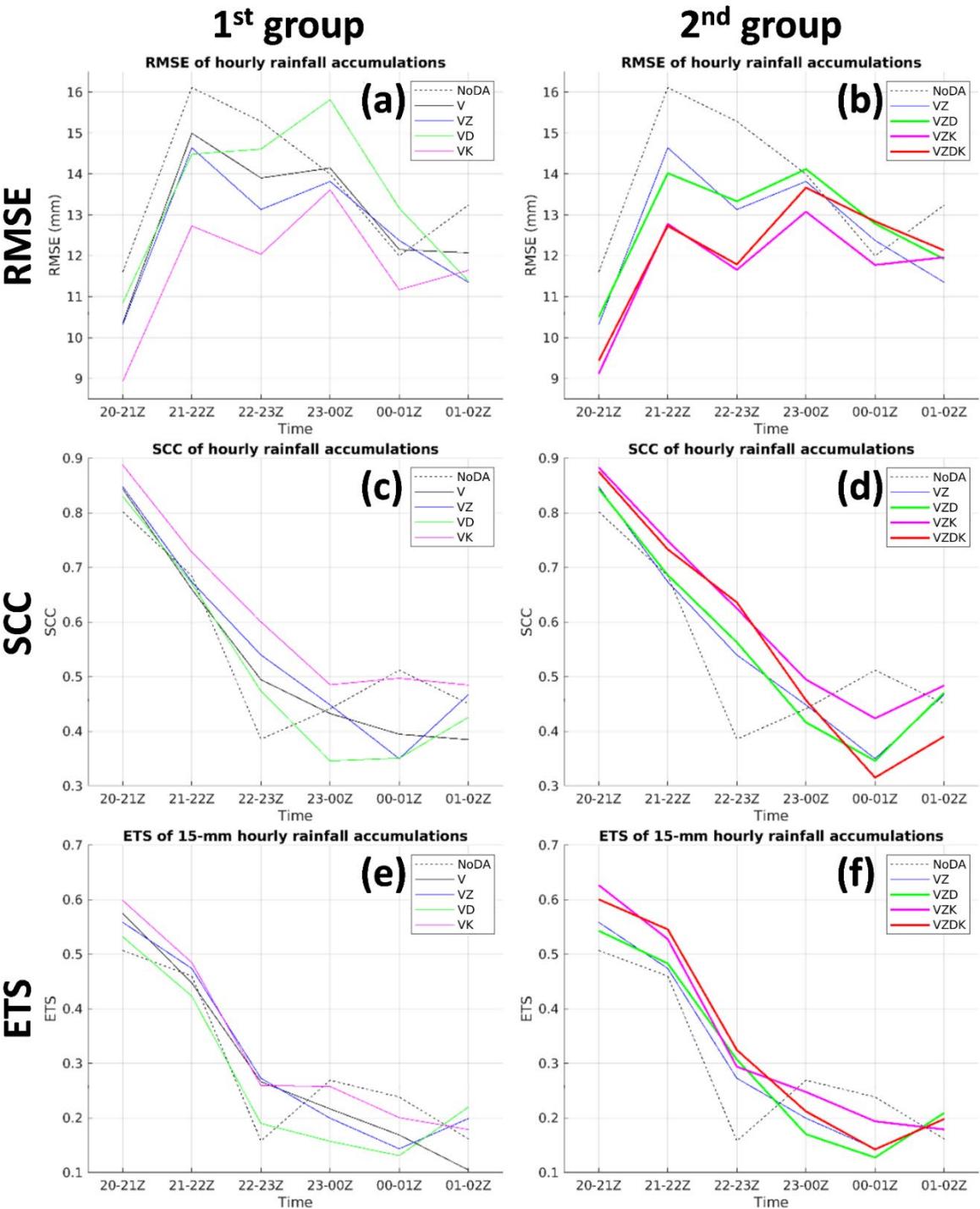
# Rainfall nowcasting

Positive effect of radar data assimilation on predicted rainfall can last 3 hours



# Rainfall nowcasting

Performance of the 1<sup>st</sup> group:  
VK>VZ>V>VD>NoDA



# Summary



- **Values of the polarimetric radar observation operator:**
  - Forecast verification
  - Evaluation of cloud microphysics schemes
  - **Data assimilation**
- **Limitations:**
  - Unsuitable raindrop shape-size relation
  - Limitations for ice-phase hydrometeors
  - Unsuitable melting ice model
- **Impacts of polarimetric radar data assimilation:**
  - With the unadjusted observation operator, polarimetric radar data assimilation still corrects the following in observation space:
    1. Discrete rainband pattern
    2. Overestimation of  $Z_{DR}$  and  $K_{DP}$
    3. Excessive bright band signature
  - Benefits:  $K_{DP} > Z_H > Z_{DR}$ 
    1. Lower levels of convective precipitation areas
    2. Predicted rainfall
  - Positive effect on predicted rainfall can last **3 hours** by assimilating one S-band polarimetric radar in this typhoon case

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