



同化臺灣地區沿岸近地表雷達資料之效益評估

Evaluation of the Benefits of Data Assimilation for Near-Surface Coastal Radar Data in Taiwan

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Kao-Shen Chung¹, Chin-Chuan Chang¹, Bing-Xue Zhuang², Chen-Hau Lan^{1, 3} and Chih-Chen Tsai⁴

¹*Department of Atmospheric Sciences, National Central University, Taiwan*

²*Department of Atmospheric and Oceanic Sciences, McGill University, Canada*

³*National Center for Atmospheric Research, Colorado*

⁴*National Science and Technology Center for Disaster Reduction, New Taipei City, Taiwan*

Introduction

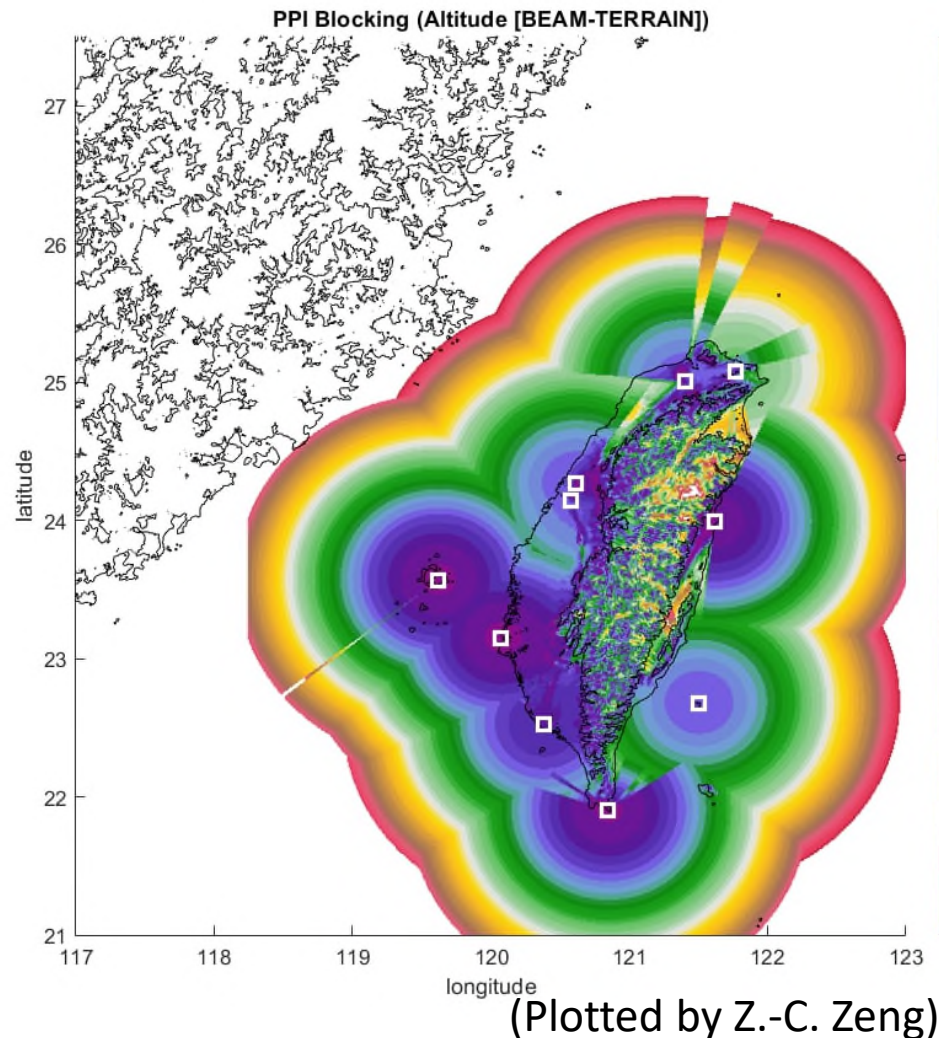
Data
& Methodology

Result
& Discussion

Summary

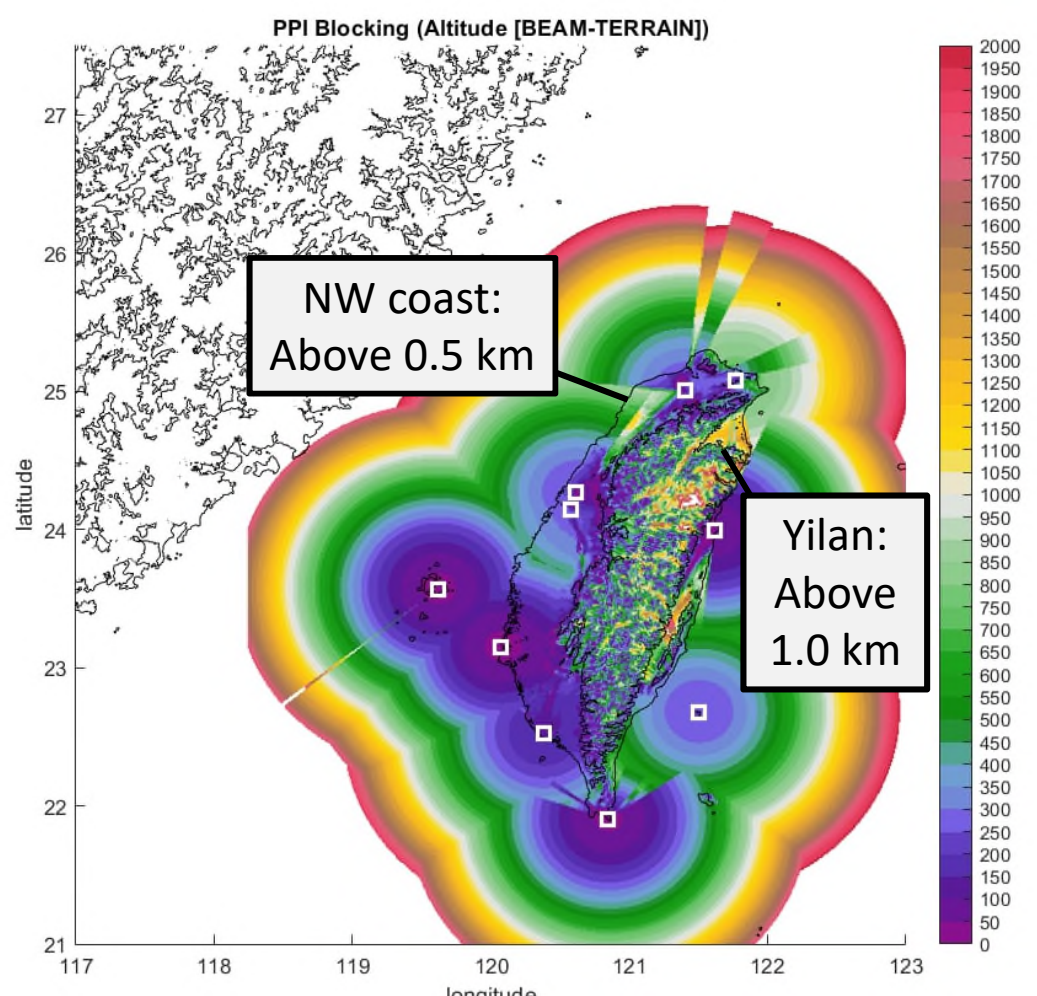
Introduction

Gap of the Operational Observation



- Weather radar with high spatial-temporal resolution offers an advantage in the construction of three-dimensional meteorological structures.
- Dual-polarization radar observation provides more comprehensive determination of cloud microphysics structures.
- However, near surface area are often lack the radar observation due to the terrain blockage and the lowest altitude of the observation plane.
- The scarcity of the radar data may limit the description of low-level dynamics and microphysics; also, impacts the accuracy of radar data assimilation.

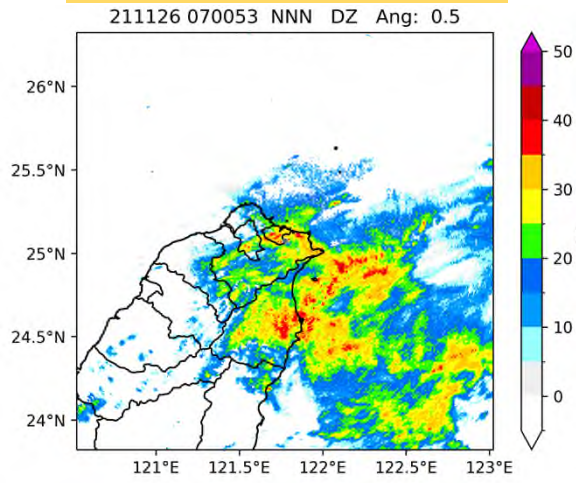
Gap of the Operational Observation



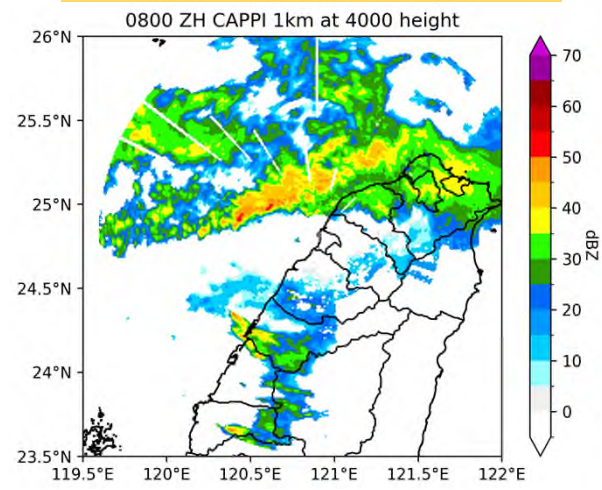
(Plotted by Z.-C. Zeng)

- Significant rainfall events often happened at northwestern coast and Yilan during the Mei-Yu season and winter, respectively.
- However, Yilan and northwestern coast are two regions which are lack of the low-level radar data.

2021YESR IOP2



2022 TAHOPE IOP3



Motivation and Purpose



NCAR S-POL
(S-band Dual Polarization Doppler Radar)

- ✓ S-Band
- ✓ **Dual-polarimetric Radar**
- ✓ SoWMEX, **TAHOPE...**

Photo by H.-E., Lin



TEAM-R (Taiwan Experimental Atmospheric Mobile Radar, since 2008)

- ✓ X-Band
- ✓ **Dual-polarimetric Radar**
- ✓ SoWMEX, **YESR, TAHOPE...**


- By employing the experimental mobile radar, the dynamic and microphysics structure at blockage region could be well observed. So, what is the added value of assimilating low level radar data?
- Two cases are selected to investigate how **additional gap-filling dual-polarization radar data** affects the results of data assimilation and model forecasts.

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& Methodology

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An orange rectangular sticky note with a folded bottom-right corner, centered on a white background. The text "Data & Methodology" is printed in black on the note.

Data
& Methodology

WRF-LETKF Radar Assimilation System (WLRAS)

(Tsai et al. 2014)

Local Ensemble Transform Kalman Filter (LETKF)

(Hunt et al. 2007)

✓ **Deterministic EnKF**

✓ Ensemble mean:

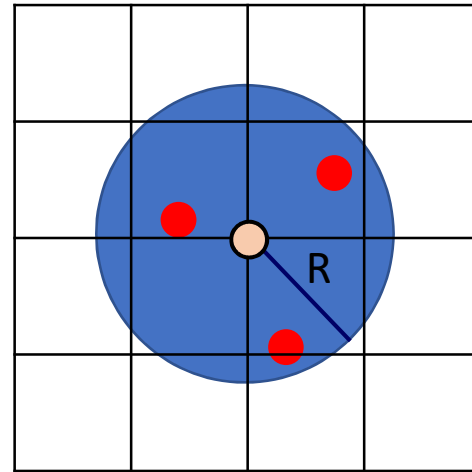
$$\bar{x}_a = \bar{x}_b + X_b \bar{w}$$

$$\bar{w} = \tilde{P}_a Y_b^T R^{-1} (y_o - H \bar{x}_b)$$

✓ Perturbation:

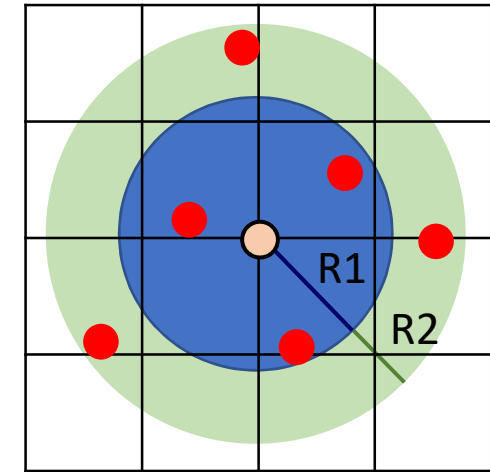
$$X_a = X_b W$$

$$W = [(n - 1) \tilde{P}_a]^{-\frac{1}{2}}$$



● OBS ○ Analysis point
R: Localization Radius

Mixed Localization (Tsai et al. 2014)



● OBS ○ Analysis point

Updated Variables	U, V	PH, T	q _v , q _c , q _i , N _c	q _r , q _s , q _g , N _r
H. L. (km)	36	12	24	12
V. L. (km)			4	
Inflation			1.08	

Polarimetric Radar Data Simulator (PRDS; Jung et al. 2008a, 2010)

Raindrop

Direct Integration (Jung et al. 2010)

$$Z_{hh,x} = \frac{4\lambda^4}{\pi^4 |K_w|^2} \int N_x(D) (A |f_{hh,x}(\pi)|^2 + B |f_{vv,x}(\pi)|^2 + 2C |f_{hh,x}(\pi)| |f_{vv,x}(\pi)|) dD$$

$$Z_{vv,x} = \frac{4\lambda^4}{\pi^4 |K_w|^2} \int N_x(D) (A |f_{vv,x}(\pi)|^2 + B |f_{hh,x}(\pi)|^2 + 2C |f_{hh,x}(\pi)| |f_{vv,x}(\pi)|) dD$$

 x : hydrometeor species λ : Radar wavelength K_w : Dielectric coefficient A , B and C : Canting coefficient $|f_{hh}|$ and $|f_{vv}|$: Scattering Amplitude(By **T-matrix method**, Vivekanandan et al. 1991)

Ice particles

Scattering Amplitude Fitting (Jung et al., 2008a)

$$N_X(D_X) = N_{0,X} D_X^\mu \exp(-\Lambda_X D_X) \quad |f_{hh}| = \alpha_{hh,x} D_x^{\beta_{hh,x}} \quad |f_{vv}| = \alpha_{vv,x} D_x^{\beta_{vv,x}} \quad [\alpha_x \text{ and } \beta_x : \text{fitting coefficient}]$$

$$Z_{hh,x} = \frac{4\lambda^4 N_{0,x}}{\pi^4 |K_w|^2} \left(A \alpha_{hh,x}^2 \frac{\Gamma(\mu_x + 2\beta_{hh,x} + 1)}{\Lambda_x^{\mu_x + 2\beta_{hh,x} + 1}} + B \alpha_{vv,x}^2 \frac{\Gamma(\mu_x + 2\beta_{vv,x} + 1)}{\Lambda_x^{\mu_x + 2\beta_{vv,x} + 1}} + 2C \alpha_{hh,x} \alpha_{vv,x} \frac{\Gamma(\mu_x + \beta_{hh,x} + \beta_{vv,x} + 1)}{\Lambda_x^{\mu_x + \beta_{hh,x} + \beta_{vv,x} + 1}} \right)$$

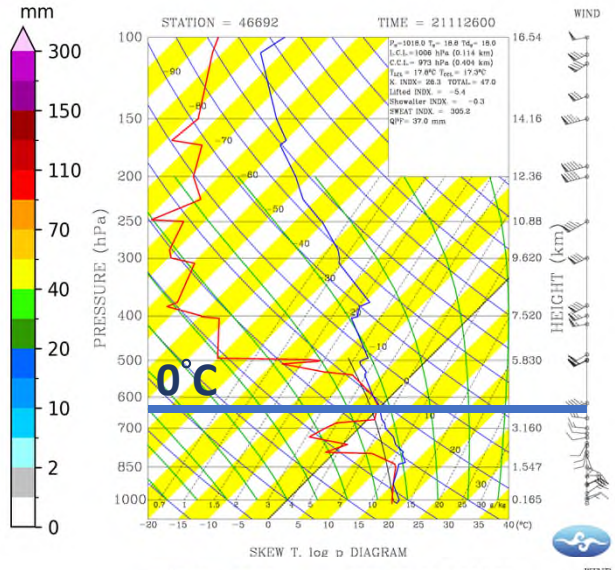
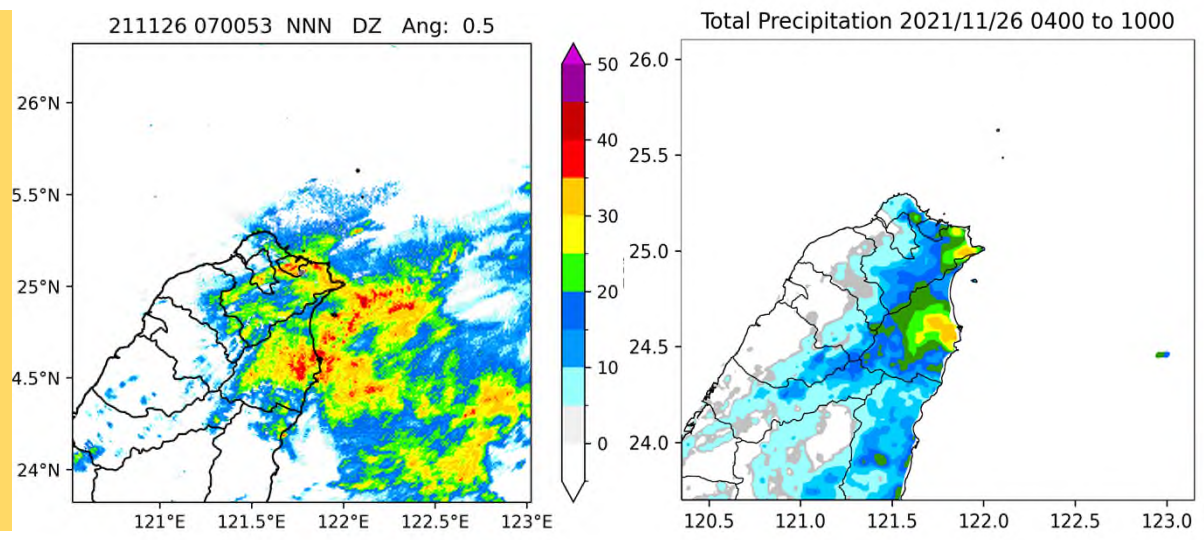
$$Z_{vv,x} = \frac{4\lambda^4 N_{0,x}}{\pi^4 |K_w|^2} \left(A \alpha_{vv,x}^2 \frac{\Gamma(\mu_x + 2\beta_{vv,x} + 1)}{\Lambda_x^{\mu_x + 2\beta_{vv,x} + 1}} + B \alpha_{hh,x}^2 \frac{\Gamma(\mu_x + 2\beta_{hh,x} + 1)}{\Lambda_x^{\mu_x + 2\beta_{hh,x} + 1}} + 2C \alpha_{hh,x} \alpha_{vv,x} \frac{\Gamma(\mu_x + \beta_{hh,x} + \beta_{vv,x} + 1)}{\Lambda_x^{\mu_x + \beta_{hh,x} + \beta_{vv,x} + 1}} \right)$$

Dual-pol
Parameters

$$Z_{HH} = \log_{10} \left(\sum Z_{hh,x} \right) \quad Z_{VV} = \log_{10} \left(\sum Z_{vv,x} \right) \quad Z_{DR} = \log_{10} \left(\frac{\sum Z_{hh,x}}{\sum Z_{vv,x}} \right)$$

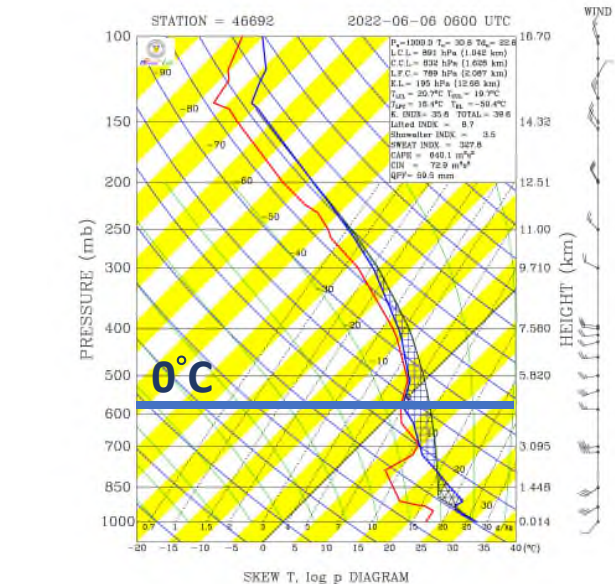
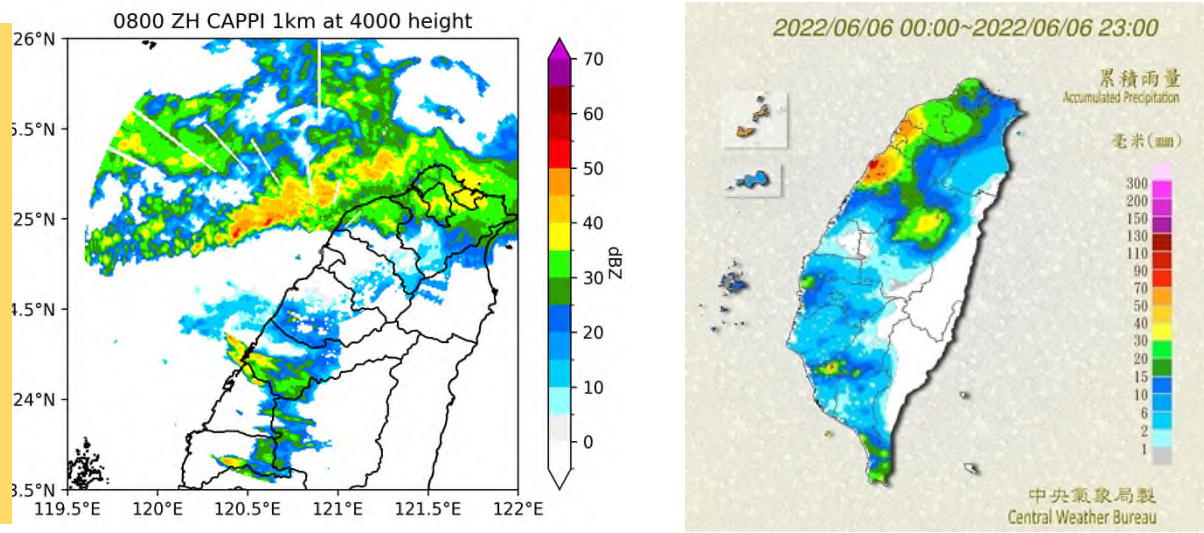
Case Studies

2021 YESR IOP2



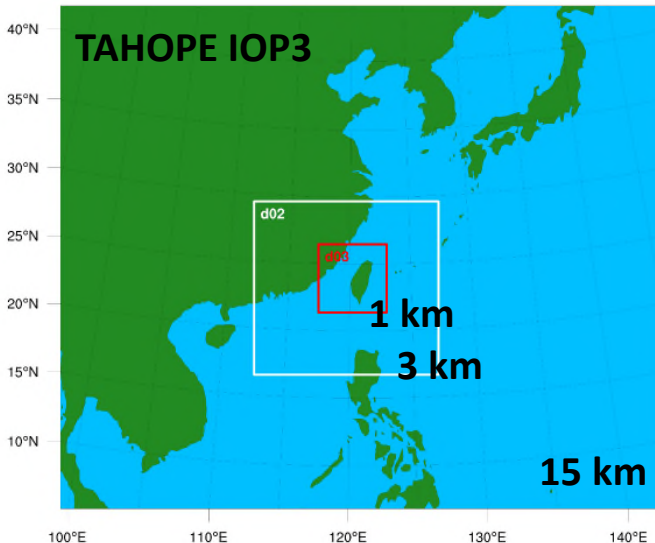
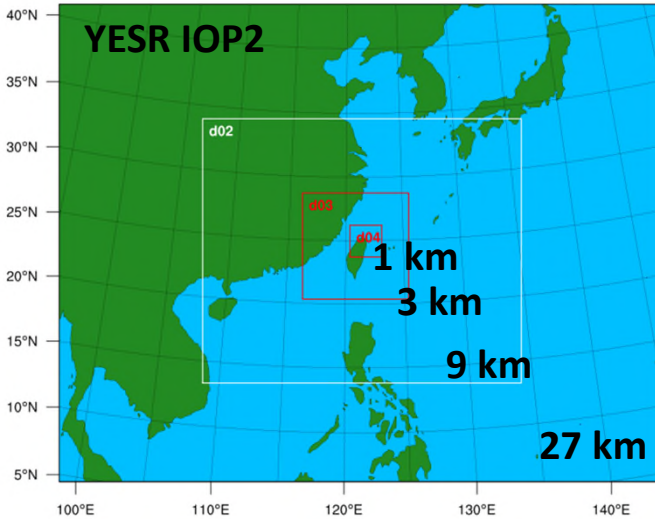
- Shallow-convection systems kept popping up, causing moderate rainfall happened at Yilan.
- Two moist layers (0-1.5km, 3.5~4.5km). 0°C is about 3-4 km height.

2022 TAHOPE IOP3



- Meso scale system induced by the Mei-Yu front, causing rainfall happened at north-west coast.
- 0°C level: about 4-5 km height.

Configuration of Ensemble Simulation



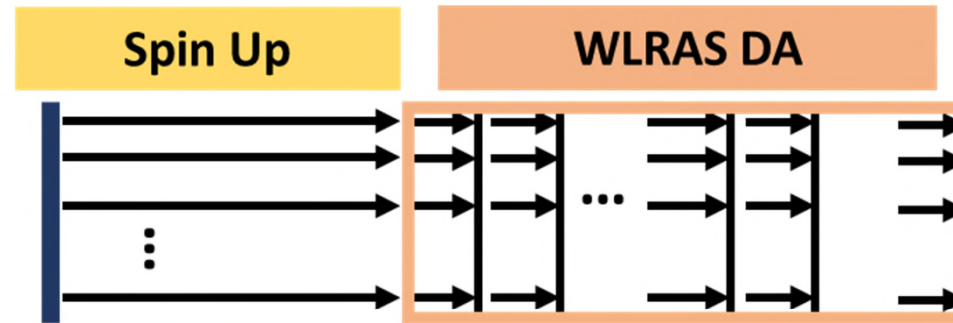
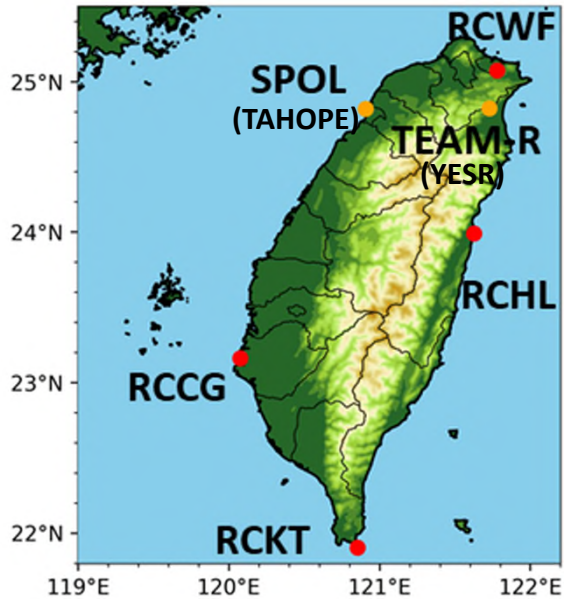
	YESR IOP2	TAHOPE IOP3
WRF Version	V 4.1.3	V 3.9.1
Start time	2021-11-25 12 UTC	2022-06-05 18 UTC
End time	2021-11-26 04 UTC	2022-06-06 06 UTC
IC. & BC.	NCEP FNL 0.25°	
Vertical levels	52 levels from surface to 10hPa	
Ens. Members	128	50
Perturbation method	WRFDA cv3	
Nesting	2-way nesting	
Physics	MP: WDM6 (Lim and Hong, 2010) LW: RRTM scheme SW: Dudhia scheme BL: YSU scheme	

Configuration of Experiments

Period of DA cycle:

YESR IOP2: 15 mins, 17cycles

TAHOPE IOP3: 12 mins, 11cycles



	Assi. data	σ_o
Vr	Full volume,	3(m/s)
Z _{HH}	$< 3 \times \sigma_o$	5(dBZ)
Z _{DR}	< 3 (4) km in winter (summer) case, $< 3 \times \sigma_o$	0.2(dB)

25 th Nov. 2021 1200 UTC	26 th Nov. 2021 0400 UTC	26 th Nov. 2021 0800UTC	YESR IOP2
5 th Jun. 2021 1800 UTC	6 th Jun. 2021 0600 UTC	6 th Jun. 2021 0800UTC	TAHOPE IOP3


Experiments	Assi. parameter	Assi. Radar
VrZ_noL	Vr and Z _{HH}	Operational Radar
VrZ_plusL		Opt. Radar + TEAM-R (YESR) or SPOL (TAHOPE)
VrZZ_noL	Vr, Z _{HH} and Z _{DR}	Operational Radar
VrZZ_plusL		Opt. Radar + TEAM-R (YESR) or SPOL (TAHOPE)

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Result & Discussion

Result & discussion

Root Mean Square Residual (RMSR)

Calculated at OBS points
below melting layer

Vr (m/s)

Z_{HH} (dBZ)

Z_{DR} (dB)

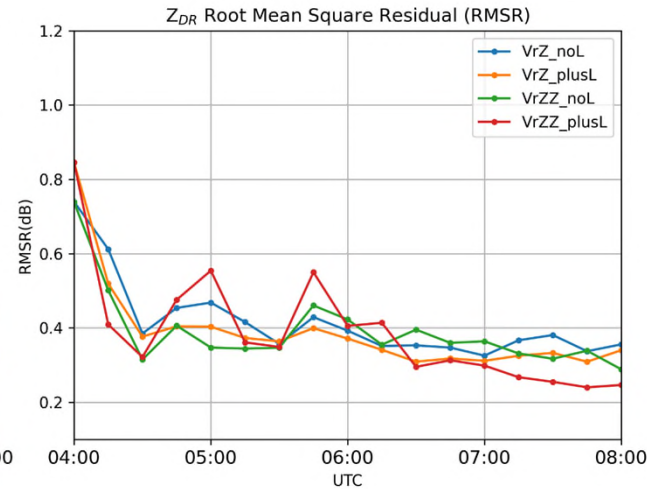
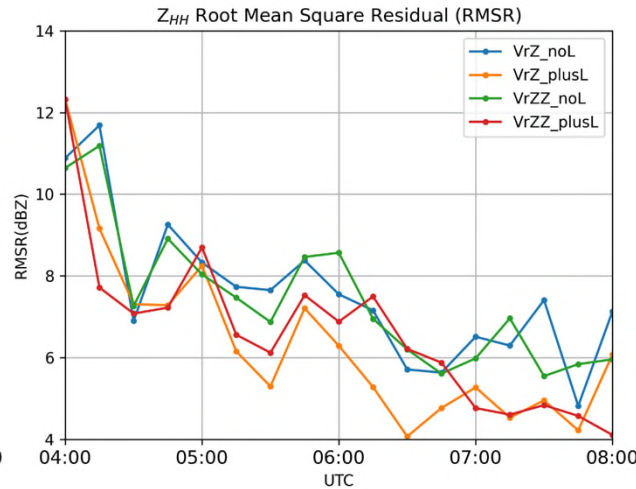
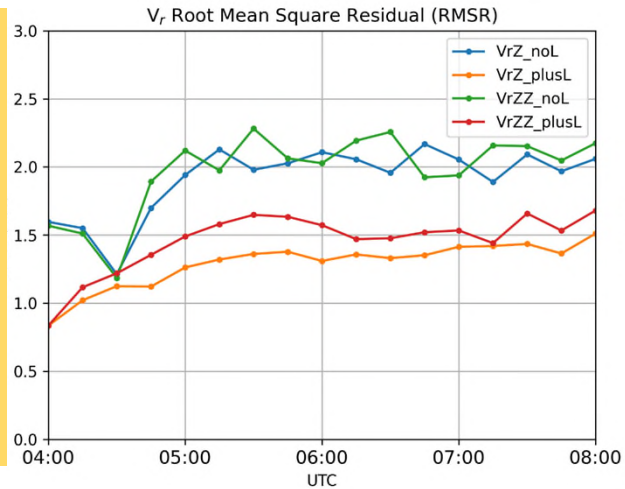
$$RMSR = \sqrt{\frac{\sum (y^o - H\bar{x}^a)^2}{n}}$$

- Assimilating low-level radar data effectively reduces the V_r RMSR.

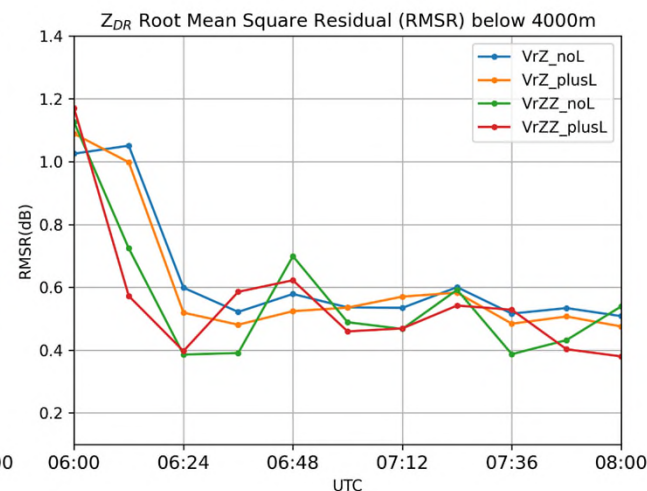
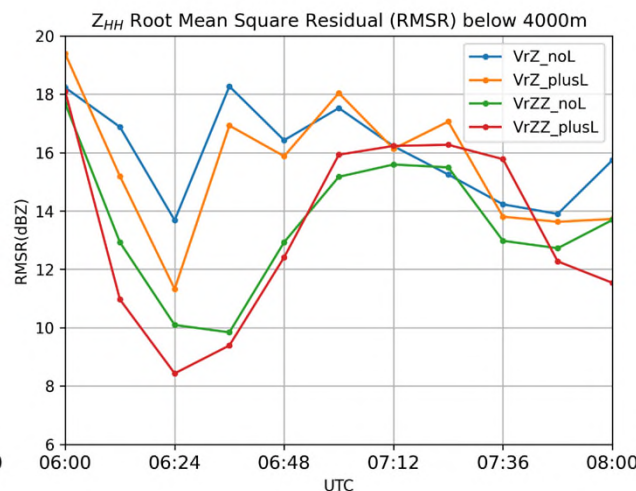
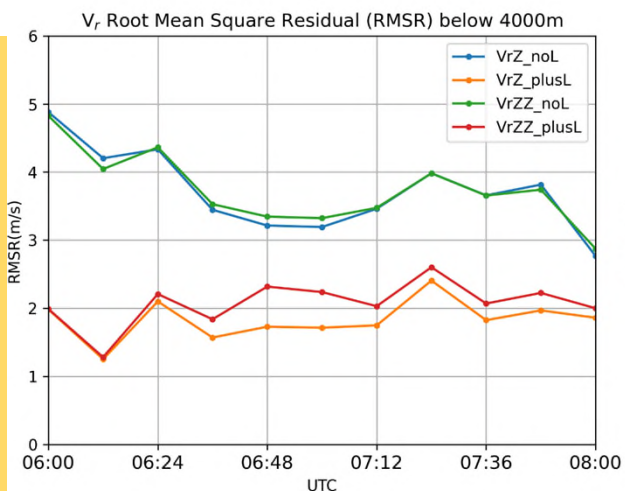
- When Z_{DR} is assimilated into the model, the Z_{HH} RMSR becomes lower overall.

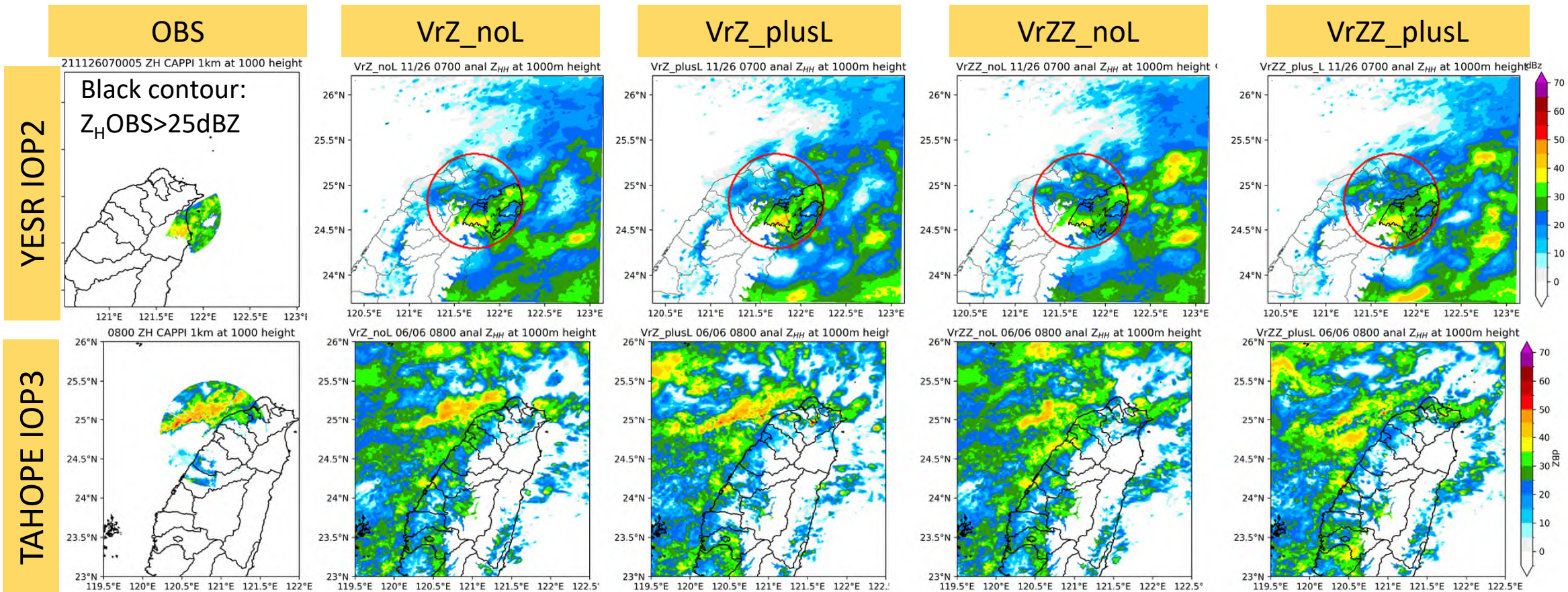
- Z_{DR} in different experiments are comparable.

YESR IOP2

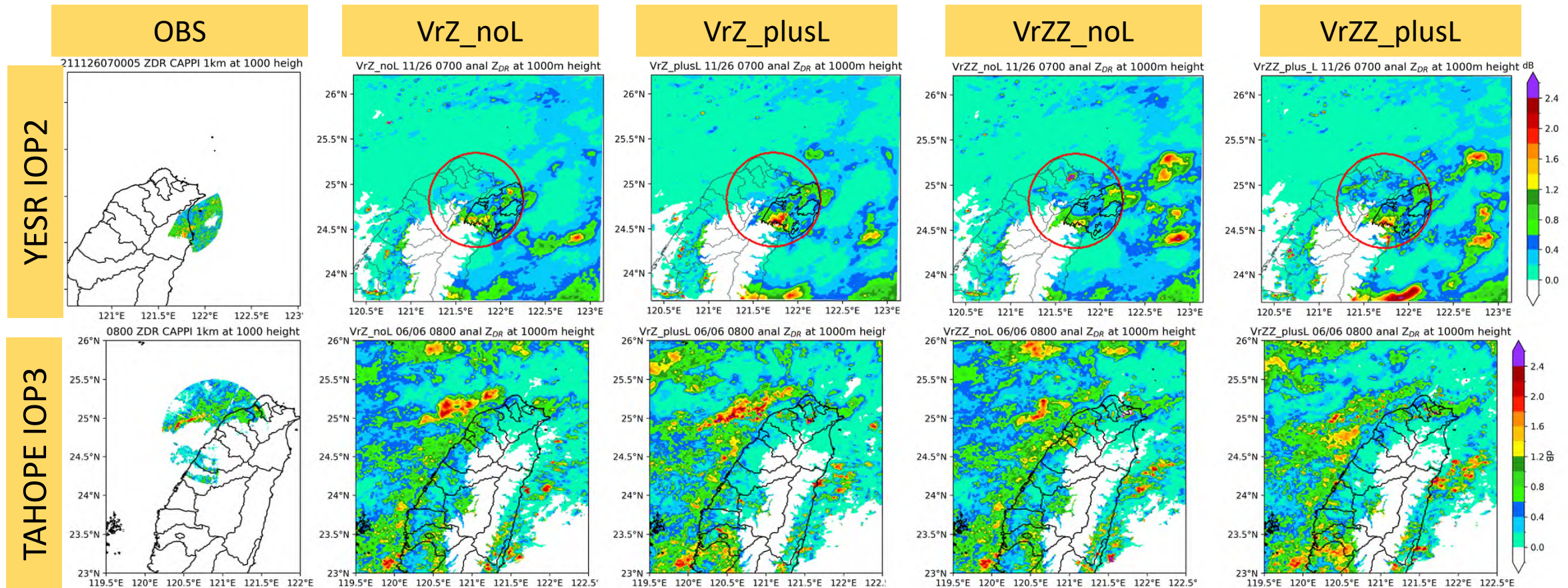


TAHOPE IOP3





- Assimilating low-level radar data leads analyzed Z_{HH} close to the observation.
- Assimilating Z_{DR} into model decrease the intensity of Z_{HH} , especially in the summer case.



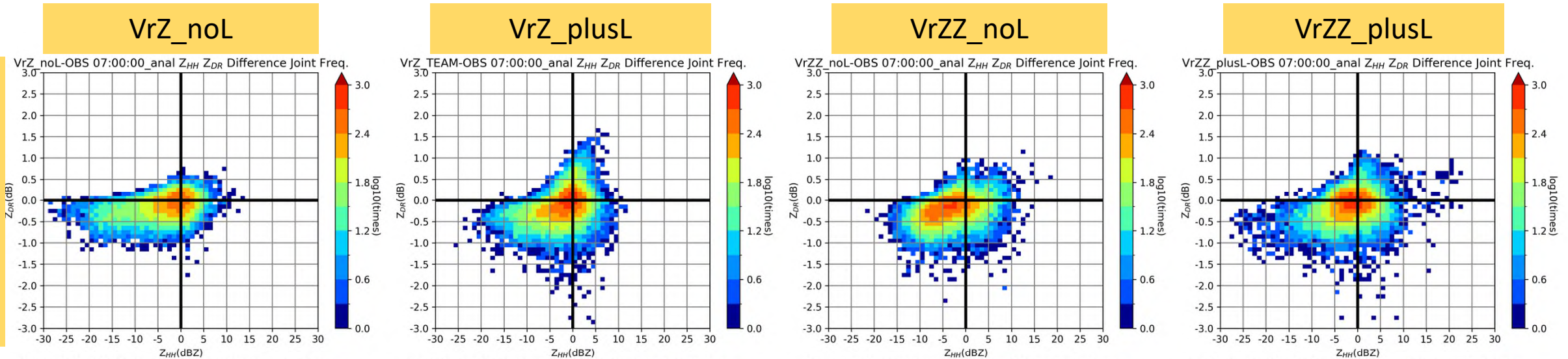
- Assimilating low-level conventional radar data leads analyzed Z_{DR} higher.
- Assimilating Z_{DR} into model decrease the intensity of Z_{DR} , especially in the summer case, which decreases the overestimation of the analyzed Z_{DR} .

Result & discussion

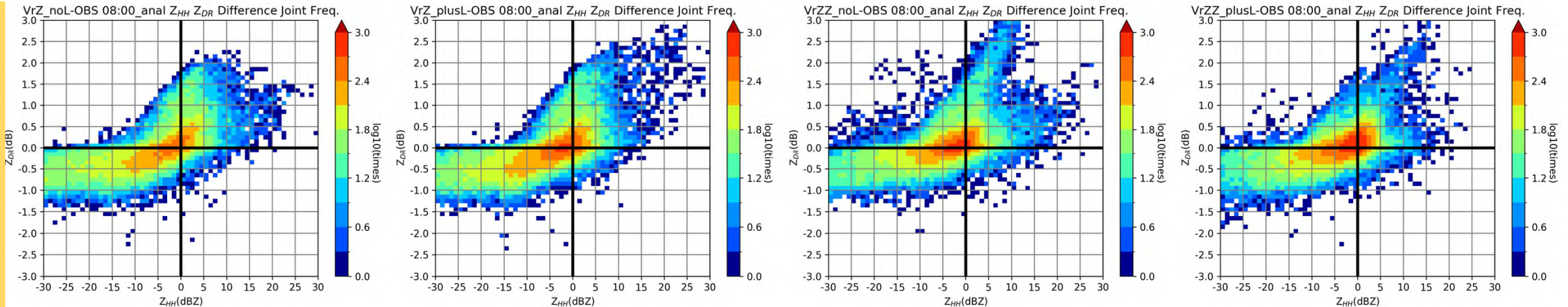
$Z_{HH} - Z_{DR}$ Difference Between Exps. and OBS

Calculated at OBS points **19**
below melting layer

YESR IOP2



TAHOPE IOP3



- Overall, assimilating not only low-level radar data but also Z_{DR} decreases the difference between analyses and model.
- However, obvious differences remain even after both datasets are assimilated in the summer case.

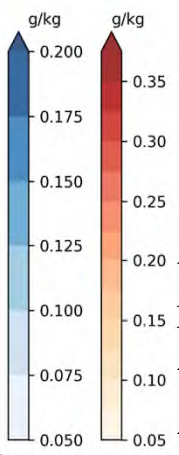
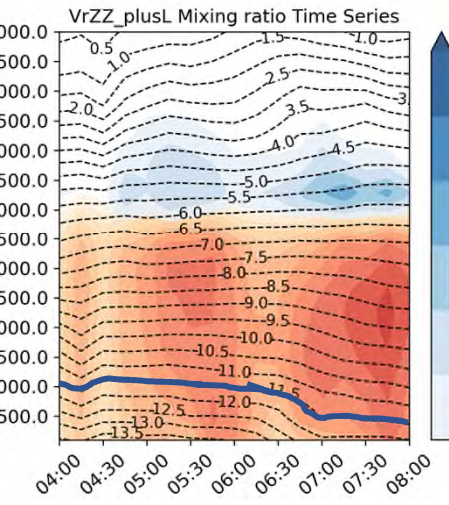
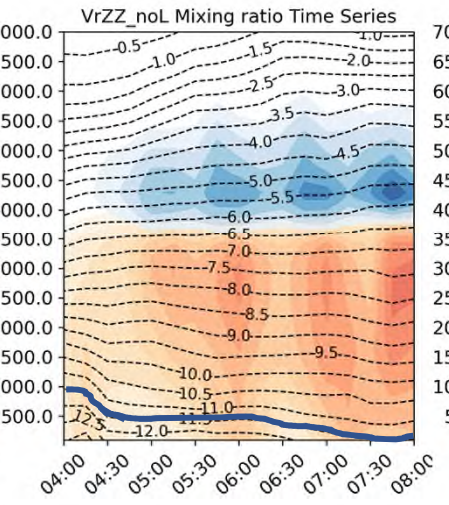
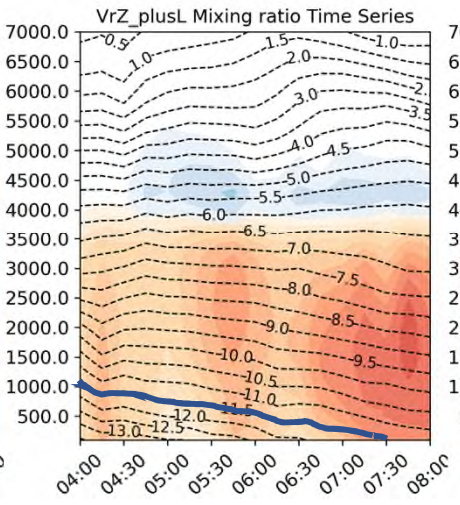
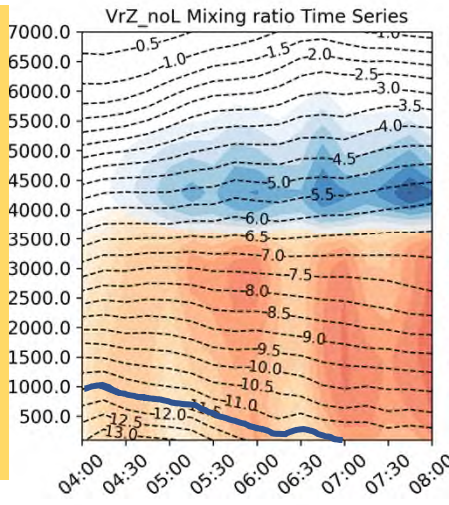
YESR IOP2

VrZ_noL

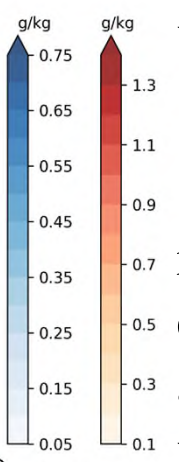
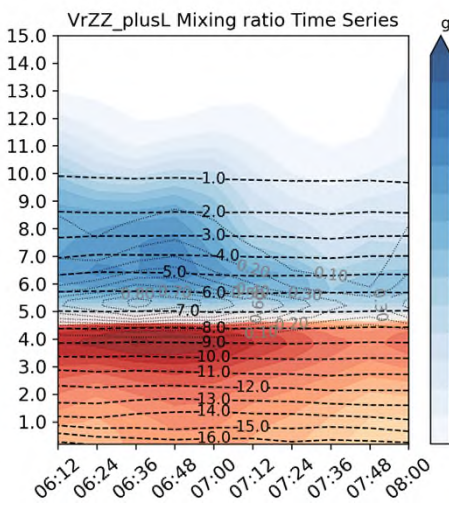
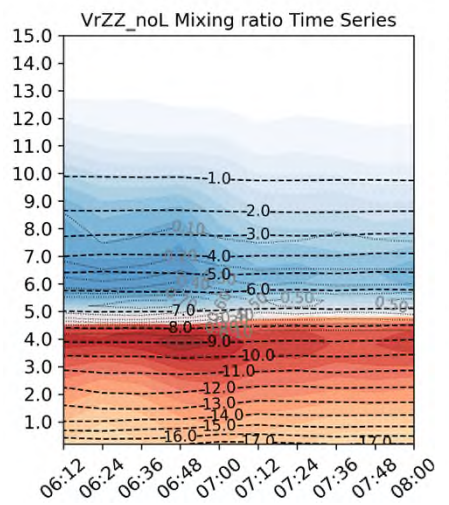
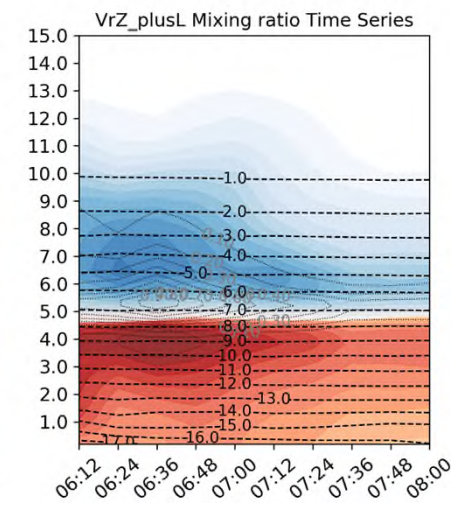
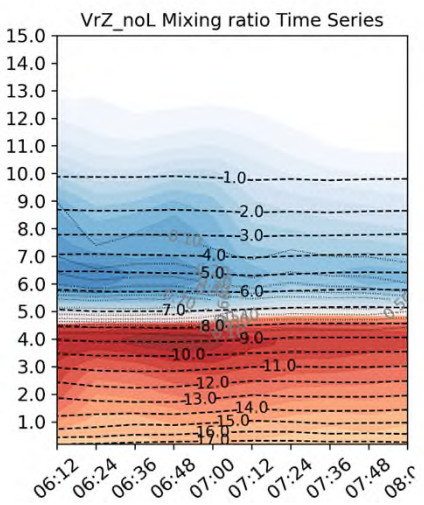
VrZ_plusL

VrZZ_noL

VrZZ_plusL



TAHOPE IOP3(conv.)

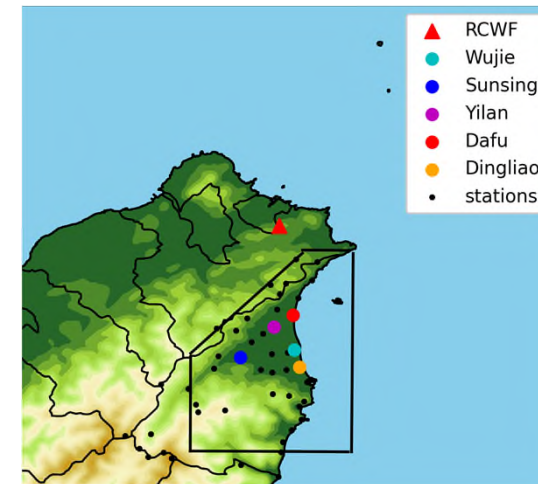
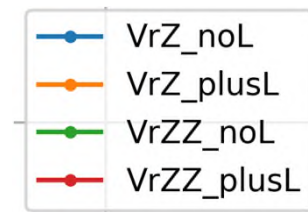


X-axis : Time (UTC)
 Y-axis : Height
 Red shaded: q_r (g/kg)
 Blue shaded: q_s (g/kg)
 Dashed line: q_v (g/kg)

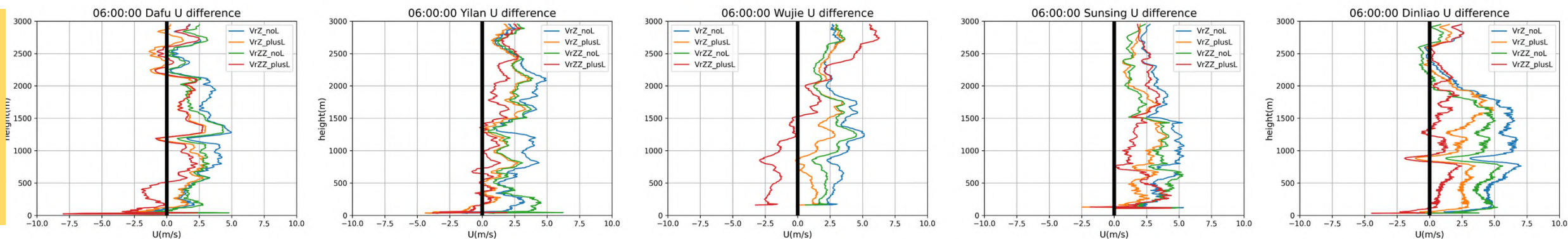
✓ Winter Case:
 Assimilating low-level radar data and Z_{DR} together would enhance the low-level q_r and q_v . Also, decrease q_s in the winter case.

✓ Summer Case:
 Assimilating low-level radar data would enhance q_r , but assimilating Z_{DR} would decrease it at the same time.

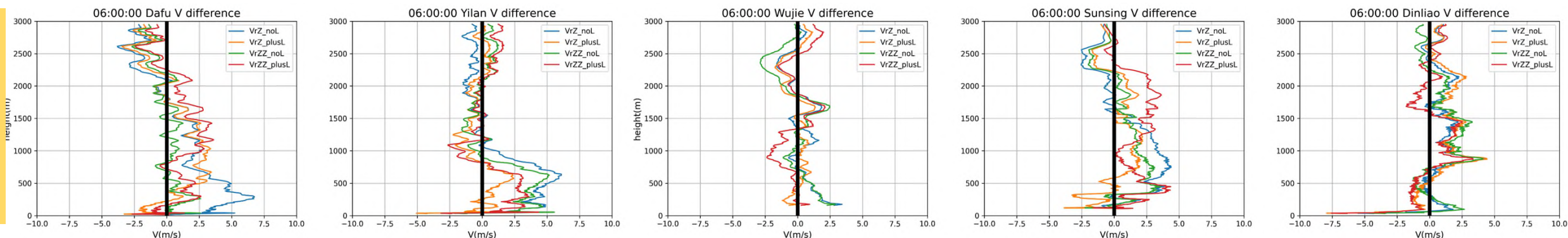
- Validate model by Storm Tracker data
- Assimilating low level radar data can improve U wind under 1500m and maintain the V wind error.
- Assimilating Z_{DR} into model can improve low level wind structure as well.
- Overall, VrZZ_plusL has the best dynamics structure.



U Wind Diff. (m/s)



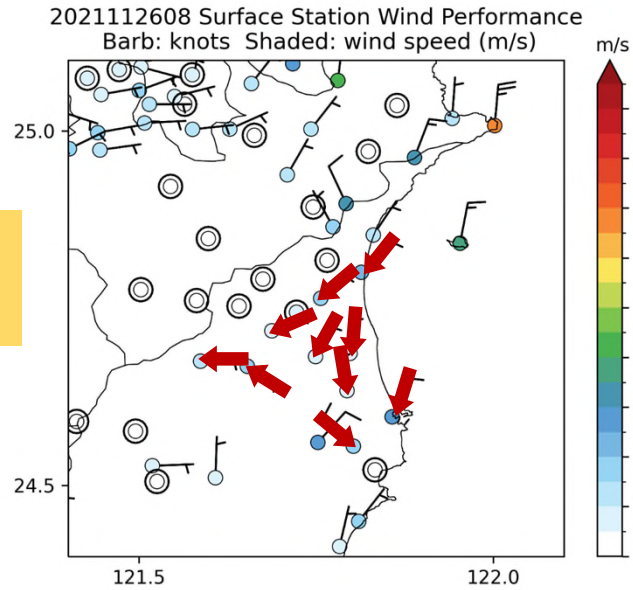
V Wind Diff. (m/s)



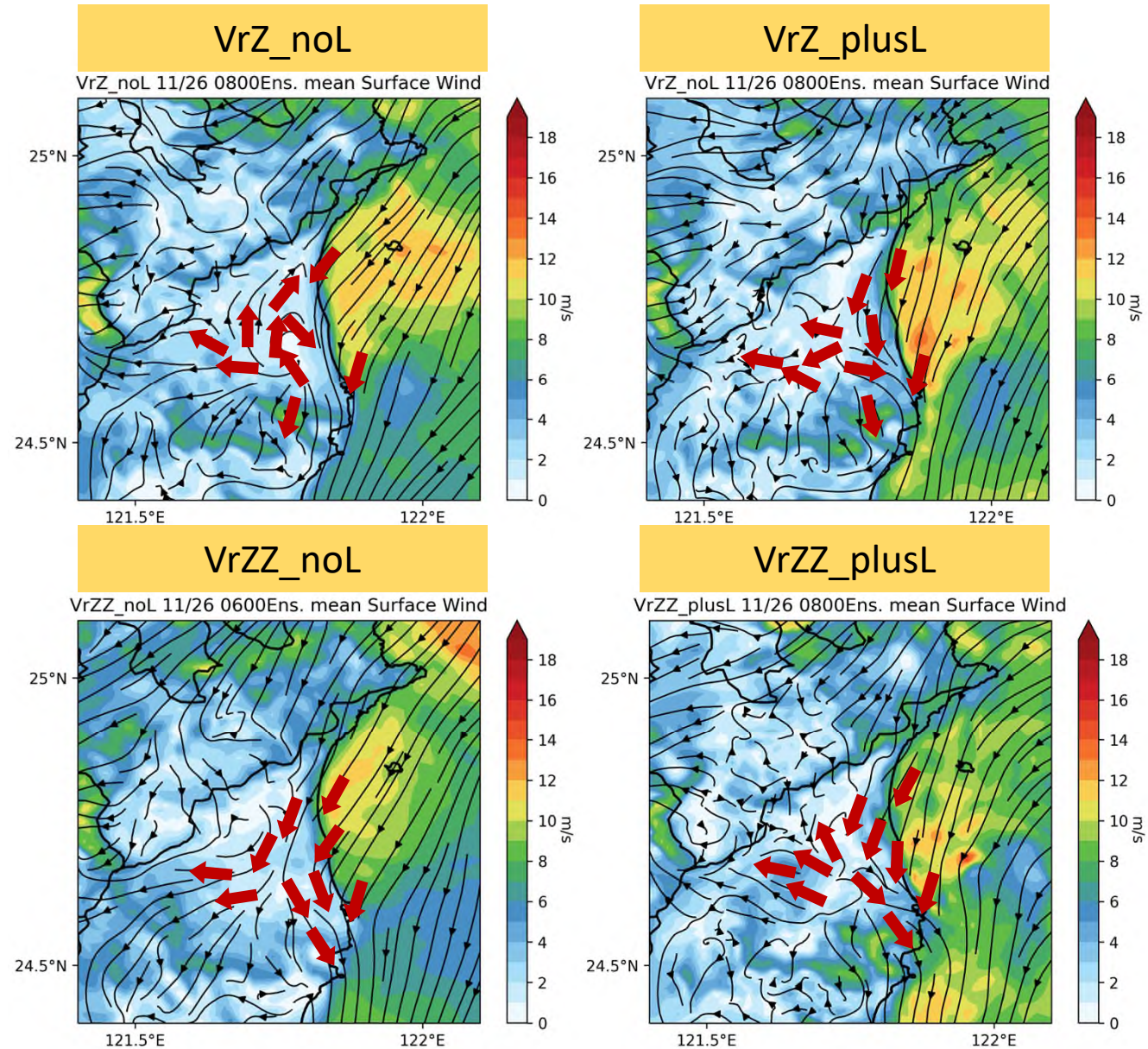
Dynamics Validation in YESR IOP2

0800UTC (Cycle17)

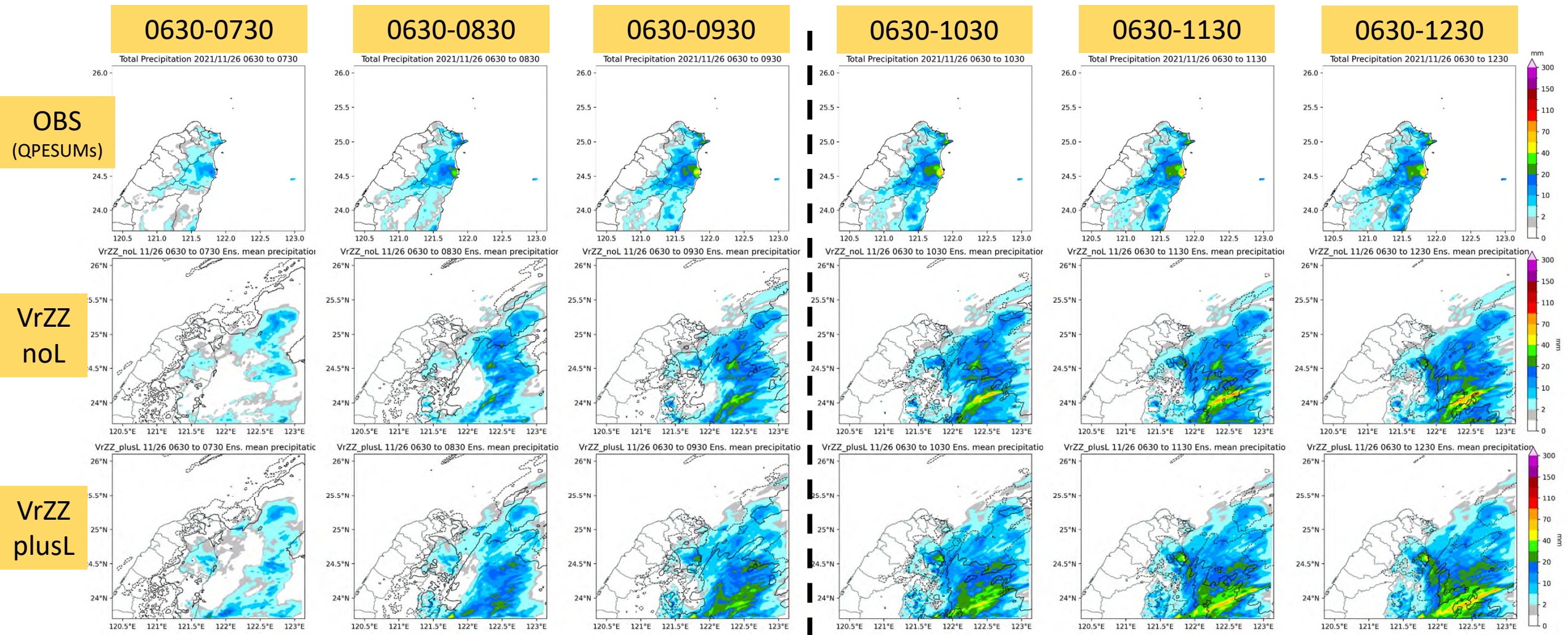
Surface Station



- Assimilating low-level radar data produces near-surface circulation patterns that closely resemble the observations at the final analyses.



Precipitation Validation in YESR IOP2



✓ Assimilating low-level dual-pol radar data could improve the rainfall forecasts.

Precipitation Validation in YESR IOP2

Deterministic forecasts

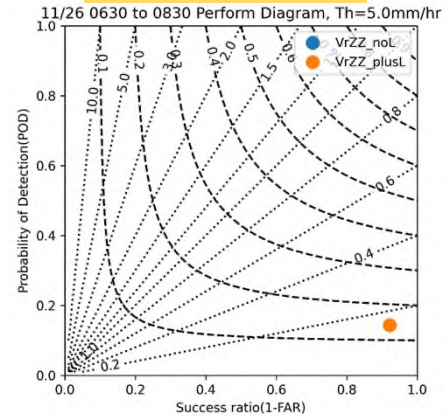
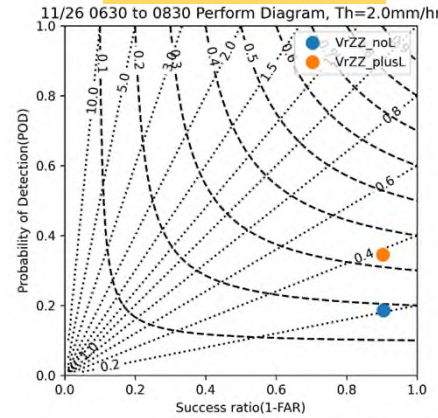
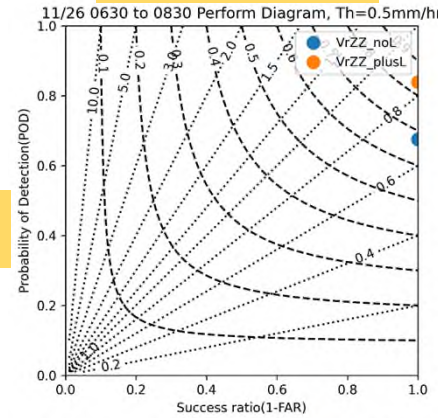
- ✓ VrZZ_noL could present the coverage of the rainfall with low threshold.
- ✓ Assimilating low-level radar data may improve the rainfall forecast under different threshold.

0.5*hrs mm

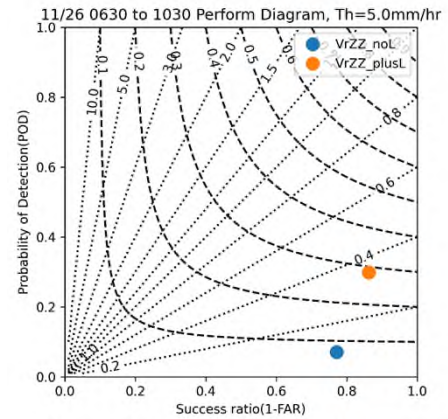
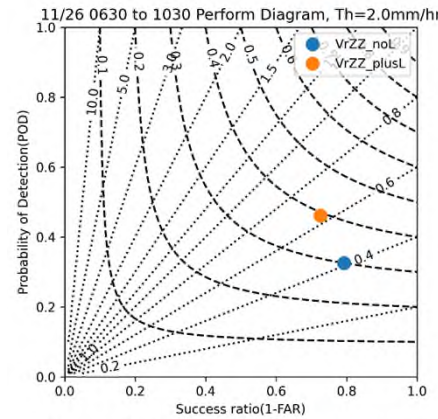
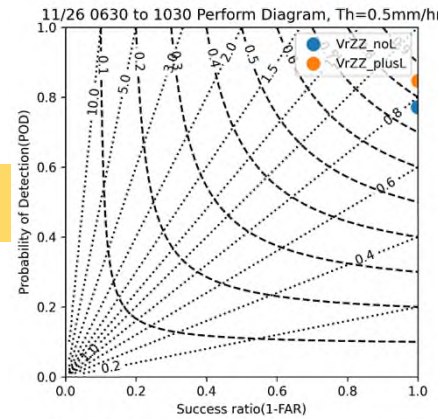
2.0*hrs mm

5.0*hrs mm

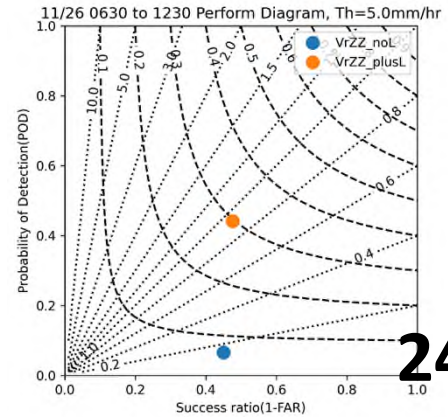
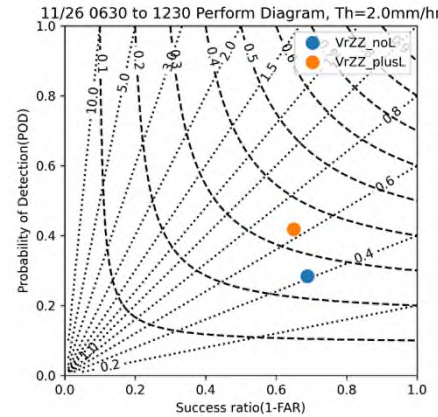
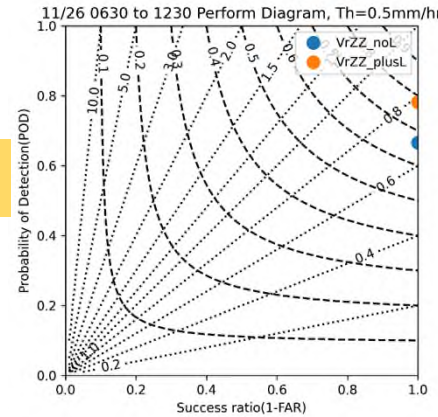
0-2 hrs



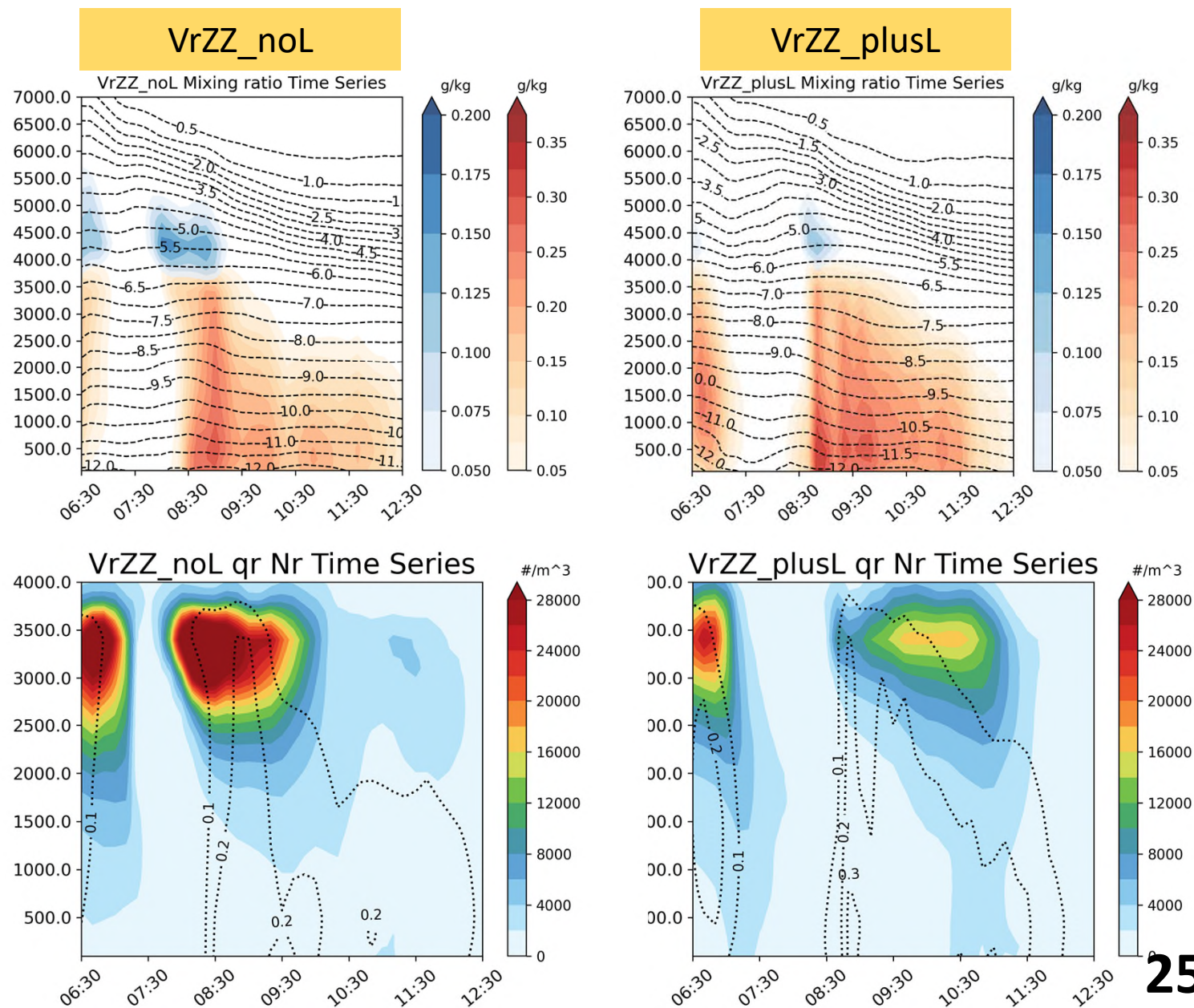
0-4 hrs



0-6 hrs

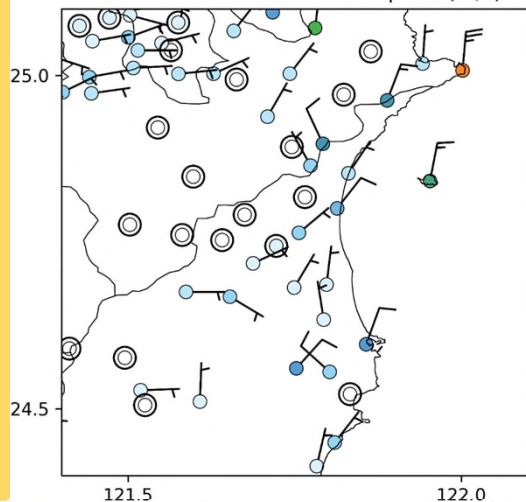


- The enhancement of q_r could be sustained in the first hour in the forecast.
- Much more q_r is simulated after 0830 UTC in the VrZZ_plusL with fewer numbers.
- Analyses of hydrometeors source/sink terms are needed to describe how data assimilation impact on cloud microphysics.



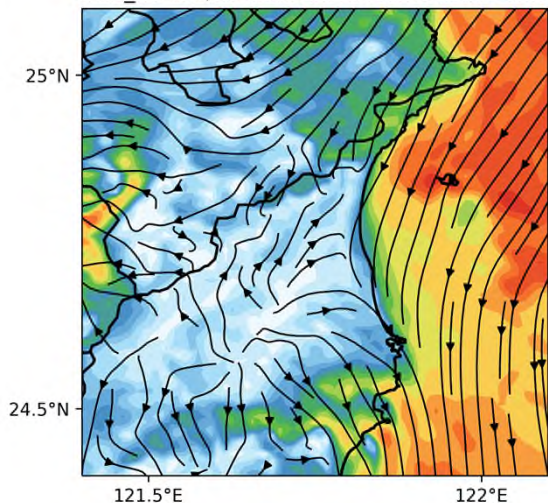
Surface Station

2021112608 Surface Station Wind Performance
Barb: knots Shaded: wind speed (m/s)



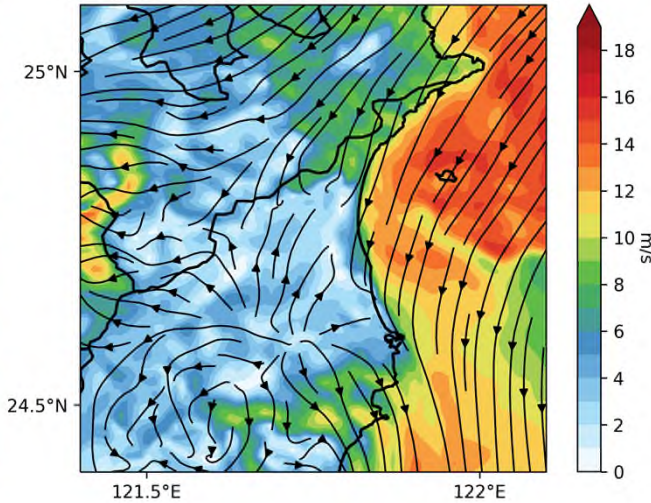
VrZZ_noL

VrZZ_noL 11/26 0800Ens. mean Surface Wind



VrZZ_plusL

VrZZ_plusL 11/26 0800Ens. mean Surface Wind

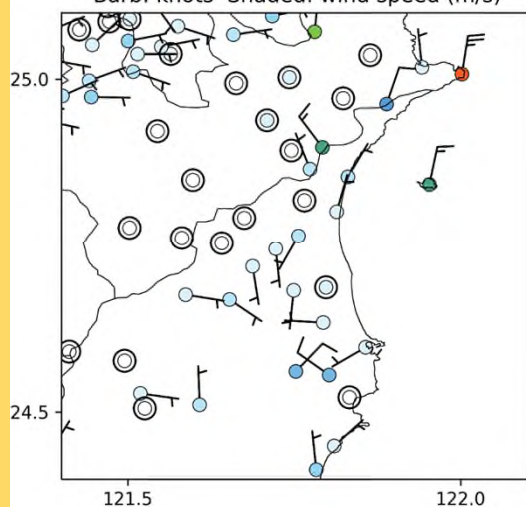


➤ All experiments simulate the return flow that is not observed at 0800 UTC.

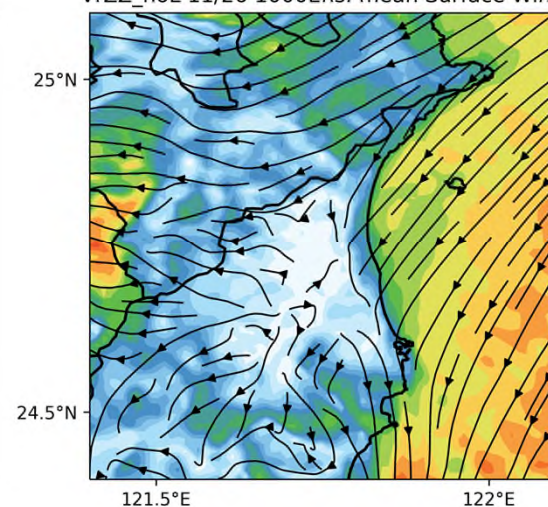
➤ Assimilating low-level radar data leads to stronger return flow compared to the other.

0800UTC (FCST 1.5hr)

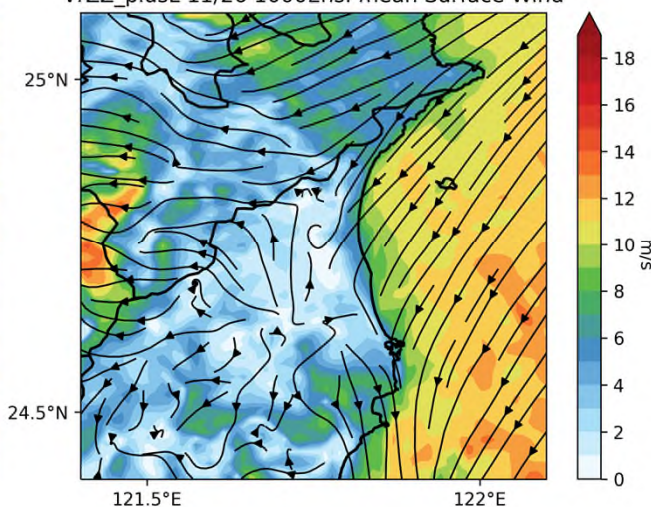
2021112610 Surface Station Wind Performance
Barb: knots Shaded: wind speed (m/s)



VrZZ_noL 11/26 1000Ens. mean Surface Wind



VrZZ_plusL 11/26 1000Ens. mean Surface Wind



➤ Two experiments have similar circulation compared to OBS at 1000 UTC, but the one with additional radar DA has stronger wind speed.

1000UTC (FCST 3.5hr)

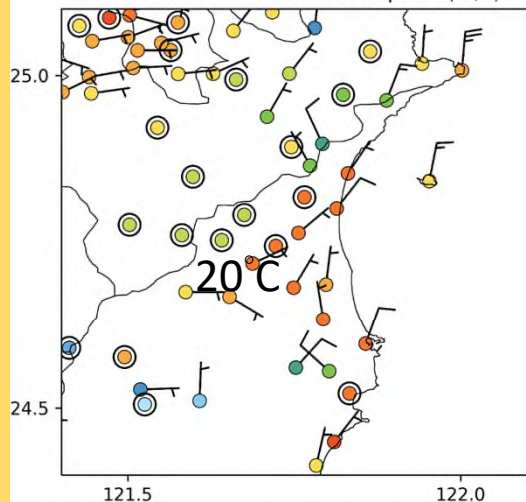
Surface Station

VrZZ_noL

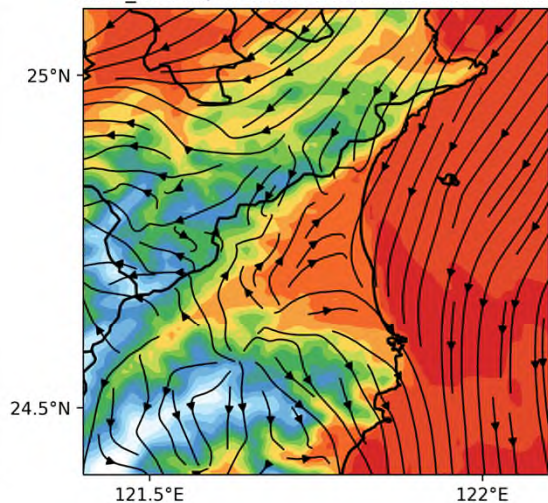
VrZZ_plusL

0800UTC (FCST 1.5hr)

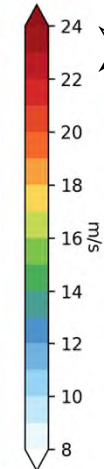
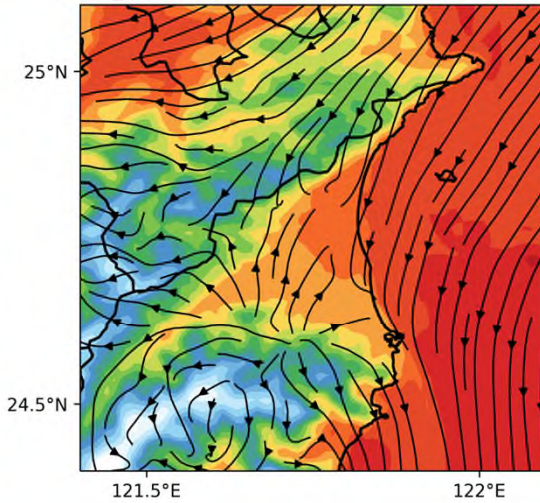
2021112608 Surface Station Wind and Temperature
Barb: knots Shaded: wind speed (m/s)



VrZZ_noL 11/26 0800Ens. mean Surface Wind



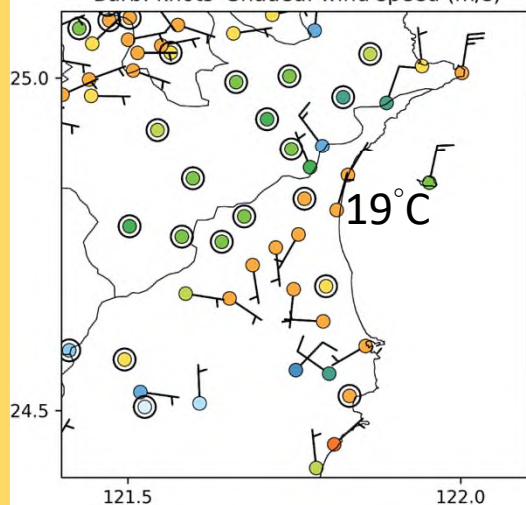
VrZZ_plusL 11/26 0800Ens. mean Surface Wind



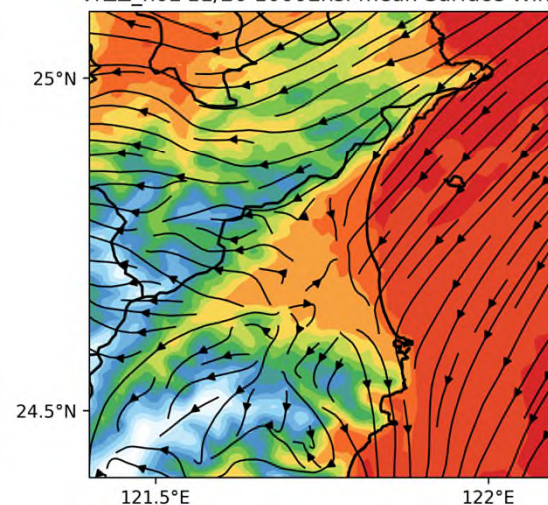
➤ Assimilating low-level radar data leads to lower temperature compared to the observation in the Yilan plane at 0800 UTC.

1000UTC (FCST 3.5hr)

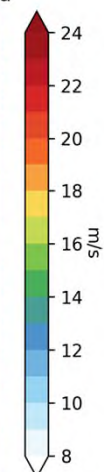
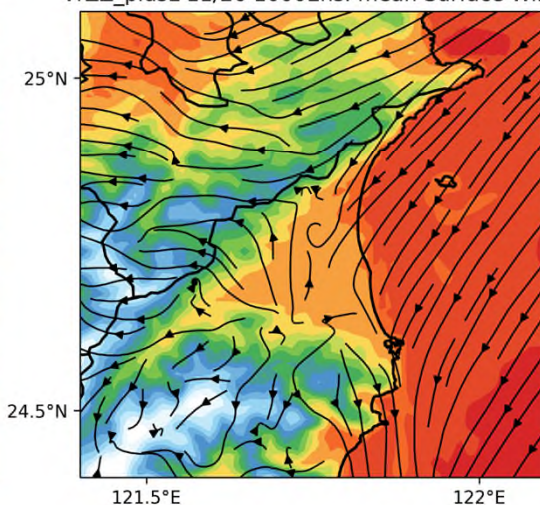
2021112610 Surface Station Wind and Temperature
Barb: knots Shaded: wind speed (m/s)



VrZZ_noL 11/26 1000Ens. mean Surface Wind



VrZZ_plusL 11/26 1000Ens. mean Surface Wind



➤ However, assimilating low-level radar data may decrease the temperature, which is overestimated in VrZZ_noL at 1000 UTC.

Introduction

Data
& Methodology

Result
& Discussion

Summary

Summary

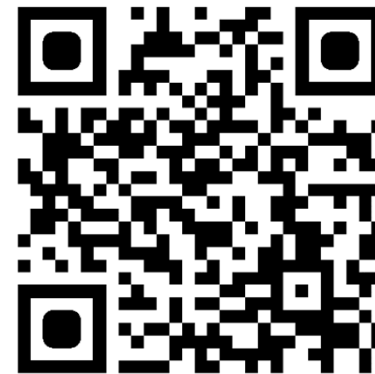
Conclusion

- In this study, the effects of assimilating low-level radar data and dual-pol radar Z_{DR} are evaluated using two rainfall cases that occurred in winter and summer, respectively.
- Assimilating low-level radar data adjusts the low-level circulation toward observation, leading to smaller residual between analyses and observation.
- In the winter case, assimilating low-level Z_{DR} data would lead analyses much closer to the observation, and increase near-surface q_r .
- In the summer case, assimilating low-level radar data and Z_{DR} would decrease Z_{DR} intensity, which is overestimated by other experiments. For the microphysics structure, low-level radar assimilation would increase q_r , but assimilating Z_{DR} would decrease this value, which decreases the overestimation.
- Assimilating low-level radar data can enhance the precipitation forecasts in the winter case.

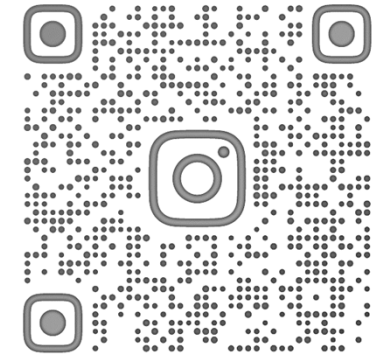
Future work

- Dynamics validation of TAHOPE IOP3 is on process.
- Analyses of hydrometeors source/sink terms are needed to describe how data assimilation impact on cloud microphysics.
- The dynamical and thermodynamical structures in the forecasts will be examined to further describe how assimilating additional radar data influences simulations.
- Further investigations of the limitation inside MP schemes and forward operator are needed to fix the simulated bias of dual-polarization variables in the summer case.

Thanks for listening!



RaMeLab Website



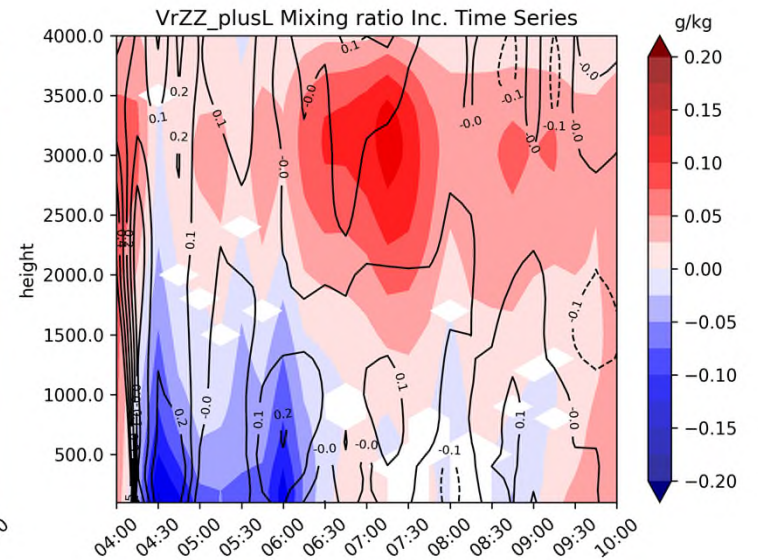
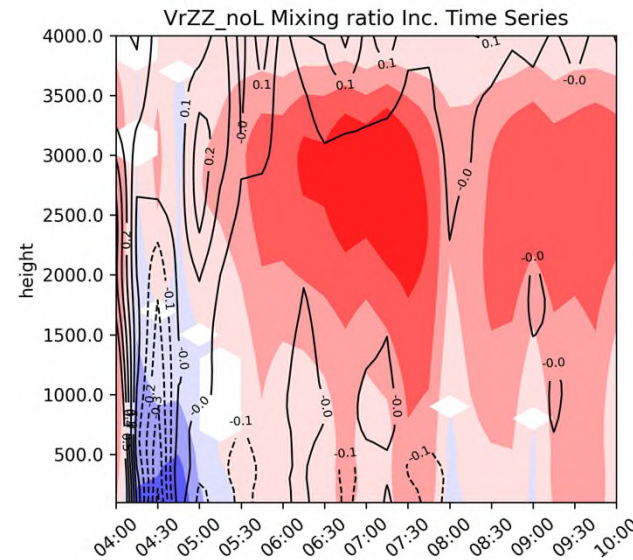
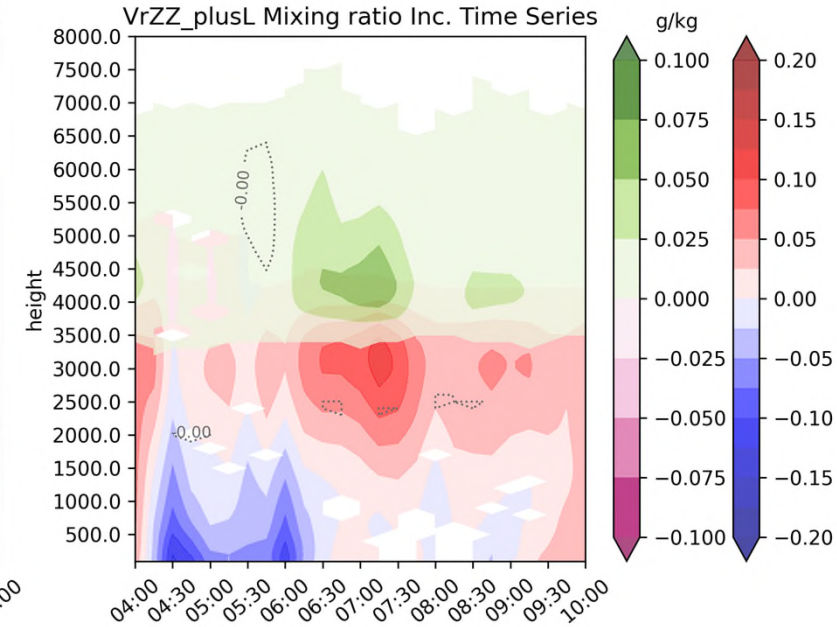
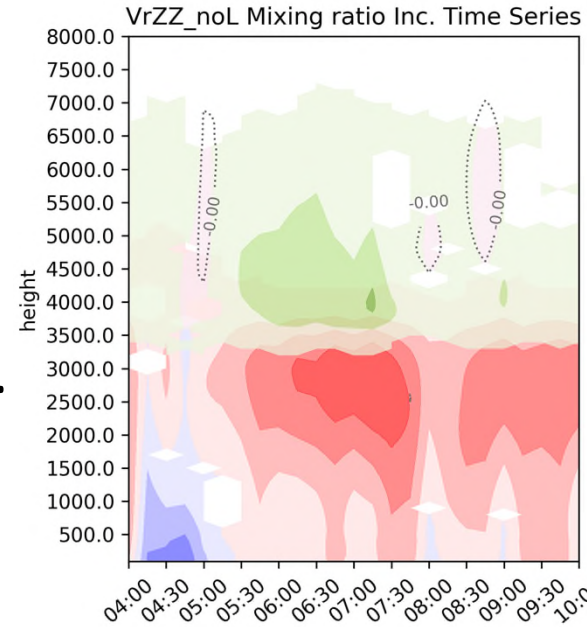
@YES_TEAMR

YESR Mixing Ratio Increment (DA)

Qr (g/kg): blue-red shaded Qv (g/kg): black contour
 Qs (g/kg): purple-green shaded Qs (g/kg): dotted line

- ✓ Qr has positive increment at 2-4 km.
- ✓ Qs has positive increment above 3.5 km.
- ✓ Assimilate low-level dual-pol radar data into model leads to:

1. Qr has negative increment nearby surface.
2. Qr has much more positive increment.
3. Qv has positive increment nearby surface, which is totally different from VrZZ_noL



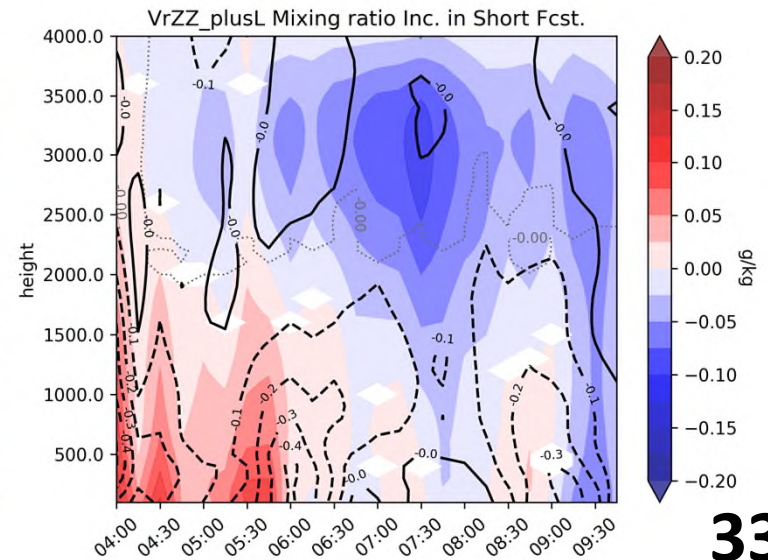
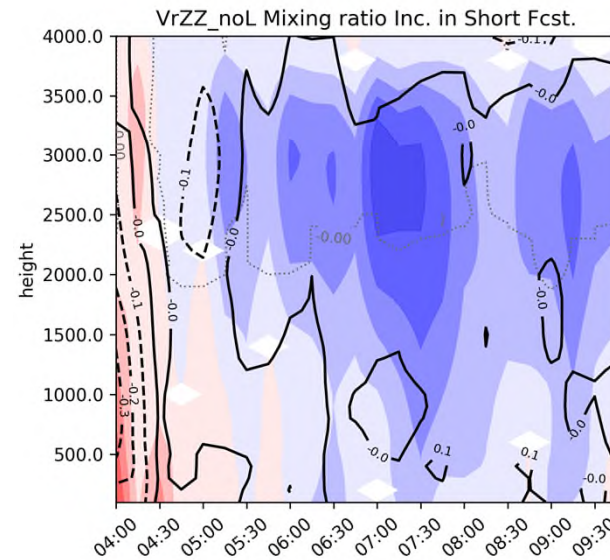
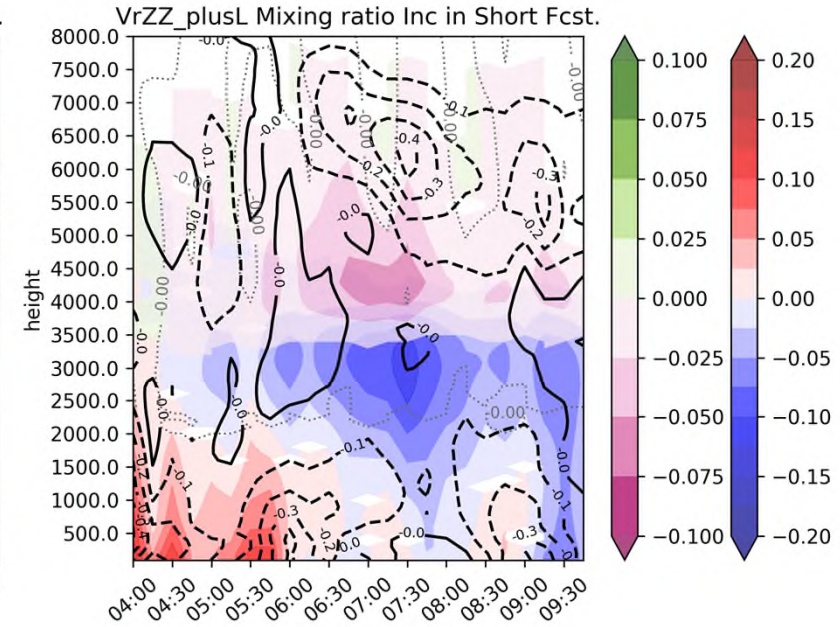
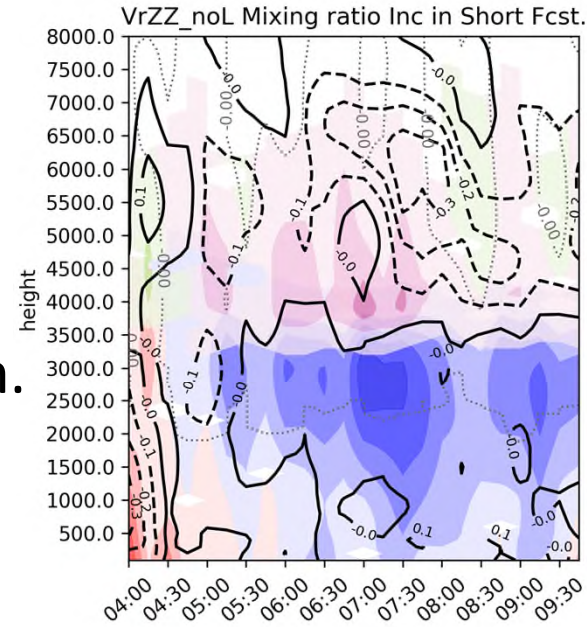
YESR Mixing Ratio Increment (Short Fcst)

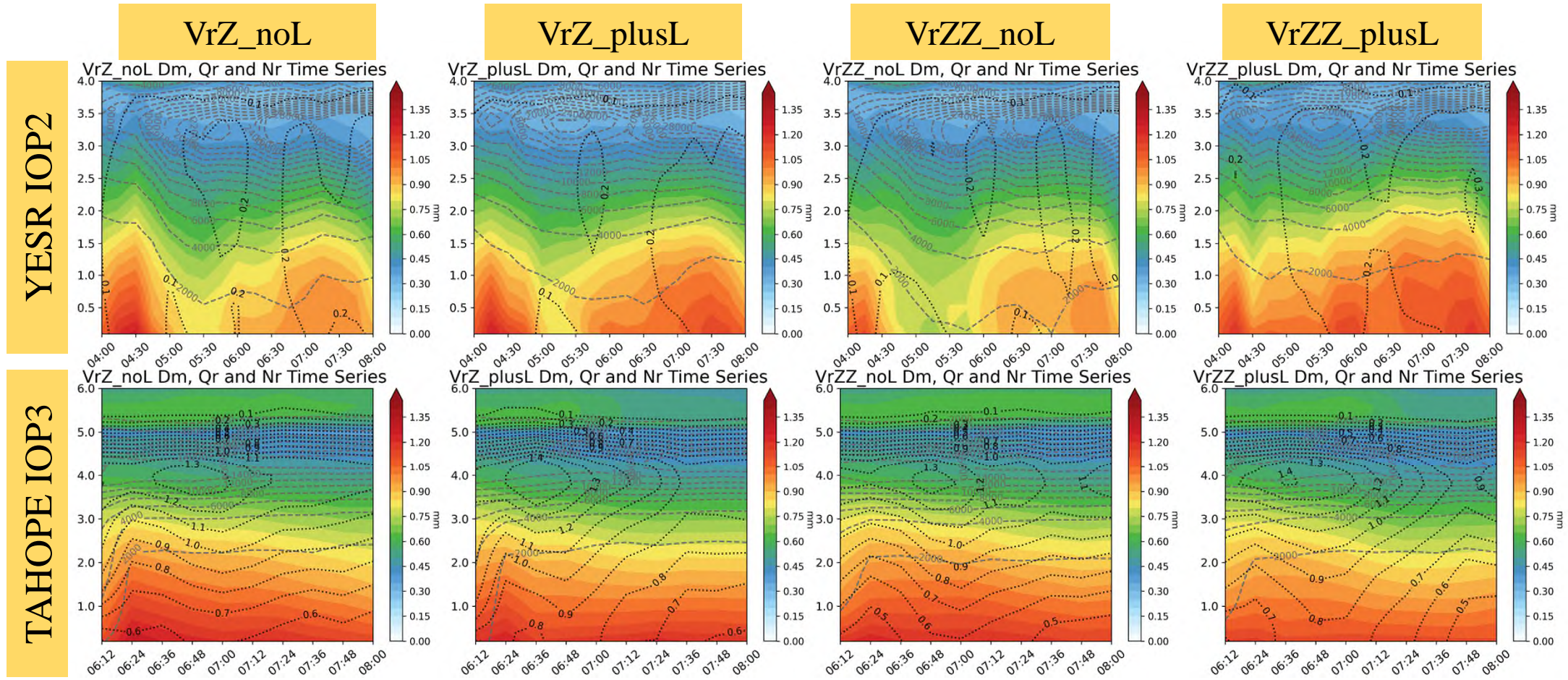
Qr (g/kg): blue-red shaded Qv (g/kg): black contour
 Qs (g/kg): purple-green shaded Qs (g/kg): dotted line

- ✓ Qr has negative increment at 1-4 km.
- ✓ Qs has negative increment above 3.5 km.
- ✓ Assimilate low-level dual-pol radar data into model leads to:

1. Qr has positive increment nearby surface before 0600 UTC.
2. Qv has negative increment nearby surface, which is stronger than VrZZ_noL

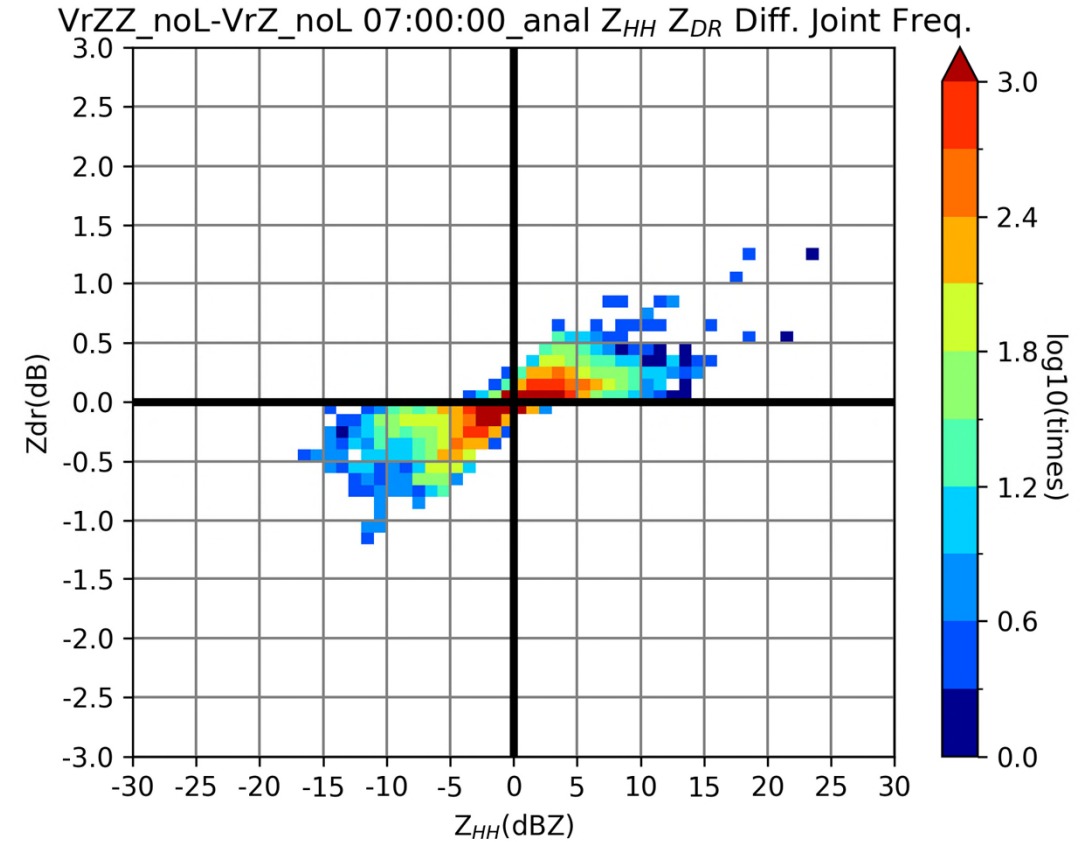
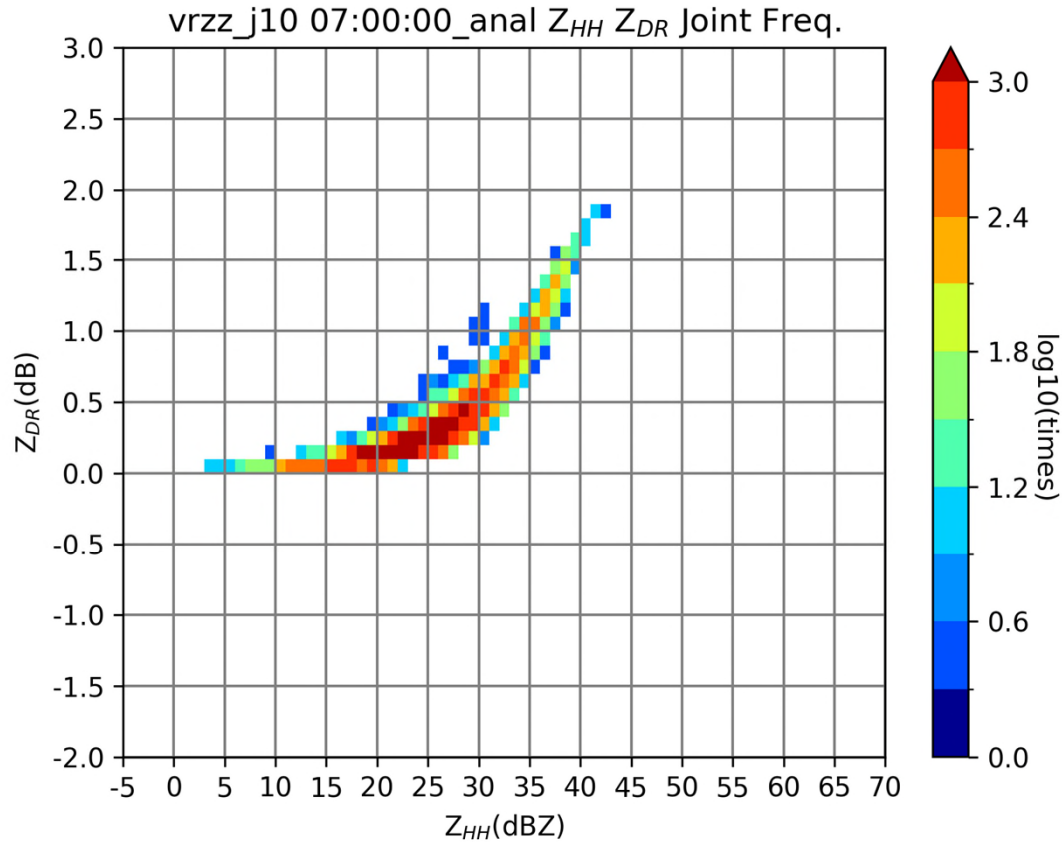
✓ Short Fcst. dilute the inc. from DA.





X-axis : Time (UTC)
 Y-axis : Height
 Shaded : D_{mr} (g/kg)
 Gray Dotted: N_{Tr} (#/m³)
 Dashed line: q_r (g/kg)

- ✓ Enhancement of the q_r and decreasing of the N_{Tr} lead the larger D_{mr} when assimilating low level radar data in the winter case.
- ✓ In the summer case, though the q_r is enhanced, the D_{mr} becomes smaller when assimilating after assimilating low-level radar.



➤ Z_{HH} and Z_{DR} are high correlated with using the certain setting of forward operator and microphysics scheme.

➤ The high correlation would leads the updates of Z_{HH} and Z_{DR} at the first and the third quadrant.