

Applied research of doppler radar for rainfall prediction at medium and small basin

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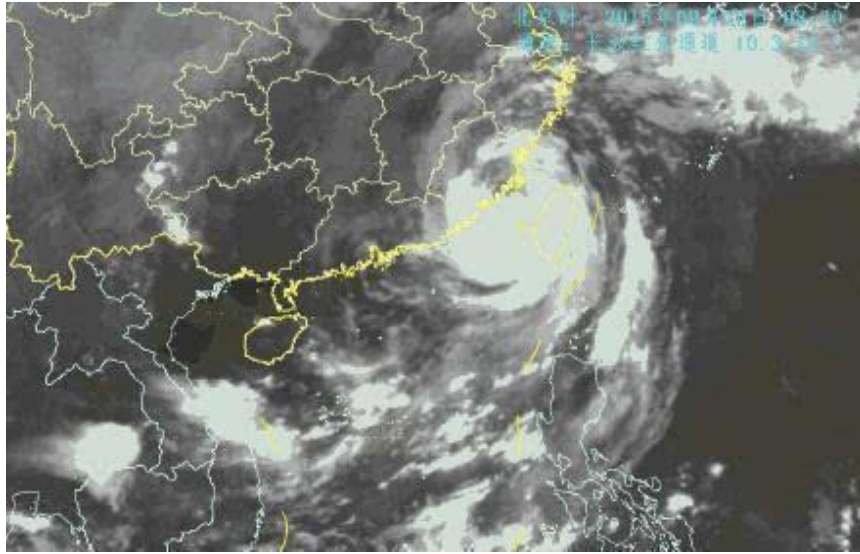
Content

- ◆ **Why doppler radar**
- ◆ **Radar data assimilation for NWP**
- ◆ **Nowcasting forecast with doppler radar**
- ◆ **Conclusions**

Content

- ◆ **Why doppler radar**
- ◆ Radar data assimilation for NWP
- ◆ Nowcasting forecast with doppler radar
- ◆ Conclusions

Why Doppler Radar



**The flood management system
at large basin
Turn to completed**

**The short time of concentration
In medium and small basin**

**The high flood peak,
but short process**

**Pay attention to flash flood
management at Small and
medium scale catchment**

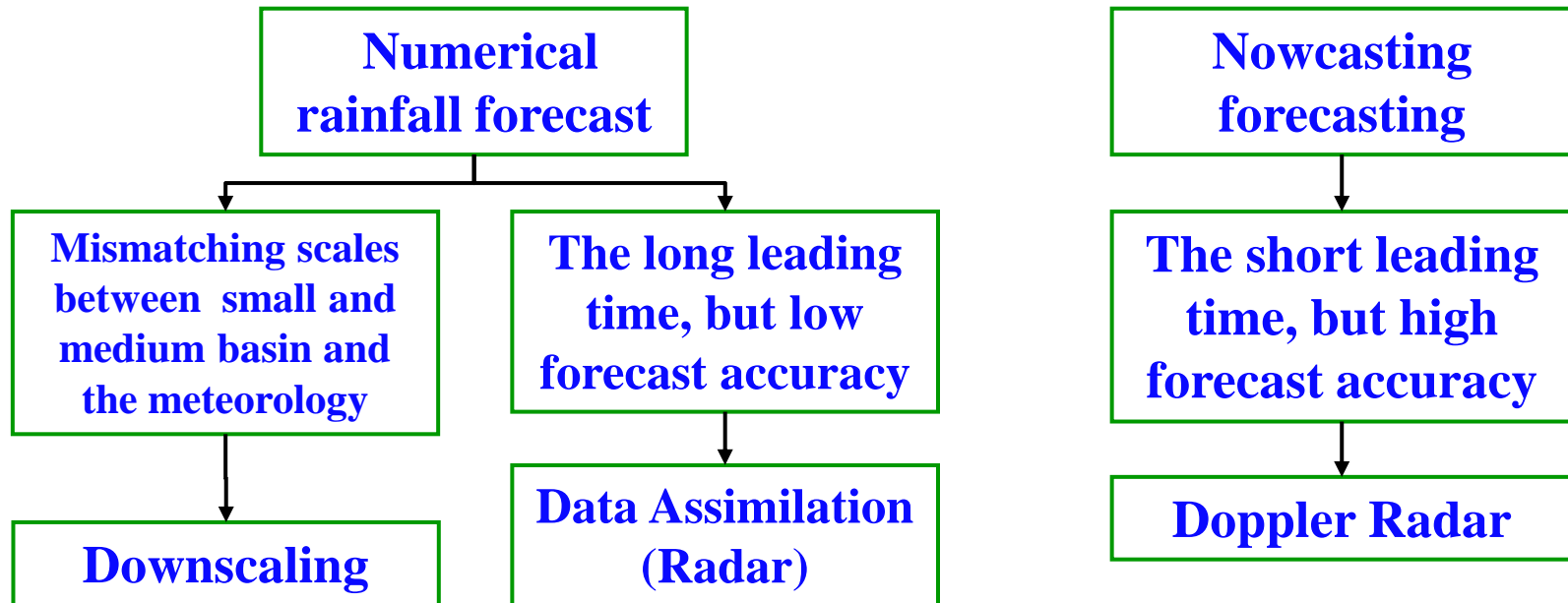
**High requirement of flash flood
leading time**

**High requirement of forecast
accuracy**

The lengthen of leading time, and the improvement of forecast accuracy

Why Doppler Radar

It is necessary to carry out the research of high-precision rainfall forecast and develop rainfall forecasting before flood events instead of forecasting after events.



Radar data have high spatial-temporal resolution, so for the weather observation of medium and small basin, this benefit makes it become the best choice for numerical rainfall forecasting

How should radar data be assimilated in order to make the effective improvement on the accuracy of numerical rainfall forecasting?

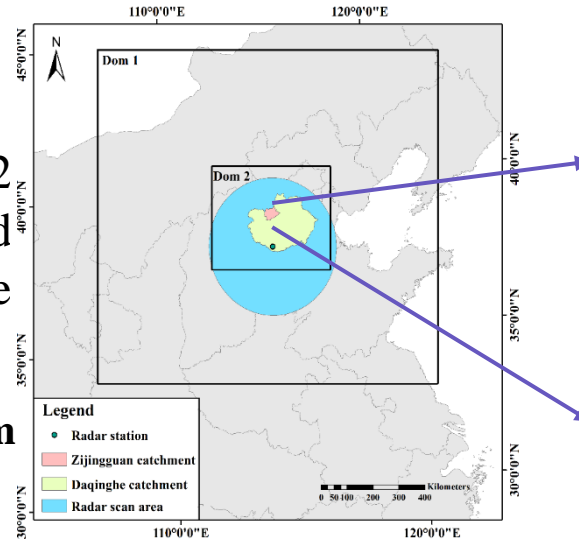
Whether the general nowcasting methods could meet the need of rainfall forecasts on the field of flood forecasts at the small and medium scale of catchment?

Why Doppler Radar

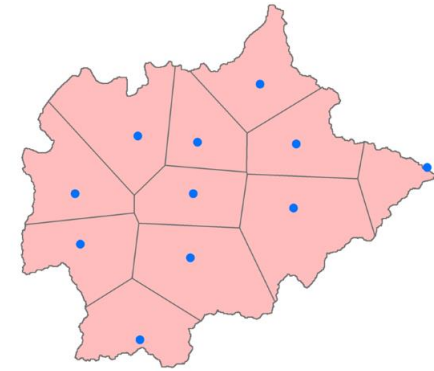
◆ (1) Study area and storm event

- **Zijinguan catchment** with 1760 km²
- **Storm event:** high intensity rainfall (172 mm/24h) occurs on 21 July 2012 and peak flow reaches 2580 m³/s at the catchment outlet.

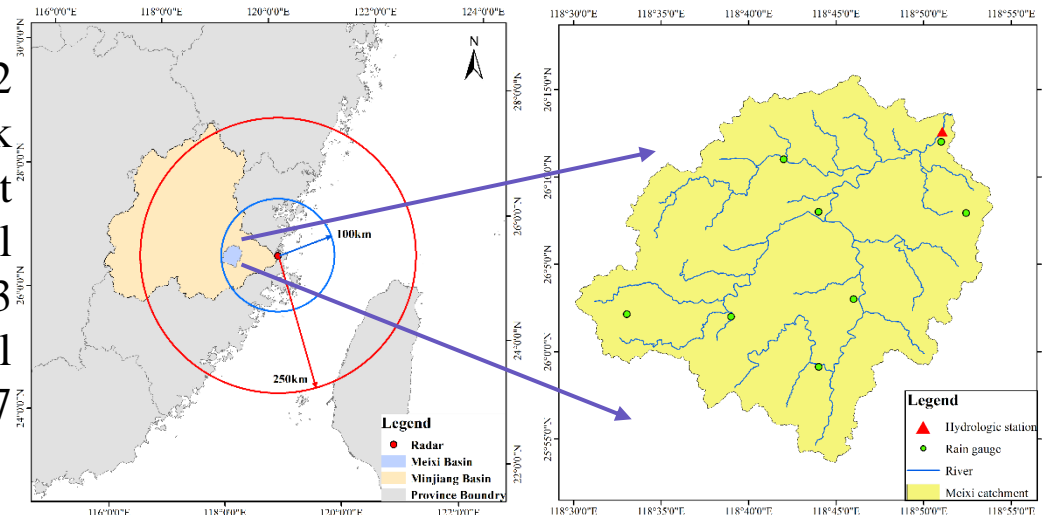
Caused by the intersection of cold and warm airflow and the uplift of terrain



The Semi-humid and semi-arid region in the northern of China



The humid region on the southern of China



◆ (2) Study area and storm event

- **Meixi catchment** with 956 km²
- **Storm event:** 1) high intensity rainfall (242 mm/24h) occurs on 8 July 2016 and peak flow reaches 4710 m³/s at the catchment outlet; 2) With relative uniform rainfall distribution (84 mm/24h) occurs on 3 August 2012; 3) With uneven rainfall distribution (66 mm/24h) occurs on 17 June 2014

Caused by typhoon

Content

- ◆ Why doppler radar
- ◆ **Radar data assimilation for NWP**
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Radar data assimilation for NWP

◆ Model and configuration

- **WRF model**

input data: GFS with the grid resolution of $1 \times 1^\circ$

domain setting: downscaling ratio 1:3

vertical level: top level (50hPa), 40 vertical pressure

levels

physical parameterizations: WSM6, RRTM/Dudhia,

Noah, MYJ, KF

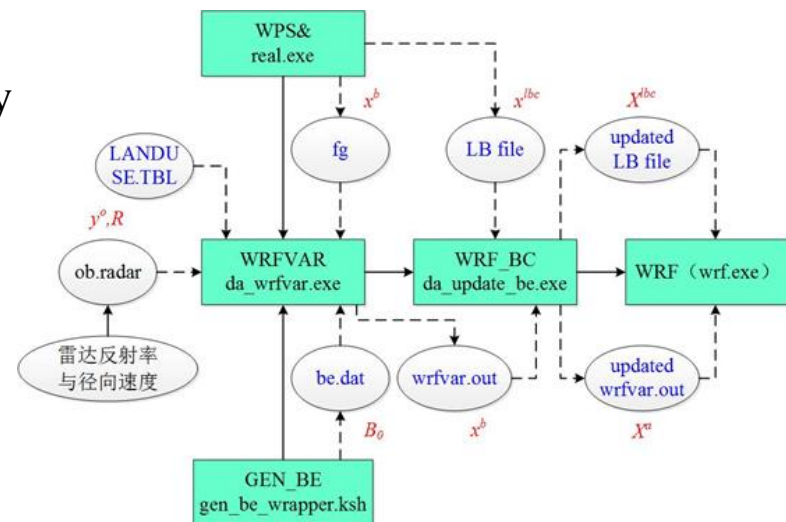
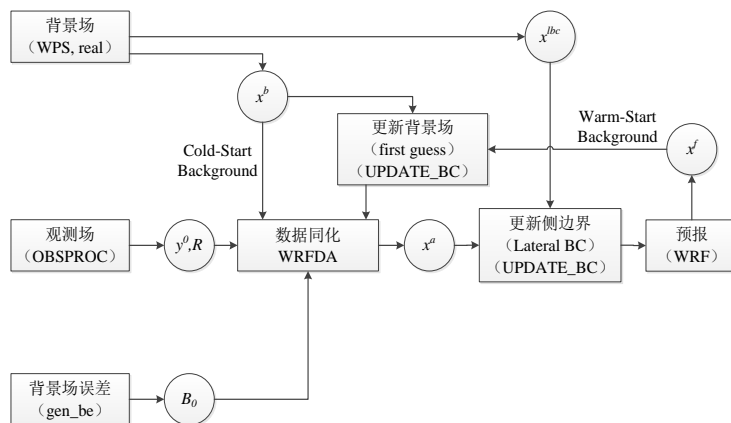
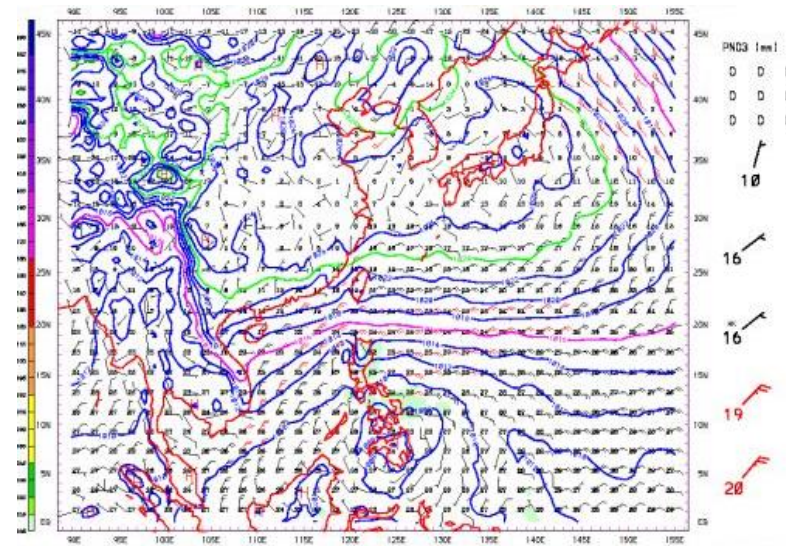
- **3-DVar data assimilation**

BE: CV3

Assimilation time interval: six hours, three hours, one

hours

Assimilated data: radar reflectivity and radial velocity



Radar data assimilation for NWP

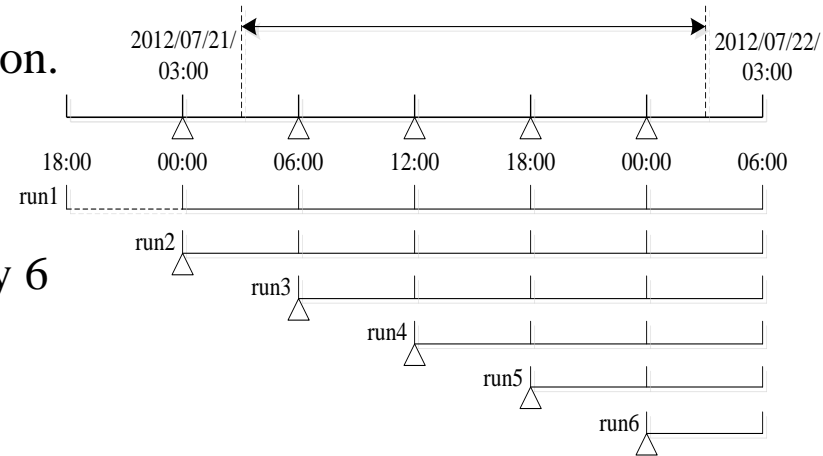
◆ Assimilation scenario design

- **Cycling run (time interval 6h for example)**

run1 is the initial WRF run without data assimilation.

The first 6 h, which is represented by a dashed line segment, is for the model spin-up.

run2, run3, run4, run5 and run6 are executed every 6 h to show the rainfall improvement for the entire storm duration by each time of radar data assimilation.

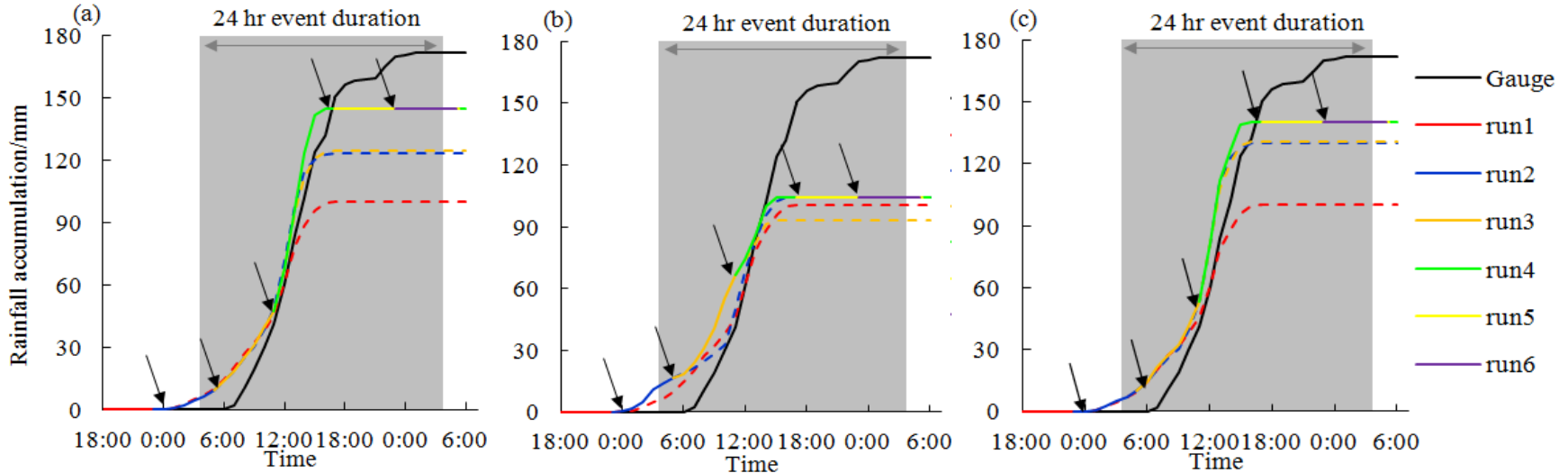


◆ Data assimilation scenario

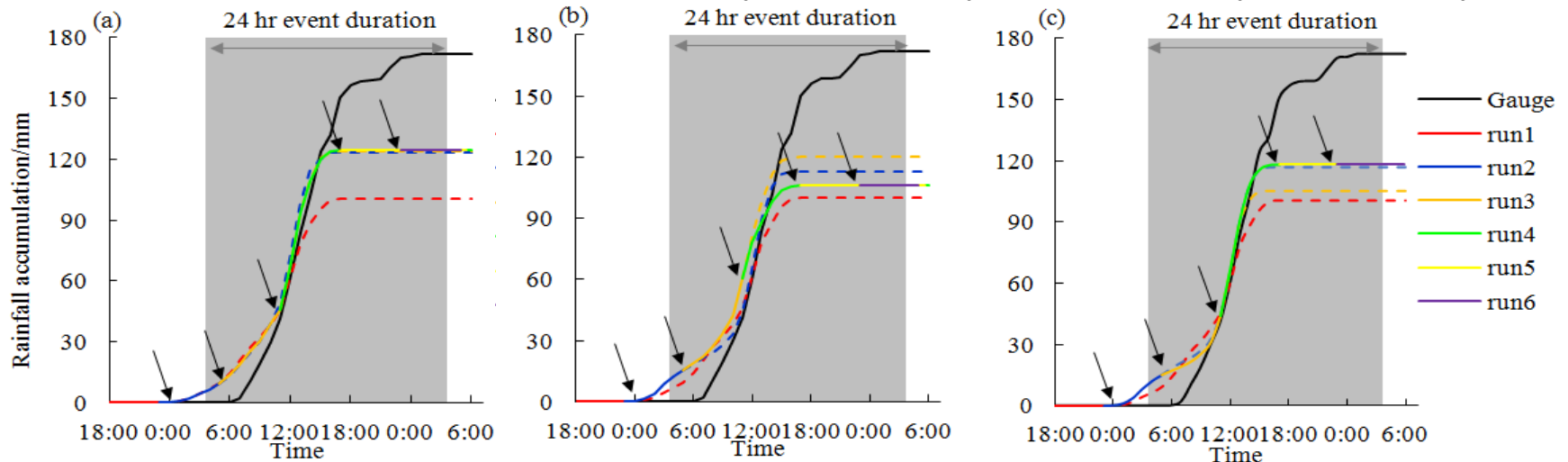
- **7 data sets:** according to the observation heights: (1) <500 m, (2) <1000 m, (3) <2000 m, (4) 500~1000 m, (5) 1000~2000 m, (6) >2000 m, and (7) all layers
- **Assimilation time interval:** six hours, three hours, one hours
- **Assimilated data:** (1) radar reflectivity, (2) radial velocity, (3) radar reflectivity and radial velocity

Radar data assimilation for NWP

Zijinguan catchment, rainfall occurs on 21 July 2012, assimilation time interval 6 h



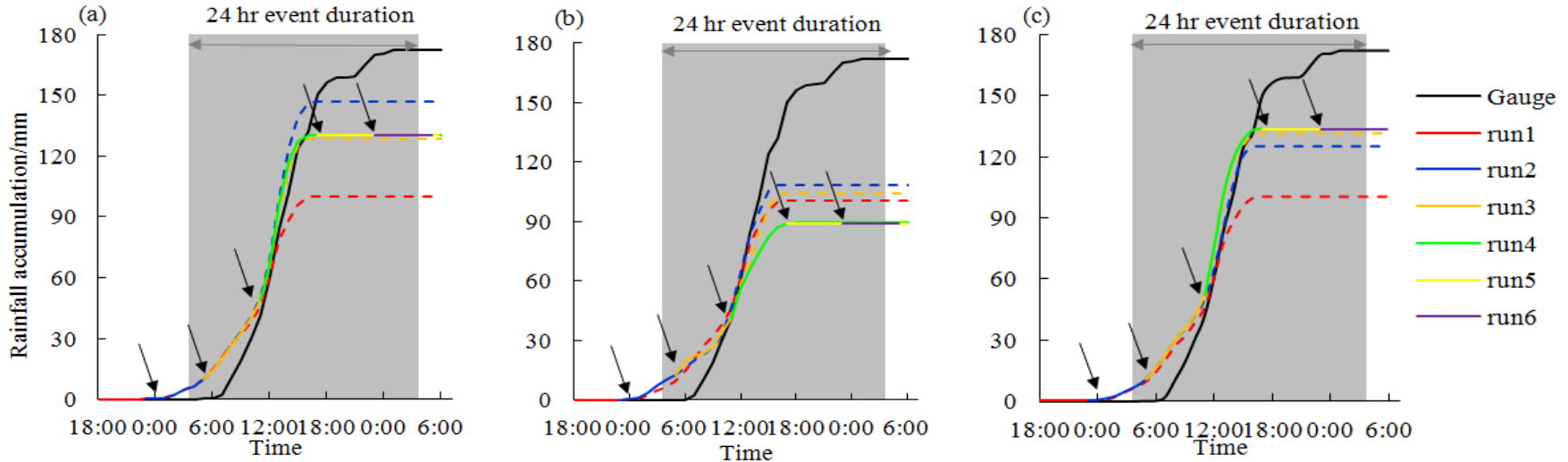
Assimilation results (<500m): (a) reflectivity; (b) velocity; (c) reflectivity and velocity



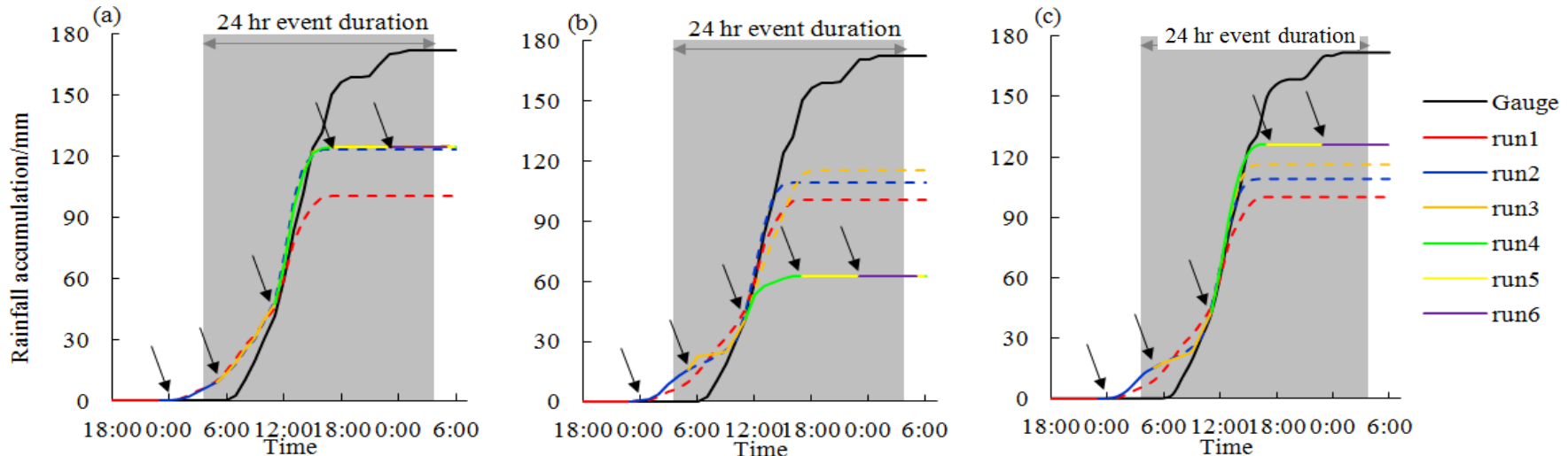
Assimilation results (<1000m): (a) reflectivity; (b) velocity; (c) reflectivity and velocity

Radar data assimilation for NWP

◆ Zijjnguan catchment, rainfall occurs on 21 July 2012, assimilation time interval 6 h



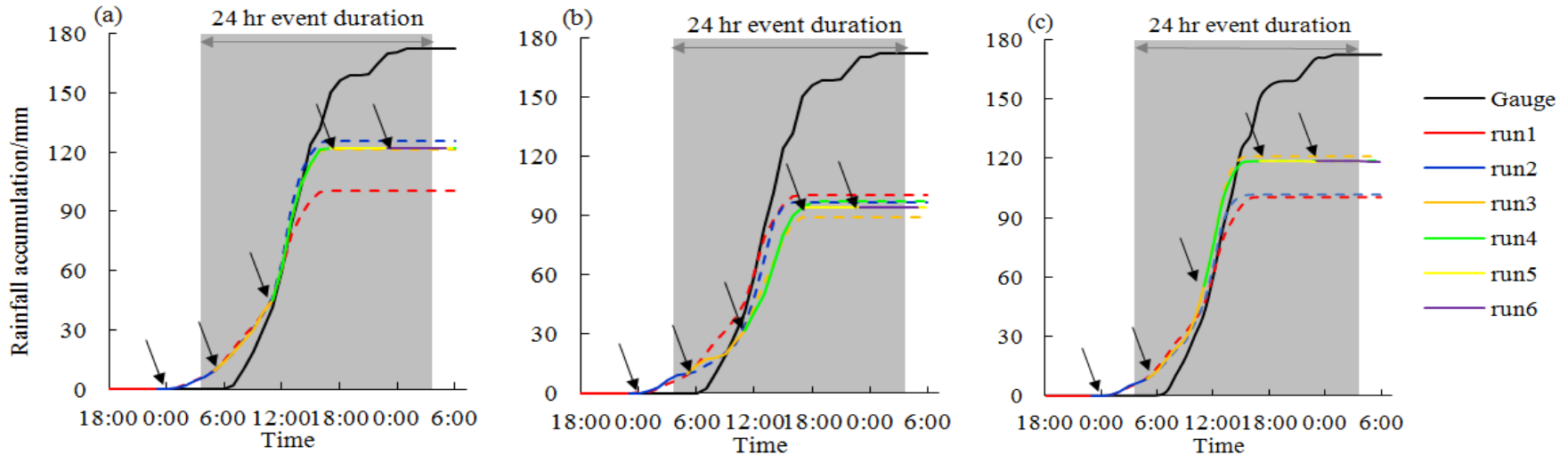
Assimilation results (<2000m): (a) reflectivity; (b) velocity; (c) reflectivity and velocity



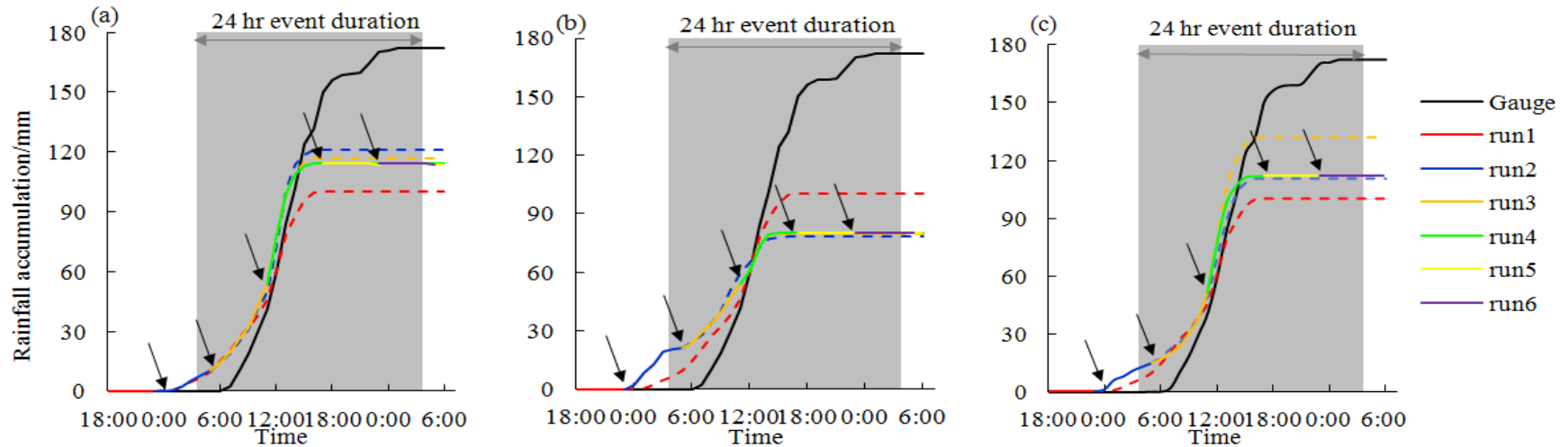
Assimilation results (500~1000m): (a) reflectivity; (b) velocity; (c) reflectivity and velocity

Radar data assimilation for NWP

◆ Zijjnguan catchment, rainfall occurs on 21 July 2012, assimilation time interval 6 h



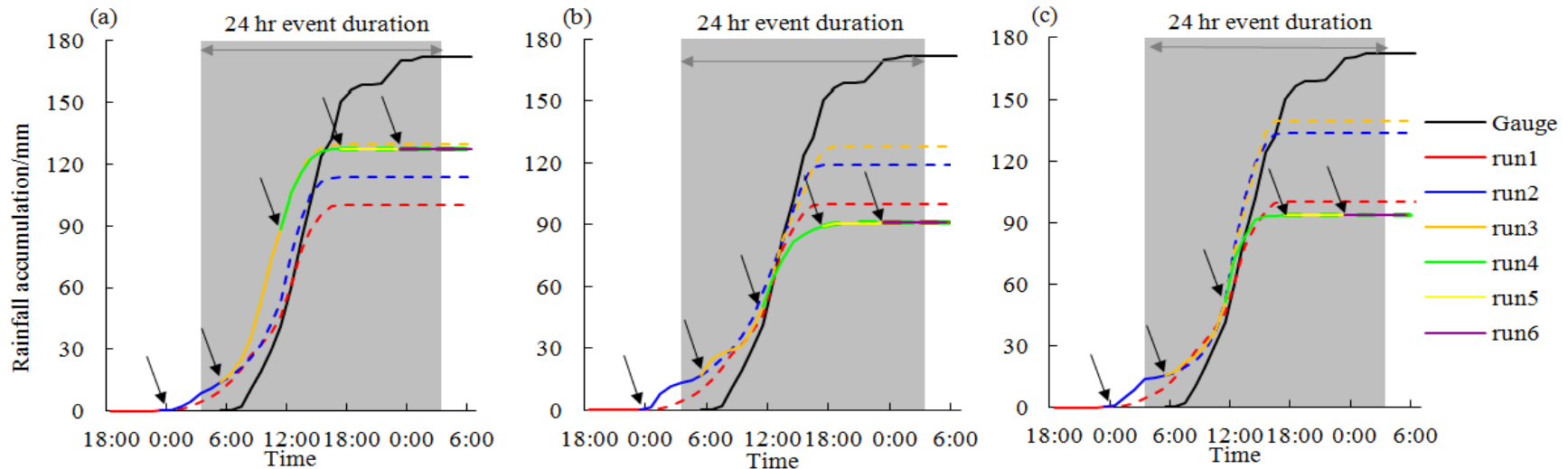
Assimilation results (1000~2000m): (a) reflectivity; (b) velocity; (c) reflectivity and velocity



Assimilation results ($>2000m$): (a) reflectivity; (b) velocity; (c) reflectivity and velocity

Radar data assimilation for NWP

◆ Zijjnguan catchment, rainfall occurs on 21 July 2012, assimilation time interval 6 h



Assimilation results (all layers): (a) reflectivity; (b) velocity; (c) reflectivity and velocity

- Assimilating radar reflectivity lower than 500 m is the best choice.
- Higher layers come from the assimilated radar reflectivity or both types of radar data, the less improvements are found with the rainfall forecasts.
- Involvement of radar reflectivity or both types of radar data in higher layers may sometimes reduce the effect of rainfall improvements.

Radar data assimilation for NWP

◆ Zijjnguan catchment, rainfall occurs on 21 July 2012, , assimilation time interval 6 h

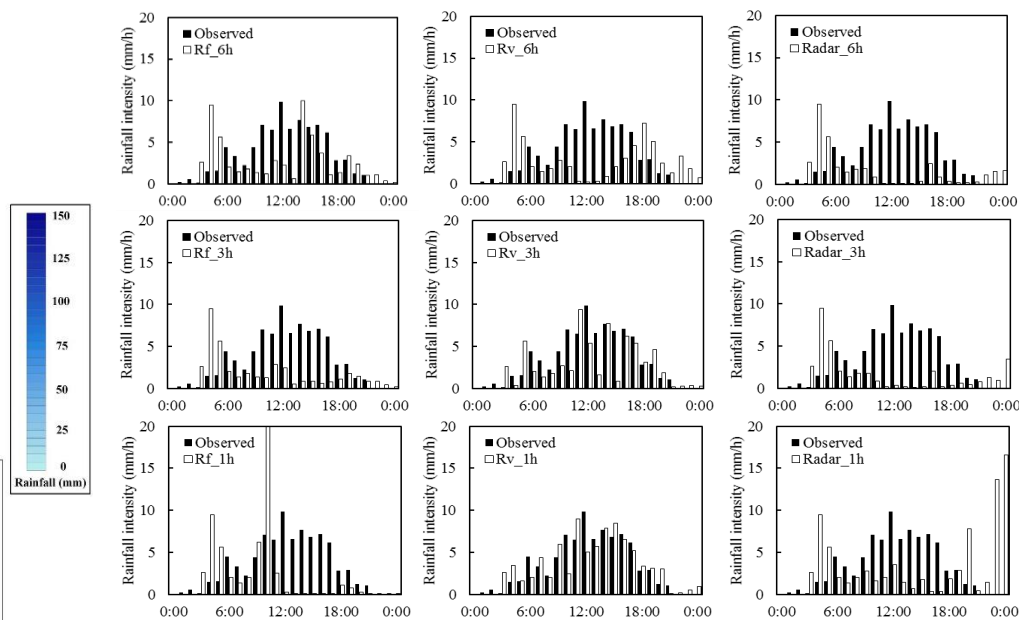
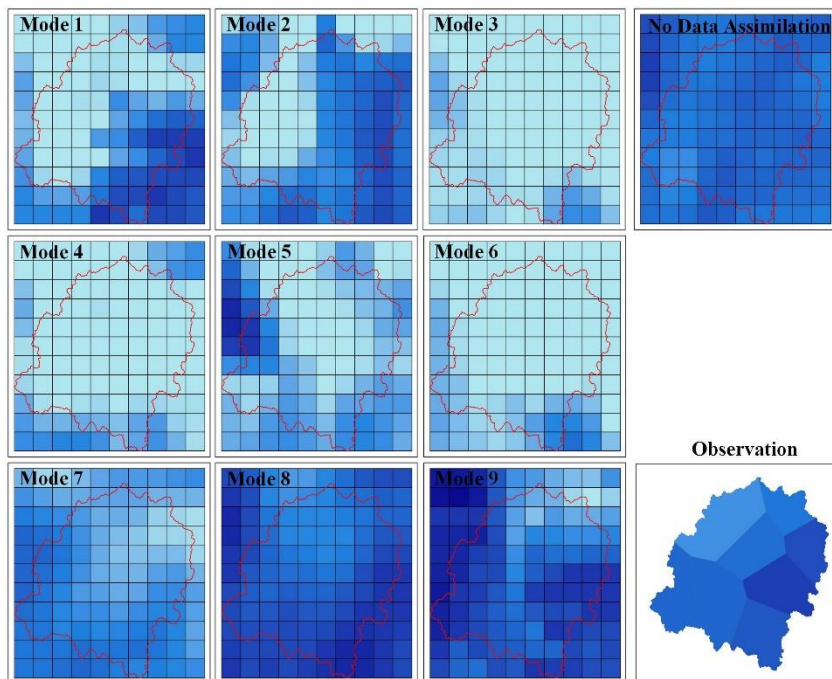
24h rainfall accumulations (mm) and relative errors (%) of the assimilation scenarios

Data set	Elevation	Original run	Data assimilation run		
			Reflectivity	Velocity	Reflectivity + velocity
1	<500 m	95.54 (-44.51)	140.60 (-18.34)	93.05 (-45.95)	135.60 (-21.24)
2	<1000 m	95.54 (-44.51)	120.09 (-30.25)	97.54 (-43.35)	109.54 (-36.38)
3	<2000 m	95.54 (-44.51)	125.90 (-26.88)	81.80 (-52.49)	128.50 (-25.37)
4	500~1000 m	95.54 (-44.51)	119.95 (-30.33)	54.26 (-68.49)	117.52 (-31.74)
5	1000~2000 m	95.54 (-44.51)	117.64 (-31.67)	87.74 (-49.04)	113.58 (-34.03)
6	>2000 m	95.54 (-44.51)	108.84 (-36.78)	60.85 (-64.66)	100.90 (-41.39)
7	all layers	95.54 (-44.51)	118.92 (-30.93)	77.65 (-54.90)	79.76 (-53.67)

Reason: With the increase of the air height, rainwater gradually turns to ice crystal, which is assimilated by WRF-3DVar as rainwater in upper air.

Radar data assimilation for NWP

◆ Meixi catchment, rainfall occurs on 3 August 2012

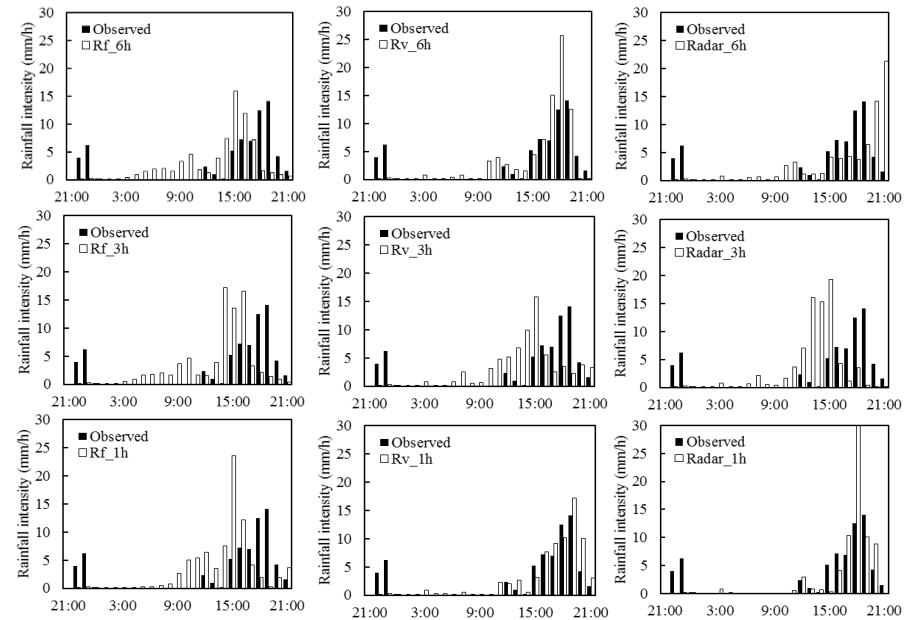
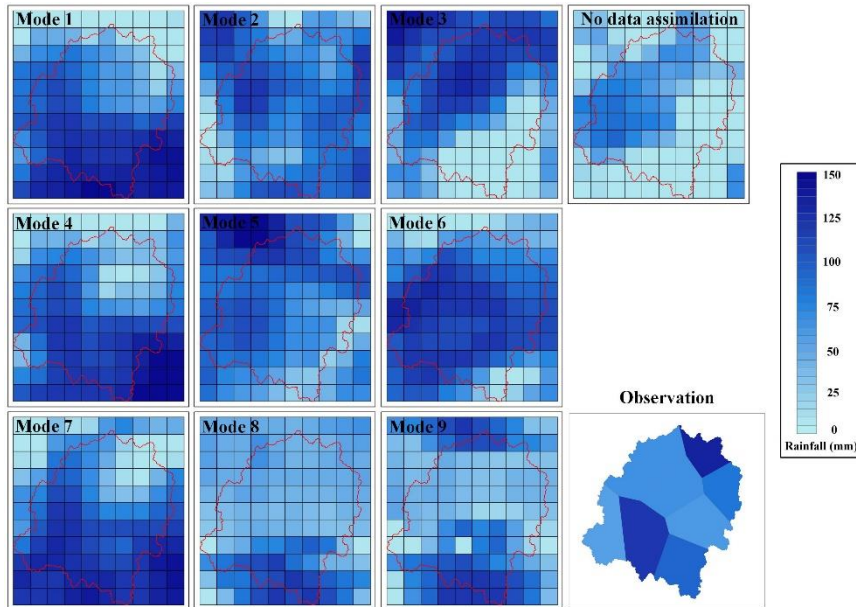


The spatial and temporal distribution of rainfall predicted by mode 8 is obviously improved, but the other assimilation modes perform not well. For rainfall with uniform spatial and temporal distribution, it is more important to choose data assimilation mode.

Mode	Time interval	Assimilated data
1	6h	Reflectivity (<500m)
2	6h	Velocity
3	6h	Reflectivity (<500m)+Velocity
4	3h	Reflectivity (<500m)
5	3h	Velocity
6	3h	Reflectivity (<500m)+Velocity
7	1h	Reflectivity (<500m)
8	1h	Velocity
9	1h	Reflectivity (<500m)+Velocity

Radar data assimilation for NWP

◆ Meixi catchment, rainfall occurs on 17 June 2014

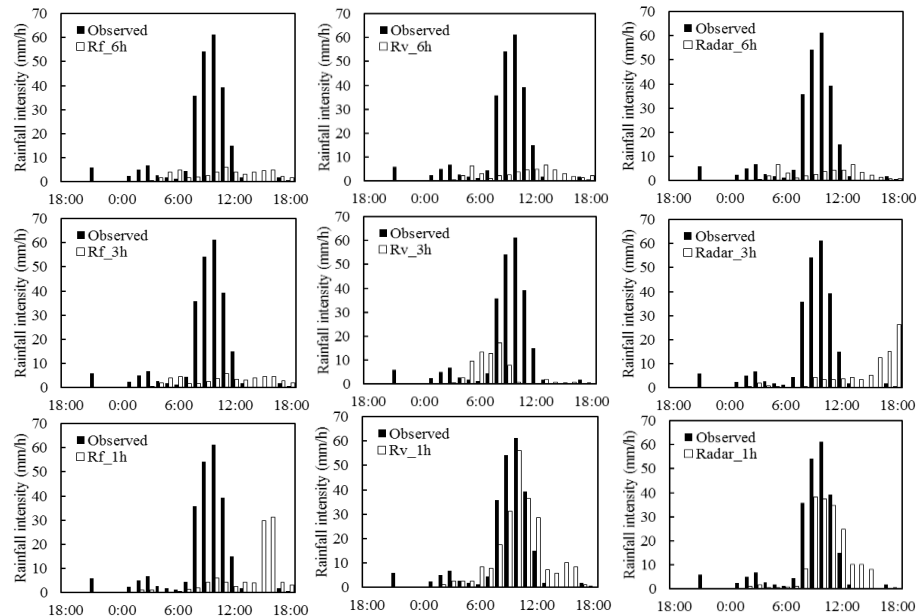
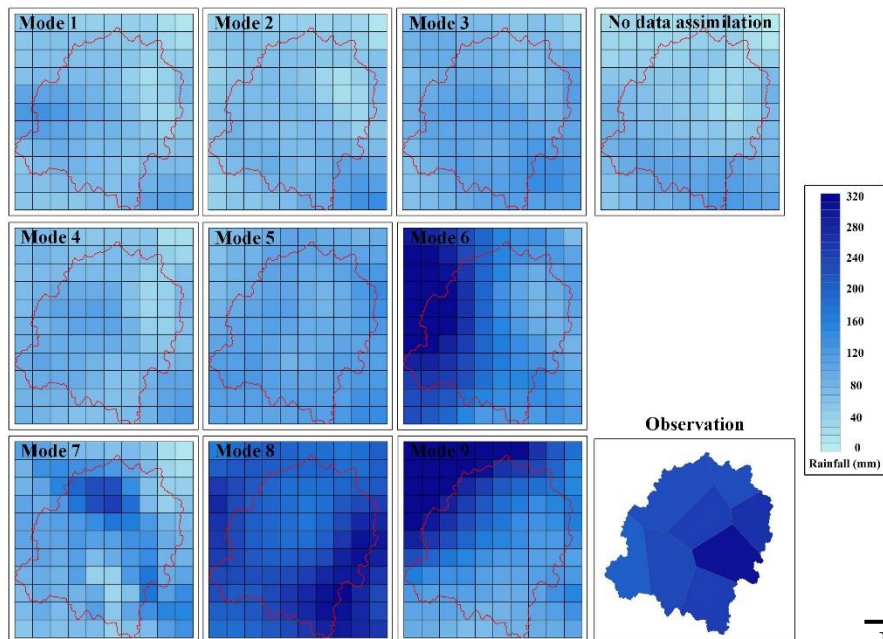


The rainfall forecasts have been improved with all data assimilation modes

Mode	Time interval	Assimilated data
1	6h	Reflectivity (<500m)
2	6h	Velocity
3	6h	Reflectivity (<500m)+Velocity
4	3h	Reflectivity (<500m)
5	3h	Velocity
6	3h	Reflectivity (<500m)+Velocity
7	1h	Reflectivity (<500m)
8	1h	Velocity
9	1h	Reflectivity (<500m)+Velocity

Radar data assimilation for NWP

◆ Meixi catchment, rainfall occurs on 8 July 2016



The rainfall forecasts have been improved with all data assimilation modes

Mode	Time interval	Assimilated data
1	6h	Reflectivity (<500m)
2	6h	Velocity
3	6h	Reflectivity (<500m)+Velocity
4	3h	Reflectivity (<500m)
5	3h	Velocity
6	3h	Reflectivity (<500m)+Velocity
7	1h	Reflectivity (<500m)
8	1h	Velocity
9	1h	Reflectivity (<500m)+Velocity

Radar data assimilation for NWP

➤ Different assimilation time intervals

- when the assimilation time interval is 6h, radar reflectivity assimilation is the best choice;
- when the assimilation time interval is 3 h or 1 h, radial velocity assimilation is the best choice;
- when the assimilation time interval is 1 h, radial velocity is the best choice. The rainfall forecast is much closer to the observed rainfall.

➤ Different assimilation data

- when radar reflectivity is assimilated, increasing the assimilation frequency of radar reflectivity cannot guarantee the increase of rainfall forecast accuracy;
- when radar reflectivity and radial velocity are assimilated at the same time, the assimilation is gradually improved with the decrease of assimilation time interval, but some evaluation indices still fluctuate;
- when radial velocity is assimilated, the assimilation effect decreases with the assimilation time interval, and the rainfall forecasts have gradually been improved.

Overall, reasonable radar data assimilation can improve the accuracy of rainfall forecast by 20 % ~ 40 %.

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Nowcasting forecast with doppler radar

◆ Model and configuration

- **Optical flow and ensemble forecast**

Gauss perturbation: 30 members

- **Intense precipitation identification**

Precipitation type: convective precipitation, stratiform precipitation without the influence of bright band, stratiform precipitation with the influence of bright band

Z-R relationship: different Z-R for different precipitation type

- **Evaluation indices**

Relative error for 24-h accumulated areal rainfall

$$RE = \frac{P' - P}{P} \times 100\%$$

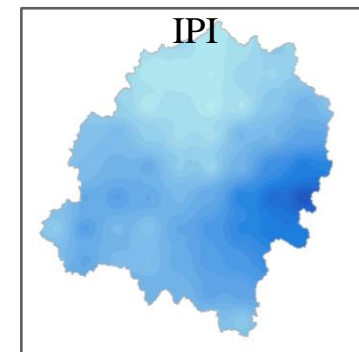
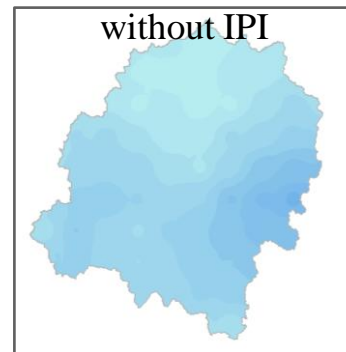
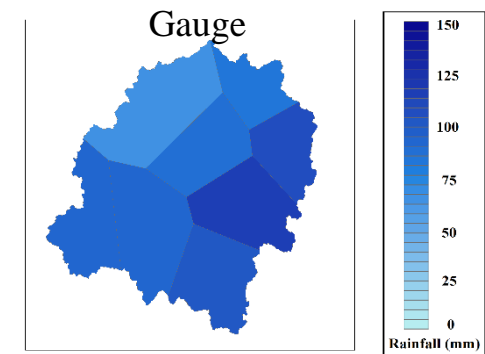
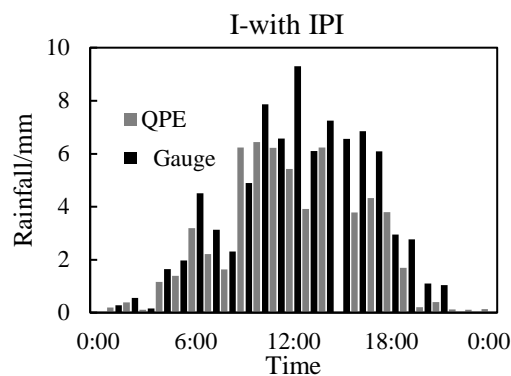
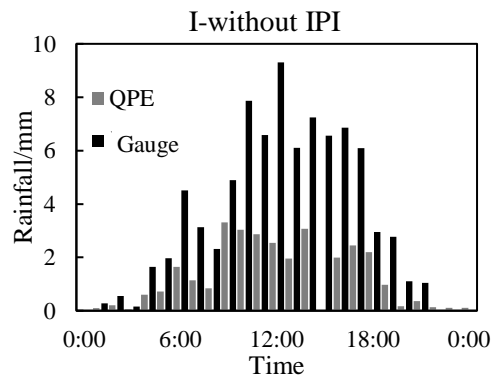
Ratio of root mean square error for spatiotemporal patterns

$$RMSE = \frac{\sqrt{\frac{1}{M} \sum_{j=1}^M (P'_j - P_j)^2}}{\frac{1}{M} \sum_{j=1}^M P_j}$$

Nowcasting forecast with doppler radar

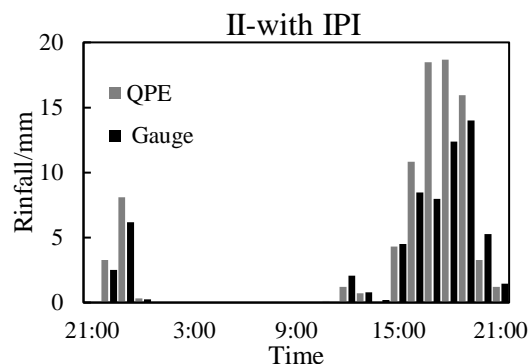
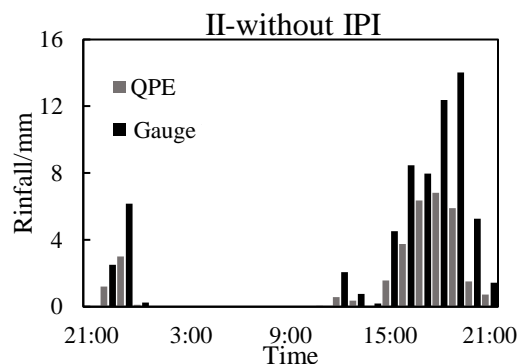
Evaluation indices for QPE

Events in Meixi catchment	<i>RE</i> (%)		<i>RMSE in spatial dimension</i>		<i>RMSE in temporal dimension</i>	
	without IPI	IPI	without IPI	IPI	without IPI	IPI
3 August 2012 (I)	-63.52	-29.29	0.71	0.37	0.82	0.53
17 June 2014 (II)	-51.40	31.06	0.55	0.48	0.85	0.90
8 July 2016 (III)	-71.35	-31.07	0.70	0.54	1.34	0.70

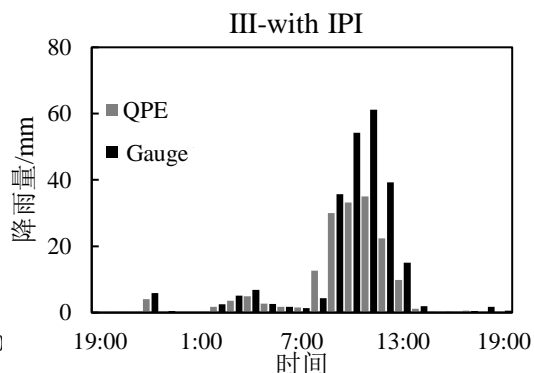
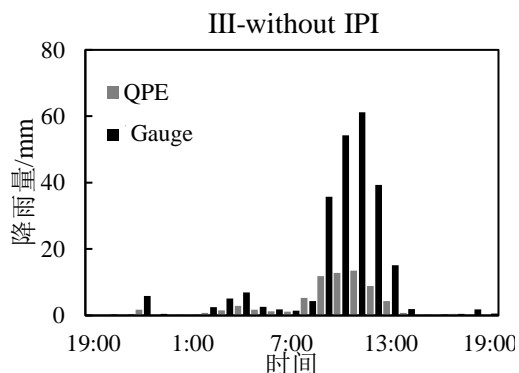


with heavy rainfall identification, the RE of 24-hour accumulated QPE for rainfall event I is reduced by 34.23%, the RMSE in spatial dimension is reduced by 0.34, and the RMSE in temporal dimension is reduced by 0.29. In general, the accuracy of radar inversion is significantly improved.

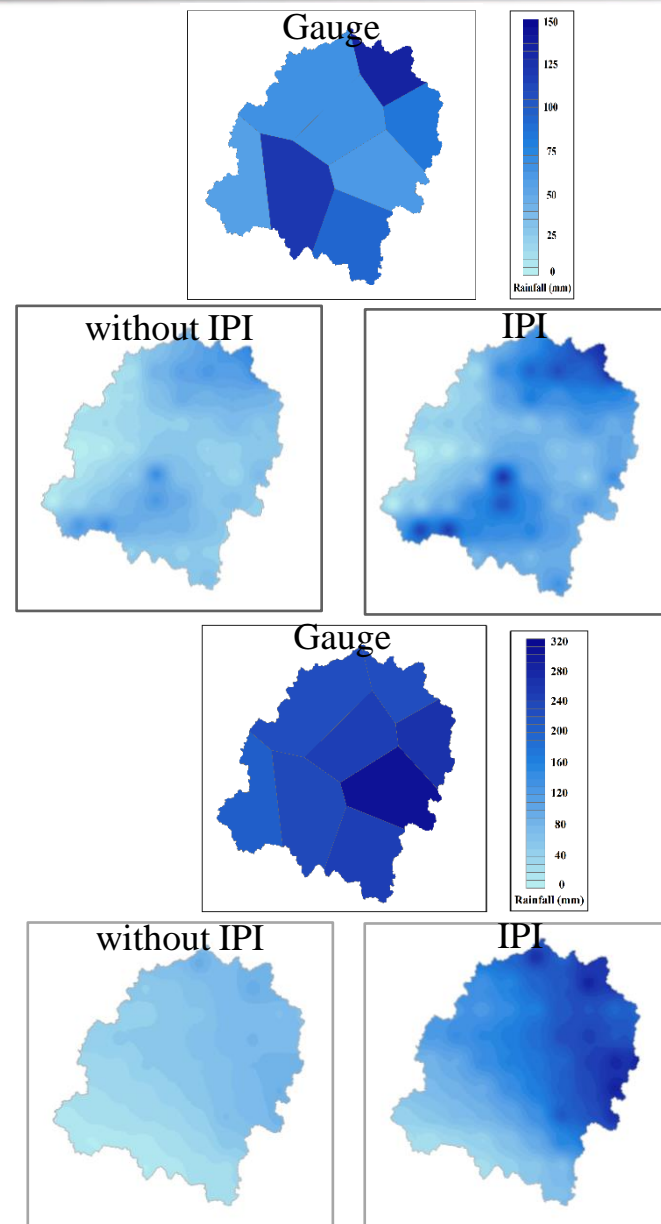
Nowcasting forecast with doppler radar



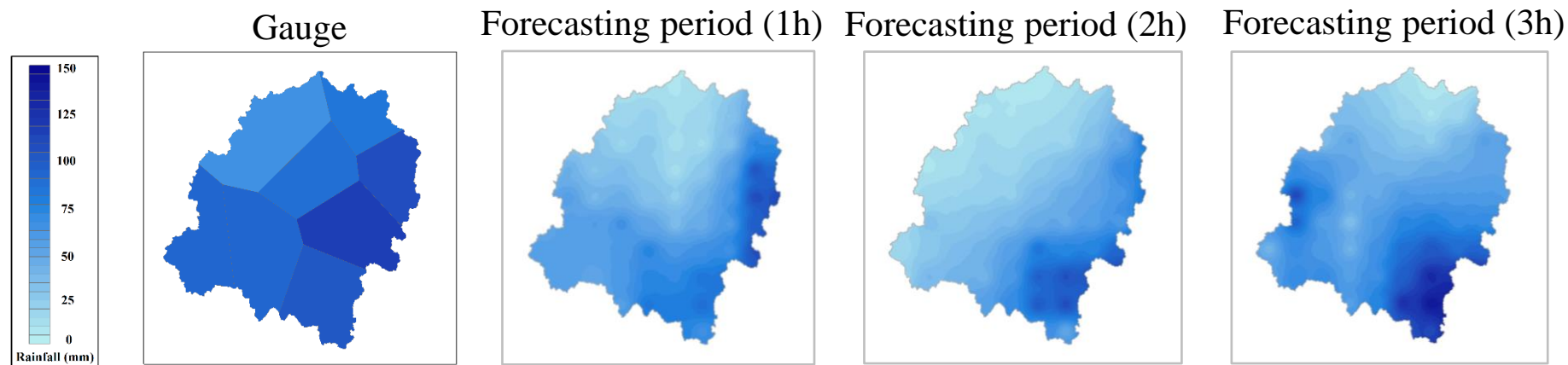
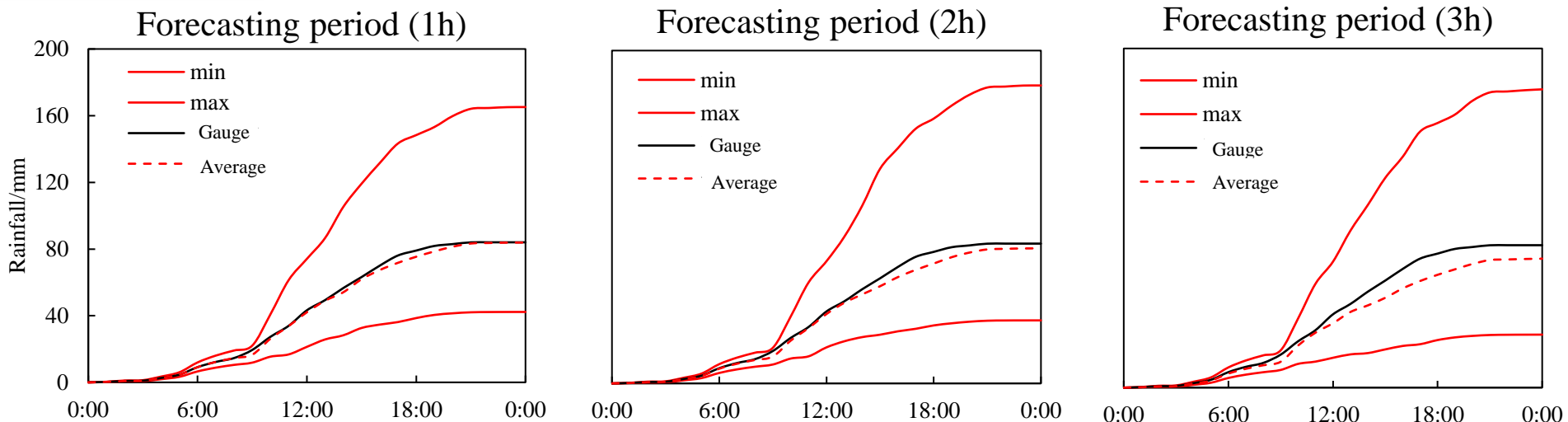
For the rainfall event on June 17th of 2014, with heavy rainfall identification, the RE of 24-hour accumulated QPE for rainfall event II is reduced by 20.34%, the RMSE in spatial dimension is reduced by 0.07, and the RMSE of temporal dimension is increased by 0.05. In general, the accuracy of radar inversion is certainly improved.



For the July 8th of 2016, with heavy rainfall identification, the RE of 24-hour accumulated QPE for rainfall event II is reduced by 40.28%, the RMSE in spatial dimension is reduced by 0.16, and the RMSE in temporal dimension is decreased by 0.64. In general, the improvement of radar inversion accuracy is most significant among these three rainfall events.



Nowcasting forecast with doppler radar



Ensemble average

RE (%)

RMSE

Spatial dimension

Temporal dimension

Forecasting period (1h)

-3.64

0.31

0.35

Forecasting period (2h)

-7.5

0.33

0.45

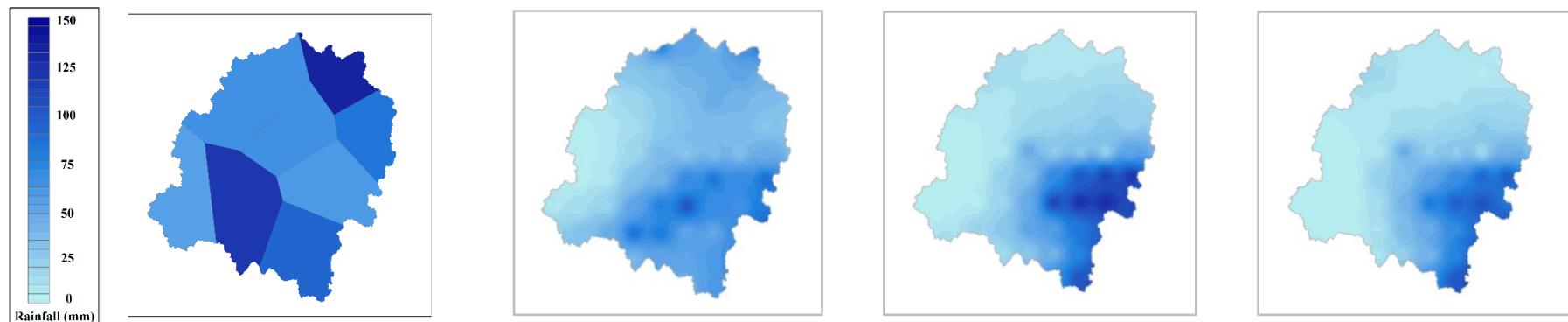
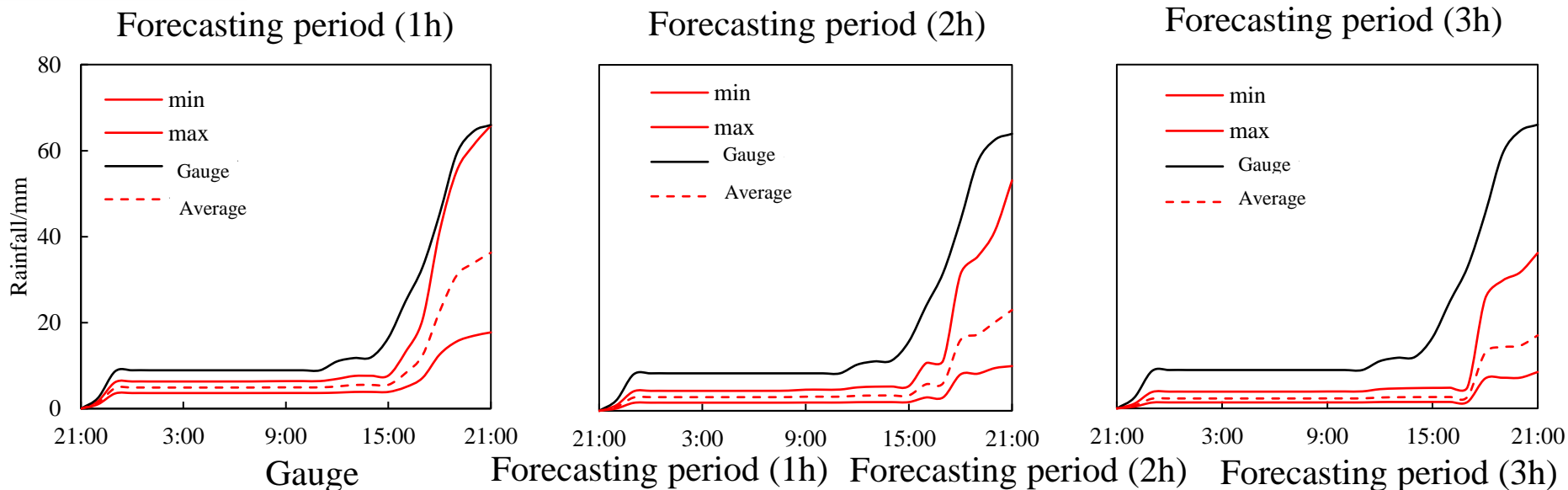
Forecasting period (3h)

-13.88

0.44

0.5

Nowcasting forecast with doppler radar



Ensemble average

RE (%)

RMSE

Spatial dimension

Temporal dimension

Forecasting period (1h)

-46.76

0.77

0.66

Forecasting period (2h)

-65.22

1.20

0.80

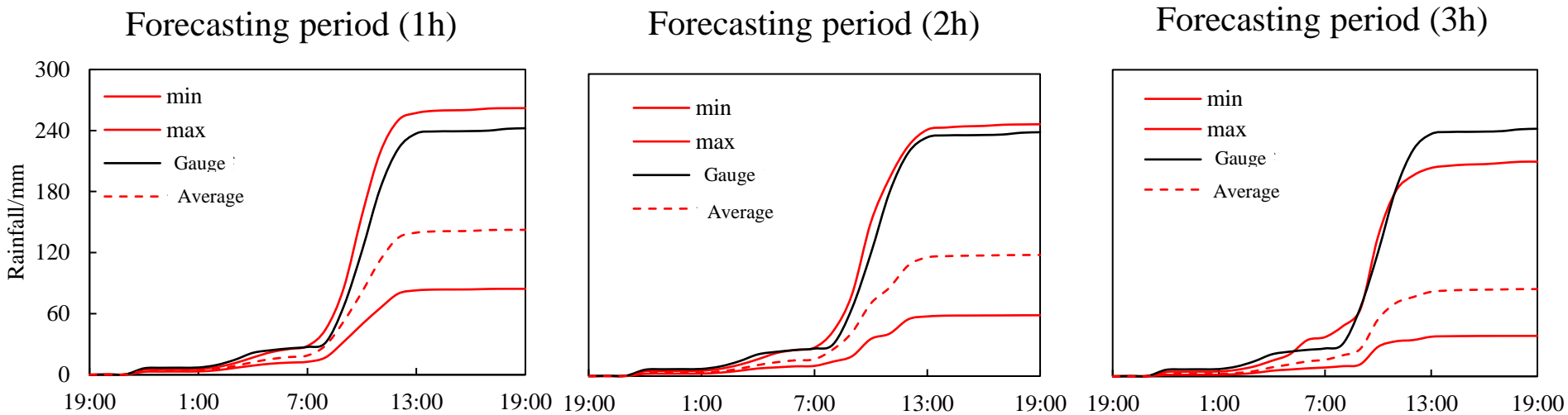
Forecasting period (3h)

-75.23

1.32

0.89

Nowcasting forecast with doppler radar

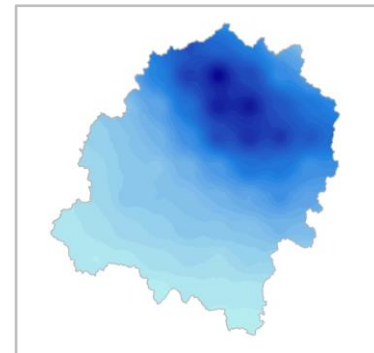
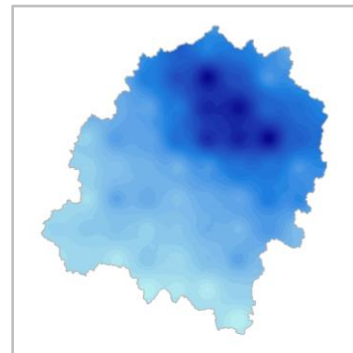
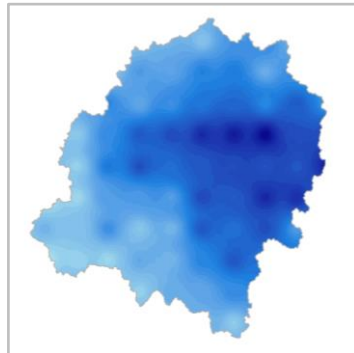
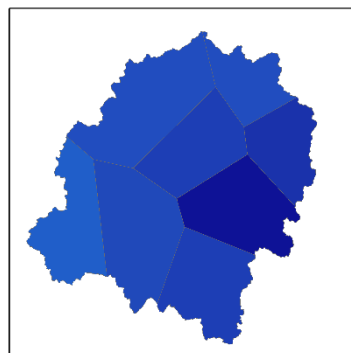
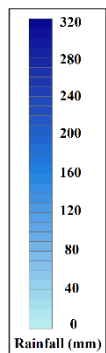


Gauge

Forecasting period (1h)

Forecasting period (2h)

Forecasting period (3h)



Ensemble average

RE (%)

RMSE

Spatial dimension

Temporal dimension

Forecasting period (1h)

-42.75

0.85

0.57

Forecasting period (2h)

-52.23

1.08

0.67

Forecasting period (3h)

-66.34

1.26

0.81

Content

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- ◆ **Conclusions**

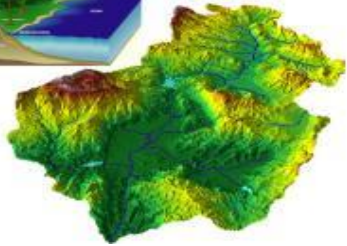
Conclusions

➤ **The main conclusion**

- Reasonable radar data assimilation can effectively improve the accuracy of numerical rainfall prediction.
- Heavy rainfall identification can effectively improve the accuracy of doppler radar rainfall measurement.
- The method of traditional nowcasting forecasting has better prediction for rainfall with uniform spatial-temporal distribution, but has poor prediction for short-term rainfall and heavy rainfall.

➤ **The future expectation**

- Considering the combining use of forecast method based on the physical mechanism and forecast experience.
- X-band rain radar should be used to improve the rainfall monitoring and forecasting in key areas.



Thanks for your attention!



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