

Applications of GPS Radio Occultation Data to Tropical Cyclone Prediction

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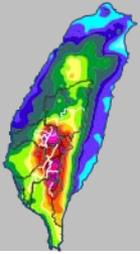
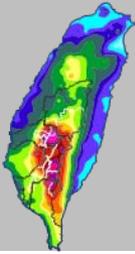
⁴Central Weather Bureau, Taipei, Taiwan

OPAC 2010, 6-9 September, GRAZ, AUSTRIA

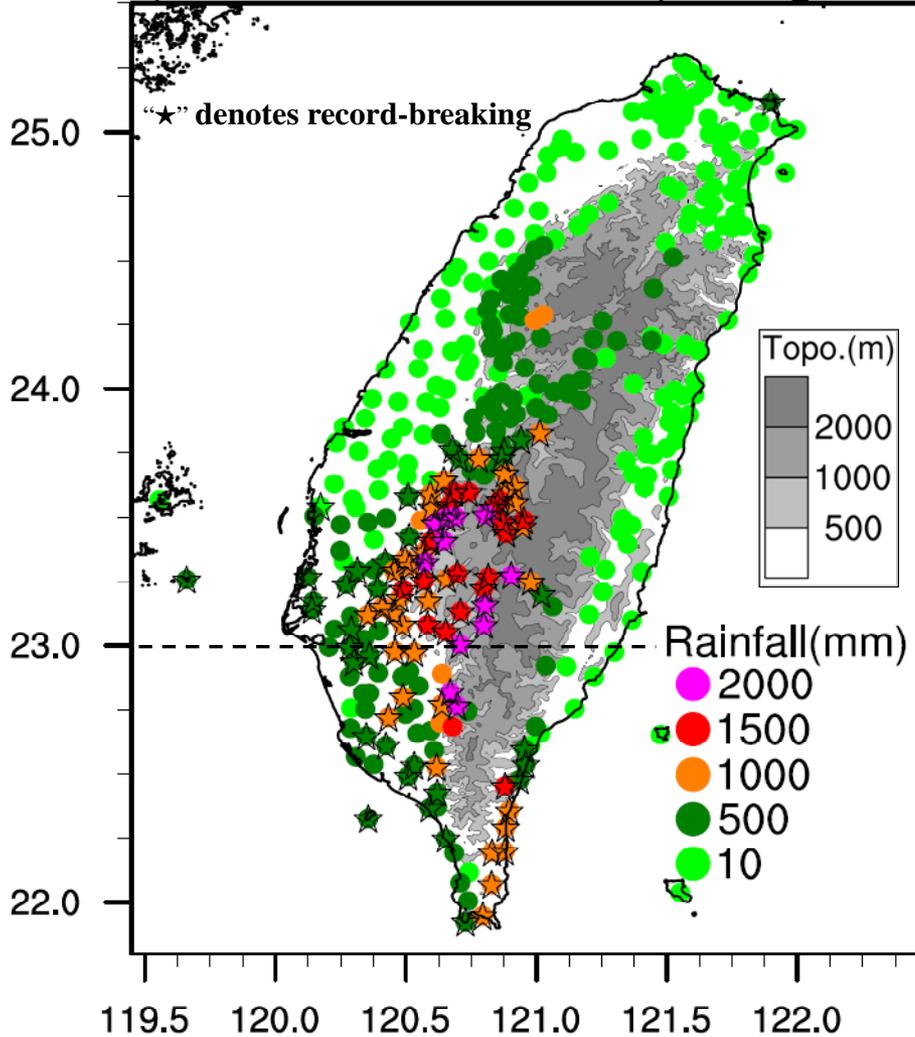
Super Typhoon Jangmi (2008)



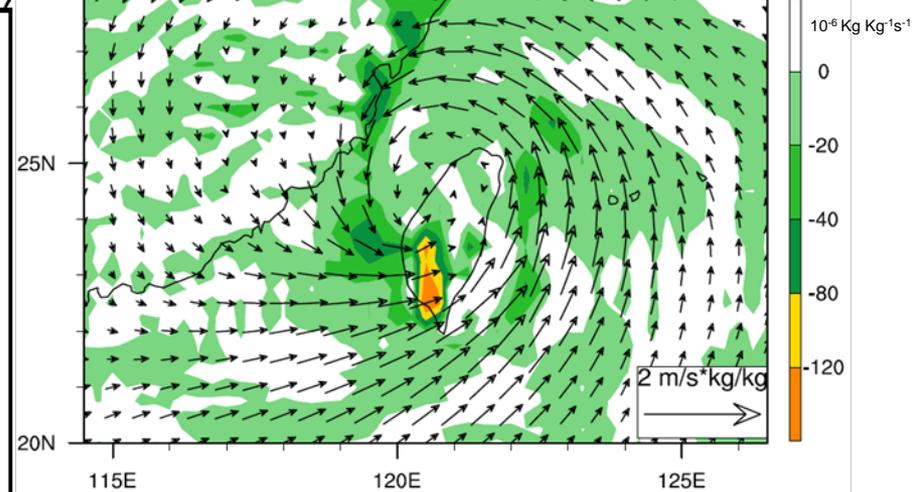
Catastrophic Morakot (2009)



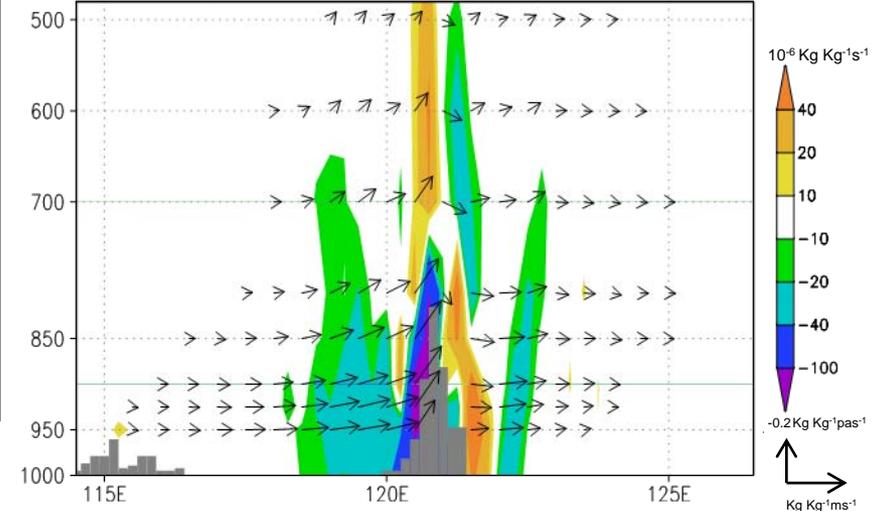
a) Taiwan Station Rainfall (7-9Aug2009)

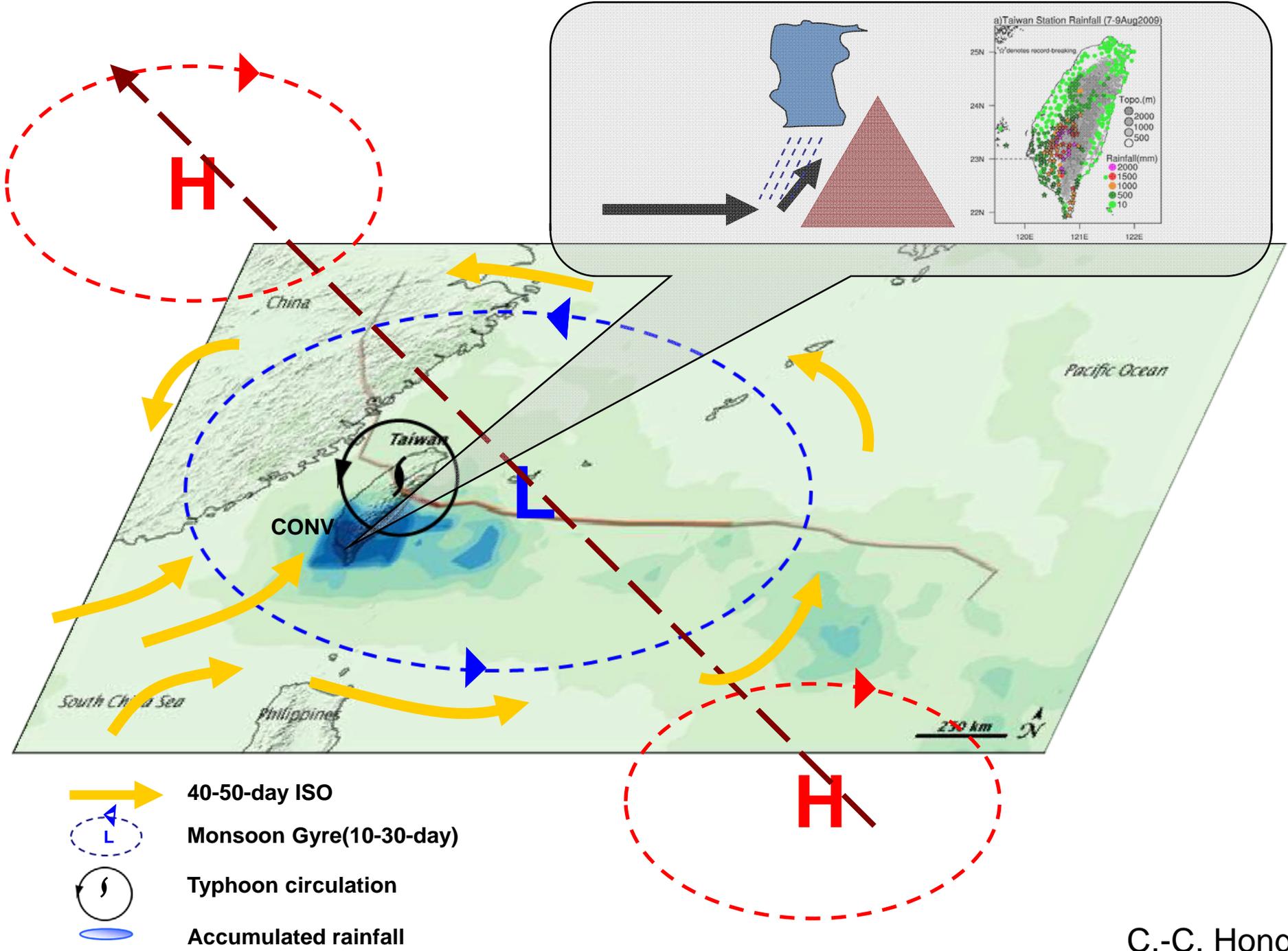


b) moisture flux and div. at 925hPa (8Aug)



c) cross profile of moisture flux and div. (23N)

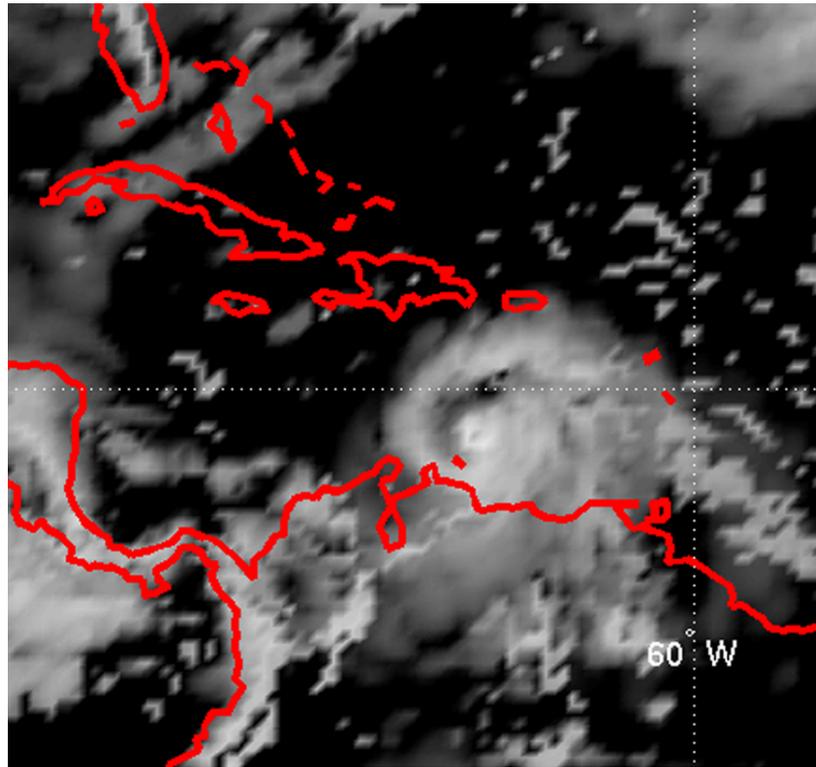




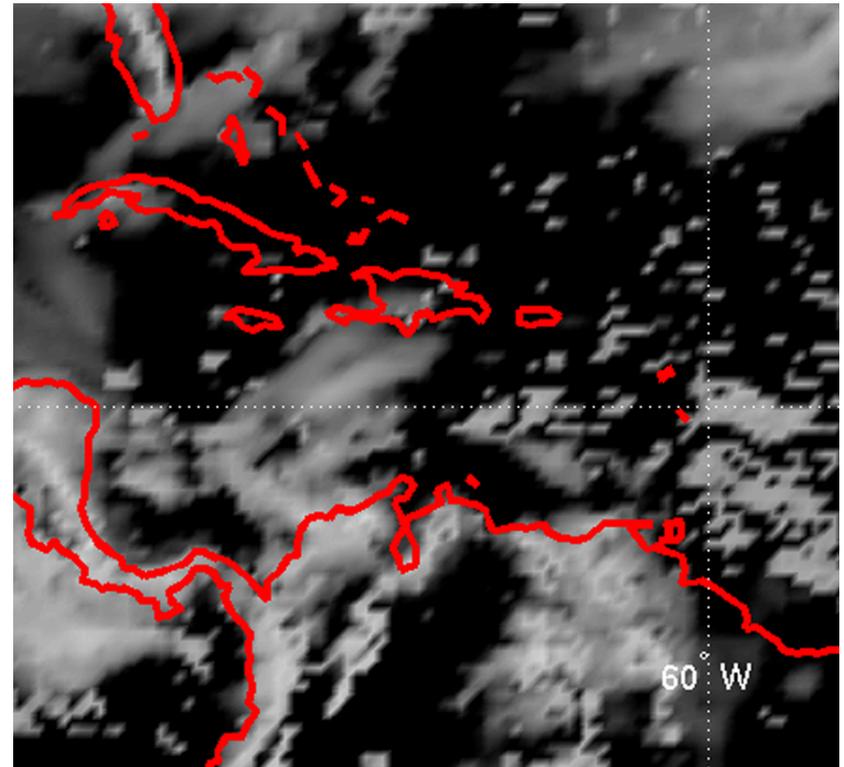


Impact of COSMIC on Hurricane Ernesto (2006) Forecast by WRF/DART

With COSMIC



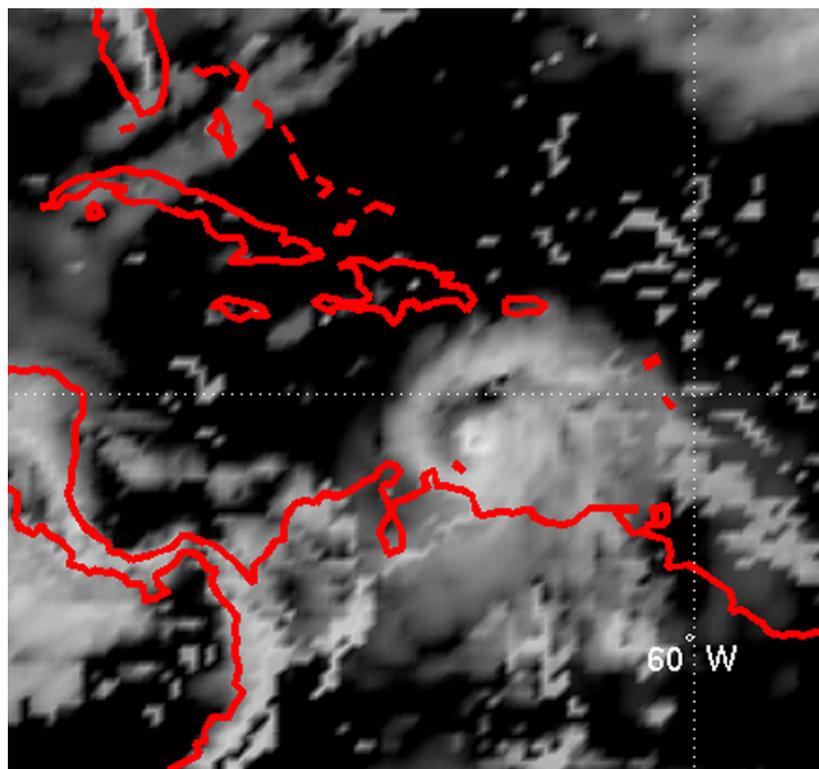
Without COSMIC



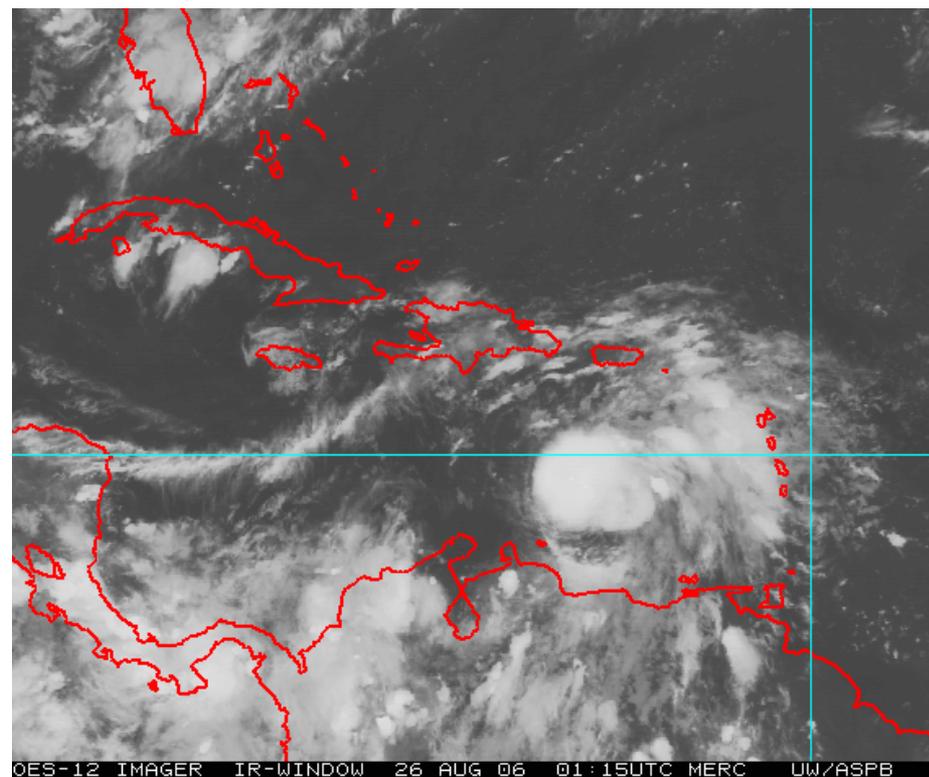
(by Y. Chen, UCAR)

Impact of COSMIC on Hurricane Ernesto (2006) Forecast

With COSMIC



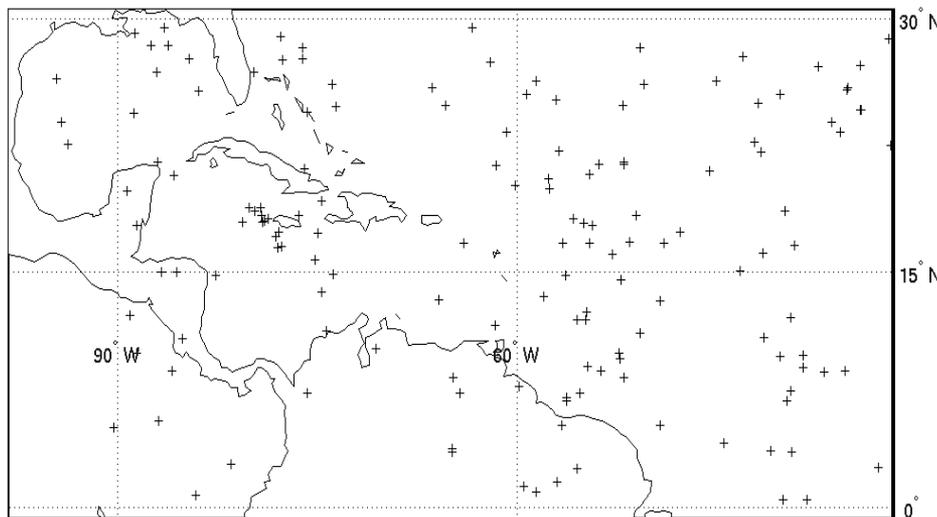
GOES Image



GOES Image from Tim Schmitt, SSEC

WRF/DART ensemble assimilation of COSMIC GPSRO soundings

- WRF/DART ensemble Kalman filter data assimilation system
- 36-km, 36-members, 5-day assimilation
- Assimilation of 171 COSMIC GPSRO soundings (with nonlocal obs operator, Sokolovskiy et al) plus satellite cloud-drift winds
- Independent verification by ~100 dropsondes.

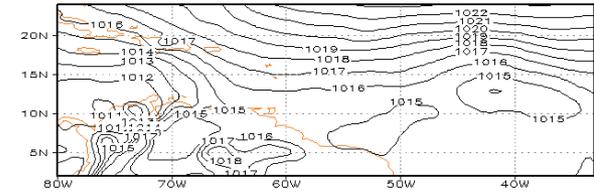
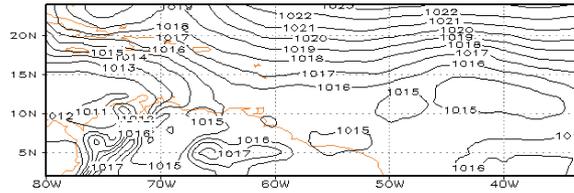


171 COSMIC
GPSRO soundings
during 21-25 August
2006

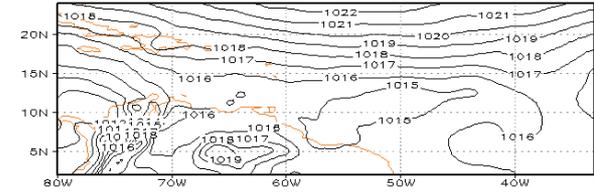
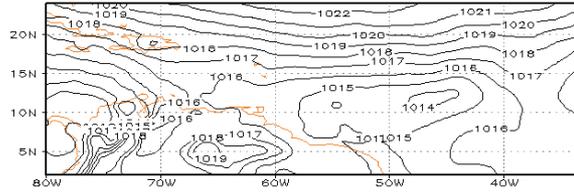
With COSMIC

No COSMIC

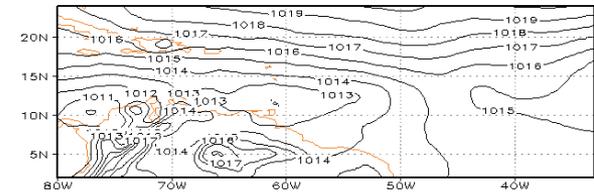
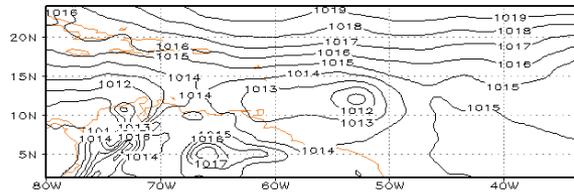
06/8/21 12Z



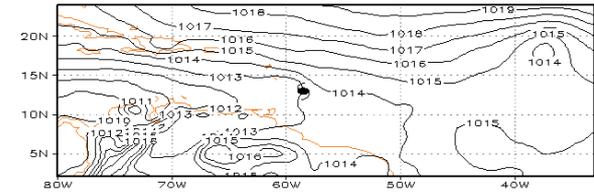
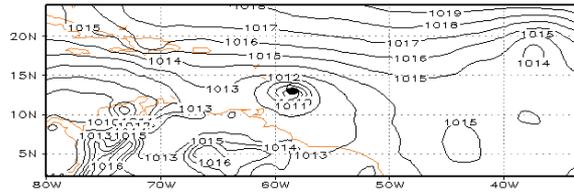
06/8/22 12Z



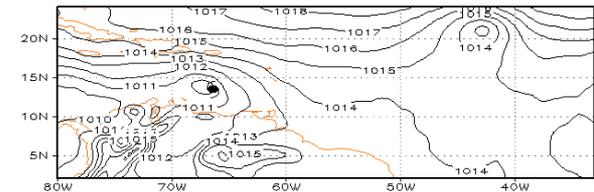
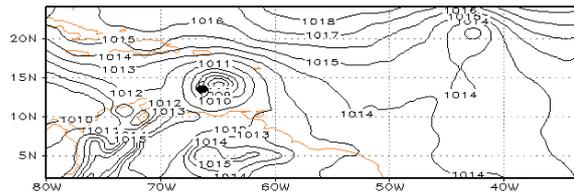
06/8/23 12Z



06/8/24 12Z



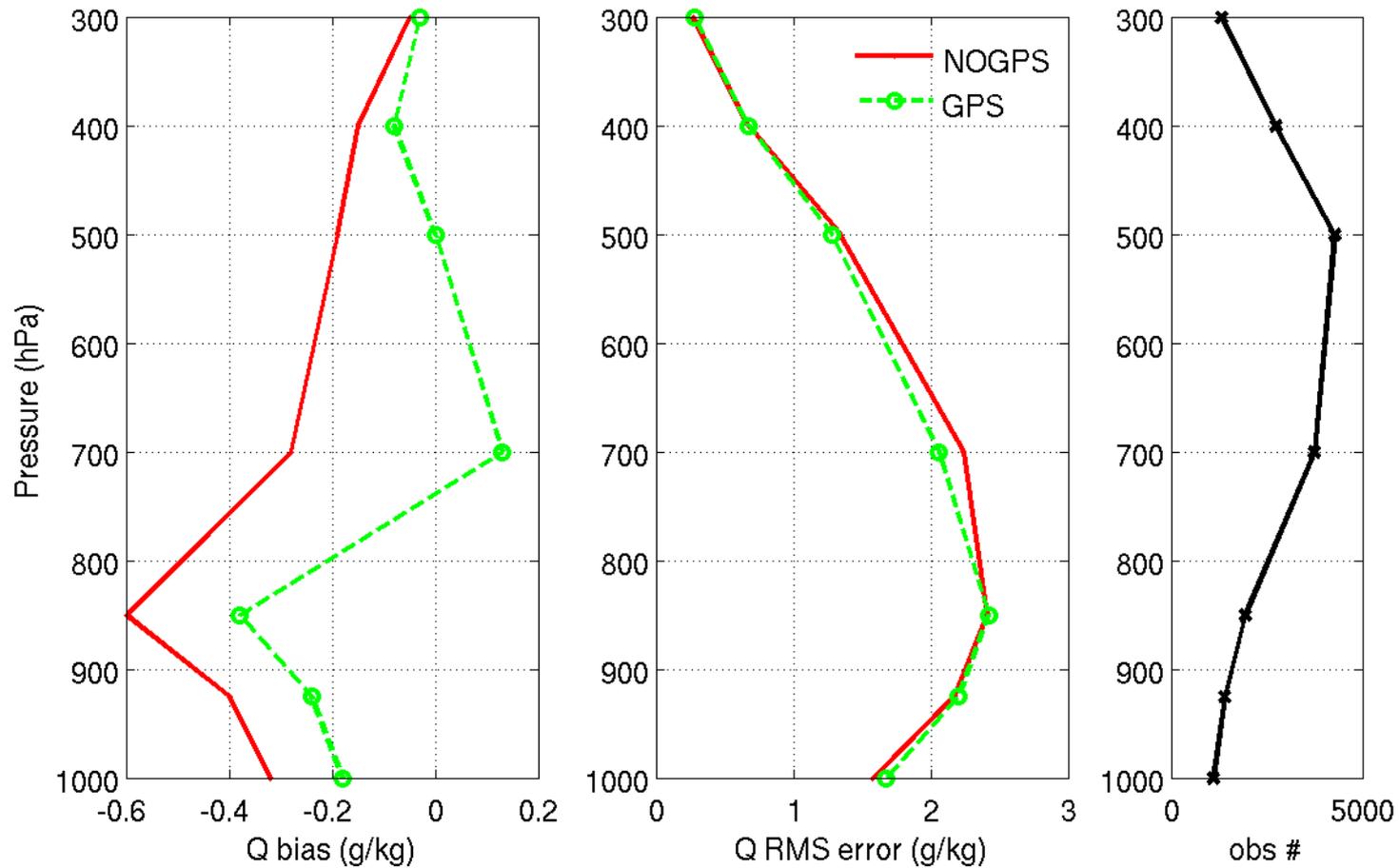
06/8/25 12Z



Genesis of Hurricane Ernesto (2006)

Continuous data assimilation during genesis stage with WRF EnKF system

Verification of WRF/DART analysis by about 100 dropsondes during the Ernesto genesis stage.



(from Hui Liu)

WRF/DART Configuration at CWB

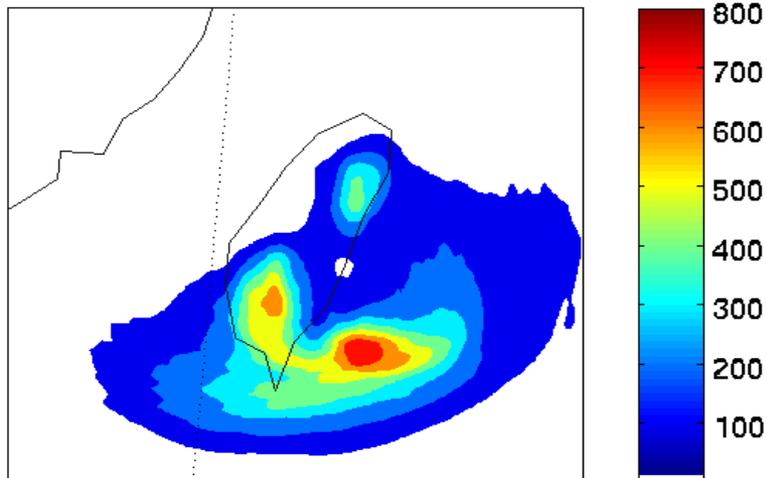
- DART EAKF algorithm, 32 members, CWB 45km grid
- DART Adaptive ensemble inflation, fixed localization
- CWB operational WRF namelists setting
- CWB operational data, including radiosondes, aircraft data, satellite cloud winds, TC bogus data, TC position data, satellite thickness data, GPS RO refractivity.

Assimilation experiments for Morakot

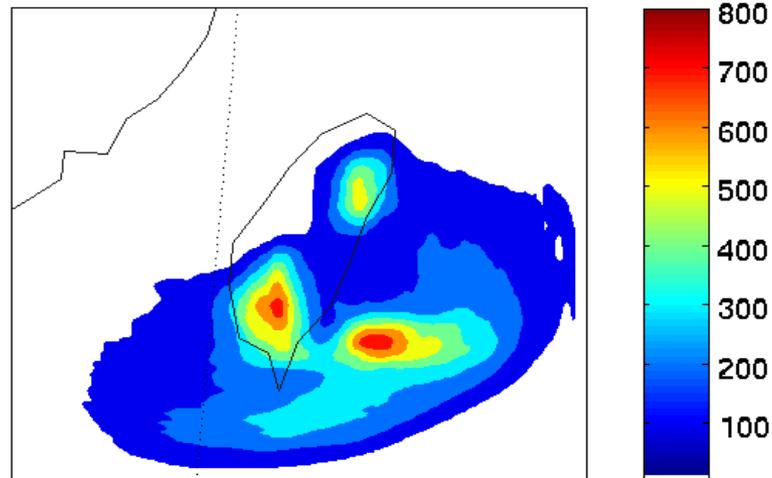
- Assimilation from 00Z 3 to 18Z 8 August, 2009 with 2-hourly cycling.
- 36km analysis grid
- 48h Forecast with nests 36/12/4km starting at August 7 00Z.
- CTL run: Assimilate CWB conventional observations
- GPS run: CTL run + COSMIC refractivity data.

24h forecast of 24-h accumulated rainfall (Aug 7-8)

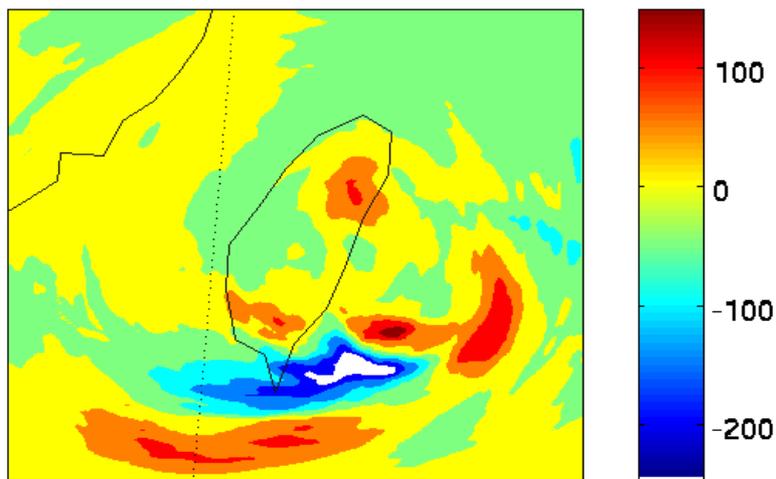
24h Prep forecast, ctl, Aug 7-8



24h Prep forecast, gps, Aug 7-8

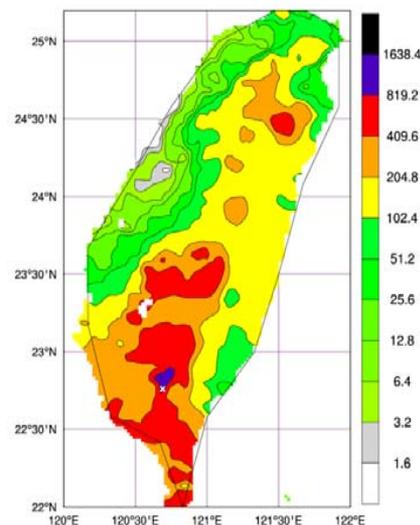


24h Prep forecast, gps - ctl, Aug 7-8



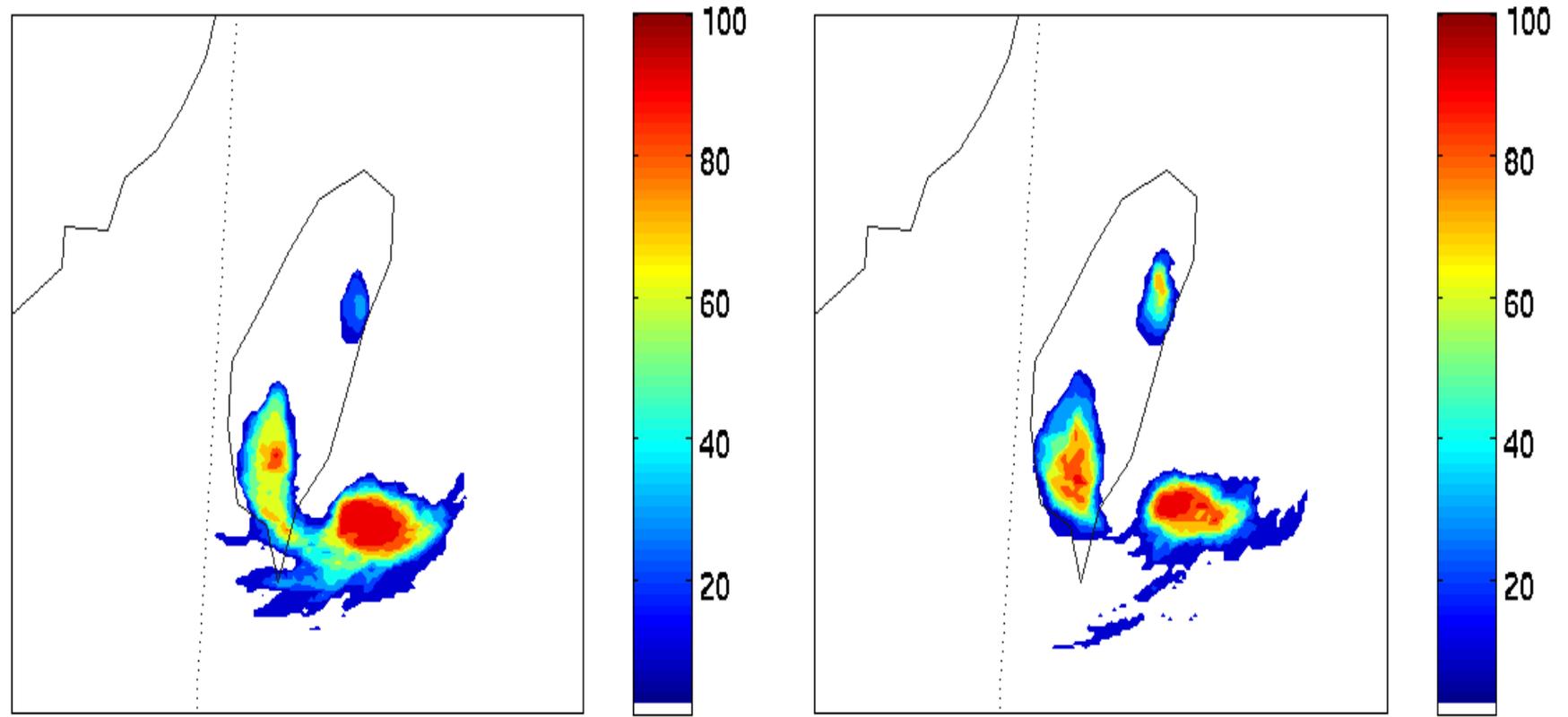
Obs pre on obs grid

Obs pre from 0700UTC to 0800UTC max1364 mm



Rain Probability Forecast (August 7-8 00Z)

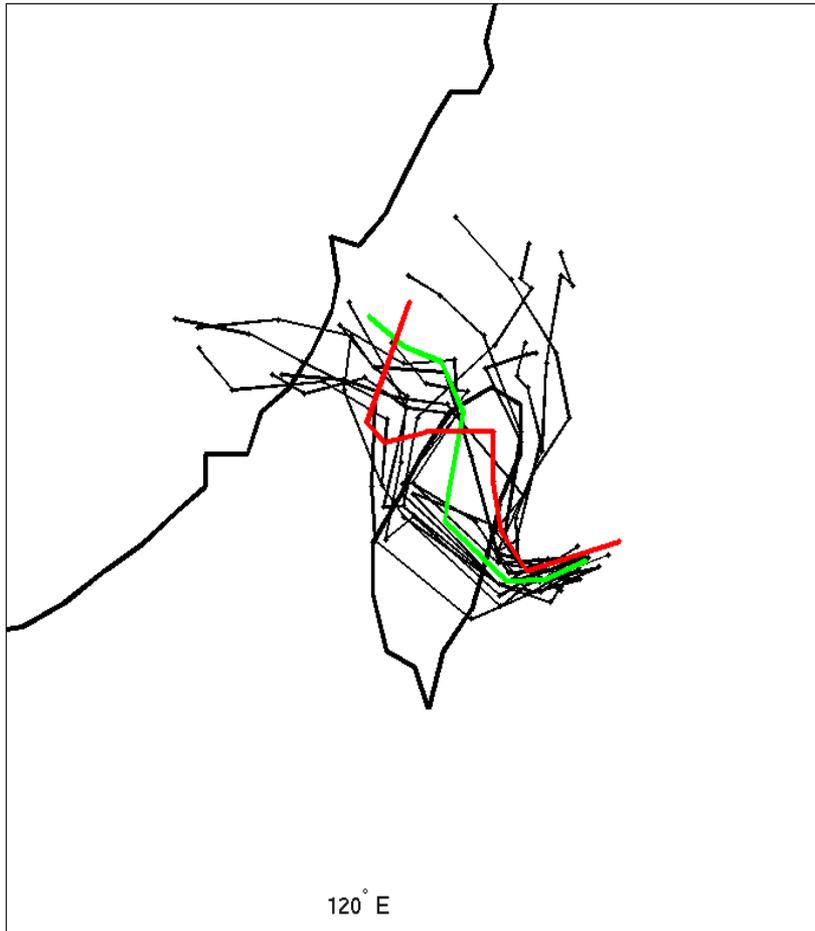
Probability forecast (% >500mm, Aug 7-8 00Z), CTL Probability forecast (% >500mm, Aug 7-8 00Z), GPS





Track errors of 48h forecasts (August 7 - 9 00Z)

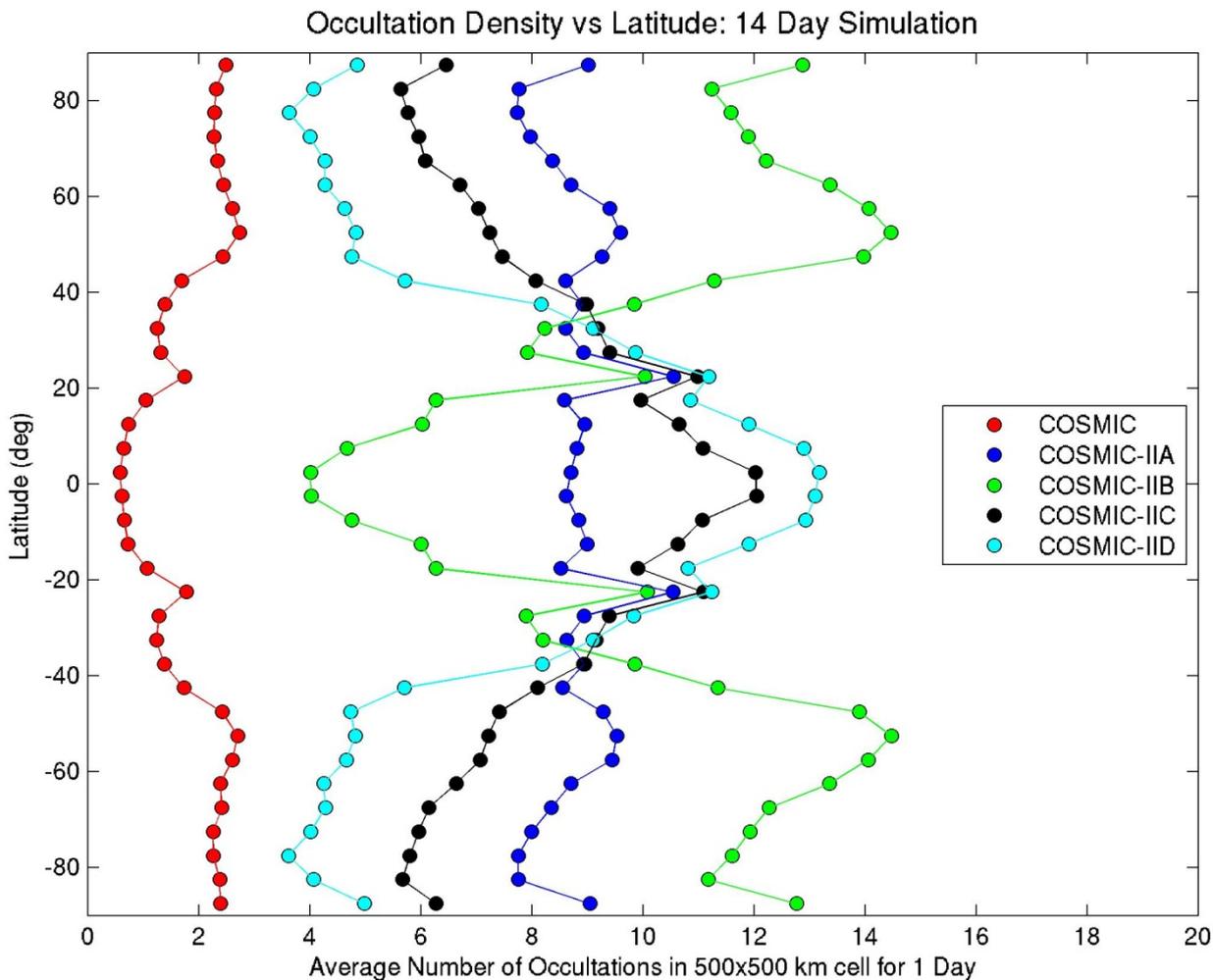
Ensemble forecasts from 00UTC 7 August, CTL



Ensemble forecasts from 00UTC 7 August, GPS



Data Density for COSMIC and COSMIC-II Options: A, B, C, and D



COSMIC

- 6 x 72°

COSMIC-IIA

- 8 x 72° + 4 x 24°

COSMIC-IIB

- 12 x 72°

COSMIC-IIC

- 6 x 72° + 6 x 24°

COSMIC-IID

- 4 x 72° + 8 x 24°

Distribution of RO soundings in a day

G

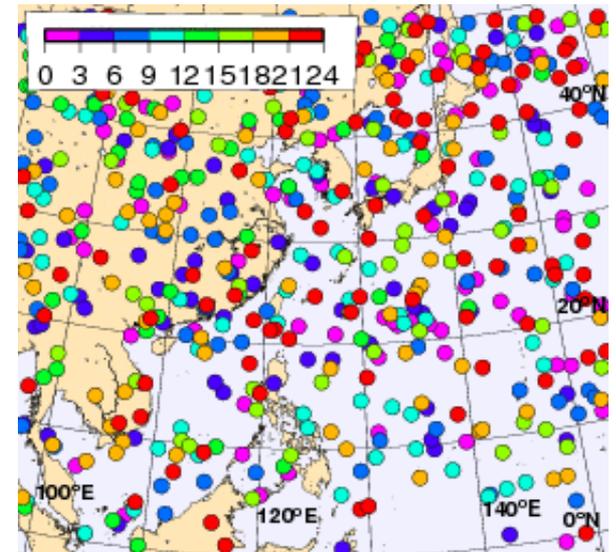
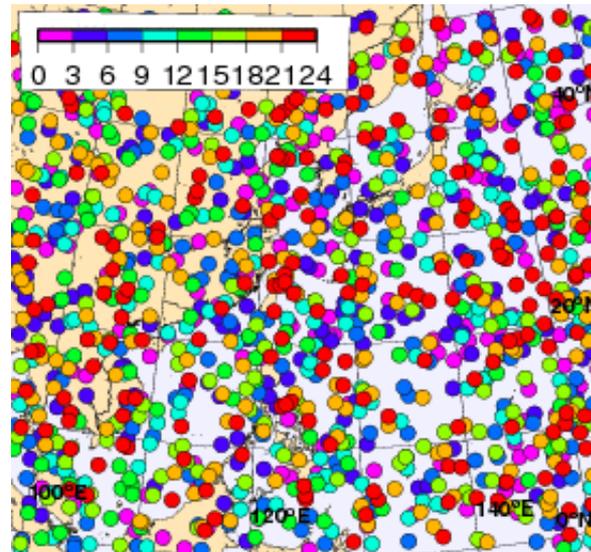
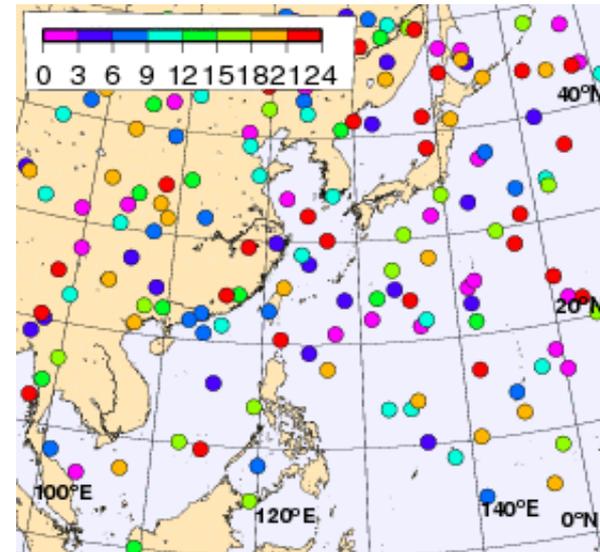
FORMOSAT-3/COSMIC

A

COSMIC-IIA

B

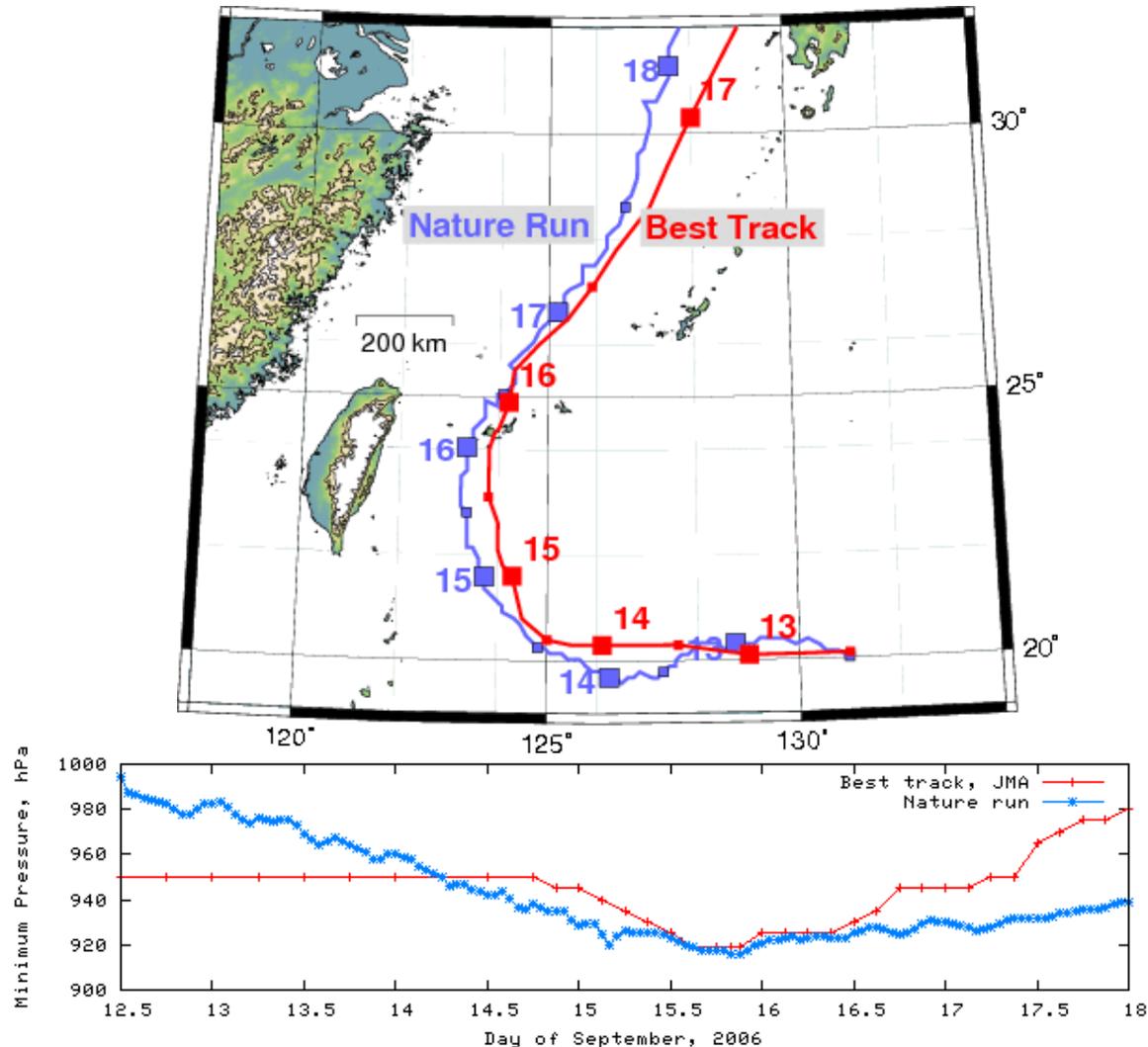
COSMIC-IIB



Different color shows availability of RO soundings at different hours of the day.

(from Bill, UCAR)

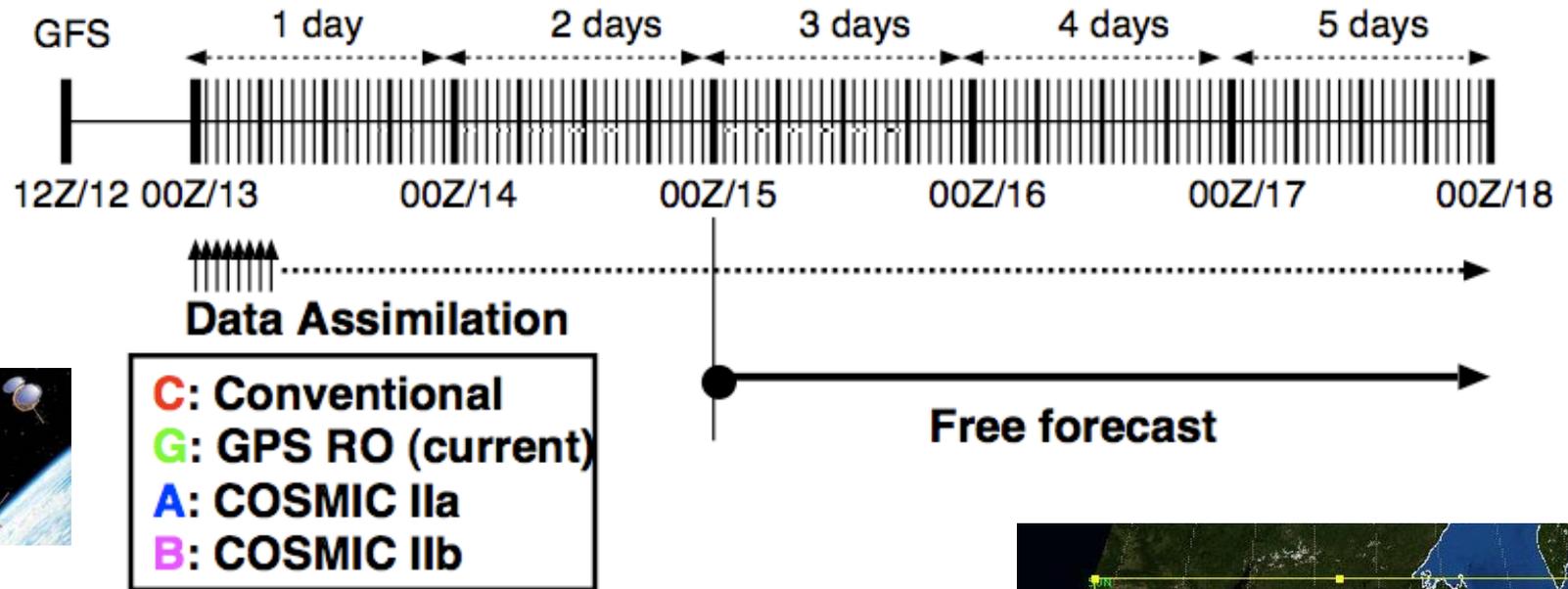
Nature Run from MM5 with ECMWF Initial condition



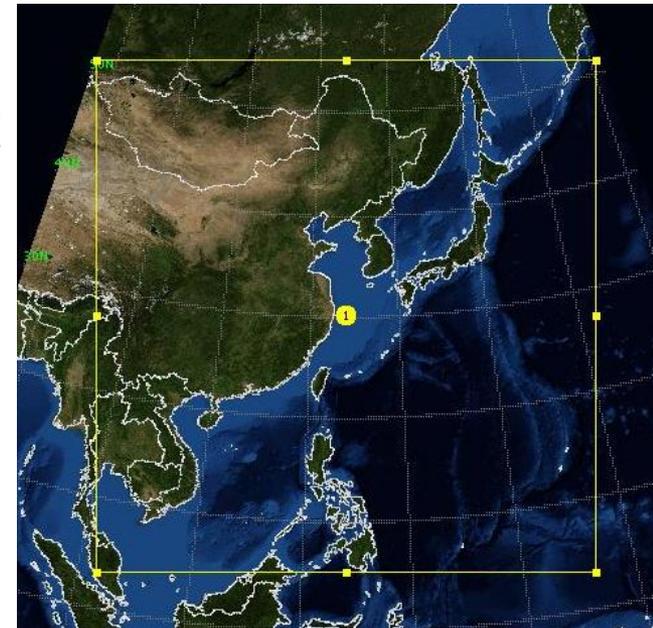
- Typhoon track recurvature was reproduced
- The track is close to the best track
- Note that no official intensity observation is available

Forecast Experiment Design

3DVAR cycling data assimilation time window

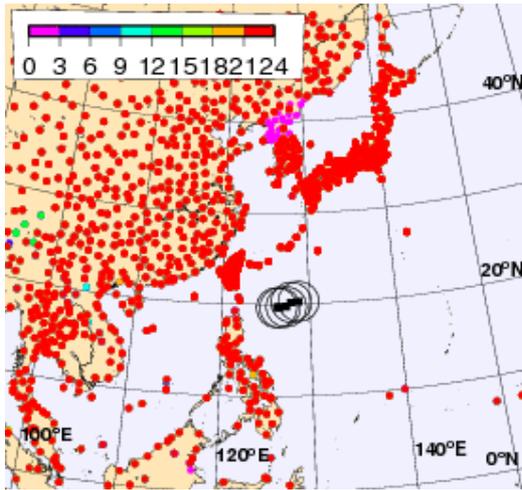


- WRF-Var (3D-Var) /WRF with GFS IC and LBC
 - B.E.: generated from one month forecast of September, 2006 (NMC)
 - 169 x 157 x 38, ptop = 10 hPa
 - Assimilation performed on 36-km grid, 1hr update cycle, over two-day period.

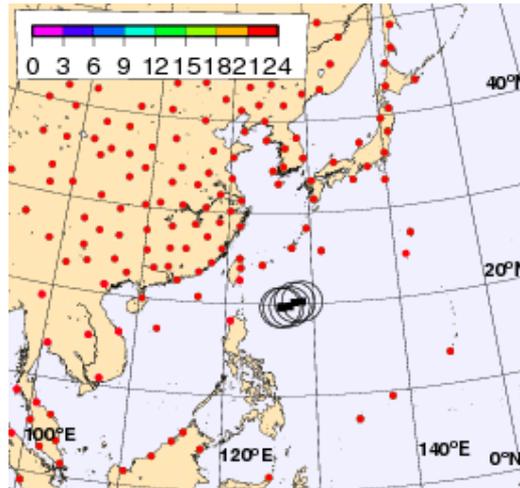


Convention Data Are Assimilated As Well

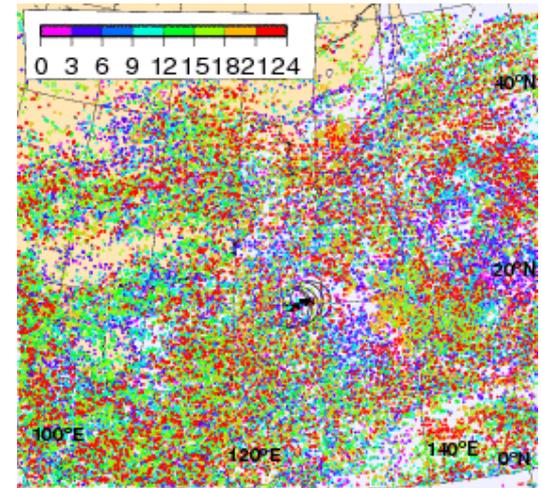
Synop



SOUND upper air

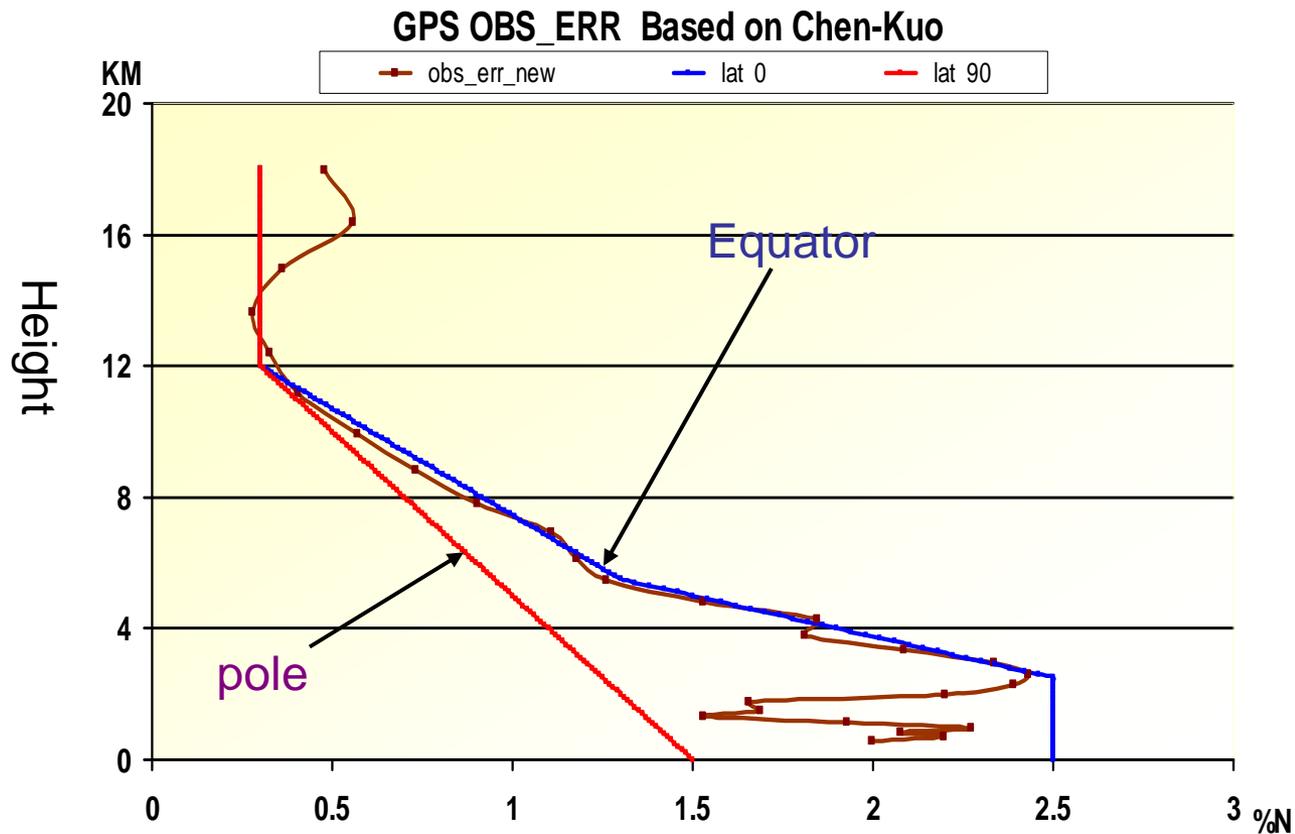


Satellite wind (SATOB)



- Upper Air sounding (SOUND)
- Observation (SYNOP)
- Satellite Cloud track Wind (SATOB)
- The horizontal and temporal distribution of these data are consistent with actual observations (location/time, and with realistic errors)

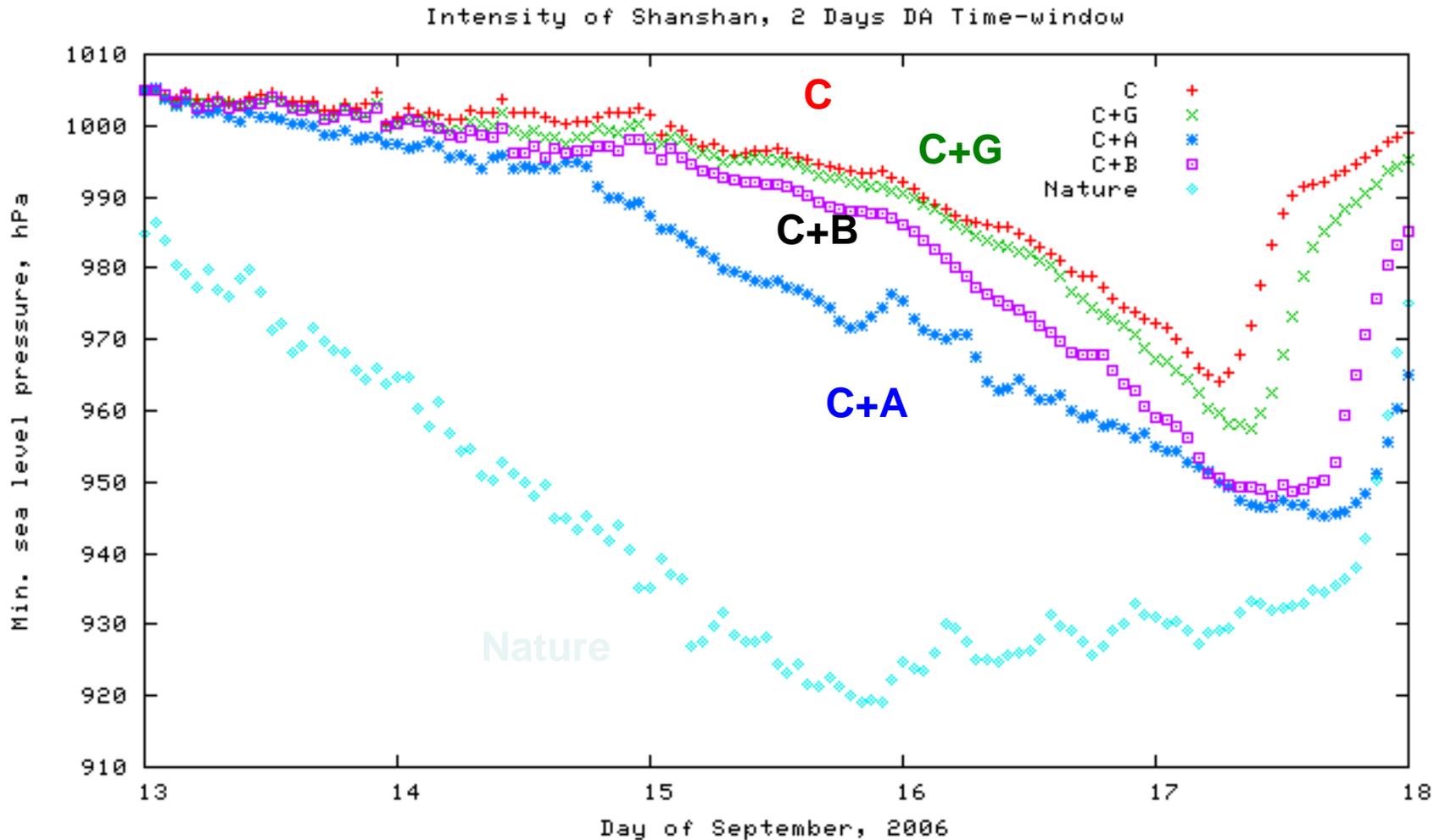
Simulated RO Refractivity Data



Percentage of GPS Ref observations

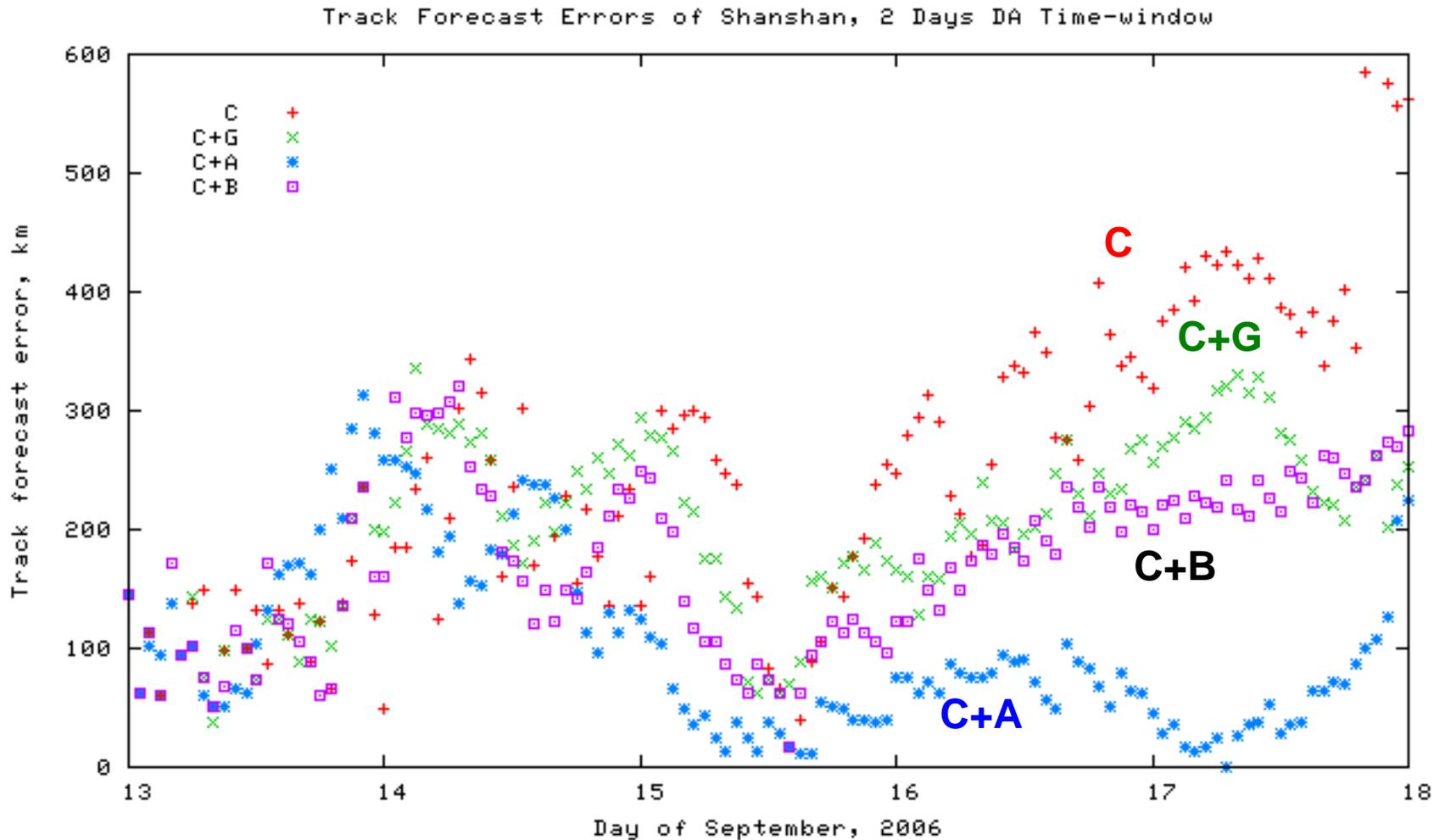
- For GPSRO refractivity, the observation errors vary with *height and latitude* (Chen and Kuo, 2005).
- RO soundings are simulated from the nature run as local value, no ray tracing simulation.

Intensity Forecast



- Intensity Forecast Performance: **C+A** > C+B > **C+G** > **C**

Track Forecast Errors



- Performance: **C+A** > C+B > C+G > C

Track Forecast Errors

Improvement against control (conventional data) forecast

Percentage of improvement of track forecast

Forecast	C+G	C+A	C+B
0 ~ 1 day	9.5	75.8	36.7
1 ~ 2 day	29.0	74.7	37.5
2 ~ 3 day	36.3	86.9	44.4
Mean	25.0	79.1	39.5

- FORMOSAT-3 only shows visible improvement over Control.
- COSMIC-IIA shows significant improvements over control.
- COSMIC-IIA is superior to COSMIC-IIB

Outlook

- Current COSMIC sounding distribution is NOT optimal for tropical prediction. We have the lowest data density over the tropics.
- Future mission (e.g., COSMIC-II) will substantially increase the data density over the tropics (factor of 10).
- UCAR, under sponsorship of NSF, will be conducting an OSSE study to examine the impact of COSMIC-II on Typhoon Morakot.

Typhoon track error ratio

= EXP track error / None track error

Kalmaegi (2008)

Fung-Wong (2008)

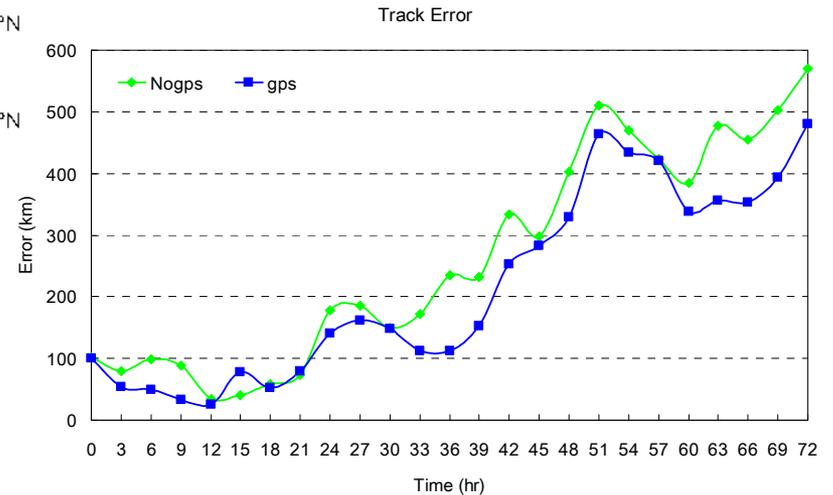
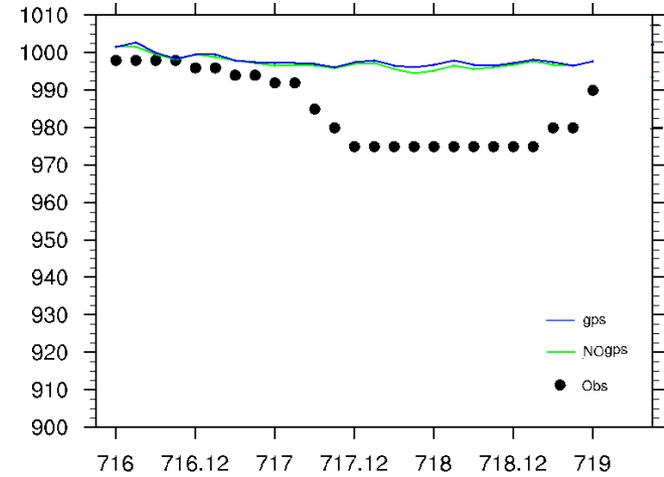
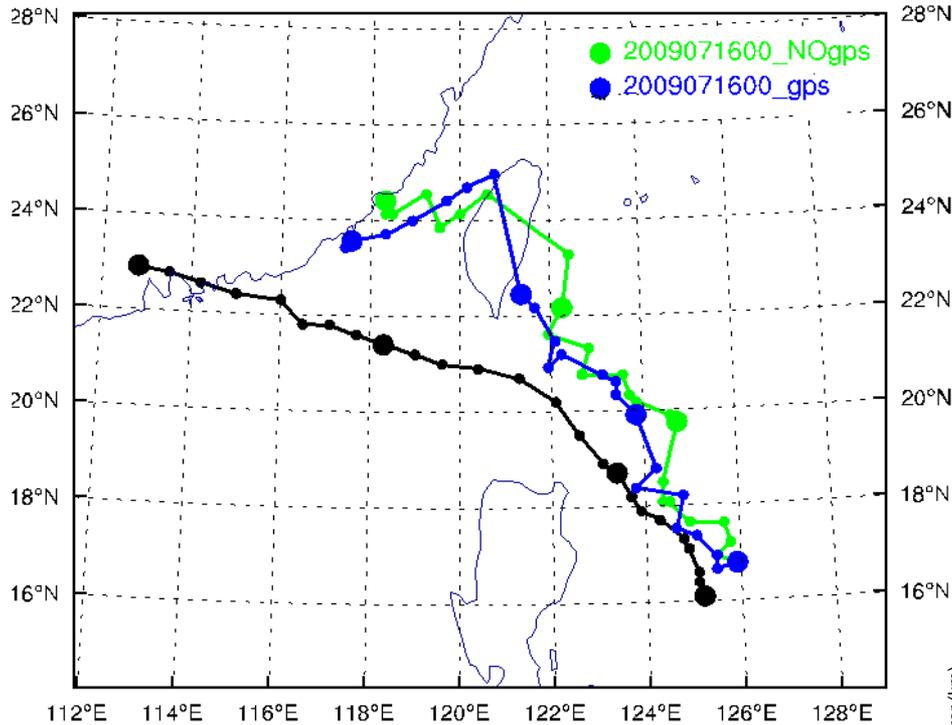
Jangmi (2008)

	EPH	Drop	CGTS	SSMI	QSCAT	EPH	Drop	CGTS	SSMI	QSCAT	EPH	Drop	CGTS	SSMI
0h	0.98	1.67	0.92	0.97	0.91	1.02	1.42	1.15	1	1.05	1.02	1.37	1.07	0.99
6h	0.96	1.34	1.01	1.01	1.00	1.12	1.81	1.46	1.01	0.33	1.71	3.65	0.75	1.55
12h	0.91	1.66	0.73	0.91	0.85	1.26	1.26	3.35	0.54	0.45	1.64	1.87	1.13	0.75
18h	0.84	1.89	0.74	0.73	0.81	0.74	0.78	0.22	0.85	0.23	1.76	1.63	1.2	1.09
24h	0.80	2.20	1.07	1.14	0.69	1.76	3.67	5.5	4.64	2.6	10.9	5.87	1.36	2.69
30h	0.94	2.83	0.76	0.88	0.58	0.05	0.71	1.03	0.16	1.15	2.66	1.43	0.29	0.93
36h	0.93	2.50	0.68	1.04	0.70	1.23	1.05	0.42	0.79	0.76	3.22	1.35	0.79	1.15
42h	0.96	2.14	0.80	0.99	0.75	3.53	3.91	0.89	1.56	0.82	4.11	1.38	1	1.39
48h	0.95	2.07	0.64	1.06	0.77	0.59	0.9	0.77	0.56	0.82	3.15	0.54	0.35	0.63
54h	0.97	1.96	0.78	1.01	0.77	2.57	1.99	0.87	1.07	1.63	2.35	0.77	0.54	1.07
60h	0.98	1.93	0.74	1.01	0.80	3.27	3.83	1.39	0.39	0.95	2.13	0.89	0.63	1.08
66h	0.95	1.89	0.81	0.97	0.84	3.89	5.88	0.88	1.17	3.31	2.18	1	0.59	1.22
72h	0.95	1.94	0.78	0.94	0.85	1.24	2.52	1.43	1.13	0.97	2.06	1.01	0.68	1.08

Molave typhoon

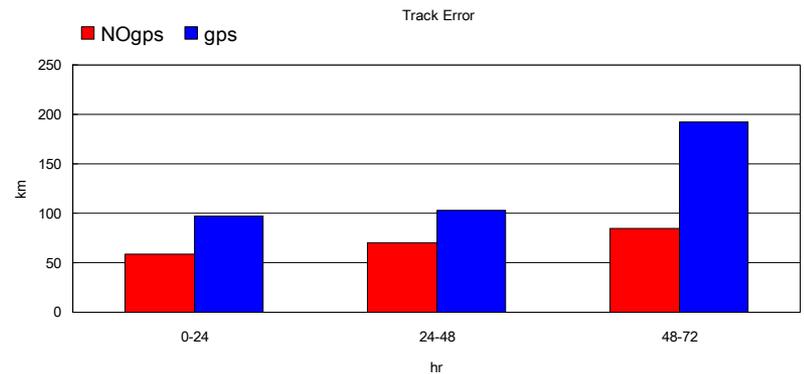
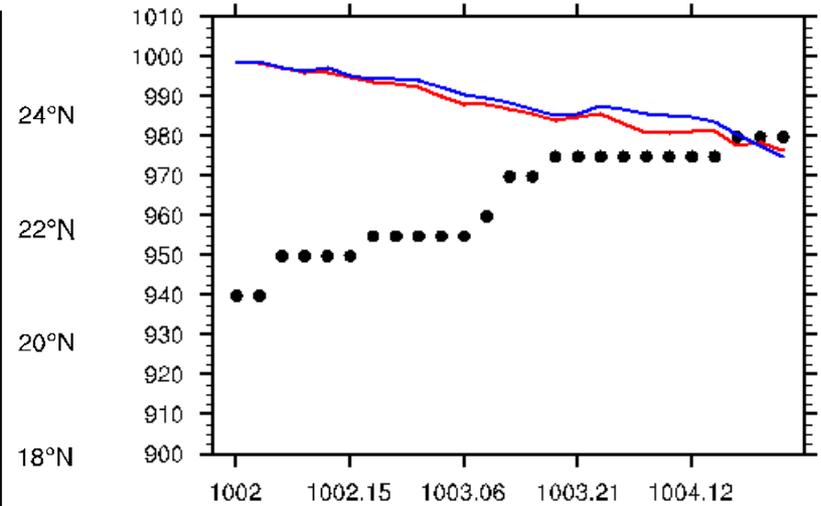
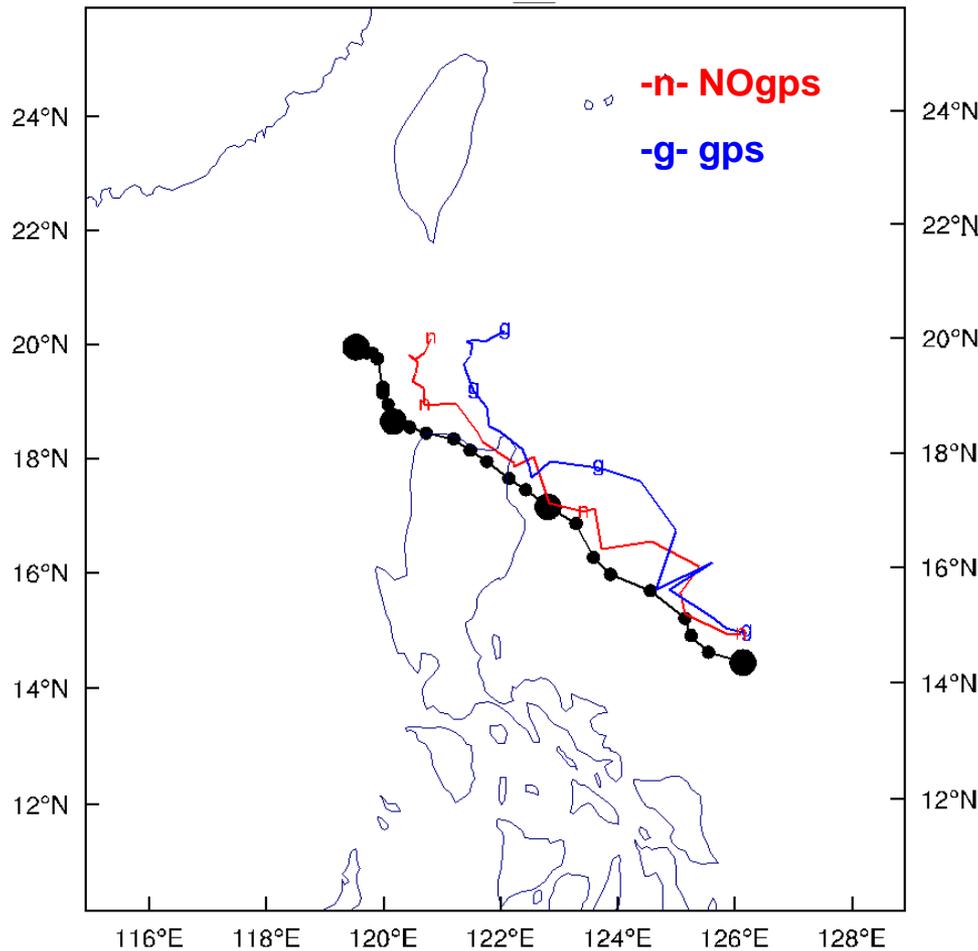
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Typhoon Molave



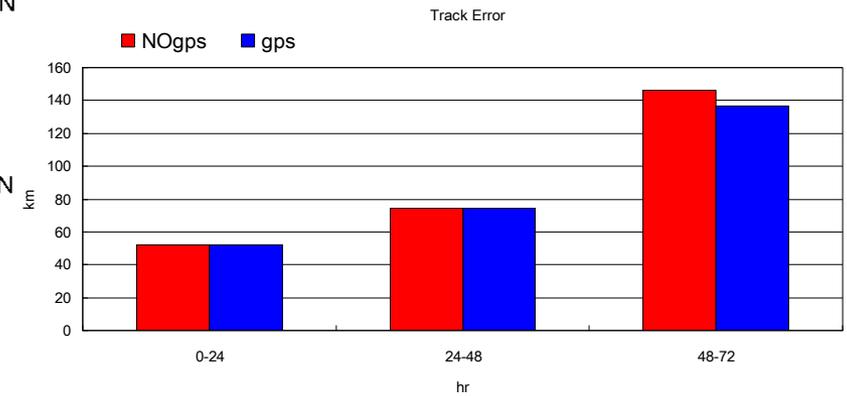
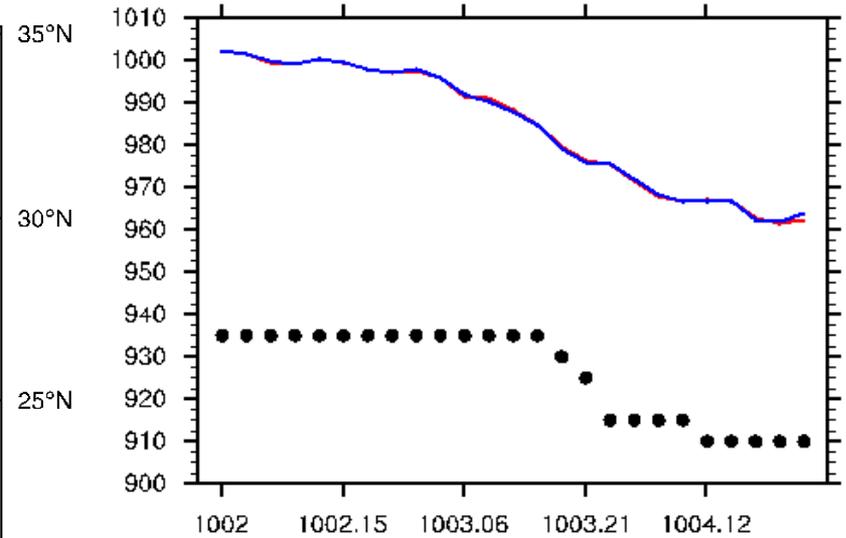
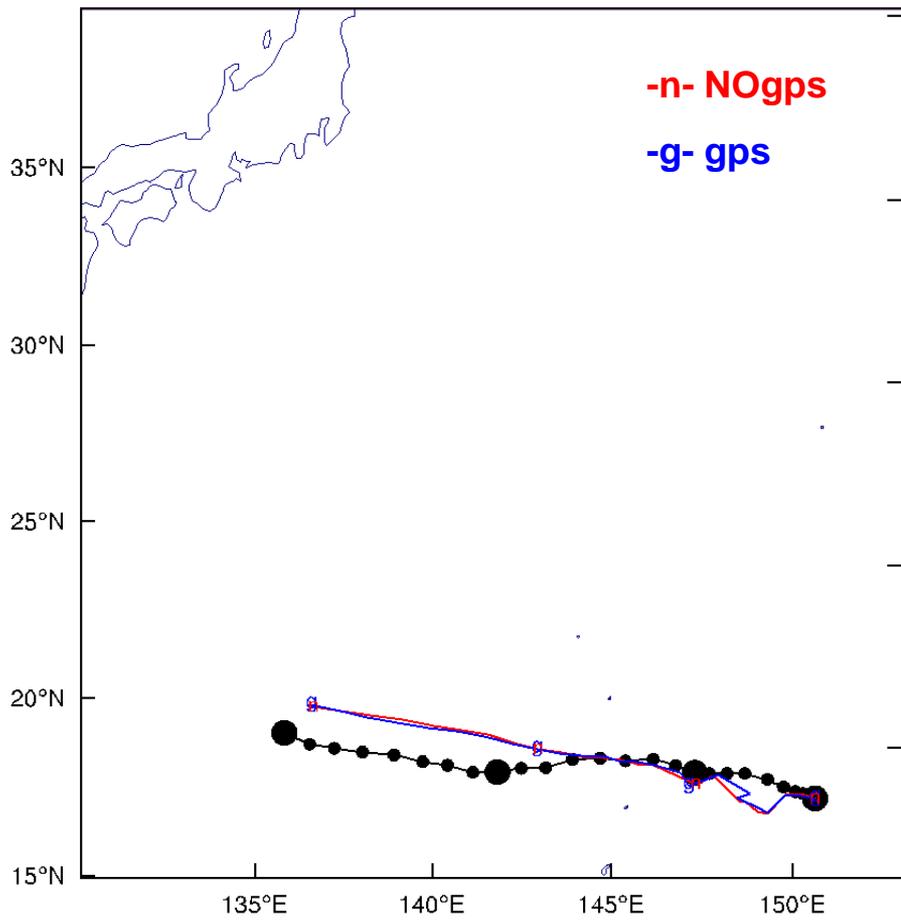
Parma typhoon

Initial time:2009-10-02-00:00

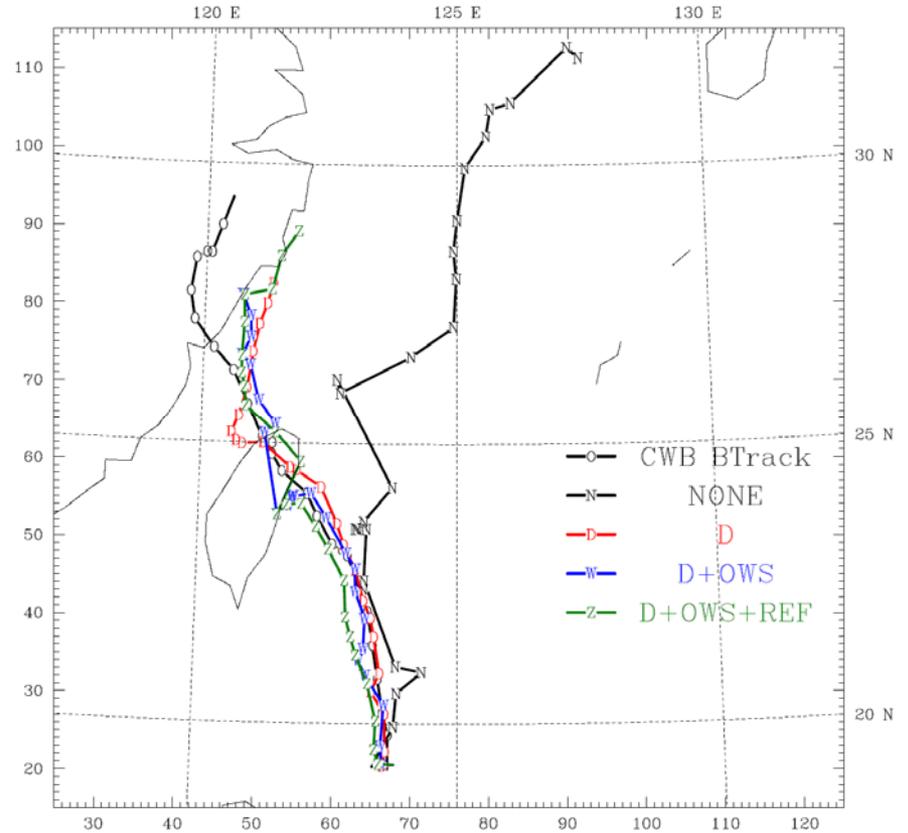
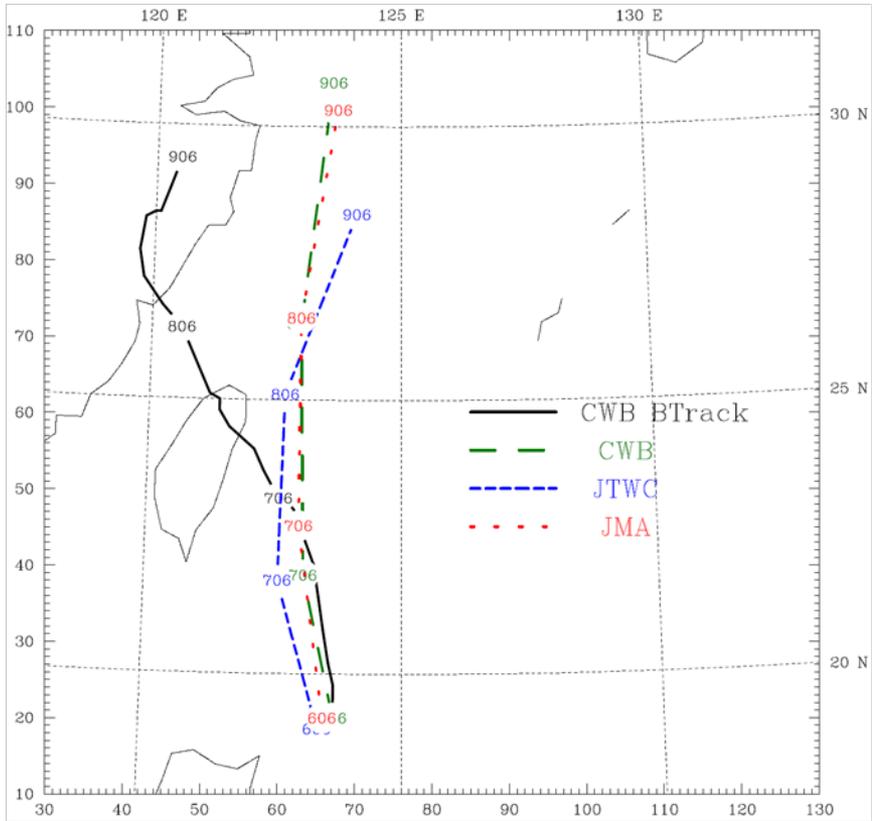


Melor typhoon

Initial time:2009-10-02-00:00



Typhoon Kalmaegi (2008)



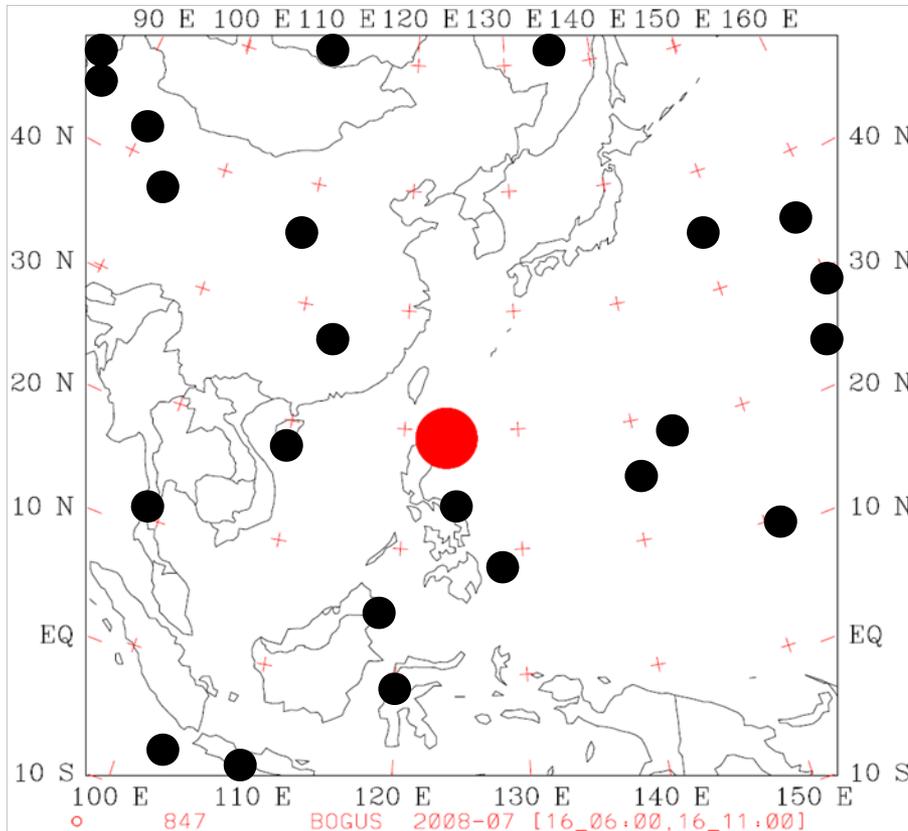
2008/07/16 06Z-07/19 06Z

MM5 V3.7.4 (45-km, 15-km, 5-km)

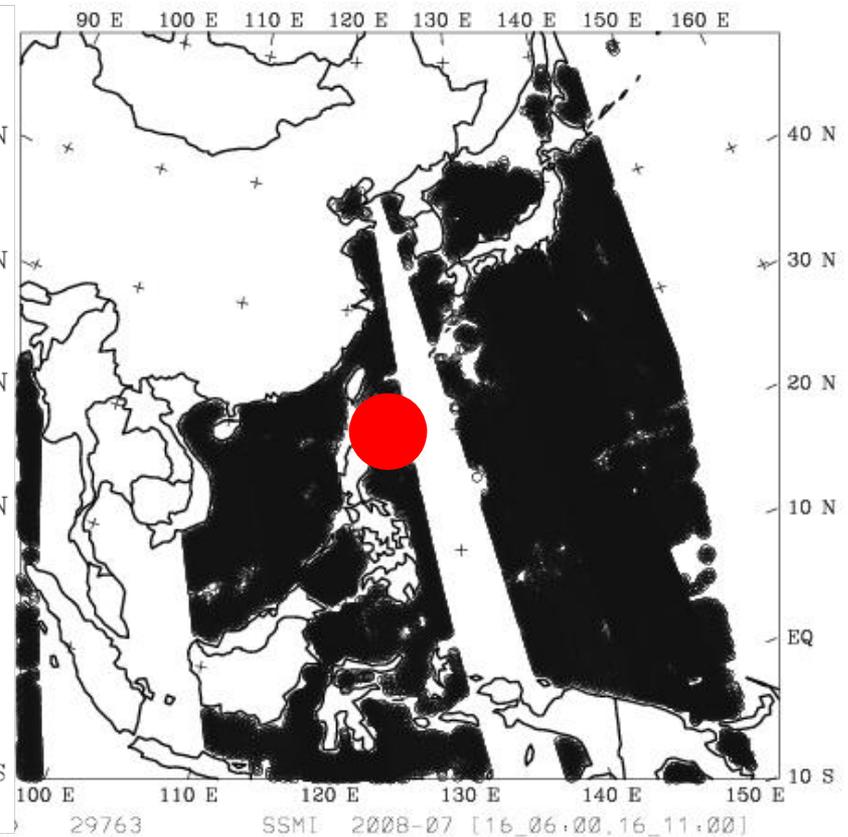
MM5 4DVAR V3 (BDA in domain-01)

Physics: Simple ice, Grell Cumulus scheme, MRF PBL

COSMIC REF and Bogus



SSM/I OWS and Bogus

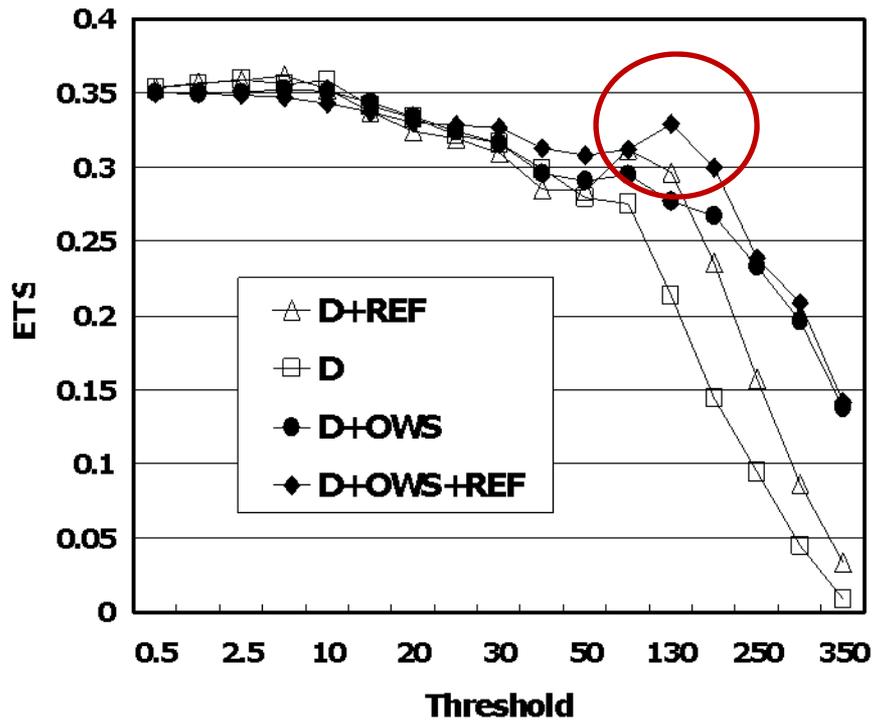


Experiment Framework

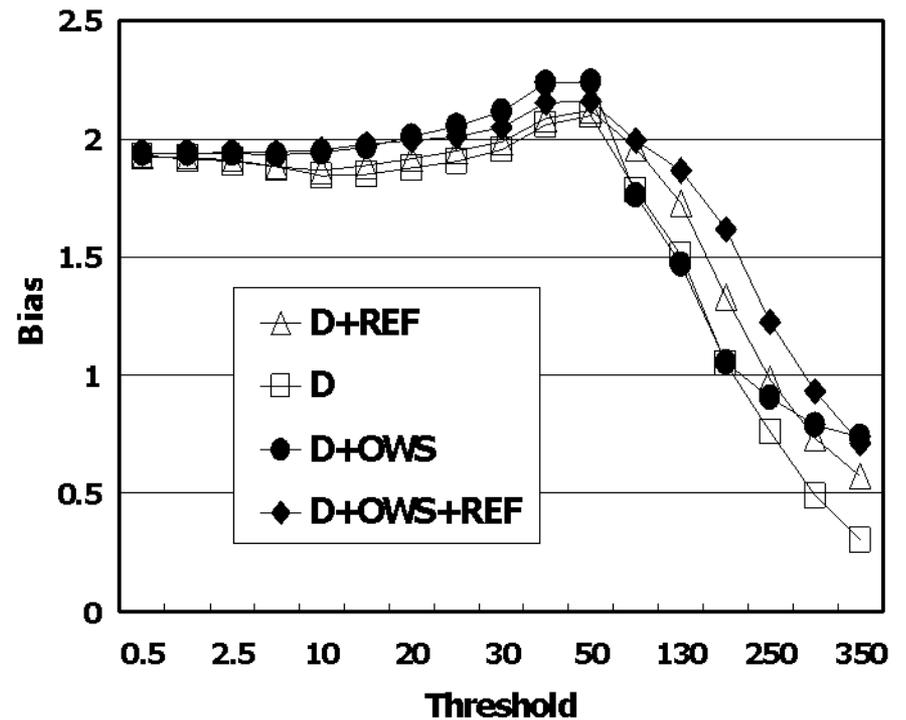
Experiment (3 days Mean Track Error)	Num of obs	Time(HR)	Mean Track Error		
			24	48	72
NONE (292)	-	-	56	245	606
D (136)	847	0-0.5	105	110	209
D+IWV (198)	11139,10426, 4457,5270	1,2,3,4	80	173	362
D+OWS (147)	9982,9774, 4153,5954	1,2,3,4	93	154	210
D+REF (113)	6,2,7,4,4	0,1,2,3,4	97	73	181
D+REF+OWS (99)			91	85	132

Threat Score

Kalmaegi 2008/07/1706-07/1806 UTC

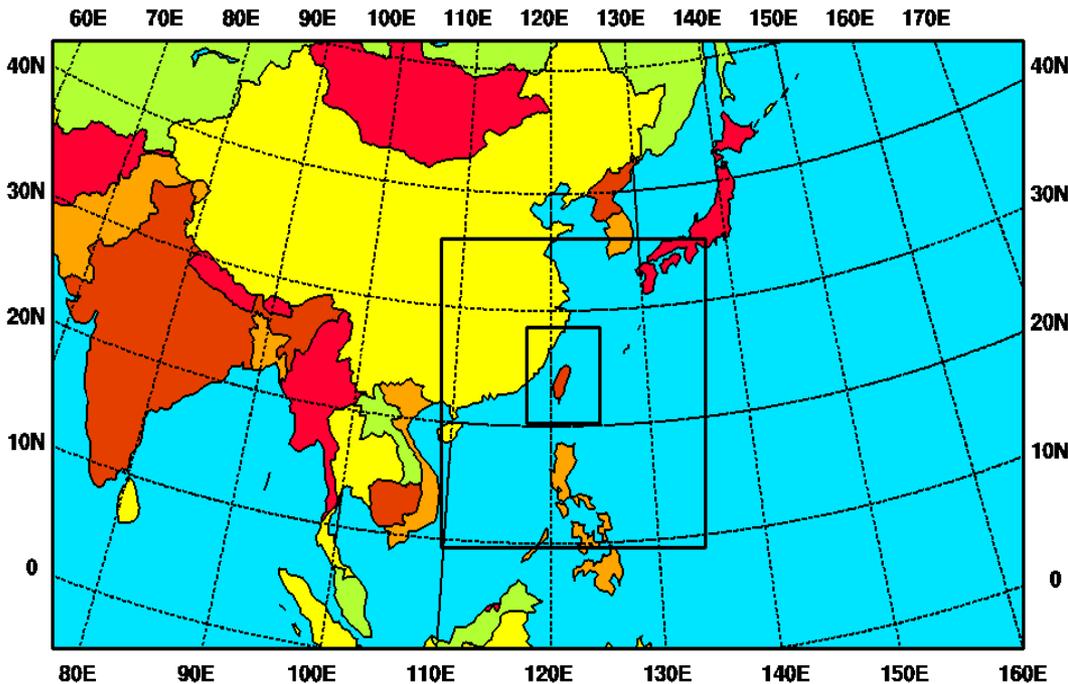


Kalmaegi 2008/07/1706-07/1806 UTC



RO data application in CWB-WRF

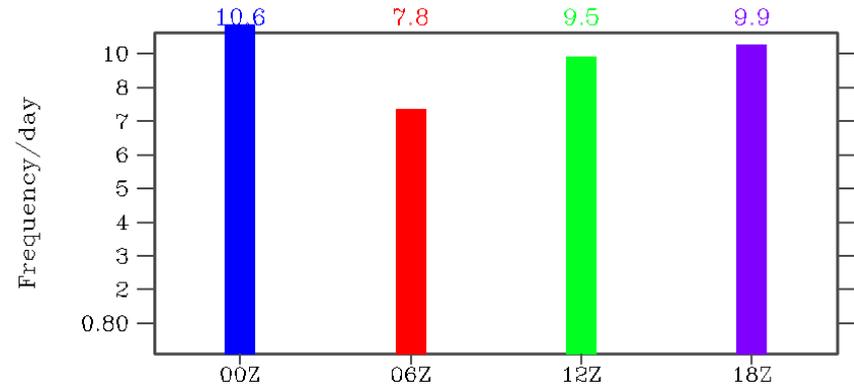
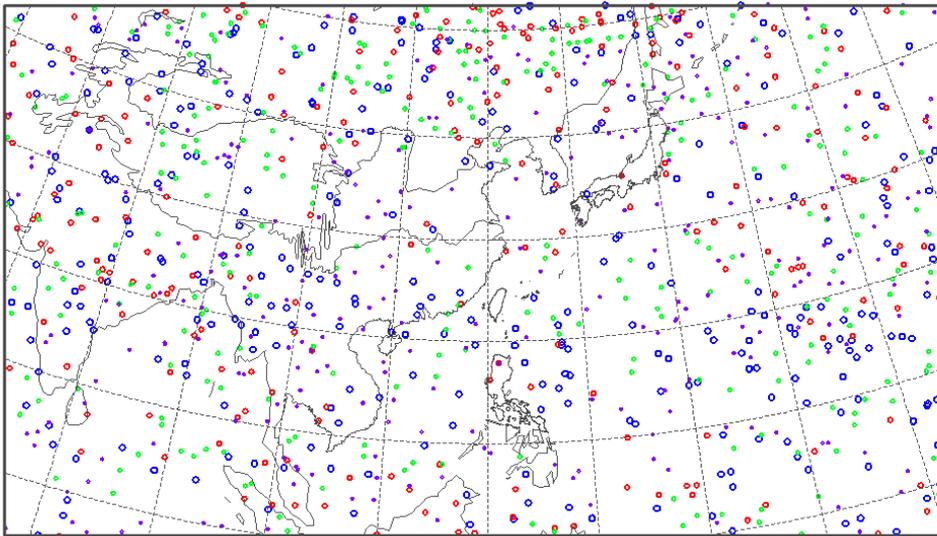
Domain of CWB WRF



- WRF-ARW with WRF-Var
- 3 nested domain of 45/15/5 km
- Use WRF-Var inner RO data assimilating technique
 - Assimilate local refractivity

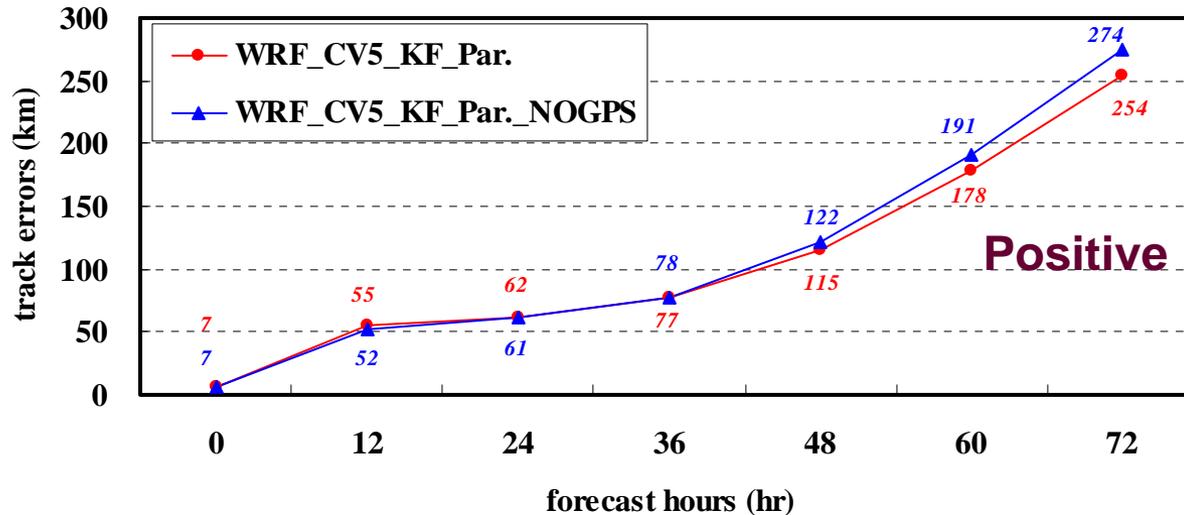
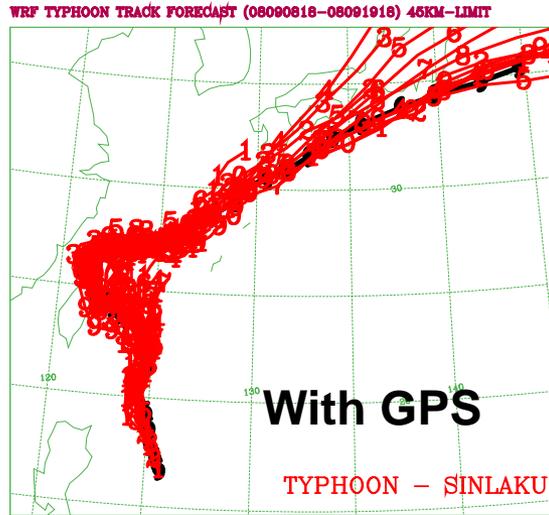
COSMIC RO Data used in CWB-WRF

GPSREF REF(N) QC-after EXP=WRFM01
TIME=100601-100630, Station AREA=WAO1



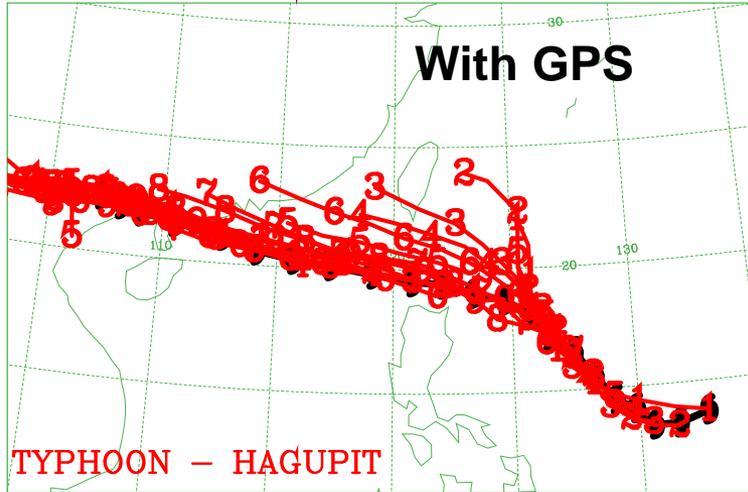
Typhoon Sinlaku (2008)

CWB

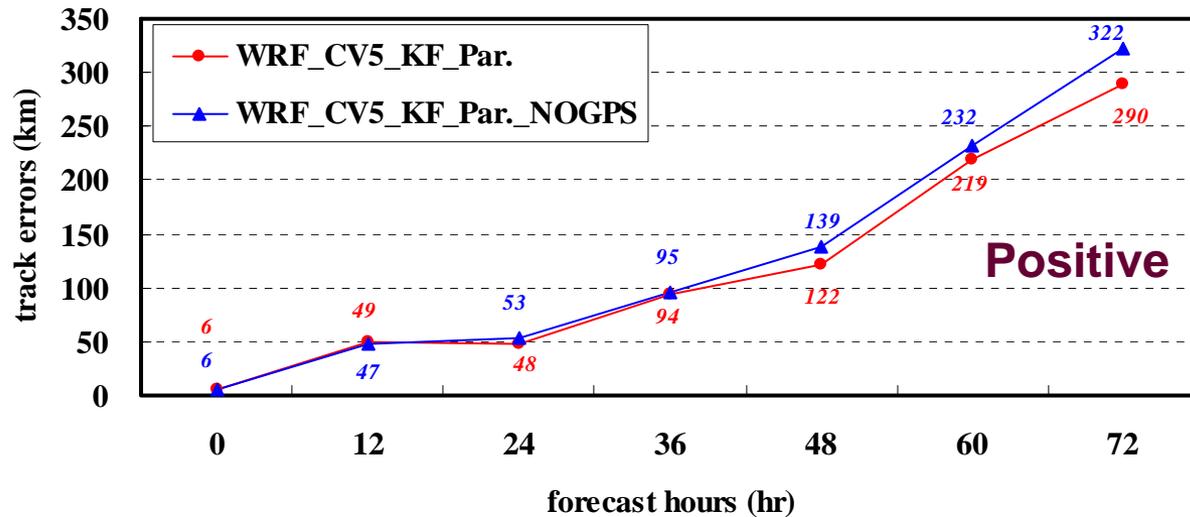
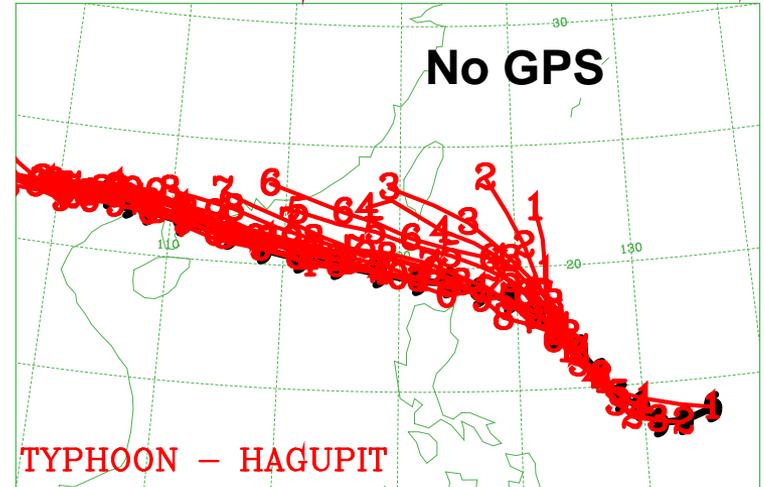


Typhoon Hagupit (2008)

WRF TYPHOON TRACK FORECAST (08091912-08092406) 45KM-LIMIT

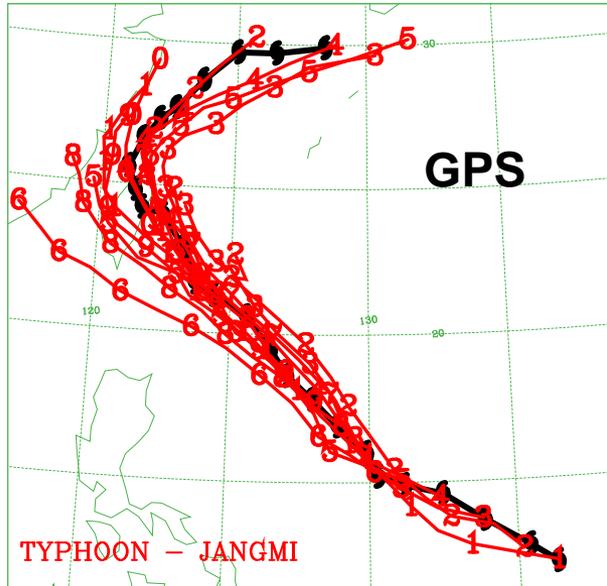


WRF TYPHOON TRACK FORECAST (08091912-08092406) 45KM-LIMIT-NOGPS

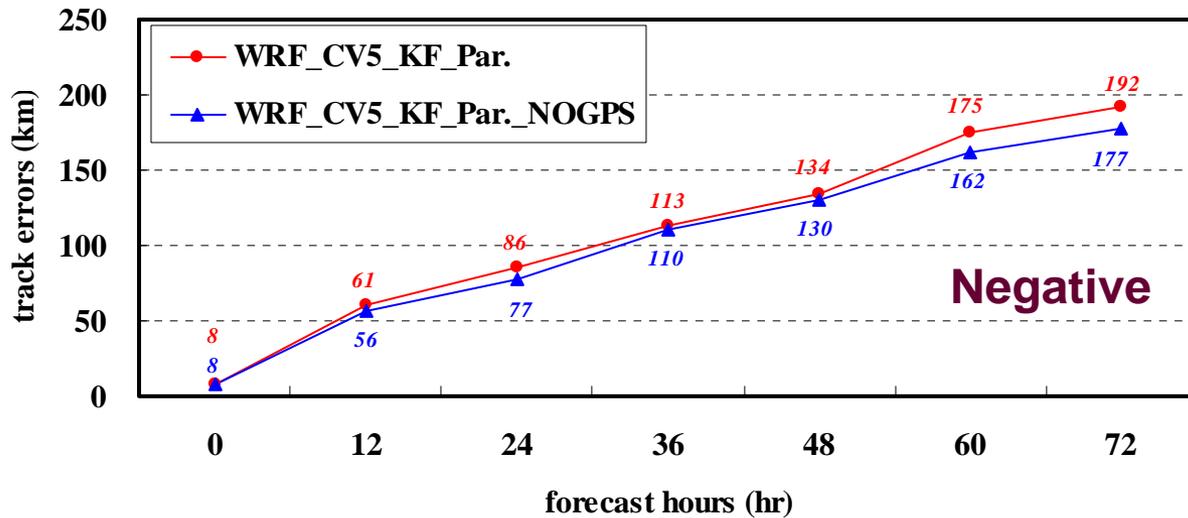
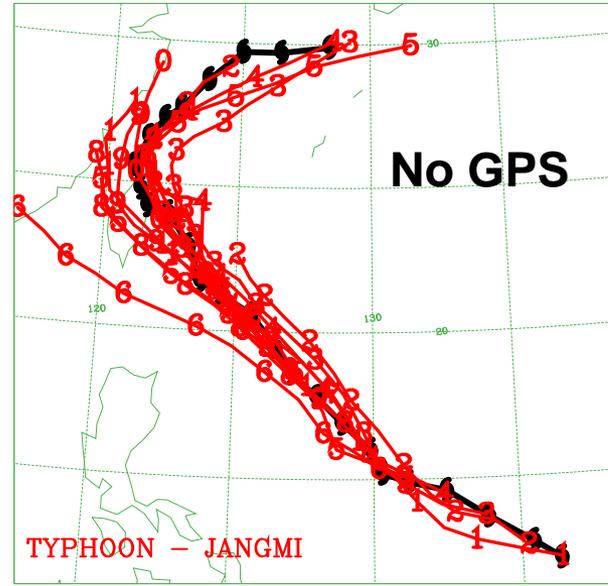


Typhoon Jangmi (2008)

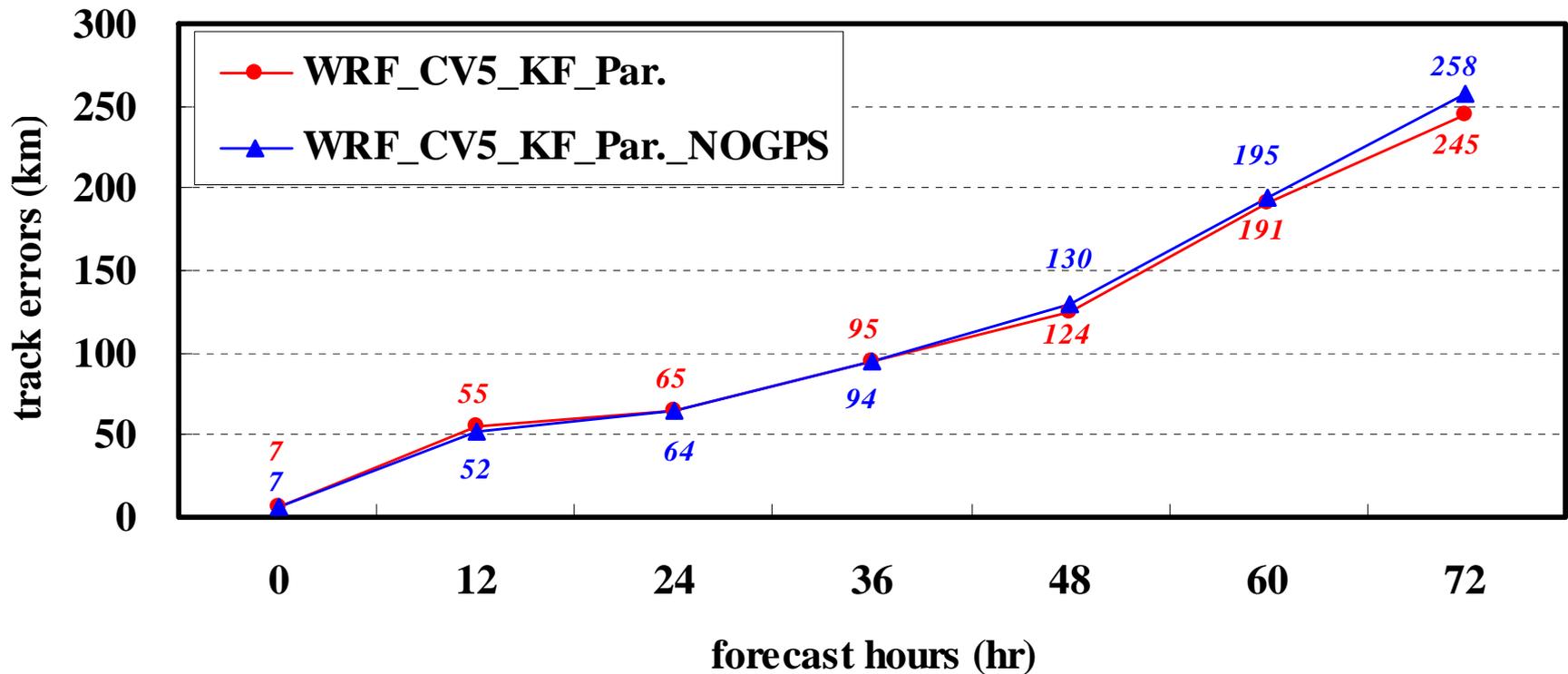
WRF TYPHOON TRACK FORECAST (08092412-08092800) 45KM LIMIT



WRF TYPHOON TRACK FORECAST (08092412-08092800) 45KM-LIMIT-NOGPS

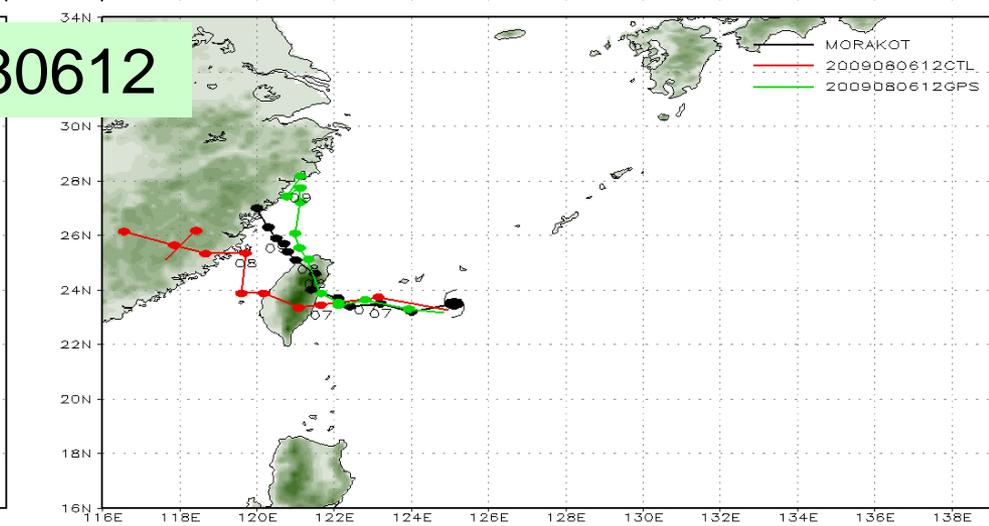
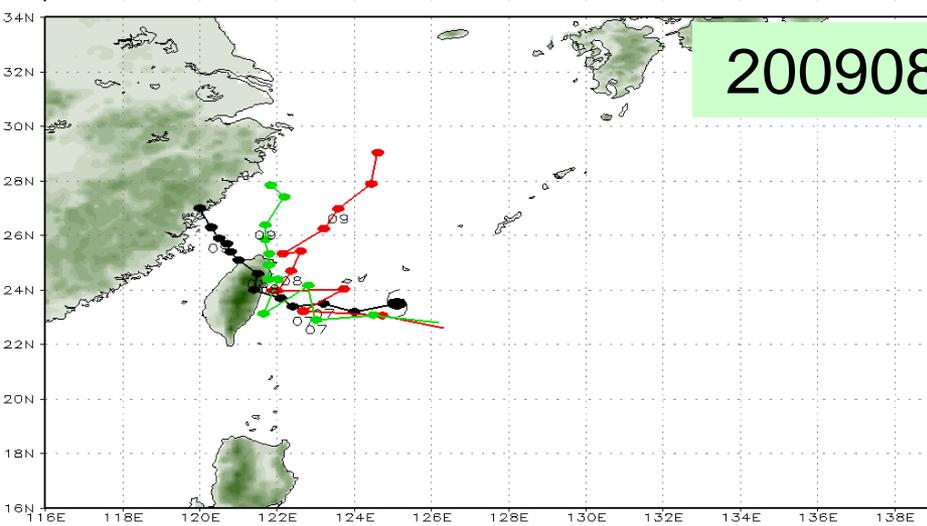
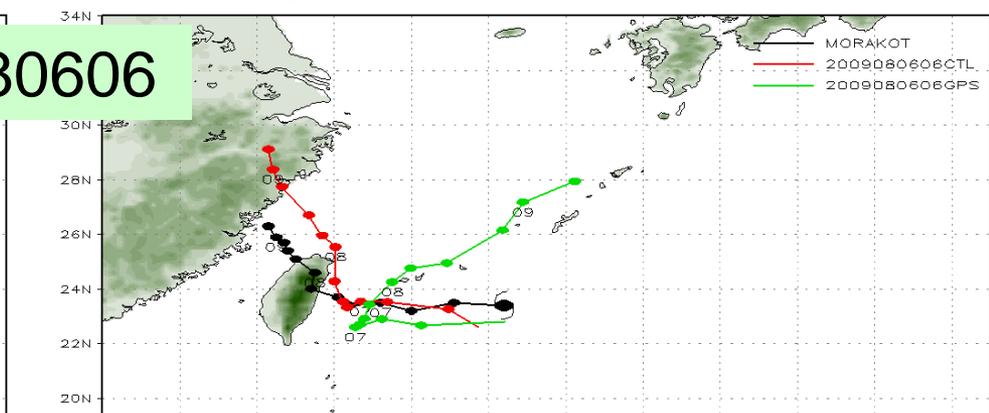
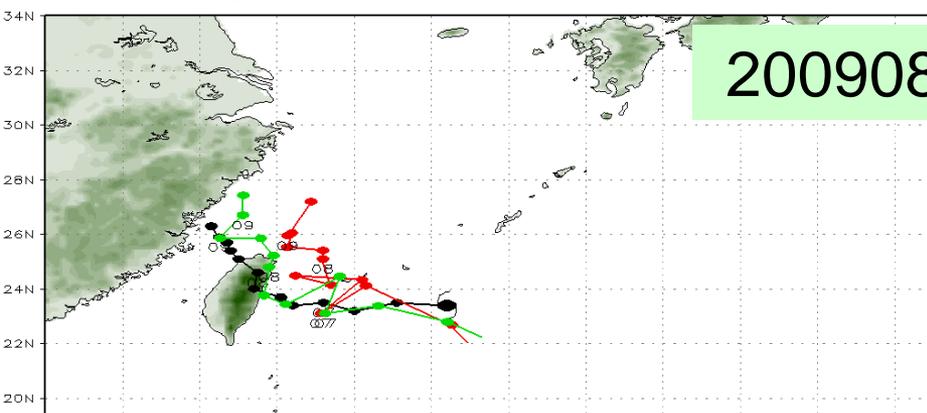
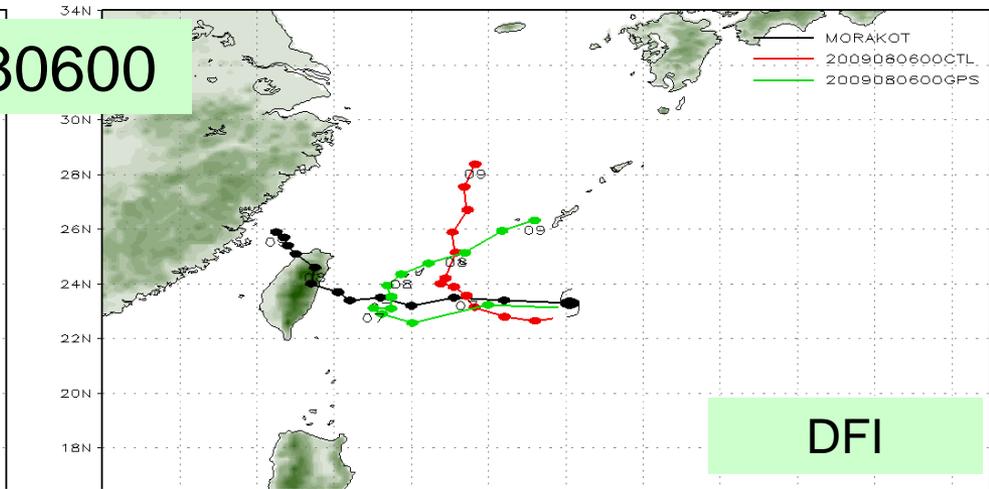
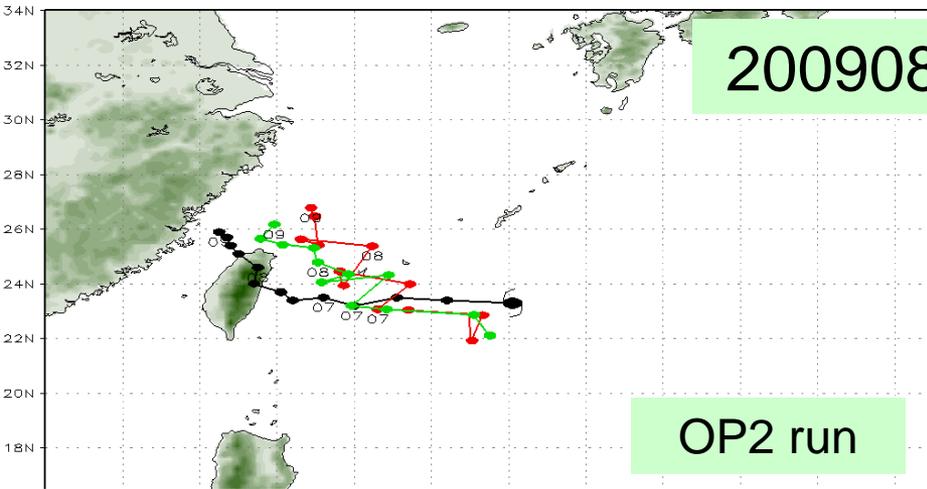


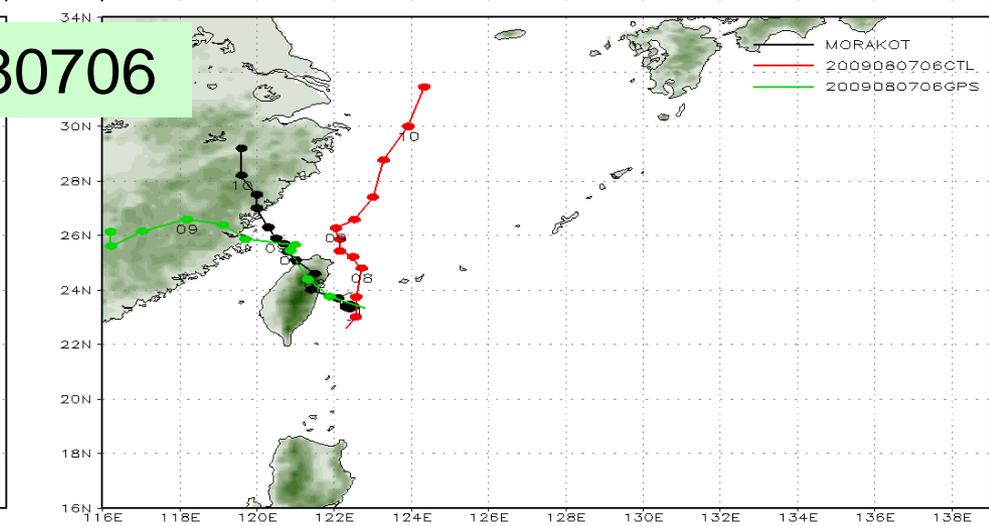
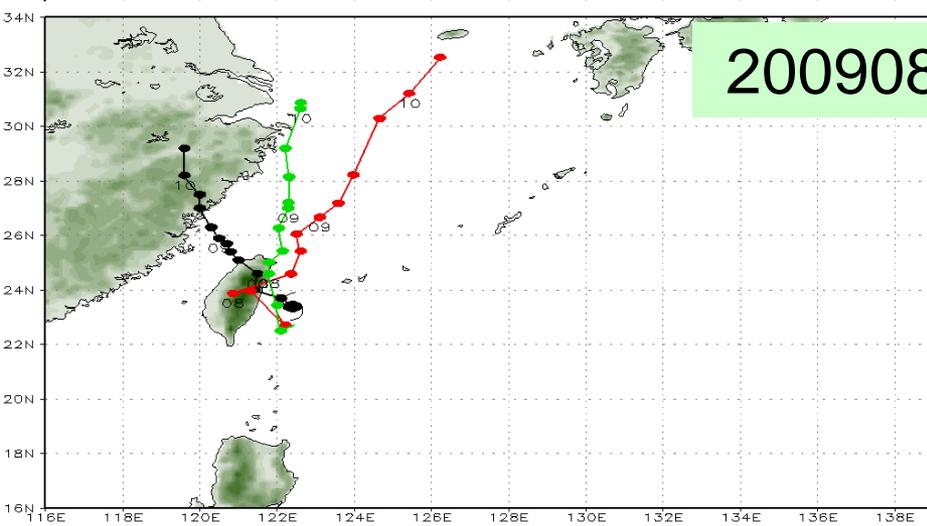
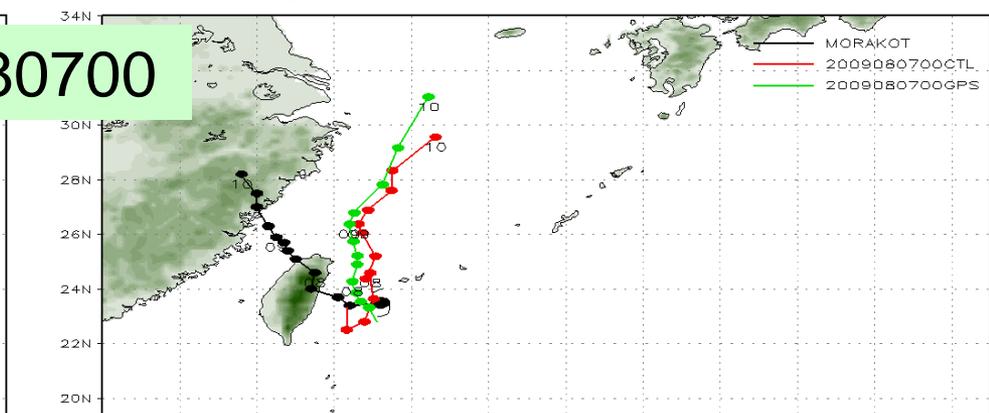
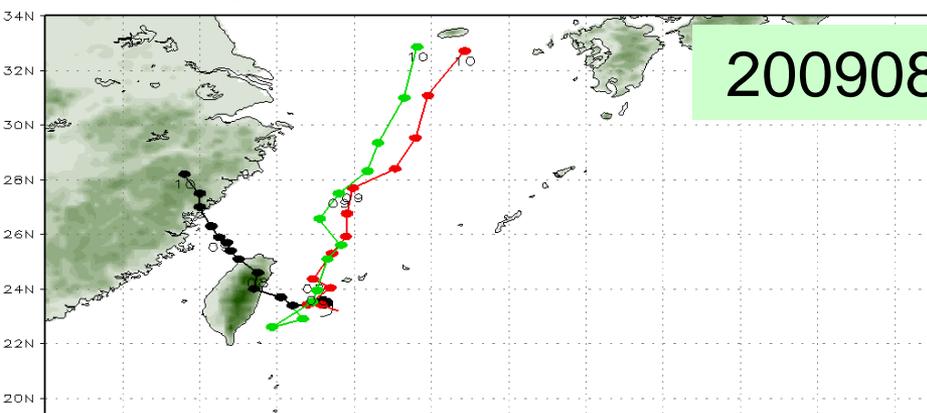
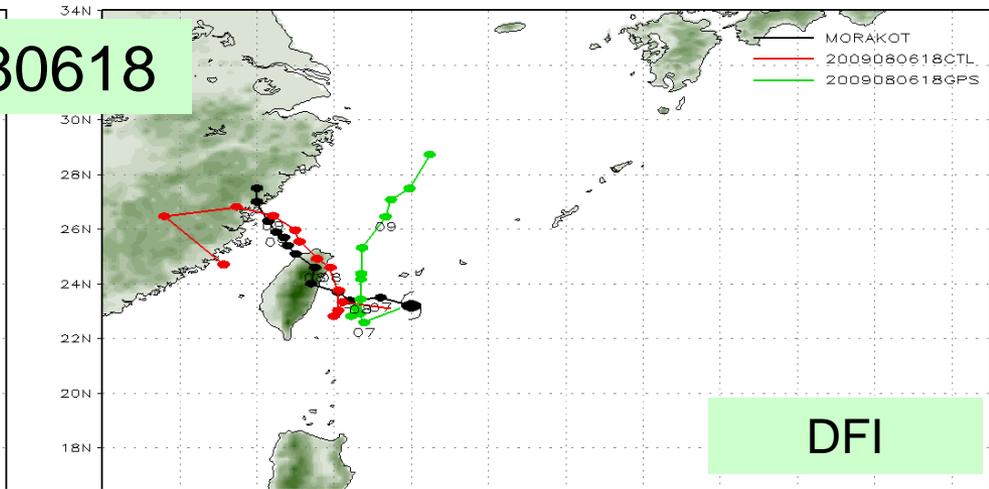
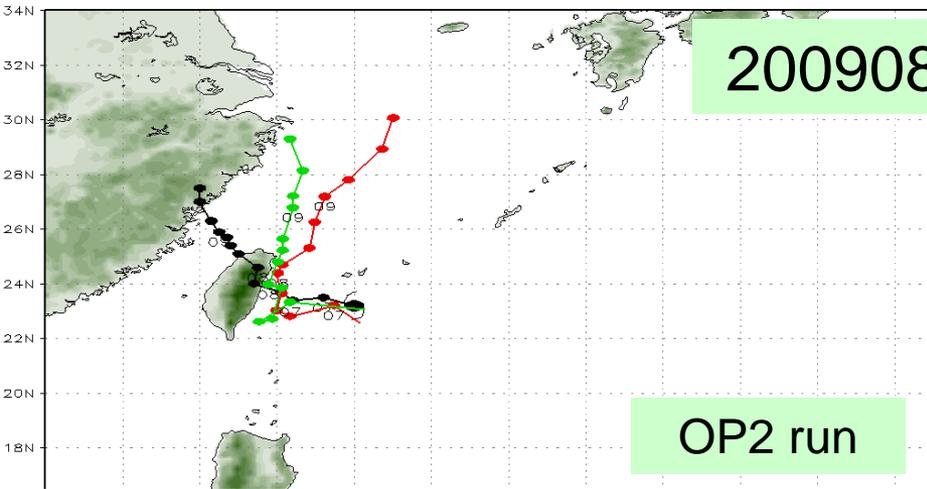
Track Forecast Errors for Sinlaku, Hagupit & Jangmi



Simulation Setup for Morakot

- OP2 run
 - NOGPS
 - GPS
- Relocation+BOGUS_v13+DFI
 - NOGPS
 - GPS
- Run Time : 2009080300~2009080918
- Comparison : 2009080318~2009080918



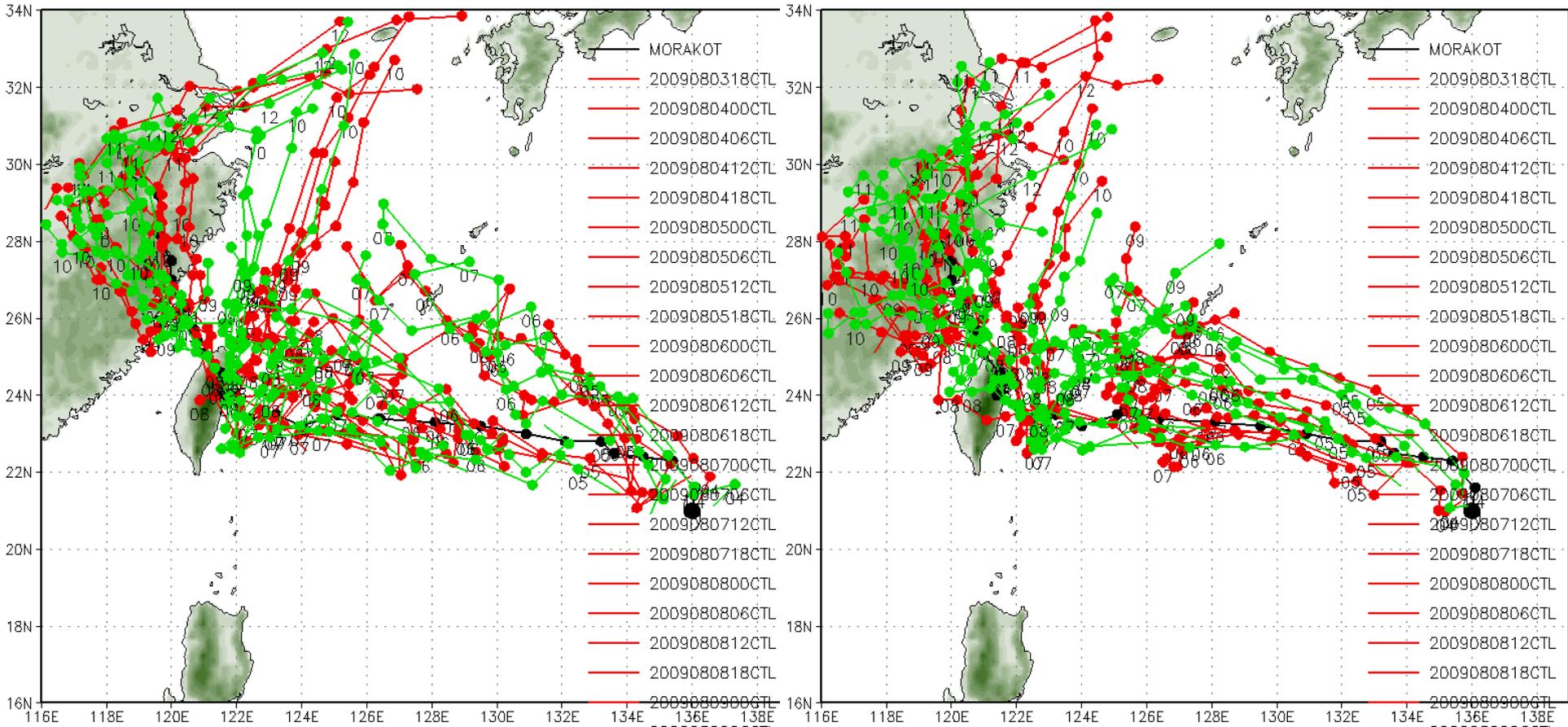


Evaluating the impact of COSMIC GPS RO data on the prediction of Typhoon Morakot, using the CWB 45-km operational WRF system (OP2) and the another system with digital filter, from 080318 – 080918 (a week long period).

Red: No GPS, Green: With GPS

OP2 run

DFI



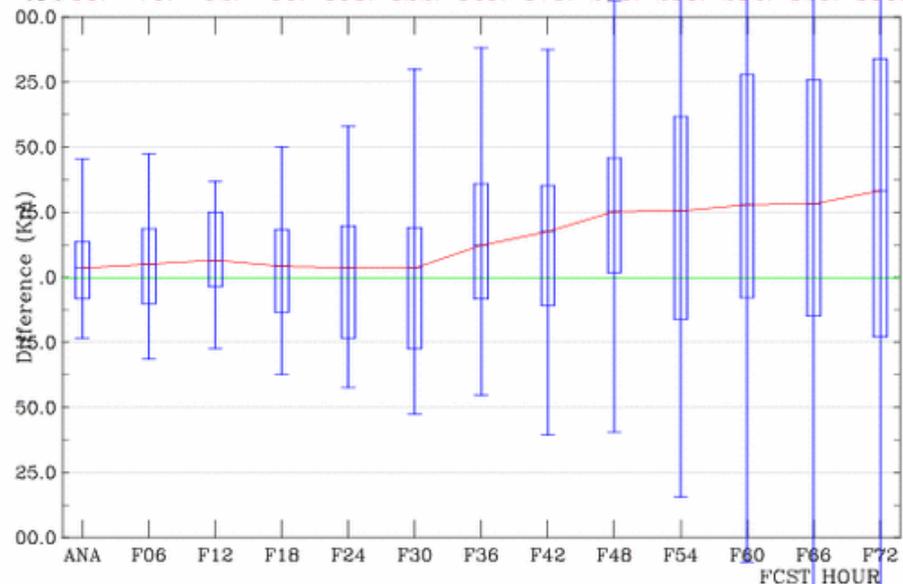
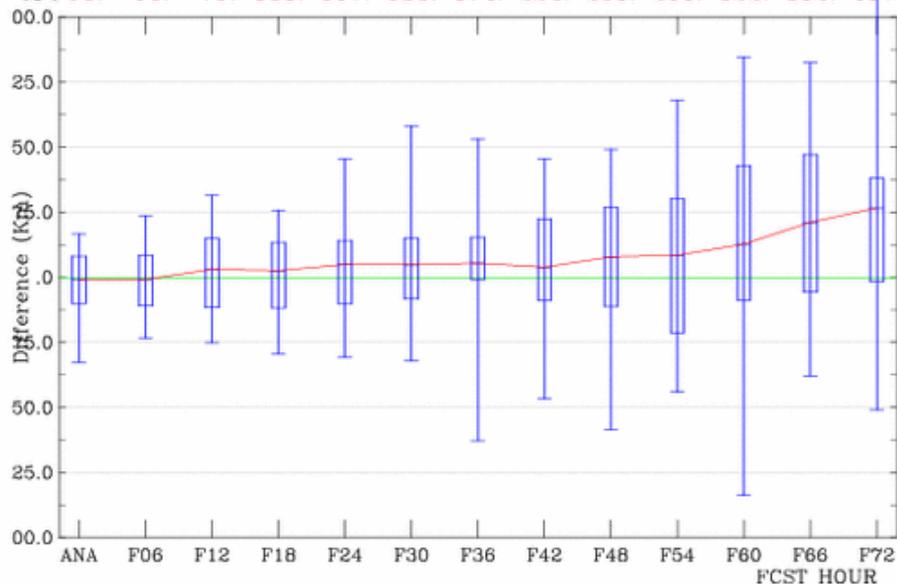
GPS RO is shown to have an impact on typhoon track prediction, particularly, after 36-h. The impact is even more robust with the use of digital filter initialization.

OP2 run

DFI

FCST HOUR	25	25	25	25	24	23	22	21	20	19	18	17	16
mean error (km)	90.	89.	88.	118.	121.	148.	190.	236.	278.	321.	360.	418.	487.
CTL	93.	91.	79.	111.	107.	133.	174.	224.	255.	296.	322.	354.	407.
GPS													

FCST HOUR	25	25	25	25	24	23	22	21	20	19	18	17	16
mean error (km)	67.	85.	112.	112.	114.	133.	186.	227.	278.	327.	367.	413.	460.
CTL	56.	70.	92.	99.	103.	122.	149.	175.	203.	250.	284.	329.	360.
GPS													



MORAKOT 2009080318~081012

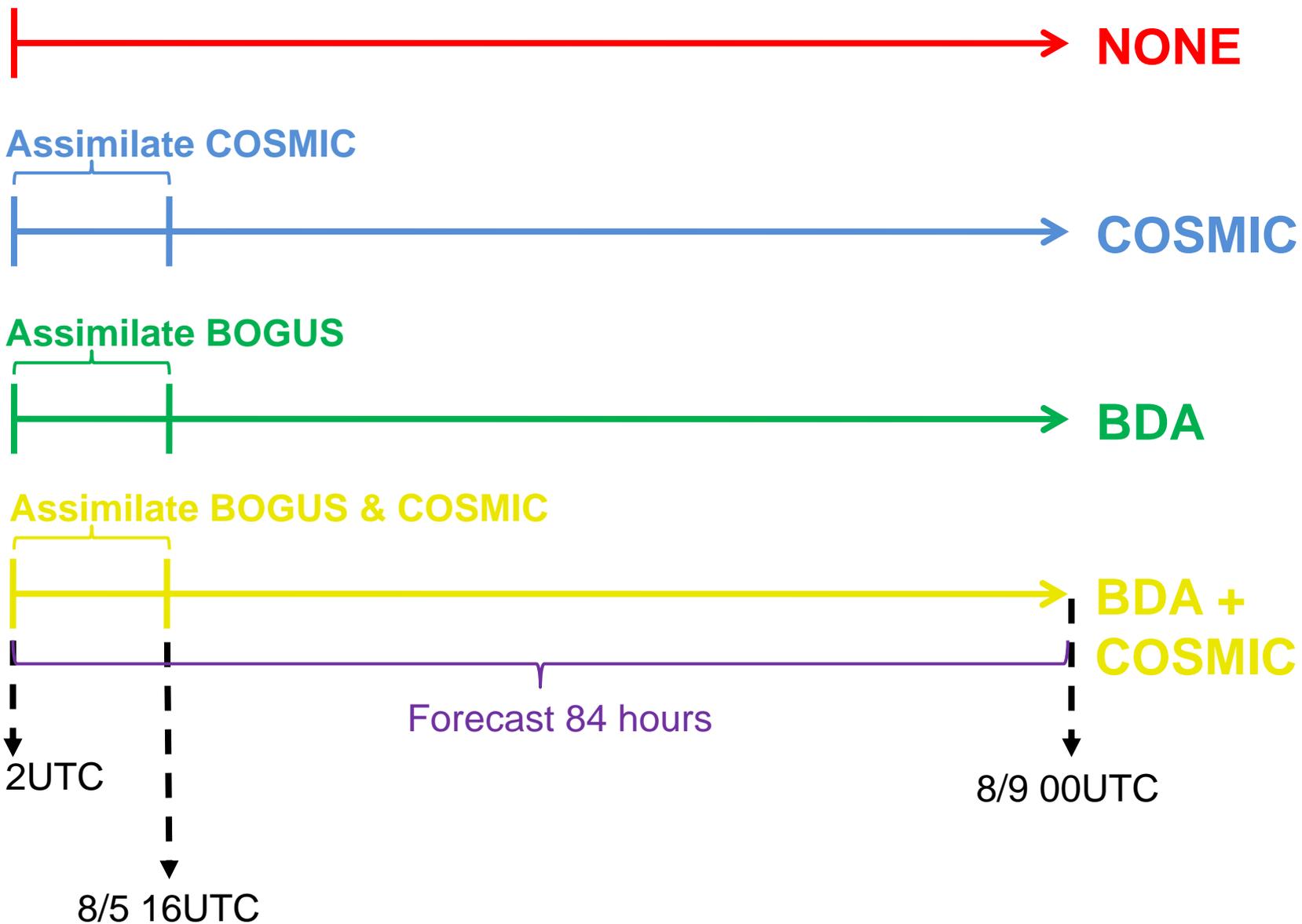
MORAKOT 2009080318~081012

diff=CTL-GPS

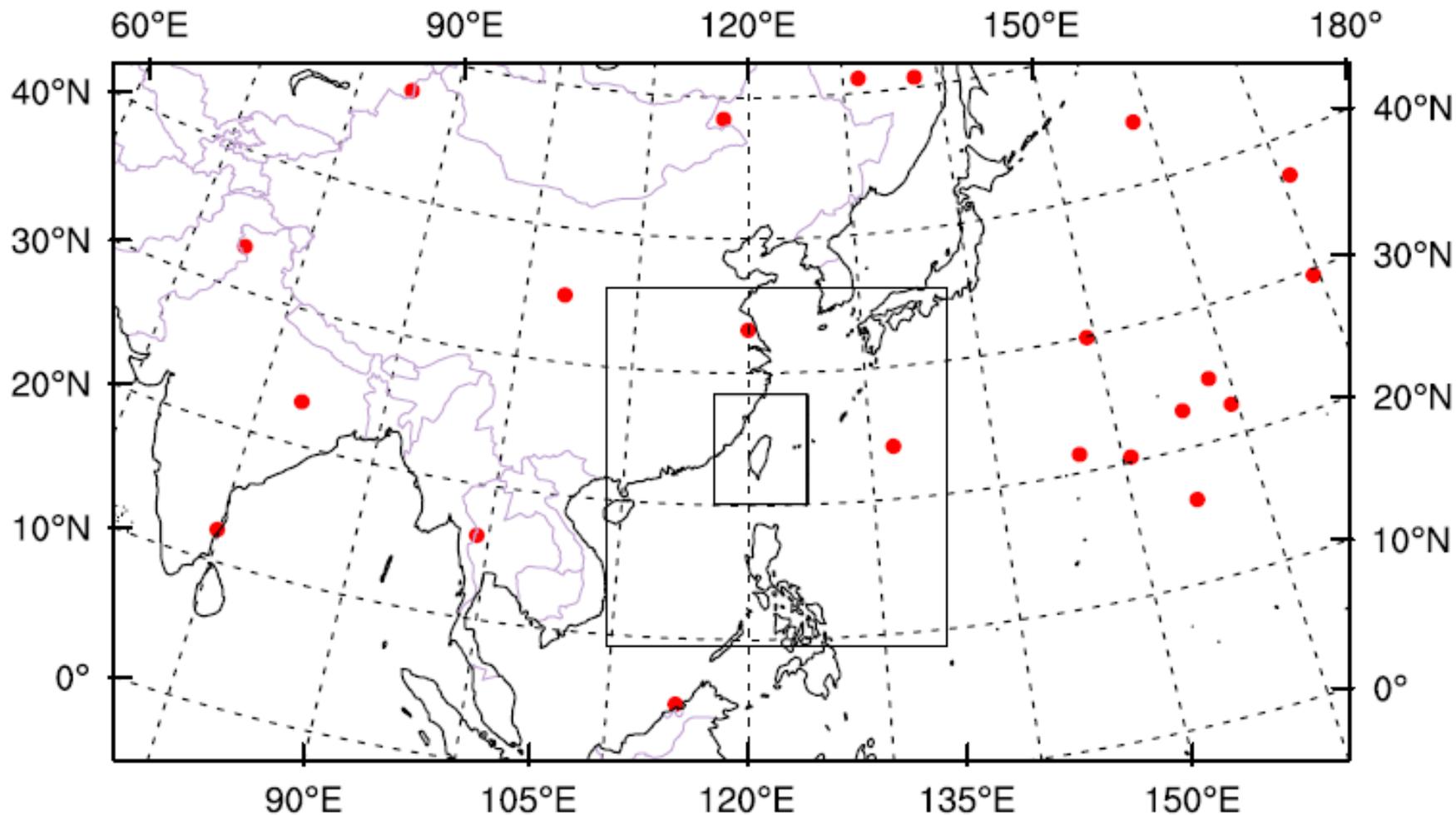
Positive means improvement from assimilating GPSRO



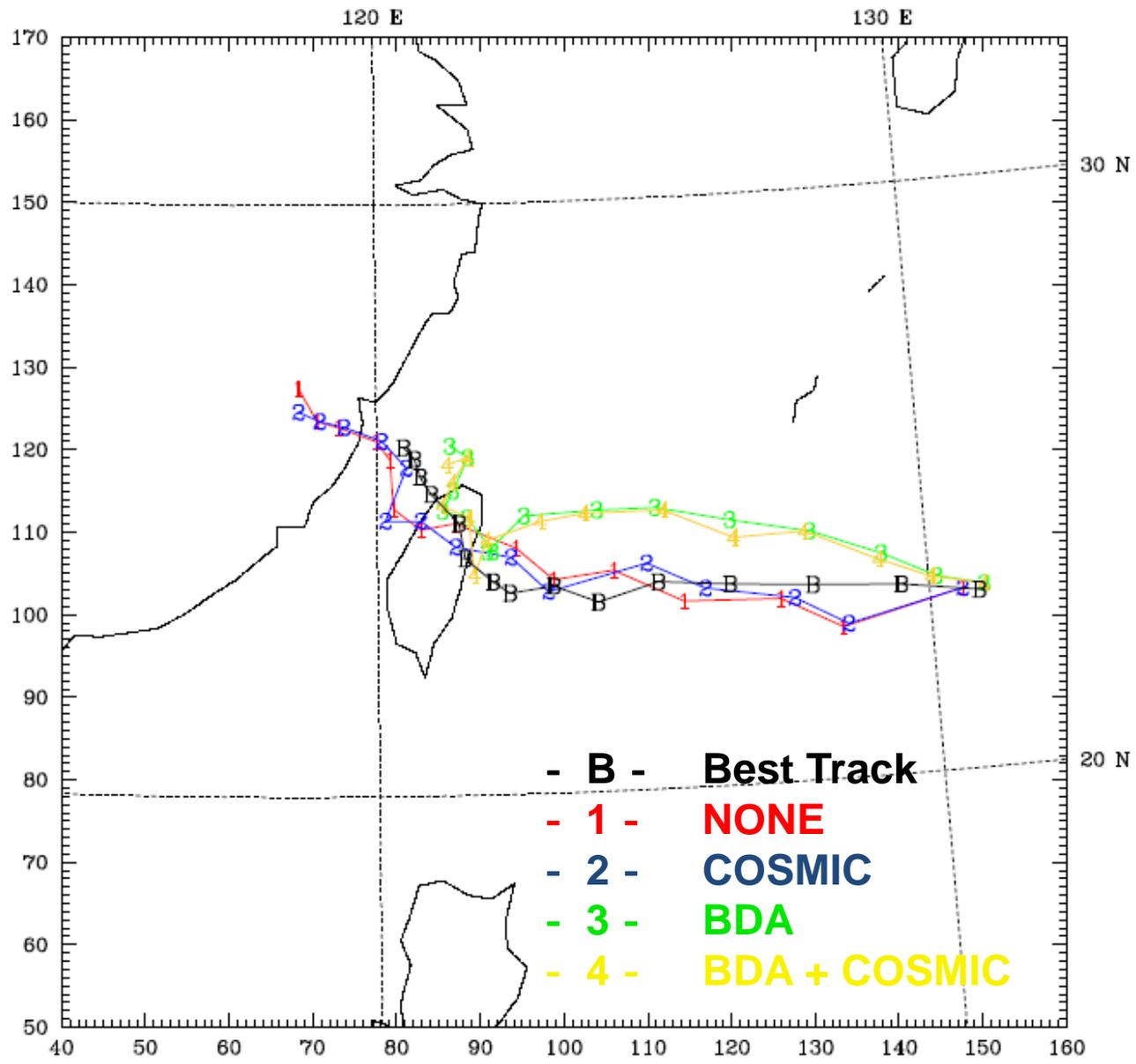
Assimilation design for Morakot

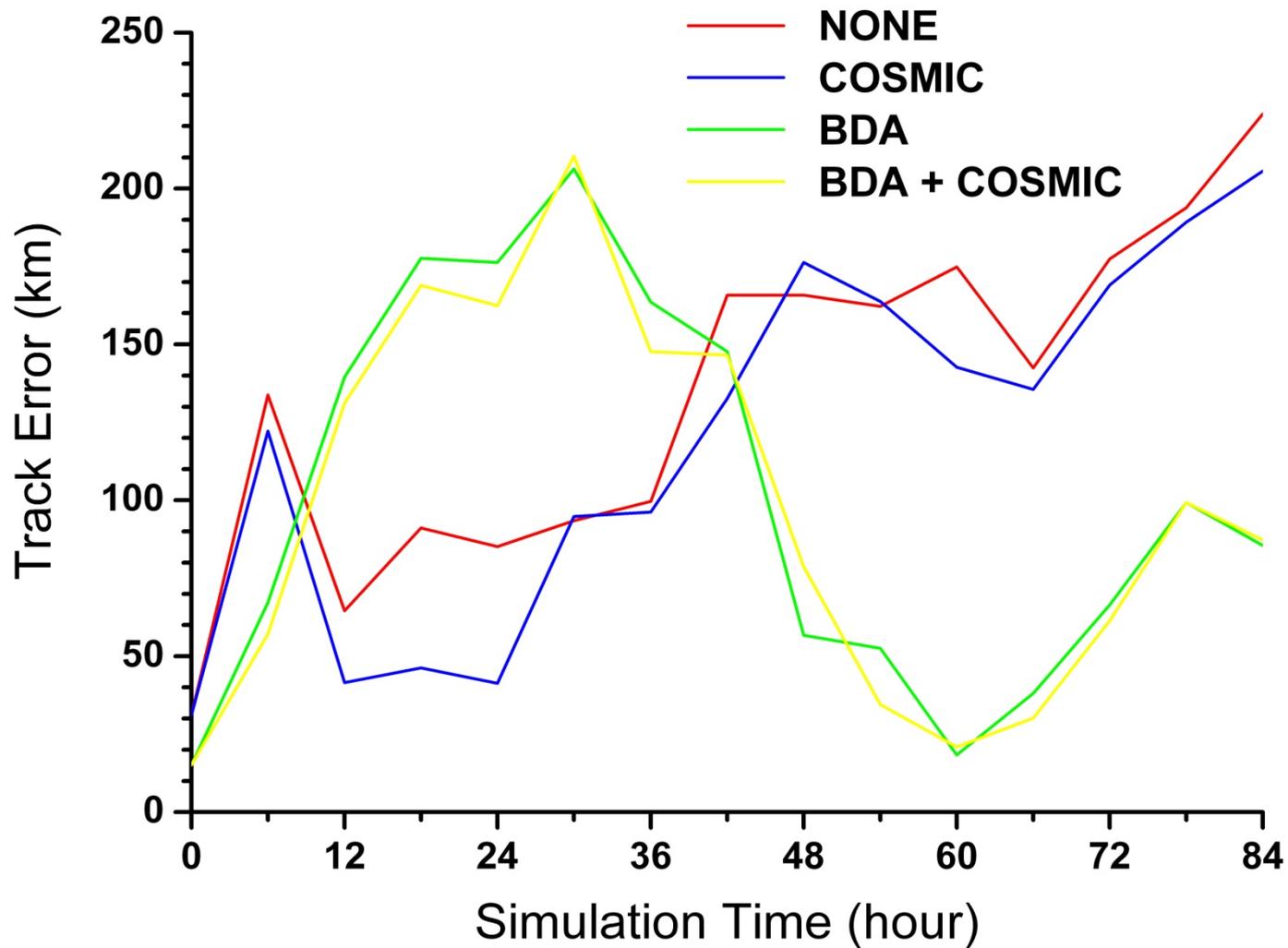


GPS RO 2009/08/05 12UTC - 2009/08/05 16UTC



	Domain 1	Domain 2	Domain 3
No. of Occultations	22	2	0



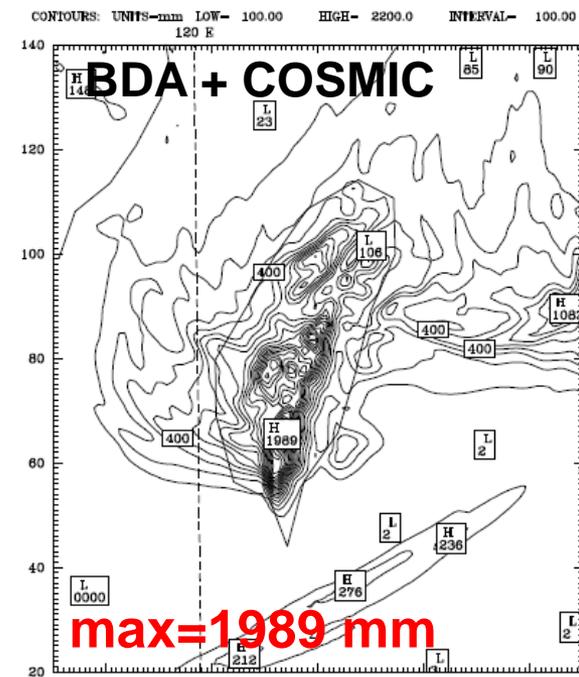
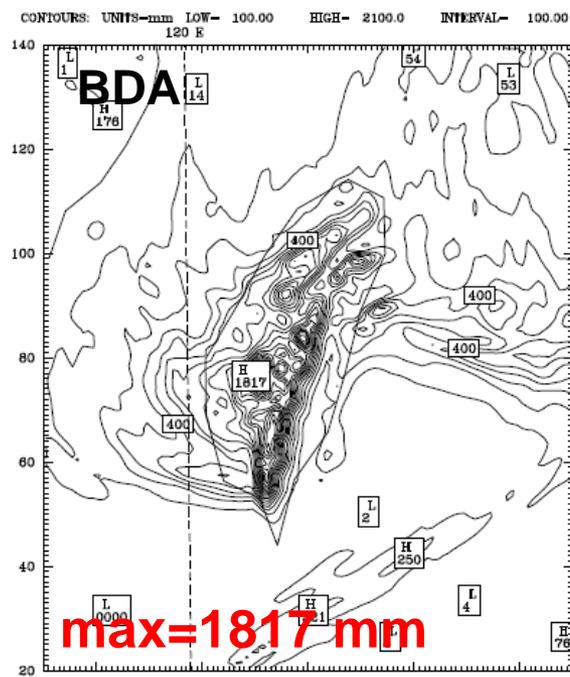
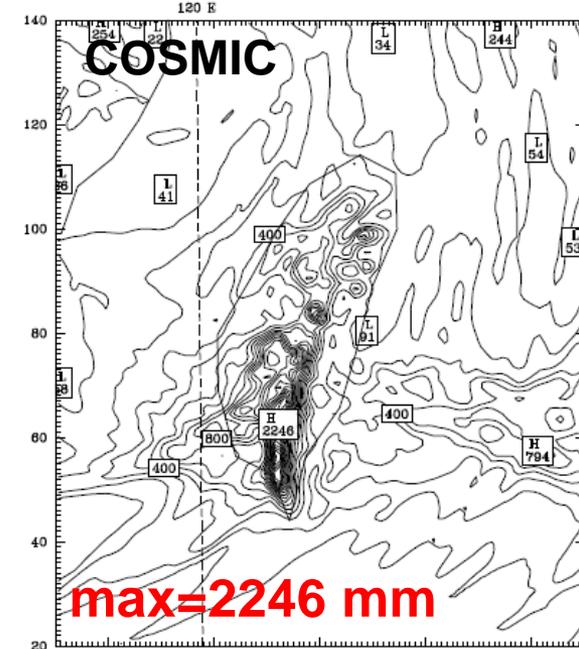
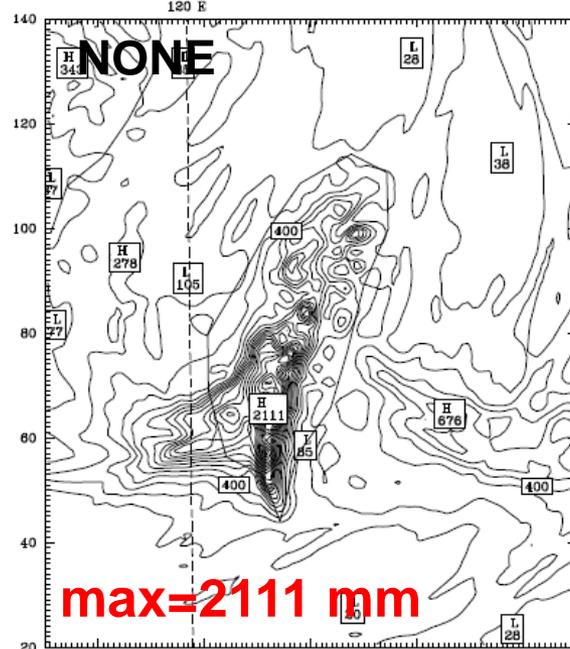
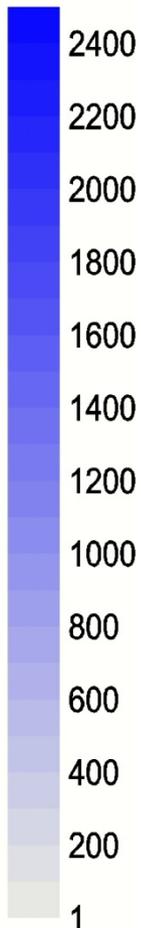
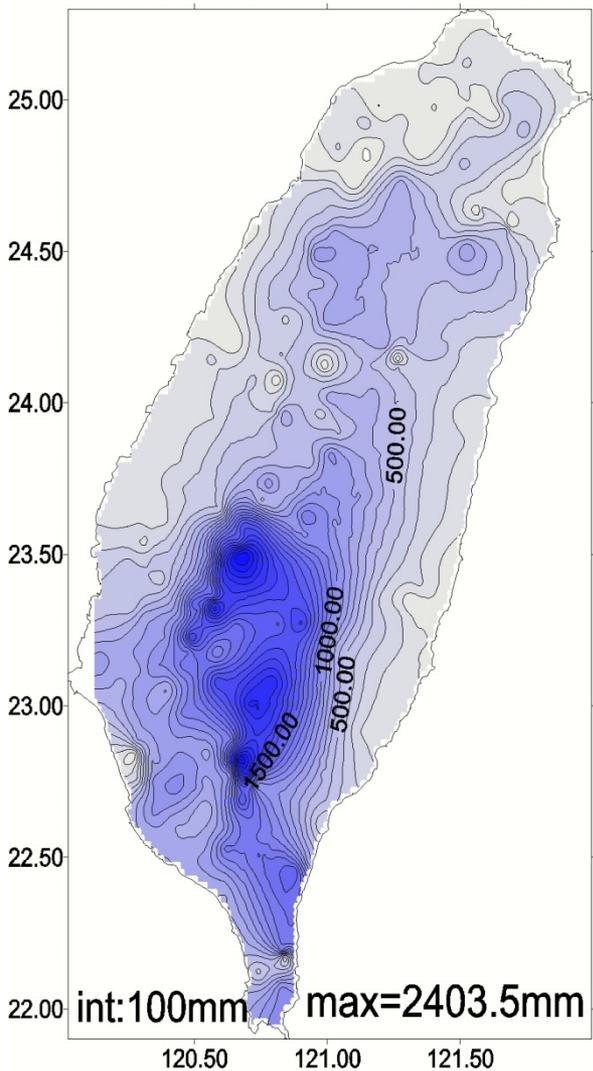


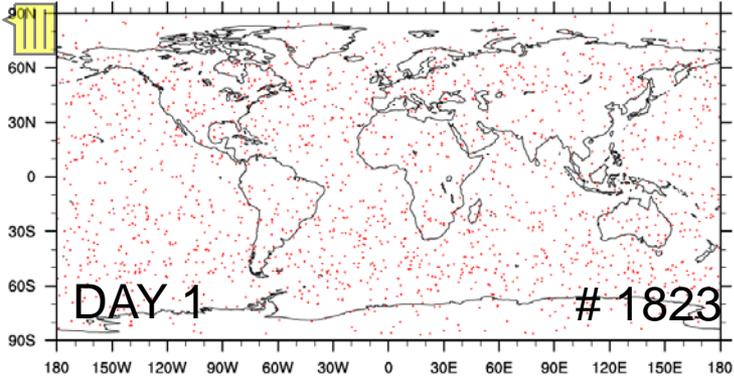
Experiment	NONE	COSMIC	BDA	BDA + COSMIC
Mean Track Error (km)	134	119	101	97



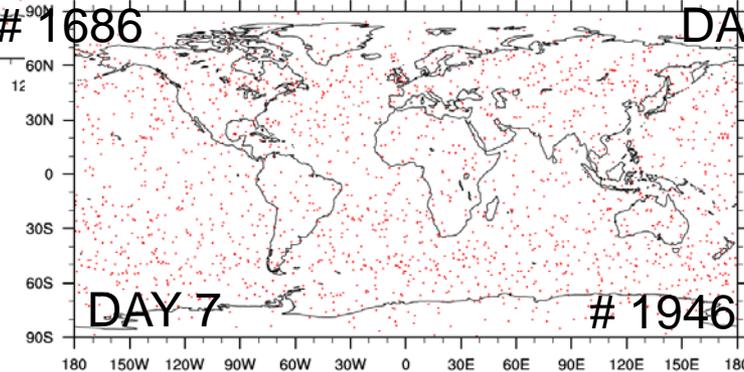
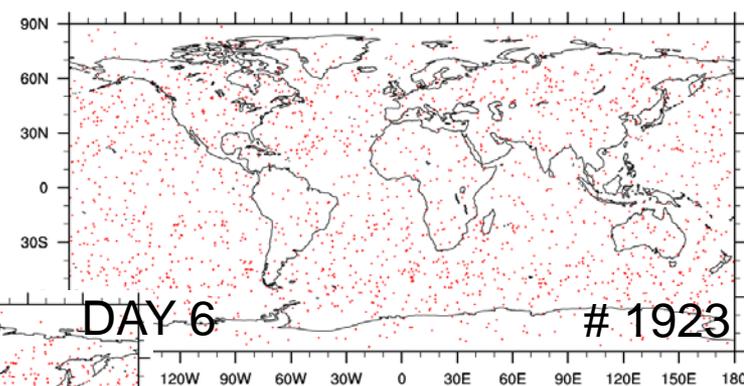
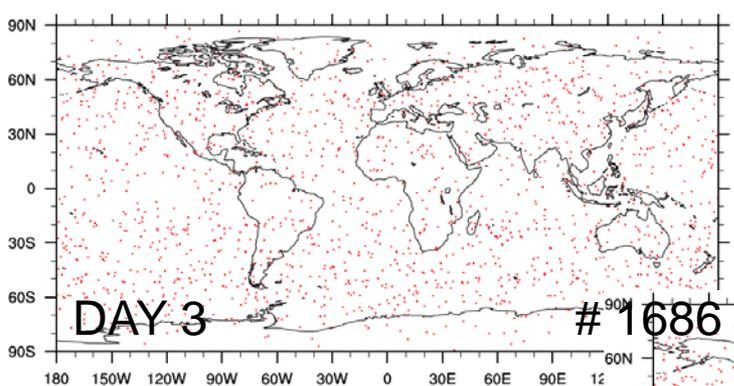
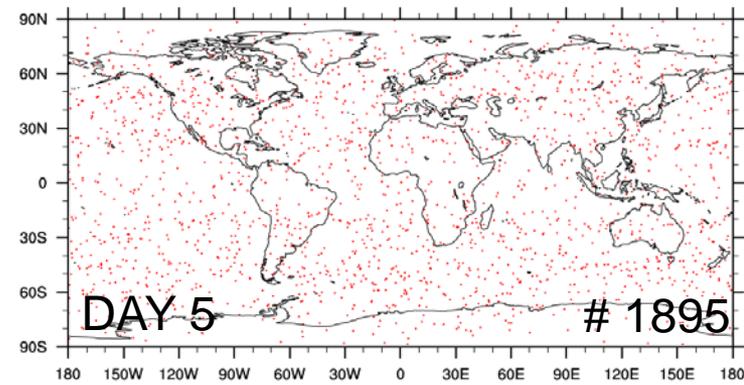
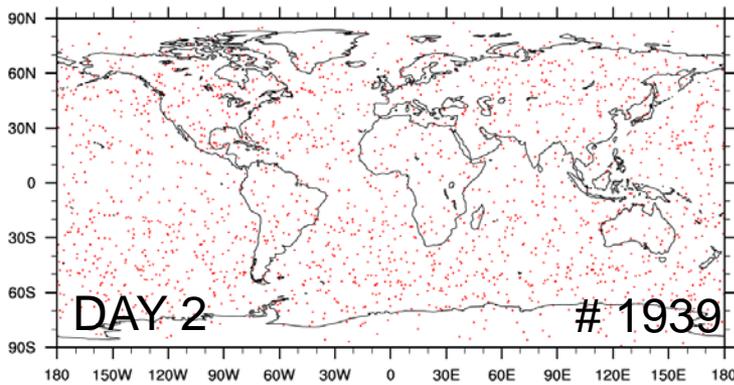
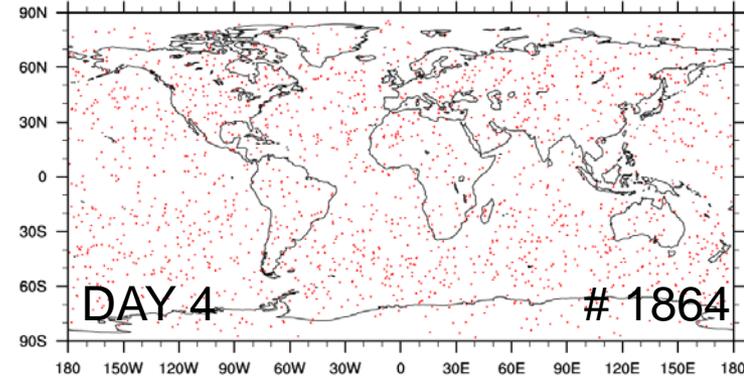
Morakot rainfall

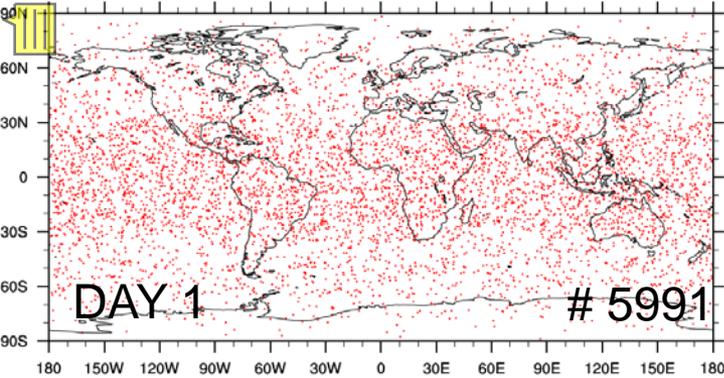
8/6 0000UTC - 8/9 0000UTC





COSMIC (8/5 ~ 8/11)



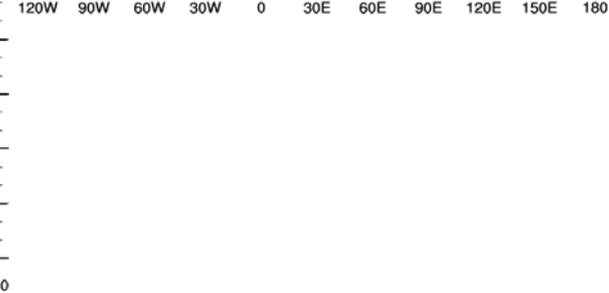
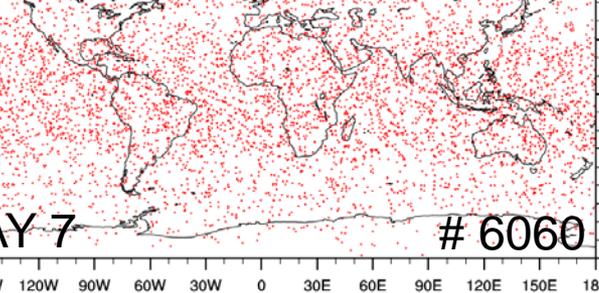
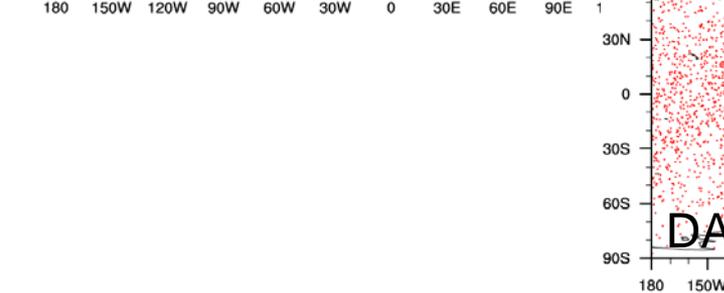
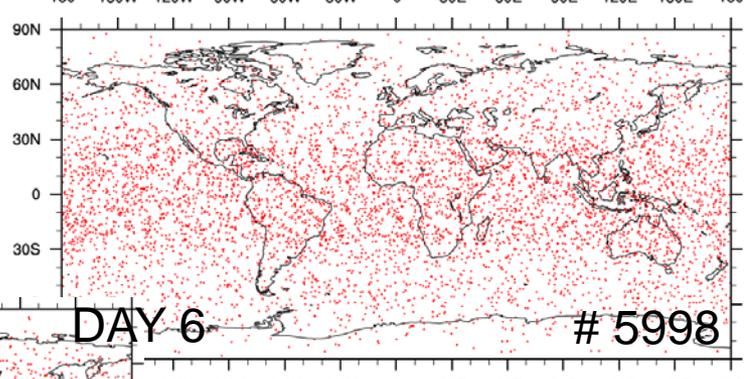
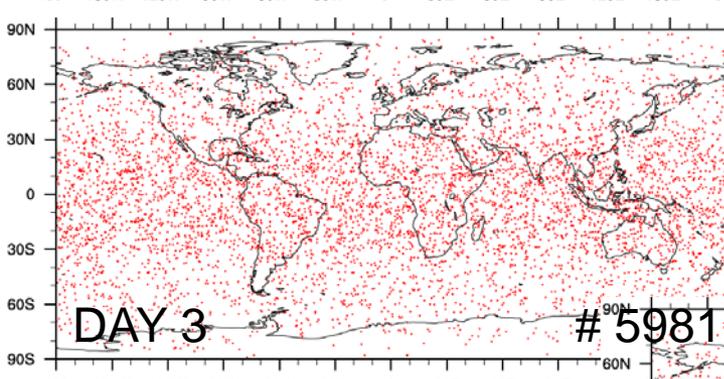
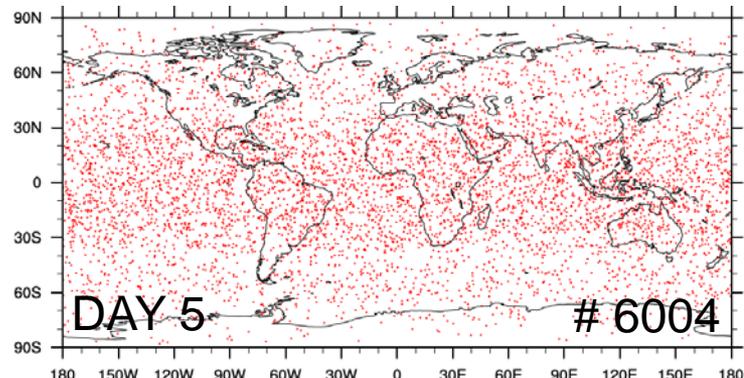
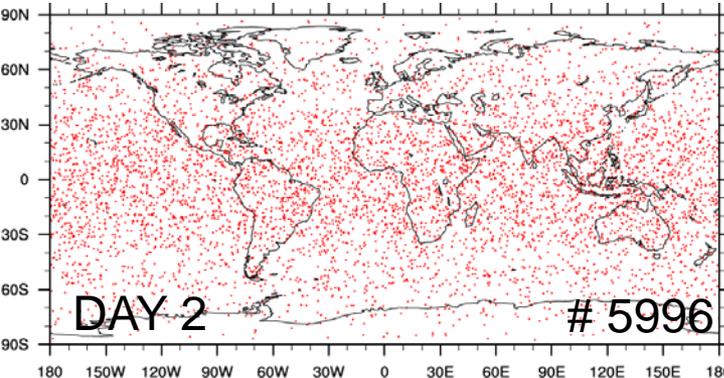
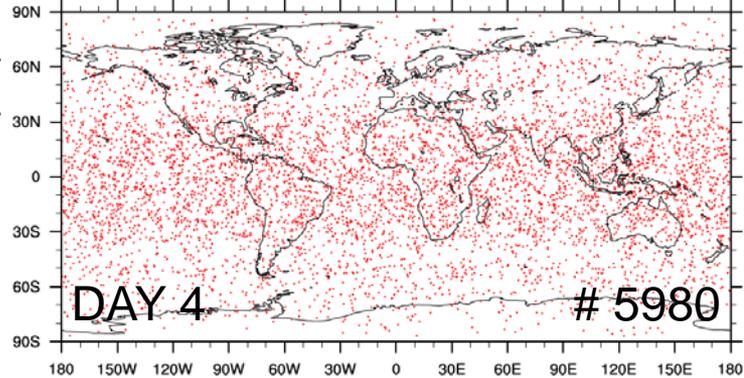


COSMIC-II (DAY1 ~ 7)

6/72°

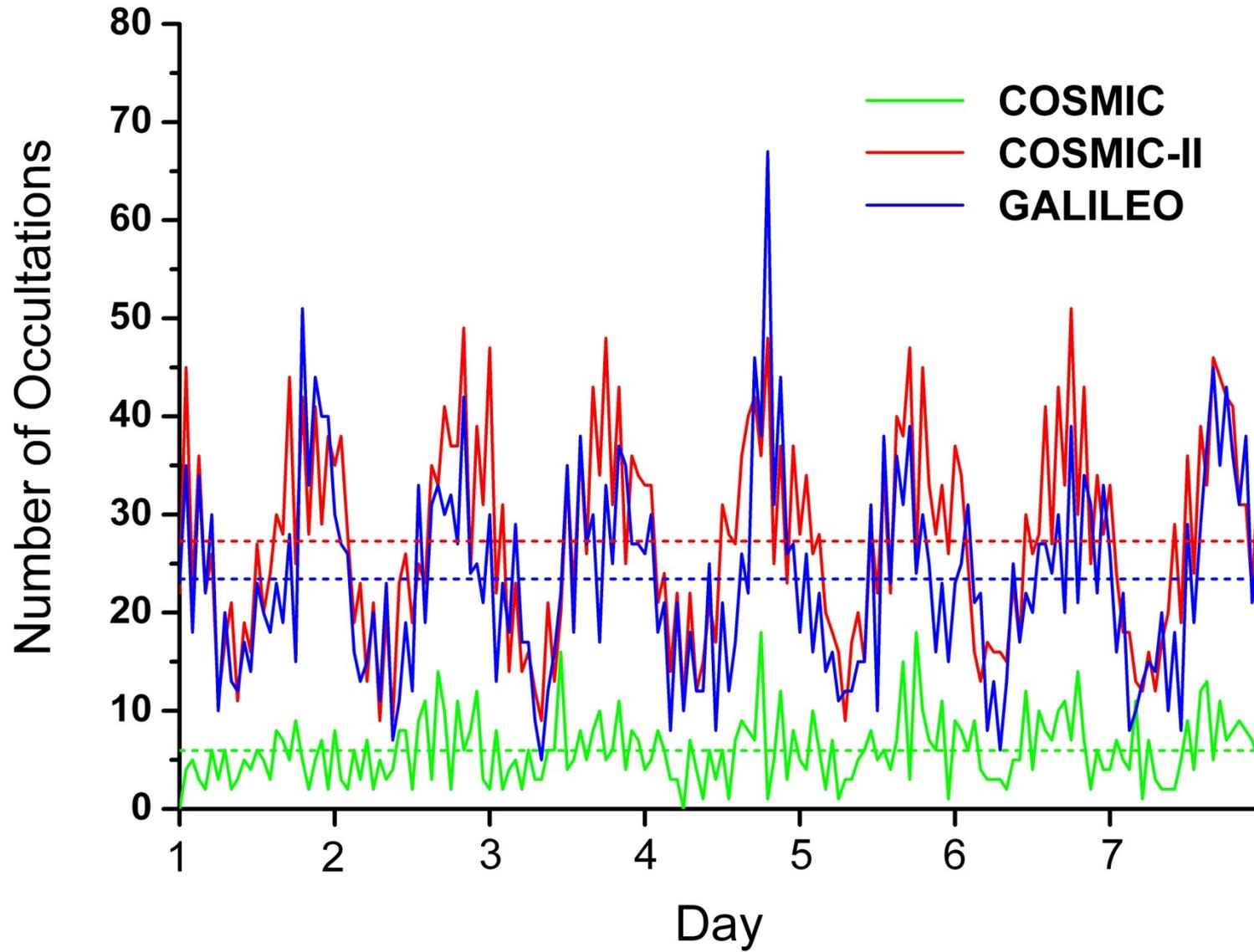
6/24°

From NSPO

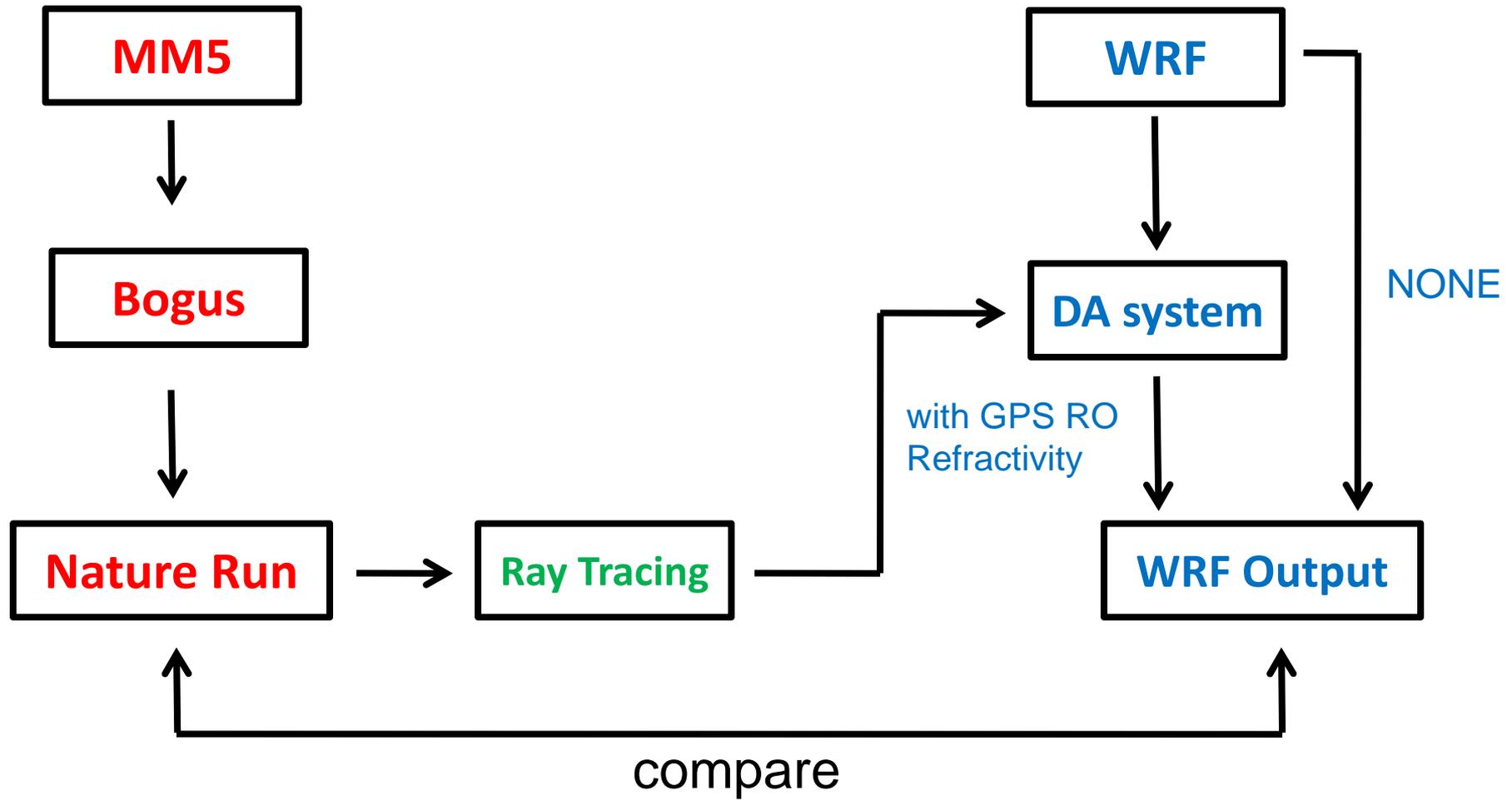




Regional hourly RO samples

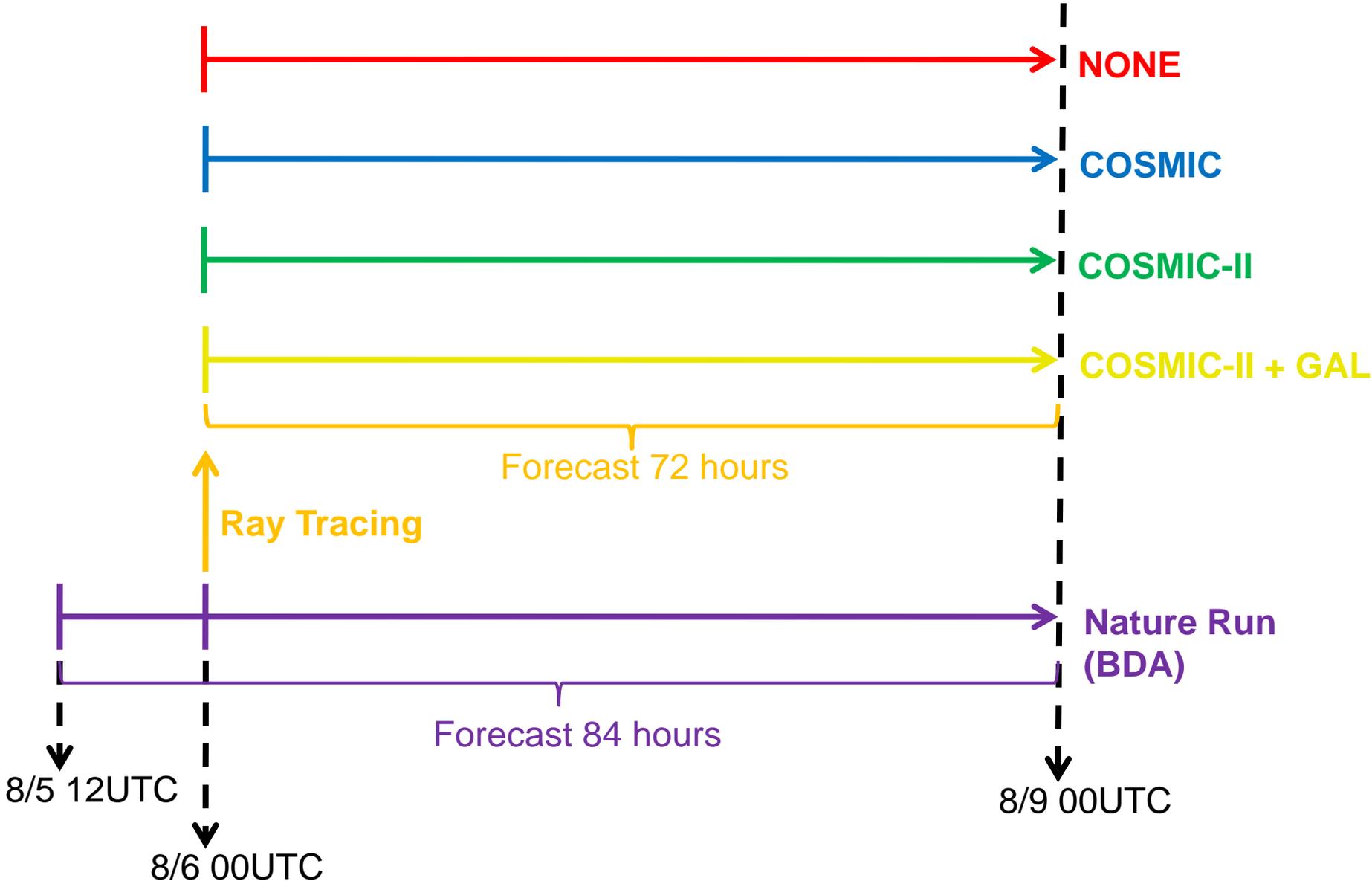


OSSE flow chart for Morakot



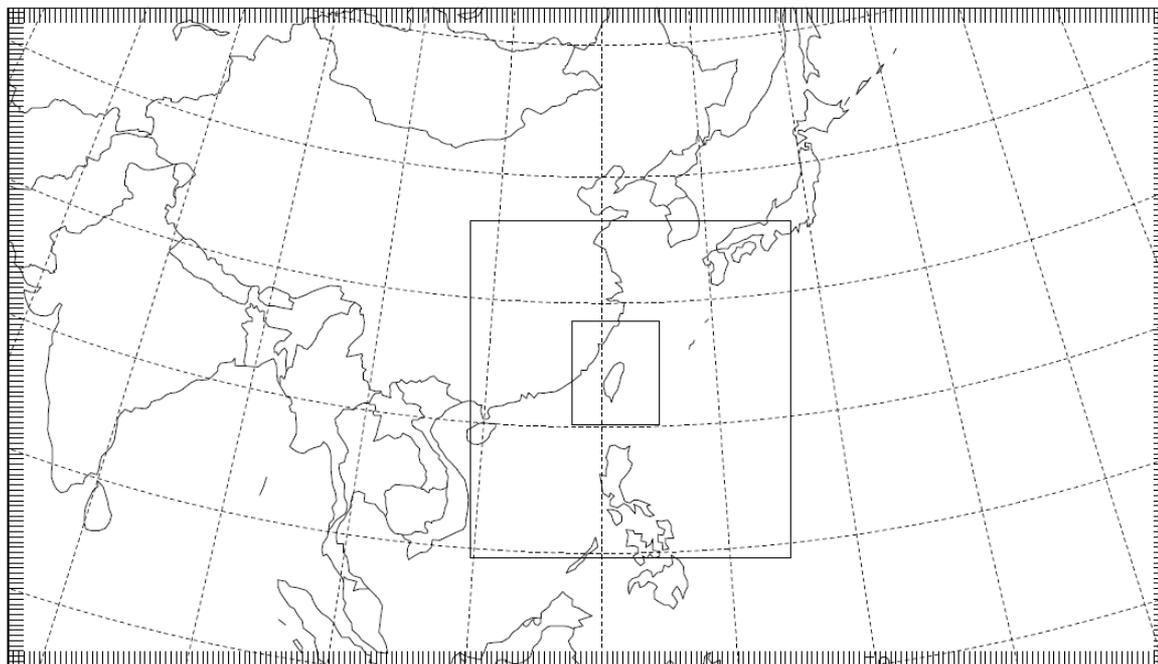


Morakot (2-h assimilation window)



Morakot OSSE (WRF ; 3DVAR)

WRF V3.1.1



Input Data :

NCEP/NCAR Reanalysis

Domain :

D01 : 222 × 128 × 45
(45km)

D02 : 184 × 196 × 45
(15km)

D03 : 151 × 181 × 45 (5km)

Model Top :

30hPa

Starting Time :

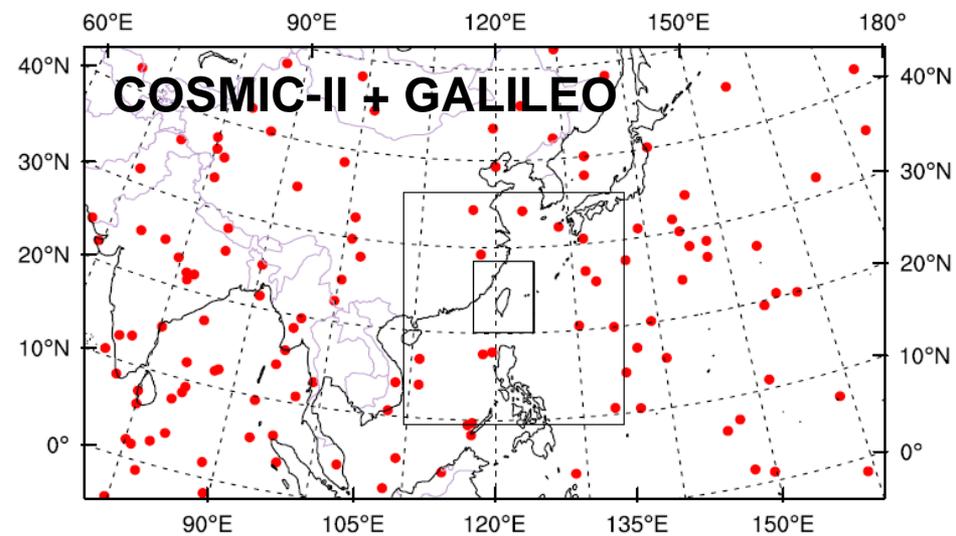
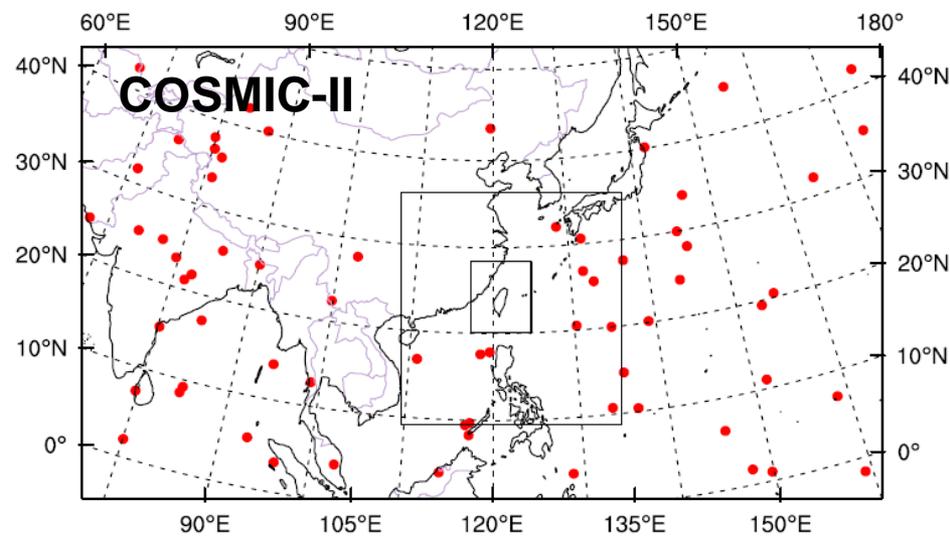
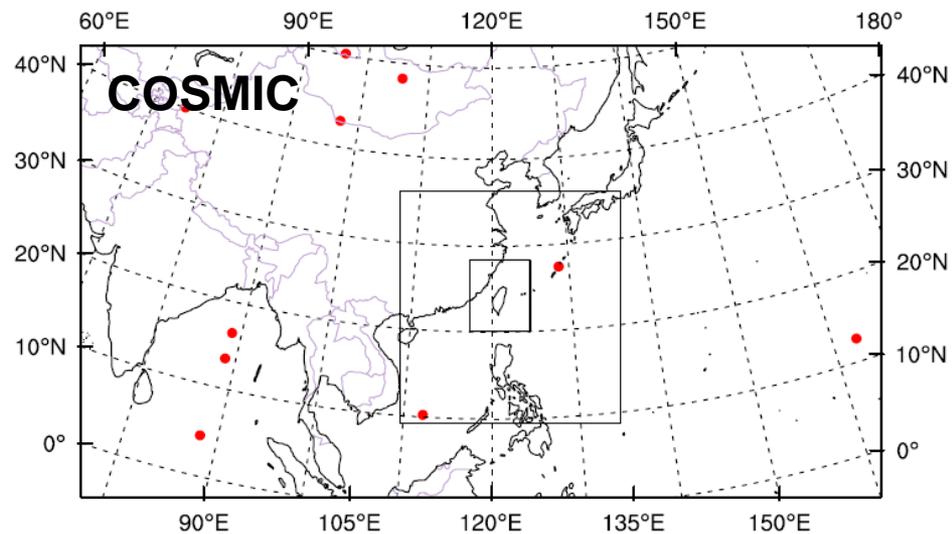
2009/08/06 00UTC

Ending Time :

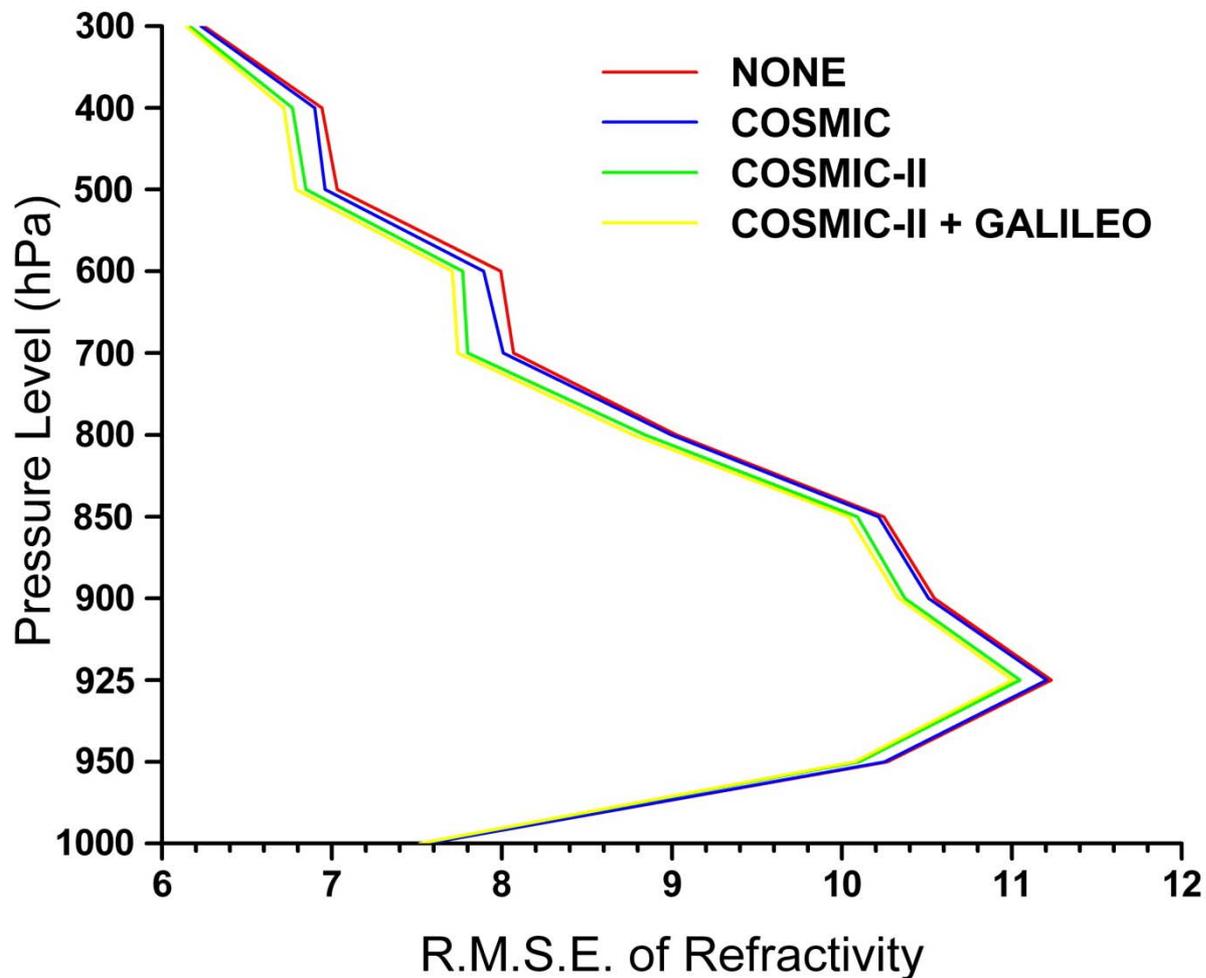
2009/08/09 00UTC

Physics Options in WRF :

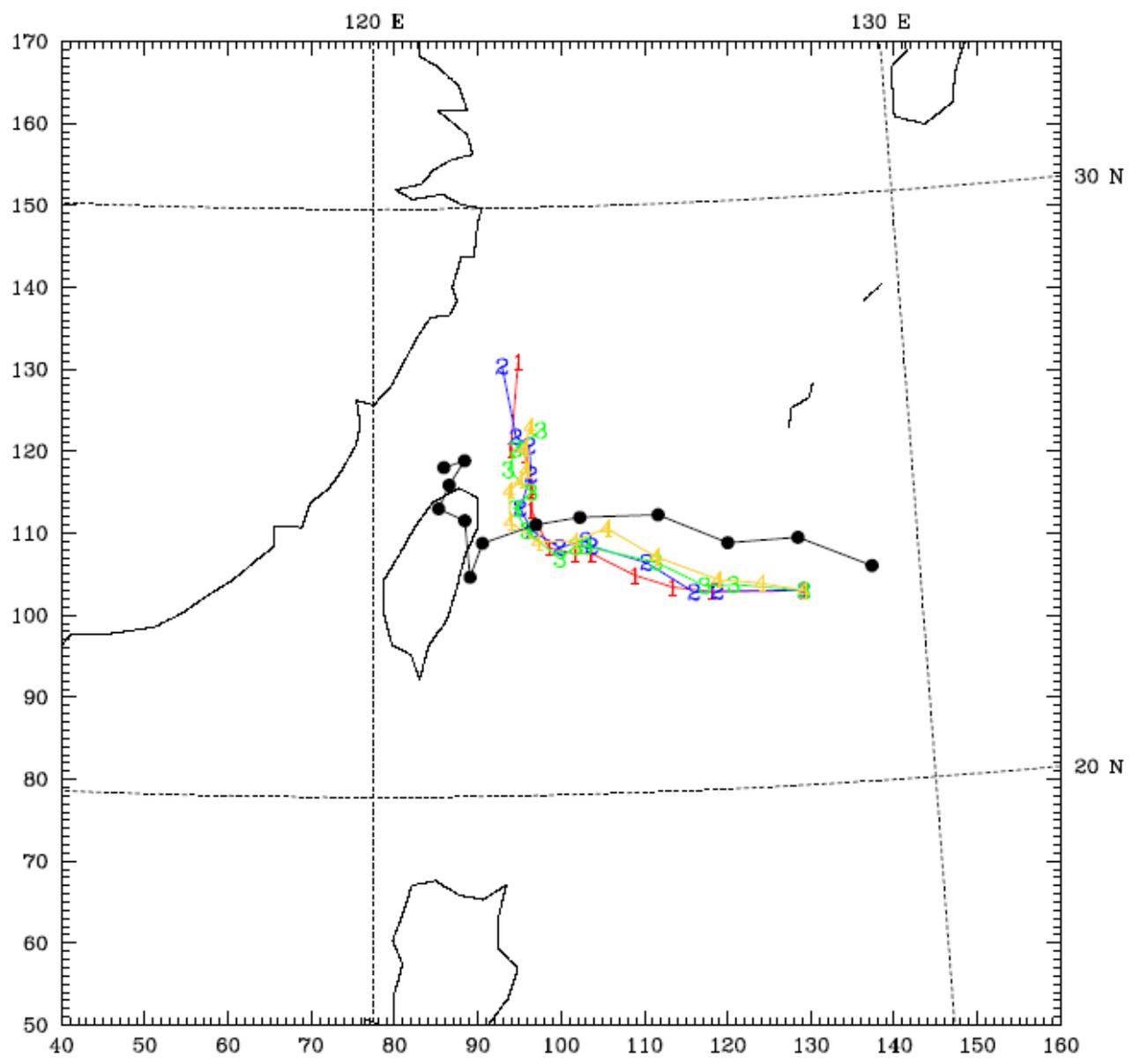
Explicit Moisture Schemes	Goddard microphysics scheme (7,7,7)
Cumulus Parameterizations	Grell-Devenyi ensemble scheme (D01 & D02) (3,3,0)
PBL Schemes	Yonsei University scheme (1,1,1)
Radiation Schemes	RRTM scheme (Rapid Radiative Transfer Model) (1,1,1)
Surface Schemes	Noah Land Surface Model (2,2,2)

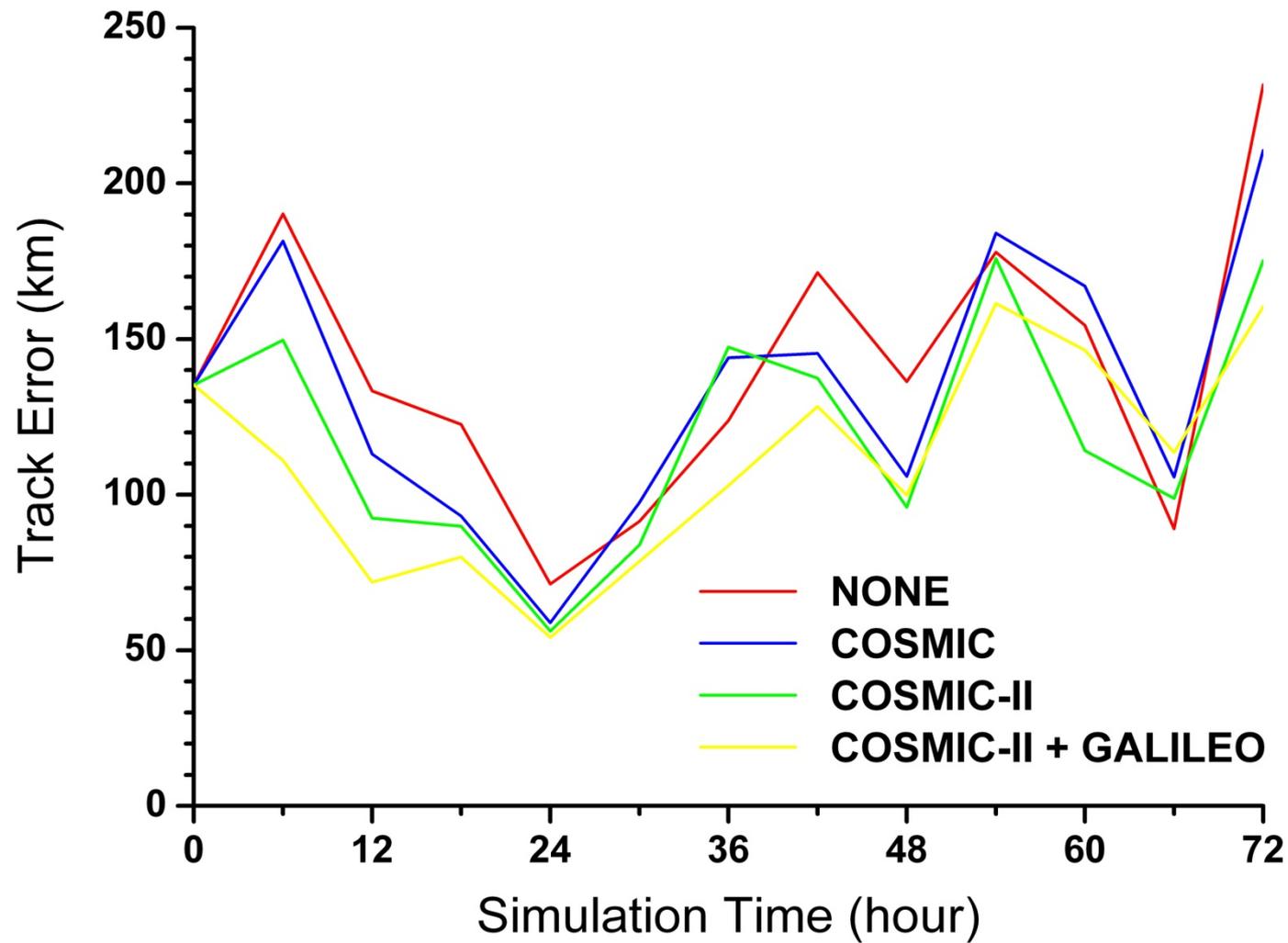


	Domain 1	Domain 2	Domain 3
COSMIC	10	2	0
COSMIC-II	67	11	0
COSMIC-II + GALILEO	125	15	0

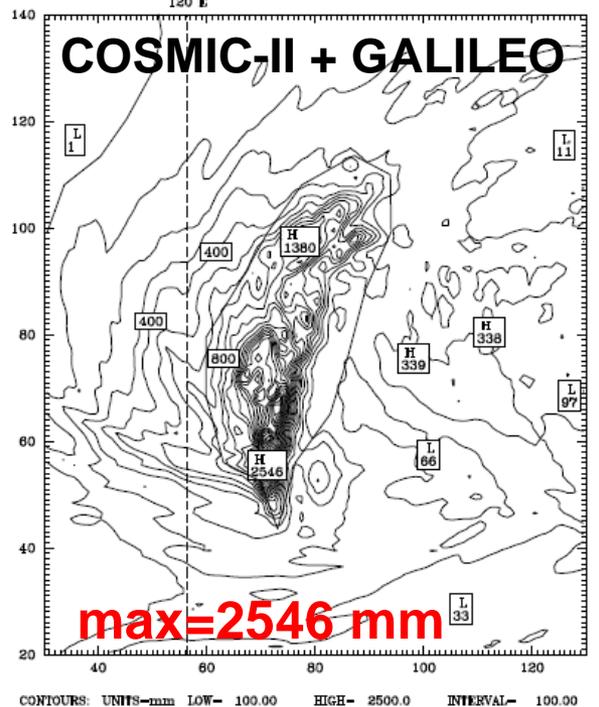
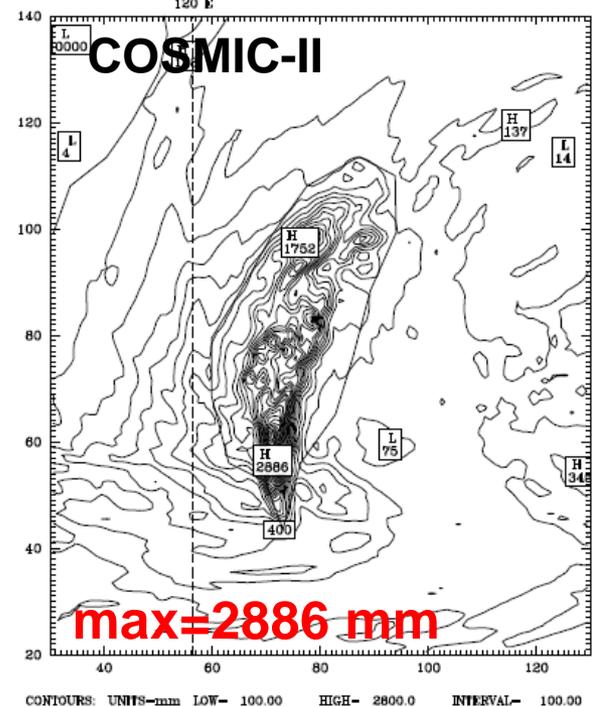
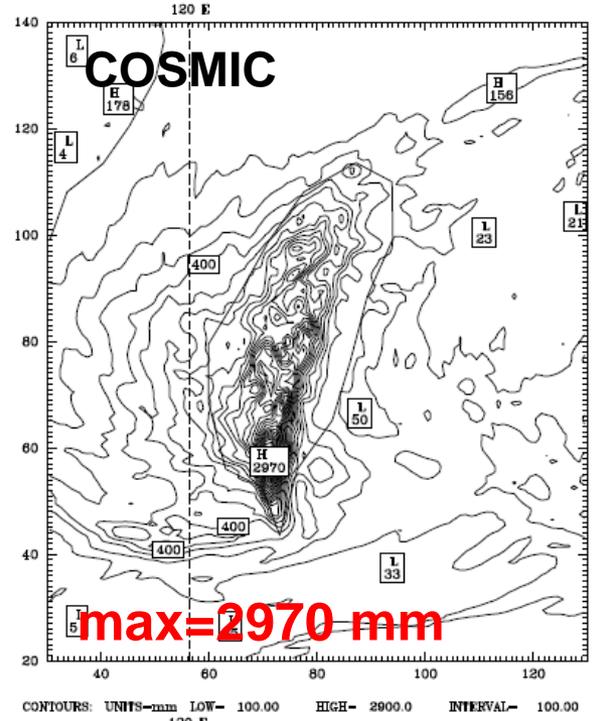
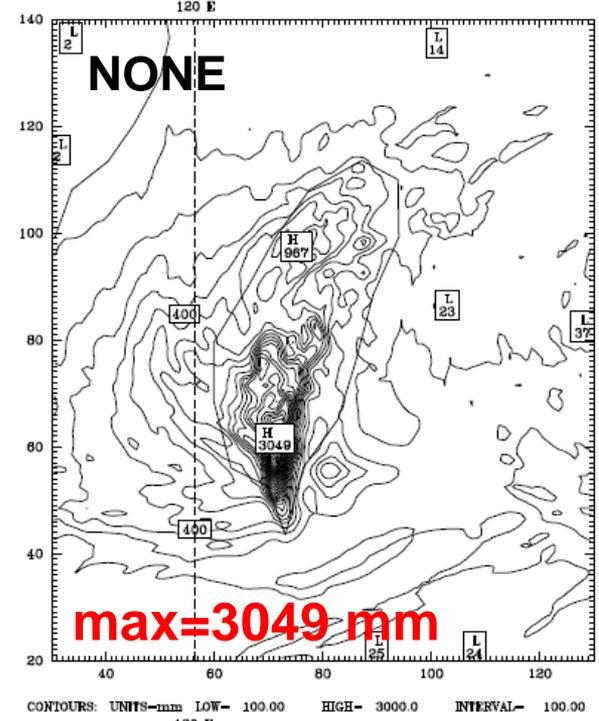
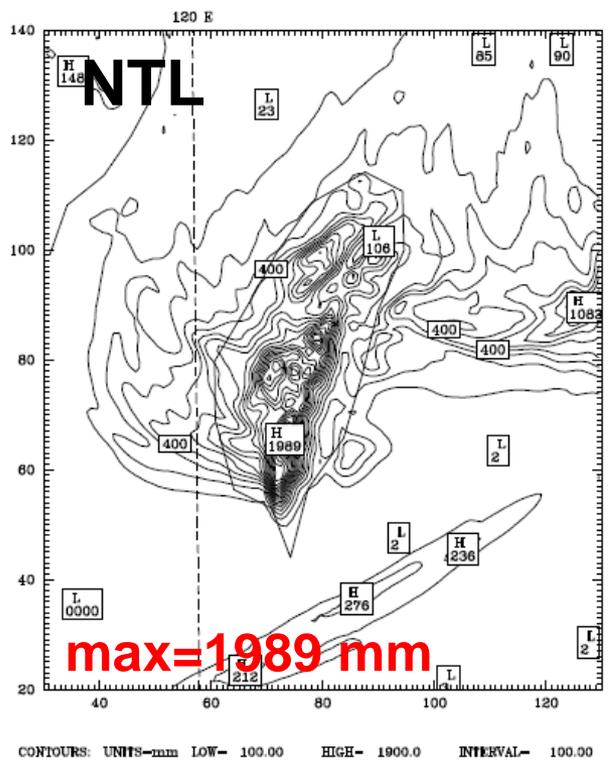


CASE	U (m/s)	V (m/s)	T (k)	Q (g/kg)	P (hPa)	REF
NONE	3.36	2.92	1.73	1.24	13.45	8.75
COSMIC	3.33	2.92	1.76	1.23	13.45	8.71
COSMIC-II	3.31	2.91	1.88	1.22	13.45	8.57
COSMIC-II + GALILEO	3.29	2.93	1.94	1.22	13.45	8.53





Experiment	NONE	COSMIC	COSMIC-II	COSMIC-II + GALILEO
Mean Track Error (km)	141	134	119	111



CONCLUSIONS

- The real case simulation results indicate that the GPS RO data have some positive impacts on typhoon track prediction, which in turns improve the ensuing rainfall prediction over local regions.
- The OSSE studies for F7/C2 tend to support the positive impacts of the GPS RO data on typhoon track prediction under current deployment plan.
- Advanced data assimilation with more reliable RO data information will be helpful for further improvement of typhoon prediction.

