

# The Impact of GPS Radio Occultation Data on Cyclone/Typhoon Predictions: An OSSE Study

A diagram illustrating the GPS satellite constellation. It shows a central Earth globe with several satellite orbits depicted as light blue arcs. Small satellite icons are placed along these orbits. A specific region of the globe is highlighted with a pink circle, and several green and blue lines represent radio occultation paths between satellites and the Earth's surface.

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<sup>2</sup>University Corporation for Atmospheric Research, Boulder, Colorado, USA

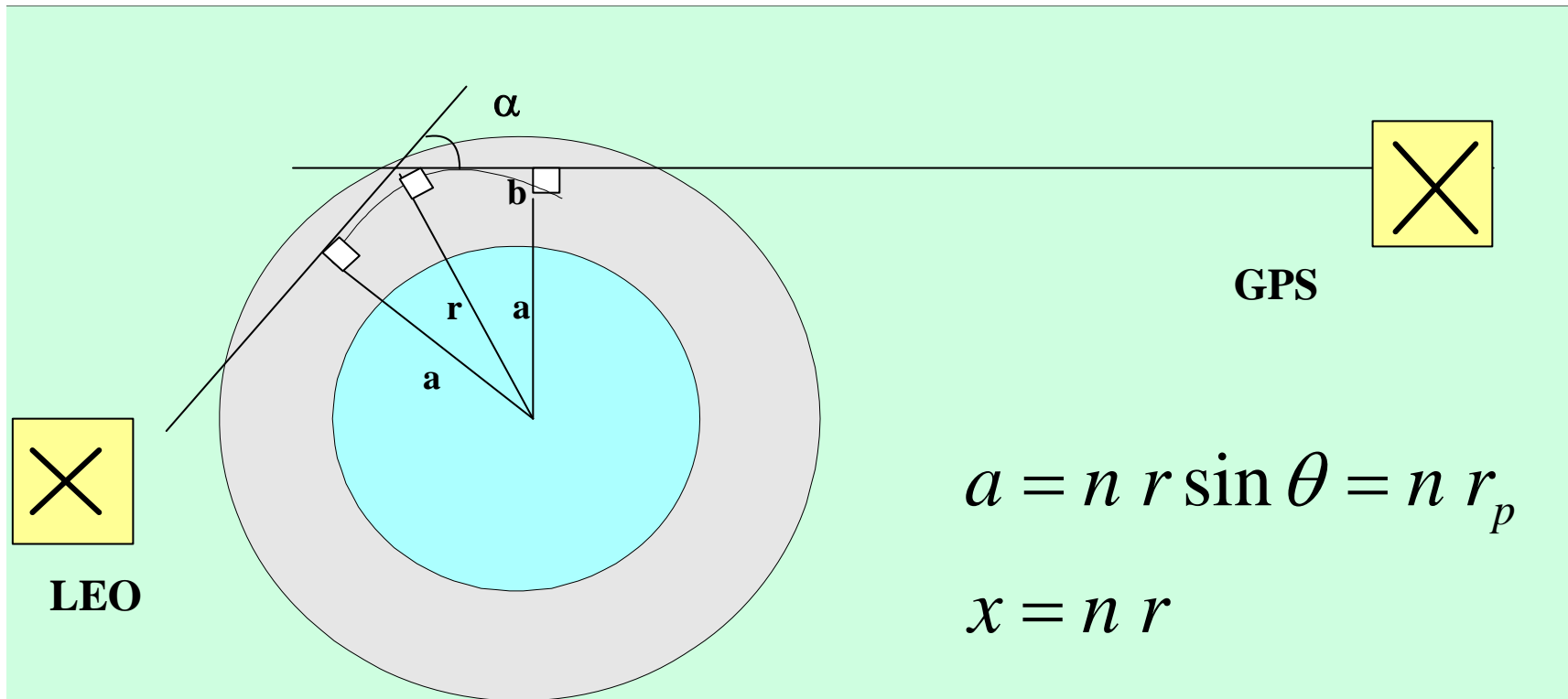
<sup>3</sup>National Center for Atmospheric Research, Boulder, Colorado, USA

# Outline

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- Introduction: observation operators, past efforts
- Recent weather (typhoon) predictions with assimilation of FORMOSAT-3/COSMIC RO data in 2007 and 2008
- The impact of idealized GPS RO data on Prediction of Typhoons Krosa (2007):  
An Observing-Systems Simulation Experiments (OSSE) Study
- Conclusions

# The GPS Radio Occultation



Forward Propagation

$$\alpha(a) = -2a \int_x^\infty \frac{d \ln(n) / dx}{\sqrt{x^2 - a^2}} dx$$

Abel Inversion

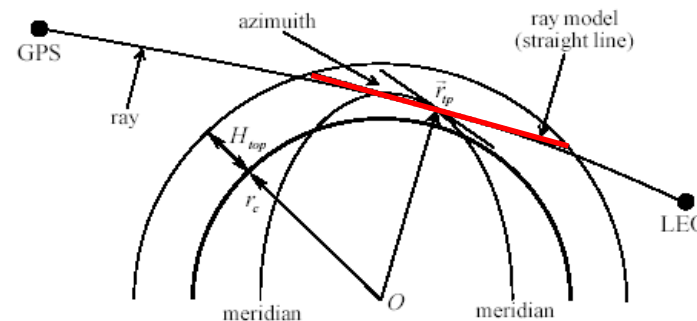
$$\ln(n(x)) = \frac{1}{\pi} \int_x^\infty \frac{\alpha(a)}{\sqrt{a^2 - x^2}} da$$

# The nonlocal operator

- Abel-retrieved refractivity accounts for an integrated amount of refractivity along the total path of the ray in a spherically-symmetric atmosphere.
- To take the effect of horizontal gradients into account, Sokolovskiy et al. (2005) suggest assimilation of excess phase, defined as the integrated refractivity along a straight ray.

Nonlocal (excess phase):

$$S = \int N \cdot dl$$



- A nonlocal operator was implemented into the WRFVAR 2.1 (Chen et al. 2008).

→ Local operator assimilating  $N$  at the perigee point.

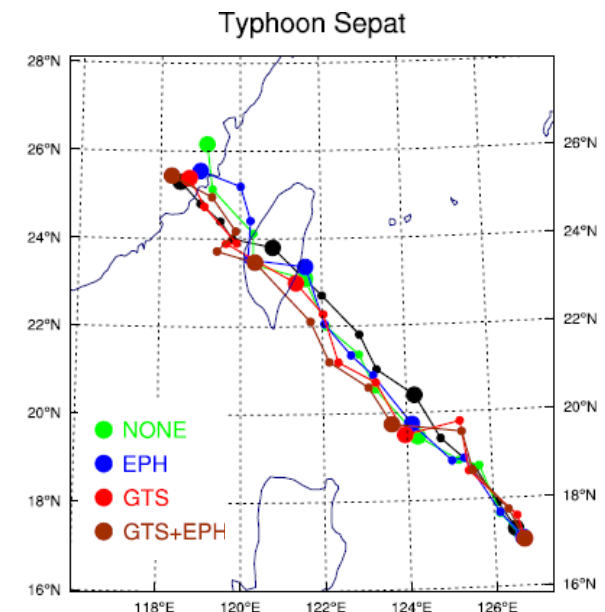
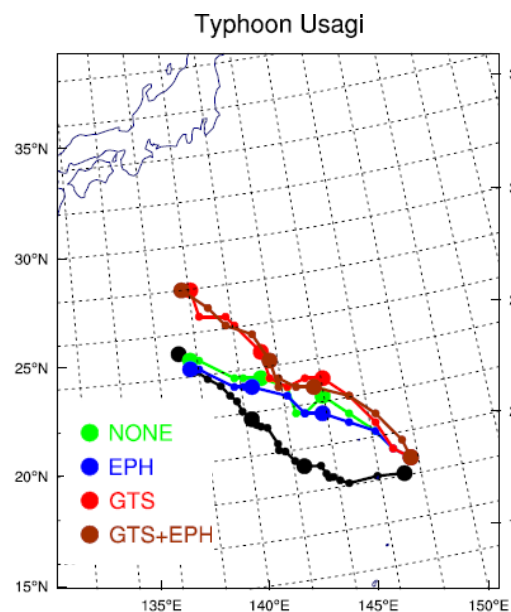
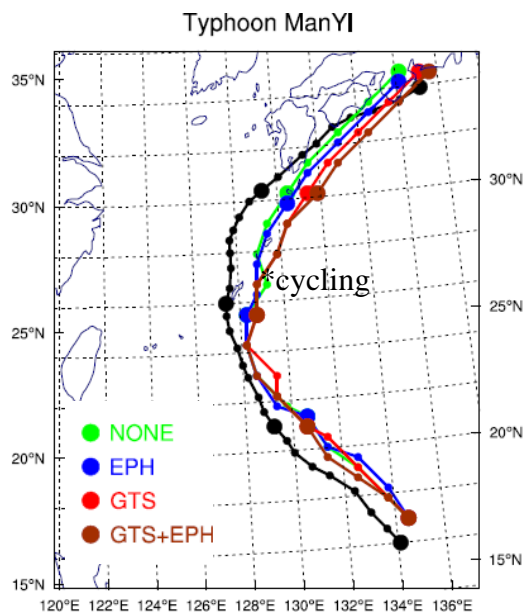
$$N = (n - 1) \times 10^6 = 77.6 \frac{P}{T} + 3.73 \times 10^5 \frac{P_w}{T^2} - 40.3 \times 10^{-12} \frac{n_e}{f^2}$$

## The simulated severe weather cases in 2006, 2007 with FORMOSAT-3 RO data.

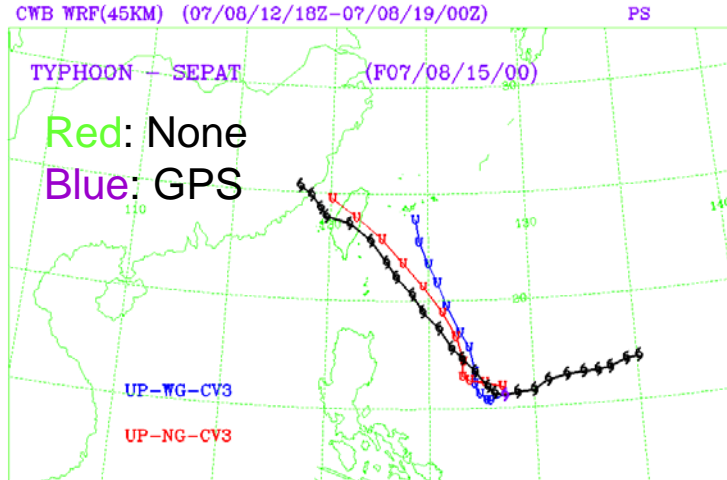
| Initial Time         | Event            | GPS RO            |
|----------------------|------------------|-------------------|
| 2006-07-1200         | Typhoon Bilis    | 2                 |
| 2006-07-2300         | Typhoon Kaemi    | 7                 |
| 2006-09-1312         | Typhoon Shanshan | 27                |
| 2007-06-0212         | Meiyu Front      | 31                |
| 2007-06-0300         | Cyclone Gonu     | 56                |
| 2007-07-1100         | Typhoon Manyi    | 15                |
| 2007-07-2900         | Typhoon Usagi    | 39                |
| 2007-08-1600         | Typhoon Sepat    | 21                |
| 2007-10-0412 (0500)* | Typhoon Krosa    | 31 (17) * cycling |

EPH: excess phase (nonlocal operator)

WRF- 3 domains

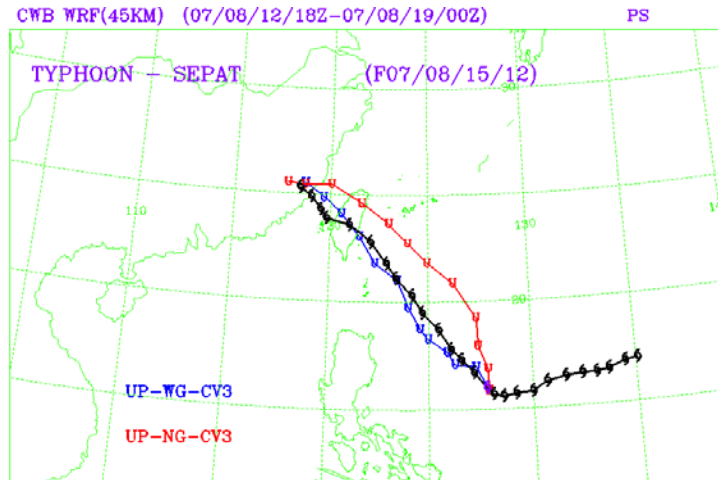


# SEPAT 2008/08/1500Z



CWB WRF operational runs

# 2008/08/1512Z



track errors (red is better)

|      | 12HR        | 24HR        | 36HR        | 48HR        | 60HR        | 72HR        |
|------|-------------|-------------|-------------|-------------|-------------|-------------|
| 1312 | <b>0.88</b> | 1.11        | 1.67        | 1.69        | 1.92        | 2.08        |
| 1400 | 5.42        | 1.43        | 2.98        | 4.84        | 7.65        | 4.98        |
| 1412 | <b>0.58</b> | <b>0.20</b> | <b>0.21</b> | <b>0.04</b> | <b>0.04</b> | <b>0.27</b> |
| 1500 | 2.59        | 1.55        | 1.90        | 2.64        | 1.80        | 2.16        |
| 1512 | <b>0.29</b> | <b>0.36</b> | <b>0.36</b> | <b>0.29</b> | <b>0.31</b> | <b>0.71</b> |
| 1600 | <b>0.48</b> | <b>0.14</b> | <b>0.18</b> | <b>0.31</b> | <b>0.5</b>  | <b>0.66</b> |
| 1612 | <b>0.30</b> | <b>0.70</b> | <b>0.79</b> | <b>0.90</b> | 1.01        |             |
| 1700 | <b>0.90</b> | 1.65        | 1.09        | <b>0.81</b> |             |             |
| 1712 | 1.57        | 1.22        | 1.46        |             |             |             |
| 1800 | <b>0.46</b> | <b>0.16</b> |             |             |             |             |

# WRF (with AVN) for Typhoon Krosa

## 2007/10/04 0000UTC

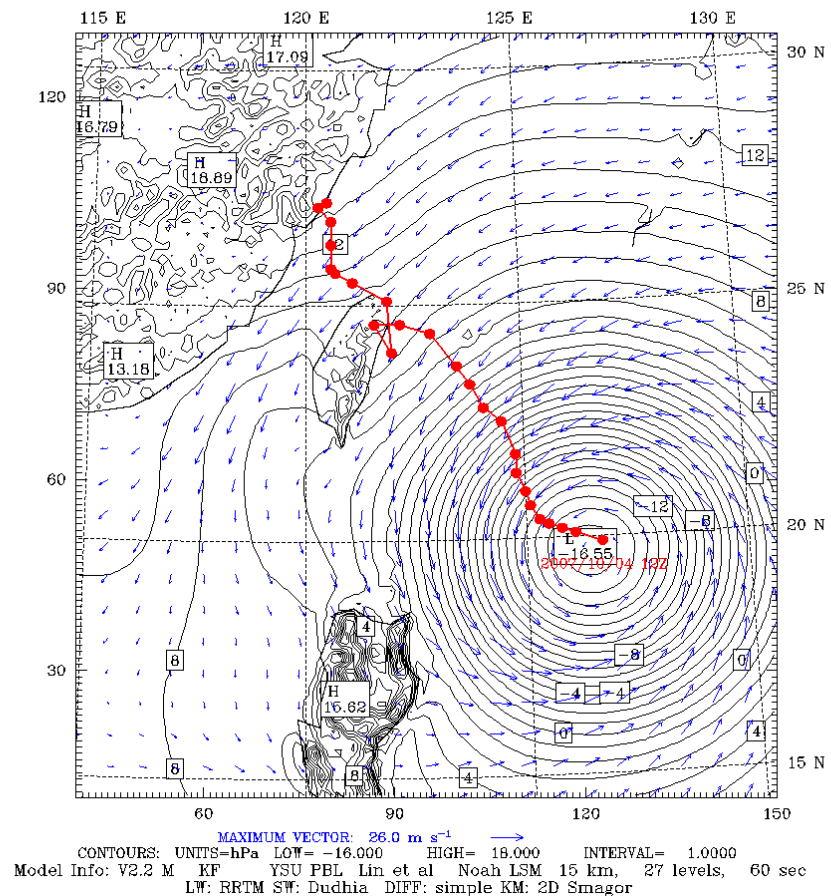
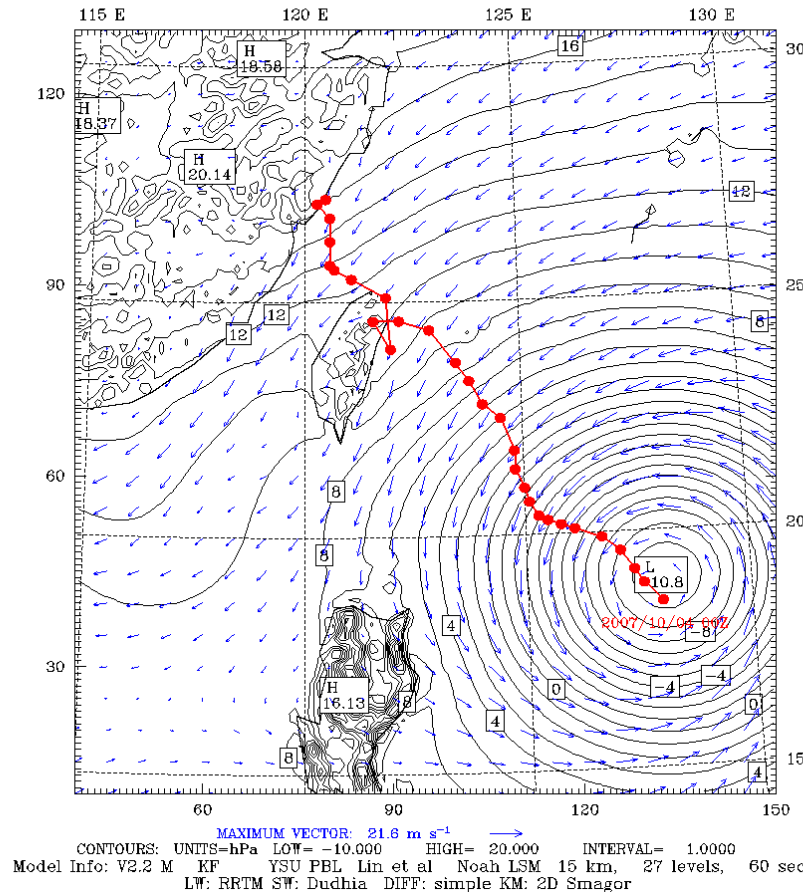
## 2007/10/04 1200UTC

Dataset: WRF NONE d02 RIP: SLP T UV  
 Fcst: 0.00 h Valid: 0000 UTC Thu 04 Oct 07 (0800 LST Thu 04 Oct 07)  
 Pressure pert. (from MM5 std. atm.) at k-index = 27  
 Horizontal wind vectors at k-index = 27

Dataset: WRF NONE d02 RIP: SLP T UV  
 Fcst: 0.00 h Valid: 1200 UTC Thu 04 Oct 07 (2000 LST Thu 04 Oct 07)  
 Pressure pert. (from MM5 std. atm.) at k-index = 27  
 Horizontal wind vectors at k-index = 27

forecast 84h

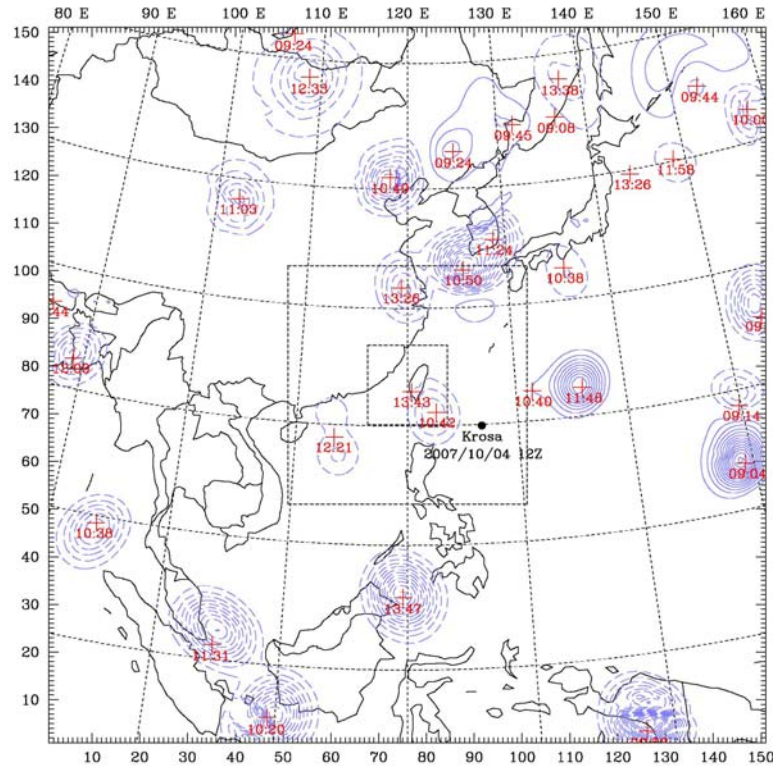
forecast 72h



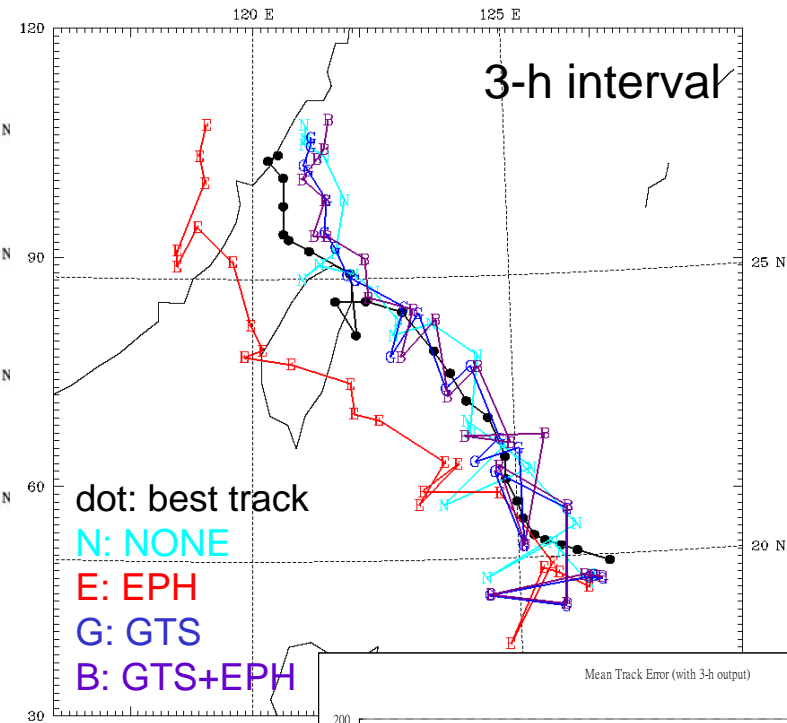
Compared with best tracks (red dotted-line) from <http://agora.ex.nii.ac.jp/digital-typhoon/>

# Typhoon Krosa (2007/10/04 12UTC)

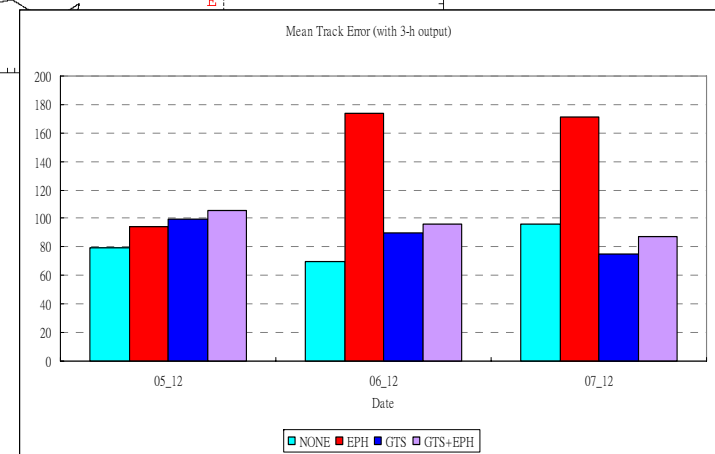
Increments of N



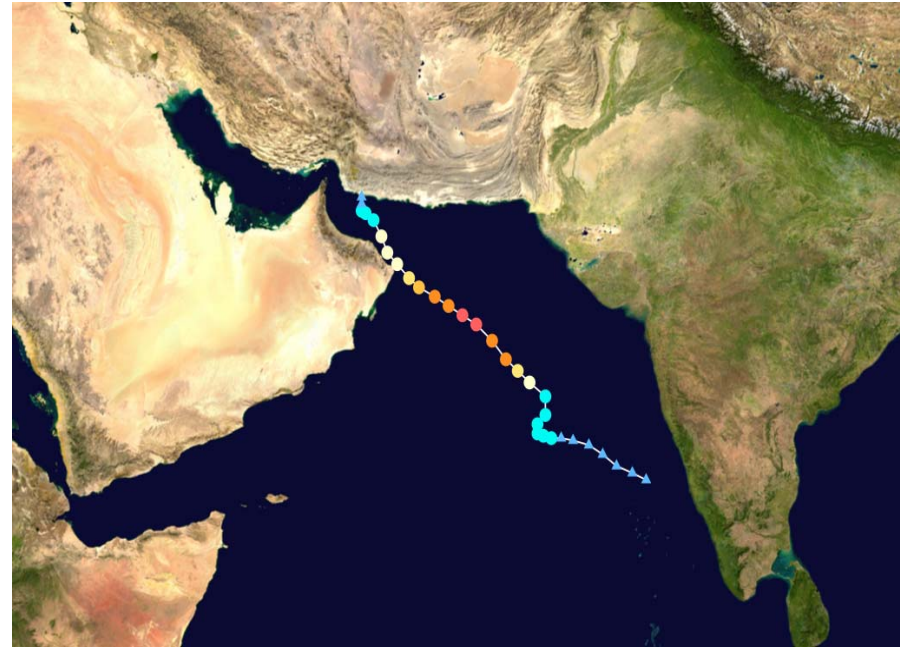
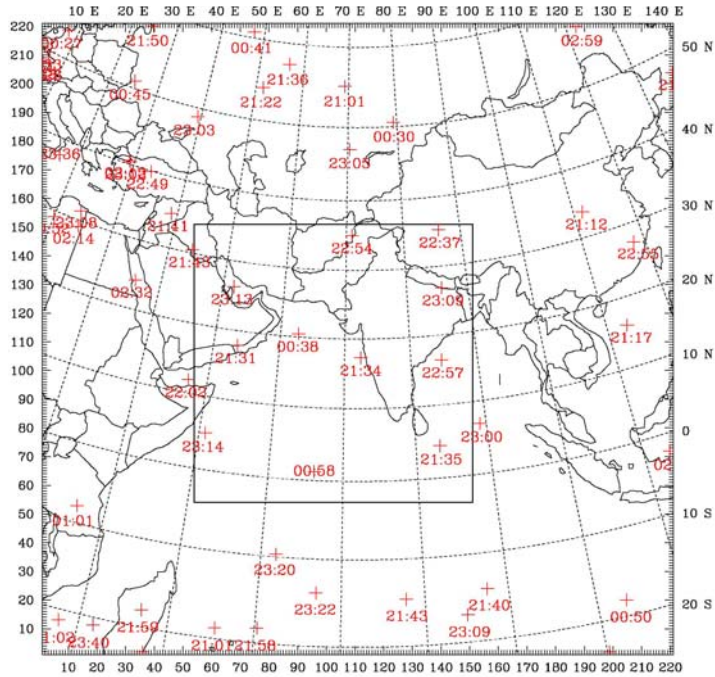
Simulated tracks



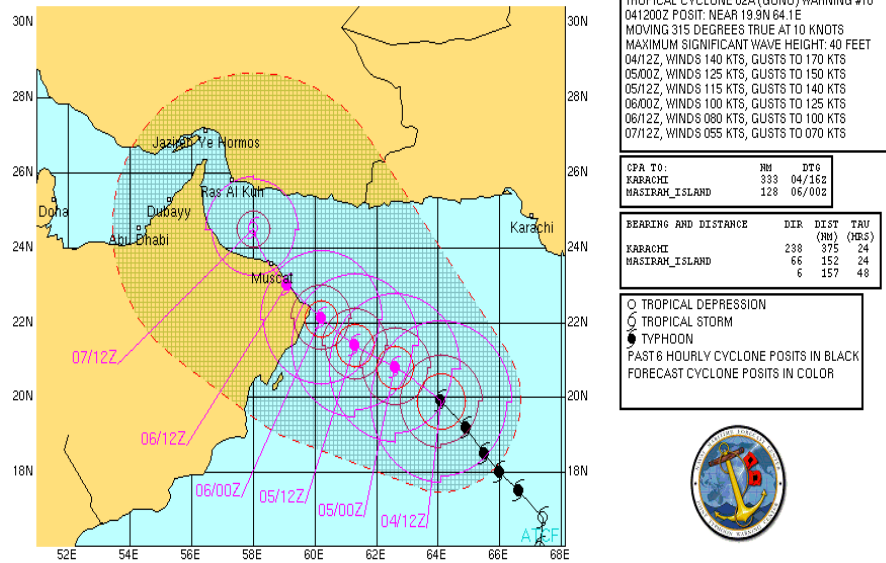
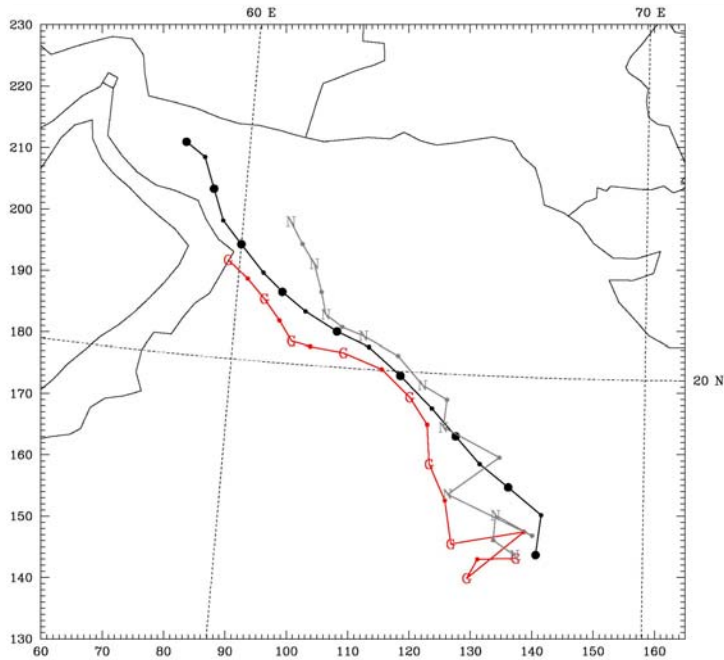
Assimilation for 3 domains  
**31 GPS RO Soundings**



a



b

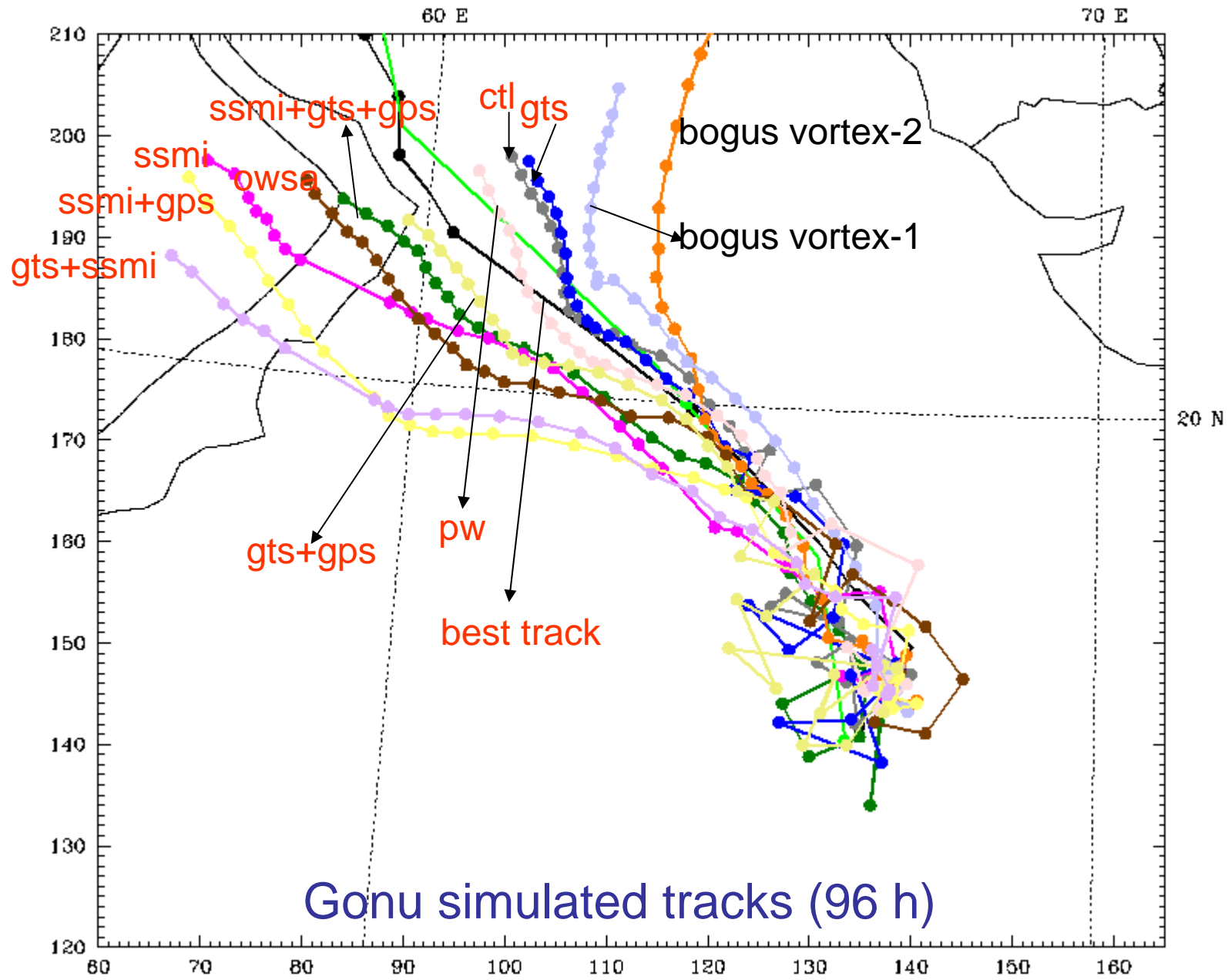


Gonu Cyclone: 03 June 2007. (56 GPS RO)

# Gonu Assimilation Experiments

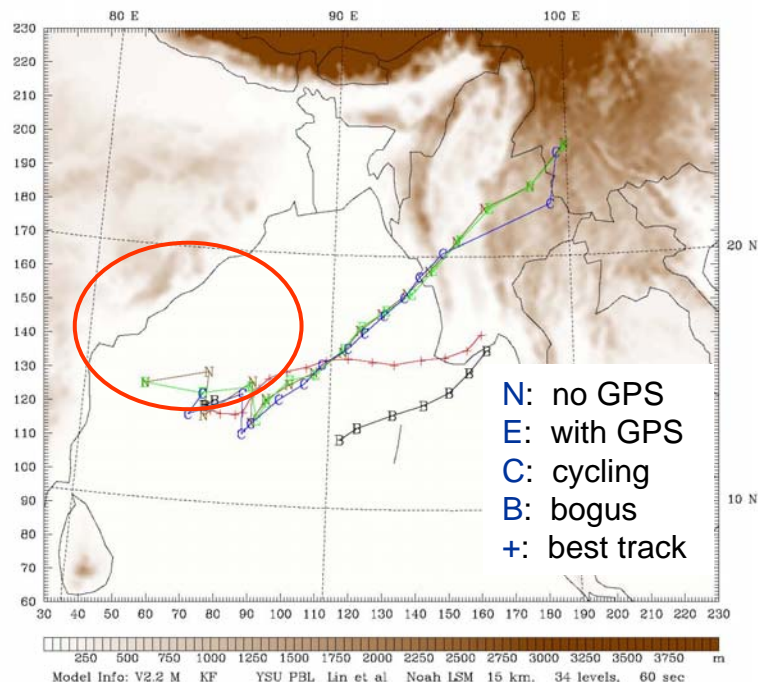
- Control Run (CTL)
- GTS
- SSM/I
- COSMIC (GPS)
- Bogus Vortex test -1 (small)
- Bogus Vortex test -2 (large)
- SGC (SSM/I+GTS+COSMIC)
- OWSA (SSM/I)
- IWVA (SSM/I)
- SSM/I+GPS
- GTS+GPS
- GTS+SSMI

**Twelve combinations**



**The impact of FORMOSAT-  
3/COSMIC RO data on recent  
severe weather predictions  
in 2008**

| <b>Initial Time</b>         | <b>Event</b>             | <b>GPS RO</b>  |
|-----------------------------|--------------------------|----------------|
| <b>2008-04-2900 (2906)*</b> | <b>Cyclone Nargis</b>    | <b>21 (24)</b> |
| <b>2008-06-2500</b>         | <b>Meiyu Front</b>       | <b>26</b>      |
| <b>2008-07-1600</b>         | <b>Typhoon Kalmaegi</b>  | <b>15</b>      |
| <b>2008-07-2600</b>         | <b>Typhoon Fung-Wong</b> | <b>43</b>      |
| <b>2008-09-1200</b>         | <b>Typhoon Sinlaku</b>   | <b>12</b>      |
| <b>2008-09-2700</b>         | <b>Typhoon Jangmi</b>    | <b>27</b>      |

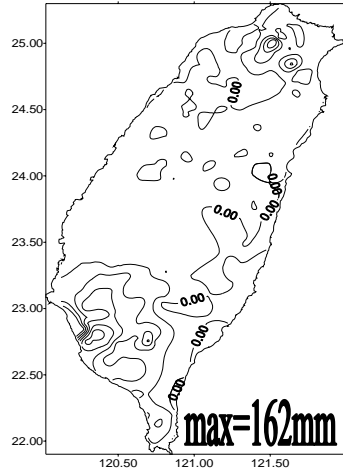


| <b>Case</b>  | <b>Assimilated data</b>                     |
|--------------|---|
| <b>None</b>  | <b>no</b>                                   |
| <b>GPS</b>   | <b>FORMOSAT-3 GPS RO refractivity (EPH)</b> |
| <b>GTS</b>   | <b>NCAR GTS data</b>                        |
| <b>Drop</b>  | <b>Soundings</b>                            |
| <b>SSM/I</b> | <b>PW and 2D wind speed</b>                 |

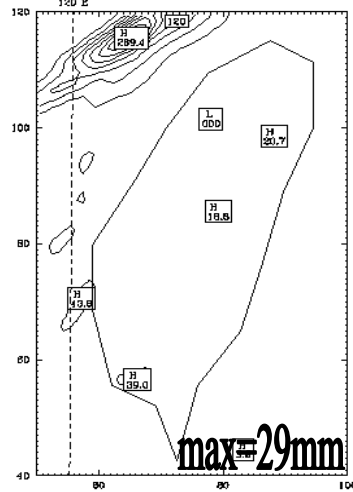
# Meiyu front- 2007/0625 0000UTC

Int:30 mm

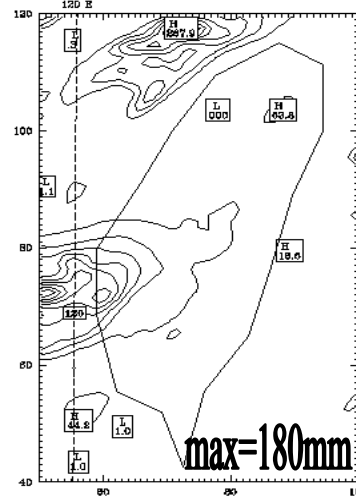
OBS



None

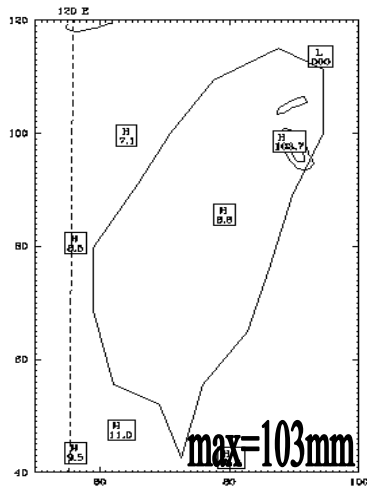


GPS

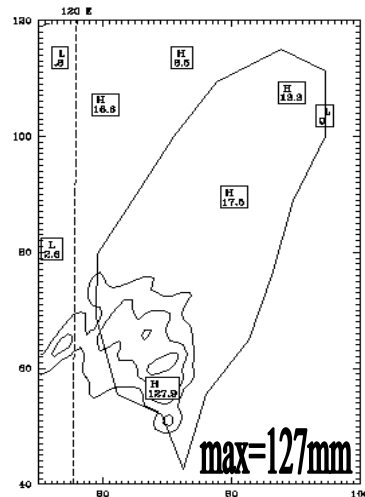


WRF simulated 24-h  
accumulated rainfall (mm)  
(0628 0000 – 0629 0000 UTC)

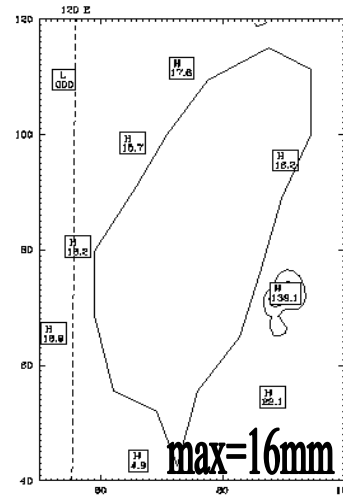
GTS



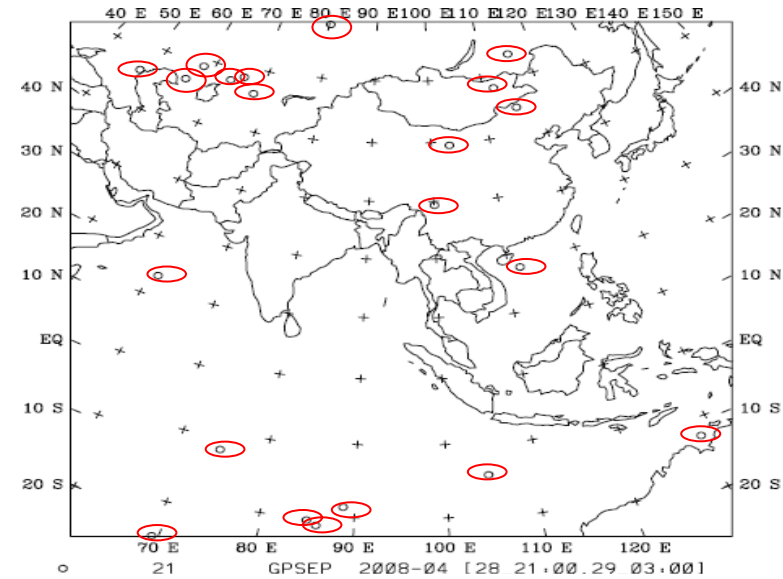
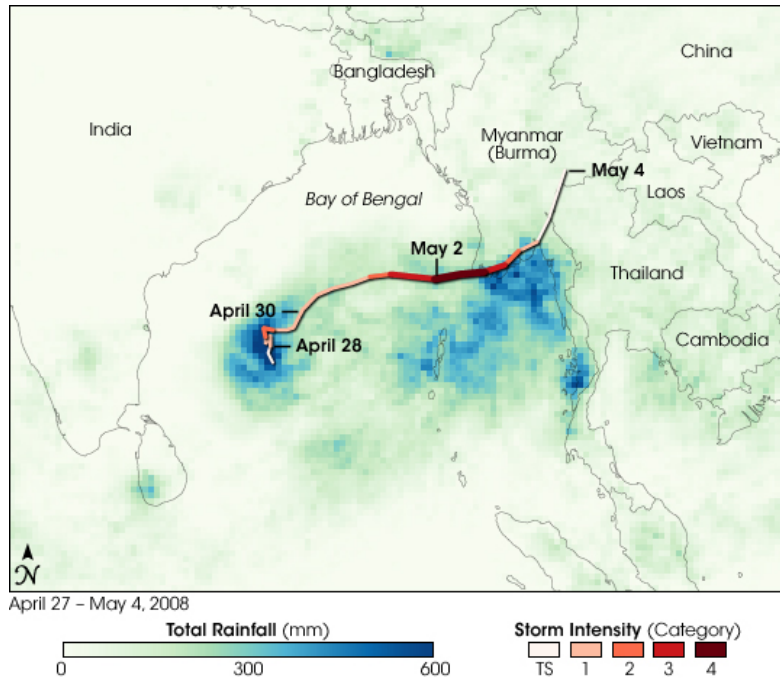
Drop



SSM/I



# Myanmar Cyclone Nargis (2008)



21 GPS RO points

Rainfall accumulations along Cyclone Nargis by Tropical Rainfall Measuring Mission (TRMM) satellite (<http://earthobservatory.nasa.gov>)

Use WRF 2-domains (45-km and 15-km)

**A perfect cyclone!**

**From 0000UTC 29 April 2008**

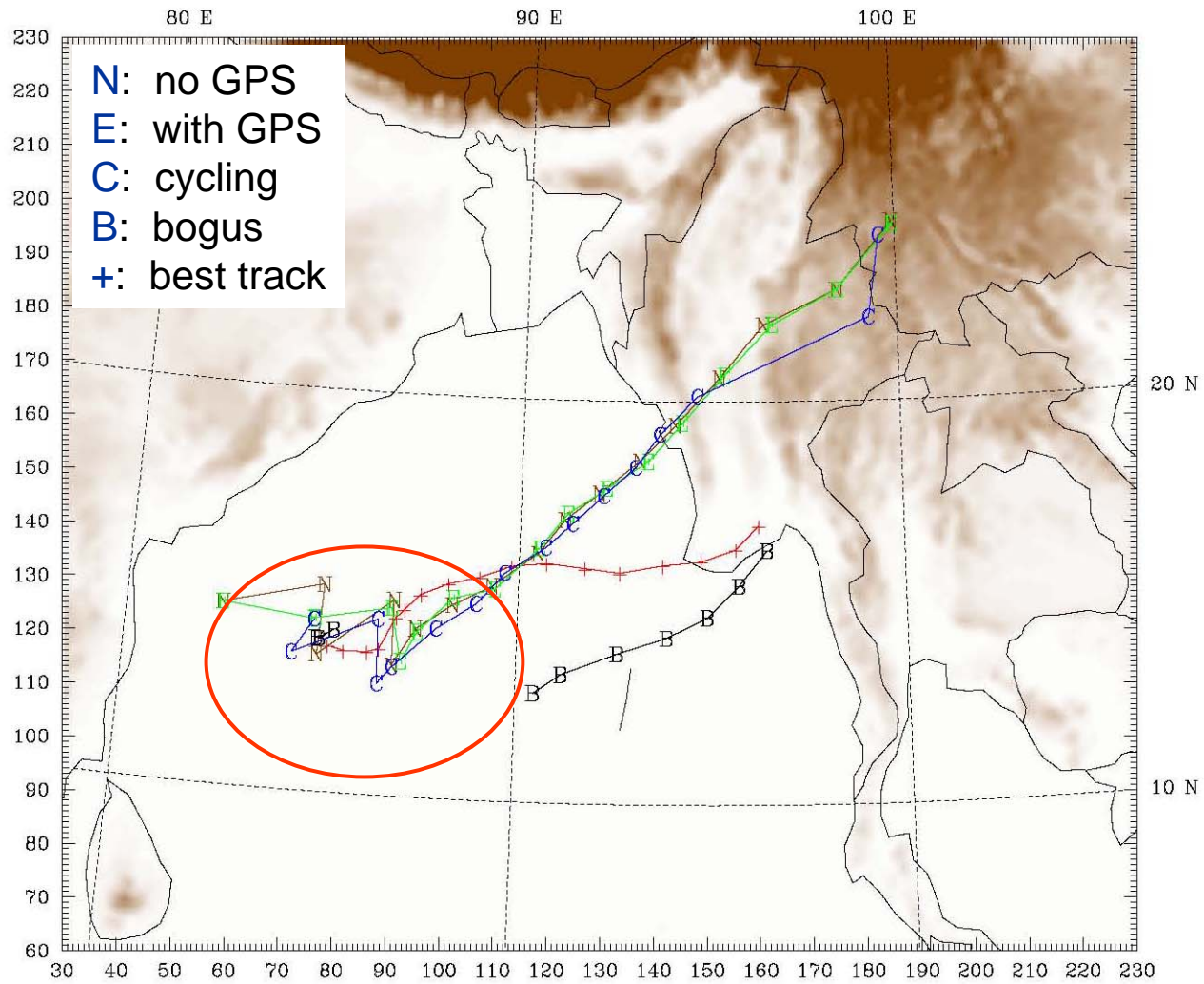
Dataset: eph RIP: Track nargis track

Init: 0000 UTC Tue 29 Apr 08

Fcst: 0.00 h

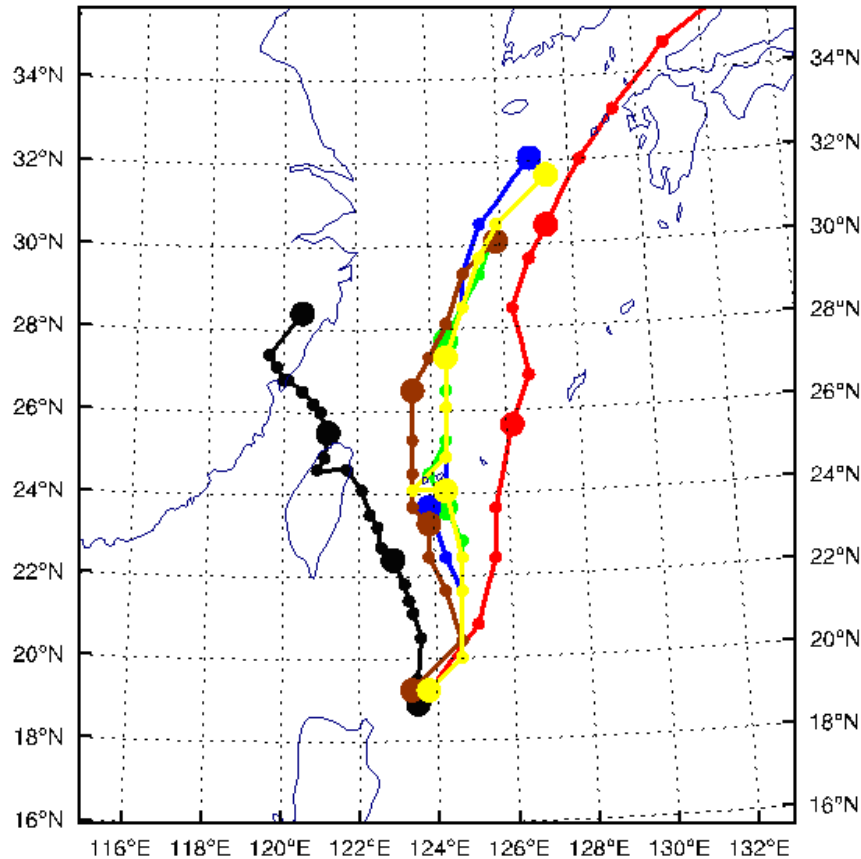
Valid: 0000 UTC Tue 29 Apr 08 (0800 LST Tue 29 Apr 08)

Terrain height AMSL



Model Info: V2.2 M KF YSU PBL Lin et al Noah LSM 15 km, 34 levels, 60 sec  
LW: RRTM SW: Dudhia DIFF: simple KM: 2D Smagor

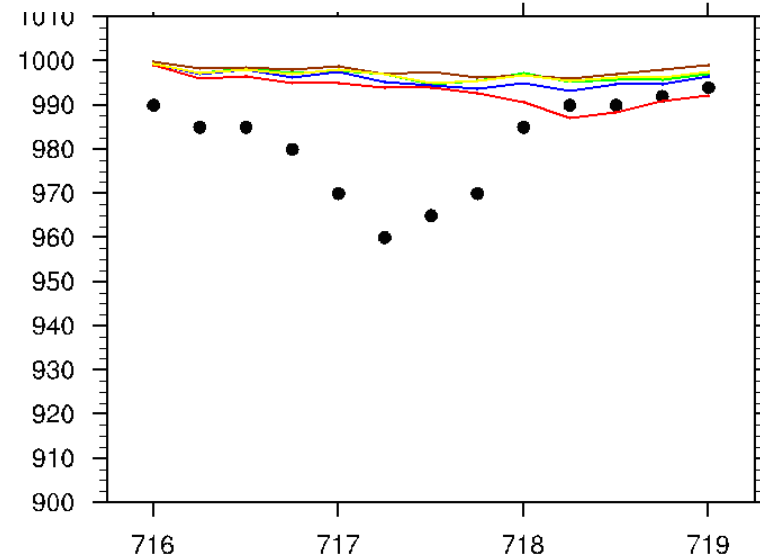
# Typhoon Kalmaegi (2008/0716)



~ 0000 UTC 16 July 2008 for 72 h

- BTrack<sub>ip</sub>
- None
- Dropsonde ( 6 points )
- GPS ( 15 points )
- GTS ( with QuikSCAT data )
- SSM/I

**A challenging case!**



Drop: Choose 7/16 0000 UTC (0h) ~ +12h for data assimilation

**Int:30 mm**

**2nd day**

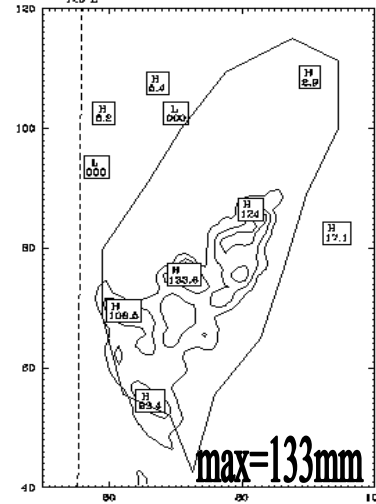
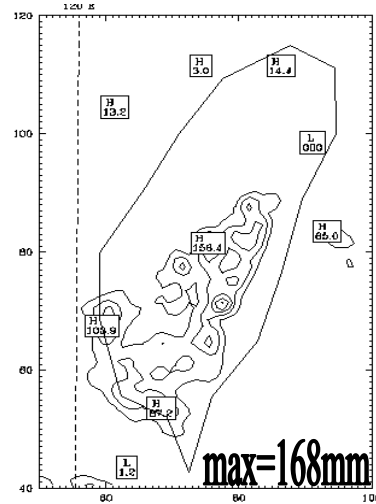
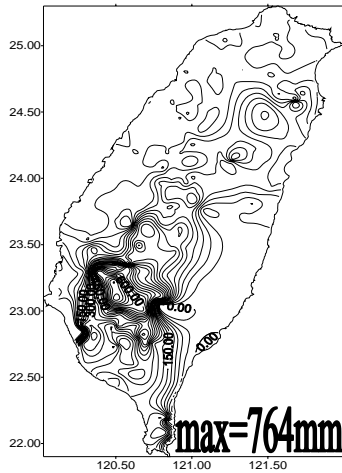
# Kalmaegi

**OBS**

**None**

**GPS**

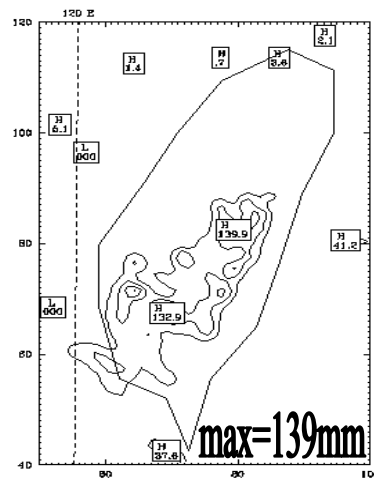
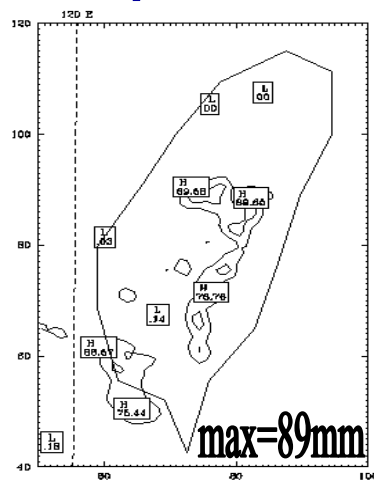
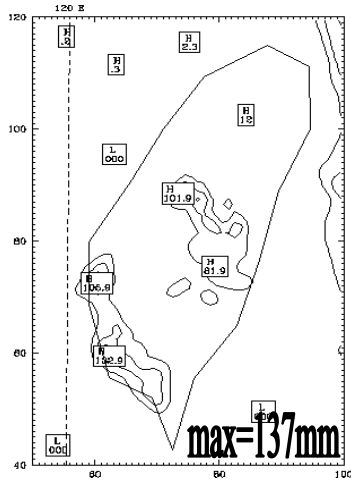
**WRF simulated 24-h  
accumulated rainfall (mm)  
(0717 0000 – 0718 0000 UTC)**



**GTS**

**Drop**

**SSM/I**

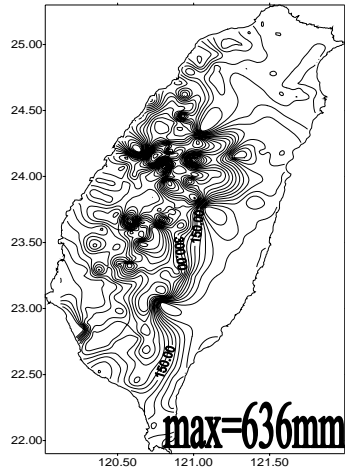


**Int:30 mm**

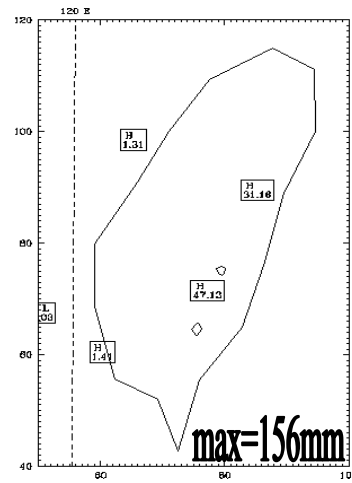
**3rd day**

# Kalmaegi

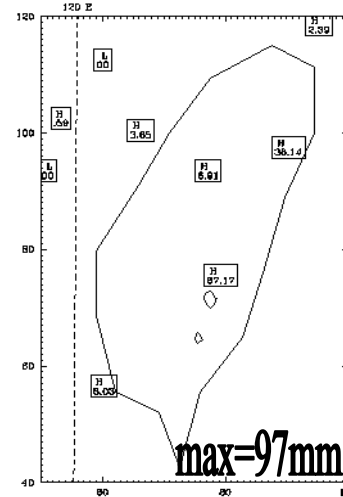
**OBS**



**None**

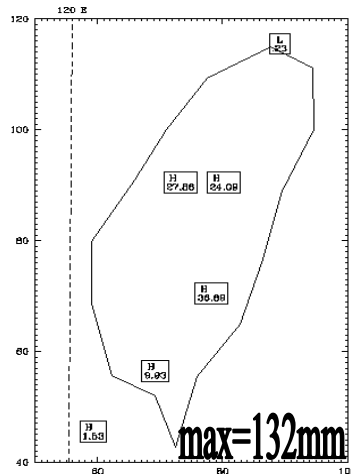


**GPS**

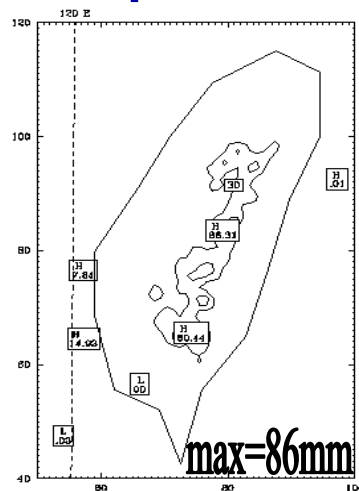


**WRF simulated 24-h  
accumulated rainfall (mm)  
(0718 0000 – 0719 0000 UTC)**

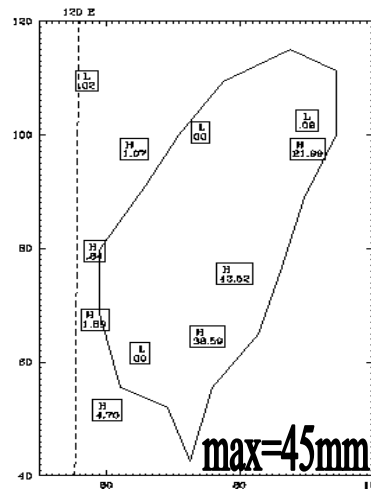
**GTS**



**Drop**

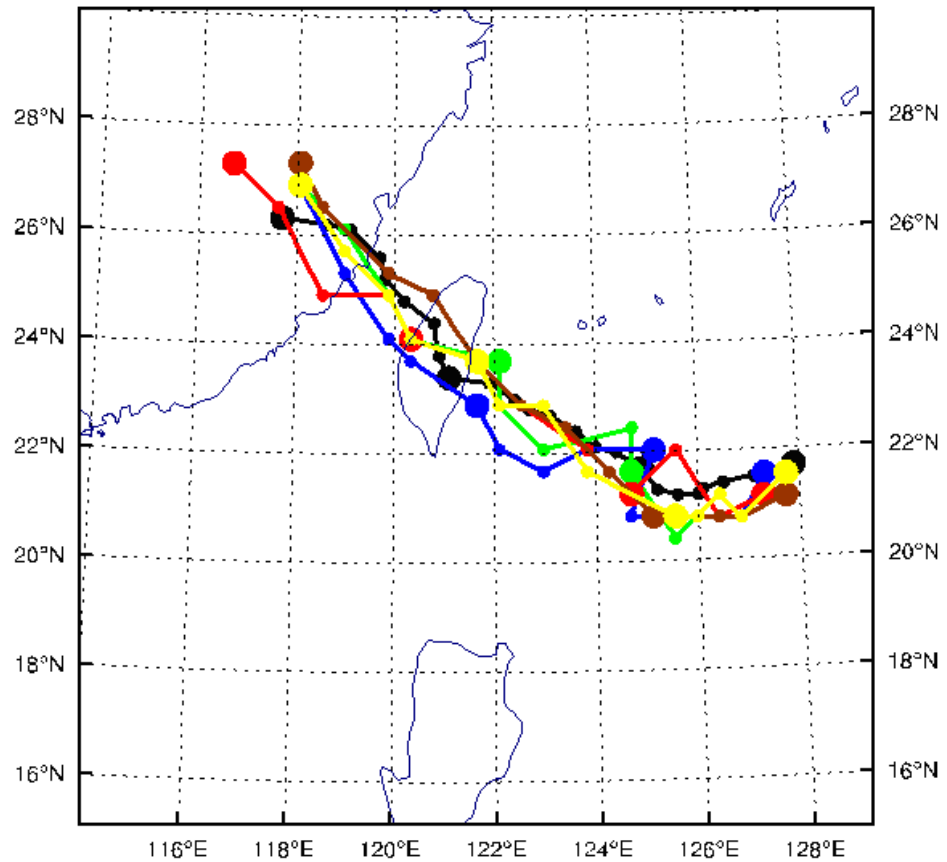


**SSM/I**

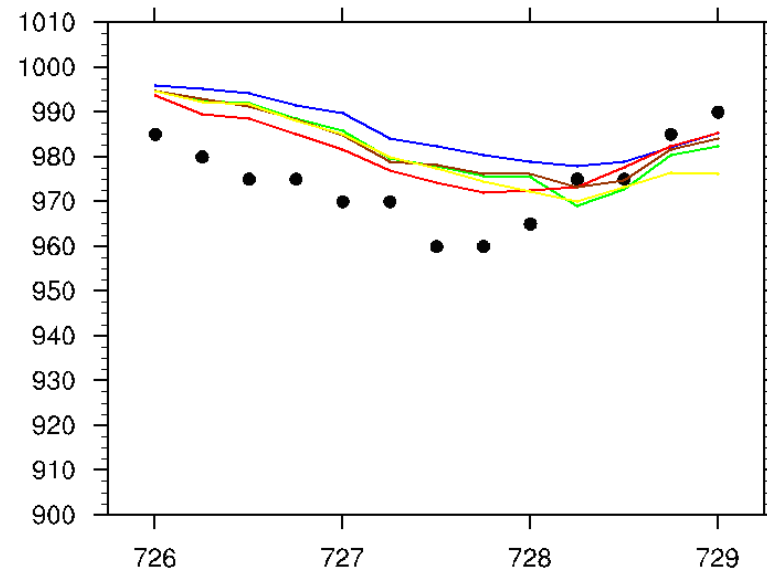


# Fung-Wong (2008/0726)

~ 0000 UTC 26 July 2008 for 72 h



- BTrack\_ip
- None
- Dropsonde ( 7 points )
- GPS ( 43 points )
- GTS ( with QuikSCAT data )
- SSM/I



Int:30 mm

2nd day

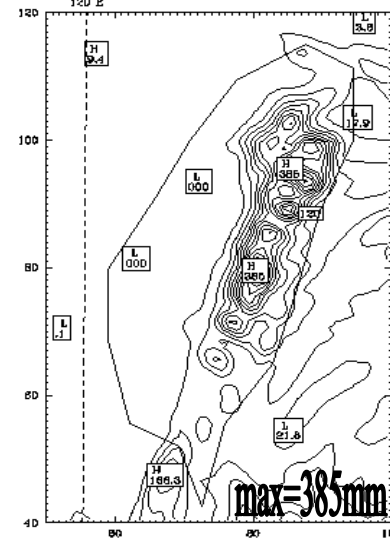
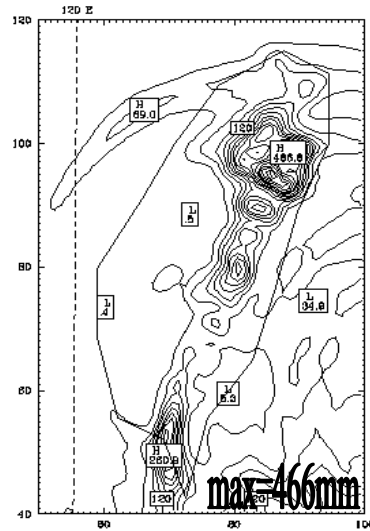
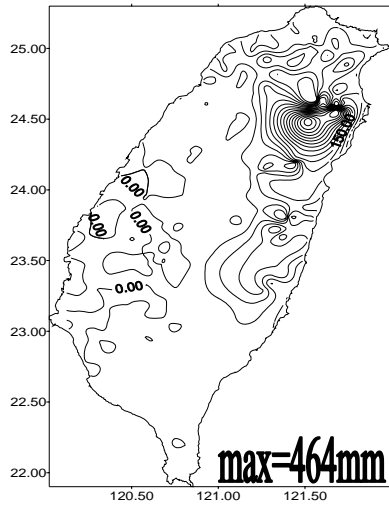
# Fung-Wong

OBS

None

GPS

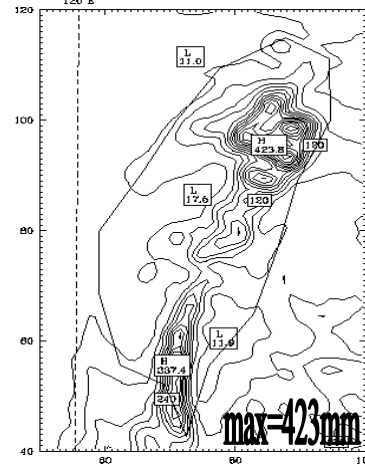
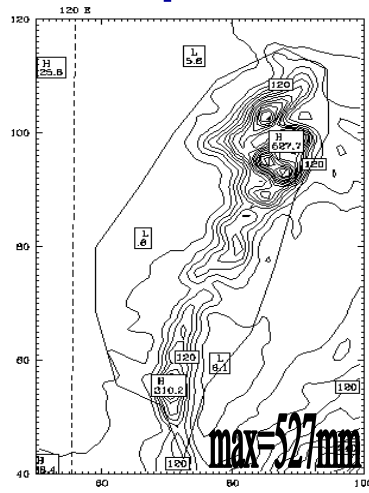
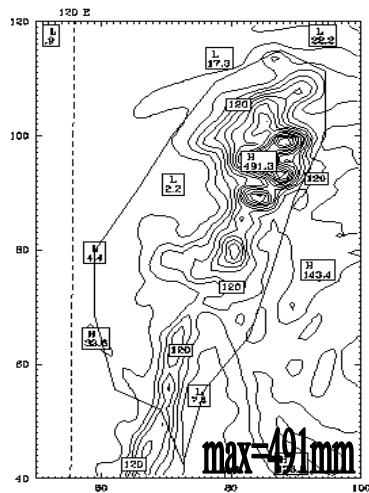
WRF simulated 24-h  
accumulated rainfall (mm)  
(0727 0000 – 0728 0000 UTC)



GTS

Drop

SSM/I



Int:30 mm

3rd day

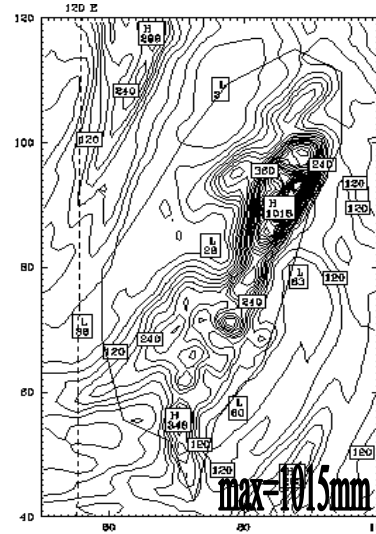
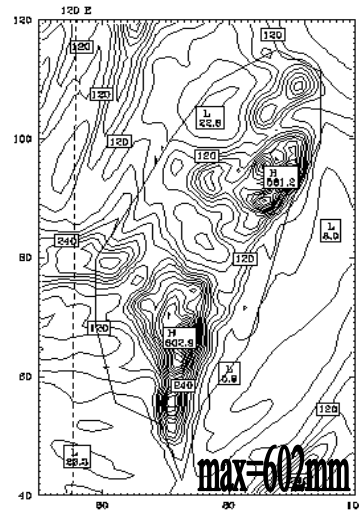
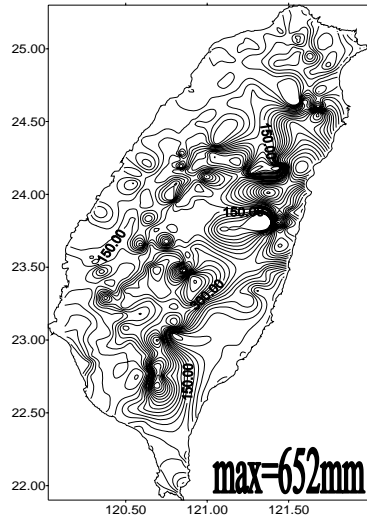
# Fung-Wong

OBS

None

GPS

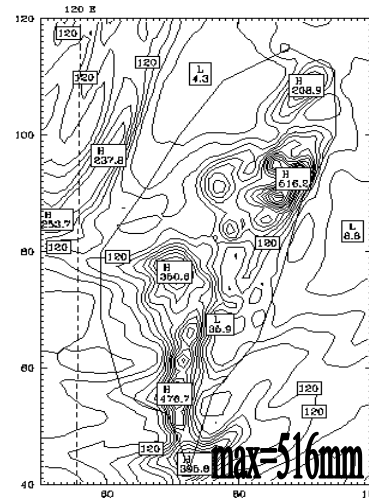
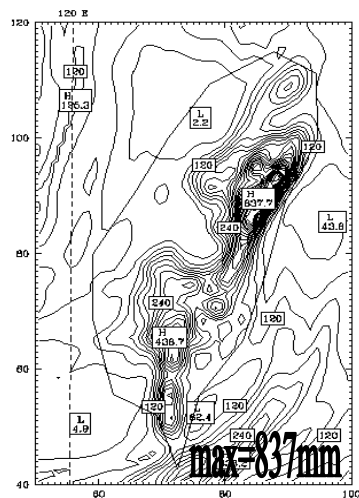
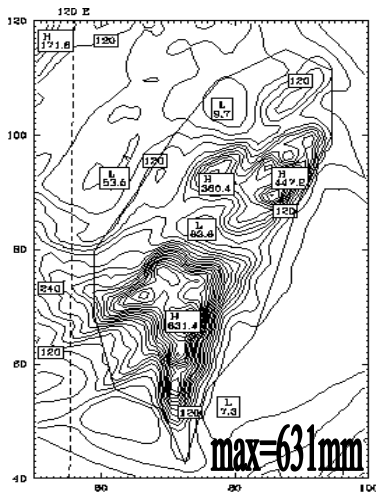
WRF simulated 24-h  
accumulated rainfall (mm)  
(0728 0000 – 0729 0000 UTC)



GTS

Drop

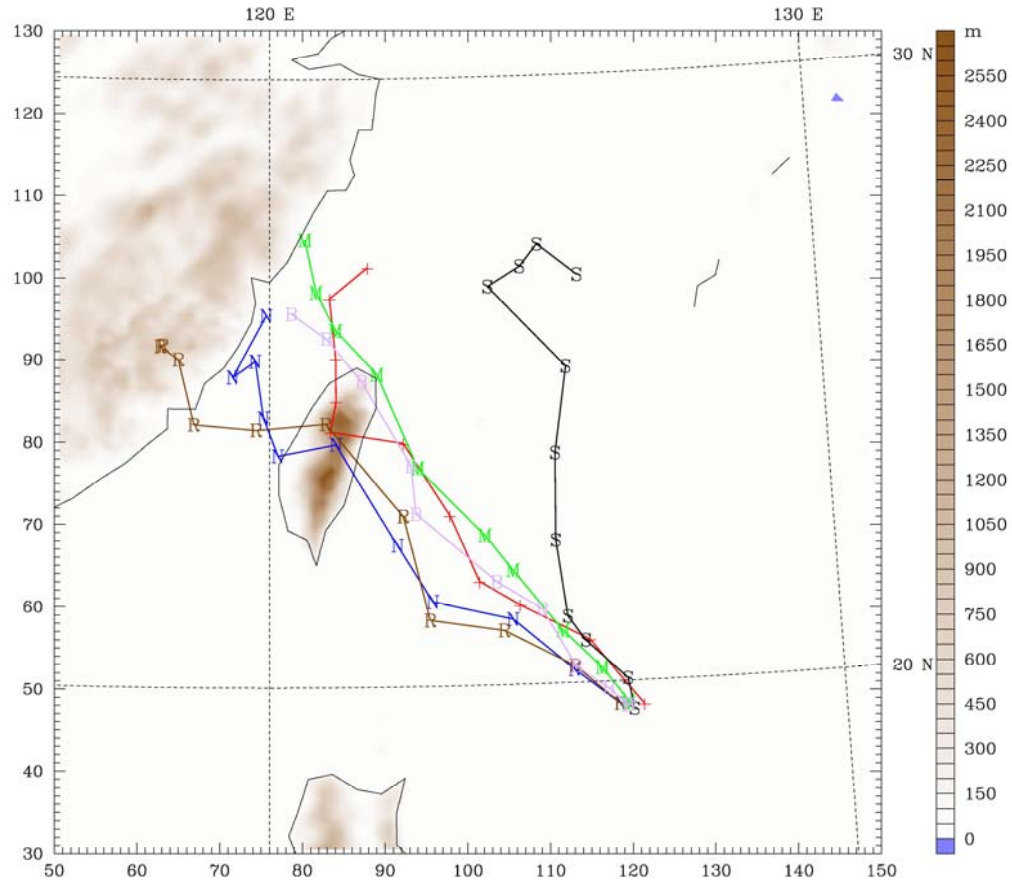
SSM/I



# Typhoon Jangmi - 0000UTC 27 Sept. 2008

| <b>Descriptions of the numerical experiments</b> |  |
|--|--|
| <i>Experiments</i>                               | <i>Assimilated data</i>  |
| <b>NONE</b>                                      | <b>No data assimilated ◦</b>   |
| <b>EPH</b>                                       | <b>Used cv options 3 as background error (BE) and GPS data by using nonlocal operator ◦</b>              |
| <b>EPH+TCBOG_S</b>                               | <b>Same as experiment EPH, but typhoon bogus vortex is also Assimilated (ROUT=300 km, R34=150 km ) ◦</b> |
| <b>EPH+TCBOG_M</b>                               | <b>Same as experiment EPH, but typhoon bogus vortex is also Assimilated (ROUT=500 km, R34=280 km) ◦</b>  |
| <b>EPH+TCBOG_B</b>                               | <b>Same as experiment EPH, but typhoon bogus vortex is also Assimilated (ROUT=600 km, R34=300 km) ◦</b>  |

Dataset: jan no RIP: Track jan 6h Init: 0000 UTC Sat 27 Sep 08  
Fcst: 0.00 h Valid: 0000 UTC Sat 27 Sep 08 (0800 LST Sat 27 Sep 08)  
Terrain height AMSL.



Model Info: V2.2 M KF YSU PBL Lin et al Noah LSM 15 km, 34 levels, 60 sec  
LW: RRTM SW: Dudhia DIFF: simple KM: 2D Smagor

**N : None**

**R : EPH (27 points)**

**S : EPH+TCBOG\_S**

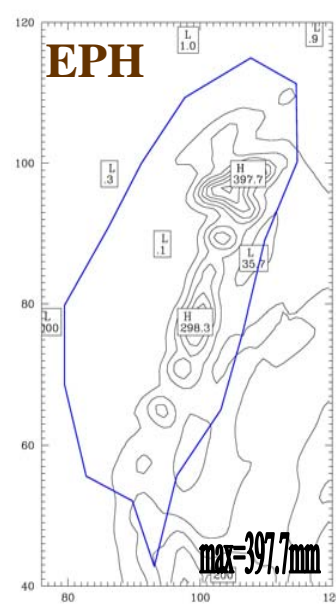
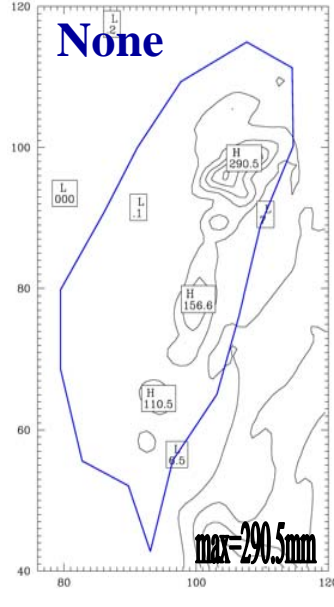
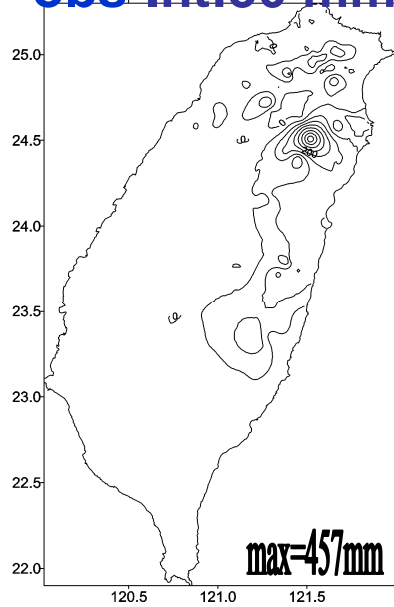
**M : EPH+TCBOG\_M**

**B : EPH+TCBOG\_B**

**+ : Best track**

**Intense Typhoon Jangmi- 0000UTC 27 September 2008**

obs Int:50 mm

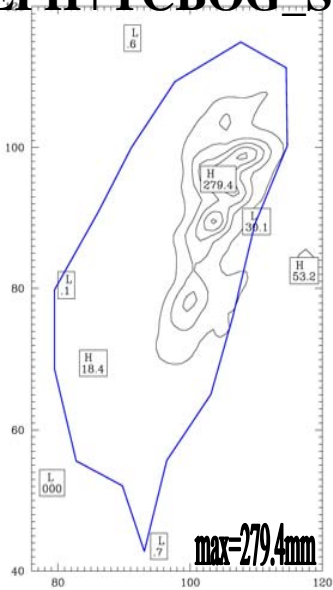


# Jangmi -2008/09

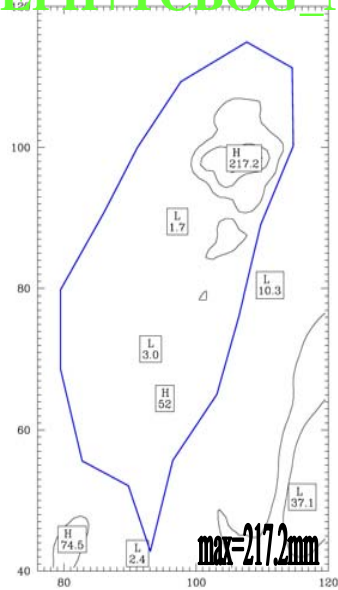
WRF simulated 24-h accumulated rainfall (mm)  
(0927 0000 - 0928 0000 UTC)

1st day

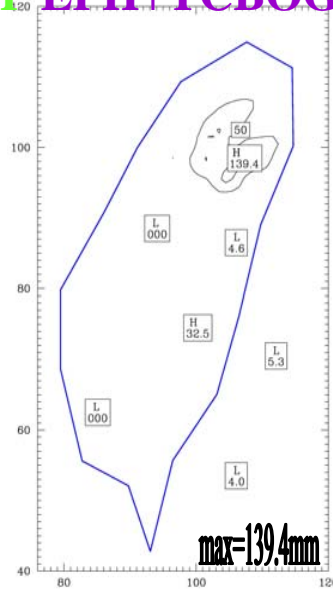
EPH+TCBOG\_S



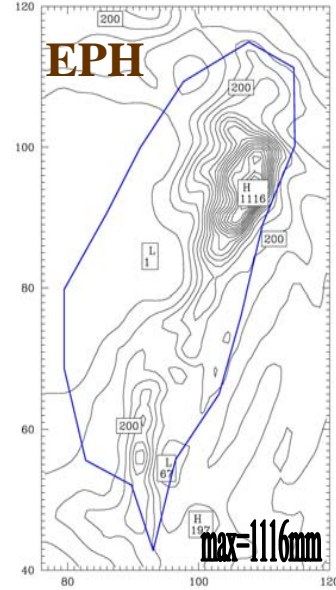
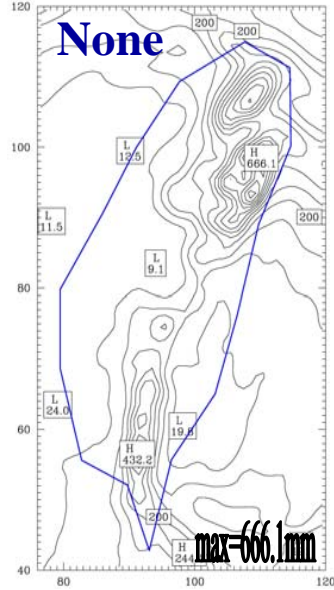
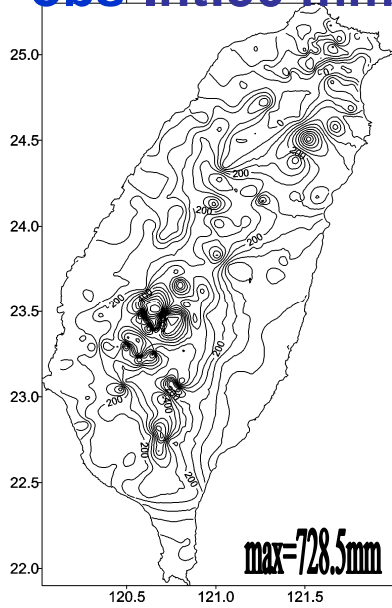
EPH+TCBOG\_M



EPH+TCBOG\_B



obs Int:50 mm



# Jangmi -2008/09

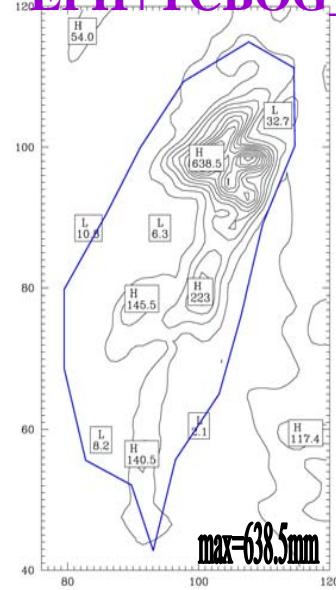
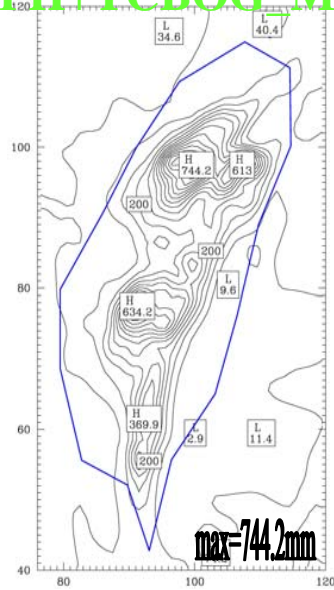
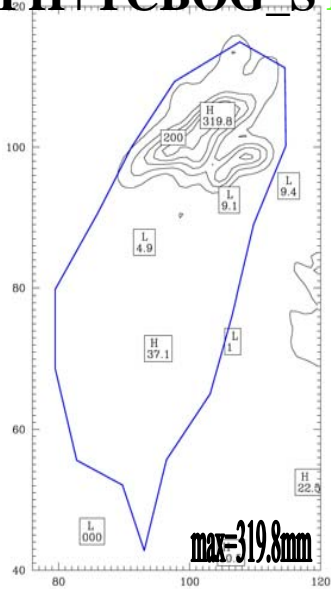
WRF simulated 24-h accumulated rainfall (mm)  
(0928 0000 - 0929 0000 UTC)

2nd day

EPH+TCBOG\_S

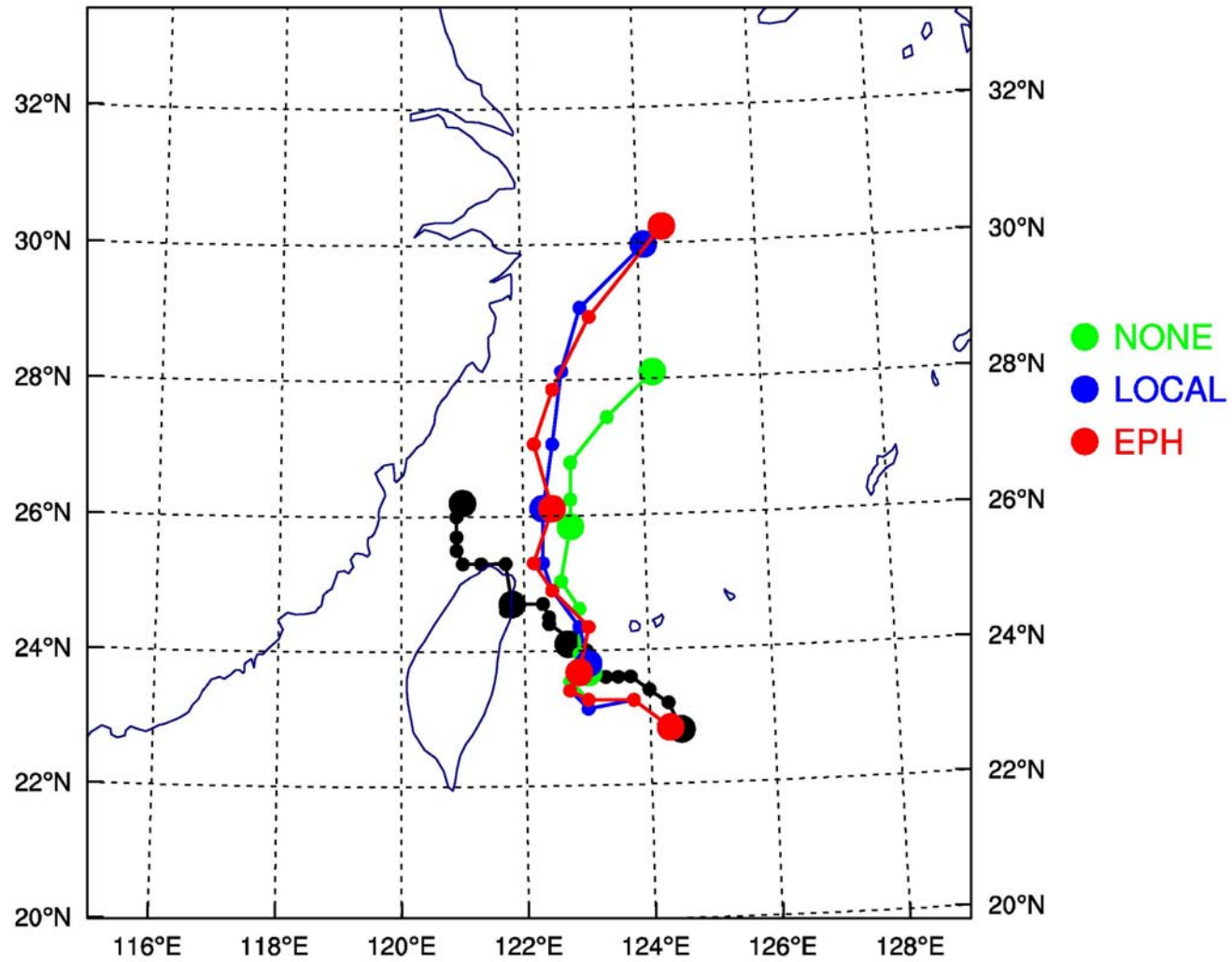
EPH+TCBOG\_M

EPH+TCBOG\_B



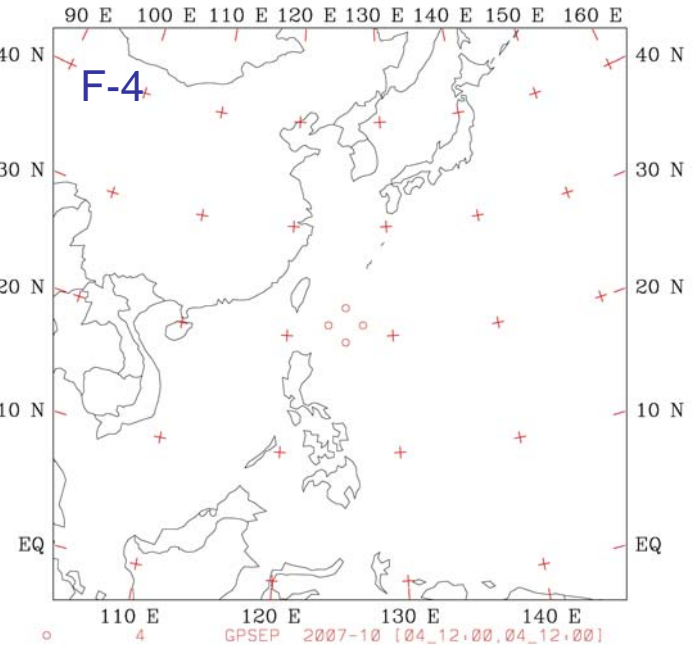
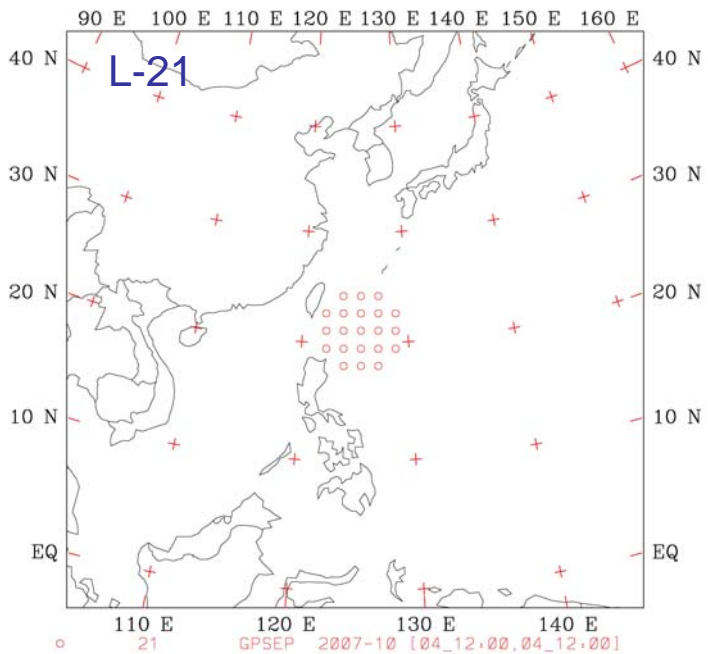
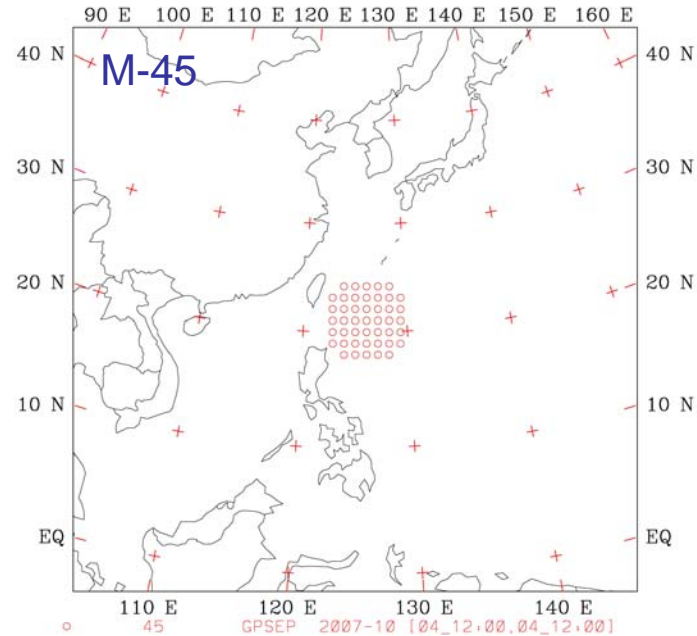
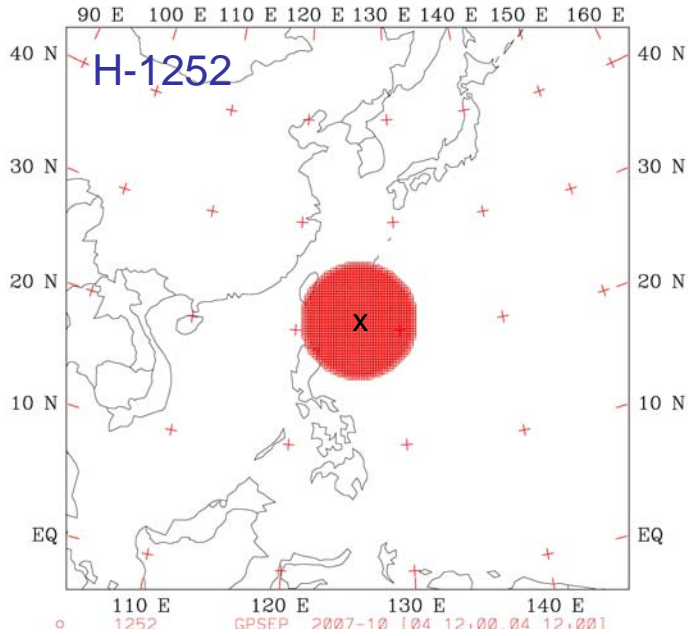
# Typhoon Sinlaku - 0000UTC 11 Sept. 2008

Typhoon Sinlaku



# An OSSE Study for Typhoon Krosa

- Perform 96-h MM5 simulation (400x400, 15 km resolution) with an initial Rankine vortex at 0400 Oct. 2007, served as the nature run.
- Retrieve RO soundings by running a 2-D ray-tracing model with the input of the nature run to obtain bending angles (assuming uniform 45° azimuthal angle) and the inverted RO refractivity in the region of the typhoon vortex circulation at 0412 Oct. 2007.
- Perform a linear filter to smooth the nature run at 0412 Oct. 2007 to provide the control run (as the first guess at coarser resolution)
- Perform WRF 3DVAR to assimilate the RO refractivity soundings (model local or retrieved) using the nonlocal operator and local operators at 041200 Oct. 2007.
- Compare the assimilation runs and control run with the nature run.

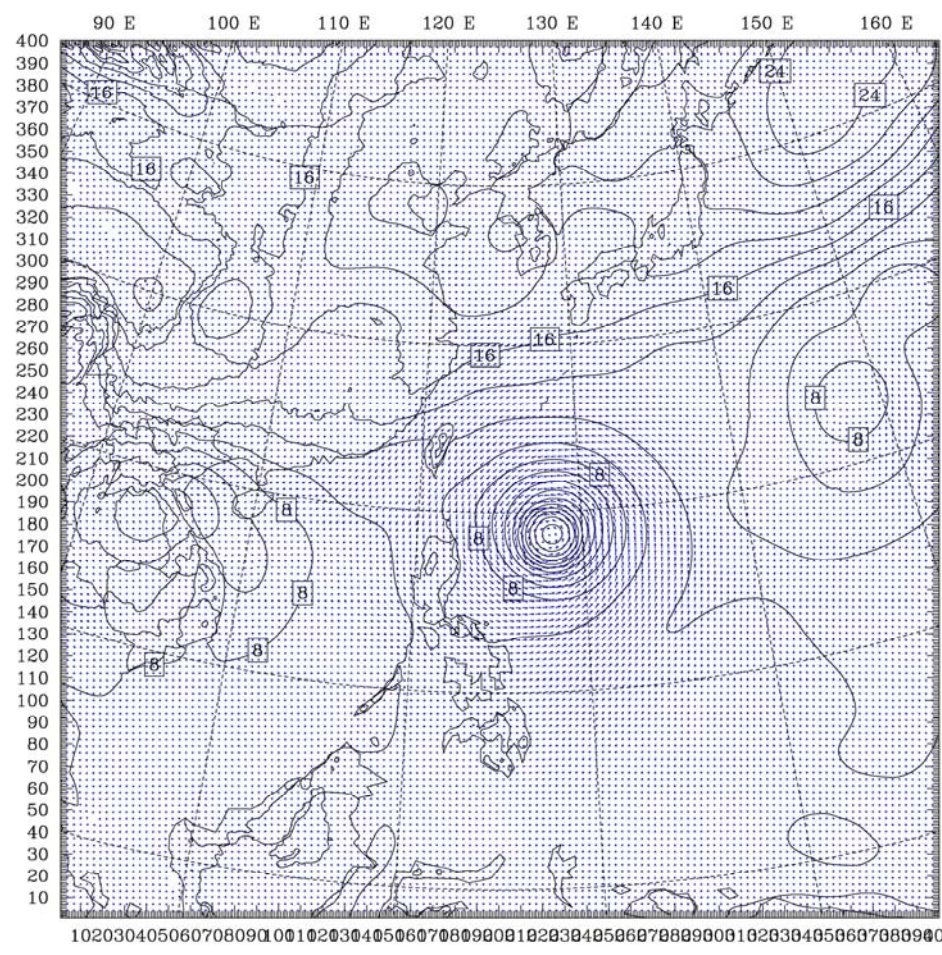


: nature RIP: osse  
 0.00 h  
 e pert. (from WRF std. atm.)  
 tal wind vectors

Init: 0000 UTC Thu 04  
 Valid: 0000 UTC Thu 04 Oct 07 (0800 LST Thu 04 Oct 07)  
 at k-index = 30

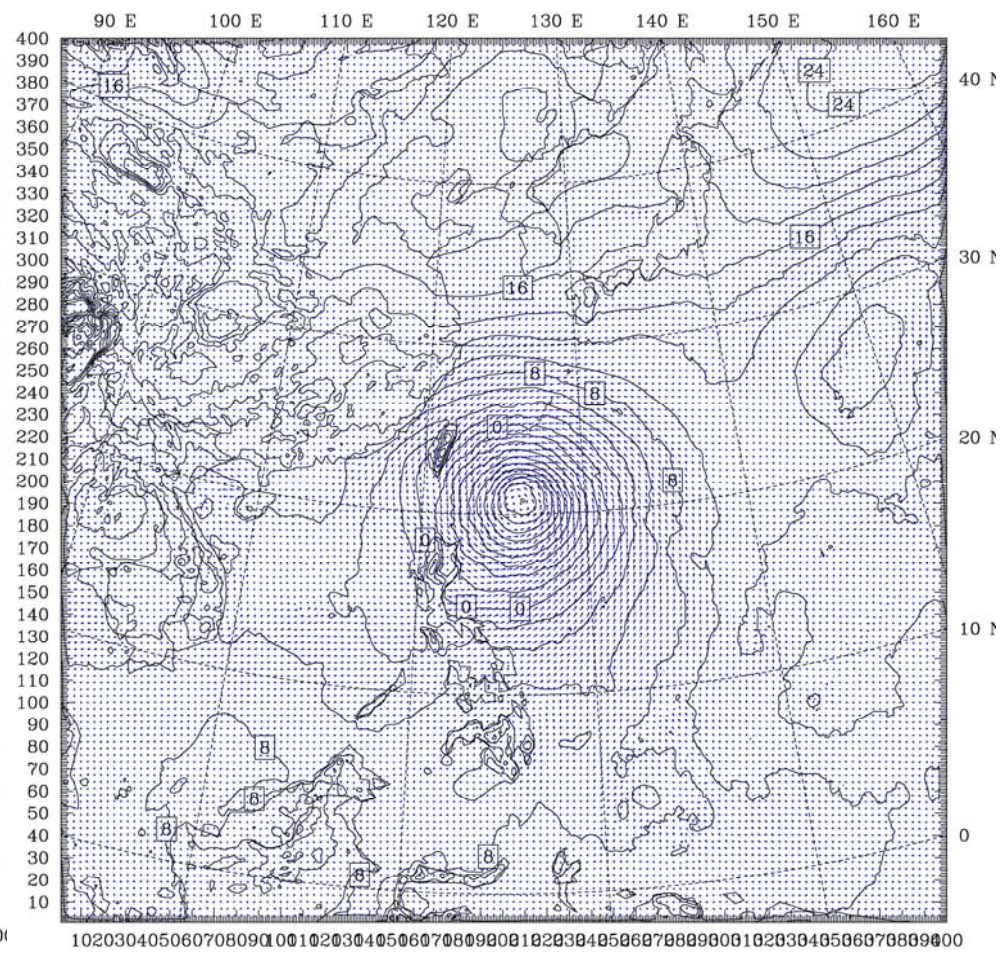
: nature RIP: osse  
 12.00 h  
 re pert. (from WRF std. atm.)  
 tal wind vectors

Init: 0000 UTC Thu 04  
 Valid: 1200 UTC Thu 04 Oct 07 (2000 LST Thu 04 Oct 07)  
 at k-index = 30



MAXIMUM VECTOR: 39.5 m s<sup>-1</sup>  
 CONTOURS: UNITS=hPa LOW=-10.000 HIGH= 26.000 INTERVAL= 2.000  
 Model info: V3.7.0 Grell MRF PBL Simple ice 15 km, 30 levels, 30 sec

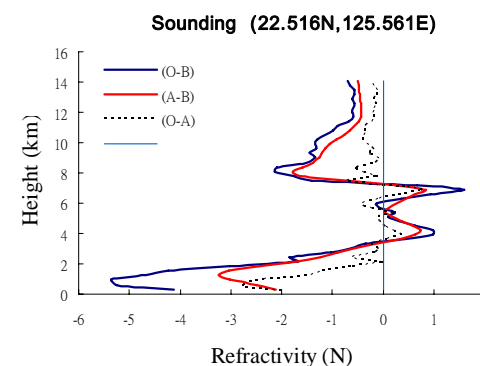
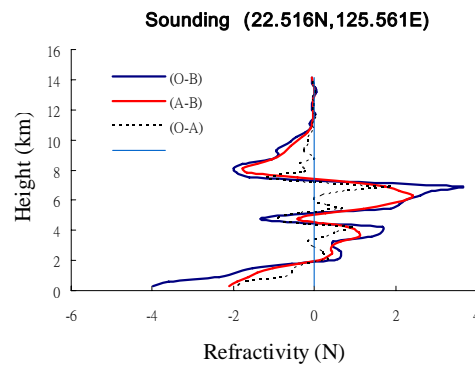
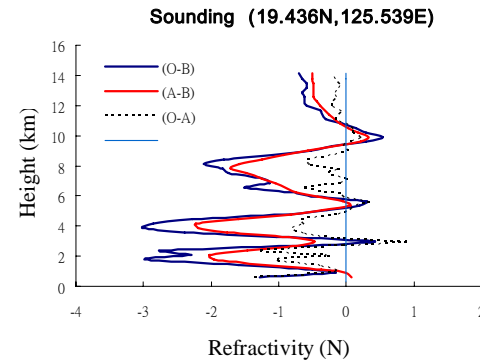
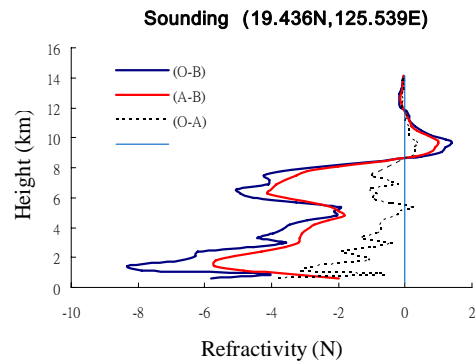
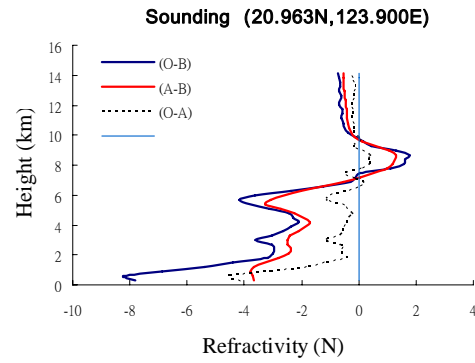
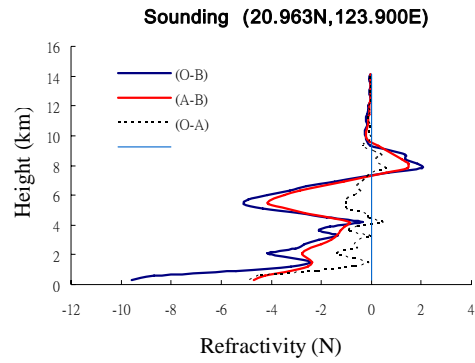
**Nature run at 0000UTC 04**



MAXIMUM VECTOR: 26.6 m s<sup>-1</sup>  
 CONTOURS: UNITS=hPa LOW=-20.000 HIGH= 24.000 INTERVAL= 2.000  
 Model info: V3.7.0 Grell MRF PBL Simple ice 15 km, 30 levels, 30 sec

**Nature run at 1200UTC 04**

| Experiments                          | Remarks  |
|--------------------------------------|--|
| <b>NTR</b>                           | MM5 initialized with AVN analysis and a Rankine vortex of 200-km radius at 2007100400UTC at 15-km resolution. The model results at 2007100412UTC are used as the initial atmospheric state of a 2-D raytracing model which generates the GPS RO refractivity observations from the Abel inversion of the simulated bending angles. |
| <b>CTL</b>                           | Degraded NTR and the vortex circulation at 2007100412UTC to mimic the large-scale analysis.  |
| <b>LM_h</b>                          | As CTL but assimilating hypothetically high (1252) model local refractivity soundings (30-km resolution) surrounding the vortex center in the vortex <b>using the local operator (on obs.)</b>   |
| <b>LR_h</b>                          | As CTL but assimilating hypothetically high (1252) retrieved refractivity soundings (30-km resolution) surrounding the vortex center <b>using the local operator (on obs.)</b>   |
| <b>NR_x</b><br><b>(x=h, m, l, f)</b> | As CTL but assimilating retrieved refractivity soundings surrounding the vortex center <b>using the localized nonlocal operator</b> , where h, m, l and f indicate 1252, 45, 21 and 4 soundings, respectively.   |
| <b>NE_x</b><br><b>(x=h, m, l, f)</b> | As CTL but assimilating excess phase (EPH) soundings (30-km resolution) surrounding the vortex center <b>using the nonlocal operator</b>   |



**FIG.** Vertical profiles of the (O-B), (O-A) and (A-B) for West, South, North points of F-case where the observations (O) are from the nature run and the background field (B) uses the model initial condition of the control run and the analysis (A) is the result after 3DVAR for (a) the model local refractivity and (b) the retrieved refractivity used as observations.

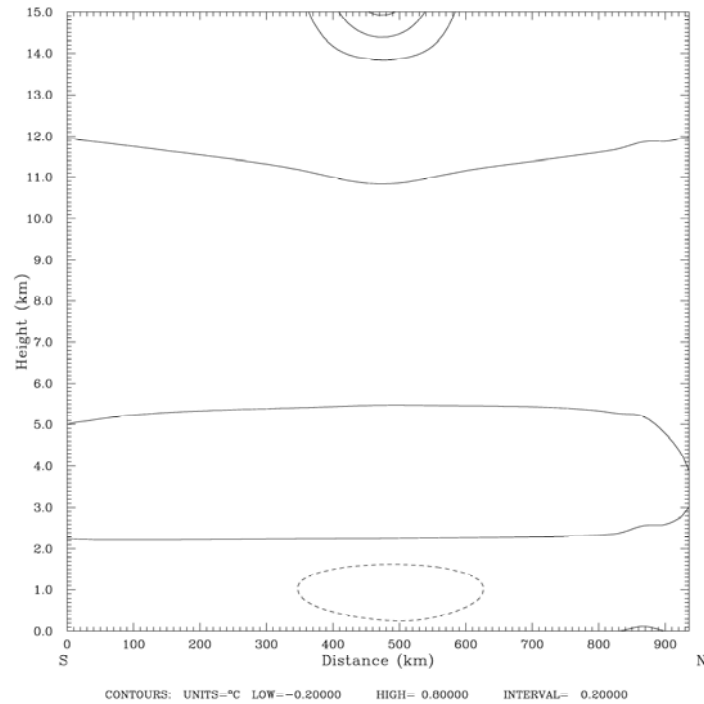
**With Model-N**

**With Retrieved-N**

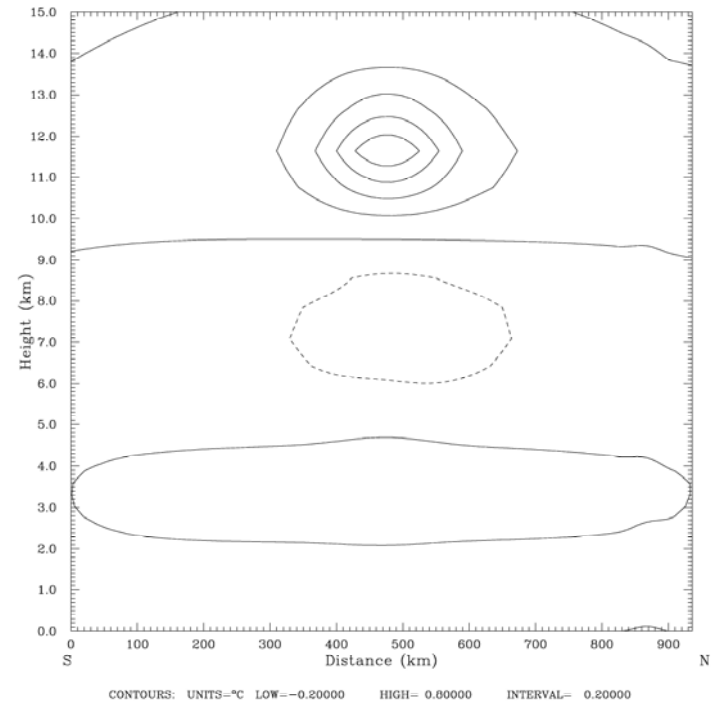
# Temperature increments along N-S cross-section through one sounding point

WRF 3D-VAR INCREMENT  
Fcst: 0.00 h      Valid: 1200 UTC Thu 04 Oct 07 (2000 LST Thu 04 Oct 07)  
Temperature      XY= 142.6,111.4 to 143.4,173.8  
(diff. from case=no, time= 0.00)

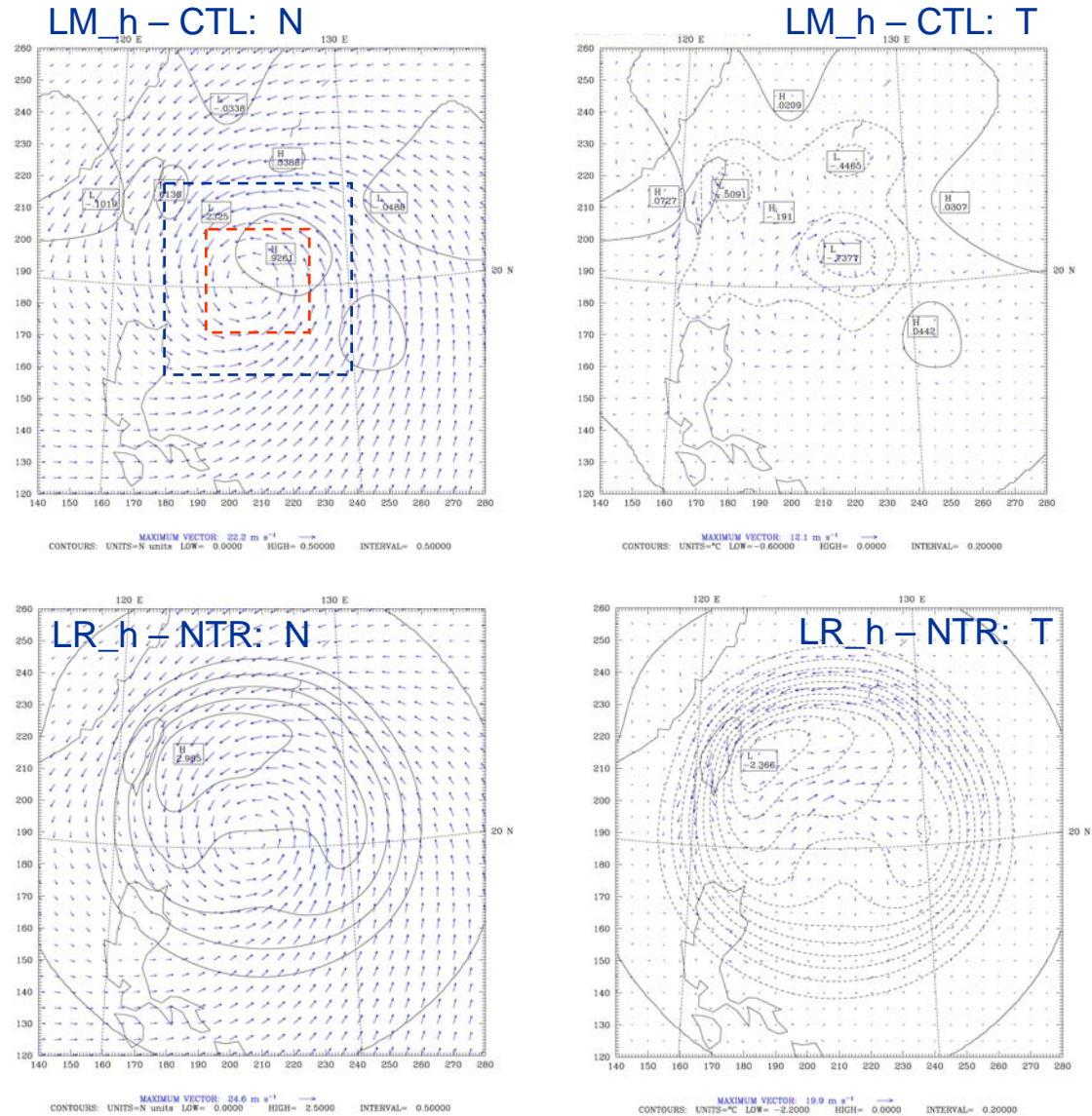
WRF 3D-VAR INCREMENT  
Fcst: 0.00 h      Valid: 1200 UTC Thu 04 Oct 07 (2000 LST Thu 04 Oct 07)  
Temperature      XY= 142.6,111.4 to 143.4,173.8  
(diff. from case=no, time= 0.00)



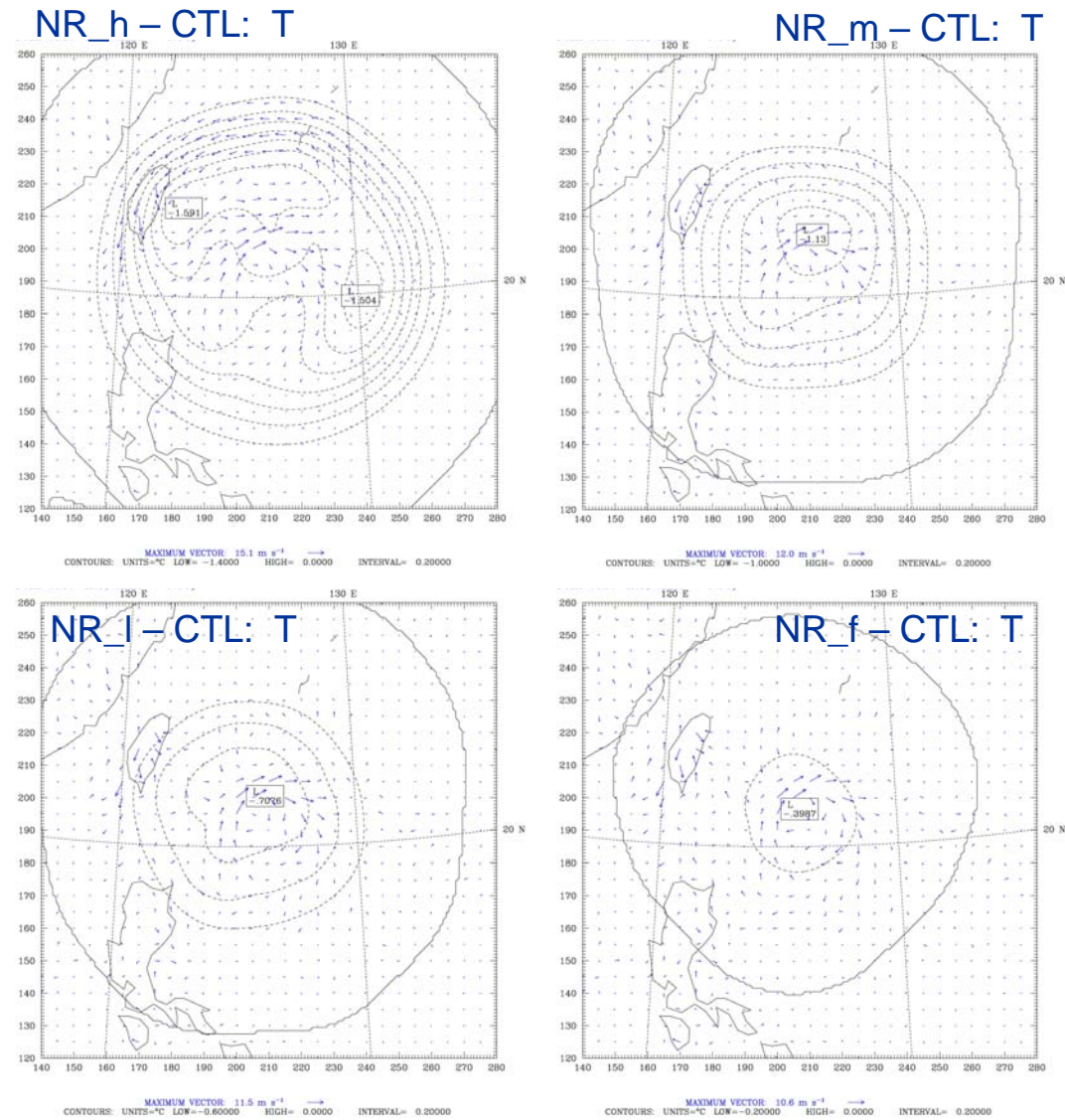
Model - NTR



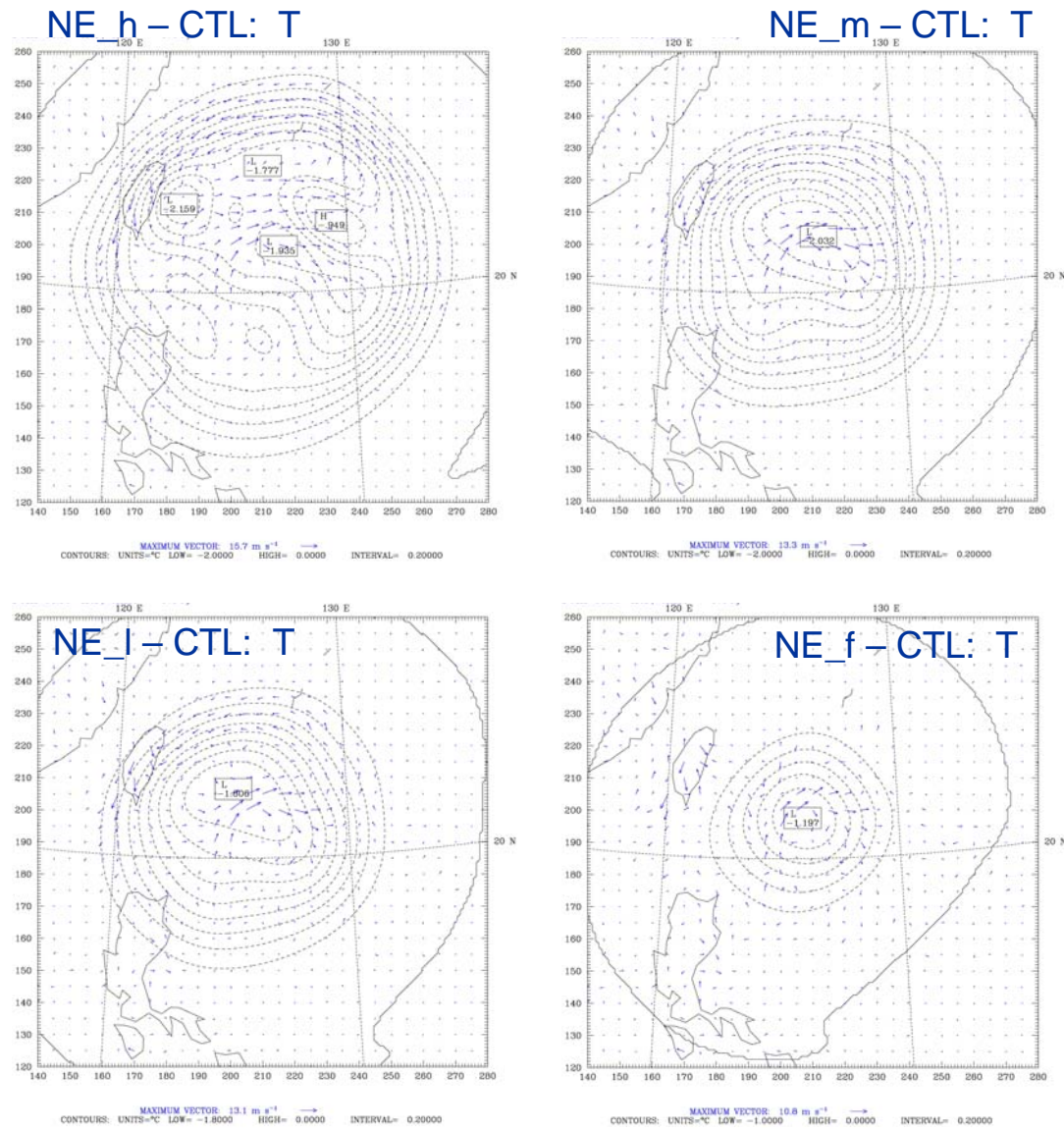
Retrieved - NTR



**FIG.** (a) The initial refractivity increments between LM\_h and CTL (control run) and wind for LM\_h near the surface (K=30) at 1200 UTC 04 October 2007, (b) as in (a) but for temperature increments at level K=22 (about 860 mb) and wind increments between LM\_h and NTR (nature run), (c) and (d) as in (a) and (b), respectively, but between LR\_h and NTR.



**FIG.** (a) The initial temperature and wind increments for NR\_h from CTL at level K=22 (about 860 mb), 1200 UTC 04 October 2007, and for (b) NR\_m, (c) NR\_l, and (d) NR\_f.



**FIG.** (a) The initial temperature and wind increments for NE\_h from CTL at level K=22 (about 860 mb), 1200 UTC 04 October 2007, and for (b) NE\_m, (c) NE\_l, and (d) NE\_f.

| From<br>NTR | U (m/s)        | V (m/s)        | T (K)          | Q (g/kg)                     | N (unit)                     |
|-------------|----------------|----------------|----------------|------------------------------|------------------------------|
| CTL         | 1.46 /<br>2.39 | 1.48 /<br>2.48 | 0.62 /<br>0.50 | 0.52 /<br>0.49               | 1.42 /<br>1.51               |
| LM_h        | 1.74 /<br>2.89 | 1.84 /<br>3.07 | 0.63 /<br>0.52 | <b>0.50 /</b><br><b>0.39</b> | <b>1.31 /</b><br><b>0.94</b> |
| LR_h        | 6.60 /<br>6.97 | 6.31 /<br>5.18 | 0.93 /<br>1.38 | 0.53 /<br>0.52               | 1.59 /<br>1.97               |
| NR_h        | 6.61 /<br>6.97 | 6.39 /<br>5.52 | 0.83 /<br>1.14 | 0.61 /<br>0.79               | 1.52 /<br>1.76               |
| NE_h        | 7.25 /<br>7.32 | 6.82 /<br>5.07 | 0.91 /<br>1.25 | 0.63 /<br>0.82               | 1.76 /<br>2.32               |
| NR_m        | 3.73 /<br>6.27 | 3.62 /<br>5.99 | 0.68 /<br>0.78 | 0.54 /<br>0.62               | 1.42 /<br>1.49               |
| NE_m        | 5.23 /<br>8.41 | 5.03 /<br>7.82 | 0.77 /<br>1.10 | 0.56 /<br>0.65               | 1.51 /<br>1.88               |
| NR_l        | 2.67 /<br>4.41 | 2.64 /<br>4.27 | 0.65 /<br>0.63 | 0.53 /<br>0.54               | 1.42 /<br>1.50               |
| NE_l        | 4.64 /<br>7.52 | 4.49 /<br>7.12 | 0.74 /<br>0.99 | 0.54 /<br>0.60               | 1.47 /<br>1.73               |
| NR_f        | 1.60 /<br>2.75 | 1.61 /<br>2.76 | 0.62 /<br>0.51 | 0.52 /<br>0.49               | 1.42 /<br>1.50               |
| NE_f        | 2.41 /<br>4.69 | 2.33 /<br>4.46 | 0.64 /<br>0.61 | 0.52 /<br>0.50               | 1.43 /<br>1.56               |

RMSE:

Larger zone/

Smaller zone

around the vortex

← Better Q, N, not U,V,T

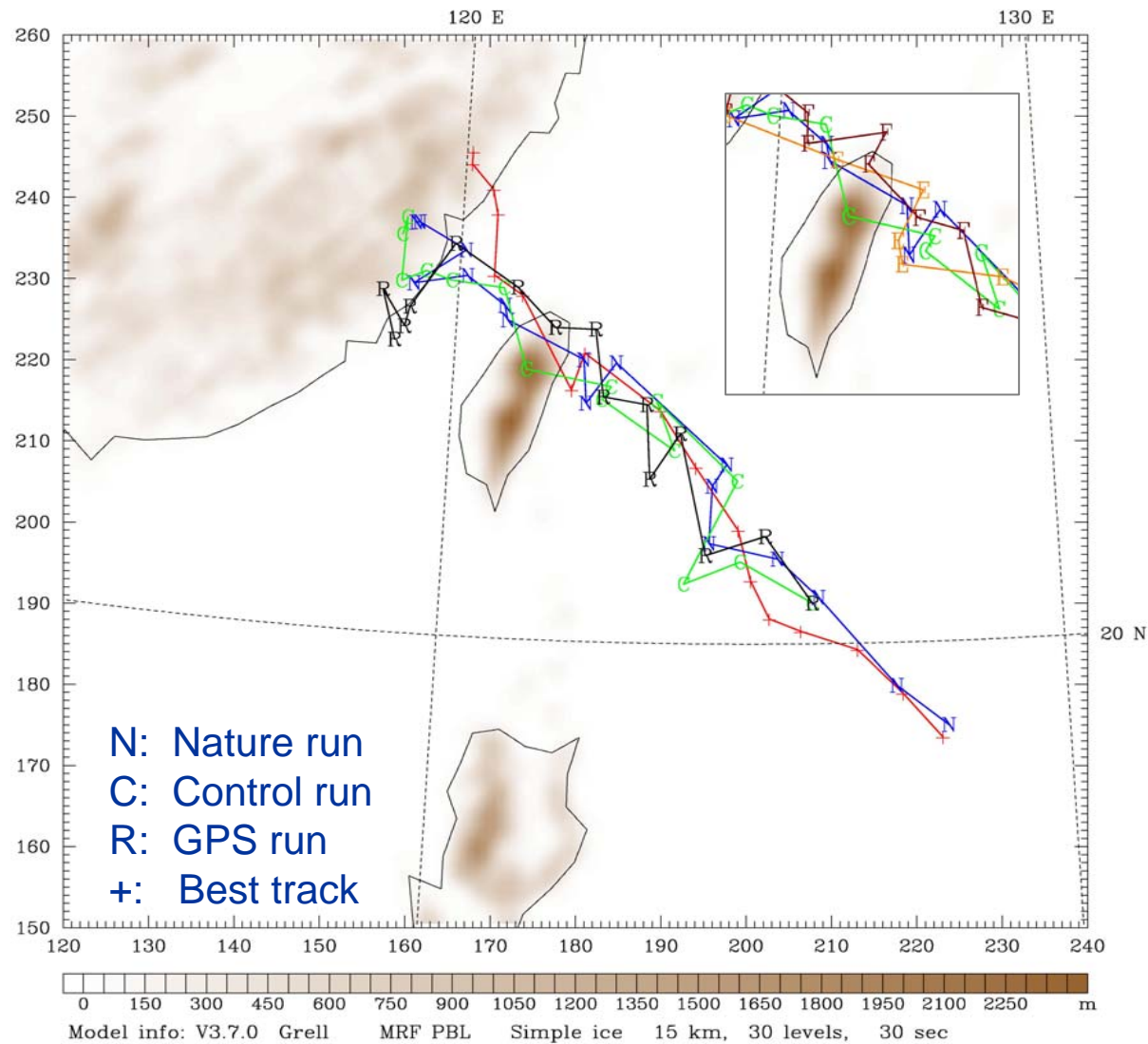
← Worse for high\_R !!

← Better NR than NE

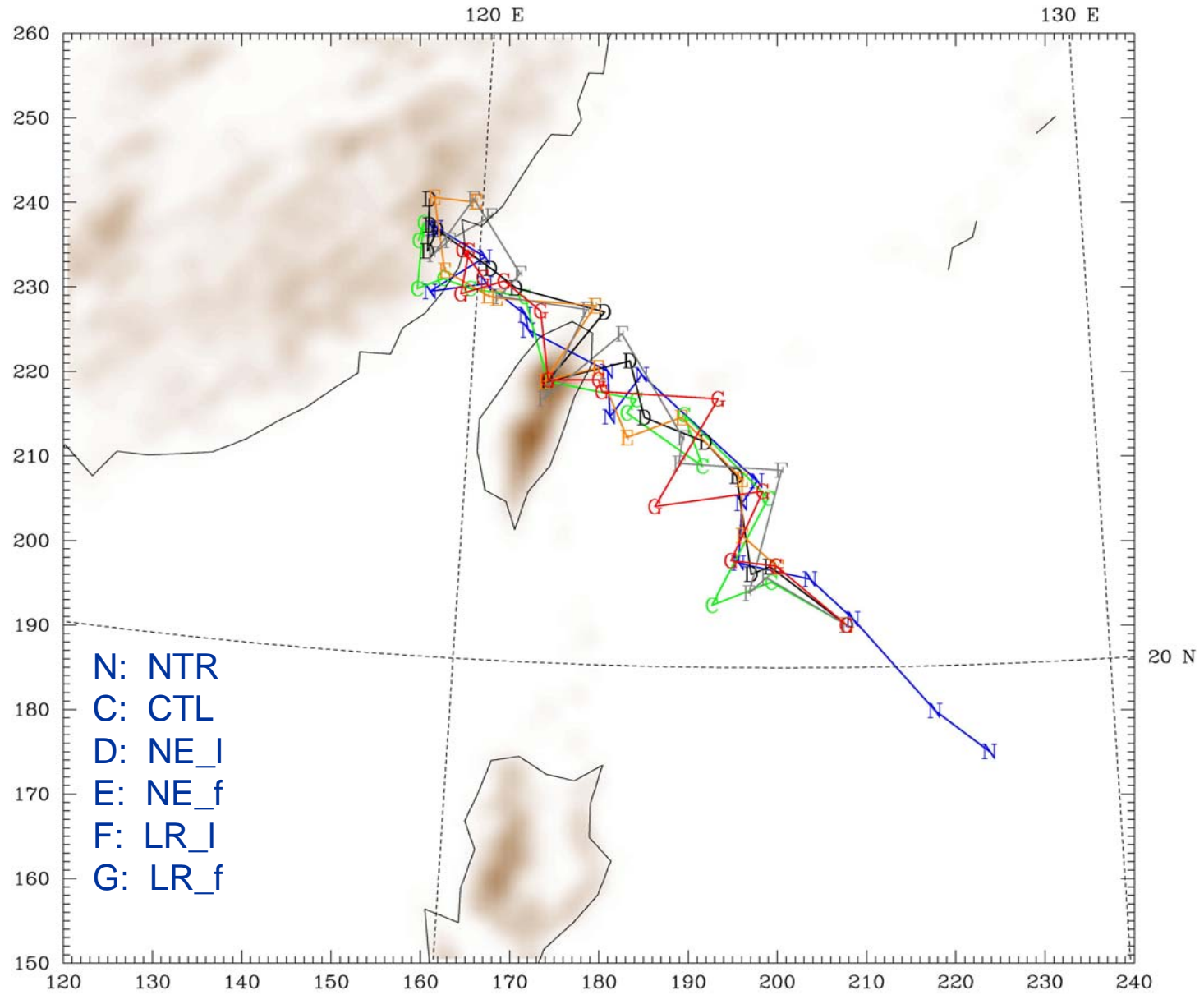
← Better NR than NE

← Better NR than NE

← Better NR than NE



**FIG.** The real best track (+) of Typhoon Krosa (2007), the simulated tracks of the nature run NTR (denoted by N), the control run CTL (C), and the assimilation runs LR\_h using the local operator (R), NE\_h using the nonlocal operator (E), and NE\_m using the nonlocal operator (F).

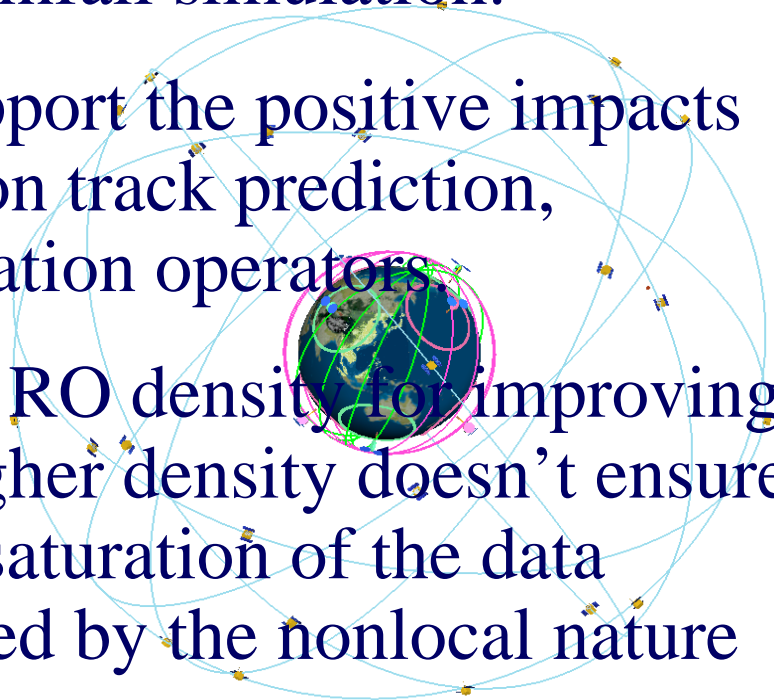


**Both tracks of simulations with 21 and 4 RO points are similar**

# Conclusions

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- 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. Some positive impacts are also found for Mei-yu front rainfall simulation.
- The OSSE studies tend to support the positive impacts of the GPS RO data on typhoon track prediction, regardless of different assimilation operators.
- There might exists an optimal RO density for improving typhoon prediction. Much higher density doesn't ensure further improvement, due to saturation of the data information that can be exposed by the nonlocal nature of refractivity.



Thanks for your attention.