

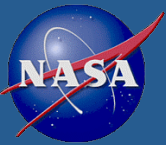
# The Experimental HWRF-HEDAS system:

## Model Evaluation in Preparation for Satellite Microwave Data Assimilation Inside the Hurricane Precipitation Area

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Tomislava Vukicevic<sup>2</sup>, Ziad Haddad<sup>1</sup> and Thiago Quirino<sup>2</sup>

<sup>1</sup> Jet Propulsion Laboratory, California Institute of Technology, Pasadena, CA, 91109

<sup>2</sup> NOAA/Hurricane Research Division/Atlantic Oceanographic Meteorological Laboratory, Miami, FL

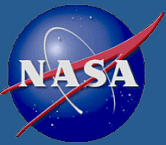


# Motivation – the large-scale models

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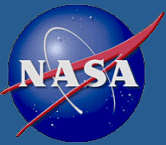
- Data assimilation of satellite observations outside precipitation has lead to significant improvement in the global models' representation of the synoptic environment.
  - This resulted in measured improvement in their hurricane track forecast skill.
- Improving the forecast accuracy of hurricane intensity changes remains very challenging because of:
  - limited ability, due to the use of convective parameterizations
  - Cannot resolve convective scale events and their interaction with the large-scale environment.



# Motivation – the regional models



- **Inner-core dynamics are important - need to properly reflect small scale complex processes**
  - **high-resolution regional models**
  - **realistic physical parameterizations**
- There is still large uncertainty regarding the assumptions used by the convective-scale parameterizations:
  - parameterizations of the microphysical processes,
  - the boundary layer processes and
  - the ocean-atmosphere fluxes, etc.
- **Need to improve hurricane forecasts by**
  - **Validating and improving the models**
  - **Advanced assimilation of observations inside the hurricane precipitating core to produce a more realistic initialization of the asymmetric structure of the hurricane vortex.**



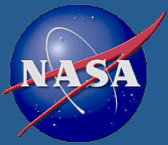
# How to Evaluate the Models

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- In situ observations to distinguish between different modeling approaches and improve on the most promising ones.
- These point measurements cannot adequately reflect the space and time correlations characteristic of the convective processes.
- An alternative approach to evaluating model physics is to use multi-parameter remote sensing observations.
- In doing so, we could compare modeled to retrieved geophysical parameters. The satellite retrievals, however, carry their own uncertainty.
- To increase the fidelity of the evaluation results, we should
  - **bring model and observations into a common analysis system**
  - **use instrument simulators to produce satellite observables from the model fields and compare to the observed.**
  - **Improve model forecast through data assimilation that also uses the instrument simulators**



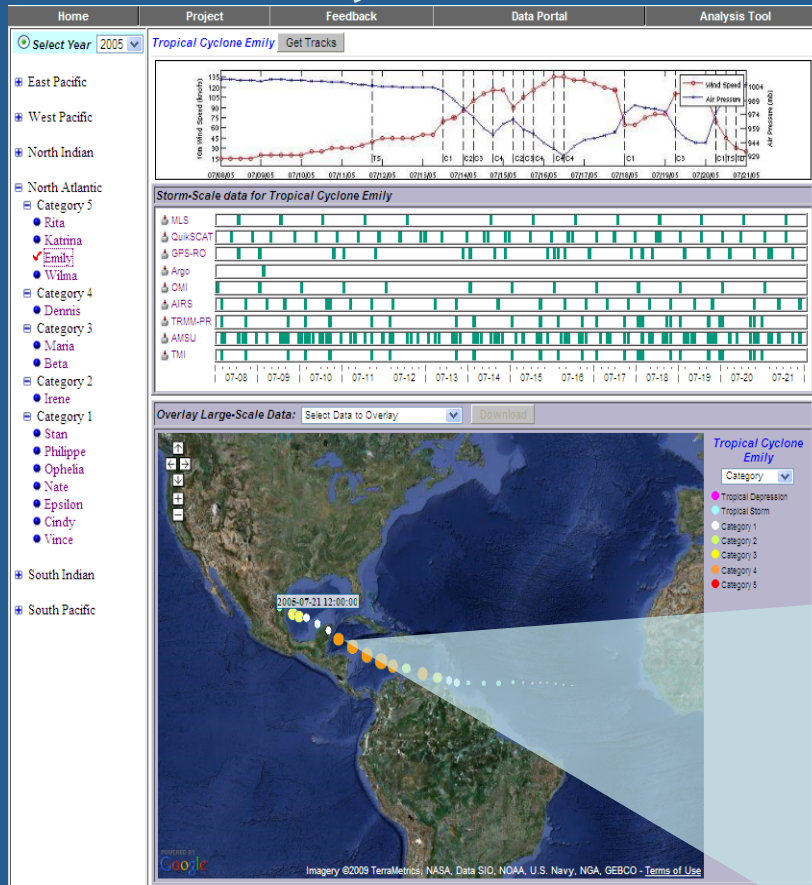


# Tropical Cyclone – Integrated Data Exchange and Analysis System (TC-IDEAS) –funded by NASA's Hurricane Science Research Program



Joint NASA Jet Propulsion Lab and Marshall Space Flight Center Project

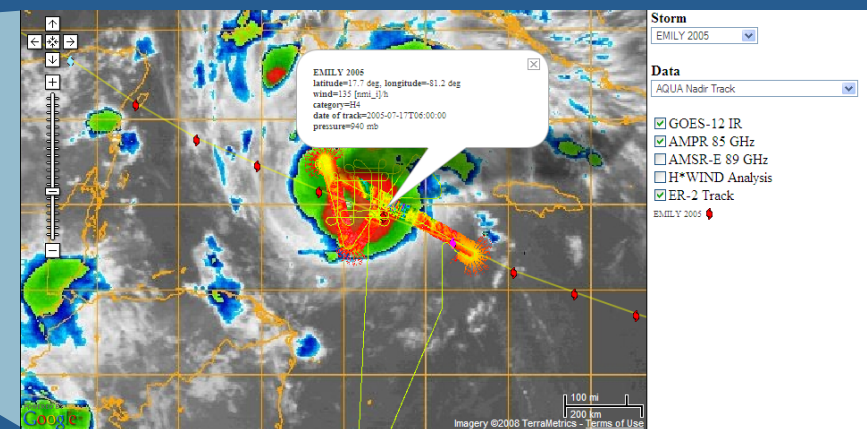
## The JPL iTCIS



Select by basin, name, or category with corresponding data availability timelines

**Objective:** To provide fusion of multi-parameter hurricane observations (satellite, airborne and *in-situ*) and model simulations with the purpose of:

- supporting both research and field campaigns
- understanding the physical processes
- improving hurricane forecast by facilitating model validation and data assimilation
- enabling the development of new algorithms, sensors and missions.



ER-2 /AMPR data overlaid on GOES IR

## TC-IDEAS

funded by NASA's  
Hurricane Science  
Research Program

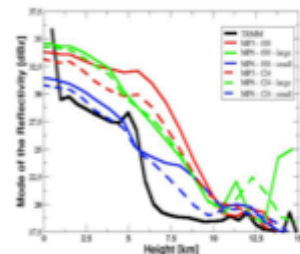
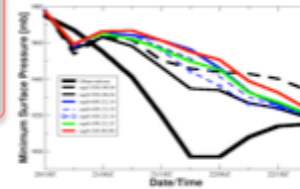
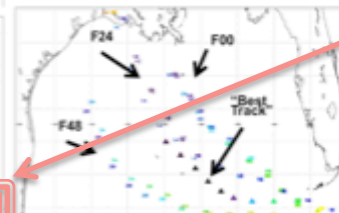
<http://tropicalcyclone.jpl.nasa.gov>  
TOPICAL CYCLONE DATA PORTAL



Simulation of radiometric  
signatures

- Radar Reflectivity and Attenuation
- Microwave Brightness Temperatures
- Surface Backscattering Cross-section

Comparison to Observations  
TRMM-PR; TRMM-TMI; QuikSCAT



Maximum Attenuated Reflectivity

CFADs

85 GHz Brightness Temperature

19 GHz Brightness Temperature

F00  
WSM3

Larger  
Particles  
(500.08.08)

F00  
WSM6

Larger  
Particles  
(500.08.04)

F00  
WSM6

Smaller  
Particles  
(300.80.40)

F24  
WSM6

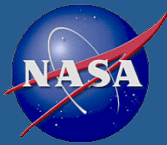
Larger  
Particles  
(500.08.04)

F24  
WSM6

Smaller  
Particles  
(300.80.40)

- Using instrument simulators and multiparameter satellite observations we can discriminate between WRF model forecasts using different microphysical assumptions.
- Assuming hydrometeor distributions with smaller particles results in model forecasts with radiometric signatures that are closer to observations.
- Will have impact in two ways:
  - providing guidance on the optimal set of physical parameterizations
  - improving the data assimilation outcome by designing model forecasts whose radiometric signatures are close to the observed ones, increasing the relative importance of the observations during the assimilation.
- Improved understanding of the PSD characteristics will lead to decrease in the uncertainty of satellite retrievals of precipitation.





# Hurricane Earl in the JPL GRIP portal

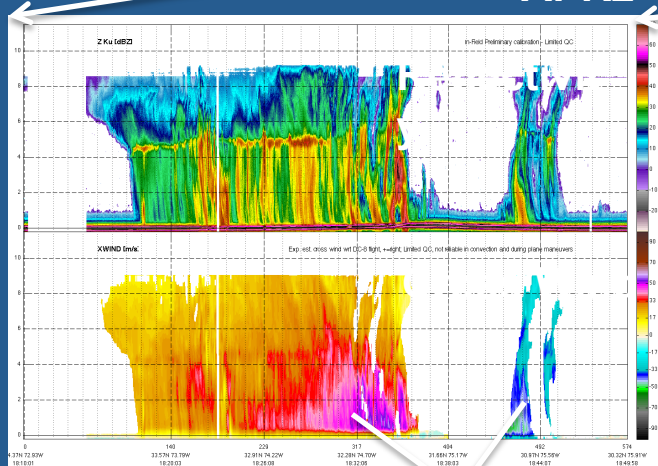


<http://grip.jpl.nasa.gov>

JPL participated with two instruments (**HAMS**R and **APR**2) and the **JPL GRIP portal** which blends satellite and airborne observations with model data. The dedicated portal was developed to facilitate the 2010 NASA/NOAA/NSF hurricane field campaigns

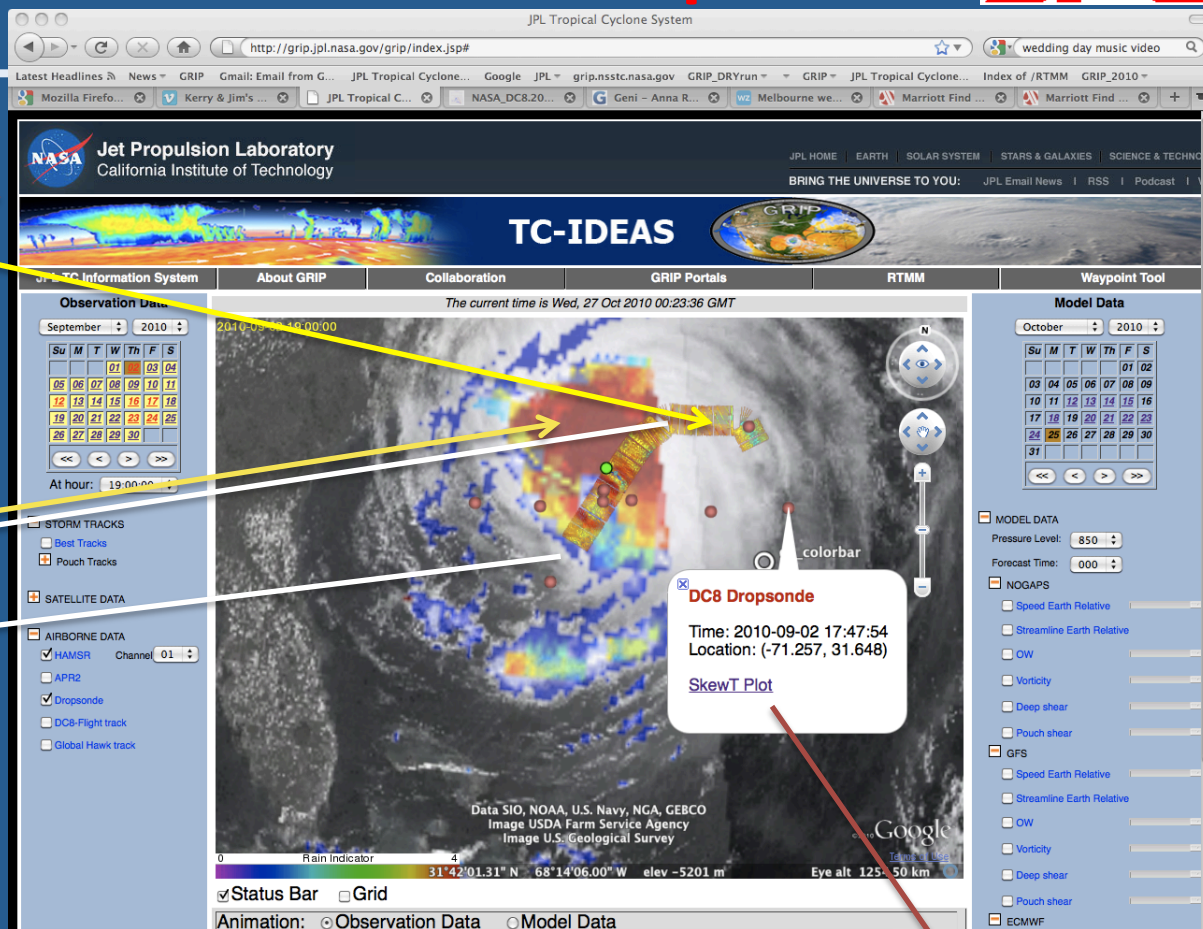
Rain from AMSR-E on AQUA

**APR2**

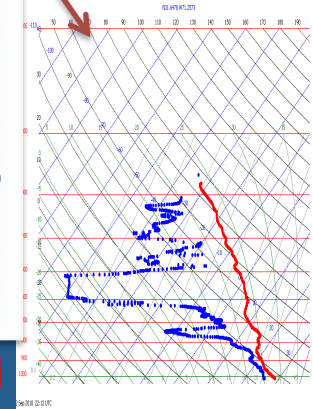


Note the change from positive to negative cross-wind flow as APR2 flies over the storm center, signifying the deep and intense cyclonic circulation.

**S. Durden, S. Hristova-Veleva, B. Lambrigtsen, S. Tanelli**

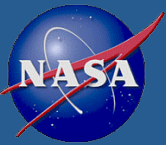


Multi-platform observations of Hurricane Earl include Visible Imagery from GOES, Passive Microwave observations from HAMS R (on the GH) and AMSR-E (on AQUA), Radar observations from APR2 (on DC8) In situ observations from dropsondes (on DC8)







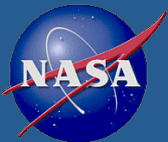


## Beyond the image comparison ...

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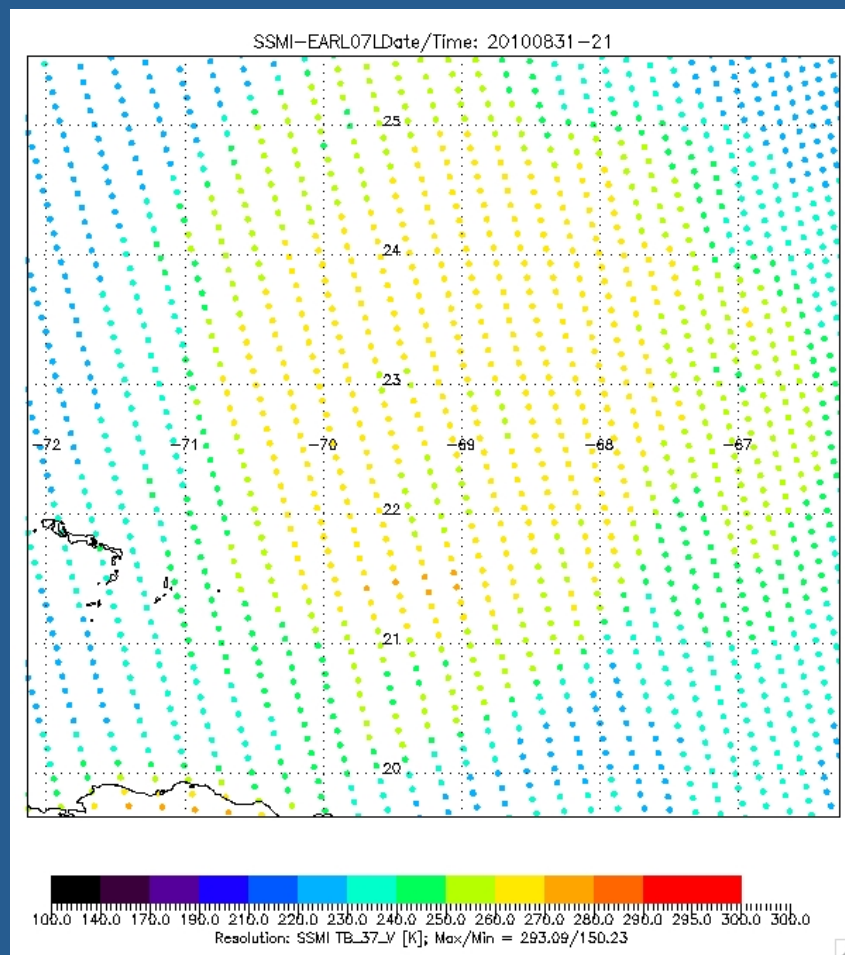
- In this study we again use **the HWRF model forecast** of the thermodynamic and hydrometeor fields to forward simulate satellite observables **(brightness temperatures computed at HRD)**
- We use the digital data to evaluate the model forecast. We consider the impact of:
  - **Satellite sampling**
  - **Resolution of the satellite data**
  - **Physics-induced biases**



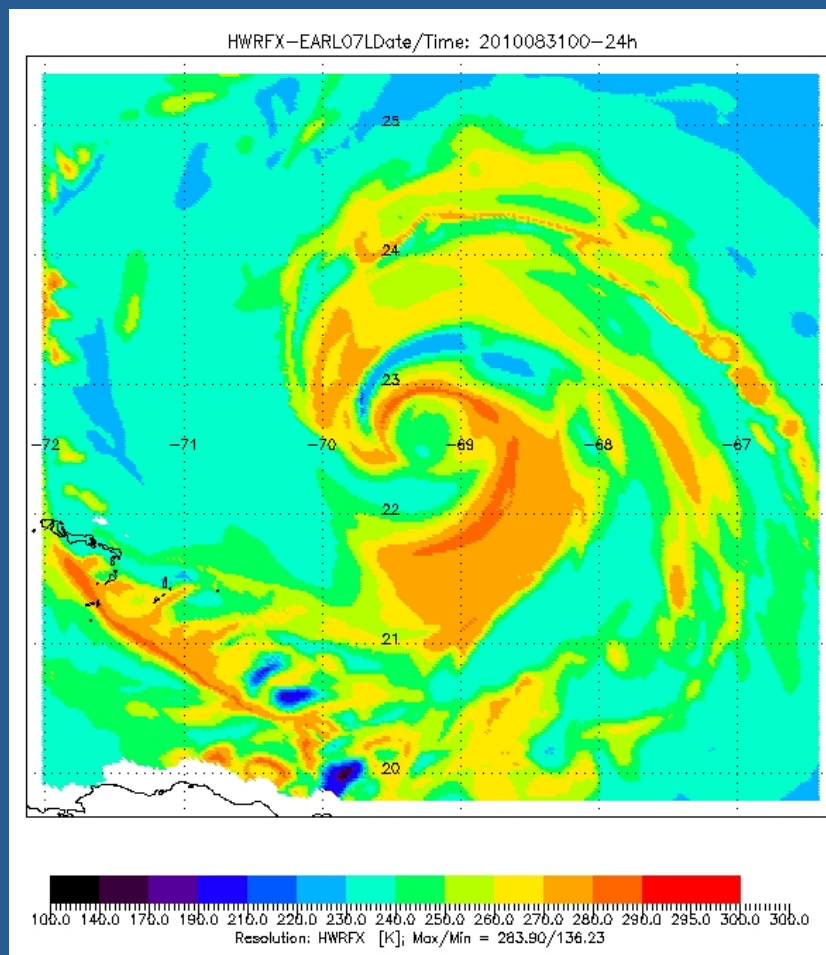
# Sampling

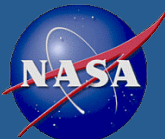


SSMIS



HWRFX

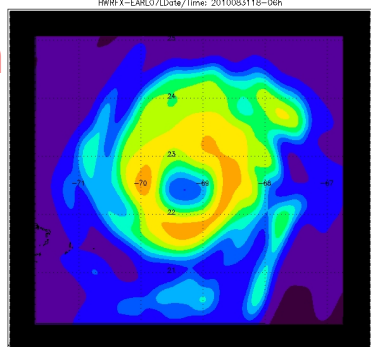
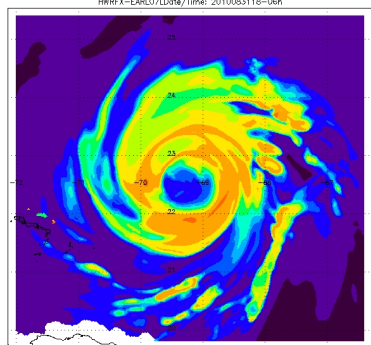
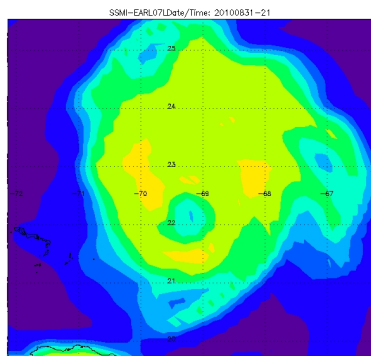




# 37 GHz H pol – September 01 2010 - Resolution

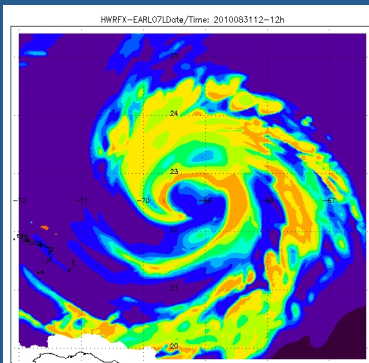


Observed

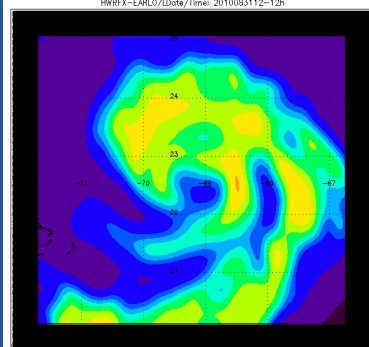


- Observed
- HWRFX – at the model resolution
- HWRFX – antenna-convolved to simulate brightness temperatures at the satellite resolution (37GHz - 27.5 x45.0km; 91GHz - 13.2x15.5)

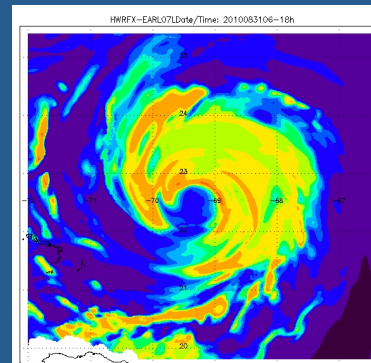
12h



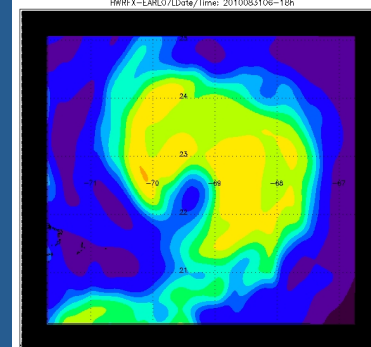
12h



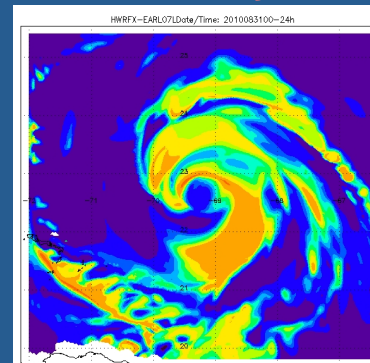
18h



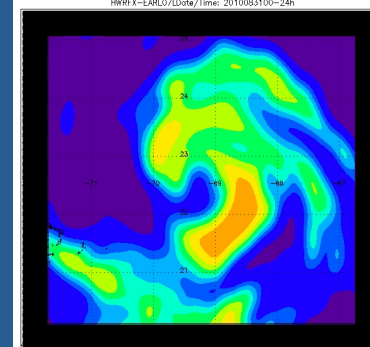
18h

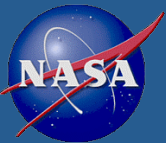


24h



24h



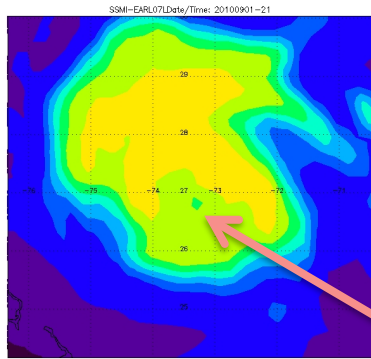


# Structure



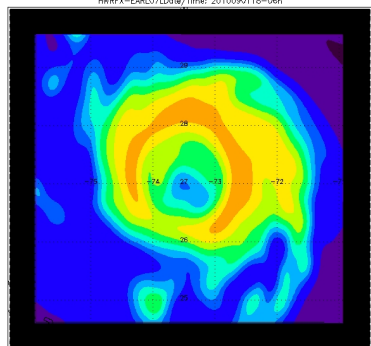
37 GHz H pol (satellite resolution) – 02 Sept. 2010

Observed



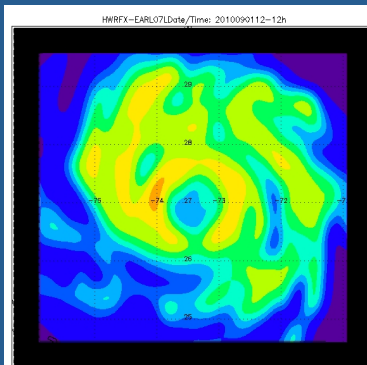
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Resolution: SSM TB, 37-H [K], Max/Min = 281.19/125.72

06h



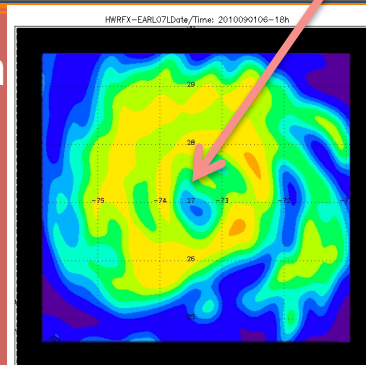
HRFX-EARL07Data/Time: 2010090116-06h  
Resolution: HRFX T87, 37-H [K], Max/Min = 275.59/169.87

12h



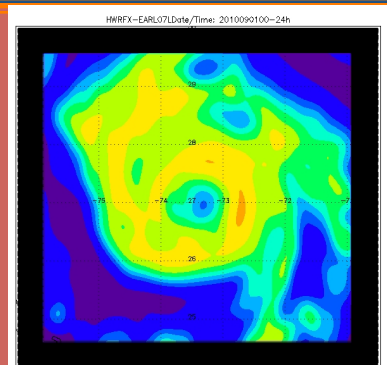
HRFX-EARL07Data/Time: 2010090112-12h  
Resolution: HRFX T87, 37-H [K], Max/Min = 273.41/173.16

18h



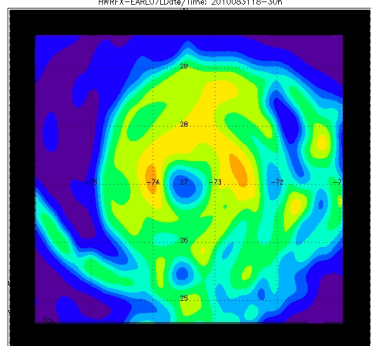
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24h



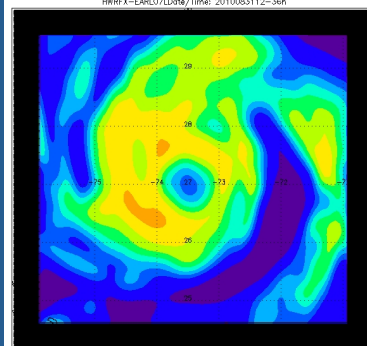
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30h



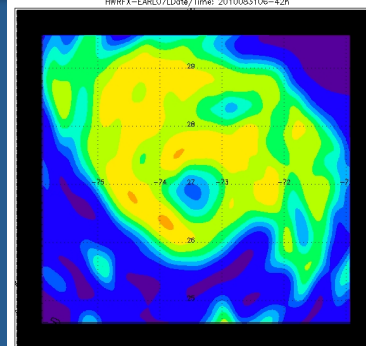
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36h



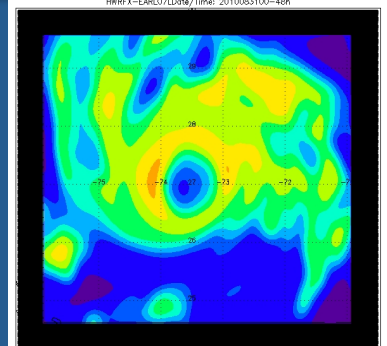
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Resolution: HRFX T87, 37-H [K], Max/Min = 272.09/176.14

42h



HRFX-EARL07Data/Time: 2010083106-42h  
Resolution: HRFX T87, 37-H [K], Max/Min = 271.88/177.62

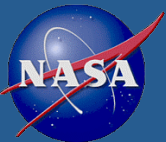
48h



HRFX-EARL07Data/Time: 2010083100-48h  
Resolution: HRFX T87, 37-H [K], Max/Min = 272.46/177.27

- Note that the realistic storm structure does not develop until **(12) 18 – 24h** into the forecast cycle
- The realism decreases after the 42h forecast
- The model has a well defined eye, not so visible in the observations.





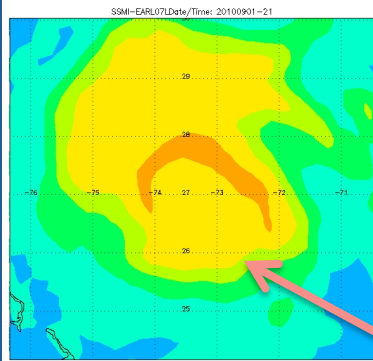
# Structure



37 GHz V pol (satellite resolution) – 02 Sept. 2010

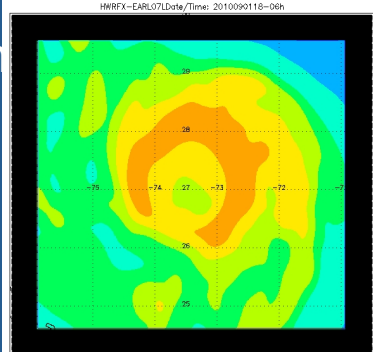
- Note that the realistic storm structure does not develop until **12-18-24h** into the forecast cycle
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- The model has a well defined eye not visible in the observations.

Observed



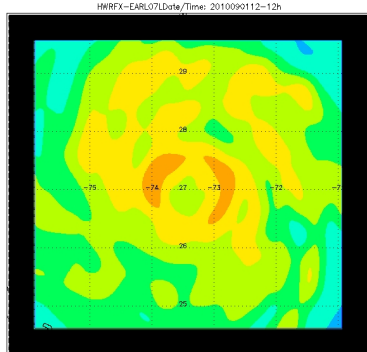
Resolution: 53M TB37/J [K], Max/Min = 293.19/151.23

06h



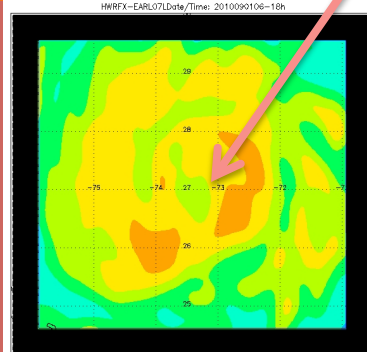
Resolution: 1M67/Tsarr [K], Max/Min = 277.49/228.51

12h



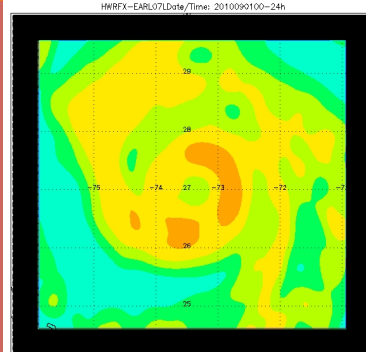
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18h



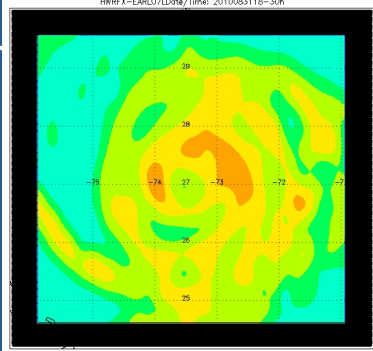
Resolution: 1M67/Tsarr [K], Max/Min = 277.35/229.48

24h



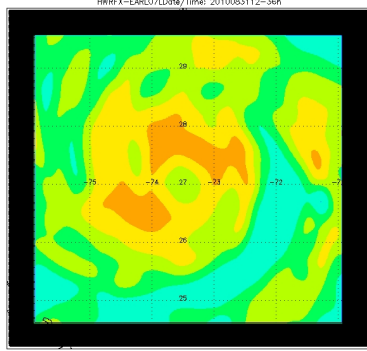
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30h



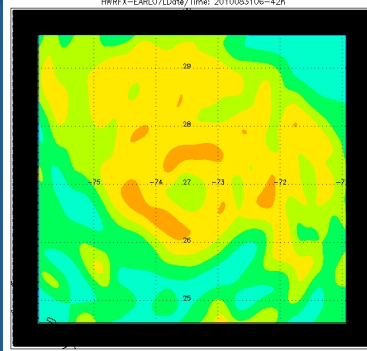
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36h



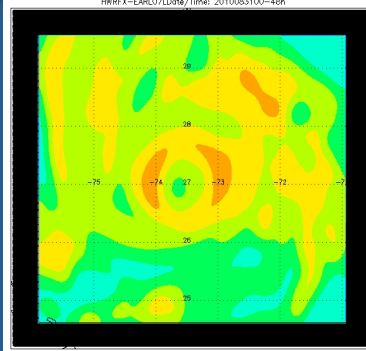
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42h

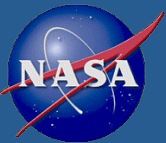


Resolution: 1M67/Tsarr [K], Max/Min = 274.50/228.09

48h



Resolution: 1M67/Tsarr [K], Max/Min = 278.33/231.35

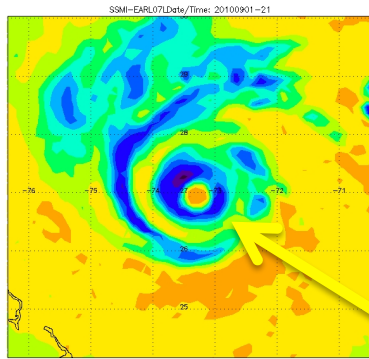


# STRUCTURE



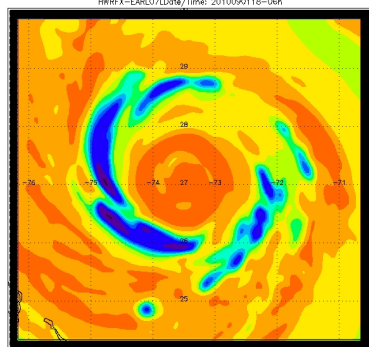
85/91 GHz H pol (sat. resolution) – 02 Sept. 2010

Observed

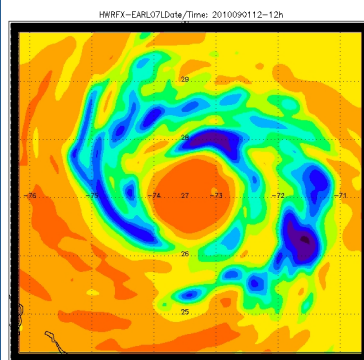


- Note that the realistic storm structure does not develop until 12-18h into the forecast cycle
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- The model has a very large eye and does not show the observed eyewall replacement cycle

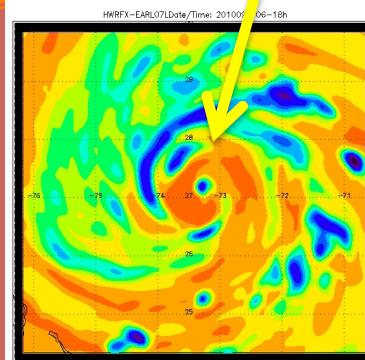
06h



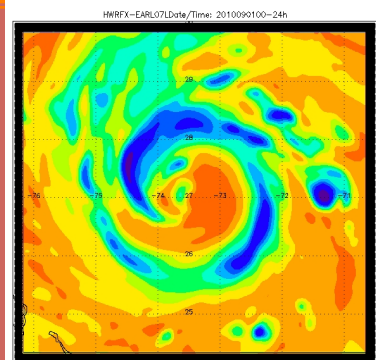
12h



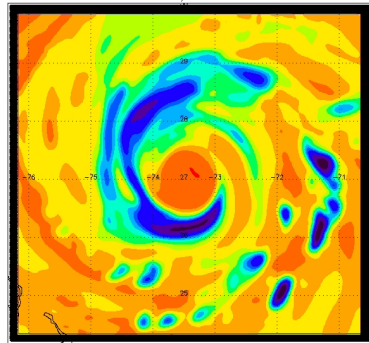
18h



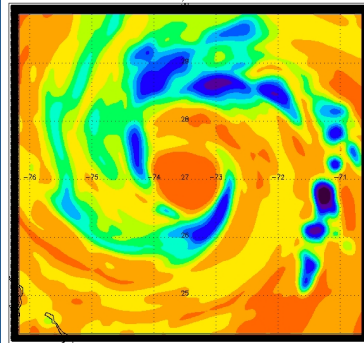
24h



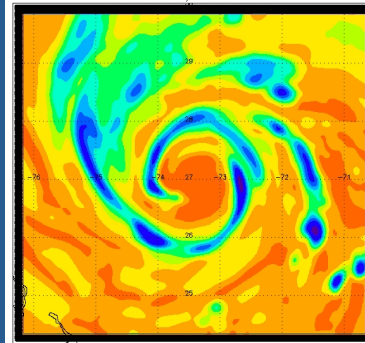
30h



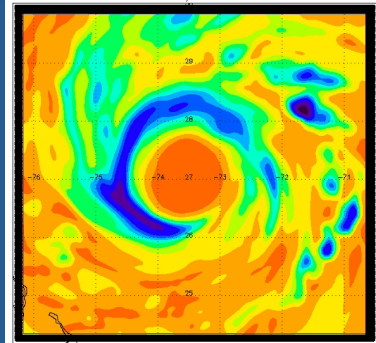
36h

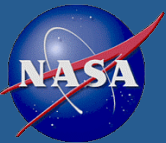


42h



48h



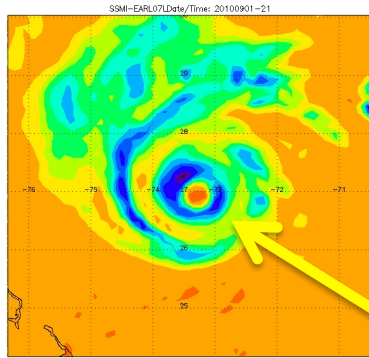


# STRUCTURE



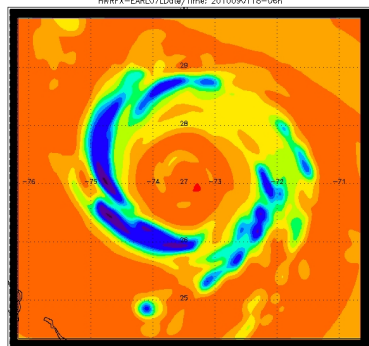
85/91 GHz V pol (sat. resolution) – 02 Sept. 2010

Observed

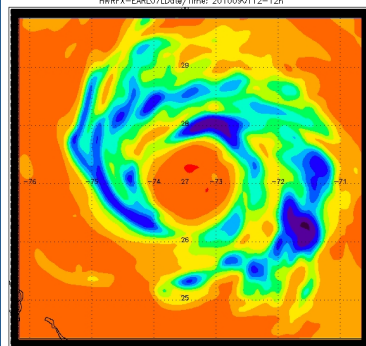


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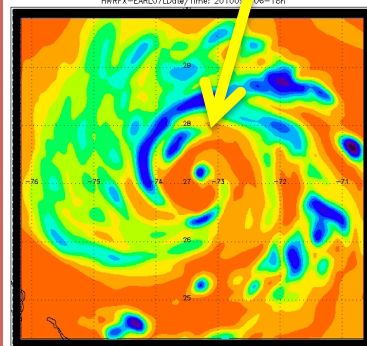
06h



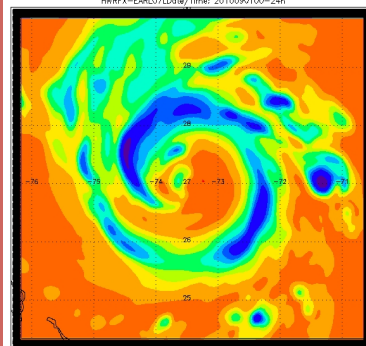
12h



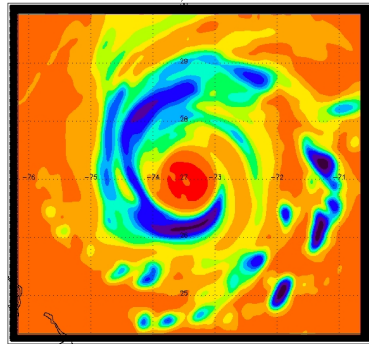
18h



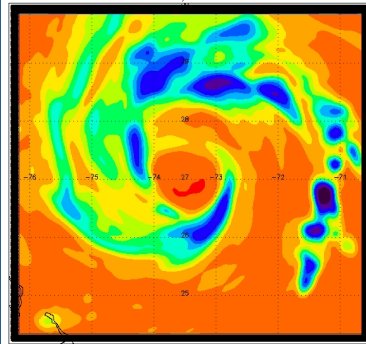
24h



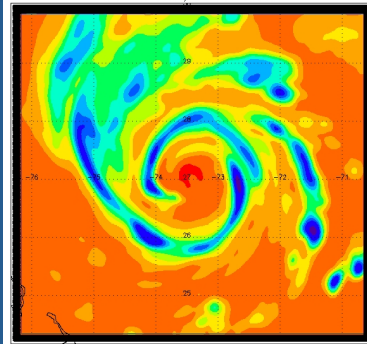
30h



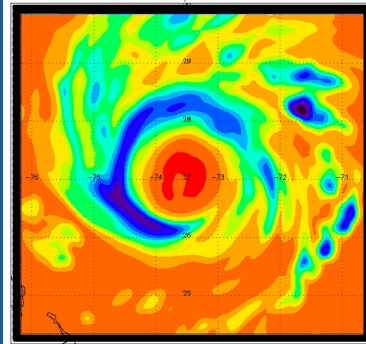
36h



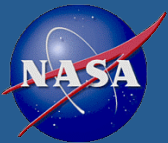
42h



48h





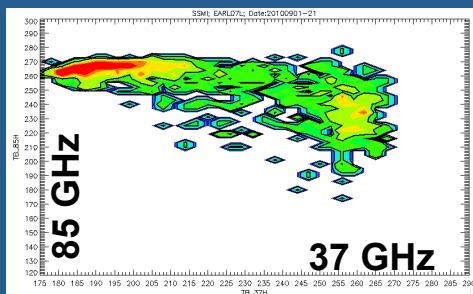


# Statistical Comparison – Joint PDFs



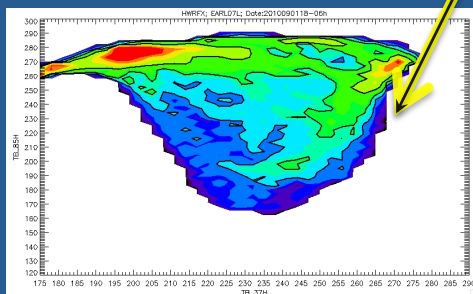
(85H/37H)(sat. resolution) – 02 Sept. 2010

Observed

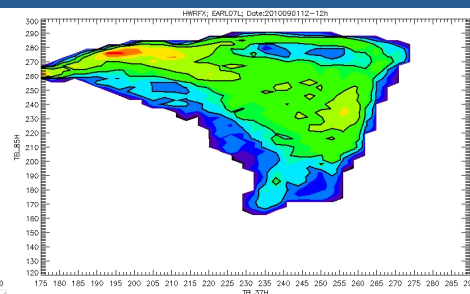


- The statistical relationship between the 37GHz TBs and the 85 GHT TB presents information on the vertical structure of the storm
- The sloping branch indicates too much scattering
- Note that the more realistic does not develop until 12-18h into the forecast cycle

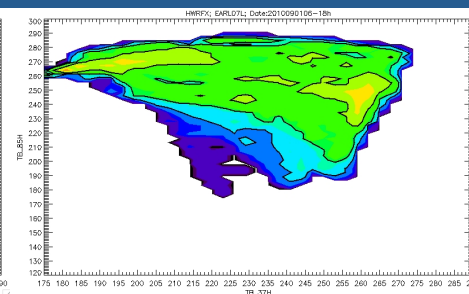
06h



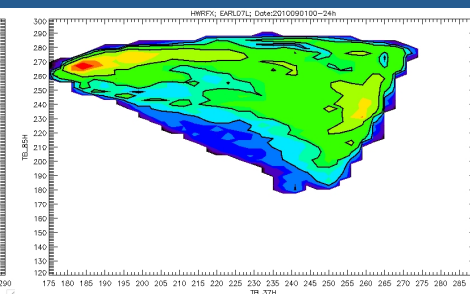
12h



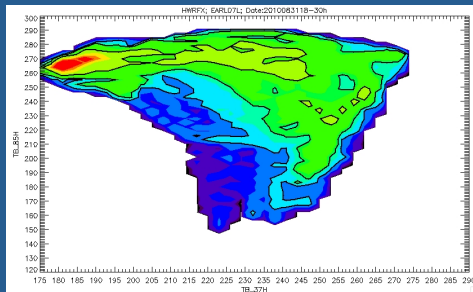
18h



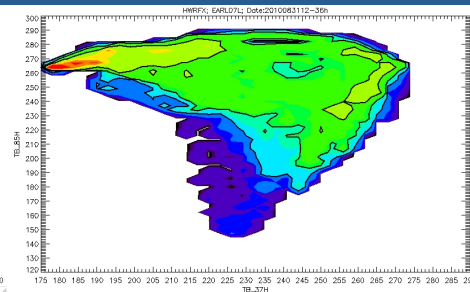
24h



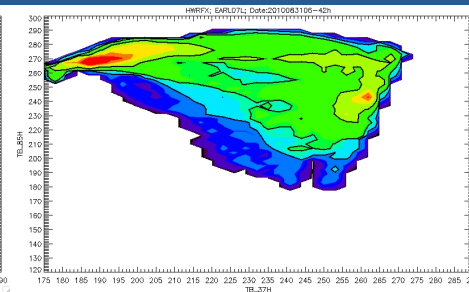
30h



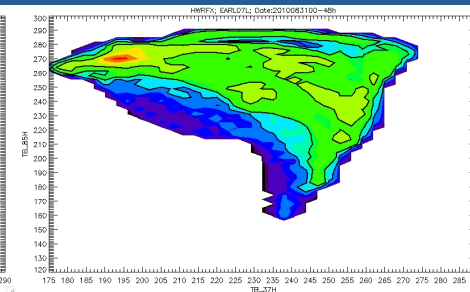
36h

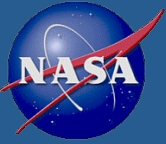


42h



48h



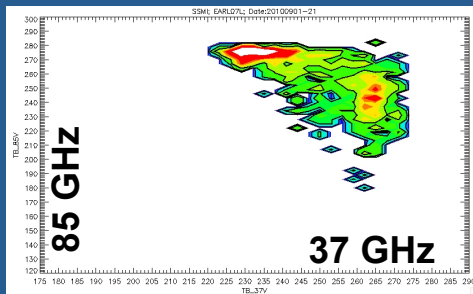


# Statistical Comparison – Joint PDFs



(85V/37V)(sat. resolution) – 02 Sept. 2010

Observed



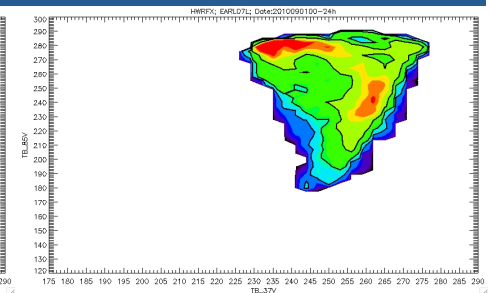
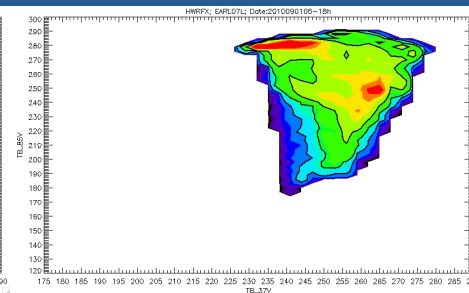
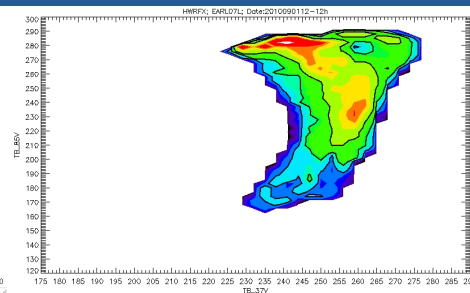
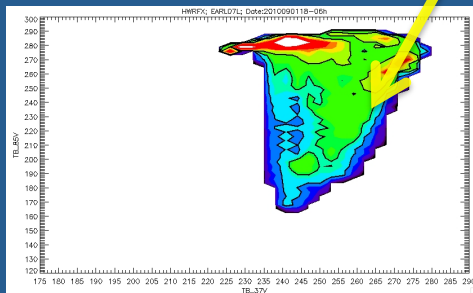
- The statistical relationship between the 37GHz TBs and the 85 GHT TB presents information on the vertical structure of the storm
- The sloping branch indicates too much scattering
- Note that the more realistic does not develop until 12-18h into the forecast cycle

06h

12h

18h

24h

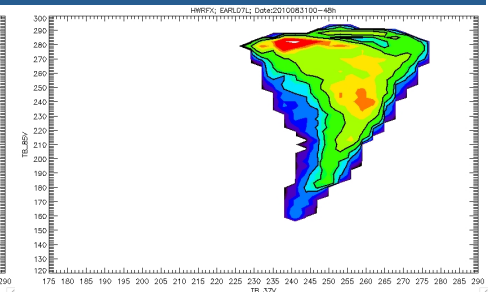
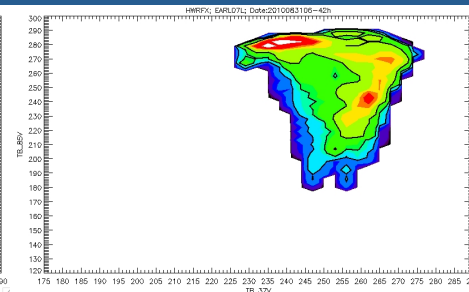
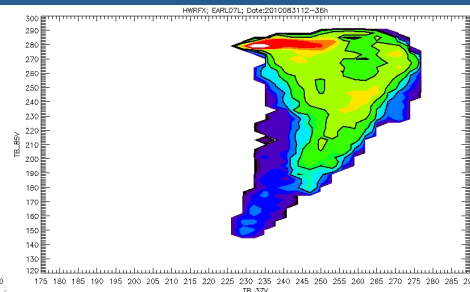
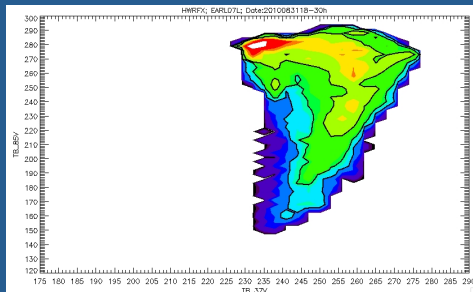


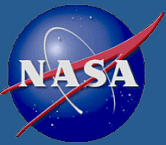
30h

36h

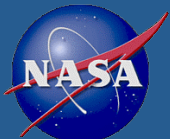
42h

48h





- The HWRF forecasts show a great dose of realism in capturing the essential asymmetry.
- However, there are some outstanding issues
  - The forecasted eye is too wide in the modeled 85 GHz TBs and the observed eyewall replacement is not captured
  - The simulated 37 GHz TBs show a well defined eye, not seen in the observations
  - **It takes 12 to 18h to even 24h for the model to develop realistic structures!**
  - **By that time the forecasted storm position has likely drifted from the observed and the modeled storm is developing in conditions different from that of the observed!**



# Evaluating the initial conditions



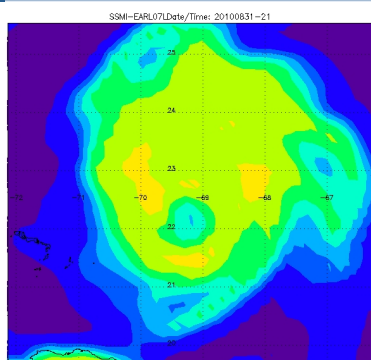
37H

37V

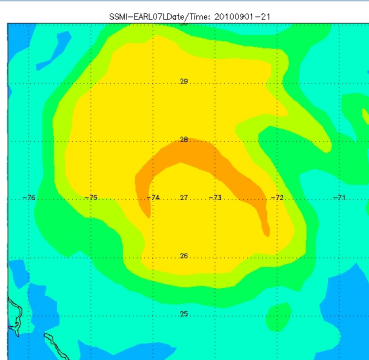
85H

85V

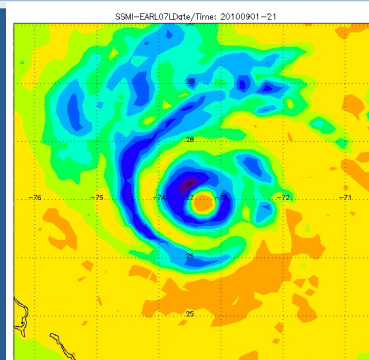
OBSERVED



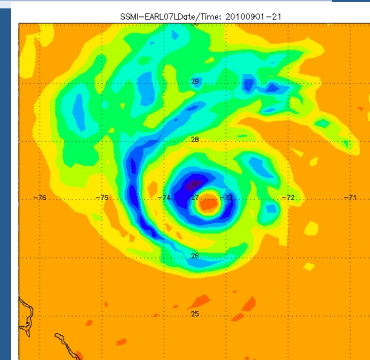
SSM-EARL07Date/Time: 20100831-21  
Resolution: SSM TB.37.H [K]. Max/Min = 262.51/125.55



SSM-EARL07Date/Time: 20100901-21  
Resolution: SSM TB.37.V [K]. Max/Min = 263.16/151.23

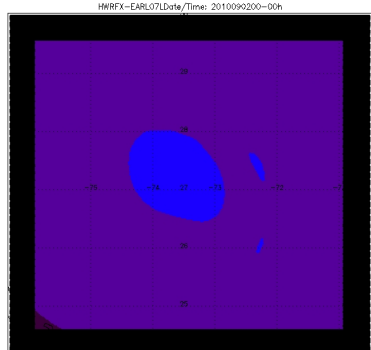


SSM-EARL07Date/Time: 20100901-21  
Resolution: SSM TB.81.H [K]. Max/Min = 311.61/125.20

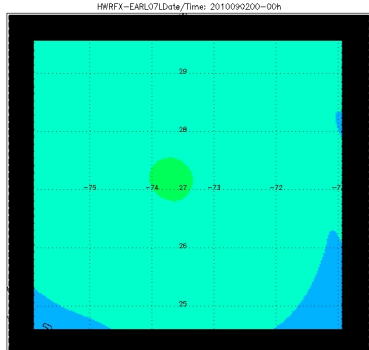


SSM-EARL07Date/Time: 20100901-21  
Resolution: SSM TB.81.V [K]. Max/Min = 284.02/128.65

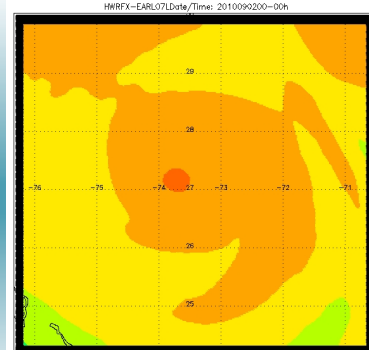
ANALYSIS



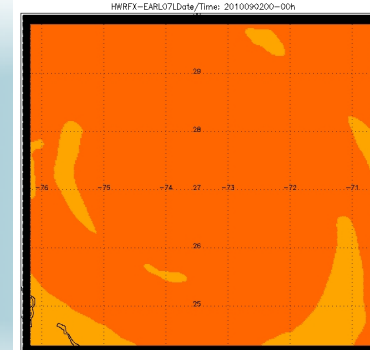
HIRFX-EARL07Date/Time: 2010090200-00h  
Resolution: HIRFXaer1 [K]. Max/Min = 186.65/167.20



HIRFX-EARL07Date/Time: 2010090200-00h  
Resolution: HIRFXaer1 [K]. Max/Min = 242.40/225.61

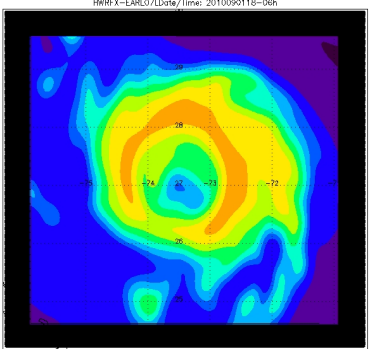


HIRFX-EARL07Date/Time: 2010090200-00h  
Resolution: HIRFXaer1 [K]. Max/Min = 281.88/249.63

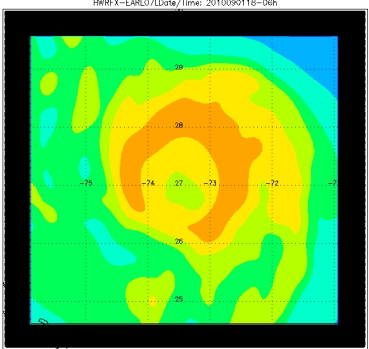


HIRFX-EARL07Date/Time: 2010090200-00h  
Resolution: HIRFXaer1 [K]. Max/Min = 287.22/275.15

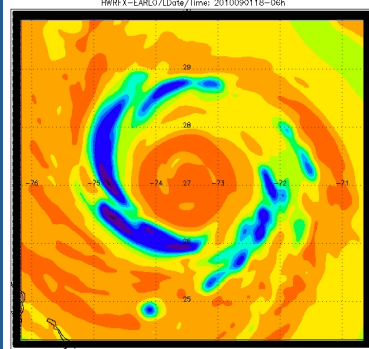
06h Forecast



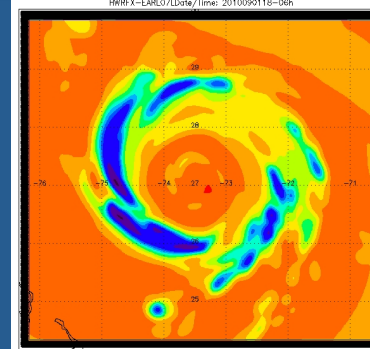
HIRFX-EARL07Date/Time: 2010090118-06h  
Resolution: HIRFXaer1 [K]. Max/Min = 275.58/168.97



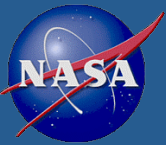
HIRFX-EARL07Date/Time: 2010090118-06h  
Resolution: HIRFXaer1 [K]. Max/Min = 277.48/226.61



HIRFX-EARL07Date/Time: 2010090118-06h  
Resolution: HIRFXaer1 [K]. Max/Min = 286.72/167.67



HIRFX-EARL07Date/Time: 2010090118-06h  
Resolution: HIRFXaer1 [K]. Max/Min = 280.08/167.68



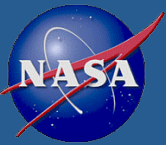
# Summary

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1. The long spin-up time might be the result of sub-optimal initial conditions which do not contain the observed precipitation structures.
2. During the model initialization we should make every effort to assimilate the microwave satellite information inside the precipitating hurricane core in order to incorporate:
  - **the precipitation-related thermodynamics**
  - **the important vortex asymmetries**





# Summary (cont.)

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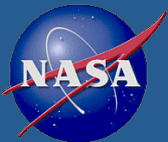
During the assimilation we cannot, and should not:

- assimilate at the resolution of the model
- but should assimilate at the resolution of the observations.

More importantly, we should assimilate the important structural information (position, size and intensity of the eyewall and the rainbands) and not the details of the storms that are not reliably simulated by the hurricane models today.

We should evaluate and understand the performance of the model physics by comparing composites from observed and forecasted storms and by performing model sensitivity studies.

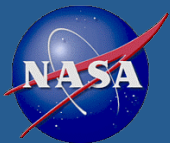
We should determine the biases we cannot remove (through model physics improvements) and should account for them during the assimilation processes.



# BACKUP

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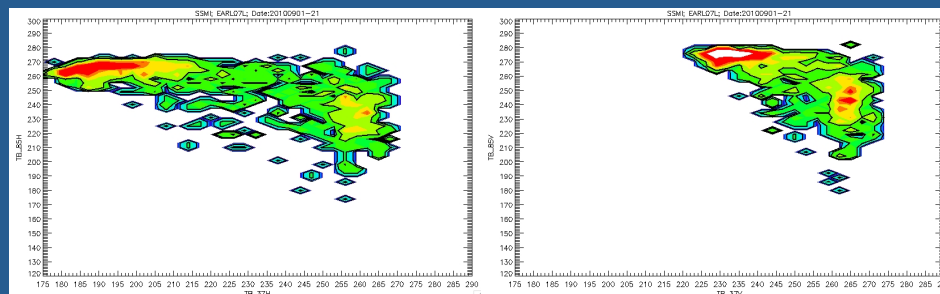


# Evaluating the initial conditions

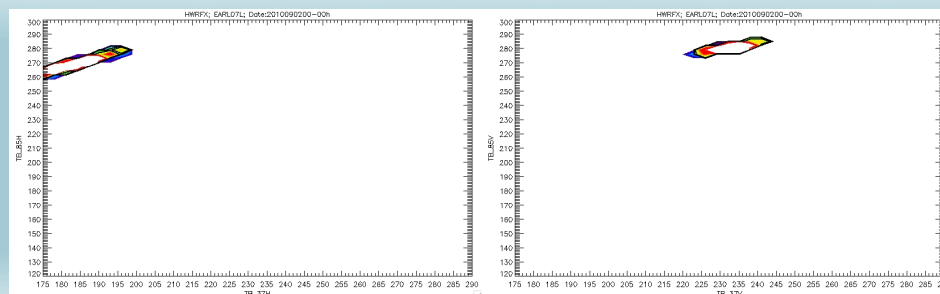
85H/37H 85V/37V



OBSERVED



ANALYSIS



06h Forecast

