

# HWRFX: Improving Hurricane Forecasts with High-Resolution Modeling

*Using the hurricane weather research and forecasting experimental modeling system (HWRFX), researchers examined the impact of increased model resolution on system performance in forecasting a select sample of tropical cyclones from the 2005 and 2007 hurricane seasons.*

The National Oceanographic and Atmospheric Administration (NOAA) Hurricane Forecast Improvement Project (HFIP) aims to double the accuracy for tropical cyclone (or *storm*) track and intensity forecasts with a comprehensive 10-year plan (see [www.nrc.noaa.gov/plans\\_docs/HFIP\\_Plan\\_073108.pdf](http://www.nrc.noaa.gov/plans_docs/HFIP_Plan_073108.pdf)). Using enhanced observations, improved model guidance, and increased forecaster expertise, the average storm track forecast has reduced errors by about 50 percent in the past decade, but little progress has been made in reducing intensity forecast errors.

The HFIP's ambitious goal is to reduce track errors by an additional 50 percent and reduce intensity errors by the same amount over the next decade, emphasizing rapid intensification events, which often cause severe damage due to shorter warning time. To achieve this goal, the HFIP advocates various approaches, including research and development activities that provide

- an optimized observing capability for hurricane analysis and forecasting,
- improved understanding of hurricane intensity change, and
- an advanced hurricane numerical modeling system.

At the NOAA Atlantic Oceanographic and Meteorological Laboratory (AOML) Hurricane

Research Division, we've been actively participating in the HFIP by building the hurricane weather research and forecasting experimental modeling system. HWRFX is a variant of the weather research and forecasting (WRF) non-hydrostatic mesoscale model (NMM) version 3.0.<sup>1</sup> Recent research suggests that it's possible to improve hurricane intensity forecasts using high model resolution (that is, grid spacing at or below 1 km horizontally) to adequately simulate the hurricane inner-core structures, such as the eyewall and rainbands.<sup>2,3</sup>

To help measure increased model resolution's impact on hurricane intensity forecast, hurricane specialists at the National Hurricane Center (NHC) selected 69 cases from 10 different tropical cyclones during the 2005 and 2007 hurricane seasons for the HFIP high-resolution hurricane (HRH) tests. The storms they chose for

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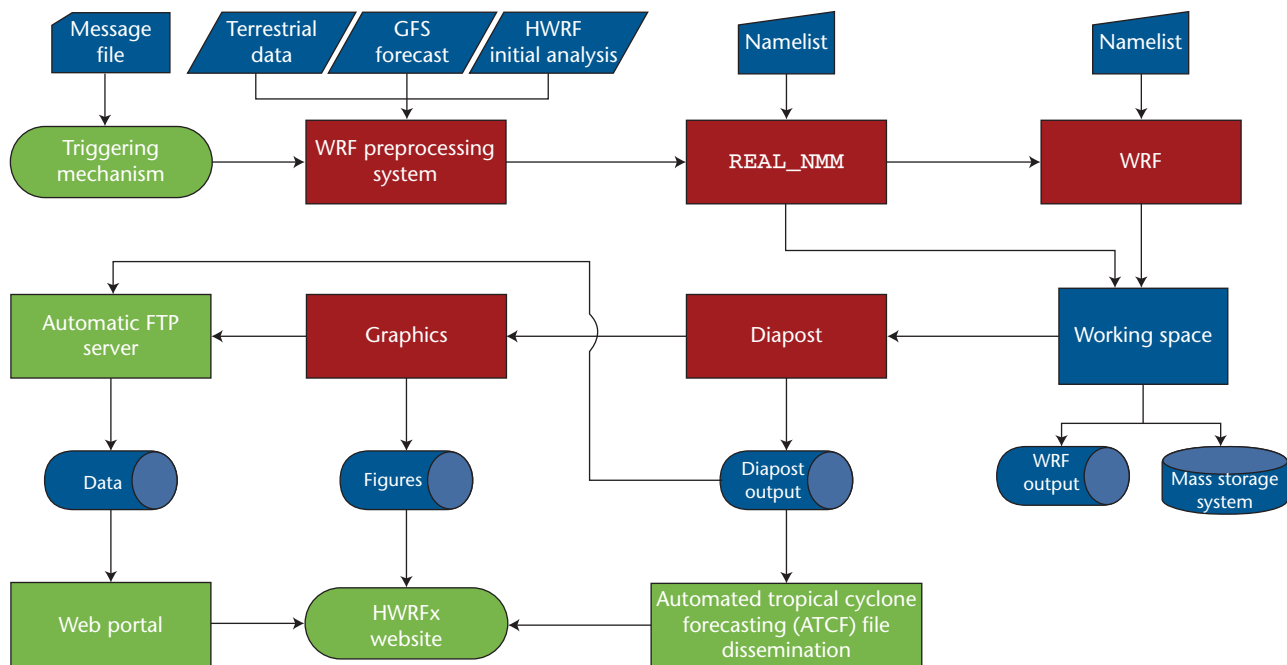


Figure 1. Schematic flowchart of the hurricane weather research and forecasting experimental modeling system (HWRFX). Red indicates executable modules, blue indicates input data and data storage disk, and green indicates controlling scripts. The working space is the high-performance parallel file system on the Nehalem Jet cluster. The automated tropical cyclone forecasting (ATCF) file dissemination occurs through the cluster's automatic email system. GFS stands for the Global Forecast System; WRF stands for the weather research and forecasting model; and Diapost stands for the diagnostic postprocessor.

2005 were hurricanes Emily, Katrina, Ophelia, Philippe, Rita, and Wilma; for 2007, they chose Felix, Humberto, Ingrid, and Karen. The 69 HRH cases are designed to examine various aspects of model performance, including

- the capability to simulate events with rapid intensity change (as in Wilma, Rita, Karen, Katrina, and Humberto);
- the impact of vertical wind shear on intensity evolution (as in Philippe, Rita, Karen, Katrina, and Ingrid);
- the effects of eyewall replacement (as in Felix, Emily, Rita, and Wilma);
- the effects of oceanic heating and cooling (as in Ophelia); and
- the impact of terrain interaction on the landfall processes (as in Wilma, Katrina, and Rita).

Here, we present a brief description of the HWRFX infrastructure and examine the impacts of increased model resolution on its performance with the 69 HRH cases.

### The HWRFX Infrastructure

The HWRFX inherits the dynamic core from the WRF-NMM, but adopts different physical parameterizations for hurricane forecasting.<sup>4,5</sup>

HWRFX uses moving nests to focus the model's highest horizontal resolution in the storm area.<sup>4,5</sup> The HWRFX is equipped with operational capabilities for automated real-time hurricane forecasting; we performed real-time experiments during the 2008<sup>5</sup> and 2009 hurricane seasons.

We designed the HWRFX modeling system as integrated software that mimics NOAA's operational system on a smaller domain. The system resides on the Nehalem Jet (NJET) supercomputer, which is the HFIP's dedicated Linux cluster with 3,520 processors located at the NOAA Earth System Research Laboratory (ESRL) in Boulder, Colorado.

Figure 1 shows a flowchart of the HWRFX modeling system, which runs automatically during the hurricane season and has eight steps:

- triggering mechanism,
- data acquisition,
- preforecast data processing,
- model forecast,
- postforecast data processing,
- graphics and visualization,
- product dissemination, and
- data archiving.

We built these components using various programming languages, including Java for control

logic design and database connectivity; shell scripting for data retrieval and file manipulation within a Linux environment; and Fortran 90 to develop the forecast model components.

We built the *triggering mechanism* with Java and shell scripting. It waits for NHC hurricane forecasters to issue tropical cyclone messages and then triggers the forecast procedure as needed. NHC can issue up to four messages simultaneously, each describing the name, current location, and intensity of a potential (also known as *invest*) or active storm. The triggering mechanism uses prescribed parameters to prioritize storm simulations. The user provides a list of target cycles (such as 00, 06, 12, and 18 Coordinated Universal Time, or UTC), a list of target basins (such as North Atlantic and Northeast Pacific), and the maximum number of simulations per six-hour cycle. The user also specifies the priority for storm sorting (potential or active) by basin and intensity—following either NHC’s priorities or the sequence provided in a user-defined list. The system’s default is to perform two simulations every six-hour cycle and follow NHC’s priorities. Typically, this corresponds to simulating the storms that pose a direct threat to US coastal areas and Caribbean islands. Users can change priorities in real-time using the graphical user interface; they can also simulate multiple storms in parallel.

The *data acquisition* component, designed with Java and shell scripts, runs automatically and in parallel with the triggering mechanism. It continuously retrieves the meteorological data sets required to perform the HWRFx forecasts. These data sets include initial time analyses from three sources:

- the Global Forecast System (GFS) 126-hour forecast;
- the Geophysical Fluid Dynamics Laboratory (GFDL) hurricane model; and
- the hurricane weather research and forecasting (HWRF) model.

The *preforecast data processing* consists of the WRF preprocessing system (WPS) and the `REAL_NMM` module. The WPS interpolates the initial and boundary conditions horizontally to the HWRFx’s rotated latitude-longitude grid; the `REAL_NMM` module further interpolates the data vertically to the terrain-following 42 sigma-pressure hybrid levels used in the HWRFx model integration. These modules also derive the other meteorological fields required to initialize the HWRFx forecast.

The *model forecast* calculates the increments of meteorological variables (such as wind, temperature, specific humidity, hydrostatic pressure depth, nonhydrostatic pressure, and total cloud water condensate) in small time steps, and integrates those numerous increments to predict the evolution of the atmosphere, including the storm itself. The initial data are thus advanced from the initial time to the forecast time with a series of small time steps to predict the atmosphere’s future state. In addition to the prognostic variables that are evolved through the atmosphere’s governing equations, the model also calculates numerous diagnostic variables and outputs them in the network Common Data Form (netCDF) format, which lets users easily compare the model simulation with the observations.

The model executes *postforecast data processing* using HRD’s diagnostic postprocessor (Diapost). Diapost reads the model’s netCDF output and performs horizontal interpolation. It thereby transforms the variables from the model’s native, staggered, rotated latitude-longitude grid to several unstaggered grids typically used in hurricane model diagnostics, including the regular latitude-longitude grid and a storm-centered cylindrical grid. Diapost also performs vertical interpolation to transform the model output from the terrain-following sigma-pressure levels to other commonly used vertical levels, such as constant pressure or constant altitude. The Diapost output is encoded for diagnostics and visualization using the grid analysis and display system (Grads). Diapost also calculates the model-forecasted storm’s track and intensity, and encodes the forecast into the automated tropical cyclone forecasting (ATCF) format for evaluation.

We built the *graphics and visualization* component using the Grads scripting language. Upon completing graphics generation, the *product dissemination* component automatically sends all graphics to a database. The graphics are then uploaded to the HWRFx website (<https://storm.aoml.noaa.gov/hwrfx>) for model evaluation. Finally, the *data archiving* module uses the mass storage system (MSS) to permanently back up the model output onto tapes.

High-resolution real-time hurricane forecasting requires extensive computing resources to execute the extremely complicated computation in an operationally constrained time window. To support next-generation model development for hurricane prediction, the HFIP significantly augmented its computing capacity in August 2009. The previous Linux cluster, Harpertown

**Table 1. Domain configurations for study of increased horizontal model resolution.**

Configuration	Low-resolution outer domain	Low-resolution inner domain	High-resolution outer domain	High-resolution inner domain
Resolution	27 km	9 km	9 km	3 km
Dimensions (degrees)	57.24 × 55.62	9.48 × 7.98	57.0 × 55.5	5.80 × 5.78
Grid points	160 × 310	80 × 134	476 × 926	146 × 290

Jet (HJET), had 2,016 cores capable of delivering up to 22 teraflops; HFIP upgraded this with Intel’s latest Xeon chips to the much more powerful NJET, which delivers up to 40 Tflops with 3,520 cores. This upgrade reduced model execution time by a factor of approximately three, making possible real-time operation of the HWRFx five-day forecasts with a 3-km grid increment for the inner domain and 9 km for the outer domain. Each forecast currently takes about two hours of wall clock time with 256 cores.

### Impacts of Increased Resolution

To demonstrate the impacts of increased horizontal resolution on the HWRFx forecast, we tested the 69 HRH cases with the original 27/9-km low-resolution and the new 9/3-km high-resolution domain configurations (see Table 1). Both configurations used 42 hybrid sigma-pressure levels with the model top at 50 hectopascals (hPa) (approximately 20 km).

The atmospheric model is initialized with the operational GFDL initial condition,<sup>6</sup> which we constructed with an idealized vortex on the large-scale environmental flow from the GFS analysis. We perform each forecast for 126 hours of simulation time, during which the outer domain’s lateral boundaries are updated with the GFS forecast data at 1° latitude-longitude grid increment every three hours. The lower boundary condition (that is, the sea surface temperature, or SST) is prescribed with the SST from the GFS analysis, which we set at the beginning of each forecast and hold constant throughout the forecast. The land surface model is also initialized with the GFS analysis. We then use the ATCF files—generated by Diapost with the inner-domain data—to verify against the NHC best track data, which gives the best estimates of the tropical storm positions and intensities. We developed the best track data using all available observations of tropical cyclones by NHC hurricane specialists after the hurricane season.

Figure 2 shows the track and intensity verifications for the HWRFx forecasts. The track errors are calculated as the great-circle distance between the model and observed storm centers every

12 hours. We define the along-track vector as the vector from the storm position six hours prior to the verification time to the vector at verification time based on NHC’s hurricane best track data. We define the cross-track vector as the vector perpendicular to the along-track vector, where the positive and negative are to the right and left of the along-track vector, respectively. Further, the positive/negative cross-track bias represents the forecast tracks that are to the right/left of the best track, and the positive/negative along-track bias represents the forecast motion of a storm that is faster/slower than the best track estimated motion.

Generally, both cross- and along-track errors of 3-km forecasts are smaller than errors of 9-km forecasts, except at the 12-hour forecast for the cross-track error and the 108 h for the along-track error. The biases of 9-km forecasts tend to be slow (negative along-track bias) and to the right (positive cross-track bias), while biases of 3-km forecasts are evenly distributed around zero. The high-resolution forecasts demonstrate a reduction in the absolute track errors versus the low-resolution forecasts at all forecast time intervals (see Figure 2c). Overall, the along-track errors contribute more to absolute track errors than cross-track errors. However, results for the frequency of superior performance (FSP), a measure (in percent) of how often one model produces better forecasts than the other, are mixed (see Tables 2 and 3). FSP compares the forecasts with different resolutions based on the absolute errors. The confidence level is based on the sample size adjusted for 24-hour serial correlation time.<sup>7</sup> The track forecast performance implies, as expected, that the track is dominated by the synoptic flow patterns, which were similarly forecasted at both resolutions (not shown).

In contrast, using the high-resolution model reduces the absolute intensity errors in comparison to the low-resolution model, with the exception of the 84-hour forecast interval (see Figure 2d). The intensity biases are apparently much better balanced over the forecast period with the high-resolution model. The high-resolution model has a smaller negative bias than the low-resolution

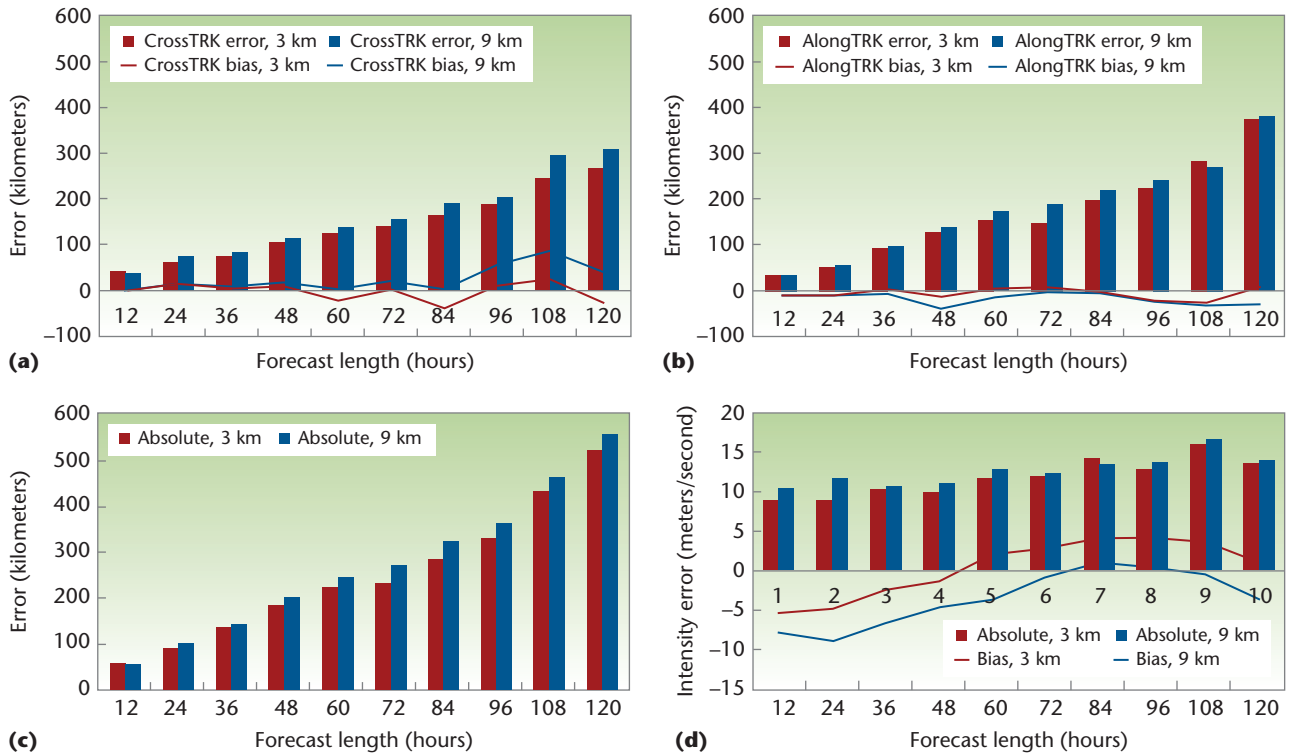


Figure 2. Track and intensity homogeneous verifications for the HWRFx forecasts. (a) Absolute track errors and west-east and south-north track biases. (b) Absolute intensity errors and biases ( $\text{ms}^{-1}$ ). (c) Absolute track errors (km). (d) Absolute intensity errors and biases ( $\text{ms}^{-1}$ ).

Table 2. The frequency of superior performance and confidence levels for track error.										
Resolution	12 h	24 h	36 h	48 h	60 h	72 h	84 h	96 h	108 h	120 h
HWRFx 3 km	47.0	65.1	57.3	58.8	47.2	58.3	51.2	46.2	46.9	44.0
HWRFx 9 km	53.0	34.9	42.7	41.2	52.8	41.7	48.8	53.8	53.1	56.0
Cases	66	63	62	57	53	48	43	39	32	25
Confidence	66.6	99.6	93.2	92.2	89	95.9	89.1	78.9	64.5	61
Adjusted cases	60.5	58	57	52.5	48.5	43.5	39	35.8	30.2	24

Table 3. The frequency of superior performance and confidence levels for absolute error and bias.										
Resolution	12 h	24 h	36 h	48 h	60 h	72 h	84 h	96 h	108 h	120 h
HWRFx 3 km	62.1	69.8	53.2	65.8	46.2	45.8	46.5	55.1	54.7	60.0
HWRFx 9 km	37.9	30.2	46.8	34.2	53.8	54.2	53.5	44.9	45.3	40.0
Cases	66	63	62	57	53	48	43	39	32	25
Confidence	99.1	100	72.4	89.6	82.6	64.5	69.2	72.3	61	57.8
Adjusted cases	60.5	58	57	52.5	48.5	43.5	39	35.8	30.2	24

model prior to 60 hours, but it changes to a positive bias at later forecast times. This demonstrates that the high-resolution model tends to intensify

storms more than the low-resolution model. As Figure 2d shows, the frequency of superior performance results for intensity errors indicate that



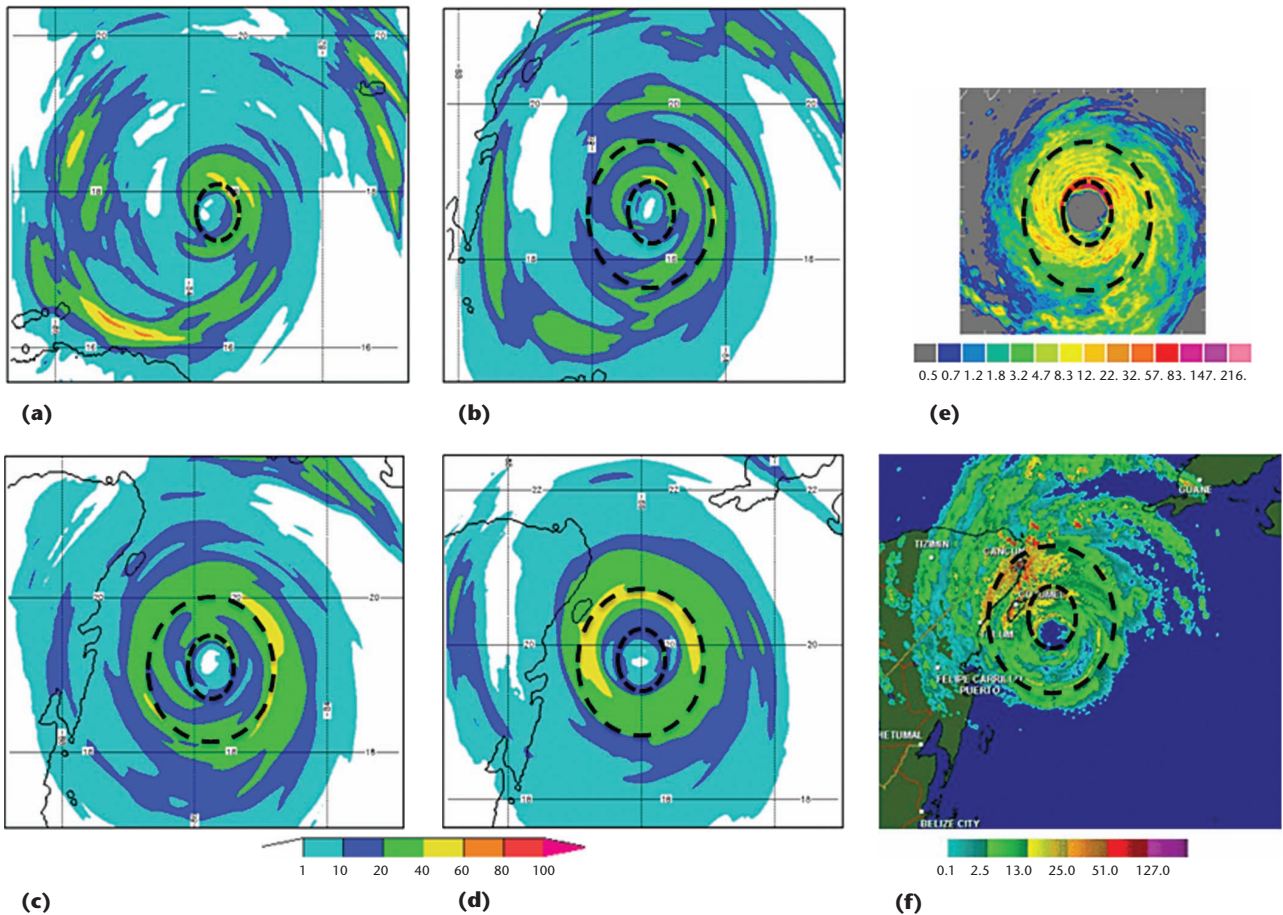


Figure 3. HWRfX's forecast for Hurricane Wilma eyewall replacement compared to radar-estimated precipitation rate. The HWRfX 9/3-km resolution forecast was initiated at 1200 UTC 19 October 2005. The HWRfX precipitation rate (mm/hr) at (a) 12 hours, (b) 24 hours, (c) 30 hours, and (d) 36 hours into the forecast. Radar-estimated precipitation rate (mm/hr) from the NOAA P3 aircraft radar observation and Mexico National Meteorological Service (e) at 2014 UTC 20 October 2005 and (f) 1156 UTC 21 October 2005 (see [www.srh.noaa.gov/tae/?n=research-zrpaper](http://www.srh.noaa.gov/tae/?n=research-zrpaper)). Dashed circles indicate the approximate eyewall positions before and after the replacement process.

high-resolution forecasts also demonstrate general improvement over the low-resolution forecasts.

The improvement in Hurricane Wilma's simulated storm structure shows one advantage of increased model resolution. Wilma experienced a rapid intensification before 1200 UTC 19 October 2005, reaching a peak sustained wind speed of  $82 \text{ ms}^{-1}$  at around that time. The US Air Force reconnaissance observation indicated that Hurricane Wilma had an eye diameter of 3.7 km—the smallest ever observed—and experienced an eyewall replacement process before it made landfall, resulting in a much larger eye diameter (approximately 72 km) on 20 October (see [www.nhc.noaa.gov/pdf/TCR-AL252005\\_Wilma.pdf](http://www.nhc.noaa.gov/pdf/TCR-AL252005_Wilma.pdf)).

Figure 3 shows the eyewall replacement phenomenon<sup>8,9</sup> in the HWRfX high-resolution forecast initiated at 1200 UTC 19 October 2005. At 12 hours into the forecast, the model eyewall was small (Figure 3a); the second eyewall started to

form at approximately 24 hours (Figure 3b) and merged with the first eyewall at approximately 30 hours (Figure 3c). As Figure 3d shows, the first eyewall was replaced with the stronger and bigger eyewall 36 hours into the forecast. Compared to the radar-estimated precipitation rate ([www.srh.noaa.gov/tae/?n=research-zrpaper](http://www.srh.noaa.gov/tae/?n=research-zrpaper)) observed at 2014 UTC 20 October (Figure 3e) and at 1156 UTC 21 October (Figure 3f), the HWRfX high-resolution forecast successfully simulated the eyewall replacement process. Although the actual timing was somewhat faster, such a structural phenomenon had been captured only marginally in the low-resolution forecasts. This improvement in simulating fine-scale processes might have contributed to the intensity forecast accuracy. Further analysis on this is underway.

We can also examine the model-simulated storm structure with the storm's radius of maximum wind (RMW), which is determined with

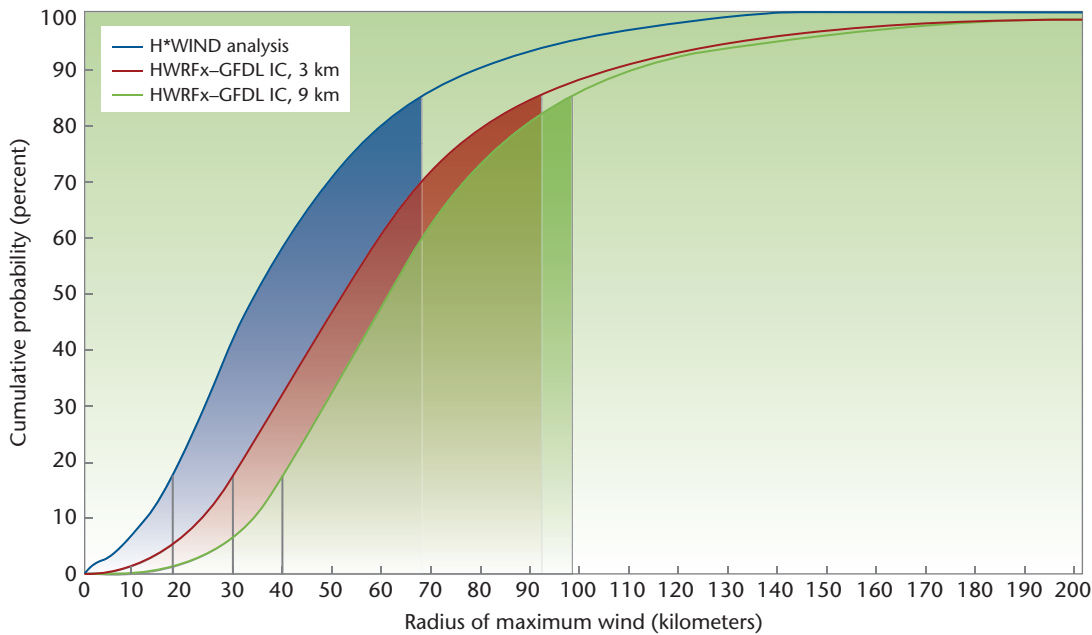


Figure 4. Cumulative Distribution Function (CDF) of the radius of maximum wind at 10 meters above the ground for the HWRFX forecasts, compared with the H\*Wind analysis. The CDFs are shaded for one standard deviation of probability.

the azimuthal average of the horizontal wind at 10 meters above the ground (10-m wind) relative to the storm center. Figure 4 shows the Cumulative Distribution Function (CDF) of the HWRFX forecasts' RMW<sup>10</sup> compared with those of HRD's H\*Wind analysis,<sup>11</sup> where both RMW frequencies are determined in 1-km bins. Excluding the samples in which the storm centers were located over land, we used 196 H\*Wind analyses and 1,320 and 1,377 low- and high-resolution model samples, respectively, from 69 forecast cycles to calculate the distribution functions.

Figure 4 shows the CDF of RMW. The median RMW is about 34 km for the H\*Wind analysis, and 52 km and 62 km for the high- and low-resolution HWRFX forecasts, respectively. The H\*Wind analysis is distributed over 17 to 68 km within one standard deviation of normal distribution (that is, from the 16th to 84th percentile). For the high- and low-resolution models, the simulated RMW within one standard deviation is distributed over 31 to 94 km and 39 to 98 km, respectively.

As expected, this indicates that the storm sizes are better predicted with the high-resolution forecasts than with the low-resolution forecasts. Further analysis indicates that standard deviations are 27, 34, and 32 km and mean RMWs are 41, 58, and 66 km for H\*Wind, high-resolution, and low-resolution, respectively. The differences in standard deviation are within two model grid

increments between analysis and forecasts. Standard deviations suggest that the model forecasts could more accurately reproduce the RMW distributions. However, the model forecasts exhibit systematic biases of mean RMWs. The potential implication of the improved storm-size prediction in intensity forecasts beckons further evaluation.

**T**he HWRFX modeling system is an integration of advanced techniques in numerical modeling and computer engineering that's useful for both research and operational needs. The specifically designed high-resolution hurricane tests suggest that the increase of horizontal resolution has positive impacts on the accuracy of both track and intensity forecasts with more realistic structural evolution, such as of the eyewall replacement process and storm size. This is a very encouraging start. More studies related to resolution impact are underway. However, our study's limited number of cases prevents a full evaluation of the results' statistical significance.

Further efforts are needed for additional improvements on both track and intensity forecasts. Our hope is that the storm's improved representation through increasing horizontal resolution will provide the foundation for additional reduction of track and intensity forecast errors by introducing better initialization and representation of

physics in the future. Because the extremely complicated dynamic and physical processes occur mainly in the hurricane's inner core, a thorough understanding of inner-core structure and its application to hurricane modeling and data assimilation could be one of the most important keys to achieving the HFIP's ambitious goals.

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