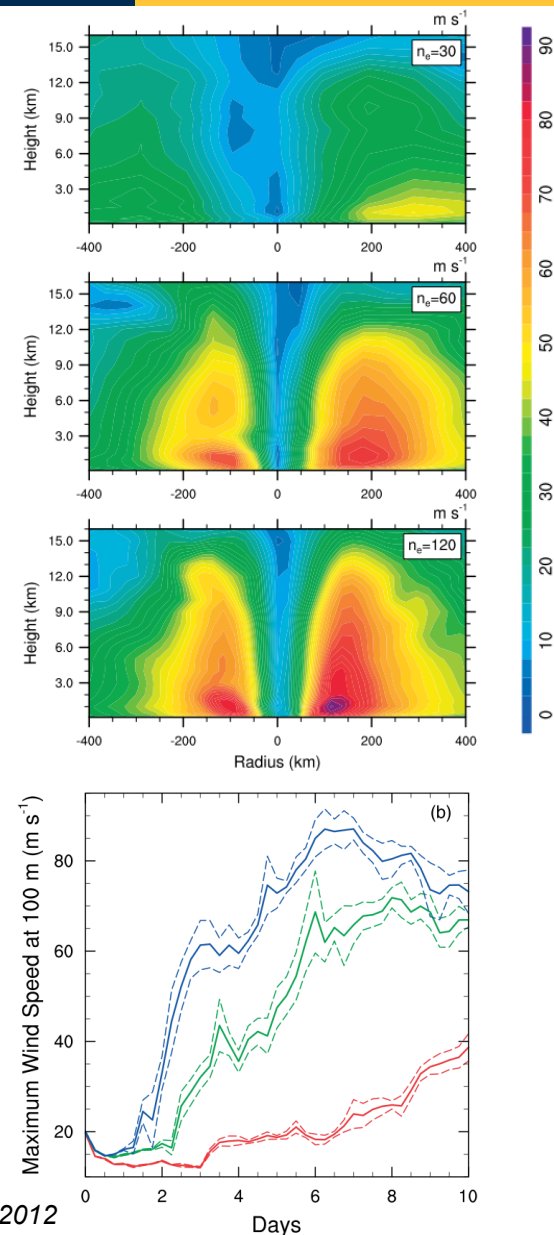


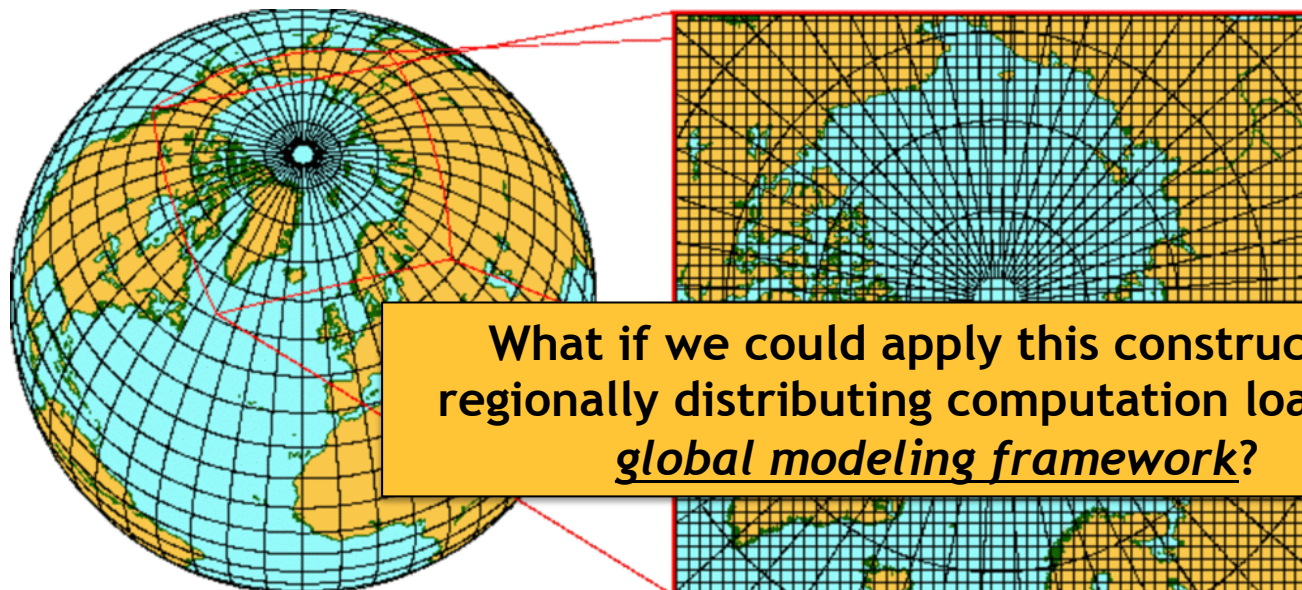
Tropical cyclones in GCMs

- Modeling of tropical cyclones (TCs) in General Circulation Models (GCMs) historically difficult
 - Essentially impossible at $\sim >75$ -100 km to resolve “realistic” TCs
- Even today, still **significant computational demand** to simulate even at 25-50 km
 - Fixed SST models broaching ~ 25 km spacing
 - Climate models for AR5 (coupled, non-timeslice), ~ 50 -200 km



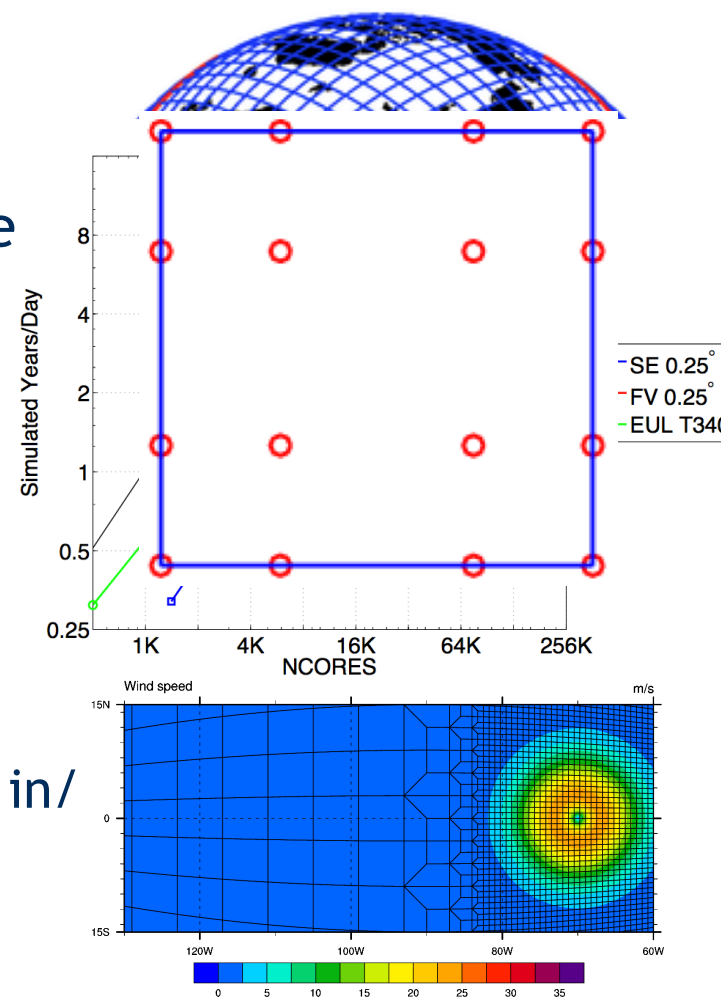
Limited area models

- One solution? Limited area models (LAMs)
 - Focus computing power in area of interest
 - Higher resolution!
 - Require *boundary conditions (BCs)*
 - Errors in BCs propagate into nest
 - BCs (such as relaxation BCs) well-posed?
 - Different model (including different dynamical core, physics package, etc.) produces BCs
- One-way nests: TCs not allowed to be active players in the climate system



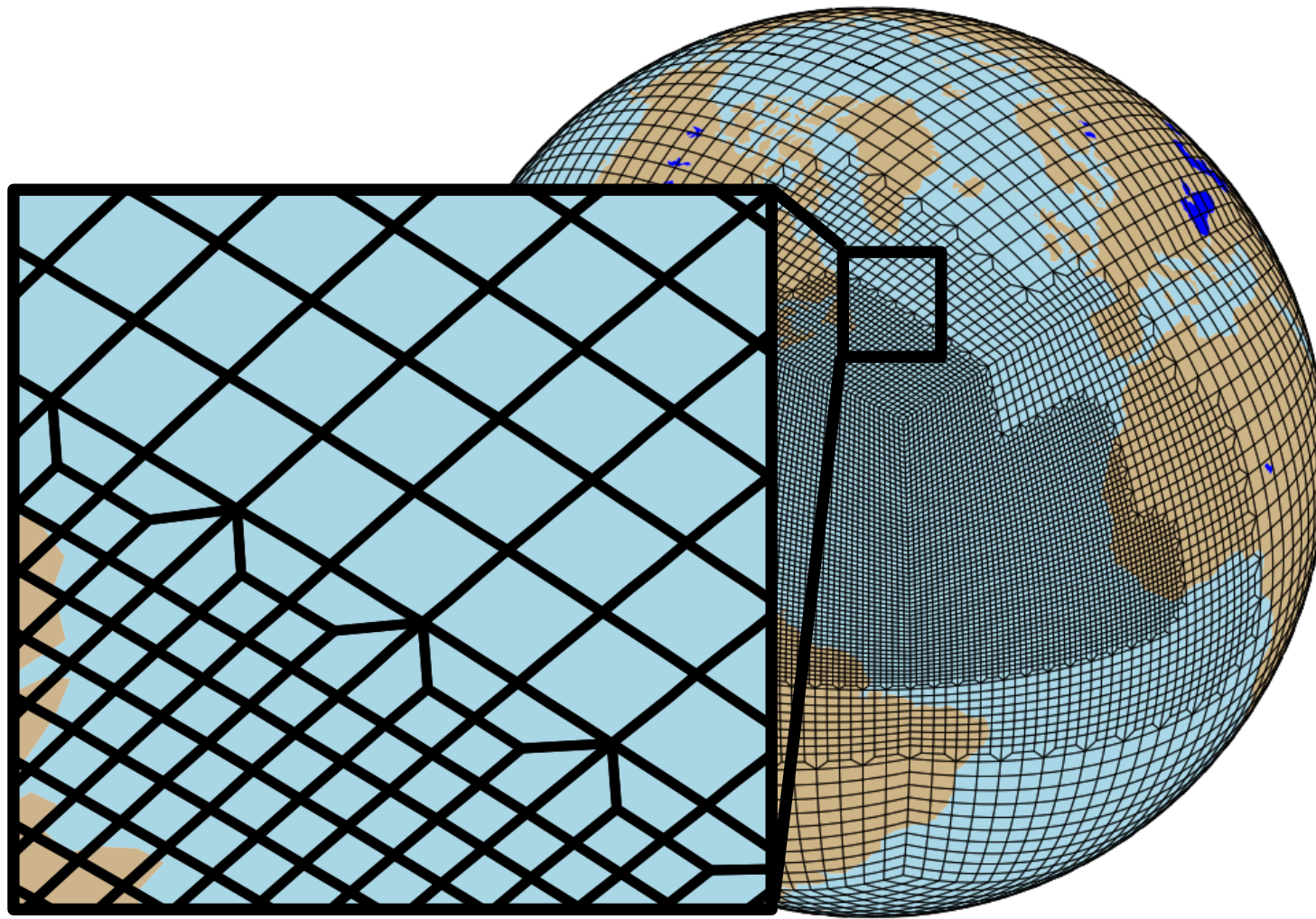
Variable-resolution CAM-SE

- Variable-resolution GCMs
 - High resolution regions embedded (stretching/ nesting) while maintaining unified model
 - Straightforward to conserve mass/energy
 - Target computing resources
- NSF/DoE Community Atmosphere Model Spectral Element (CAM-SE) dynamical core
 - Cubed-sphere grid
 - quasi-uniform
 - no pole convergence/necessary filtering
 - Primitive eqns in local spectral space
 - Easily load-balanced w/ minimal communication
 - Flexible framework for grid nesting
 - No required boundary conditions
 - High-order numerics accurately move flow in/ out of high-resolution nests
 - Multiple high-resolution regions
 - Teleconnections



Refined grids on the cubed sphere

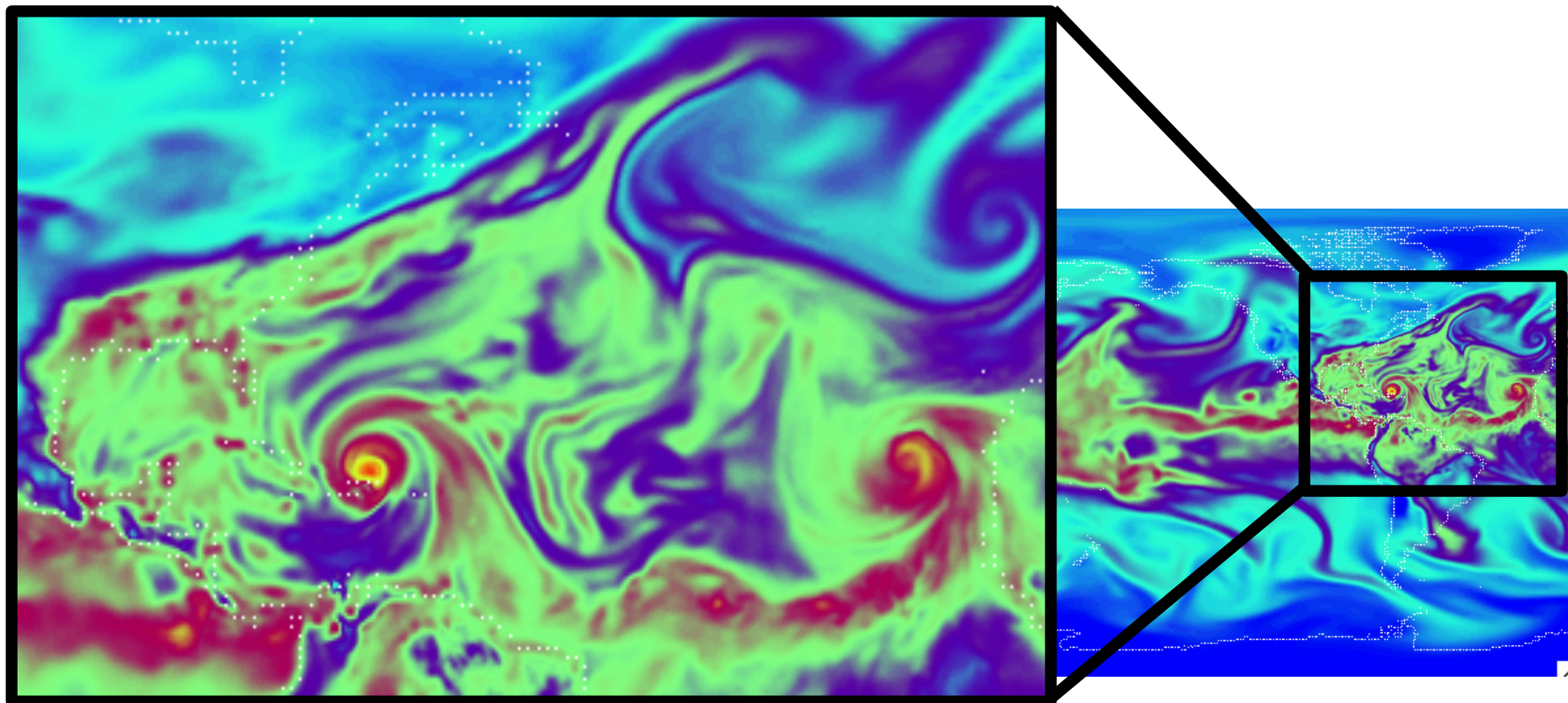
- Atlantic refinement: 1° (**~ 110 km**) $\times 4$ (2^2) (fine = 0.25° = **~ 26 km**)
- Static refinement
- CUBIT (Sandia) refinement package



Climate simulations

- NCAR Community Earth System Model (CESM) framework
- Atmospheric Model Intercomparison Project (AMIP) protocols
 - 1980-2002 (23 years) completed as of today
 - Observed SST, O₃, aerosol, solar forcing, etc.
- CPL7 tri-grid coupler (Craig *et al.* 2011)
 - Land: FV0.9°x1.25° - **active**
 - Ocean/Ice: gx1v6 (~1°) - **prescribed**
- CAM-SE
 - Timestep globally restricted to finest grid scale
 - Stock CAM5 physics
 - **Parameterization scalability caveats apply!**
 - 192 cores (hybrid OpenMP/MPI) NCAR Bluefire = ~0.5 SYPD
 - ~200,000 core hours
- Cyclone tracking
 - Uses GFDL method first proposed by Vitart (1997) and modified by Knutson *et al.*, (2007)
 - Searches for **vorticity max**, **wind max**, **pressure min**, **warm core** - needs to persist **>= 2 days** at **<= 45° latitude**
 - Using **17 m/s** (lowest model level) as wind threshold

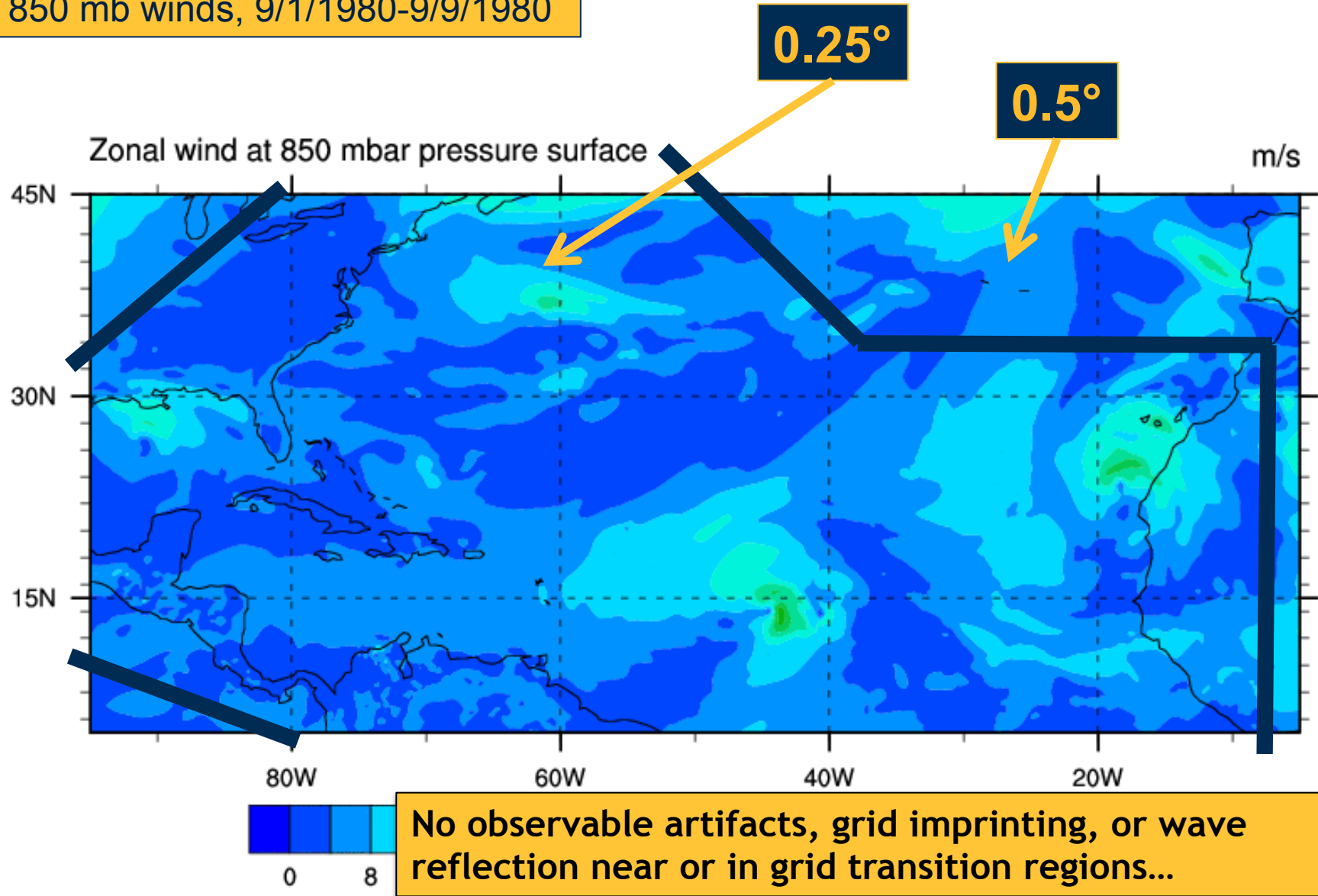
Coupled climate simulations



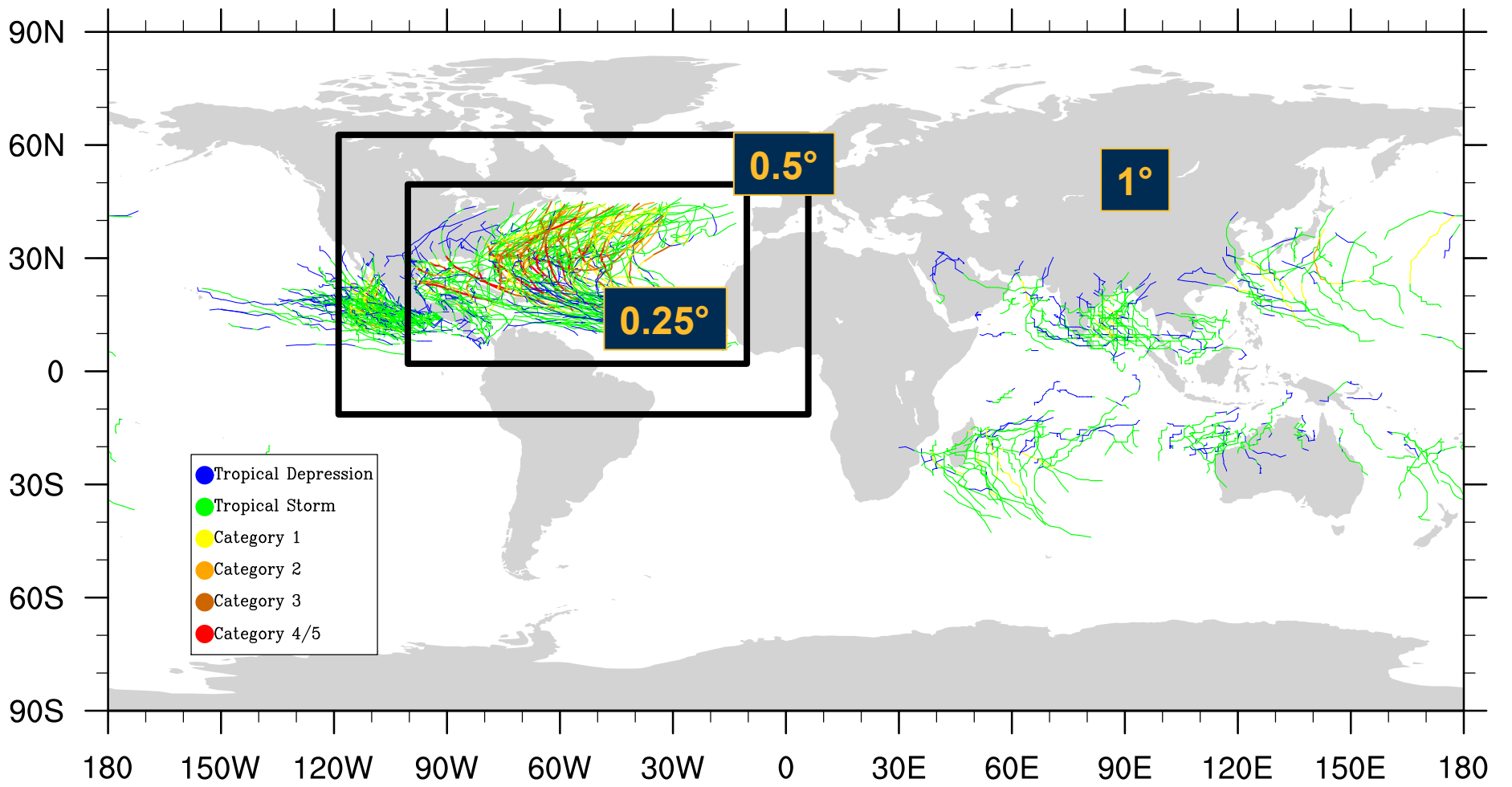
Precipitable water, 9/5/1980

10-day movie

850 mb winds, 9/1/1980-9/9/1980

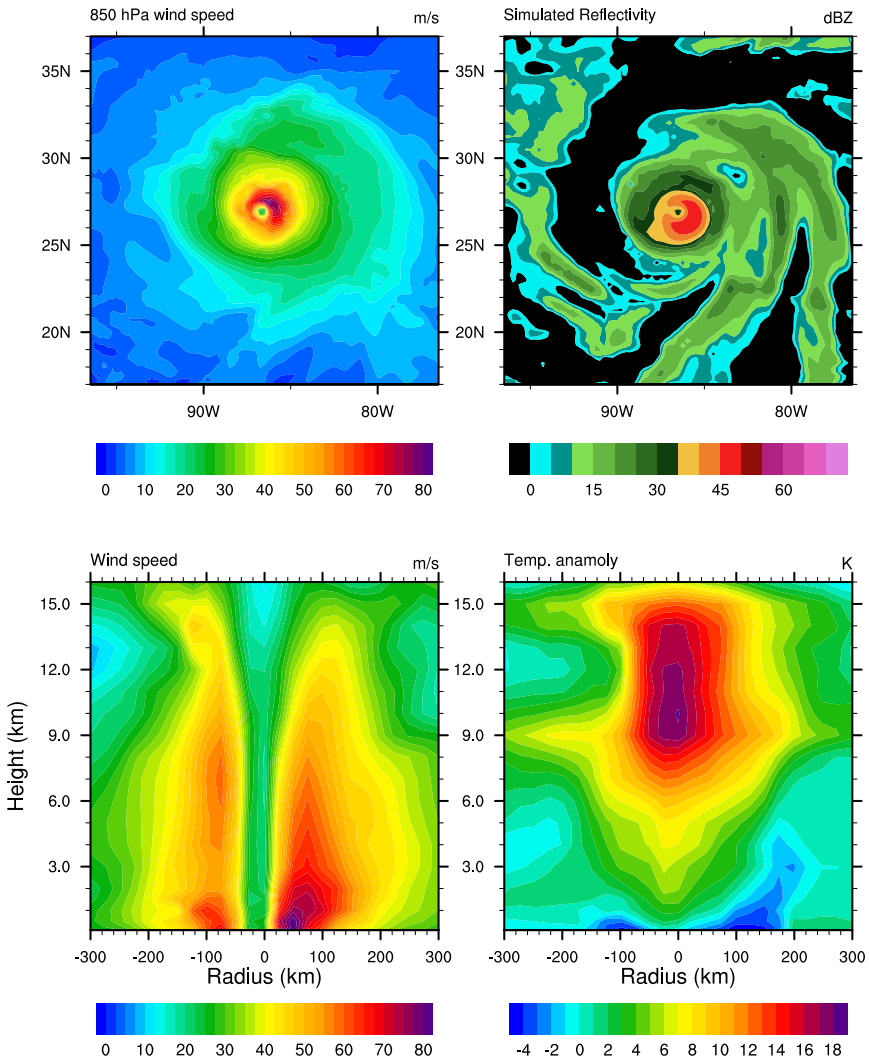
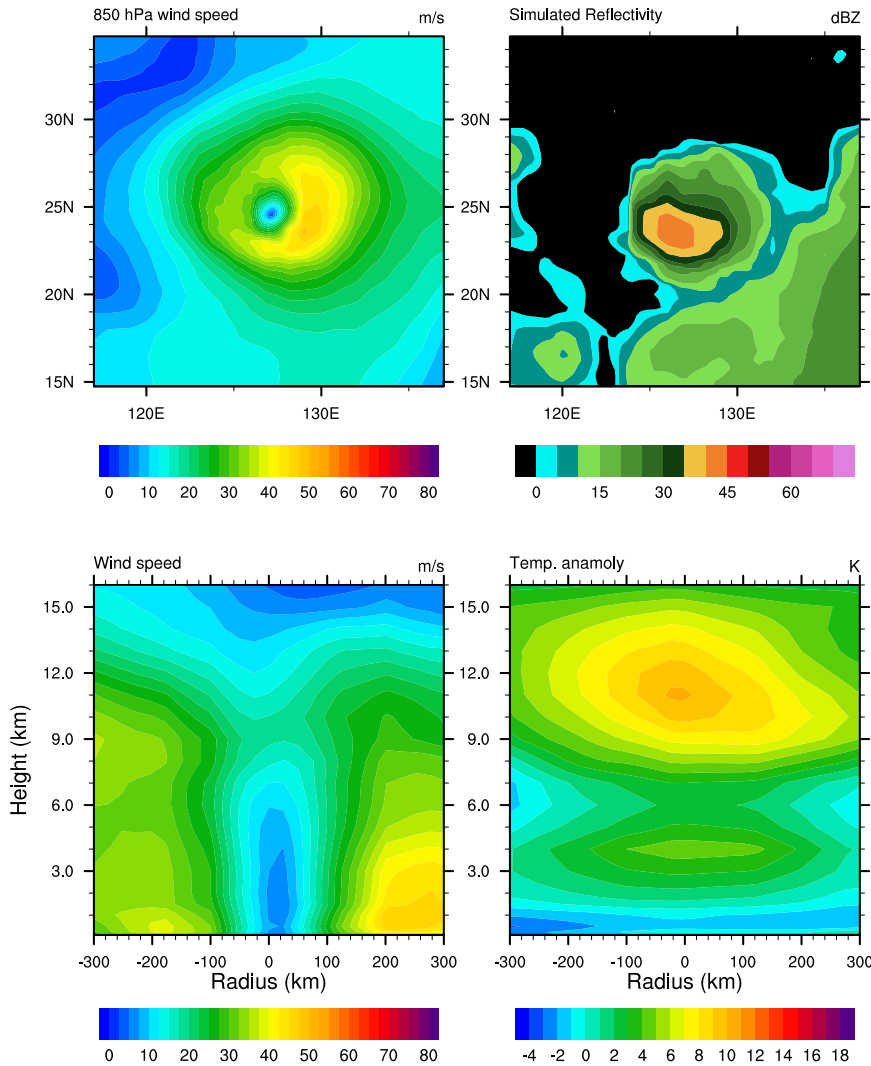


What does resolution buy?



Structural differences

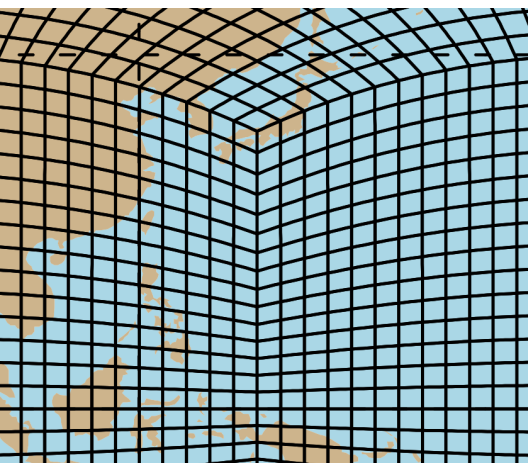
WATL - 0.25°



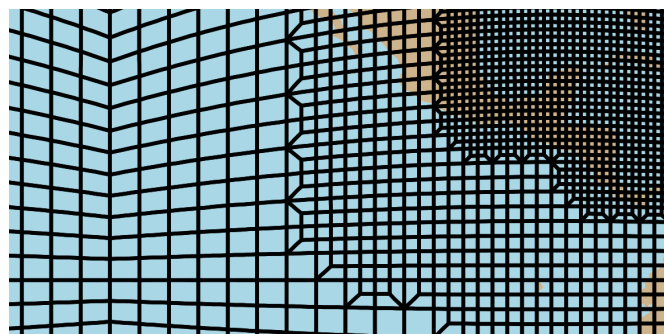
WPAC - 1°

Intensity as function of basin/resolution

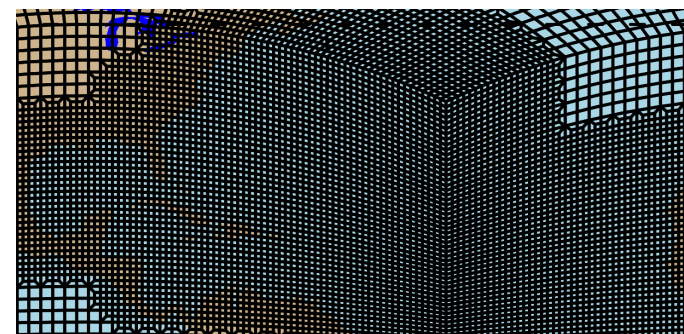
WPAC – 1°



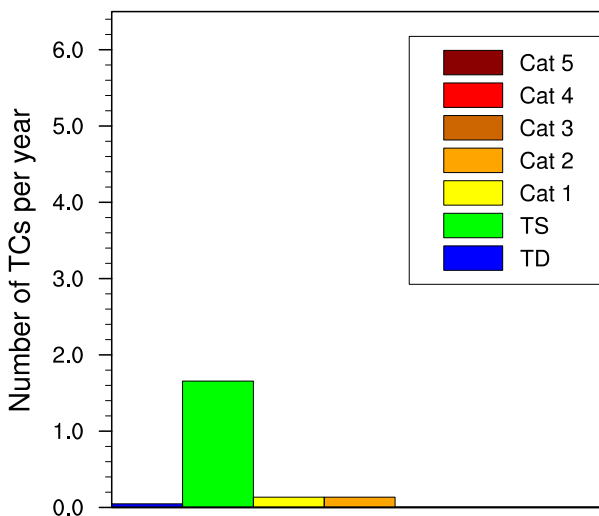
EPAC – 0.5°



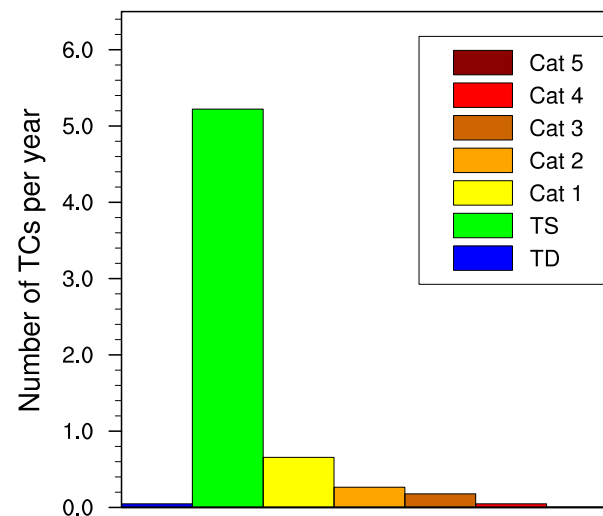
NATL – 0.25°



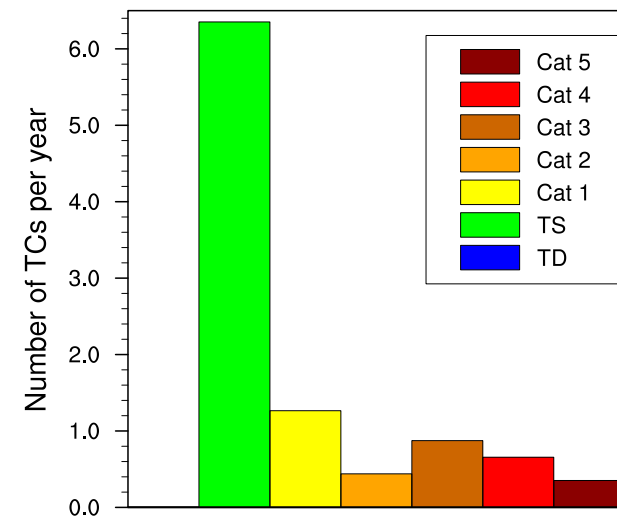
Average TC intensity profile



Average TC intensity profile



Average TC intensity profile

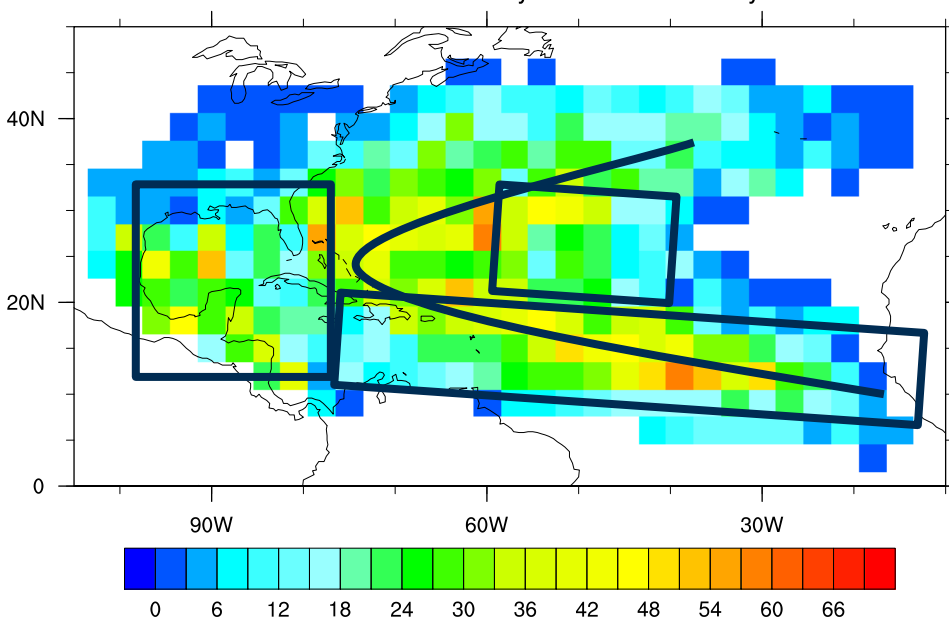


Spatial distribution of TCs

- $3^\circ \times 3^\circ$ track density (number of times TC was a “hit” in each lat/lon bin)
 - CAM-SE represents Cape Verde systems well, mid-Atlantic “hole”
 - Recurvature too far west, Gulf/W. Caribbean density biased low

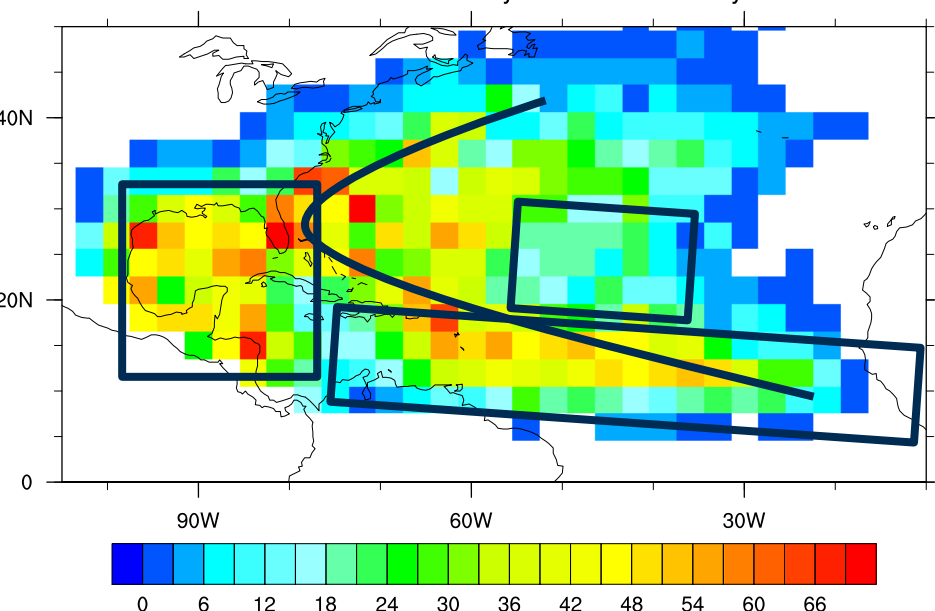
CAM-SE (simulated)

1980-2002 CAM-SE Cyclone Track Density



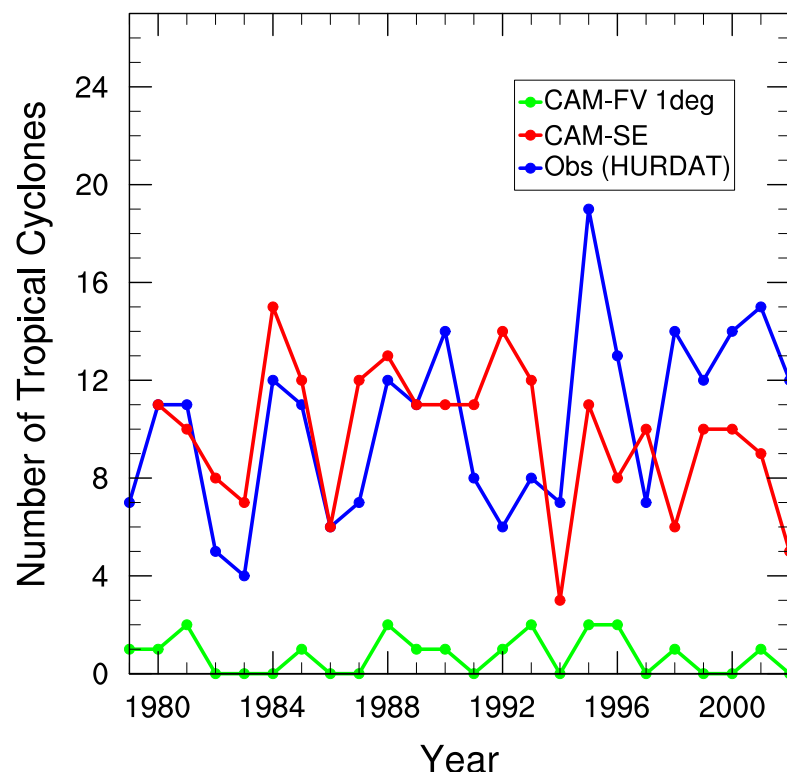
HURDAT (observed)

1980-2002 IBTrACS Cyclone Track Density



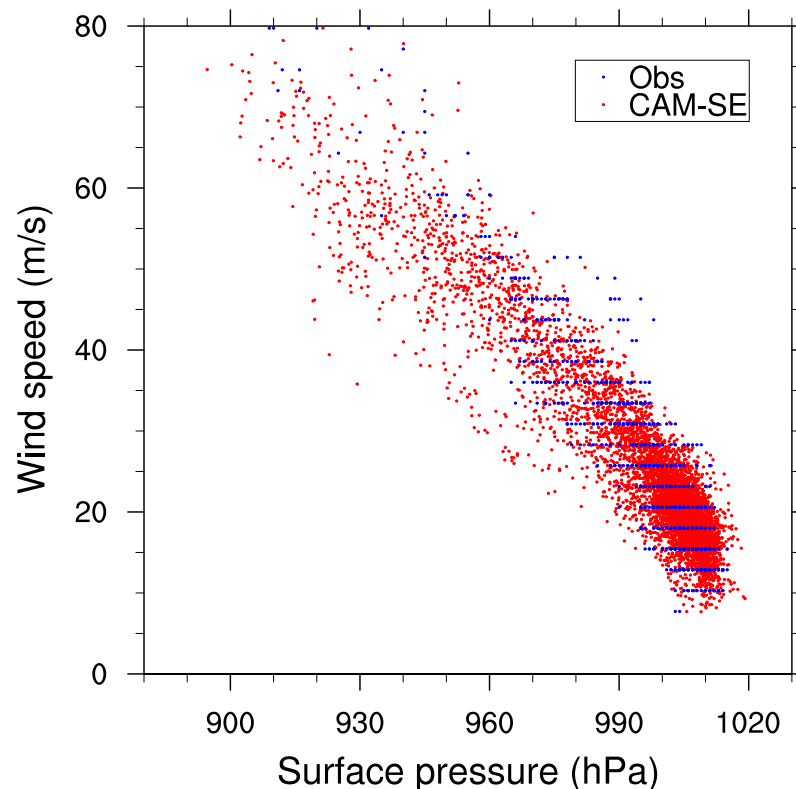
Interannual and pressure-wind performance

Annual Atlantic TC Count



- Resolution absolutely needed to achieve “realistic” TC counts
 - Observational dataset?
 - Ensembles necessary?

Atlantic Pressure-Wind Relationship



- Pressure-wind relationship well matched at 0.25° in refined model; does this still hold at higher (hydrostatic) resolutions?

Synoptic correlation

$$GP = |10^5 \eta|^{3/2} \left(\frac{\mathcal{H}}{50} \right)^3 \left(\frac{V_{\text{pot}}}{70} \right)^3 (1 + 0.1 V_{\text{shear}})^{-2}$$

- Use basin-average Genesis Potential Index (GPI) to correlate model results to reanalysis data

- Complete global 1° CAM-SE simulations...

- High correlation implies synoptic environment not affected by refinement

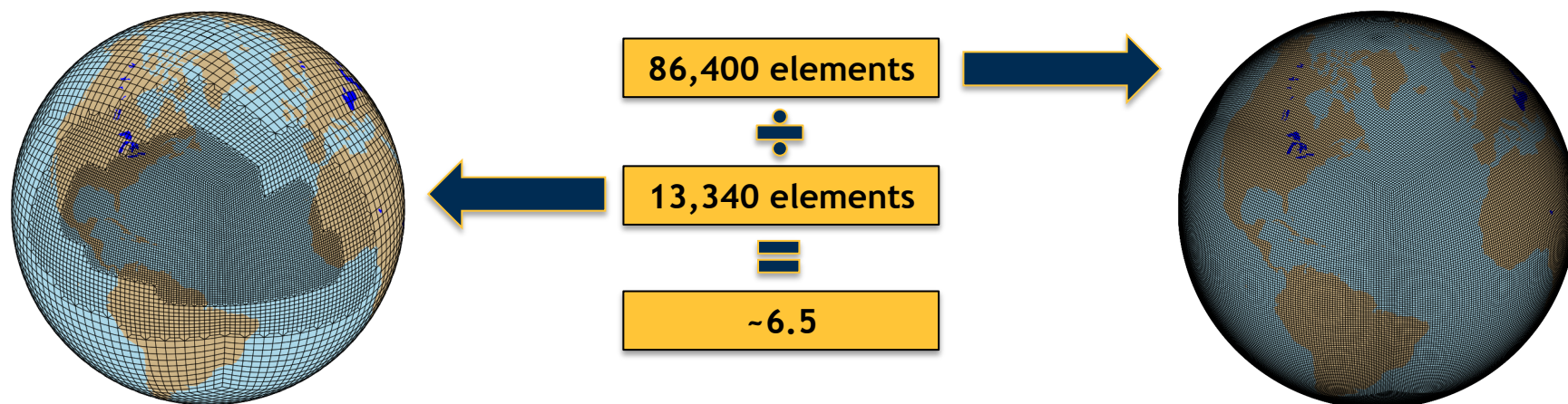
Refined grid-NCEP correlations

Basin	Monthly	Ann. Avg.	TC Season
NATL	0.85	0.41	0.57
EPAC	0.82	0.50	0.42
CPAC	0.33	0.61	0.56
WPAC	0.87	0.59	0.56
NIO	0.36	-0.08	-0.01
SIO	0.30	-0.04	-0.31
SPAC	0.44	0.44	0.00

Refined grid-1 deg CAM correlations

Basin	Monthly	Ann. Avg.	TC Season
NATL	0.97	0.93	0.93
EPAC	0.92	0.84	0.72
CPAC	0.94	0.98	0.97
WPAC	0.93	0.77	0.66
NIO	0.77	0.68	0.77
SIO	0.78	0.64	0.14
SPAC	0.87	0.73	0.69

Computational benefits

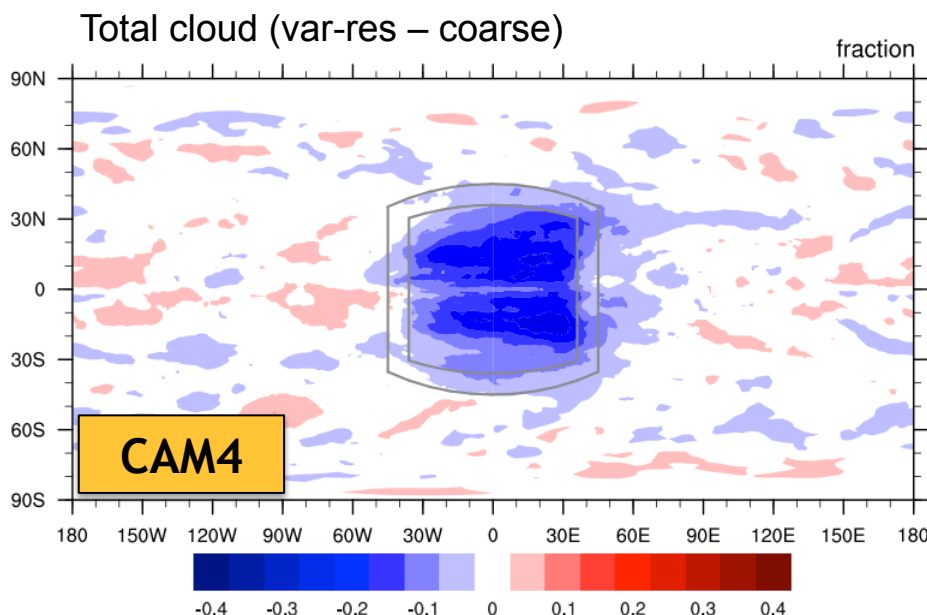


- Atm: ~**6-7x speedup** with variable-resolution vs. $1/4^\circ$ uniform grid
 - Eliminating tri-grid coupler could save ~**10-20%** lost in flux remapping
- For same cost of global uniform/quasi-uniform...
 - Higher regional resolution
 - Additional ensemble simulations
 - Longer model runs
- Potential to get “best of both worlds” between global models, limited area models?
 - Higher resolution to resolve cyclone intensity, vertical structure (regional models)
 - Physically consistent, 2-way interaction, global synoptic flow (global models)

Var-res challenges going forward

- Hydrostatic model
 - Hydrostatic assumption breaks down ~ 10 km (Hall, Nair, NCAR)
- Topography
 - Spectral methods generally require some smoothing for stability
 - How to “differentially smooth?” such that we aren’t under/oversmooth
- Refinement criteria/location
 - Where do we put high-resolution for non-localized features?
 - Ex: Do mountain-affected Rossby waves control Atlantic recurvature?
- Physical parameterizations
 - Scale-aware
 - How to handle regimes where parameterizations turn on/off?

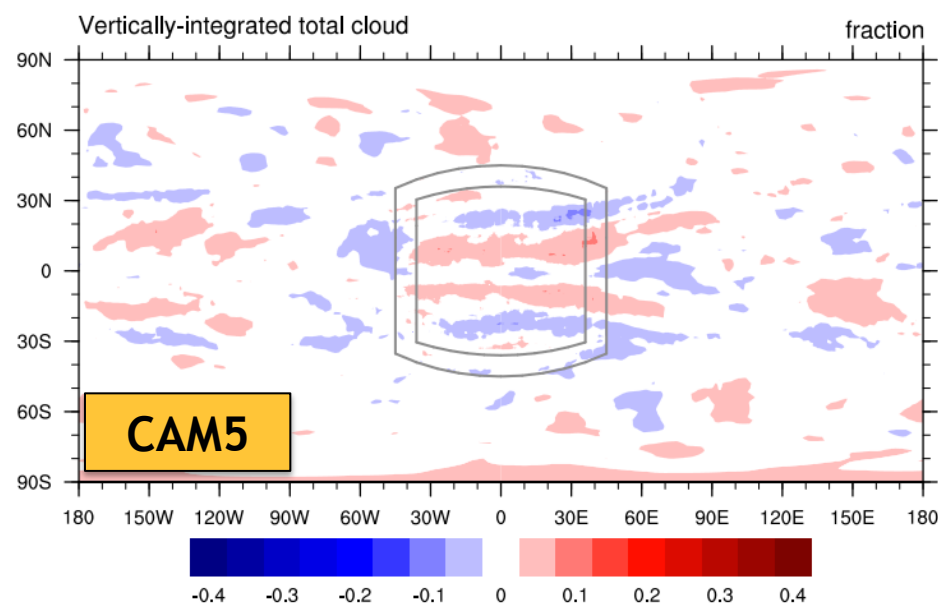
Physical parameterizations



- CAM5 physics an improvement
- Caveat: Only looking at clouds/precip and above hydrostatic threshold

CAM4 runs from Levy, Overfelt, Taylor

- Aquaplanet, 2° refined to 0.25° on cube face
- 48-month average total cloud
- With CAM4 physics, Gill response evident as parameterizations “feel” resolution



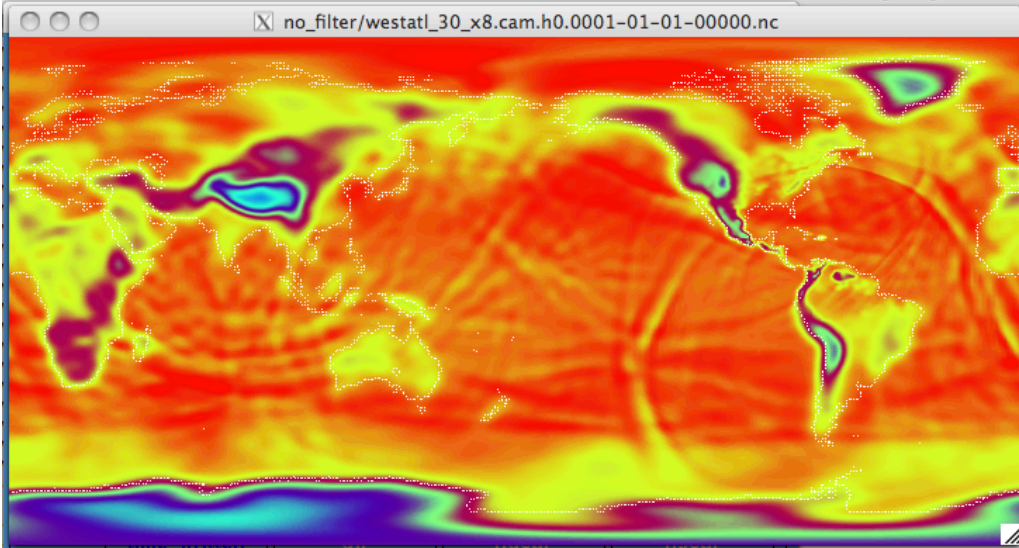
Summary

- Variable-resolution, highly-scalable dynamical cores (such as CAM-SE) may provide opportunities to improve regional climate simulations
- AMIP simulations using observed SSTs with high-resolution nests over Atlantic model realistic TC structure and observationally-reasonable average storm counts and spatial distribution
- Synoptic environment highly correlated to lower resolution simulation (identical forcing) -> indicates resolution not harming already resolved dynamics
- Significant model runtime speedup over globally uniform nest (depending on level and spatial extent of refinement)
 - Provides pathway to:
 - Higher resolution
 - Ensemble simulations

BACKUP SLIDES

- Nothing by nonsense from here on out.

Application of digital filter



No filter, pure interpolation from lat-lon to cubed-sphere

Quit ->1 << < || > >> Edit ? Delay: Opts

3gauss Inv P Inv C Mag X1 Linear Axes Range Bi-lin Print

50000 60000 70000 80000 90000 100000

Var: hyam hybm hyai hybi

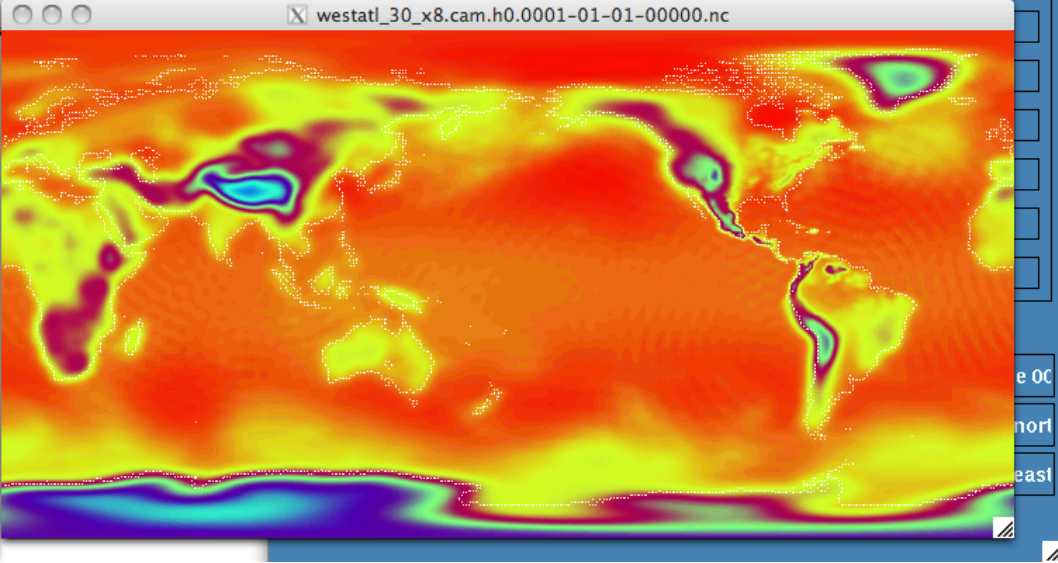
ne_bnds date_written

ndcur nscur

Surface pressure

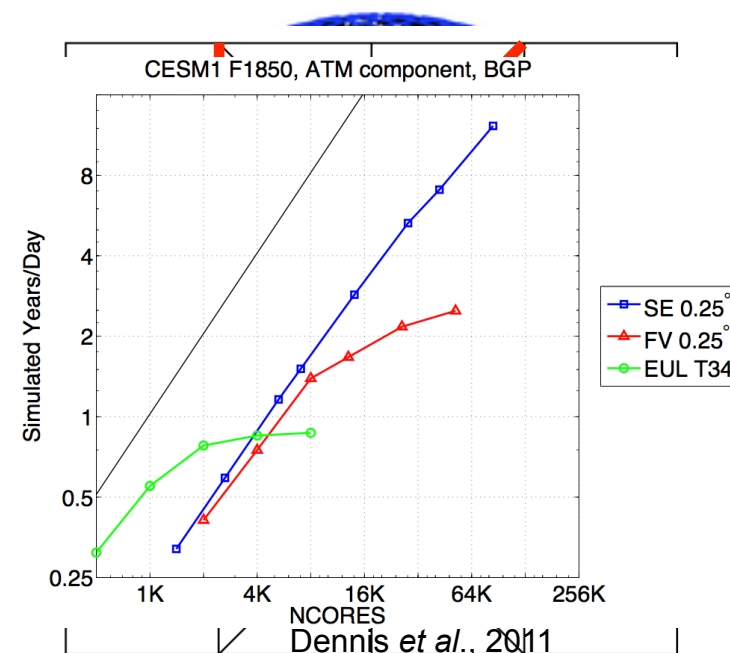
co2vmr	ch4vmr	n2ovmr	f11vmr
f12vmr	sol_tsi	nsteph	CLDICE
CLDLIQ	ICEFRAC	NUMICE	NUMLIQ
PS	Q	SICTHK	SNOWHICE
T	TS1	TS2	TS3
TS4	TSICE	U	V

Filter high frequencies using Heaviside step function - *Fillion et al.*, (1995)



Variable-resolution CAM-SE

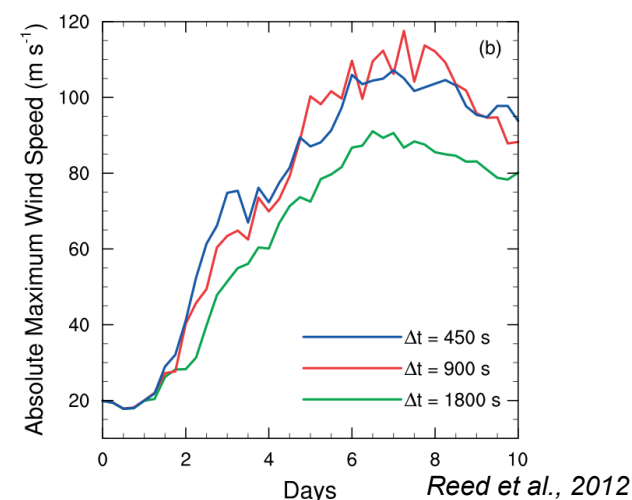
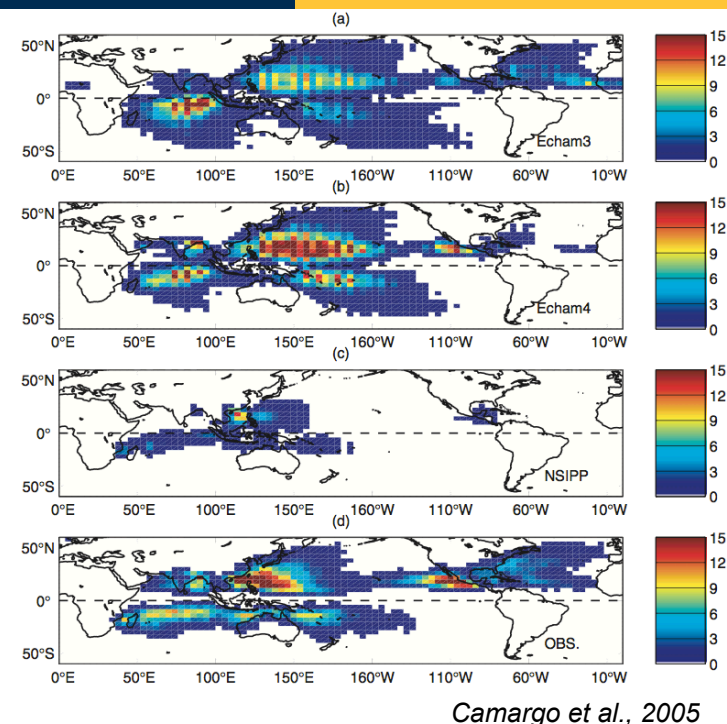
- Variable resolution feature recently implemented in NSF/DoE Community Atmosphere Model (CAM) Spectral Element (SE) dynamical core
- Cubed-sphere grid
 - Quasi-uniform, no pole convergence/necessary filtering
 - *Highly scalable* to thousands of cores
- **Conforming refinement**
 - Every edge shared by only two elements
- **Unstructured**
 - Domain not tiled in (i,j) fashion
- **Static refinement**
 - Grid refined during initialization, does not follow atmospheric features



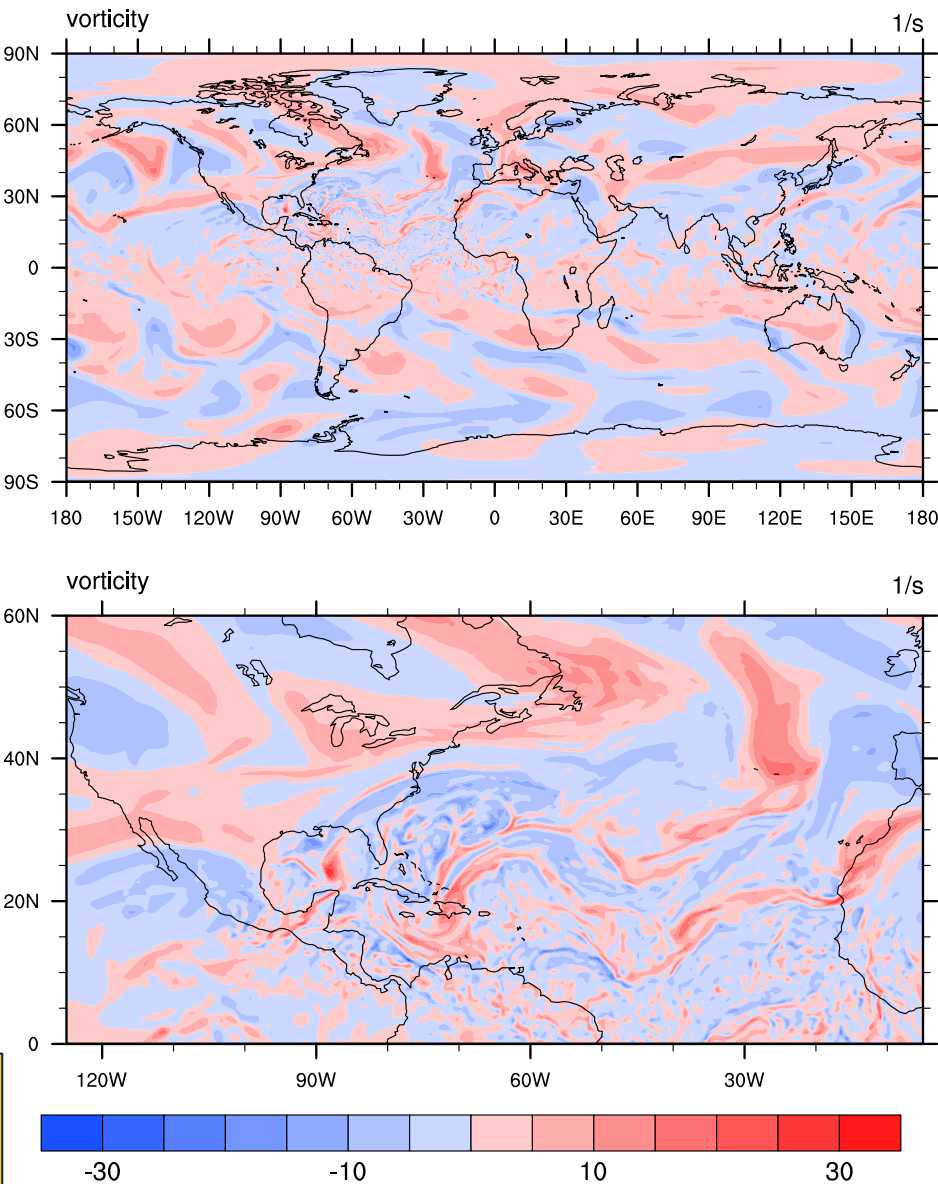
Levy et al., PDES, 2010

Why tropical cyclone forecasts?

- Test dynamical core as a potential future tool in NWP applications
 - Speed is a priority
 - For TCs, LAMs/GCMs have opposing pros/cons
 - “Franklin: Regional models (HWRF, GFDL) not being used because structure of Sandy not well-represented.” - NHC media call 10/26/12
- Provides fine-grained information on model biases (e.g., storm track, intensity) which can be useful in understanding uncertainty in TC climate forecasts (Knutson *et al.*, 2010)
- Allows for high-resolution testbed to develop/tune physical parameterizations



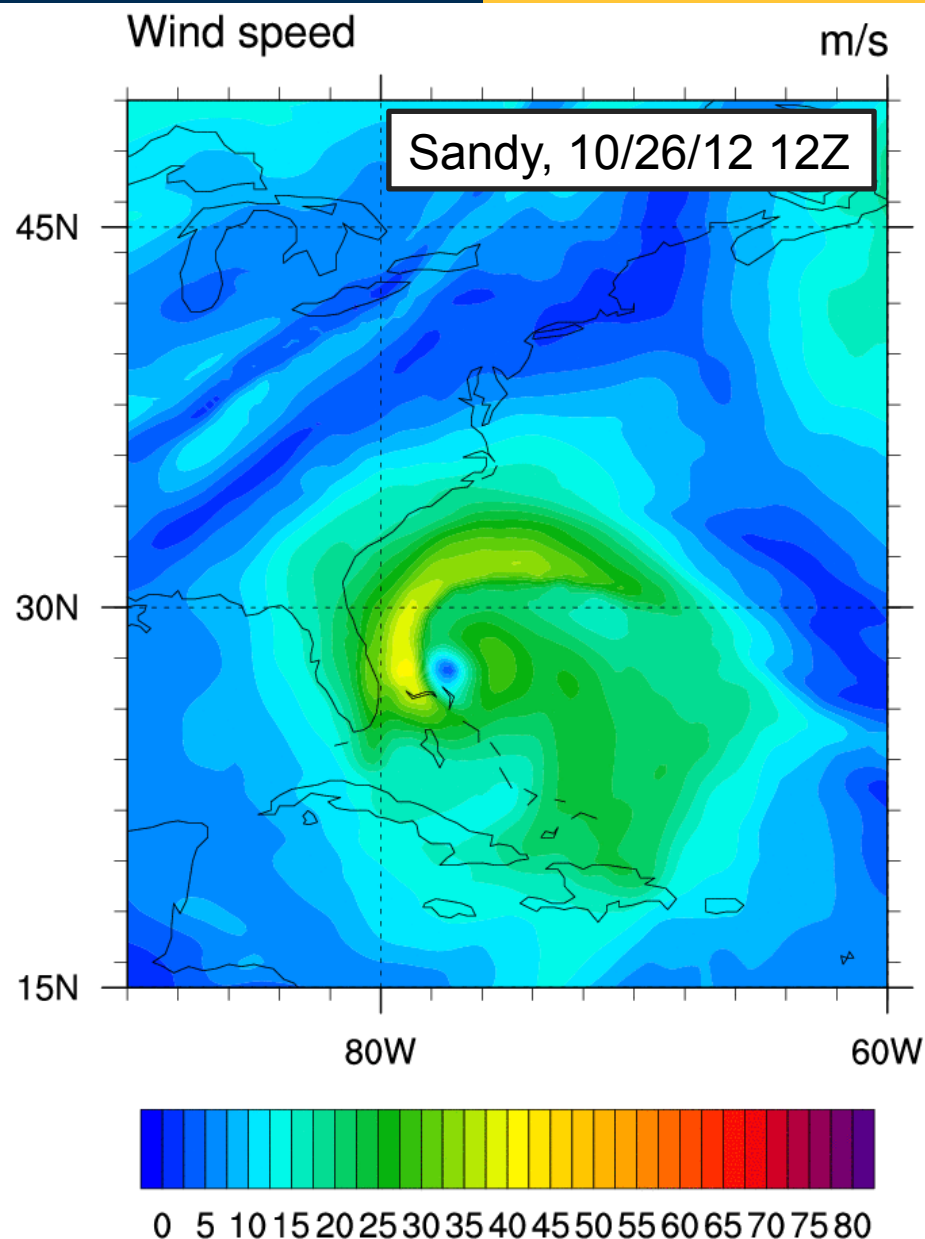
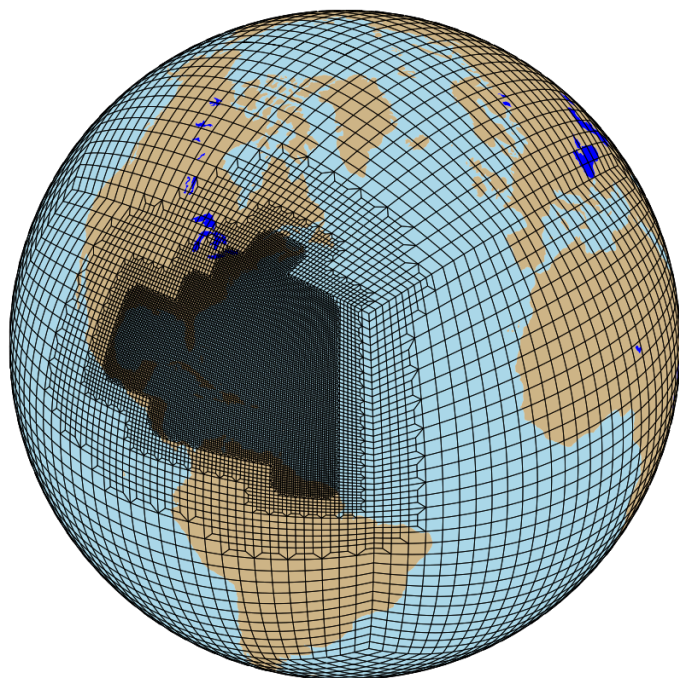
Vorticity structure



200 mb vorticity,
9/27/2002

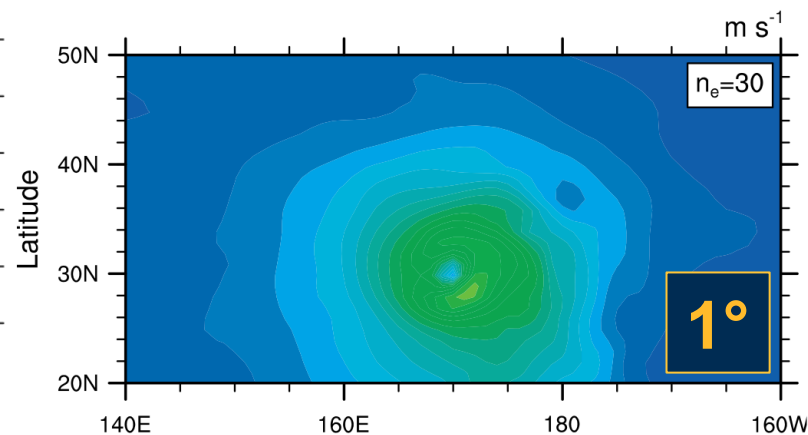
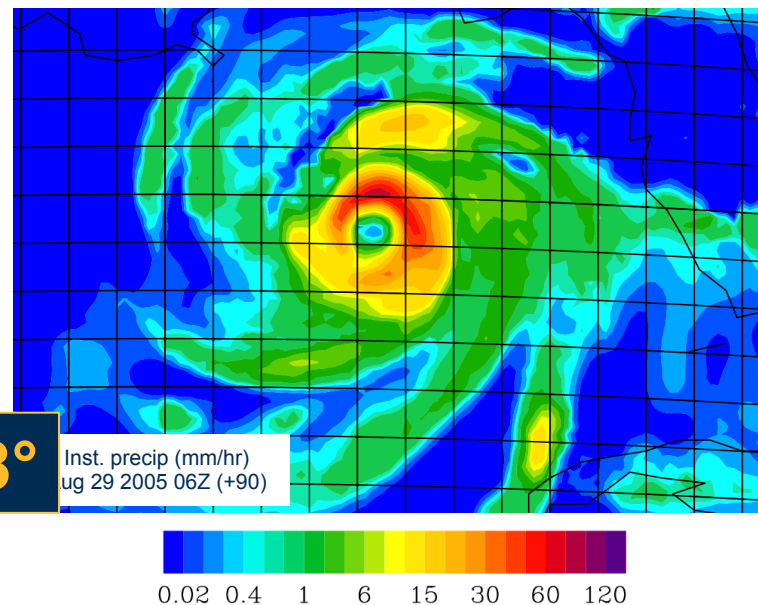
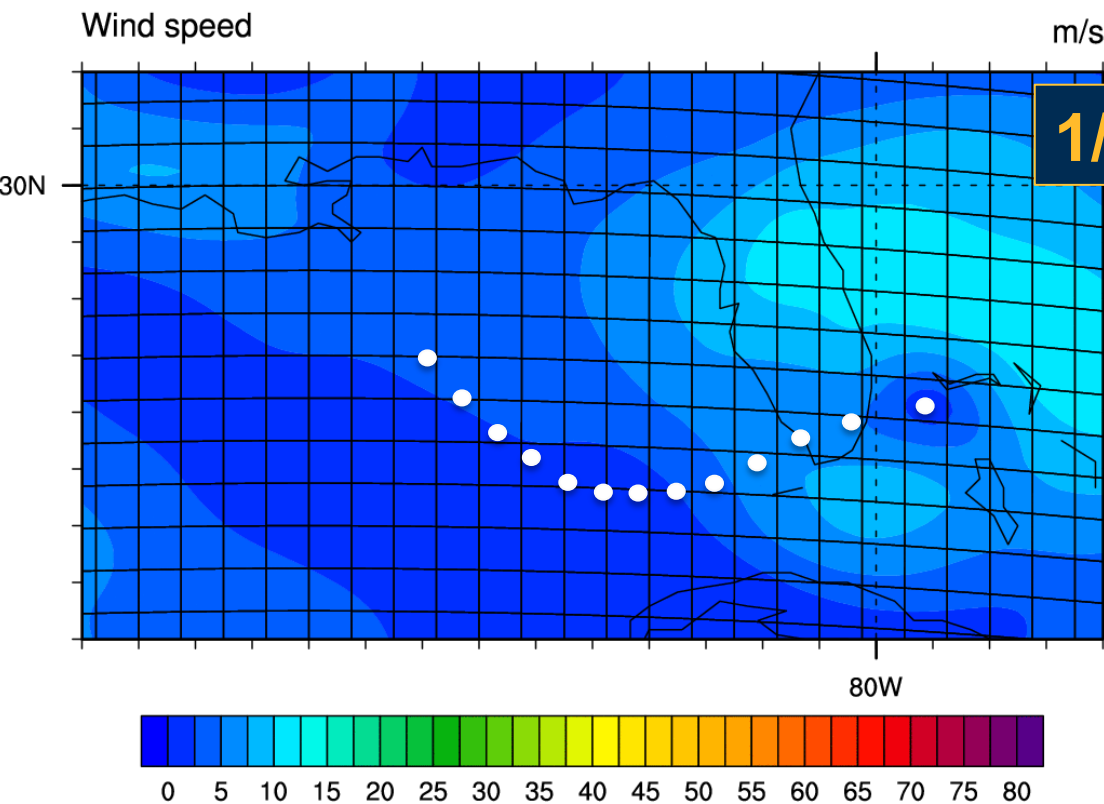
High-res deterministic simulations

- CAM-SE “forecast mode”
- Equivalent 1° global grid refined by a factor of 8 to $1/8^\circ$ (~13 km) over western Atlantic Ocean



High-res deterministic simulations

- Hurricane Katrina (2005)
- Initialized from ERA-Interim reanalysis -> 8/25 12Z (~115 hours before landfall)



Courtesy K. Reed

High-res deterministic simulations setup

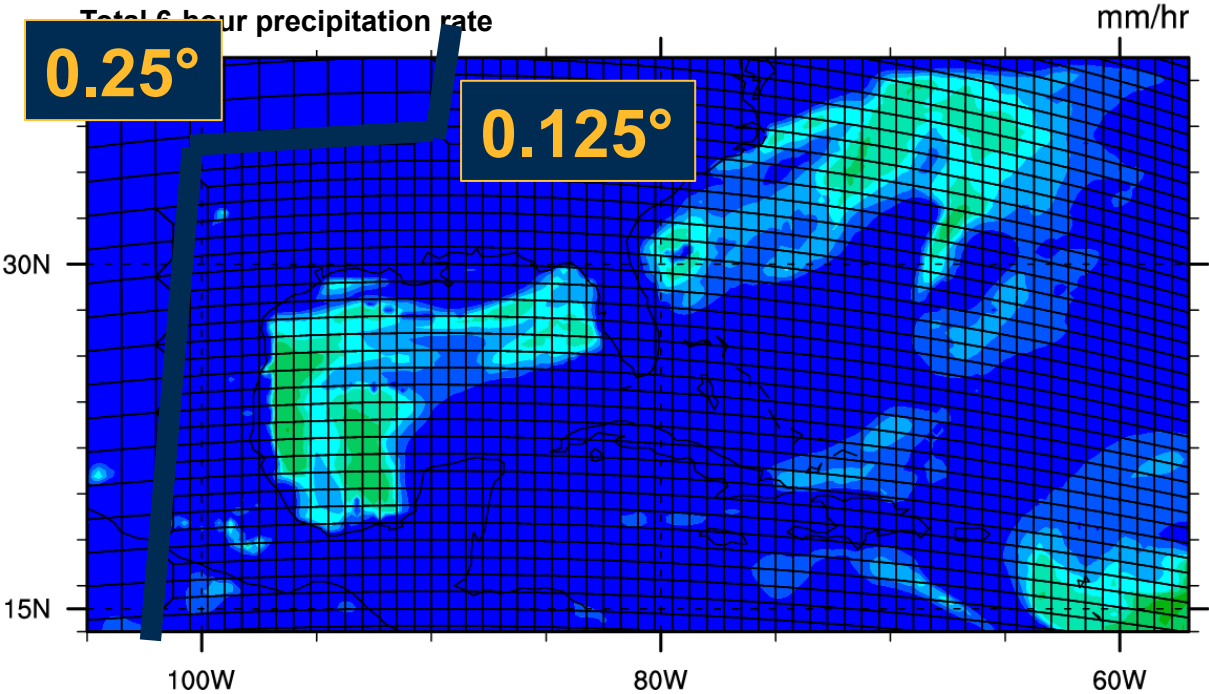
- Hurricane Isaac simulations: 00Z each day from 08/22/12 to 08/26/12
 - 120 hour forecasts
- Global Forecast System (GFS) analysis (atm + SSTs) interpolated to CAM-SE grid
- Simulation -> ~3 hours wall clock time
 - 256 cores (4 nodes) on NCAR Bluefire (IBM)



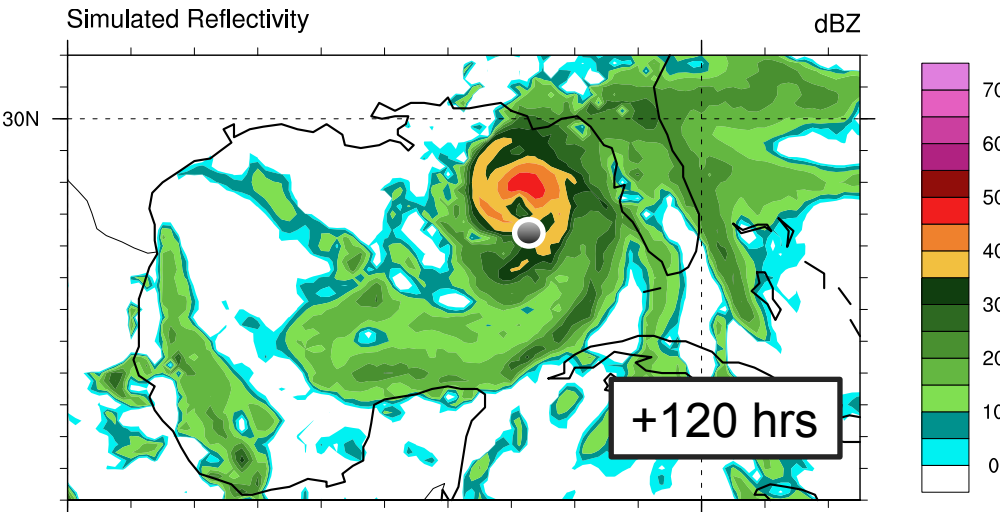
NASA MODIS



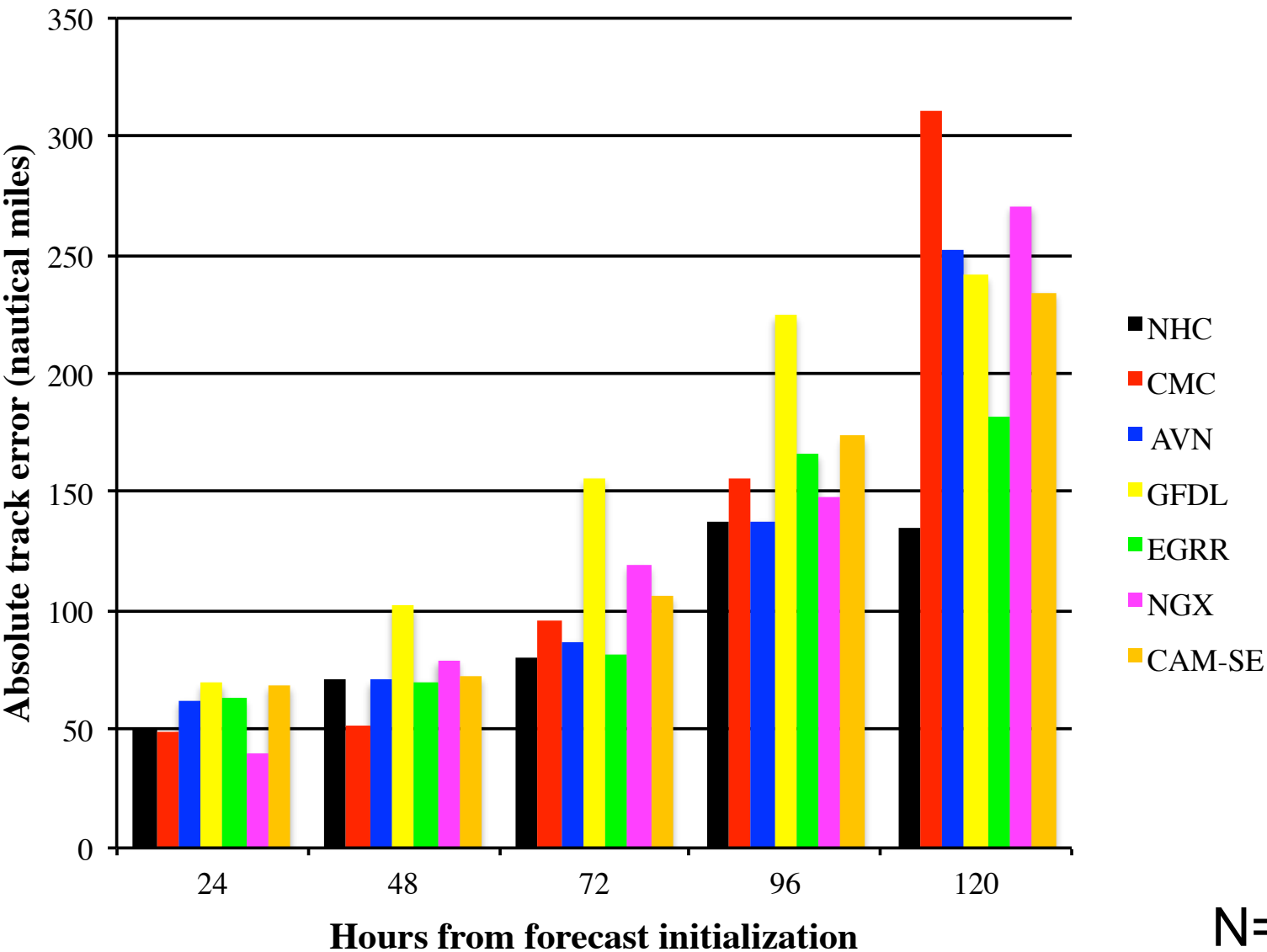
Hurricane Isaac forecasts



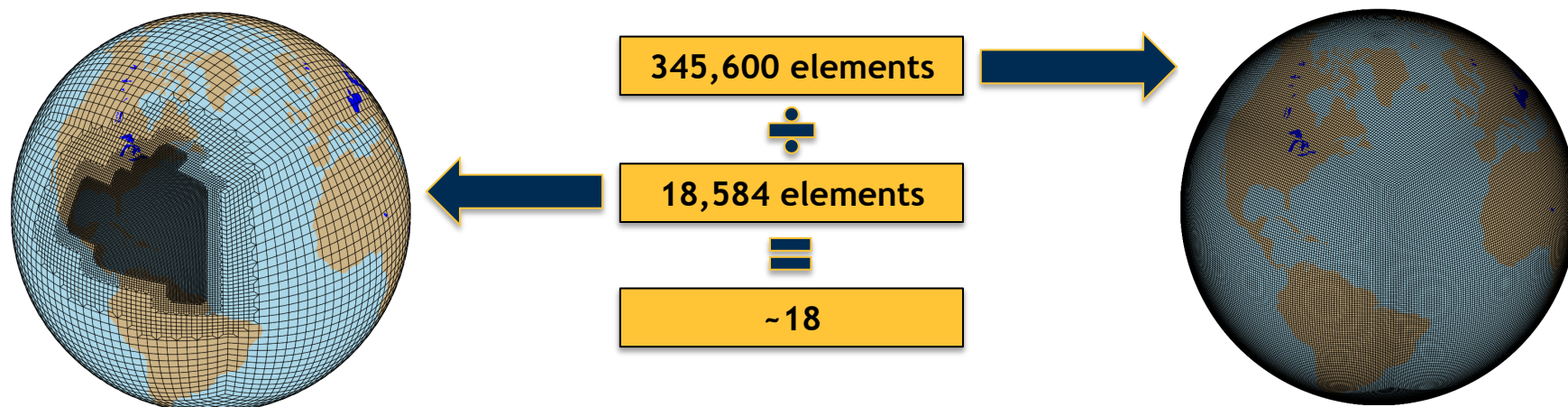
- 08/22/12, 00Z
(earliest simulation)



Hurricane Isaac forecast track errors



Computational benefits



- Atm: ~**15-20x speedup** with variable-resolution vs. $1/8^\circ$ uniform grid
 - Scales with number of elements and fixed compute load
- For same cost of global uniform/quasi-uniform...
 - Higher regional resolution
 - Additional ensemble simulations
 - Longer model runs
- Combine best features of global models, limited area models?
 - Higher resolution to resolve cyclone intensity, vertical structure (regional models)
 - Physically consistent, 2-way interaction, global synoptic flow (global models)