

# Lessons from simulating tropical cyclones in climate models

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Manila, Philippines, 2-4 November 2015

# Reference:

Review paper:

- S.J. Camargo & A.A. Wing, 2015. Tropical cyclones in climate models, WIREs Climate Change, early online, doi: [10.1002/wcc373](https://doi.org/10.1002/wcc373)

# Main challenge:

- Climate model simulations: **low horizontal resolution** – computationally compatible with long simulations, multiple future scenarios and multiple ensemble members.
- Tropical cyclones: accurate simulation necessary to run models with **high horizontal resolution**.
- Simulation of TCs in climate models a difficult task.

# Historical perspective I

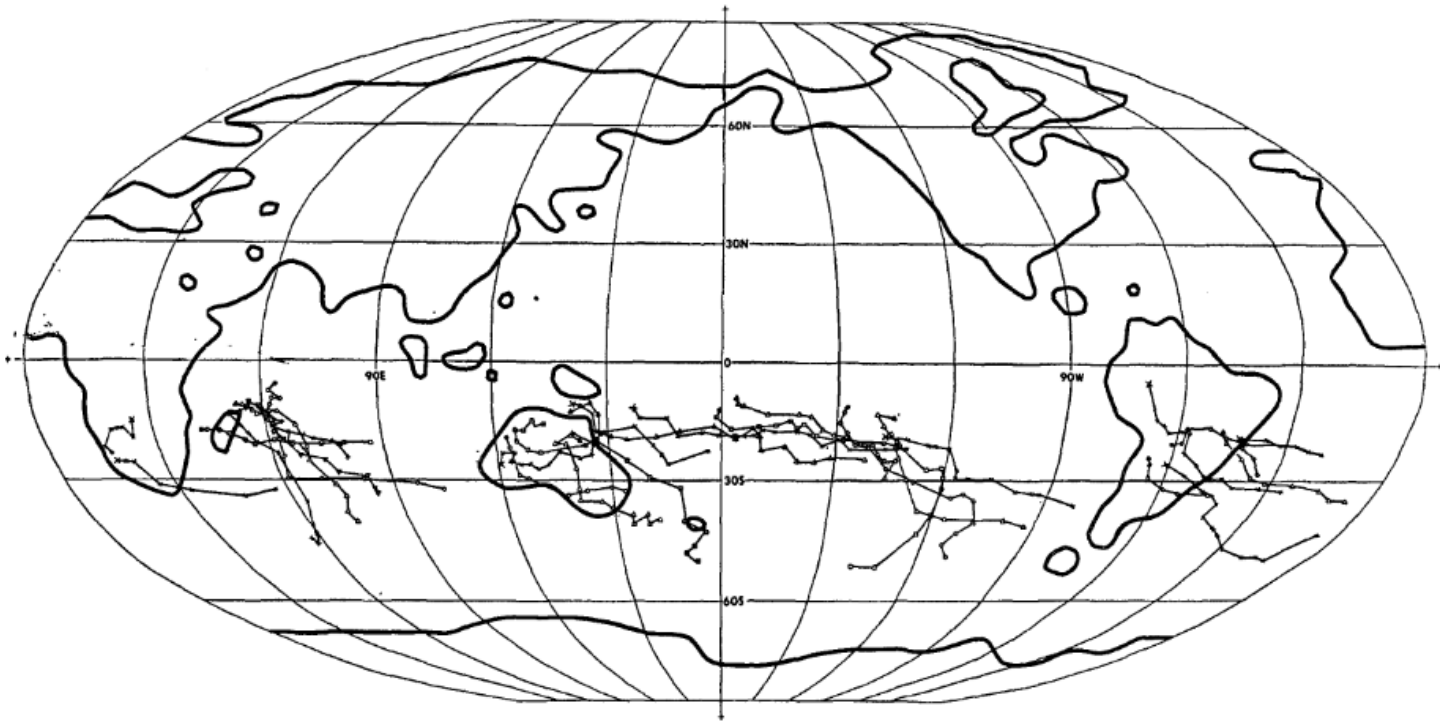
- Since 1970s: climate models produce disturbances similar to Tropical Cyclones (TCs)
- Location, seasonality, tracks, lifetime: “compatible” with observations

# Historical Perspective II:

1<sup>st</sup> paper discussing tropical cyclones in climate models:

Manabe, Holloway and Stone, JAS 1970

- Cyclonic vortices in observed TC regions
- Low-resolution model: 417 km (Equator) to 655 km (Poles)



Manabe et al., J. Atmos. Sci., 1970

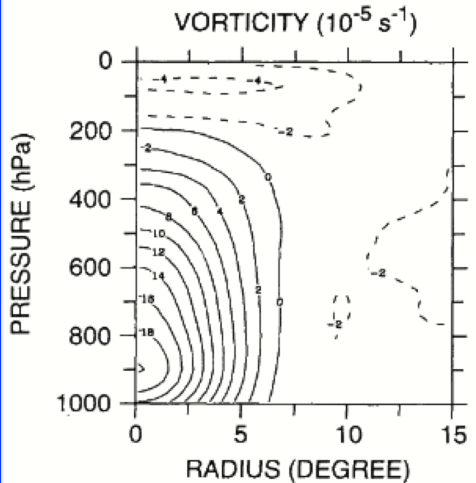
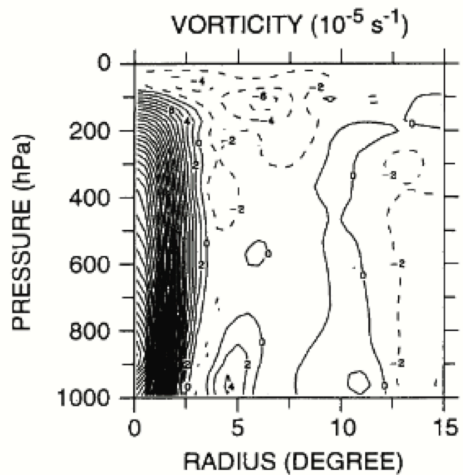
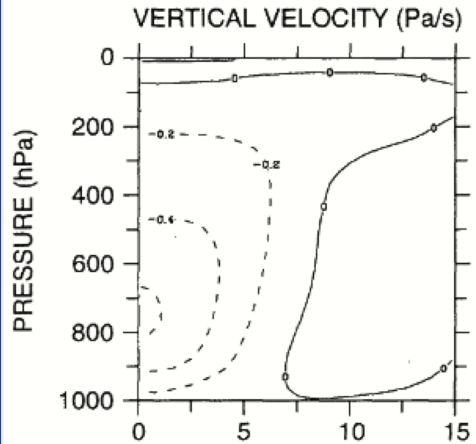
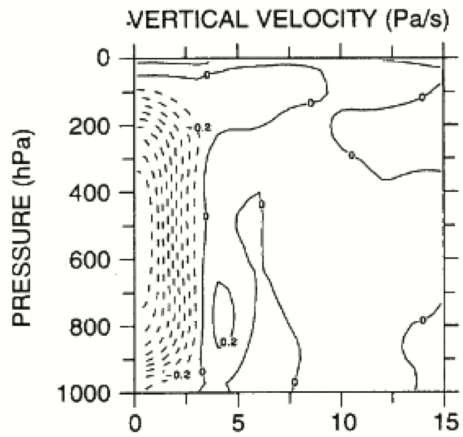
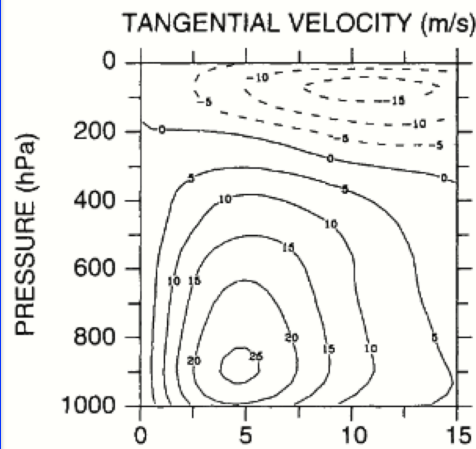
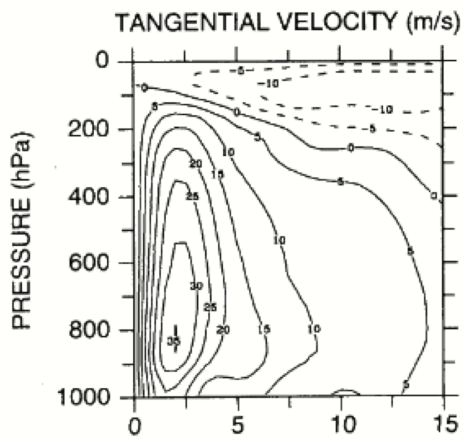
# Historical Perspective III

- Structure somewhat similar to observed TCs
- Vortices with low pressure values, heavy precipitation, strong convergence near the surface and divergence in the upper troposphere
- Formation with warm over warm sea surface temperatures (SSTs)
- Main biases: large size and weak intensity – due to low horizontal resolution

# Historical Perspective IV:

- Bengtsson, Böttger & Kanamitsu, Tellus A, 1982: TCs in the ECMWF model (1 year) – sensitivity to SST.
- 1980s: substantial progress in forecasting individual storms. Necessary requirements:
  - Horizontal high-resolution
  - Surface layer fluxes with adequate resolution
  - Parametrizations of boundary layer, cumulus convection, radiative processes

# Improvements with increasing model resolution

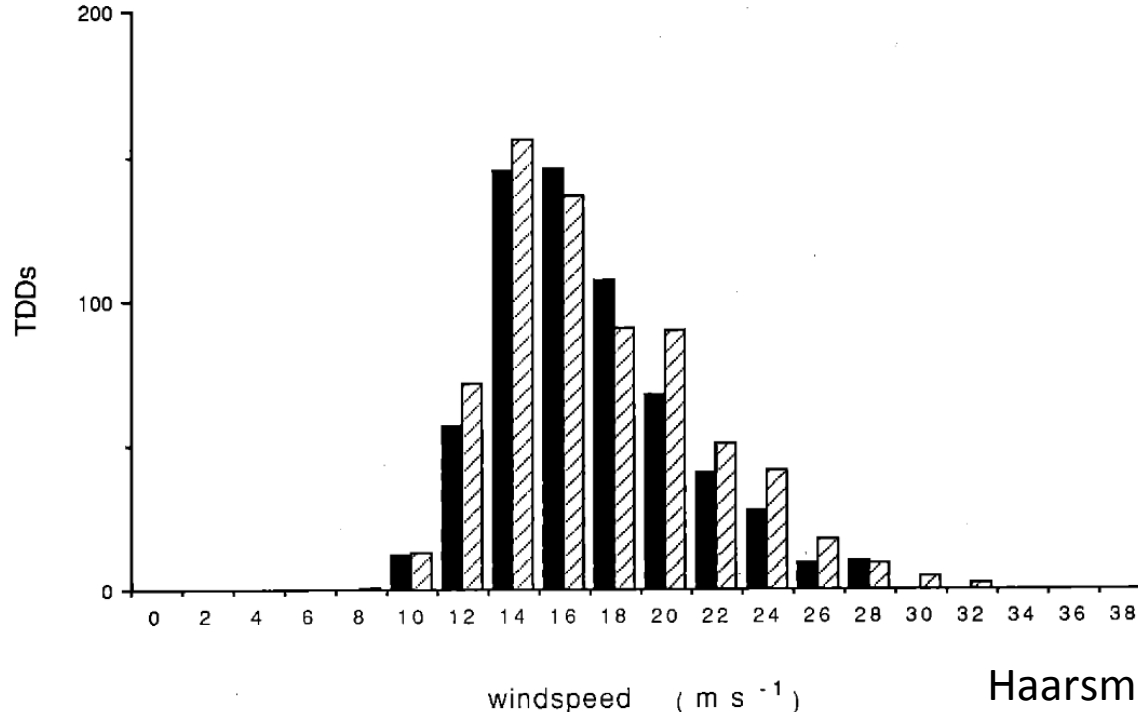


# Historical Perspective V: Climate Change & Tropical Cyclones

- First study - Broccoli & Manabe (1990): simulations with  $2xCO_2$  vs. control:
  - TC like storms tracked in both models
  - Results were inconclusive, depending on cloud treatment.
- Launch of a new way of studying the interaction of TCs and climate change

# Historical Perspective VI

- First studies analyzing the impact of climate change on tropical cyclone activity in the 1990s (Broccoli & Manabe, 1990; Haarsma et al. 1993; Bengtsson et al. 1996).
- Double CO<sub>2</sub> vs. control

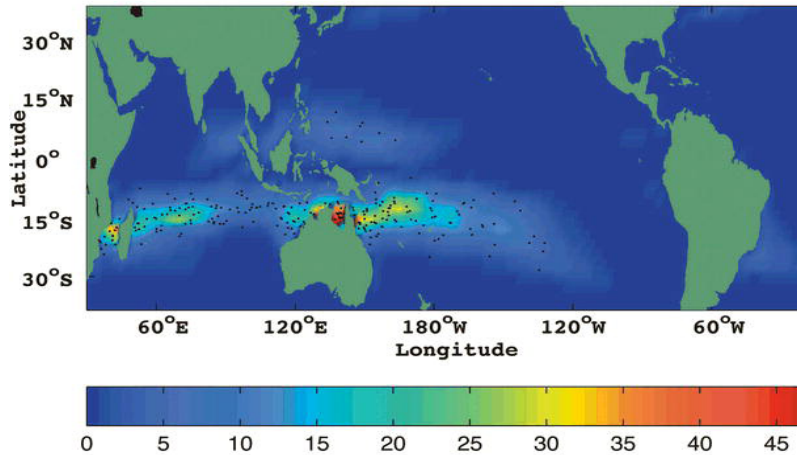


# Alternative approaches

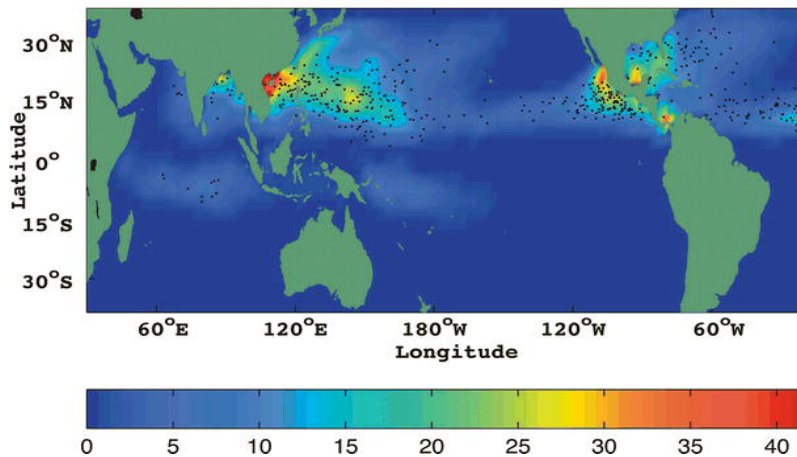
- Genesis indices applied to climate models
- Dynamical Downscaling
- Statistical-dynamical downscaling
- Statistical-dynamical forecasts

# Genesis Indices

(a)

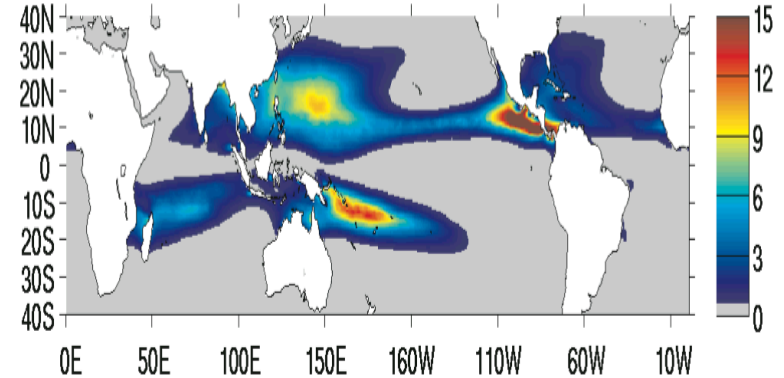


(b)

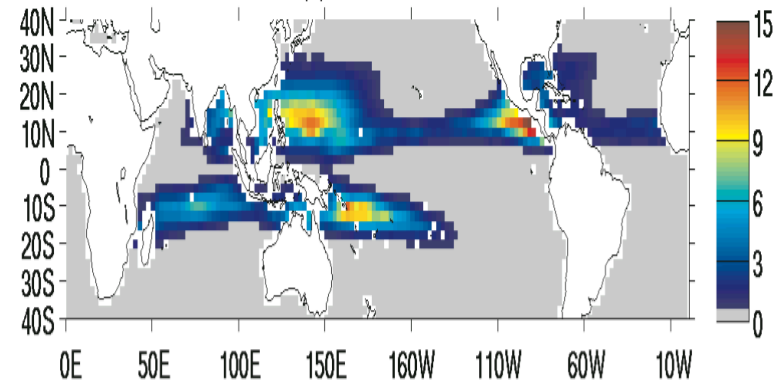


Emanuel & Nolan GPI  
Camargo et al. 2007

(a) TCGI-R HIRAM Climatology

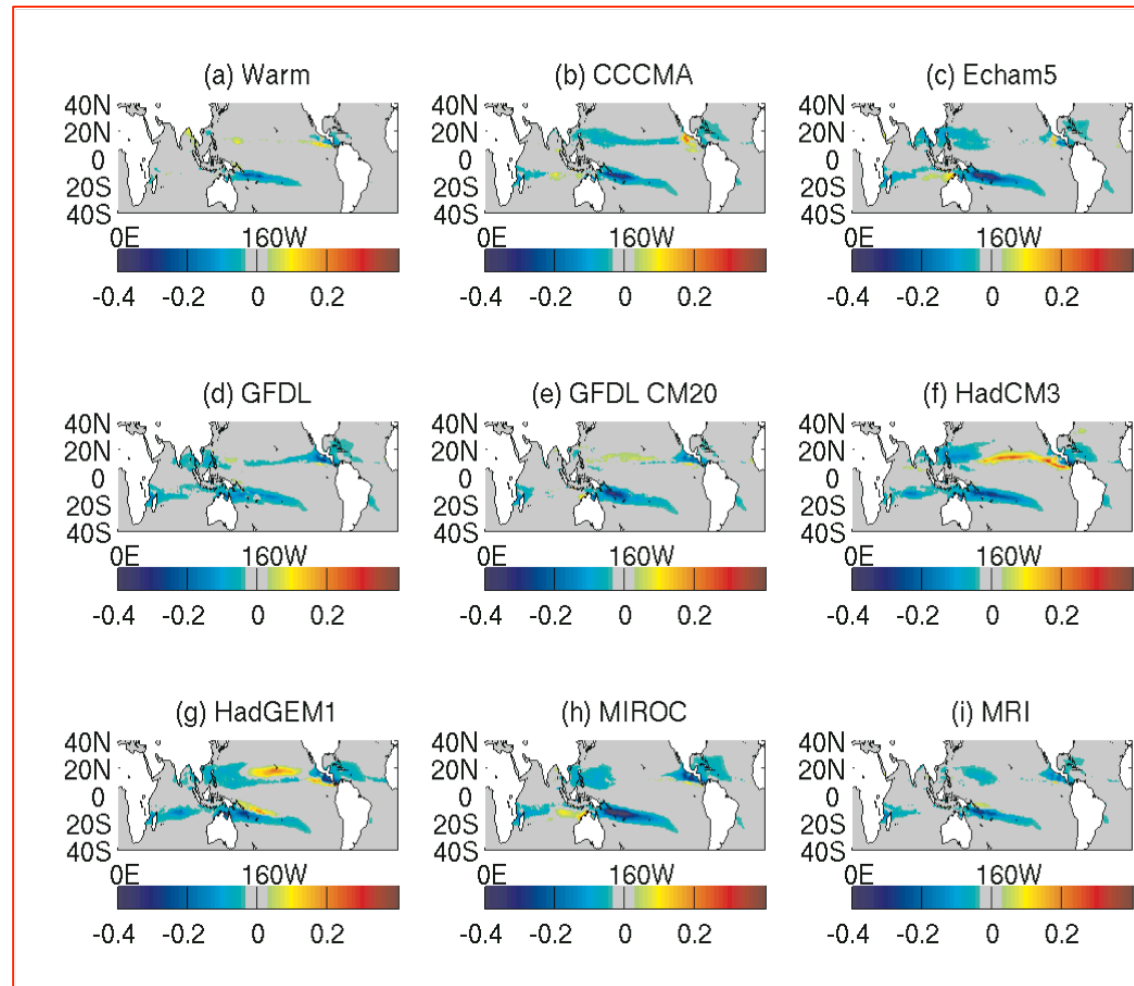
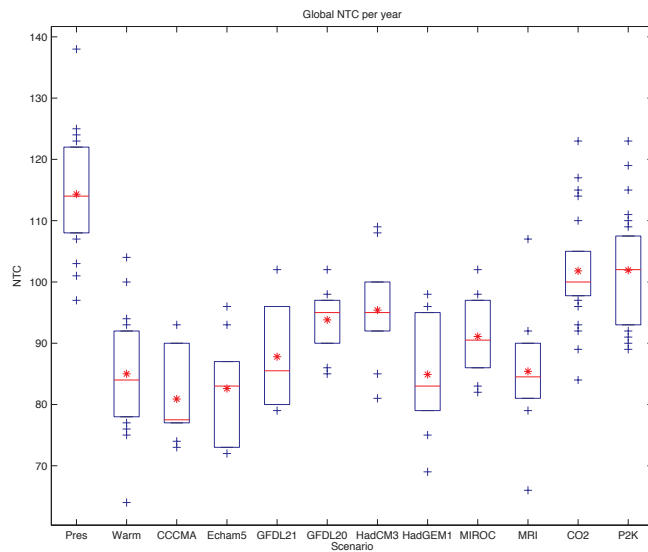


(b) TCGI-R NCEP



Tippett et al. 2011 TCGI  
Camargo et al. 2014

# Genesis Indices & Climate Change



# Synthetic tracks – large-scale environment from climate models

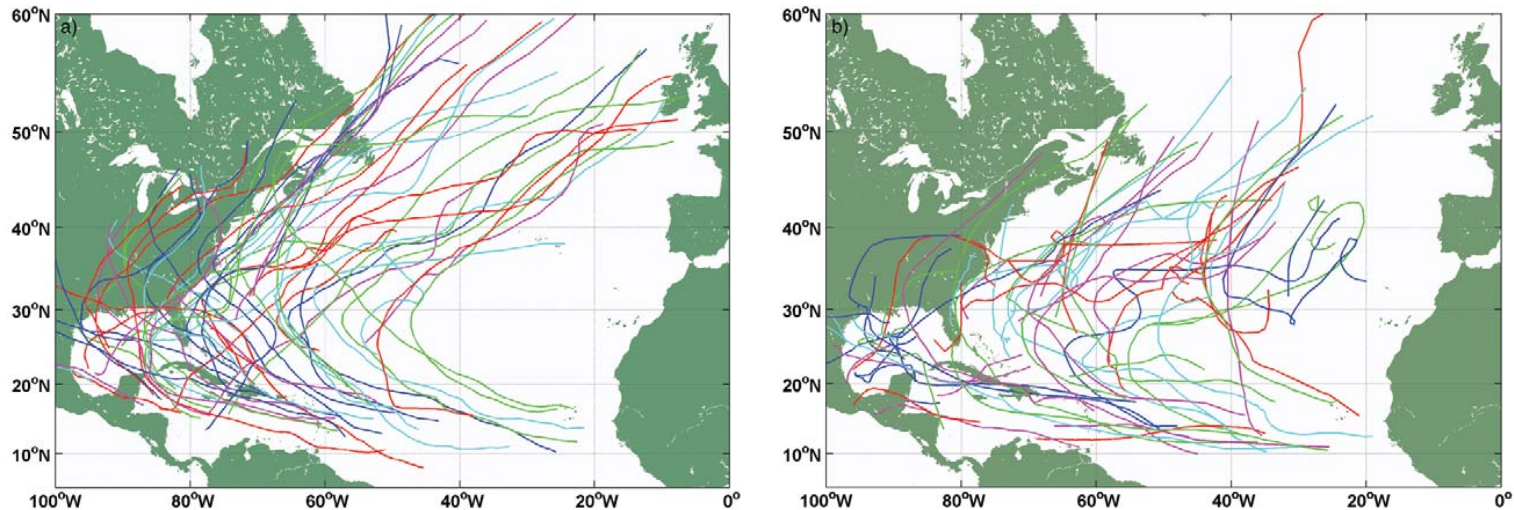
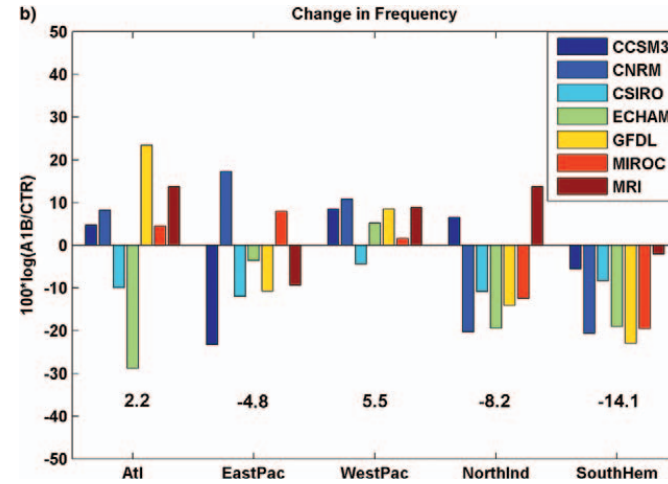
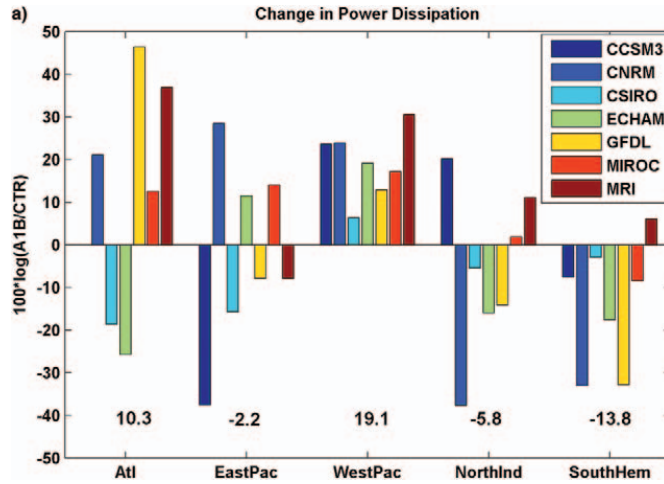
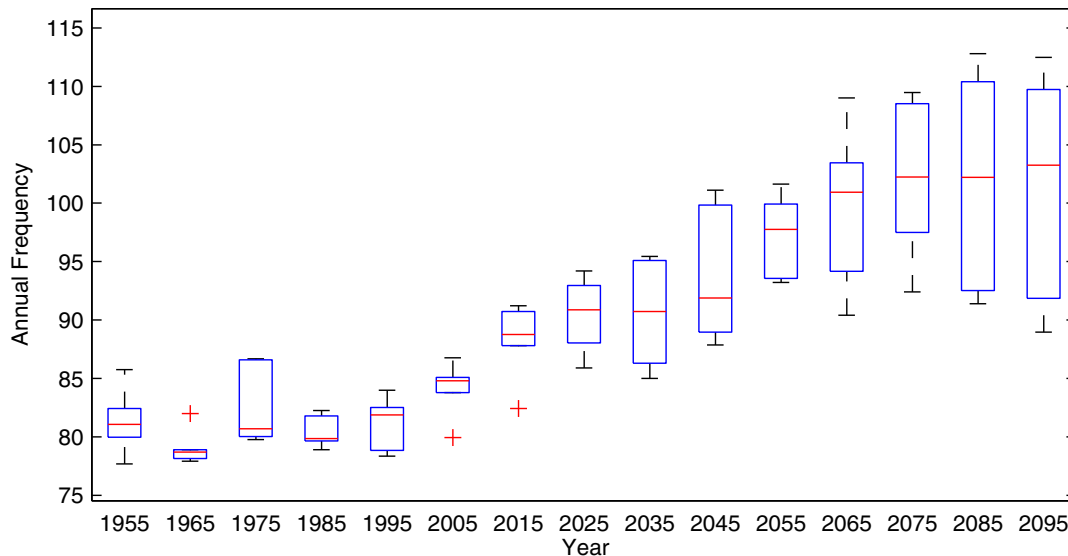


FIG. A1. Sixty random tracks from (a) the Markov chain method, and (b) HURDAT data.

# Statistical-Dynamical Downscaling

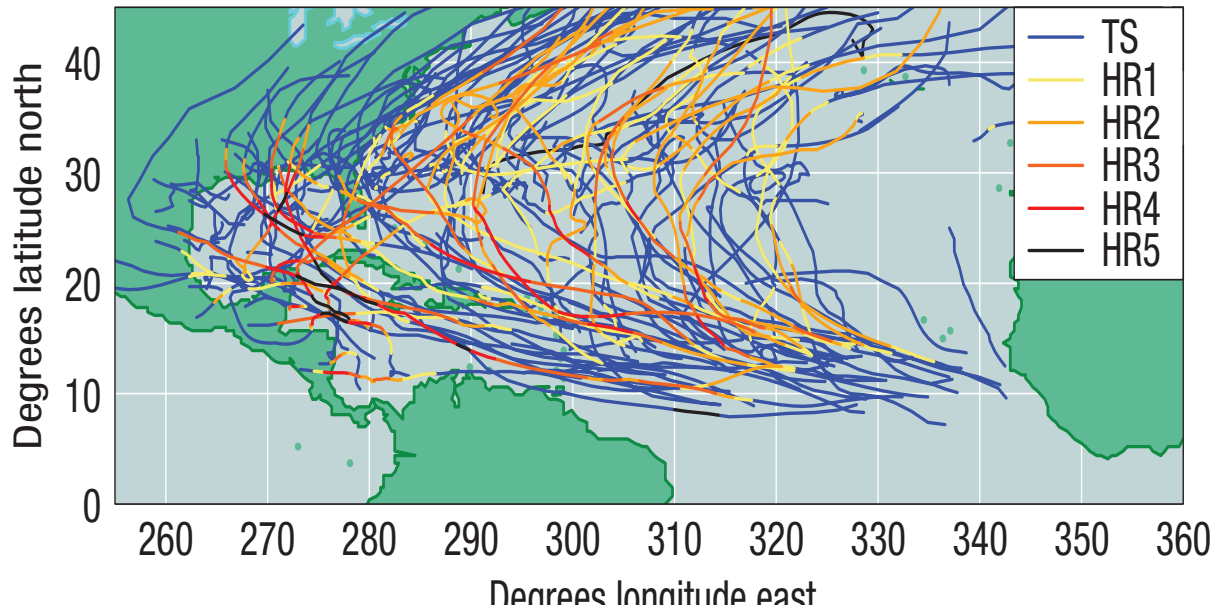


Emanuel,  
BAMS 2008



Emanuel,  
PNAS 2013

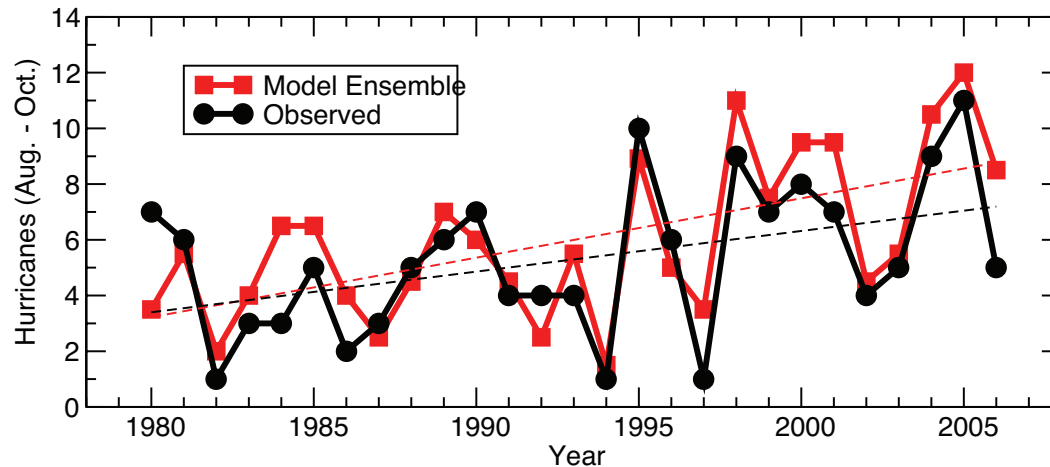
# Regional Climate Model



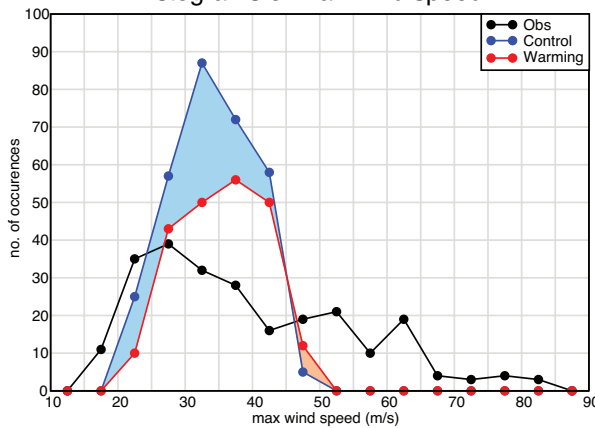
Knutson et al., Nature, 2008

# Significant progress in TC simulation in climate models

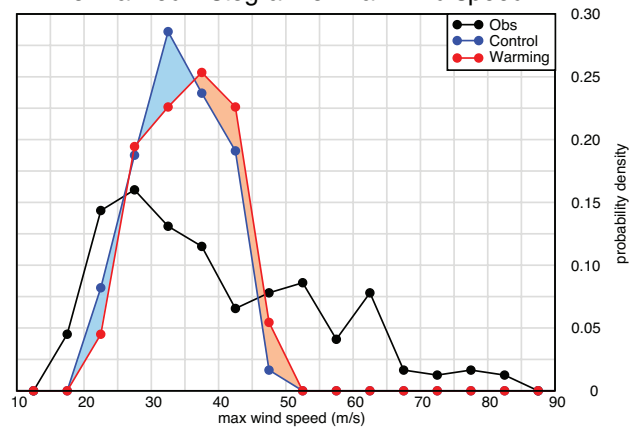
(a) Atlantic Hurricanes (1980-2006): Simulated vs. Observed  
Correlation = 0.84; Linear trends: +0.21 storms/yr (model) and +0.15 storms/yr (observed).



(b) Tropical Storms (1980-2006)  
histograms of max wind speed



(c) Tropical Storms (1980-2006)  
normalized histogram of max wind speed

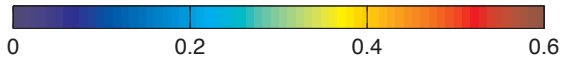
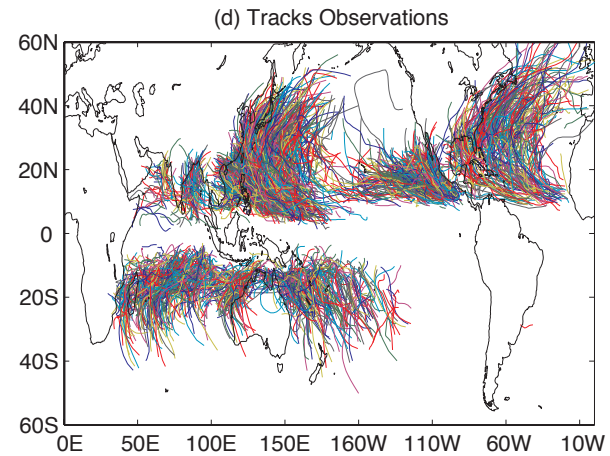
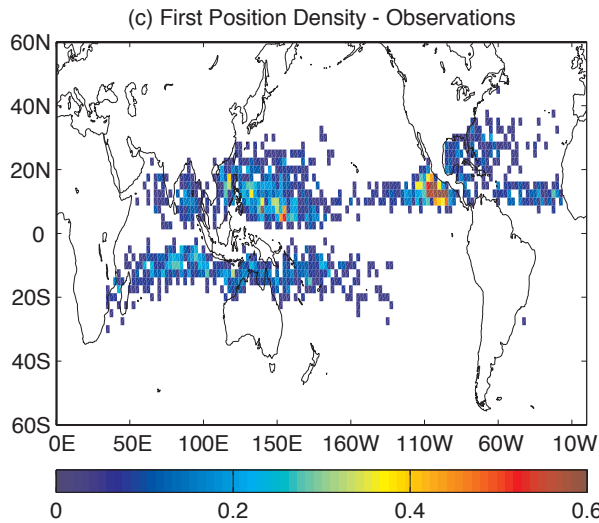
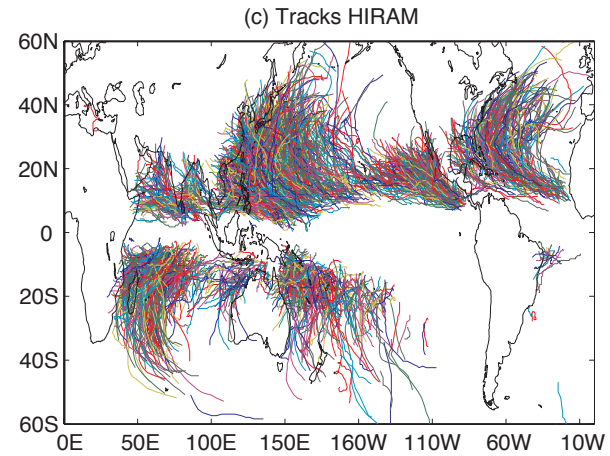
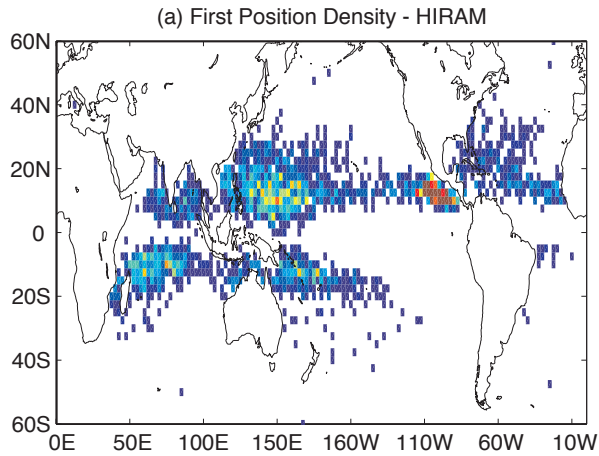


# **CURRENT CLIMATE MODELS TROPICAL CYCLONE ACTIVITY**

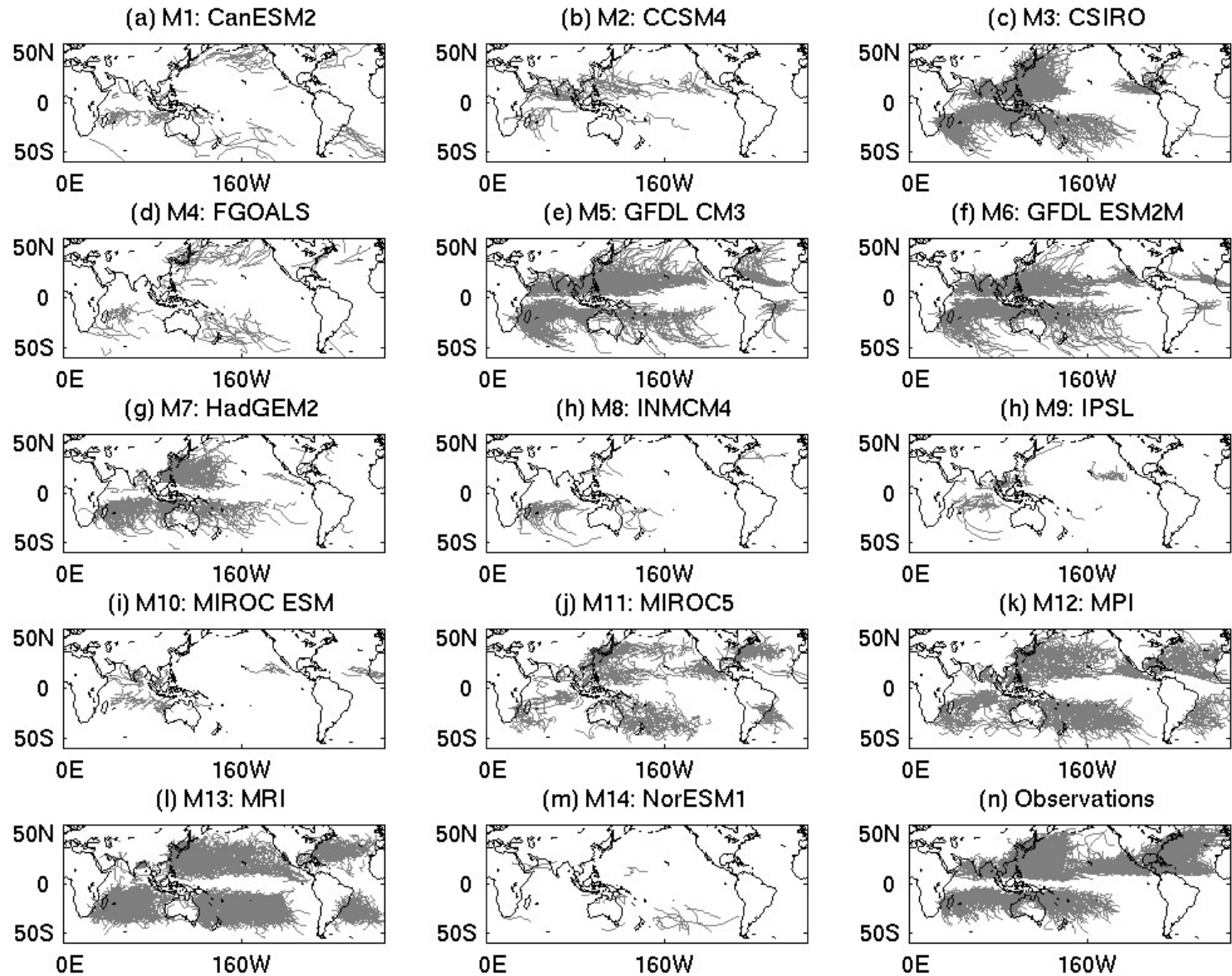
# Current Climate models

- TC activity: part of the diagnostics of climate models, as resolution increases.
- Analysis of TC activity in various time-scales: from sub-seasonal, including seasonal towards decadal and longer (climate change).
- TC forecasts and projections are part of seamless predictions approach.

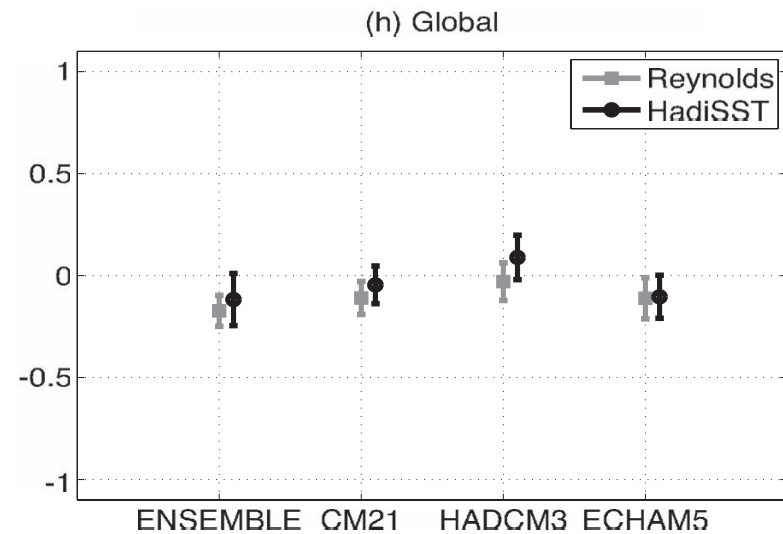
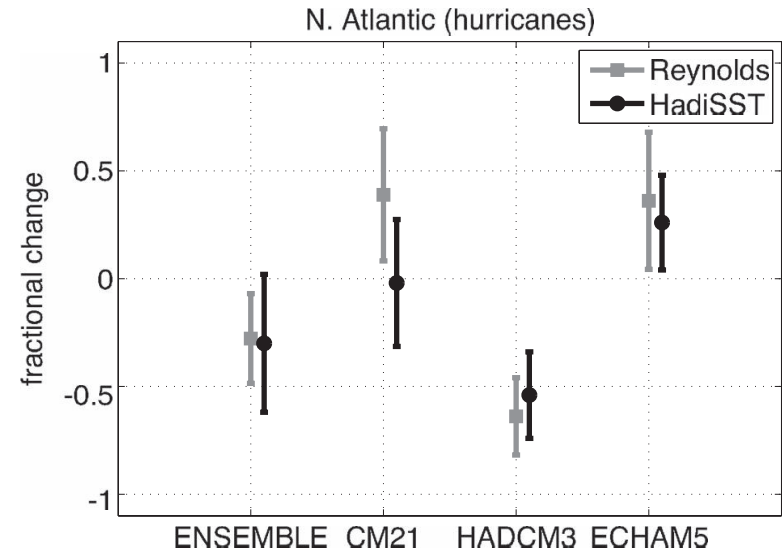
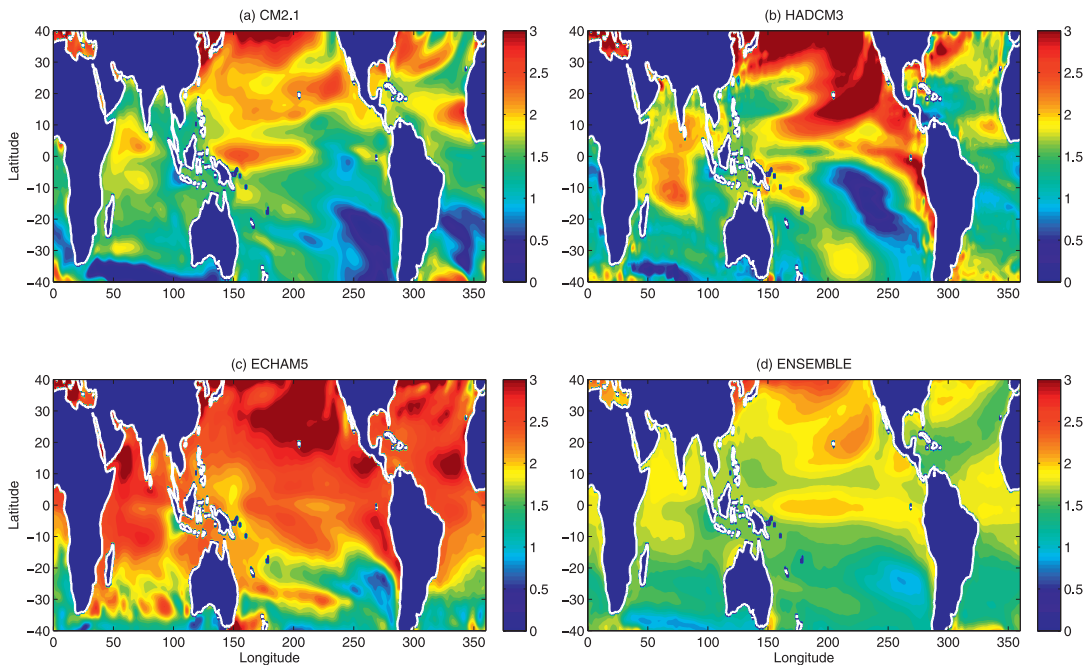
# TC Climatology



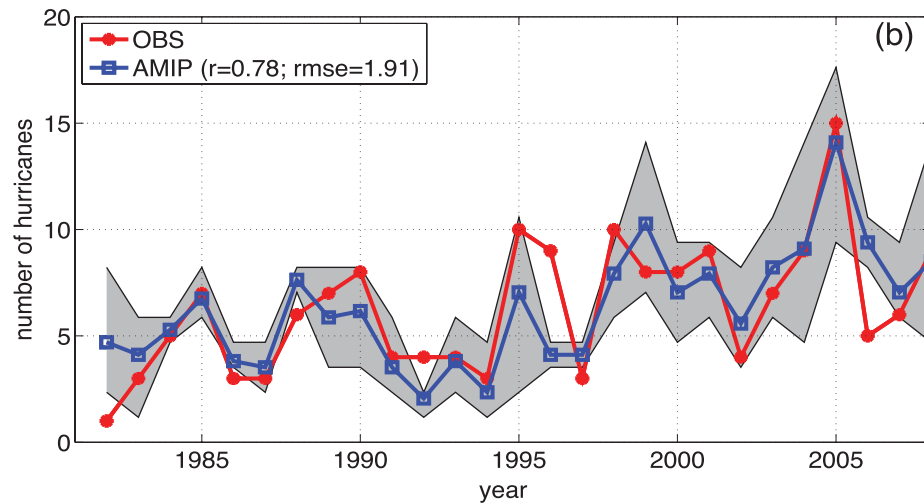
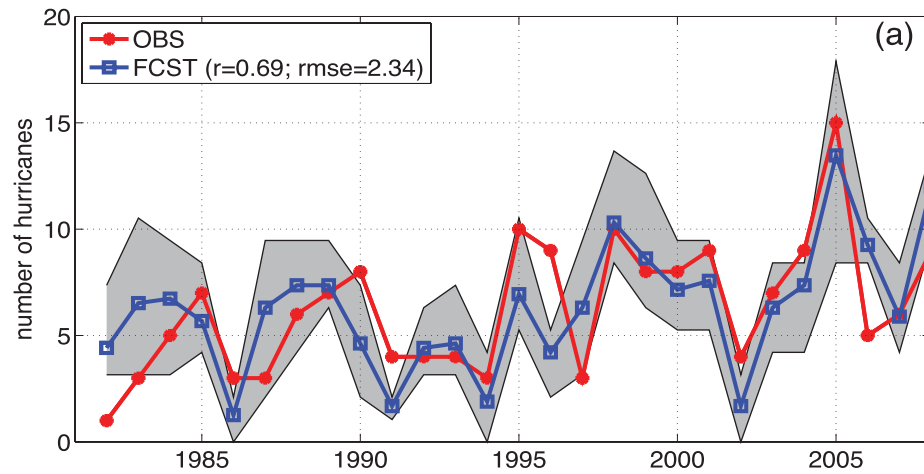
# TCs in the CMIP5 models



# “Downscaling”: SST anomalies

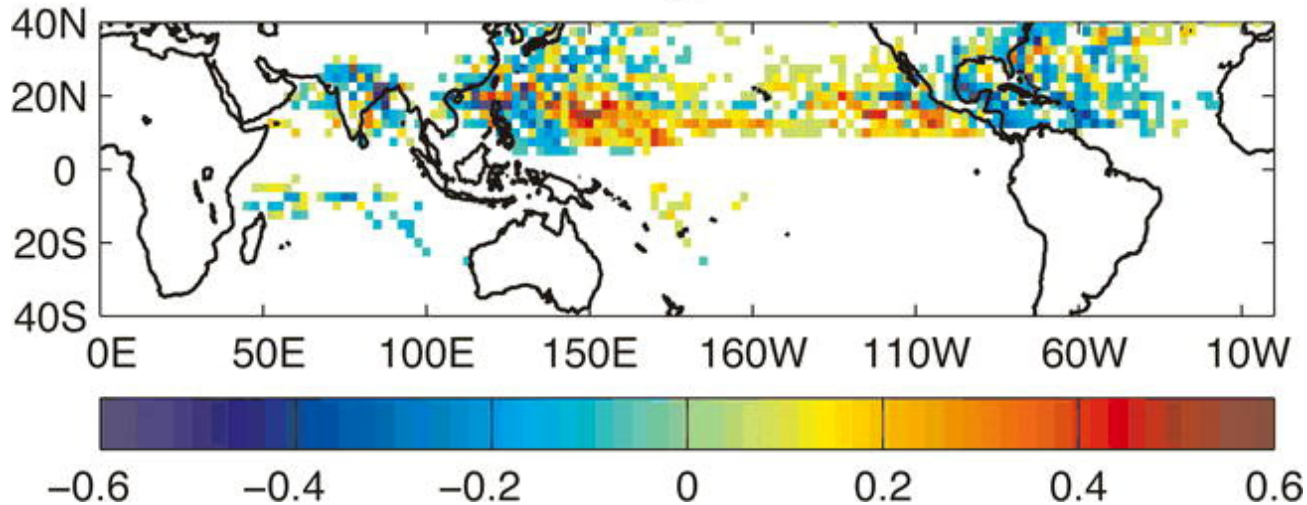


# Atlantic Hurricane Interannual Variability

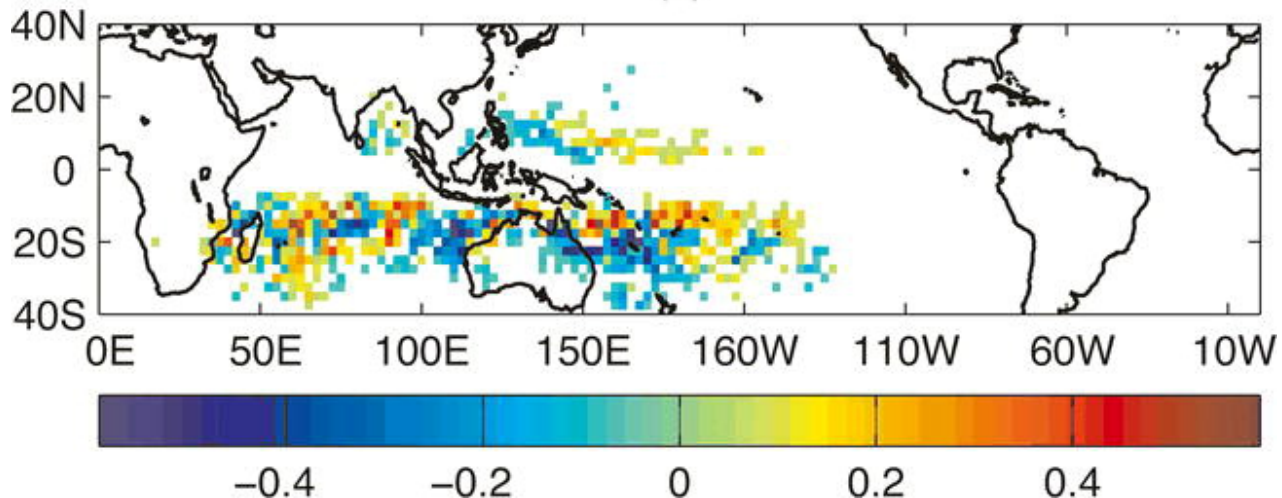


# Tropical Cyclones and ENSO

Track Density ASO difference: El Niño & La Niña



Track Density JFM difference: El Niño & La Niña



Camargo  
et al. 2007

# Can climate models reproduce the TC-ENSO modulation?

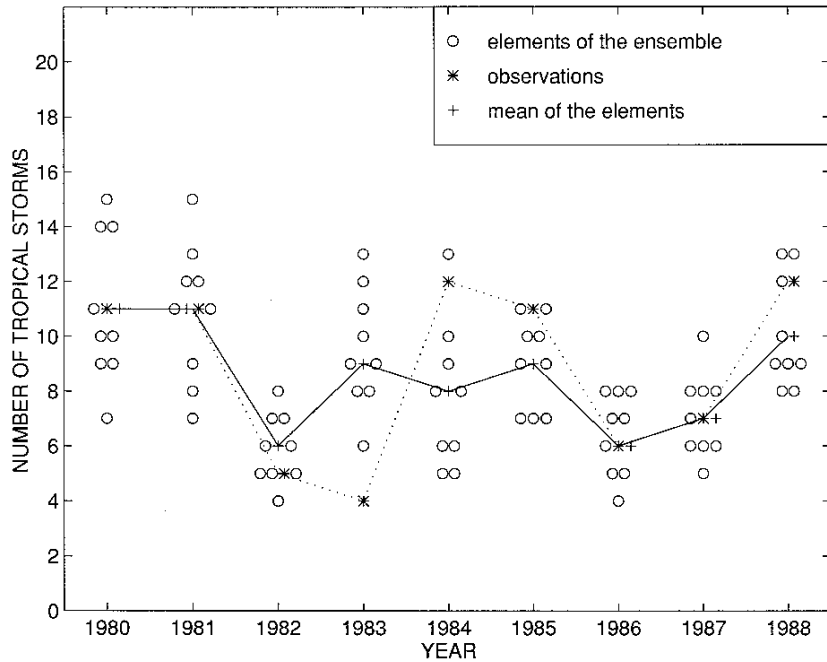
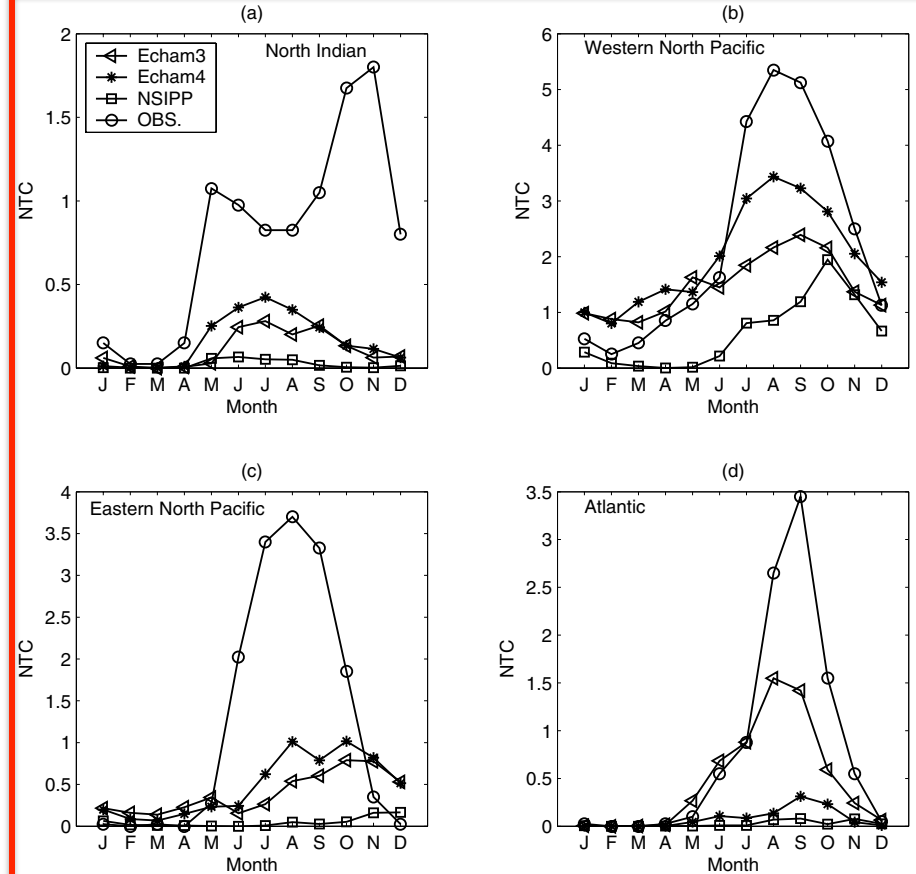


TABLE 2. Linear correlation for each ocean basin between observations and the mean of the 9-member ensemble.

	Total	WNA	ENP	WNP	NI	SI	AUS	SP
Correlation	0.41	0.56	0.545	0.66	-0.63	-0.66	0.57	-0.775
Significance	0.69	0.89	0.88	0.945	0.93	0.93	0.87	0.977

Vitart et al. 1997



Basin	Model	JJASON
WNP	ECHAM3	0.36
WNP	ECHAM4	0.26
ENP	ECHAM4	<b>0.42</b>
ATL	ECHAM3	<b>0.53</b>
ATL	ECHAM4	<b>0.52</b>
ATL	NSIPP	<b>0.38</b>

Basin	Model	NDJFMA
SI	ECHAM4	0.21
AUS	ECHAM4	<b>0.41</b>
SP	ECHAM3	<b>0.72</b>
SP	ECHAM4	<b>0.52</b>
SP	NSIPP	<b>0.62</b>

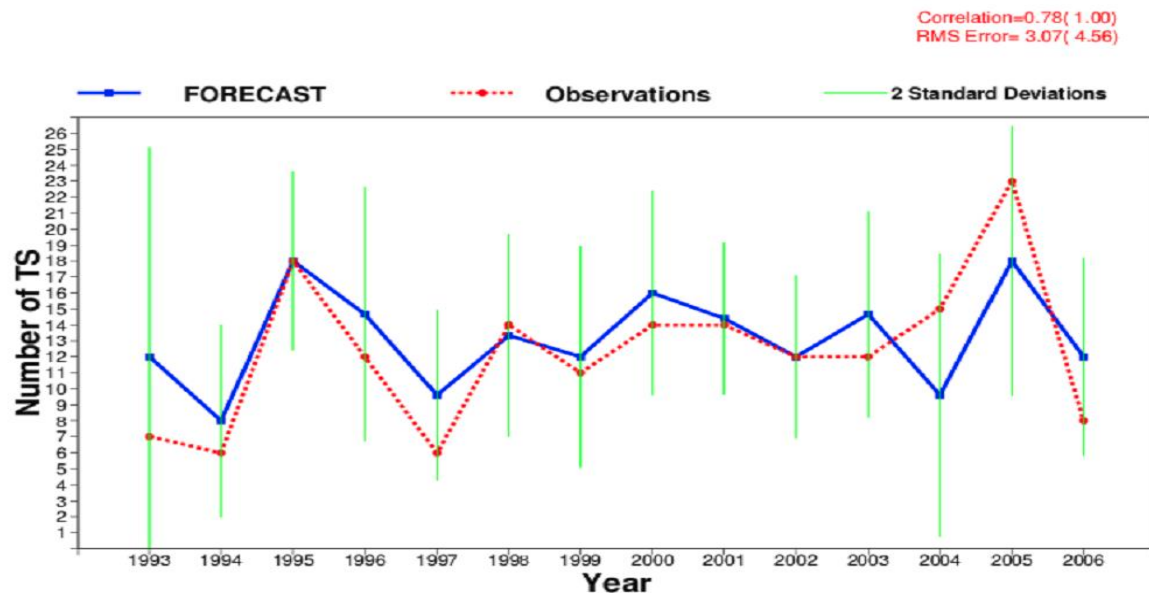
Camargo et al. 2005

# Dynamical Seasonal TC Forecasts

- First forecasts - statistical: Nicholls (Australia), Gray (Atlantic).
- First seasonal dynamical forecast of TC activity developed in the early 2000s: ECMWF, IRI, based on the modulation of TC activity by ENSO.
- Currently, many groups produce dynamical seasonal TC forecasts: ECMWF, FSU, MetOffice, GFDL, with good skill, especially in the Atlantic.

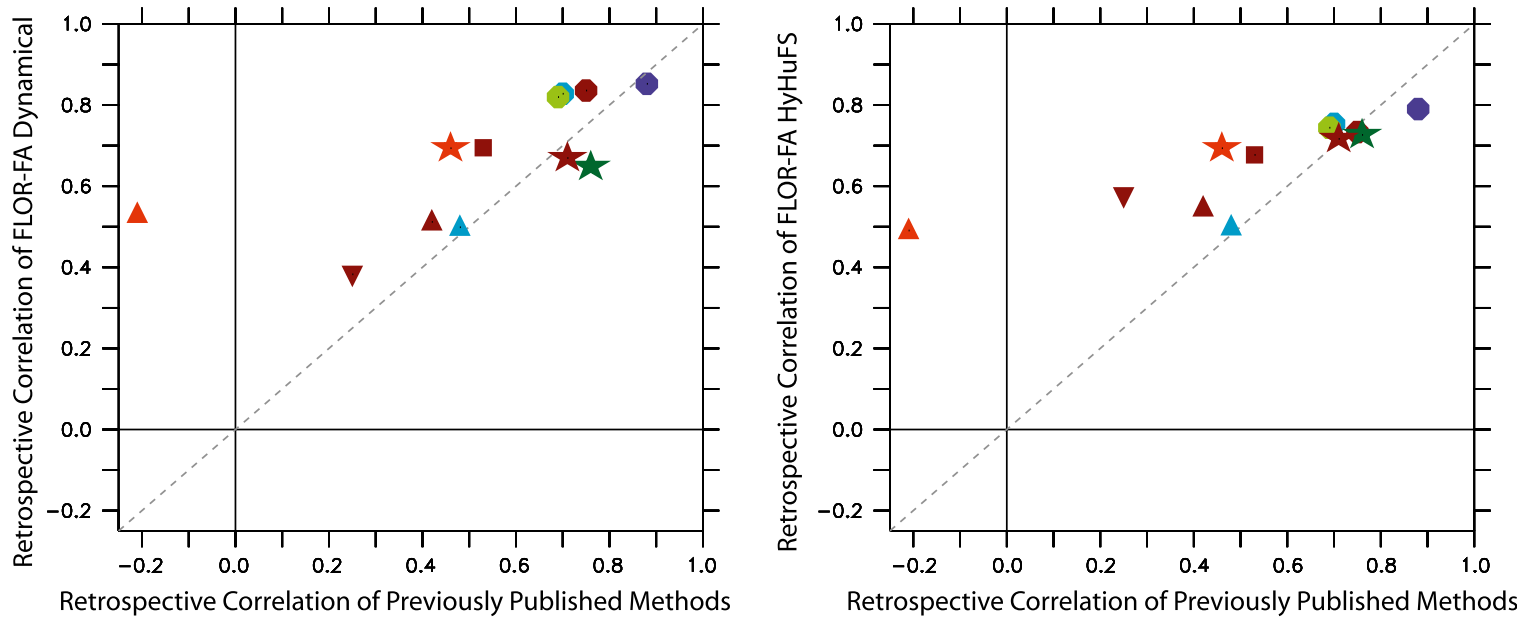
# TC seasonal forecasts:

- Currently, the TC dynamical seasonal forecasts have good skill, especially in the Atlantic:



# Skill of Current Atlantic TC Forecasts

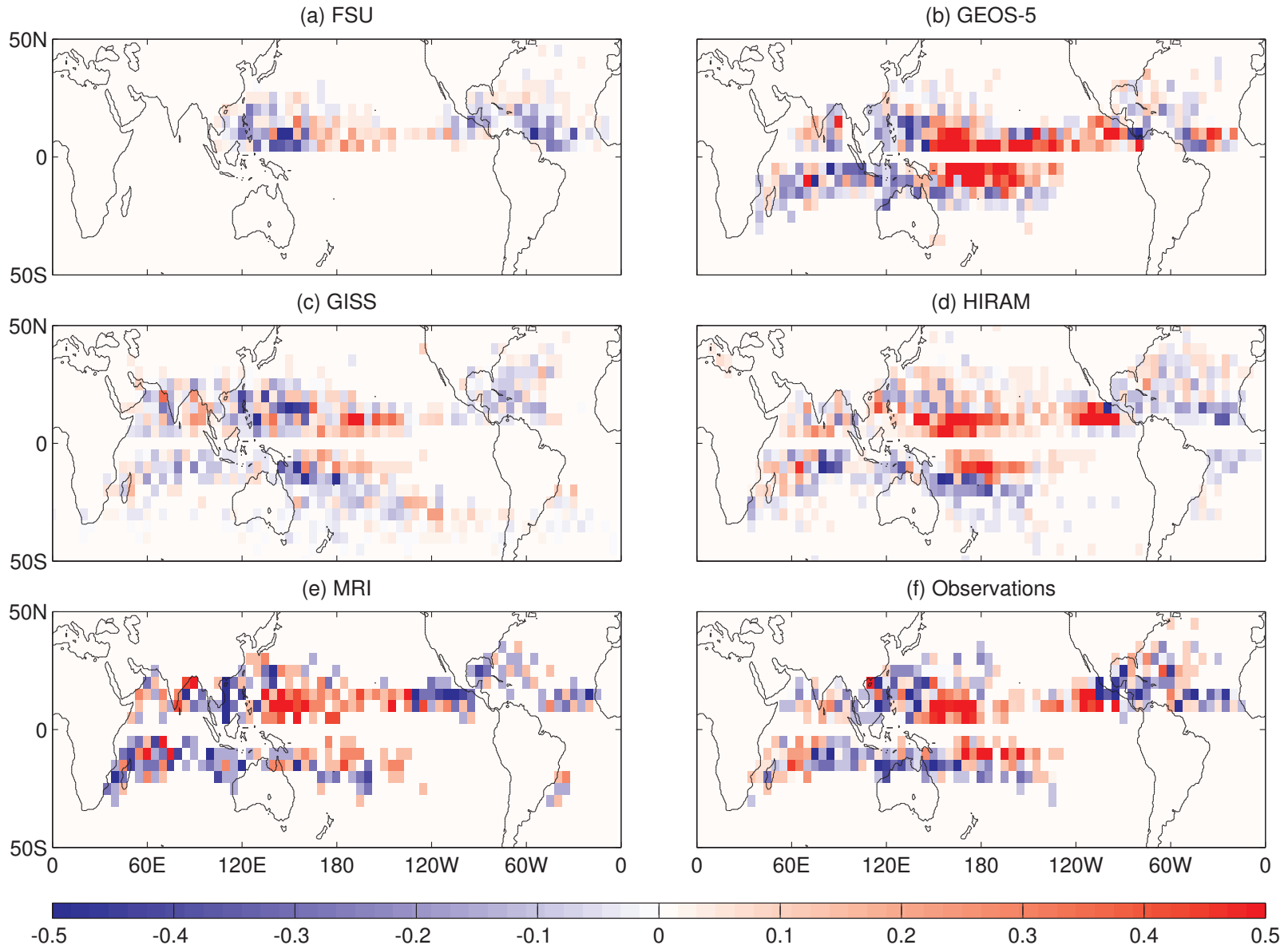
Performance of North Atlantic Hurricane Frequency Forecasts with FLOR-FA and other published methods



Vitart et al. (2006) - verify 1990-2011      Zhao et al. (2009) - verify 1982-2008      Wang et al. (2010) - verify 1982-2009  
 Klotzbach and Gray (2009) - verify 1992-2012      LaRow et al. (2010) - verify 1982-2012      Chen and Lin (2013) - verify 1990-2010  
 ● Jul.-init.      ★ Jun.-init.      ■ May-init.      ▲ Apr.-init.      ▼ Mar.-init.

Vecchi et al., J. Climate, 2014

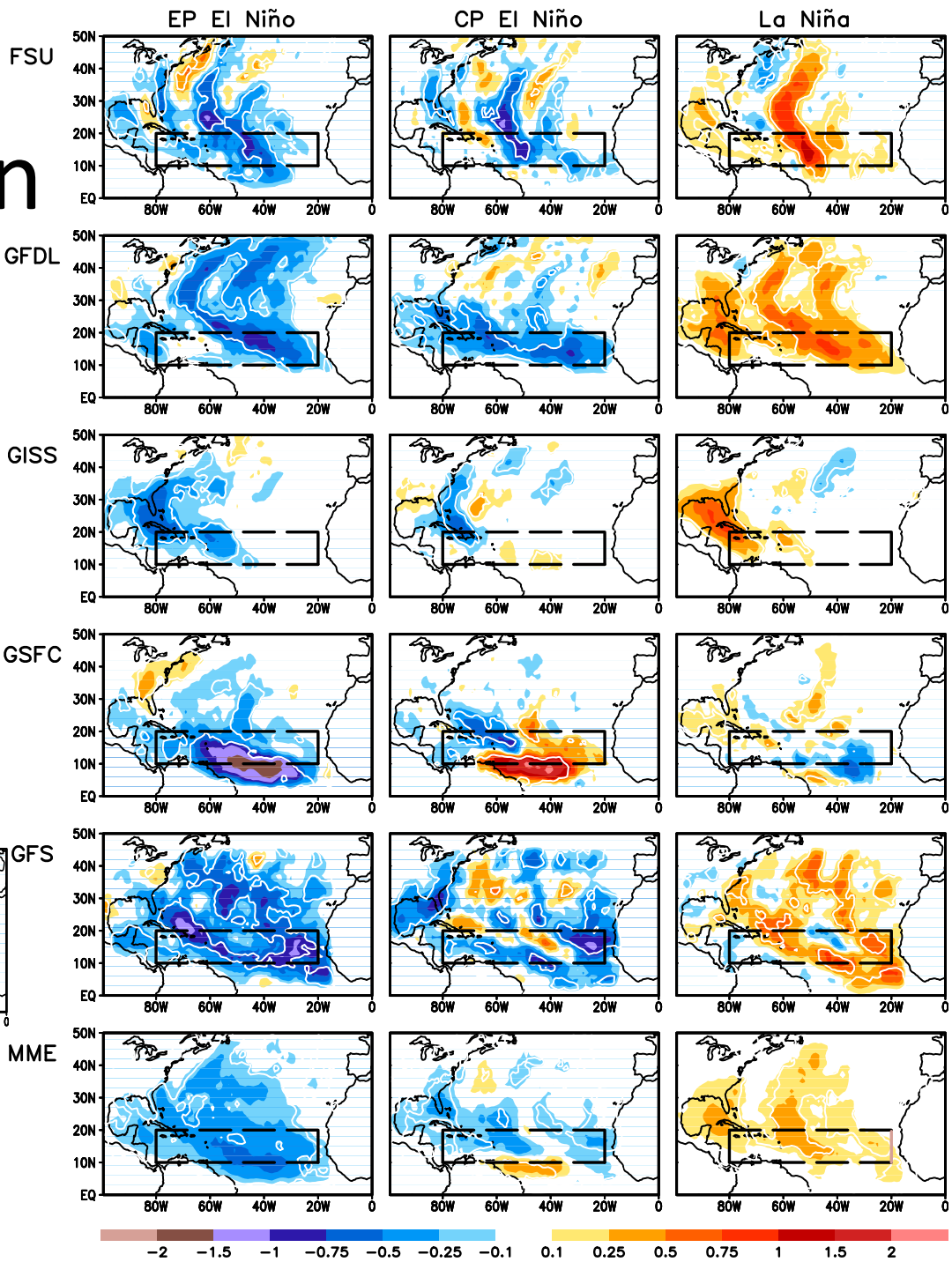
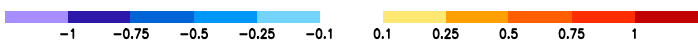
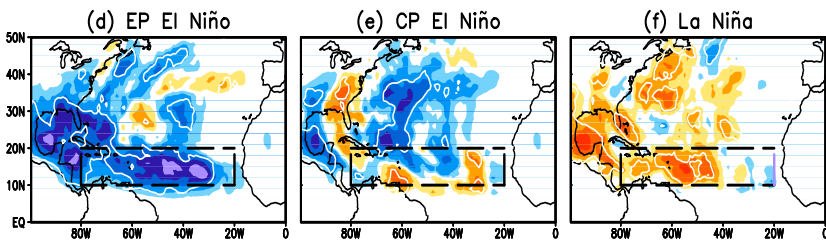
# TCs & ENSO



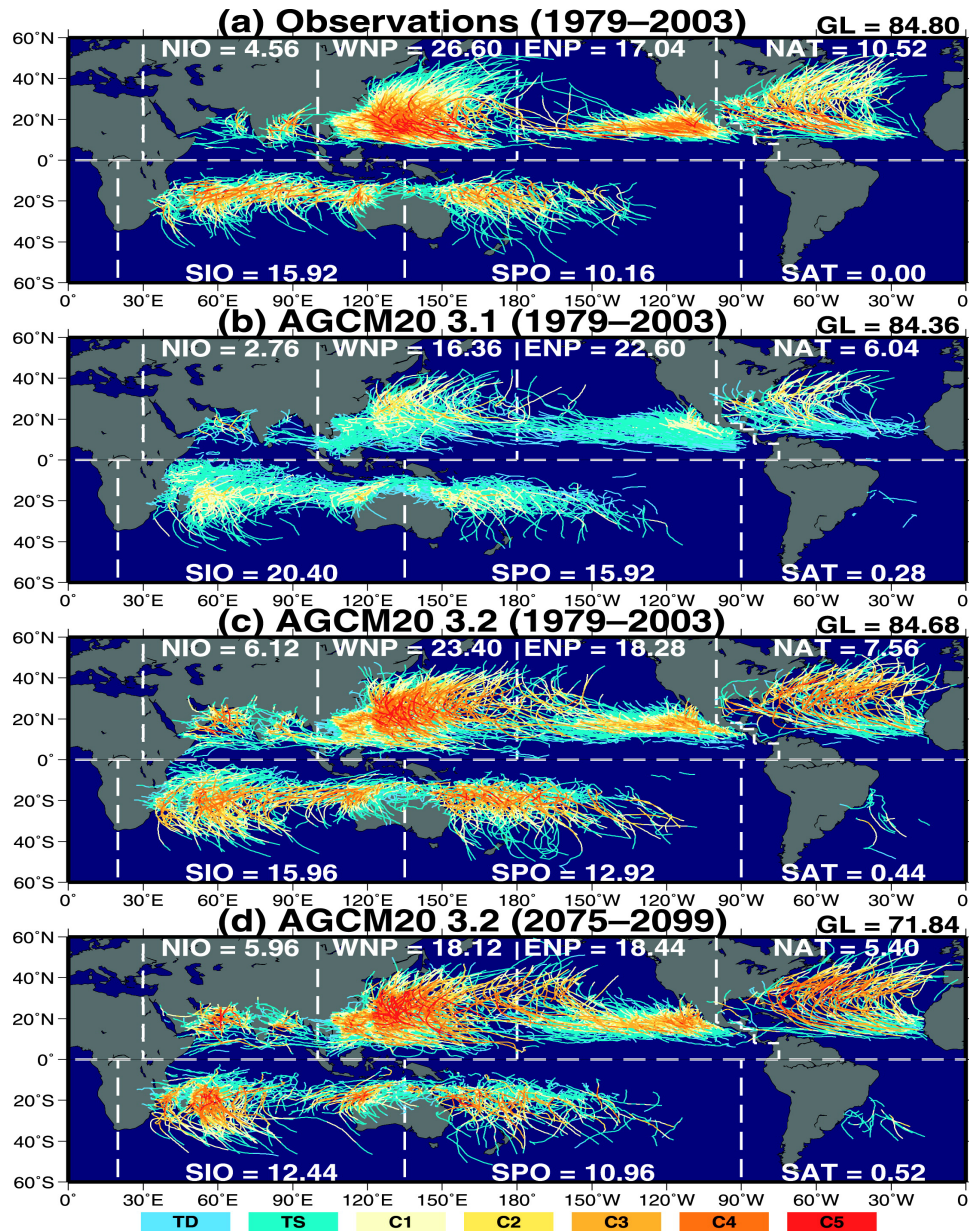
# Central vs Eastern Pacific El Niño impacts on Atlantic TCs

Wang et al., J. Climate 2014

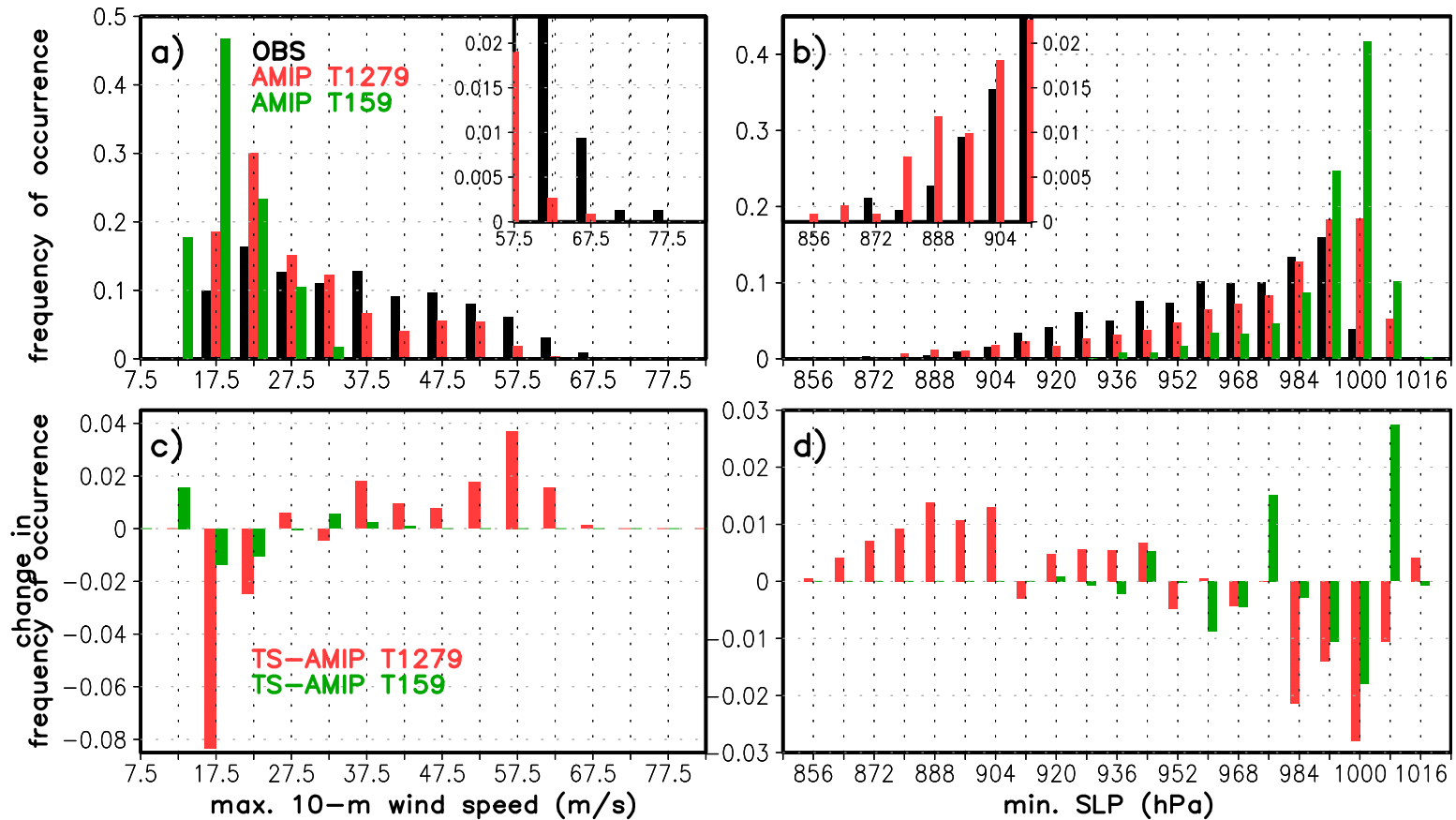
Observations



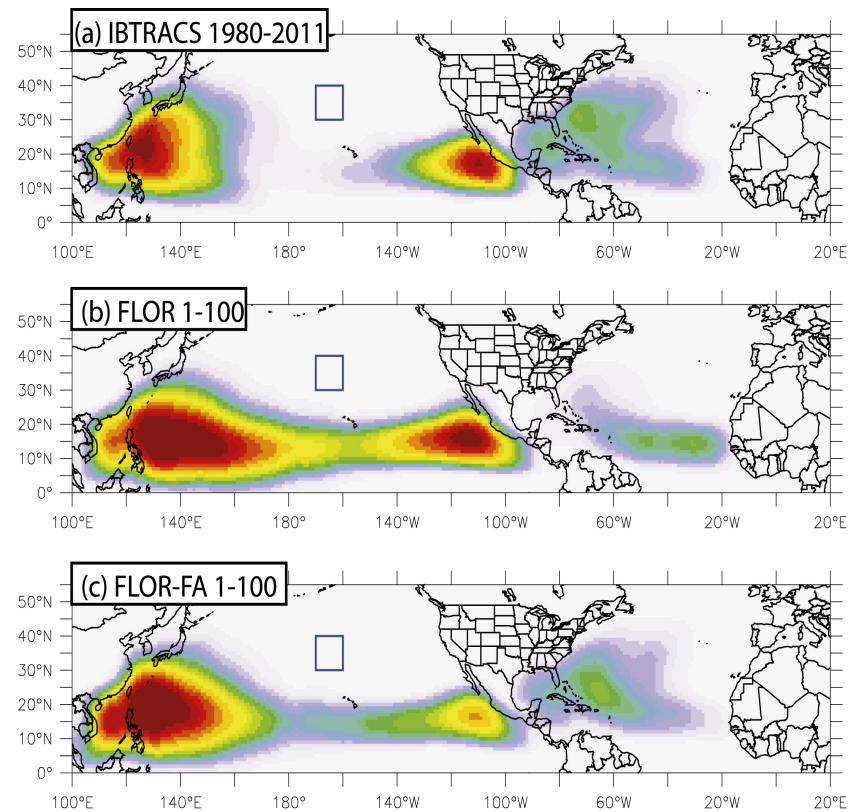
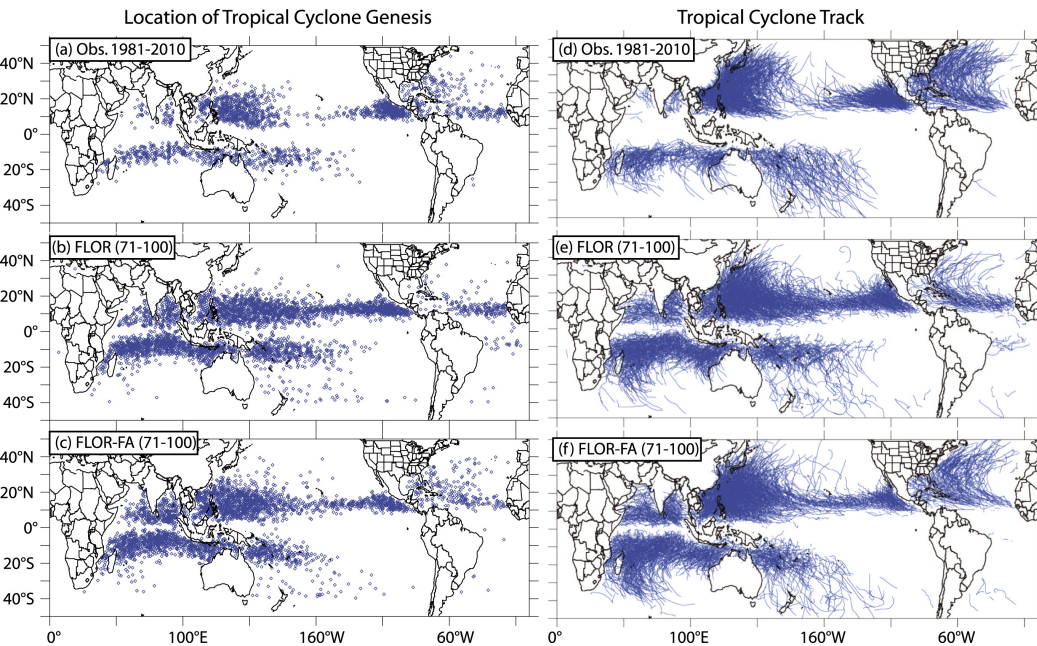
# Simulation of intense storms



# TC intensity



# Current state-of-the-art: FLOR coupled model

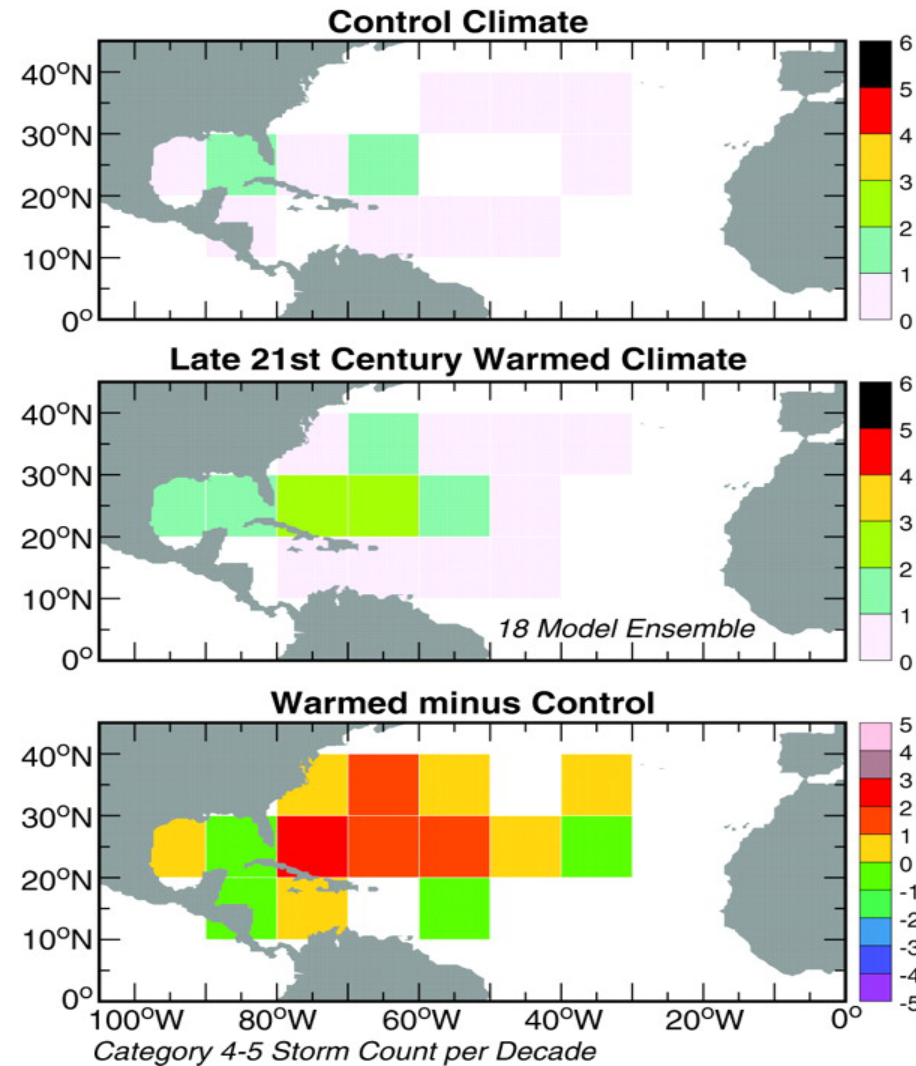
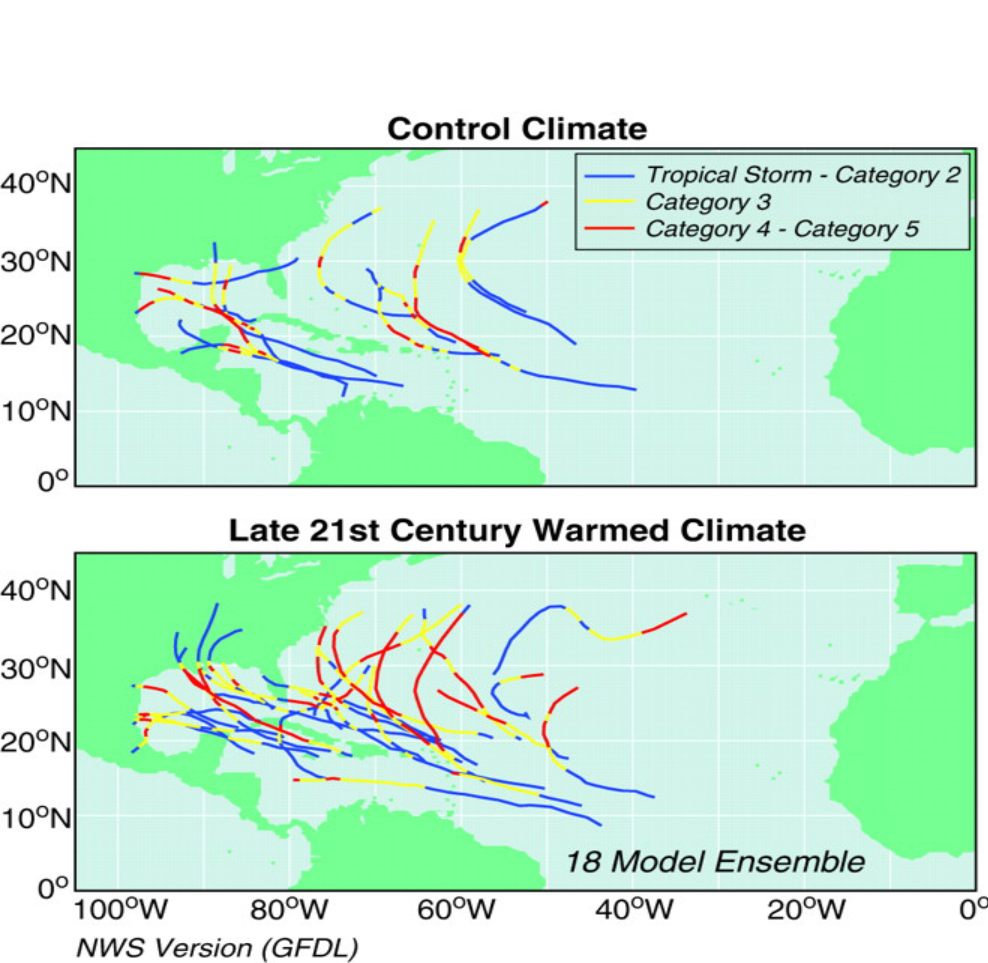


Vecchi et al. 2014

0 1 2 3 4 5 6 7 8 10 12 14 16 18 20

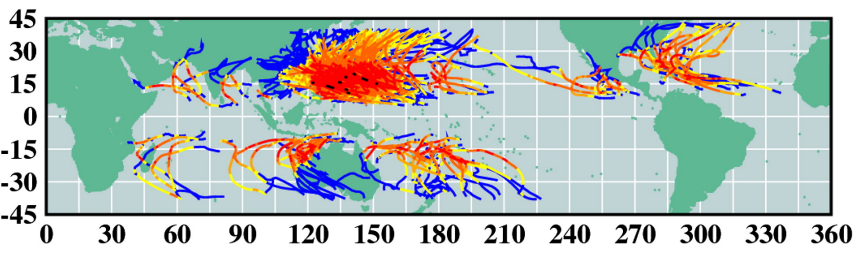
Number of TC-days per season with  $10^\circ \times 10^\circ$  box centered on point

# Downscaling: simulation of the most intense storms

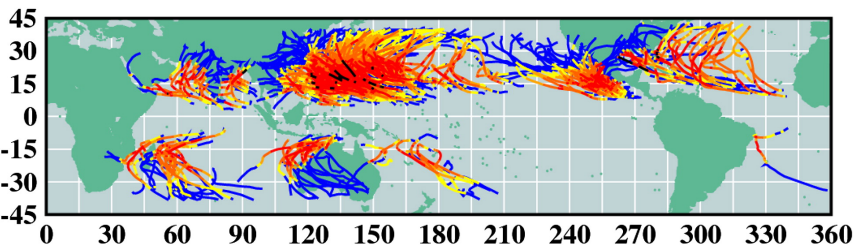


# Projections I

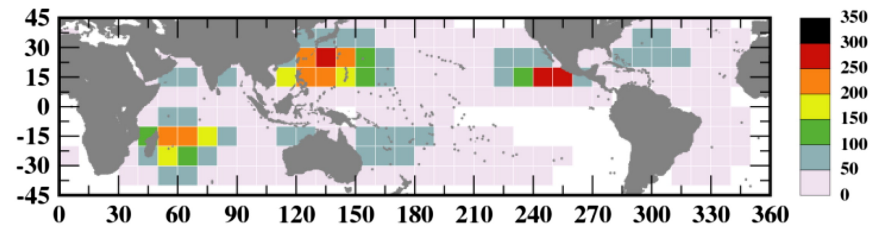
a) Present Day Simulation: 244 Cat 4-5 storms



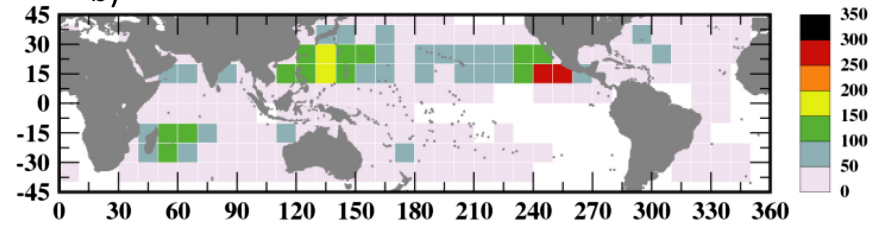
b) RCP4.5 Late 21<sup>st</sup> Century: 313 Cat 4-5 storms



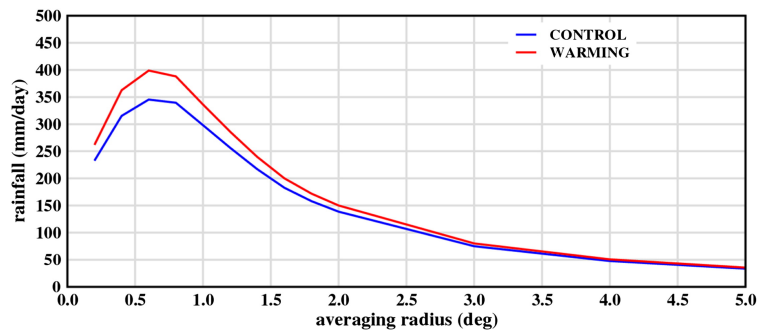
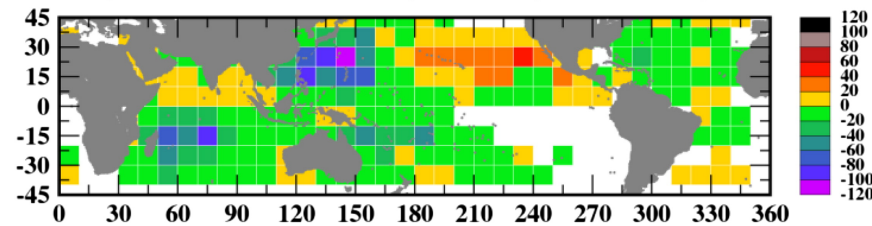
a) Present-day simulation



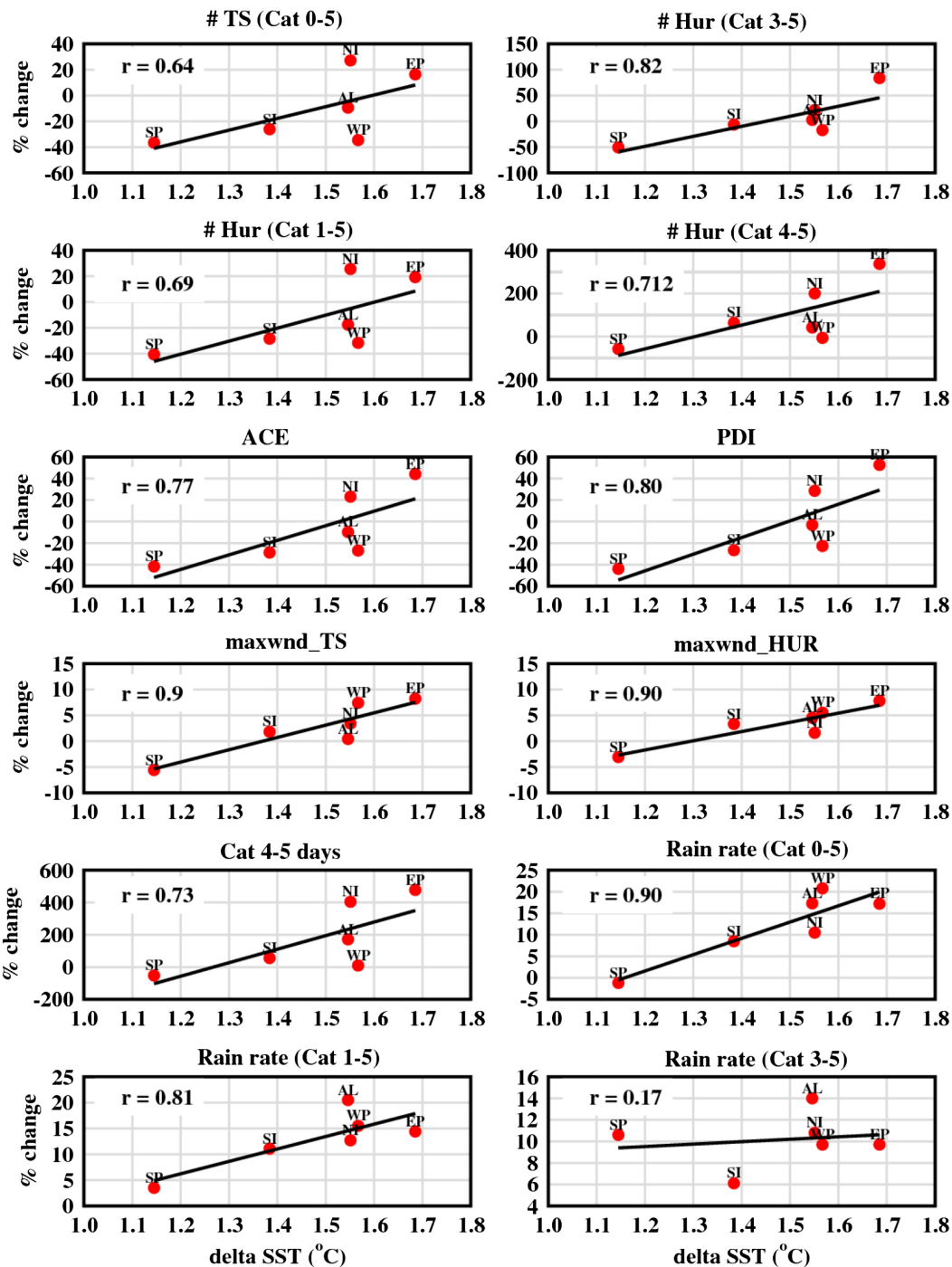
b) RCP4.5 Late 21<sup>st</sup> Century Projection



c) Late 21<sup>st</sup> century minus present-day

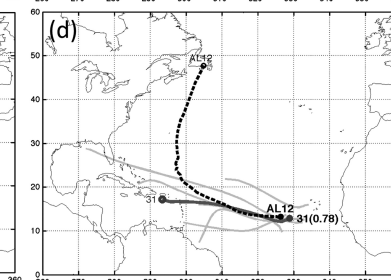
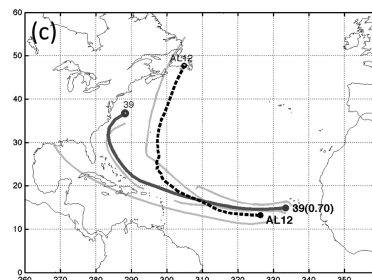
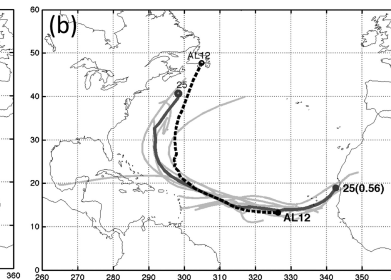
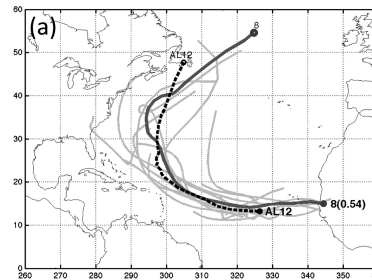
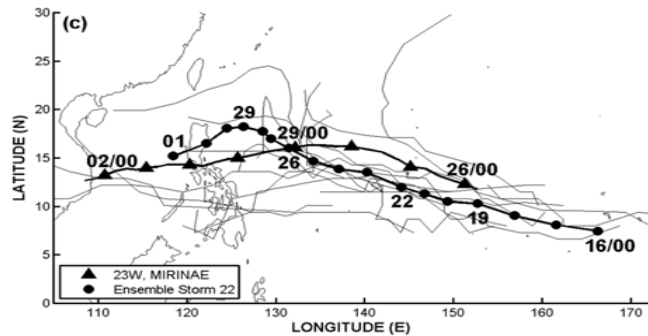
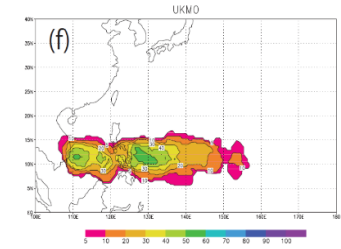
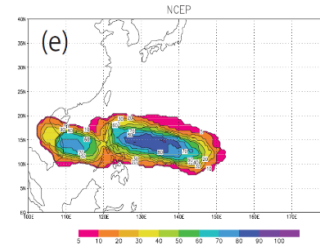
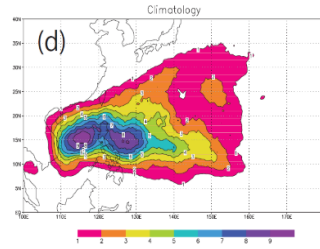
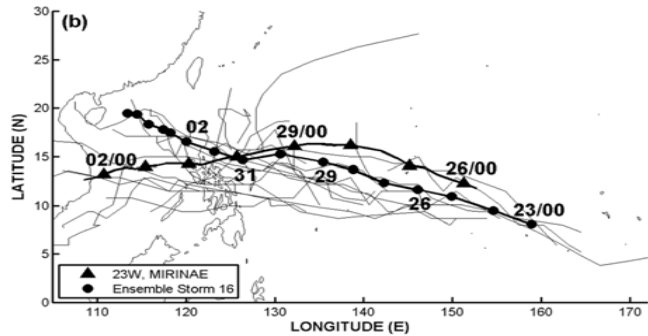
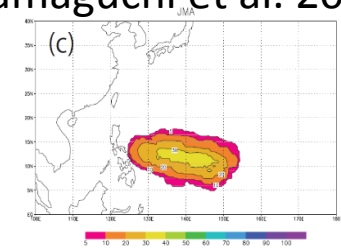
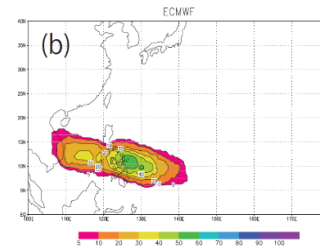
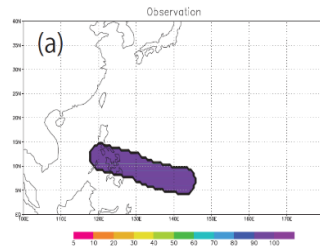
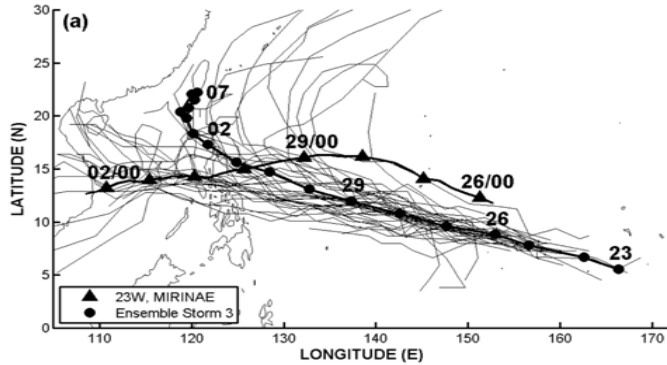


# Projections II



# A few successful forecasts

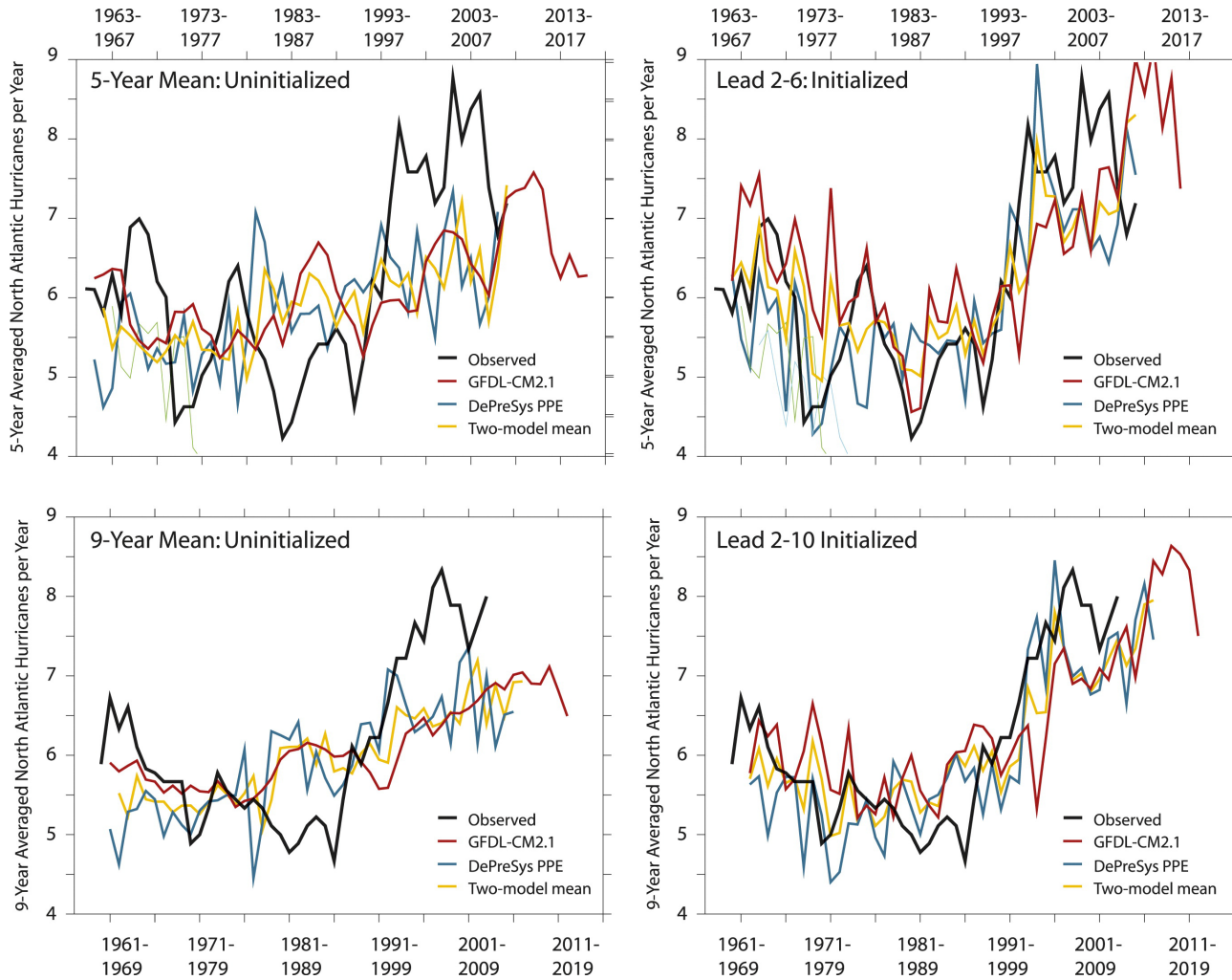
Yamaguchi et al. 2015



Elsberry et al. 2014

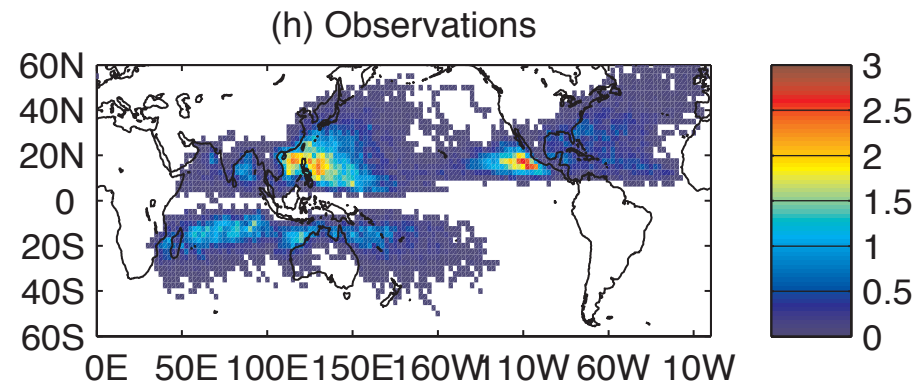
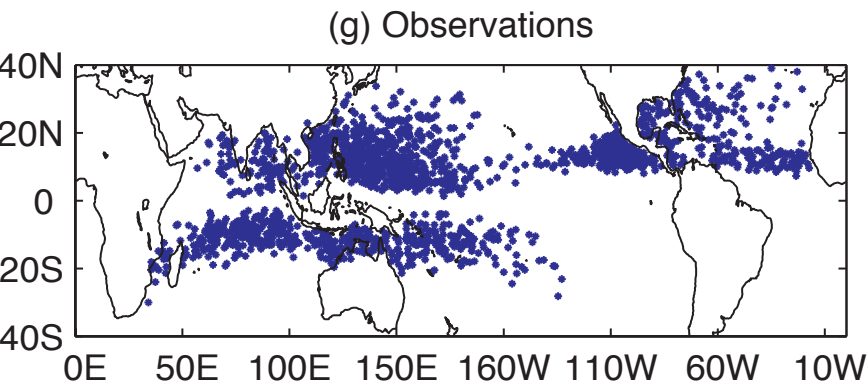
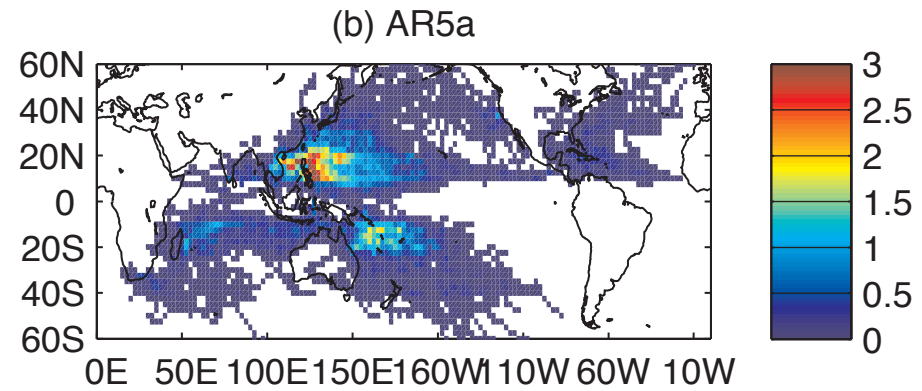
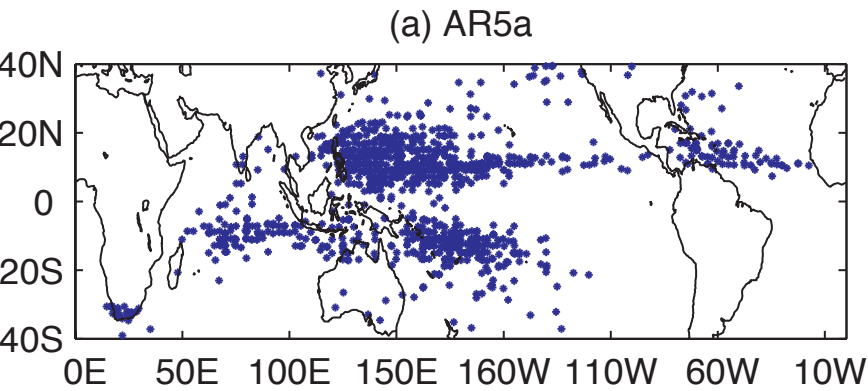
Elsberry et al. 2011

# Potential for Decadal TC predictions



# Models' sensitivities and biases

# Tropical Cyclones – GISS Model E2



# US CLIVAR Hurricanes and CLIMATE Working Group

## Objectives:

- An improved understanding of interannual variability, and trends, in tropical cyclone activity from the beginning of the 20th century to the present.
- Quantifying changes in the characteristics of tropical cyclones under a warming climate

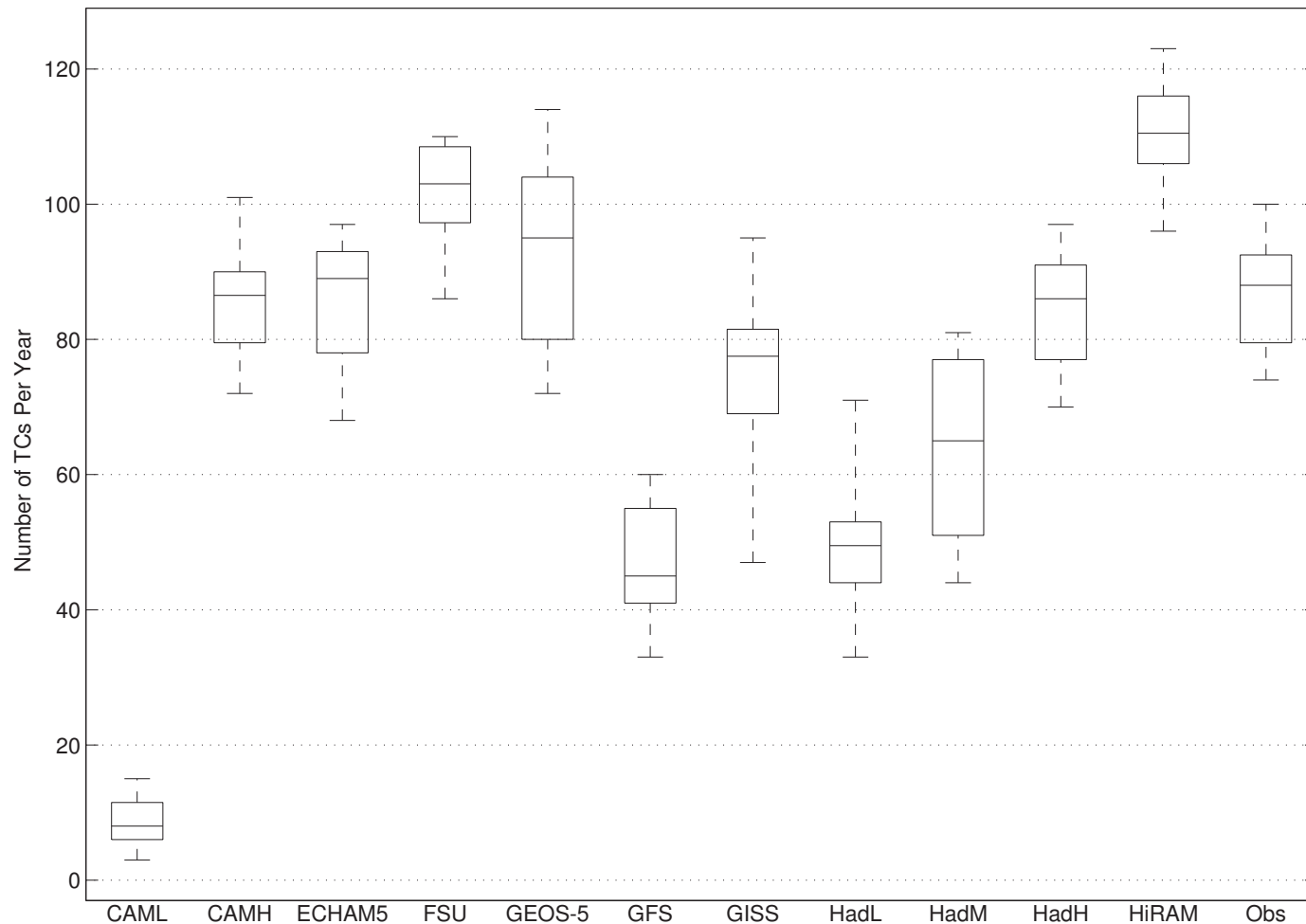
# Simulations:

- Climatology
- Climatology plus 2K
- Climatology + 2CO<sub>2</sub>
- Climatology plus 2K + 2CO<sub>2</sub>
- Interannual

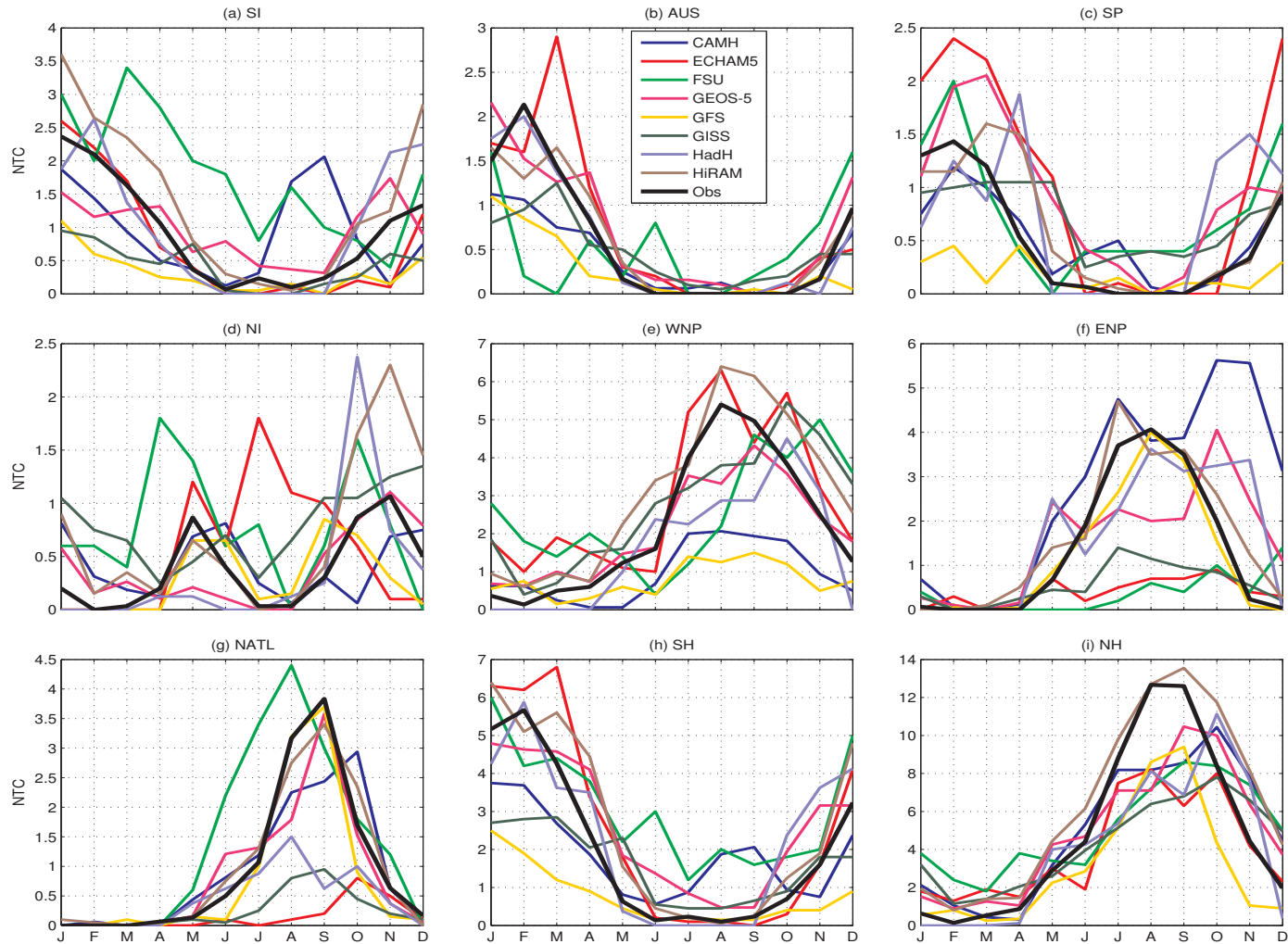
# HWG Multi-model comparison

Shaevitz et al. JAMES 2014

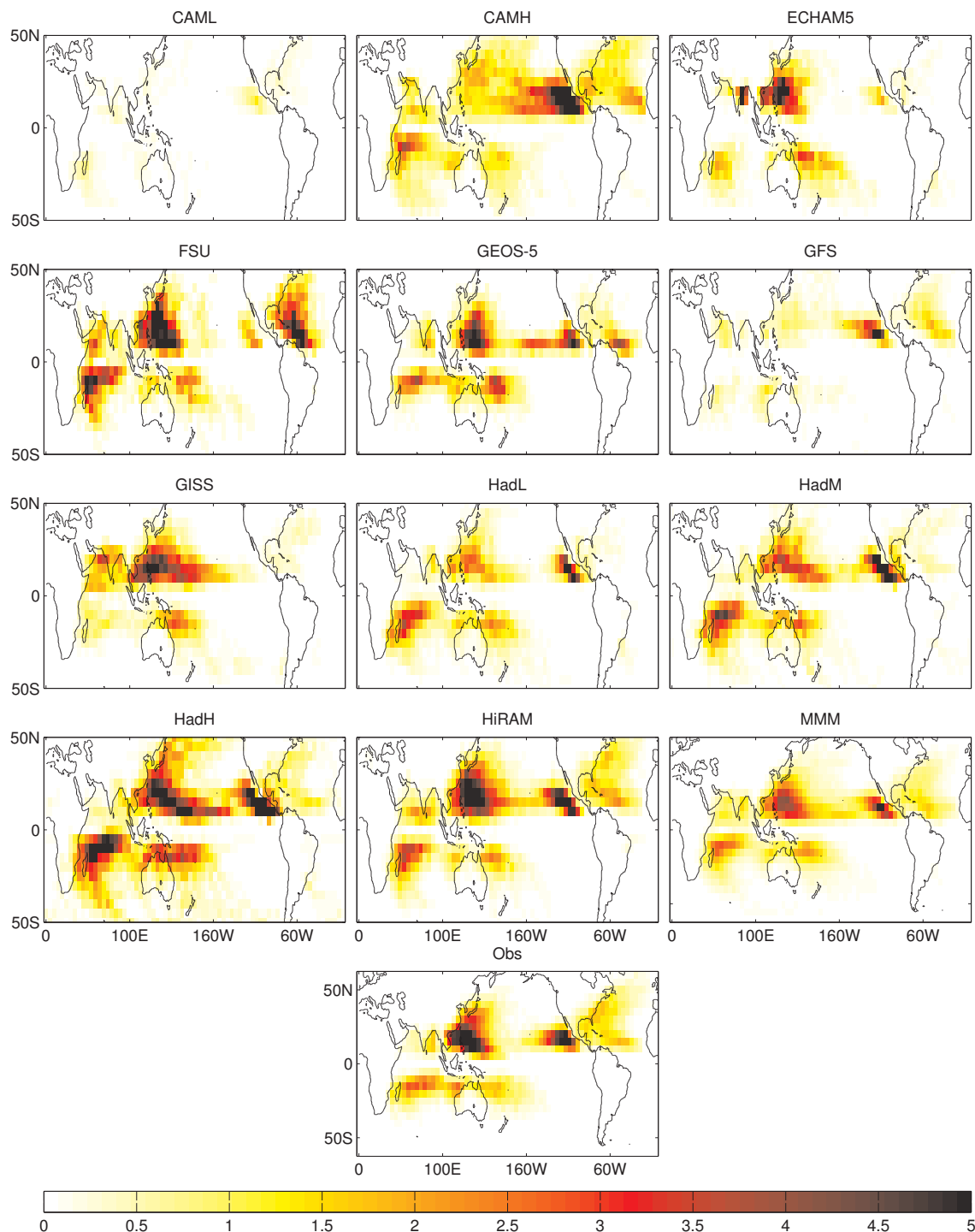
## NTC Globe



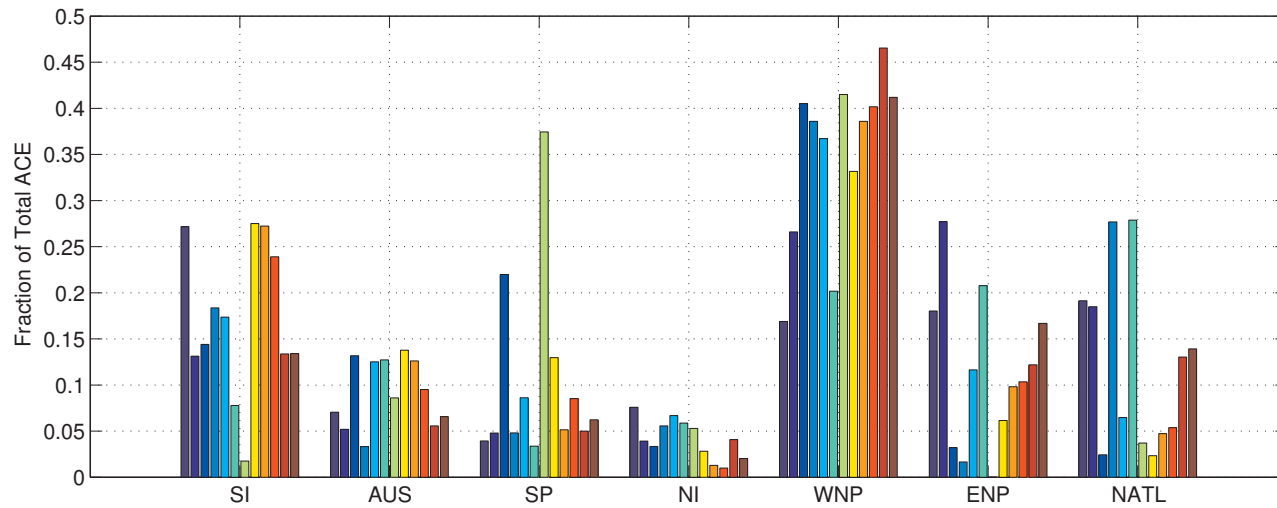
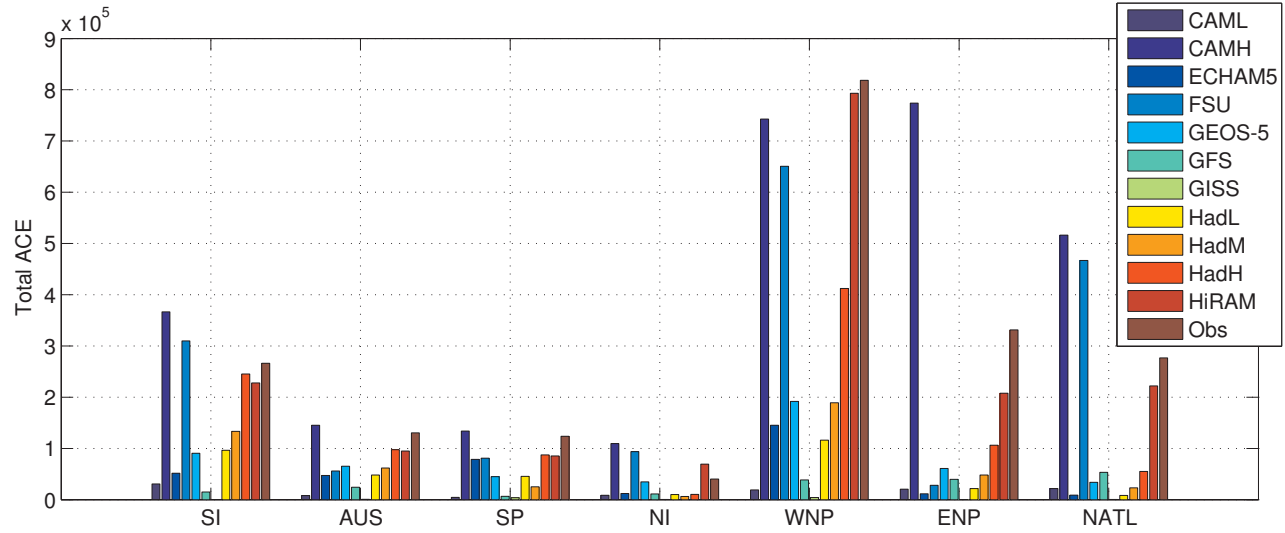
# NTC - Annual Cycle Basins



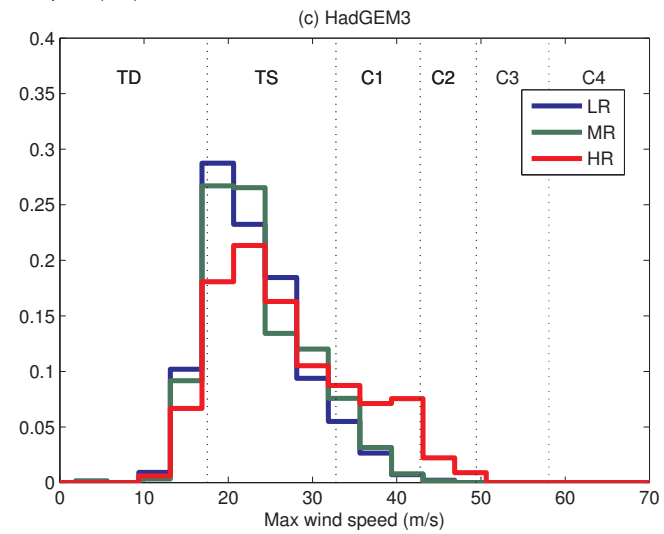
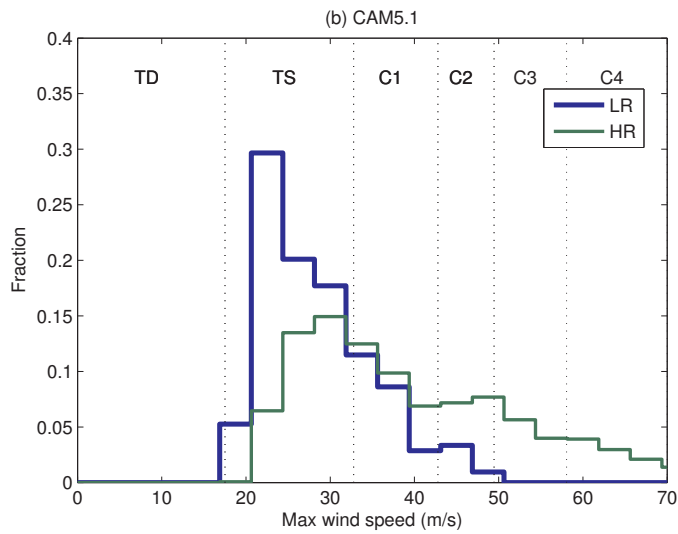
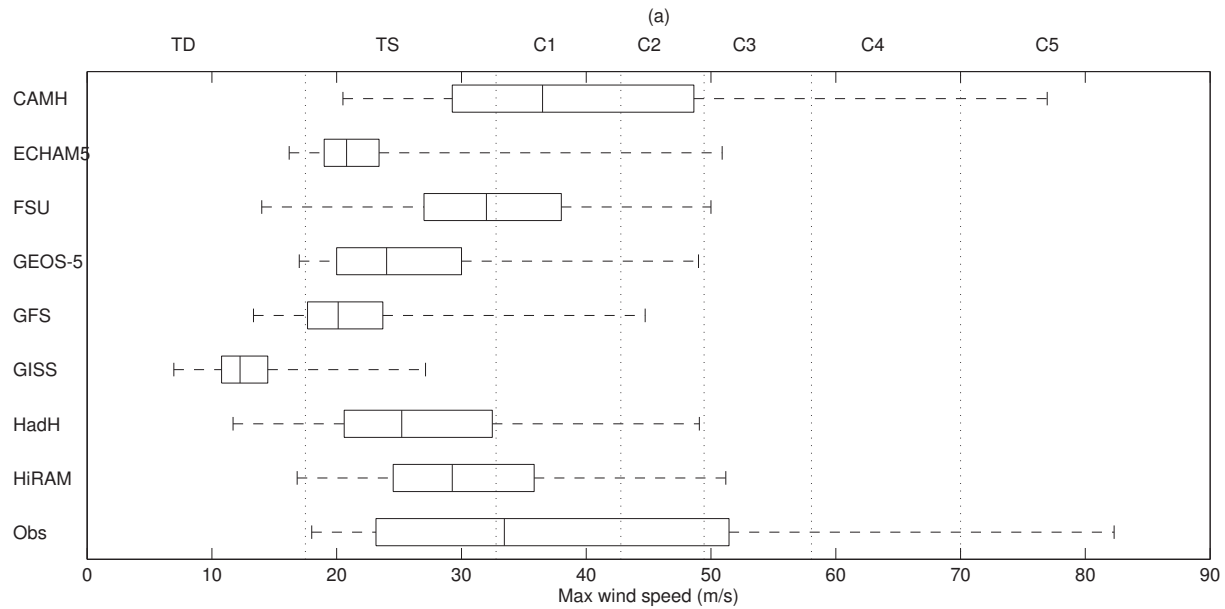
# Track Density



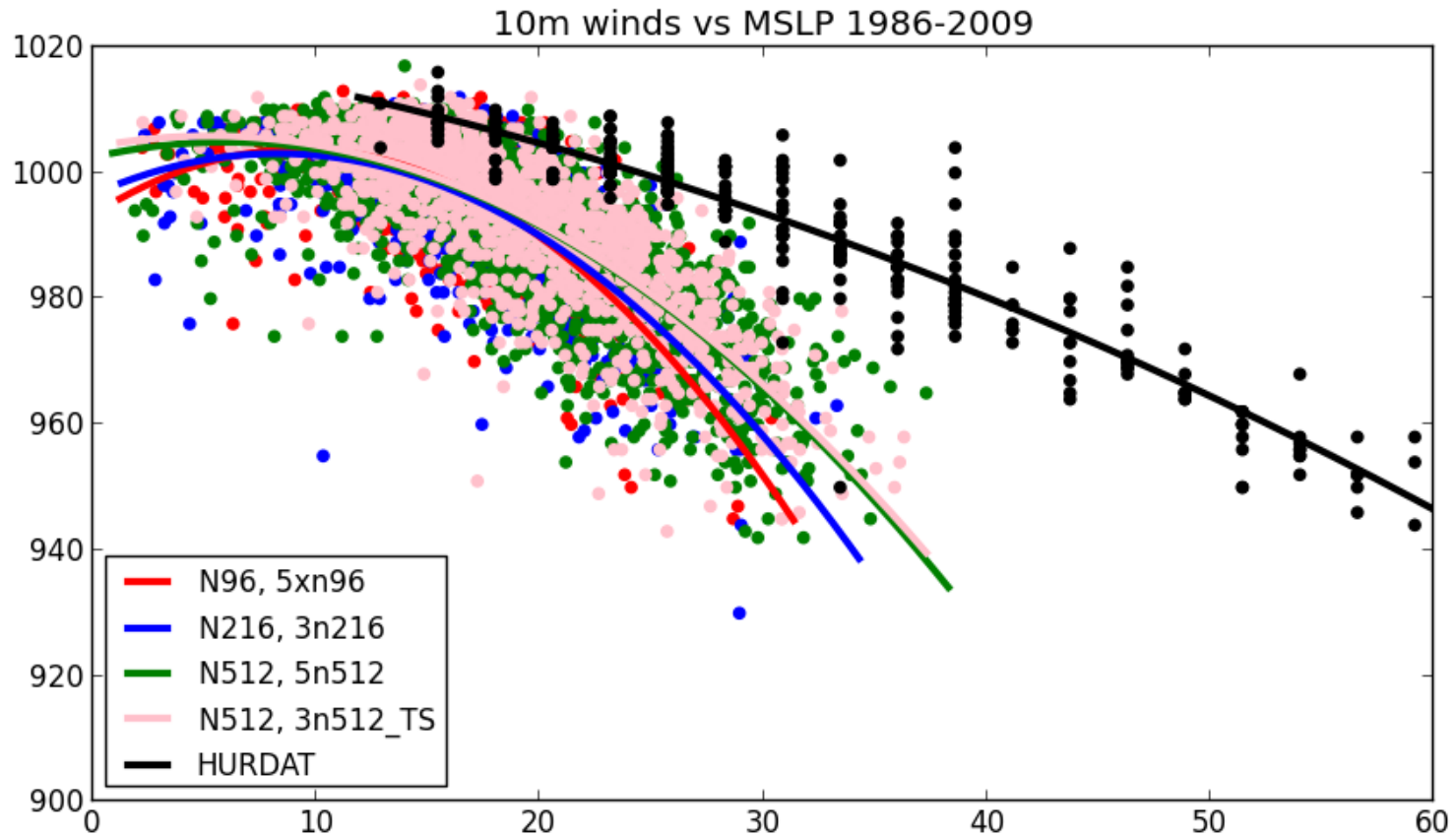
# ACE



# Intensity

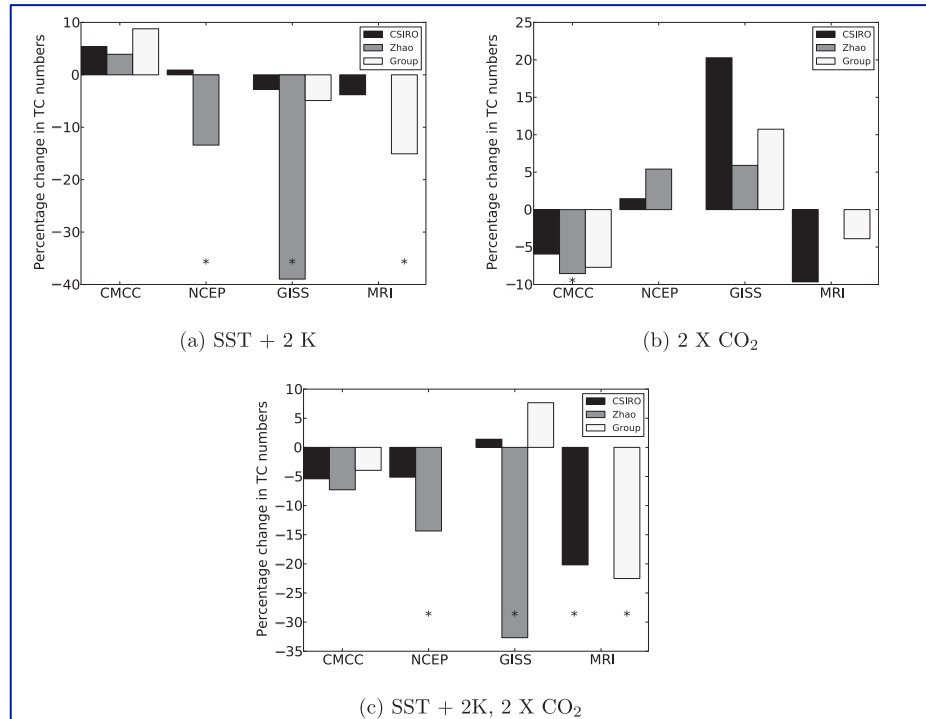
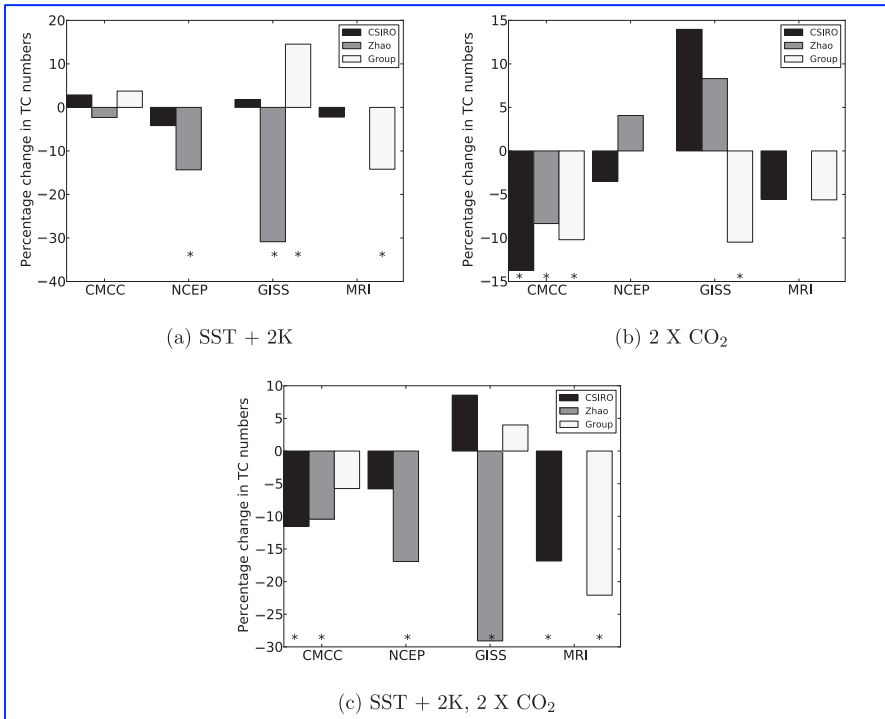


# TC intensity vs model resolution



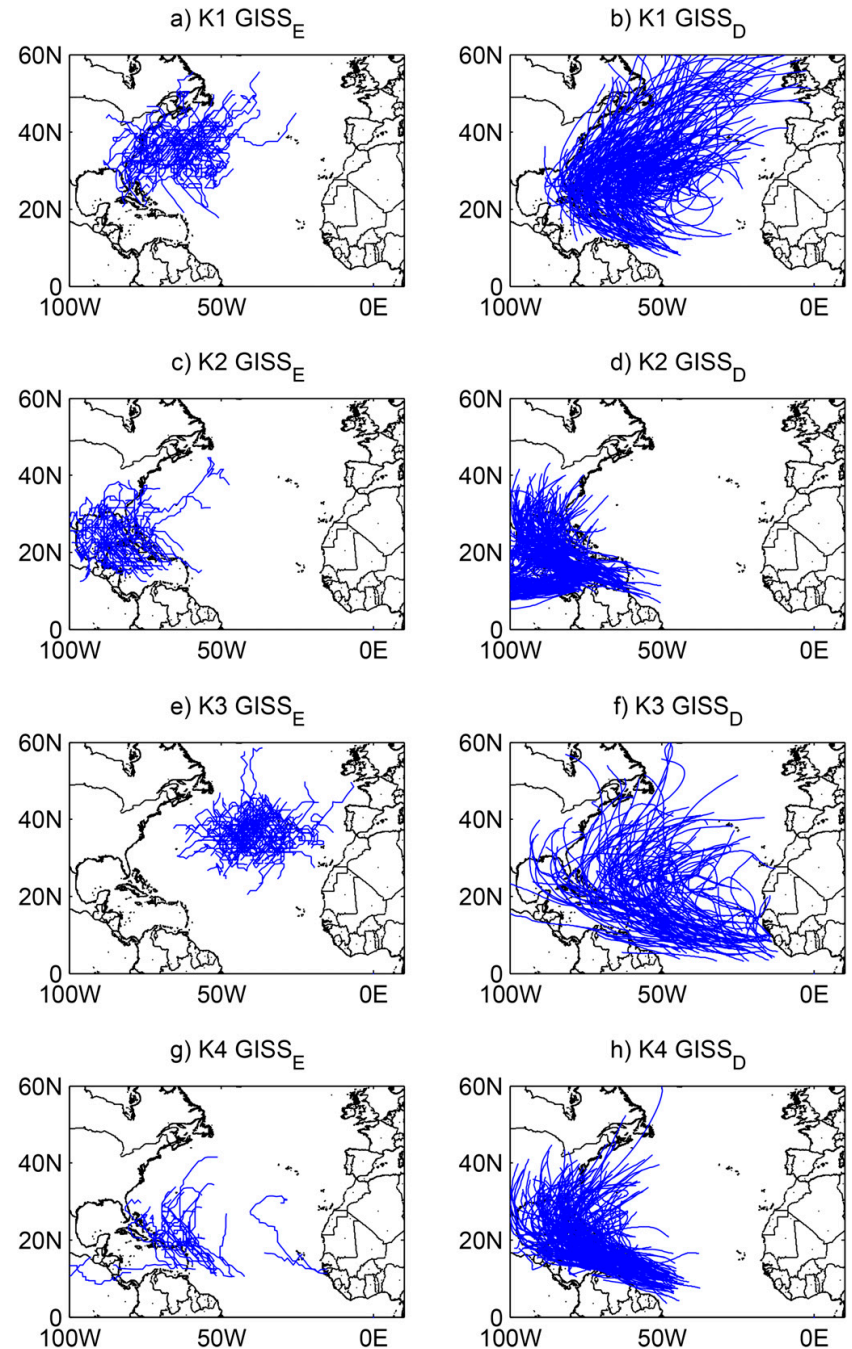
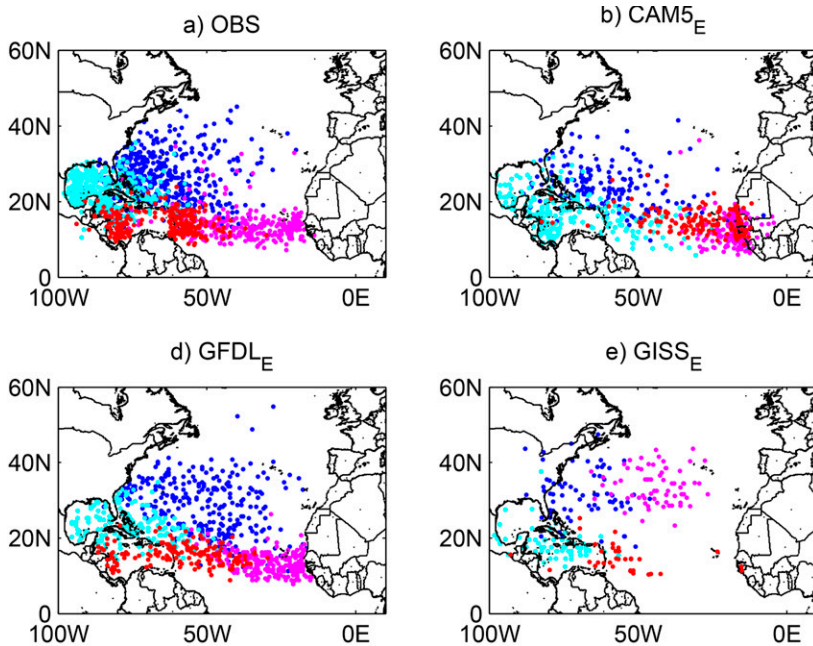
Roberts et al. J. Clim. 2015

# Sensitivity to tracking scheme



Figures from Horn et al. J. Climate, 2014

# Cluster analysis of Atlantic TC tracks



Daloz et al. J. Climate, 2015

FIG. 6. As in Fig. 5, but for GISS<sub>E</sub> and GISS<sub>D</sub>.

# Issues

- Model sensitivity to parametrizations, e.g. convection scheme
- Model biases
- Results depend on model TC definition – not uniform
- Similar resolution models: TC climatology (intensity, frequency) can be very different

# Conclusions

- In the last few years there has been a huge progress in the research of TCs in climate models.
- The HWG working is the first effort of a multi-model comparison on this topic.
- There is a large sensitivity on model resolution and physics in climate models' ability to simulate TCs.
- A large range of research topics is now possible with the improvement in the ability of climate models in simulating TCs.

# Perspective

- Remarkable progress
- Seamless predictions
- Ability to further improve:
  - Simulation of disturbances need to be improved (e.g. MJO, easterly waves, equatorial waves)
  - Modeling improvement: convection, dynamical cores
  - ENSO spring barrier
  - Reliable SST projections