



# Hurricane Predictions and Projections

G.A. Vecchi<sup>1</sup>, M. Bender<sup>1</sup>, T. Delworth<sup>1</sup>,  
I.M. Held<sup>1</sup>, H.S. Kim<sup>2,3</sup>, T.R. Knutson<sup>1</sup>,  
S.J. Lin<sup>1</sup>, R. Msadek<sup>1</sup>, A. Rosati<sup>1</sup>, J. Sirutis<sup>1</sup>,  
J. Smith<sup>2</sup>, G. Villarini<sup>4</sup>, M. Zhao<sup>1</sup>

1. NOAA/GFDL, Princeton, NJ
2. Princeton U.
3. Willis Research Network
4. University of Iowa

Gabriel.A.Vecchi@noaa.gov

# Summary

- Premature to conclude we have seen hurricane change due to CO<sub>2</sub>
- Models allow estimates of future activity – pattern of SST change key:
  - Next couple of decades: internal variability dominant player  
(some may be predictable, some not)
  - NA Hurr. Response to CO<sub>2</sub>: maybe fewer, probably stronger.
  - Aerosol forcing and response a key to next few decades.
  - Uncertainty in past and future changes in T(p) impacts interpretation of past, and perhaps TC prediction.
- Encouraging results from long-lead (multi-season and multi-year) experimental forecasts using hybrid system:

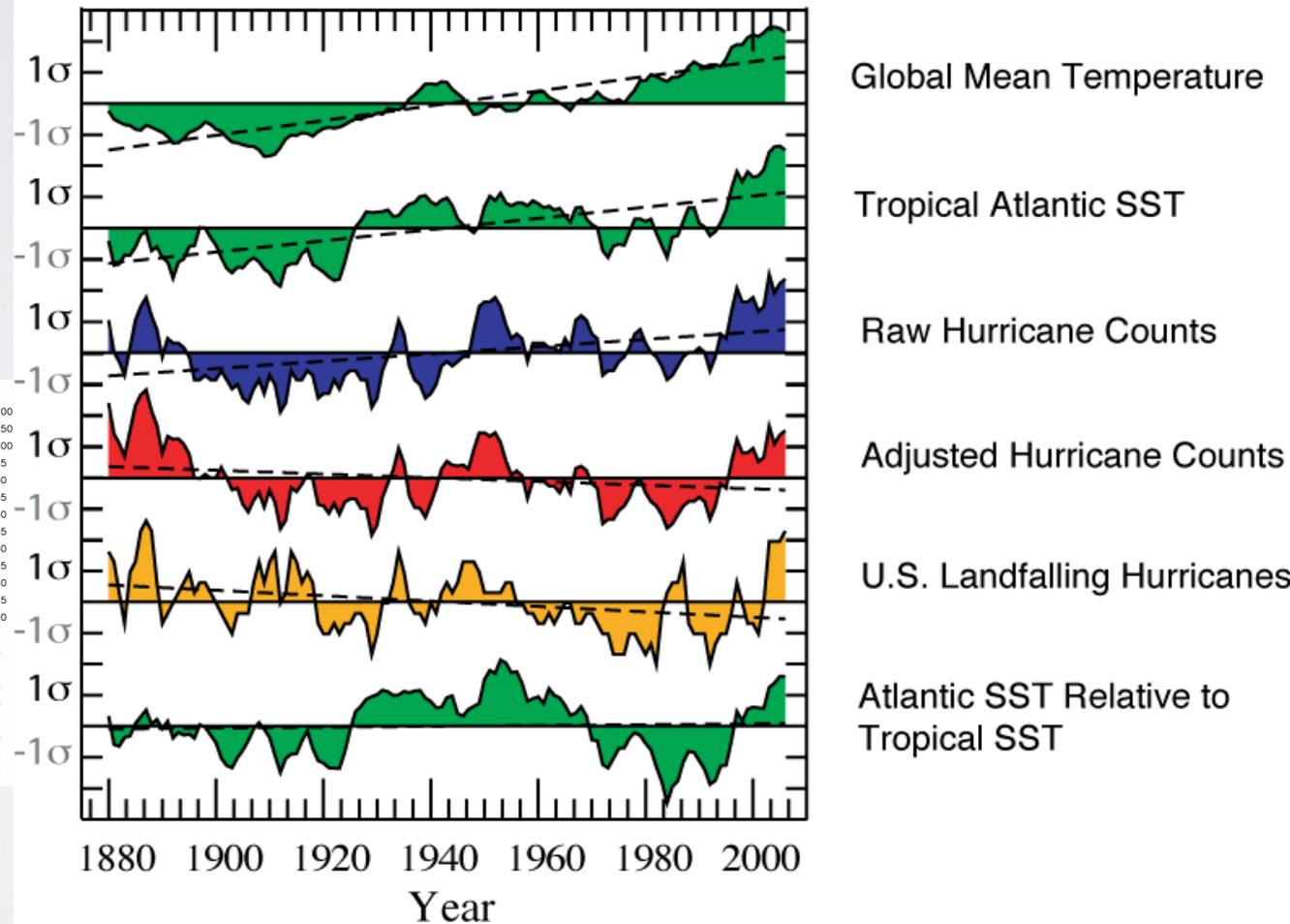
*“past performance no guarantee of future returns”  
but good past performance nice start...*
- High-resolution coupled and atmospheric models enable the next generation of hurricane prediction and projection.

# Outline

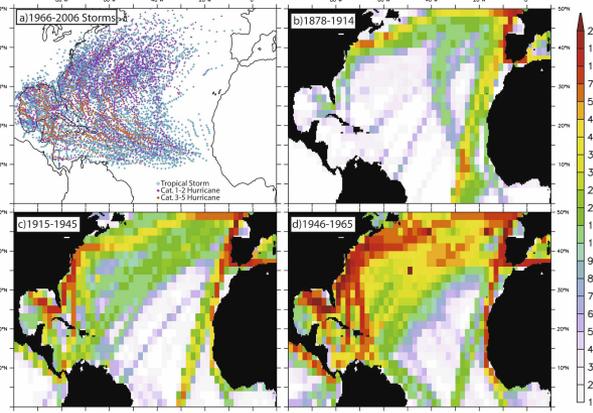
- Historical hurricane records
- Projecting decadal to centennial hurricane activity
  - Issues regarding non-moist-adiabatic warming
- Predicting multi-year hurricane activity

# Historical Hurricane Records

## Normalized Tropical Atlantic Indices



Adjustments to storm counts based on ship/storm track locations and density



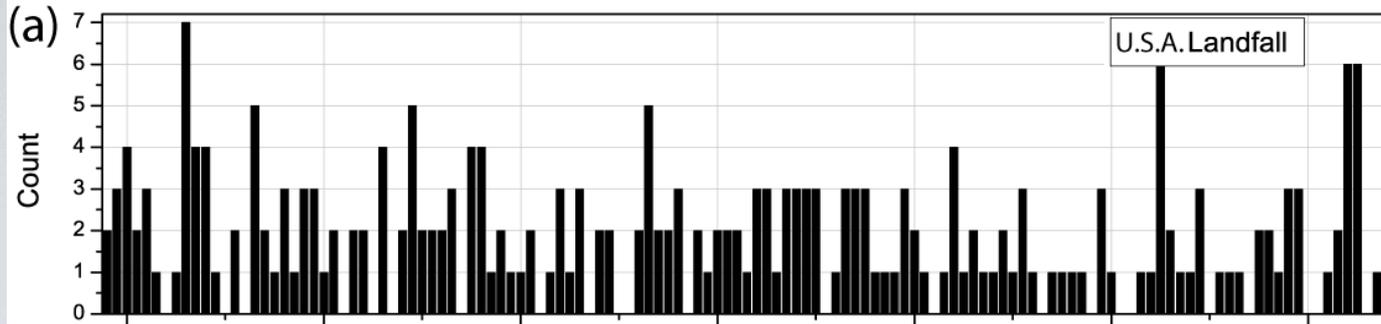
*Vecchi and Knutson (2008, J. Clim.)*

*Landsea et al. (2009, J. Clim.)*

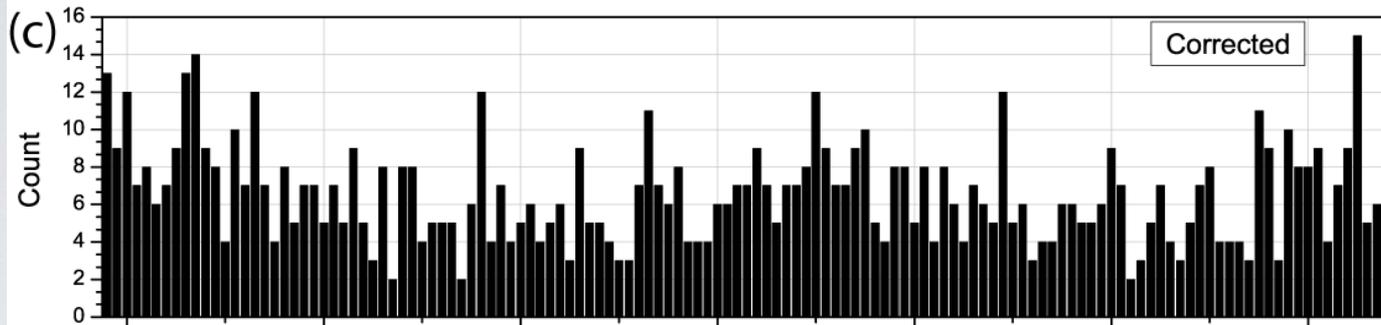
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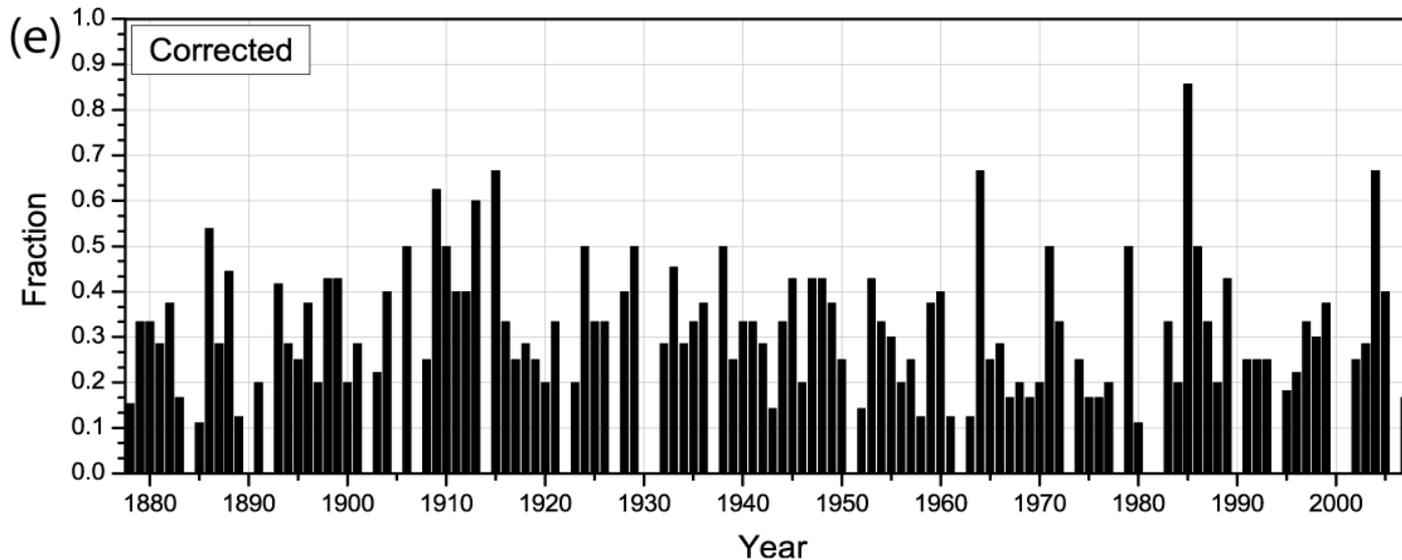
# Seasonal hurricane counts



U.S. Landfalling  
Hurricanes

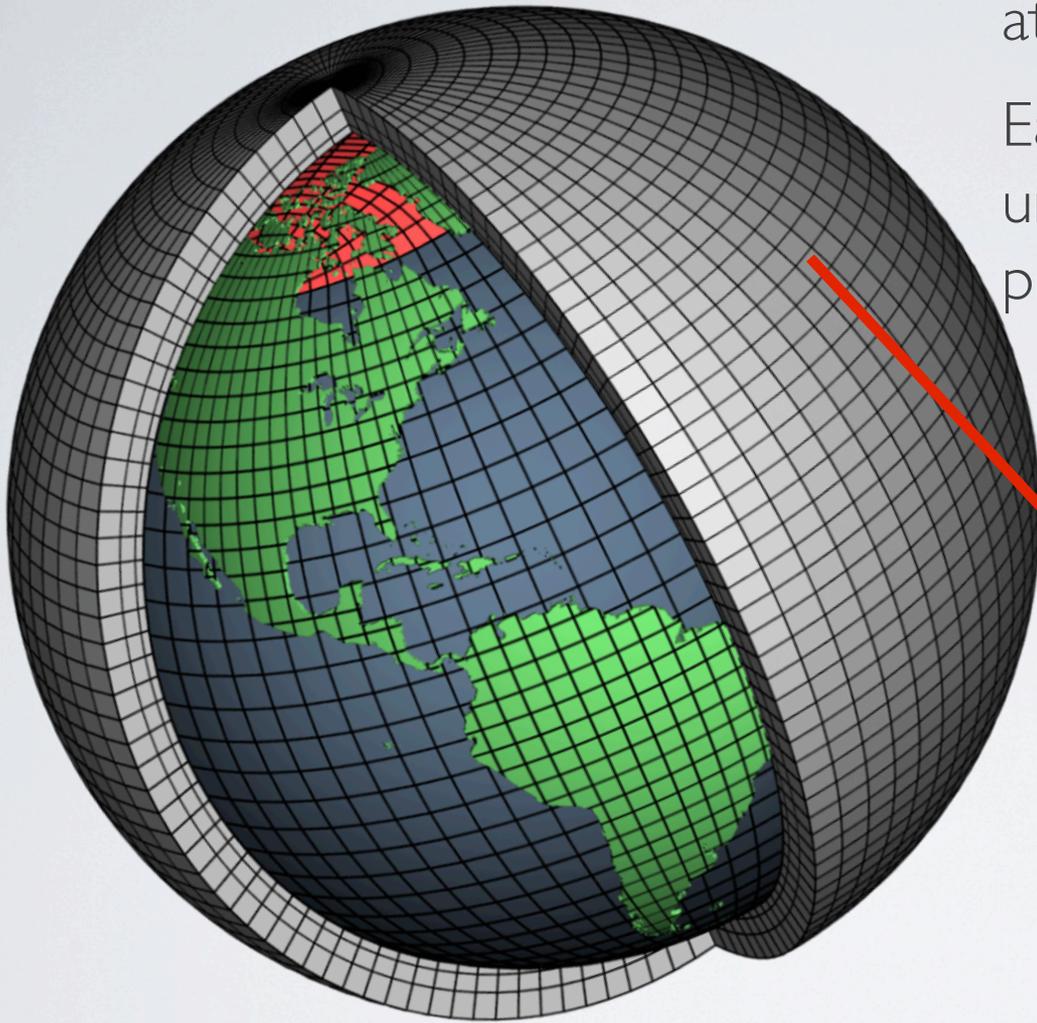


Basinwide  
Hurricanes



Fraction of  
Basinwide  
Hurricanes  
Making U.S.  
Landfall

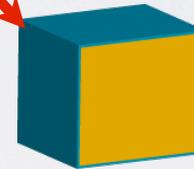
# Multi-decadal projections of TC activity



Models have land, ocean, atmosphere and ice components.

Each encapsulates our best understanding of underlying processes controlling its evolution.

In each grid cell:



★ conserve momentum  
( $F = m \cdot a$ )

★ account for changes  
in mass and  
composition

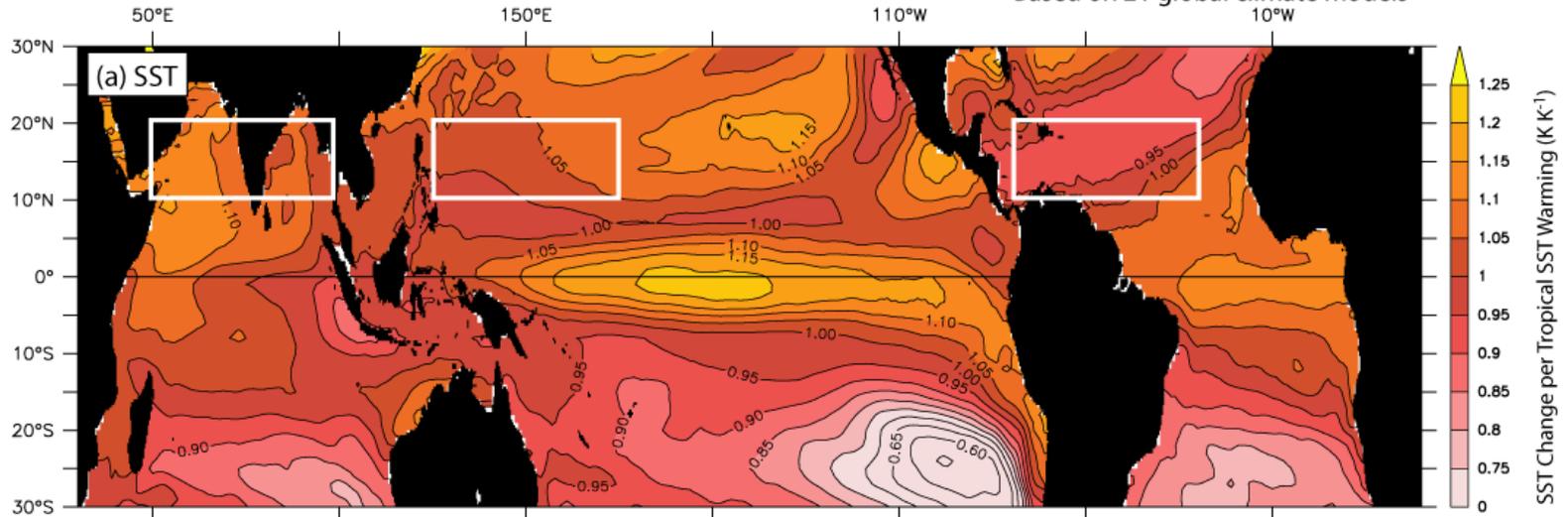
★ conserve energy  
(radiation, latent, etc...)

“Force” with solar radiation,  
structure of continents and  
atmospheric composition (e.g.,  $\text{CO}_2$ )

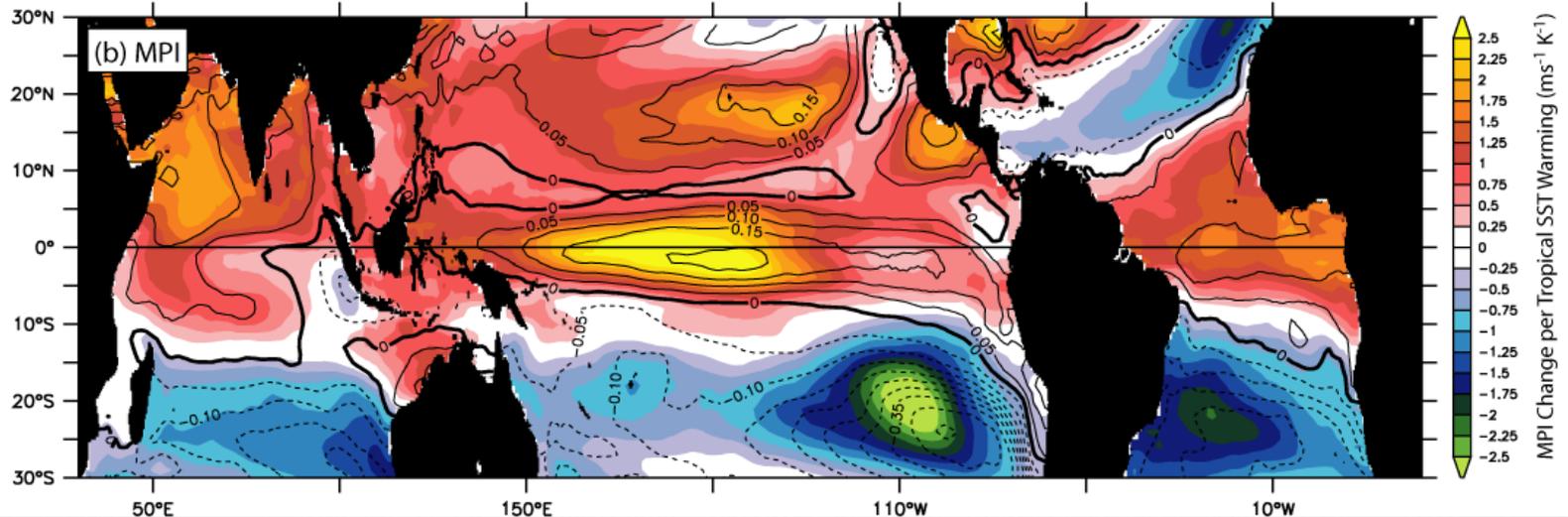
# GCM Projections of 21<sup>st</sup> Century Changes in Large-Scale Environment

Based on 21 global climate models

Surface Temp.



Tropical Cyclone  
Potential Intensity



Contour: Fractional SST Departure from Tropical-mean SST Change

Contour:  $\text{relative SST} = \text{local} - \text{tropical-mean}$

Why “relative SST” =  $T_{\text{local}} - T_{\text{trop}}$ ?

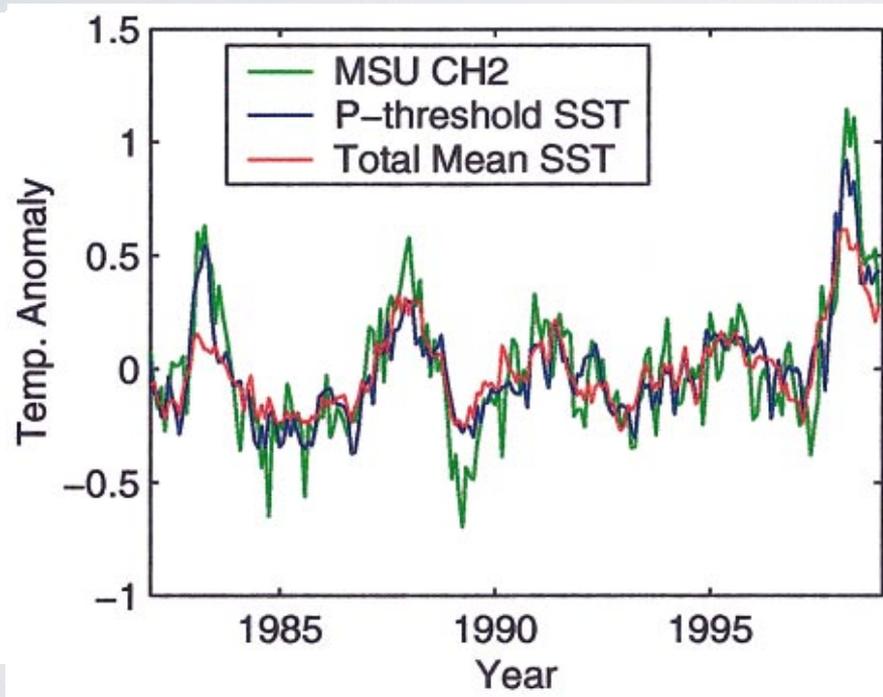
$$PI \propto \frac{T_s - T_o}{T_o} (k^* - k) \Big|_{r_{\max}}$$

Surface warming  $\rightarrow$  PI increase  
Warming aloft  $\rightarrow$  PI decrease

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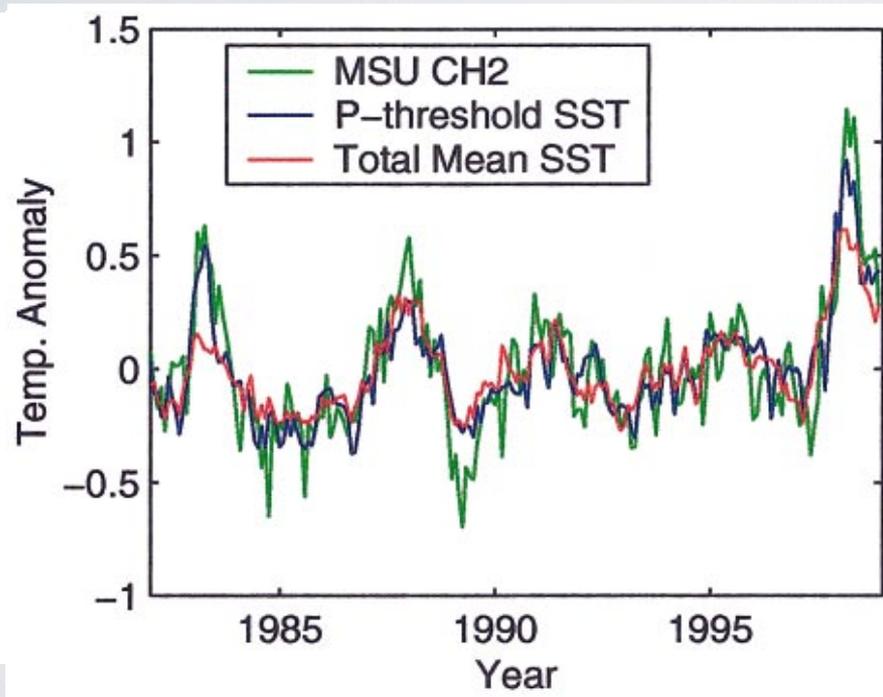
*Sobel et al. (2002, J. Clim.)*

*see also Sobel and Bretherton (2000, J. Clim.)*

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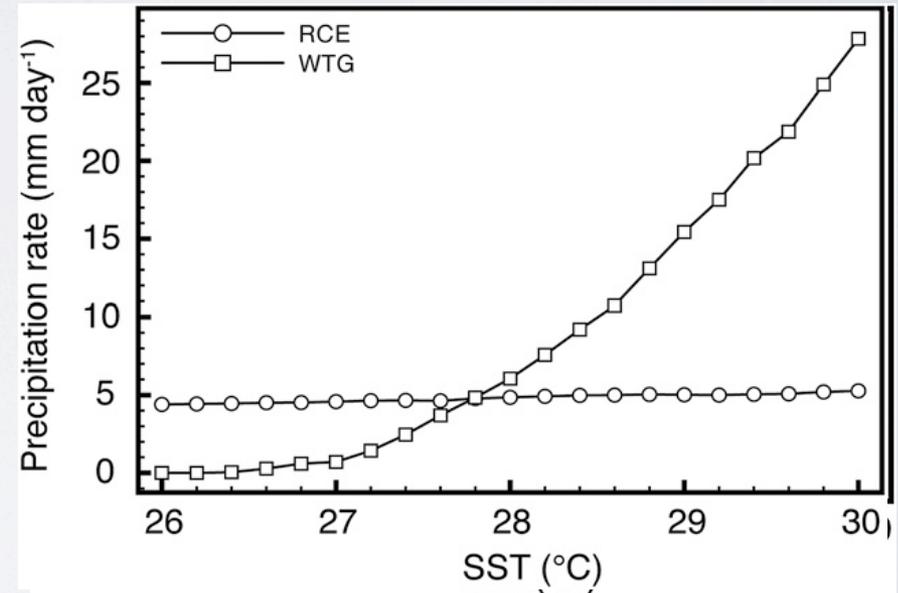
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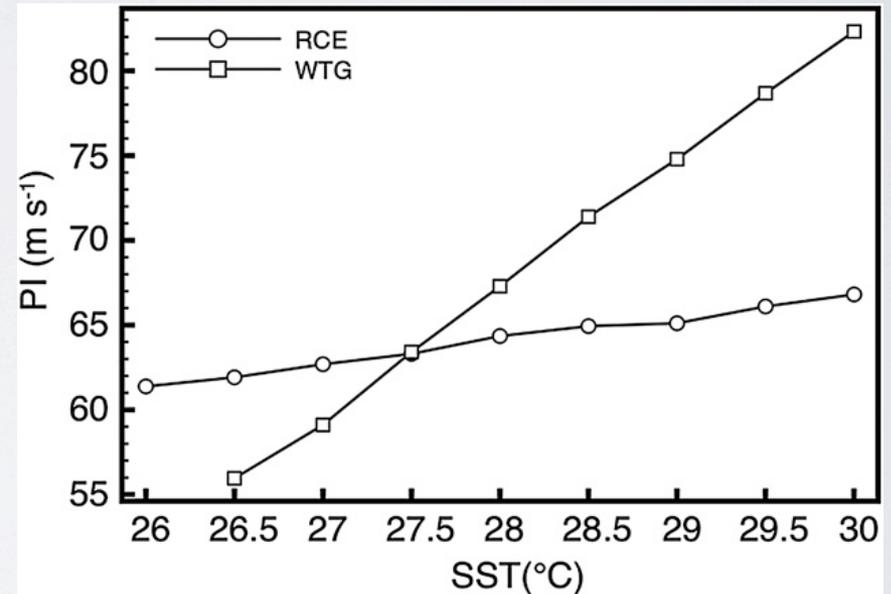
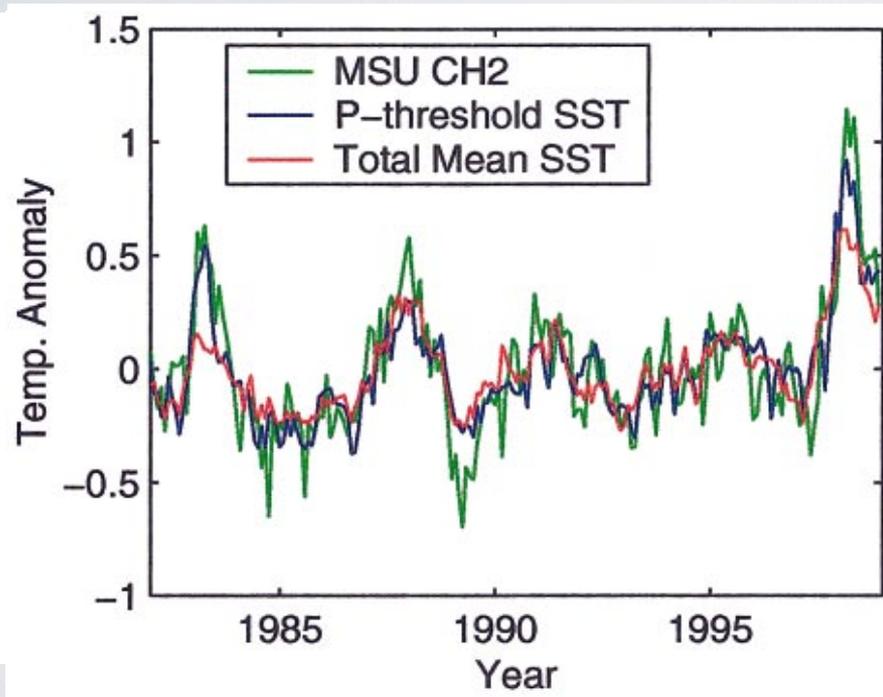


*Ramsay and Sobel (2011, J. Clim.)*

# Why “relative SST” = $T_{\text{local}} - T_{\text{trop}}$ ?

$$PI \propto \frac{T_s - T_o}{T_o} (k^* - k) \Big|_{r_{\text{max}}}$$

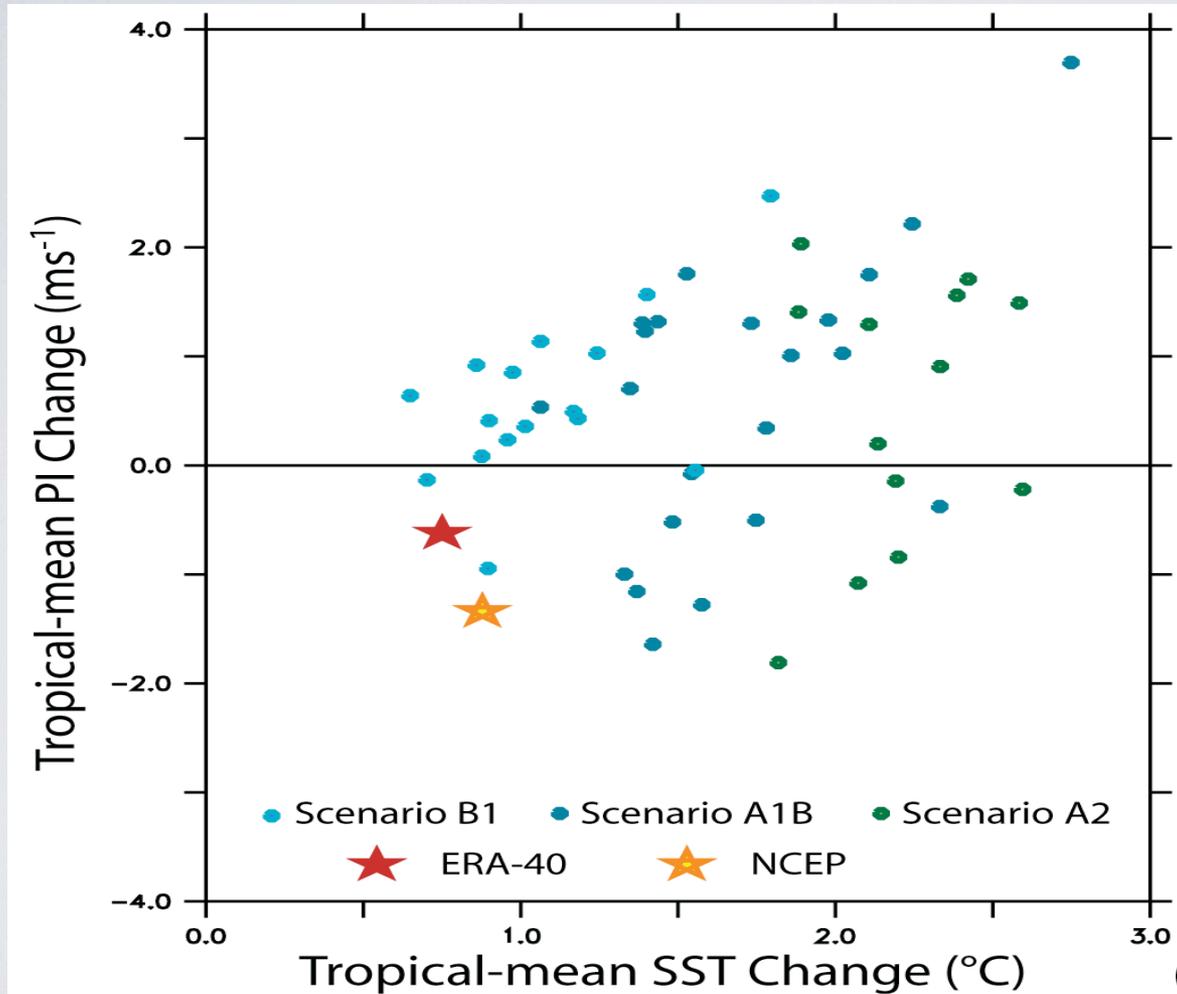
Surface warming → PI increase  
 Warming aloft → PI decrease



Sobel et al. (2002, J. Clim.)  
 see also Sobel and Bretherton (2000, J. Clim.)

Ramsay and Sobel (2011, J. Clim.)

# What about tropical-mean PI change?



Not well constrained by SST changes.

Related to vertical structure of temperature change.

Why “relative SST” =  $T_{\text{local}} - T_{\text{trop}}$ ?

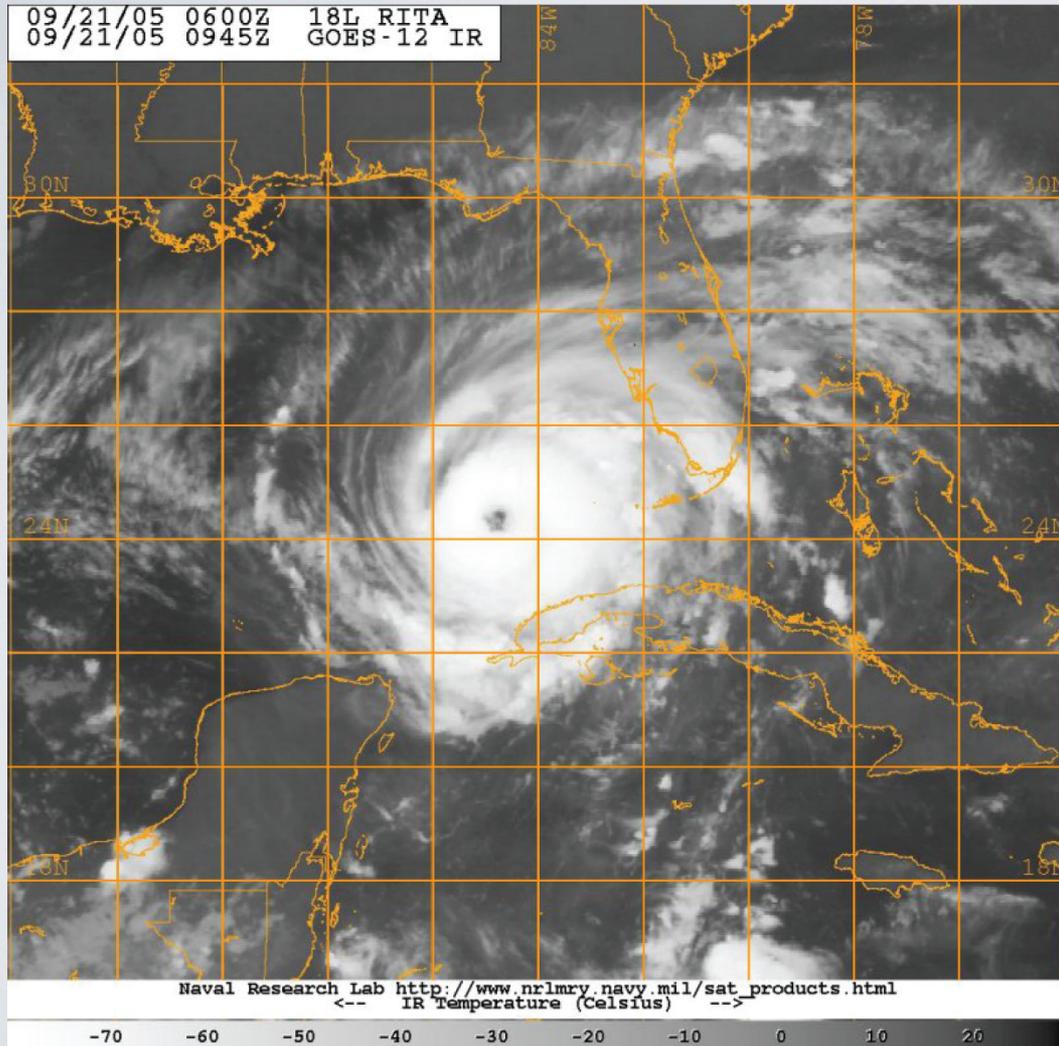
$$PI \propto \frac{T_s - T_o}{T_o} (k^* - k) \Big|_{r_{\text{max}}}$$

If warming something like moist adiabatic\*, then relative SST (through impact of tropical-SST on upper troposphere) can be an OK proxy for PI changes.

Also through stability, relative SST in Atlantic can be good proxy for other cyclone-relevant quantities ( $w_{500}$ ,  $rh_{700}$ , shear, etc.)

\*Will come back to this.

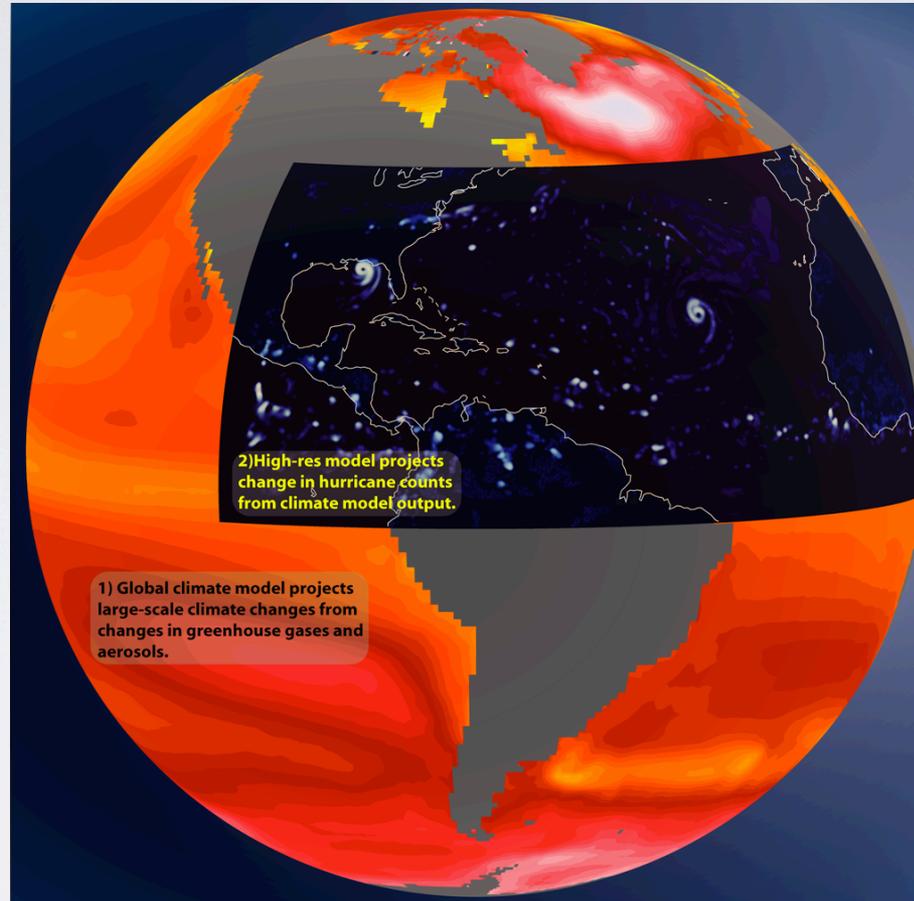
But, current computing power limits ability of coupled global climate models to represent hurricanes



Hurricane Rita (2005):  
orange grid is  
representative of most  
current *coupled global*  
climate model resolution.

Size of grid limited by  
power of computers.

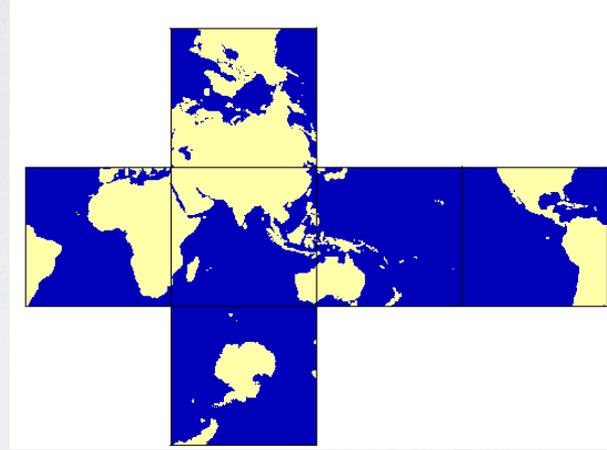
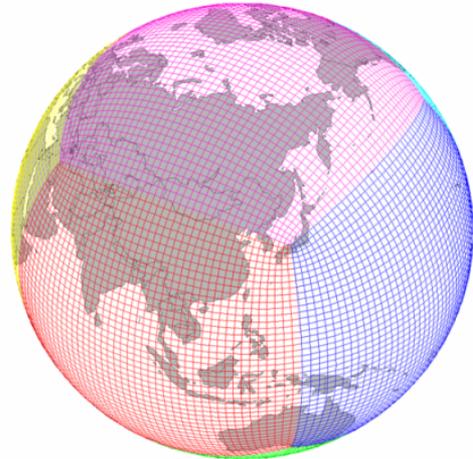
# “Downscale” Climate Model Projections With High-Resolution or Statistical Models



Global Climate Models -> High-resolution Model  
Large-scale TS Frequency

# The GFDL High-Resolution Atmosphere Model (HiRAM)

- Non-hydrostatic Finite-Volume dynamical core on the cubed-sphere

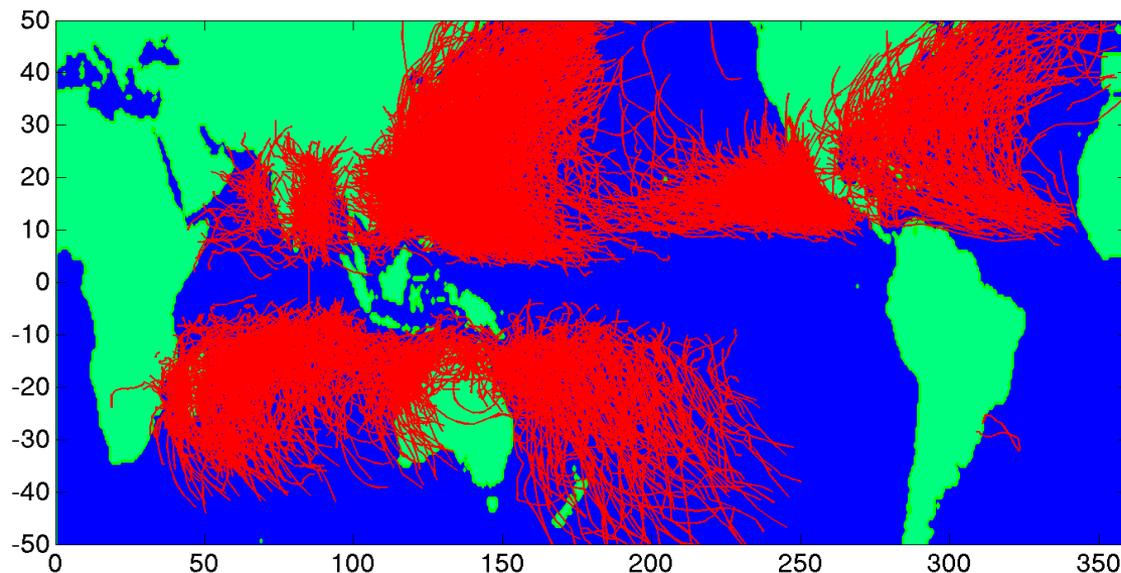


- Designed for resolution between 1– 100 km, capable of direct cloud simulation
- A PDF based 6-category cloud micro-physics with finite-volume vertical sub-grid reconstruction **allowing vertically & horizontally sub-grid cloud formation**
- A “non-intrusive” shallow convective parameterization (Bretherton scheme modified by Zhao *et al.* 2009)
- Options to couple with ocean and wave models

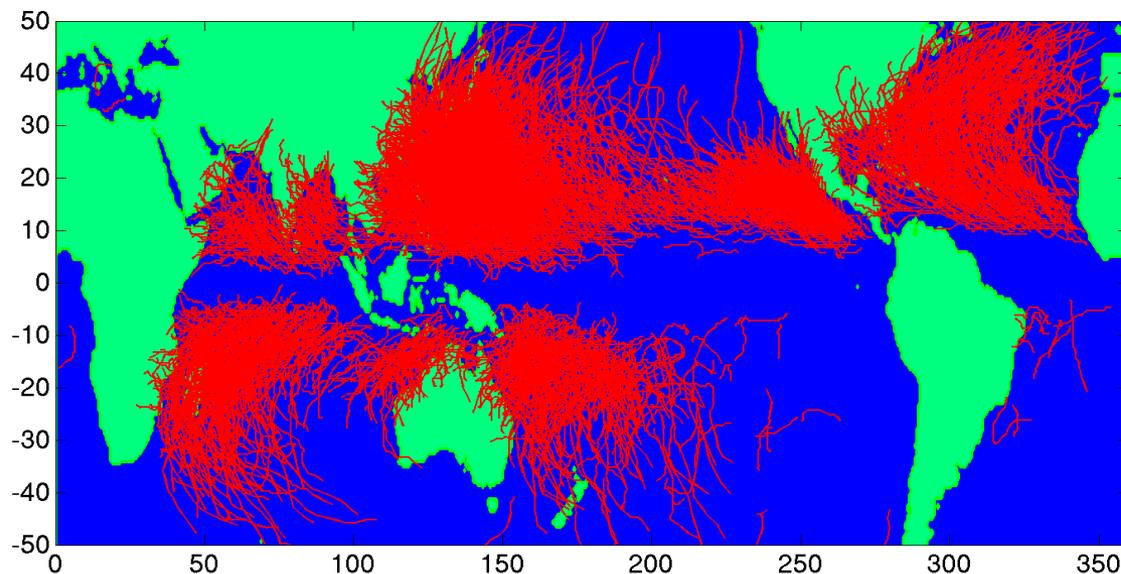
Slide: S-J Lin

# Geographical distribution of TC tracks (1981-2009)

**Observation**

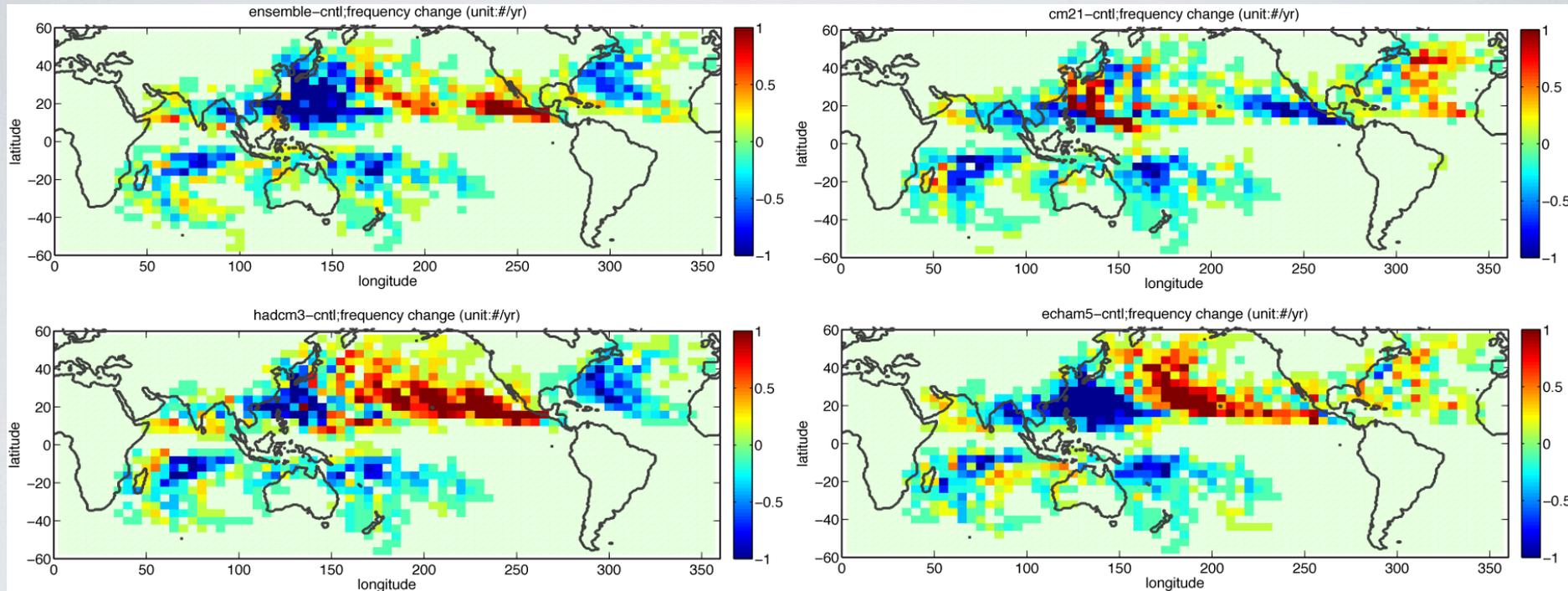


**HiRAM-C180  
AMIP simulation**



Zhao et al. (2009)

# Response of TC frequency in single 50km global atmospheric model forced by four climate projections for 21st century



**Red/yellow = increase**  
**Blue/green = decrease**

*Adapted from Zhao et al. (2009, J. Climate)*

Regional increase/decrease much larger than global-mean.

Pattern depends on details of ocean temperature change.

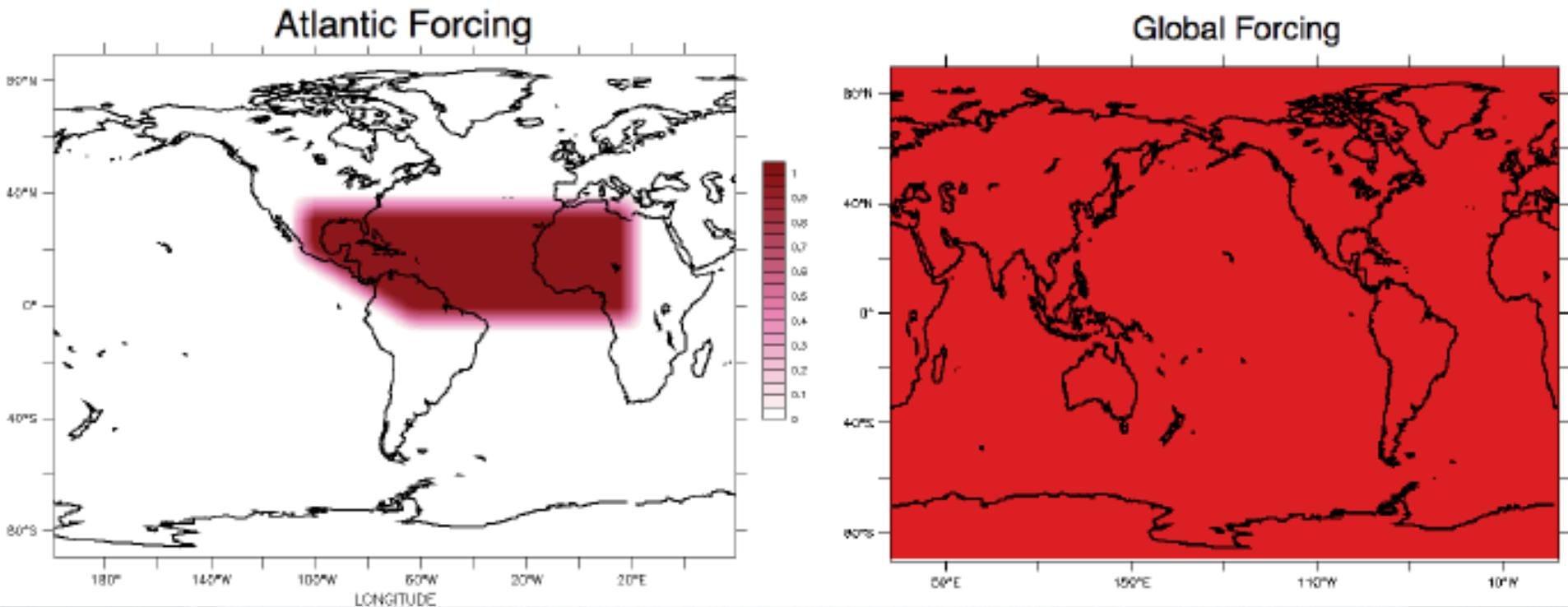
Sensitivity of response seen in many studies

*e.g., Emanuel et al. 2008, Knutson et al. 2008, Sugi et al. 2010, Villarini et al. 2011, Knutson et al. 2013, etc.*

# Idealized Forcing Experiments

If local SST the dominant control, as opposed to relative SST:

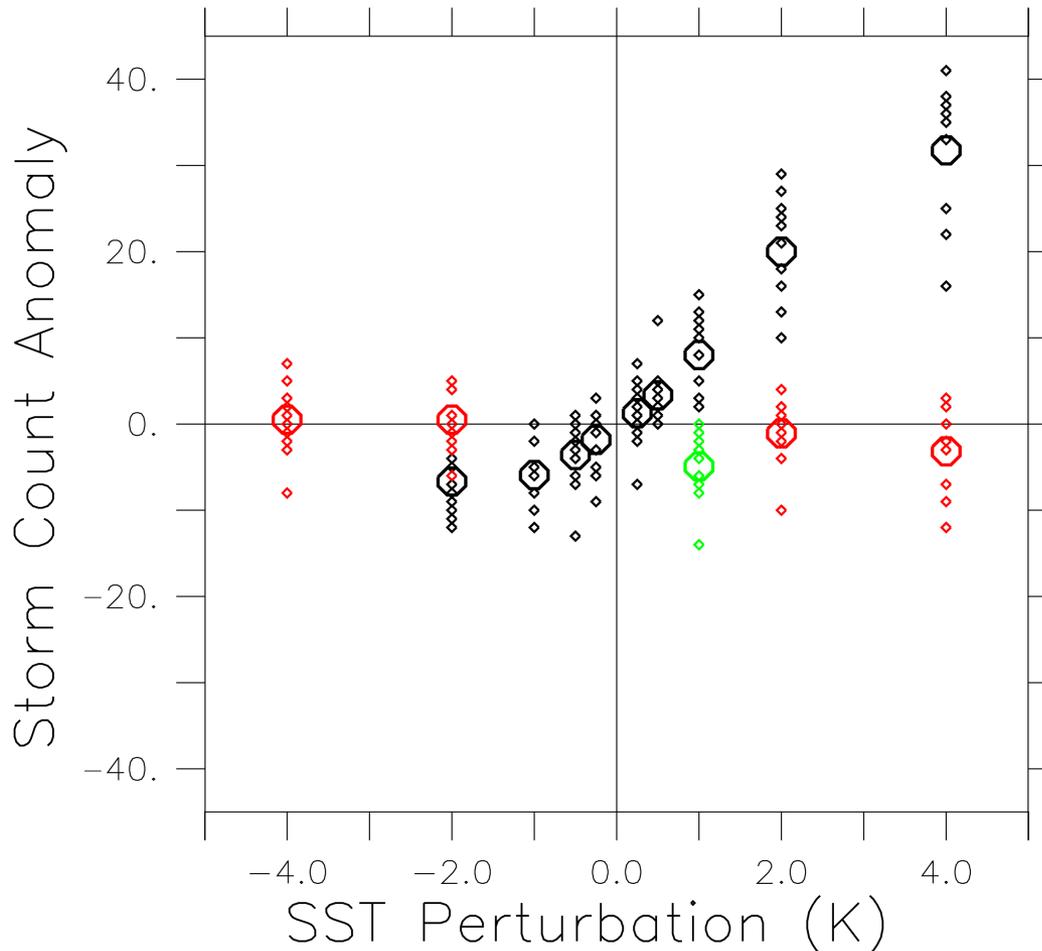
- Similar Atlantic Response to Atlantic and Uniform F' cing
- Little Pacific Response to Atlantic compared to Uniform



# North Atlantic Response to Idealized SST

Change in Annual NA Storms from Idealized SST:

NATL, GLO, EQU



Atlantic Forcing

Uniform Forcing

Near-equatorial Forcing

Similar TS frequency response to:

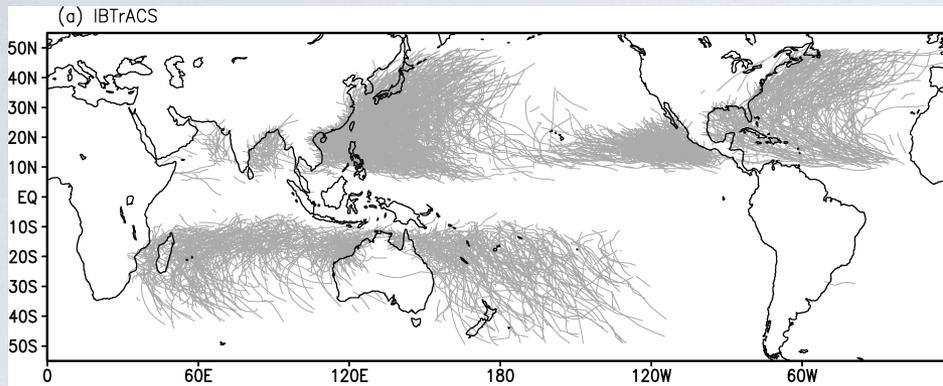
0.25° local warming

4° global cooling

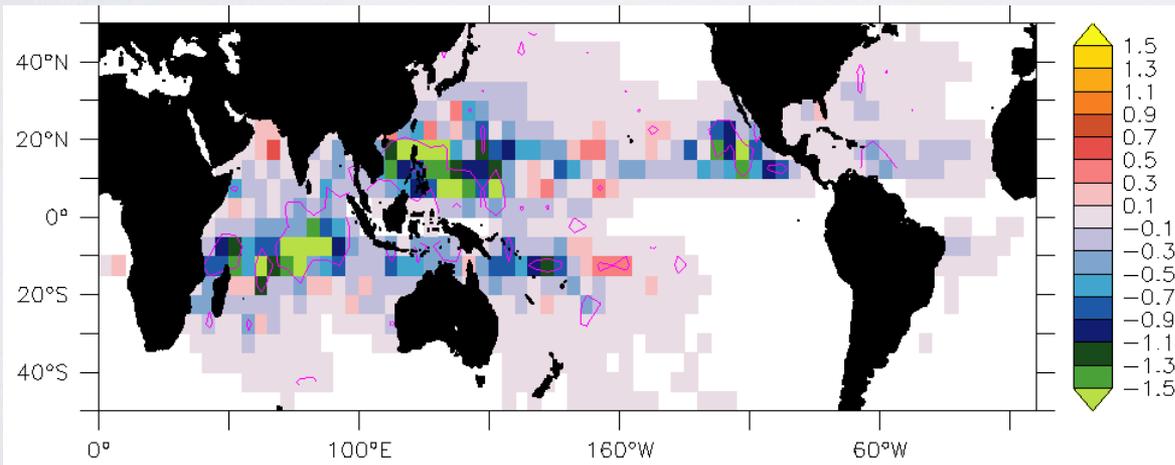
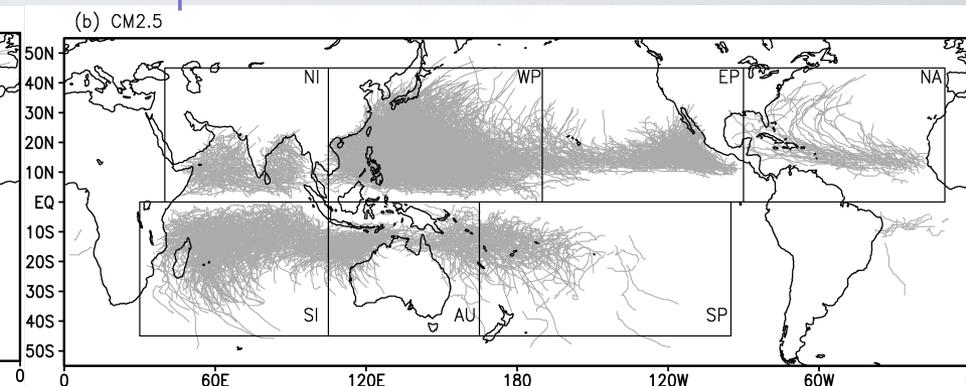
*Vecchi et al (2013, in prep.)*

# Response of TCs in high-resolution global coupled model (GFDL CM2.5, *Delworth et al. 2012, J. Climate; Kim et al. 2013 in prep.*)

## Observed Tracks



## Coupled Model Tracks



More storms

Fewer storms

CM2.5 Tropical storm density response to CO<sub>2</sub> doubling

# Use homogenized data and high-res models to build statistical models for exploration and projections

$$Rate = e^{a+bSST_{ATL}-cSST_{TRO}}$$

Family of statistical models based on observed and high-res. model hurricane activity and SST.

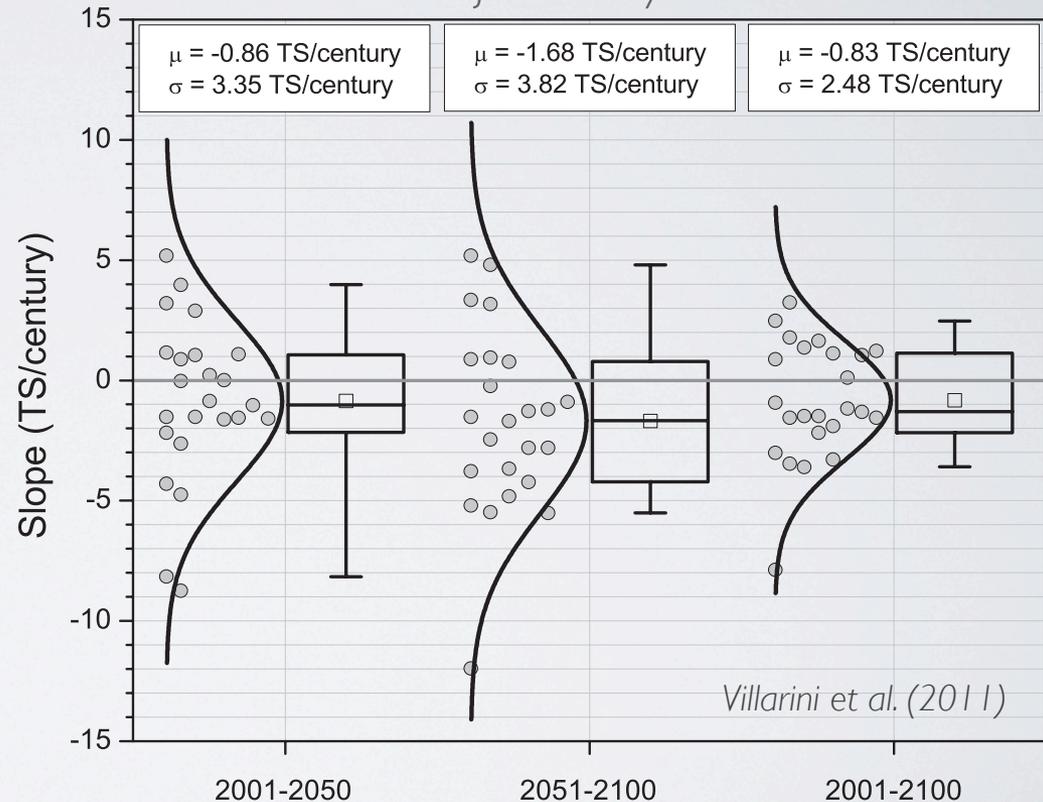
Use two predictors:

- Tropical Atlantic SST (positive)
- Tropical-mean SST (negative)

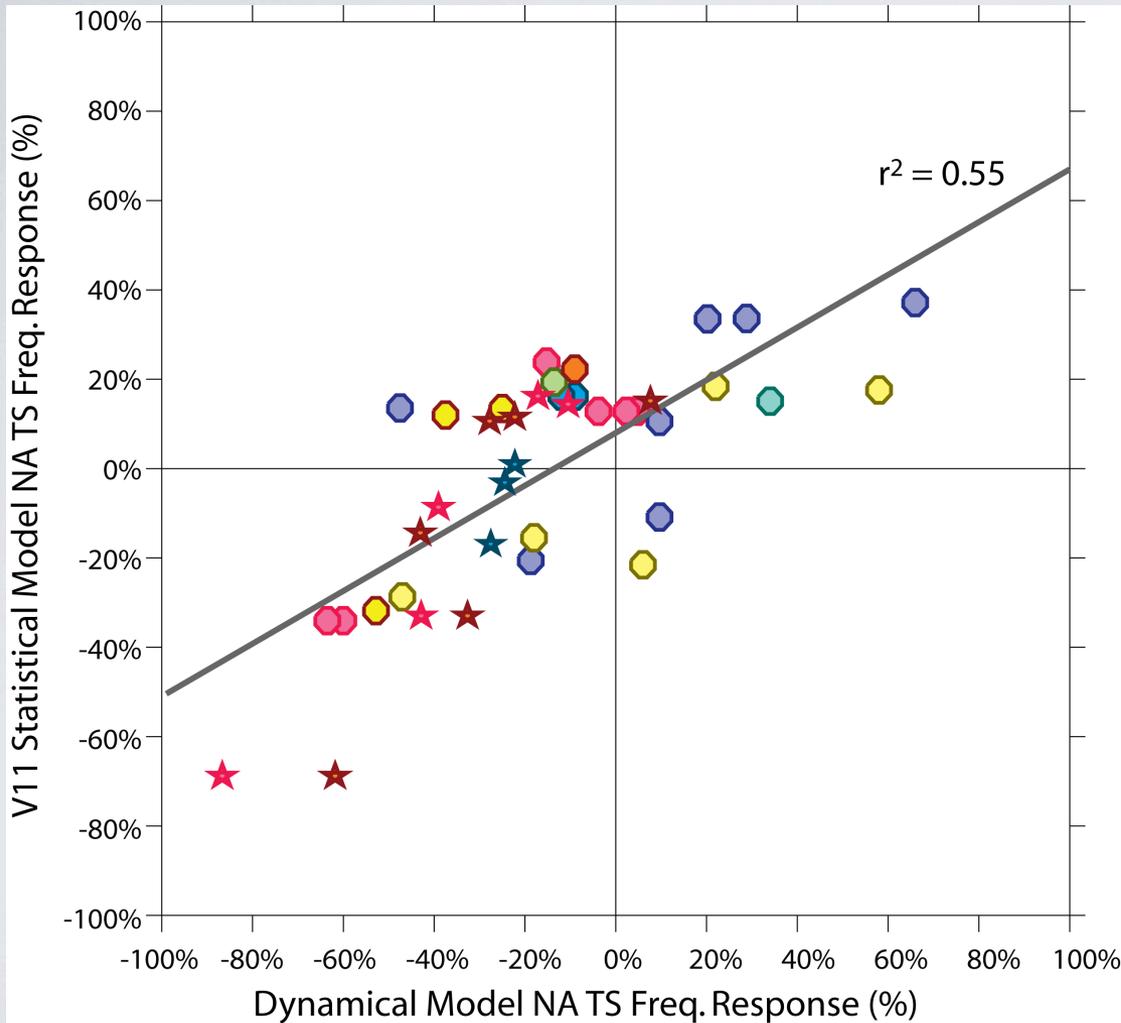
Consistent with high-res dynamical models, understanding on controls to hurricanes & “cheap”.

*Knutson et al. (2008), Swanson (2008), Vecchi et al. (2008), Zhao et al. (2009, 2010), Villarini et al. (2010, 2011 a.,c), Villarini and Vecchi (2011)*

Projections of North Atlantic TS Count Trends Using Observationally-based Statistical Model and SST Projected by 23 CGCMs



# Simple statistical model explains much of the spread across many high-res modeling studies



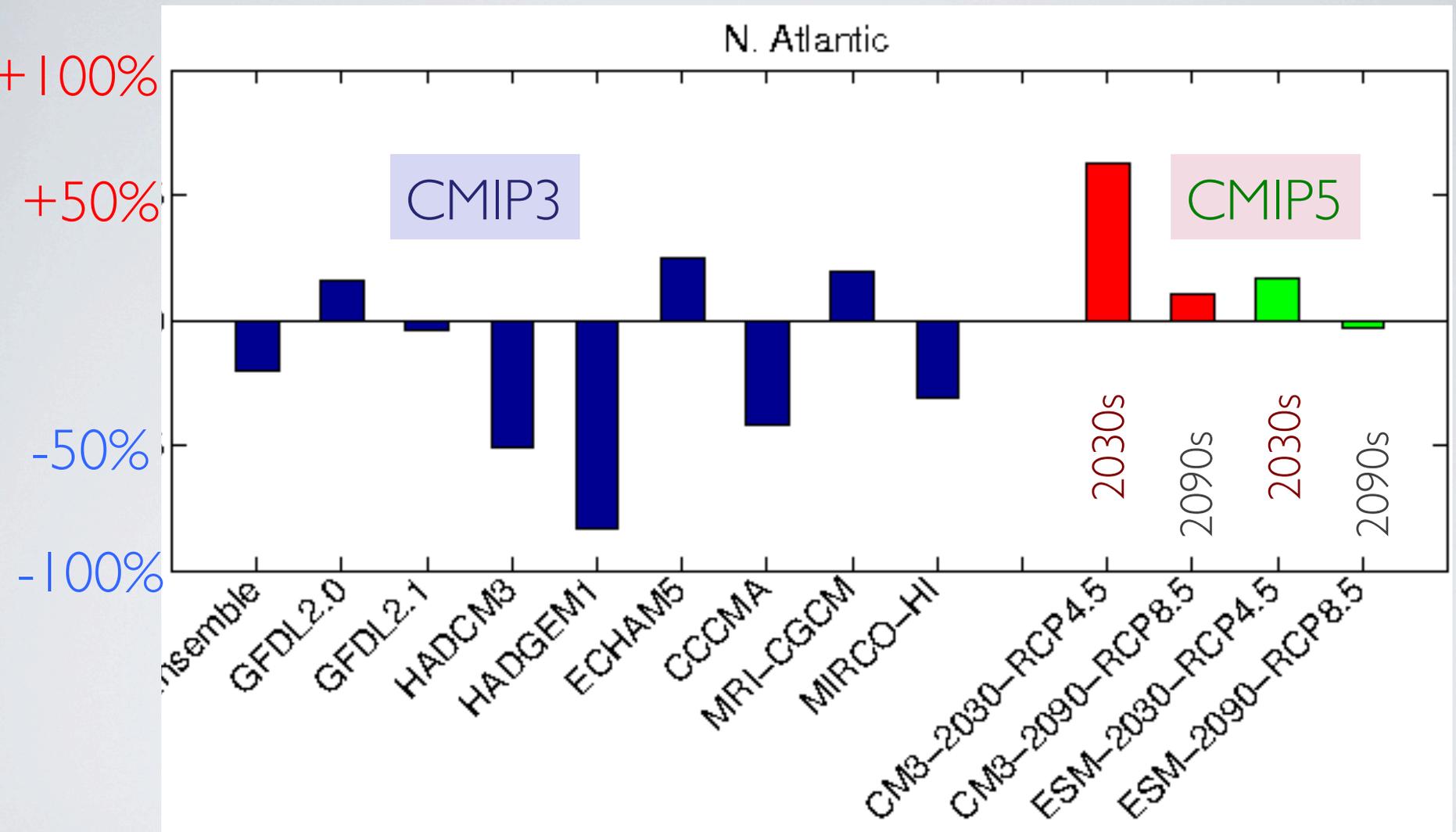
- Knutson et al (2008)
- Bender et al. (2010)
- ★ ZETAC - present study (single)
- ★ ZETAC - present study (MME)
- Zhao et al. (2010)
- ★ HiRAM - present study
- Emanuel et al. (2008)
- Bentsson et al. (2006)
- Oouchi et al. (2006)
- Gualdi et al. (2008)
- Sugi et al. (2009)

Differences in projected patterns of surface warming drive large uncertainties in hurricane projections

$$Rate = e^{a+bSST_{ATL}-cSST_{TRO}}$$

*Knutson et al. (2013, J. Clim.)*  
*See also Villarini et al. (2011, J. Clim.)*  
*Vecchi et al. (2008, Science)*

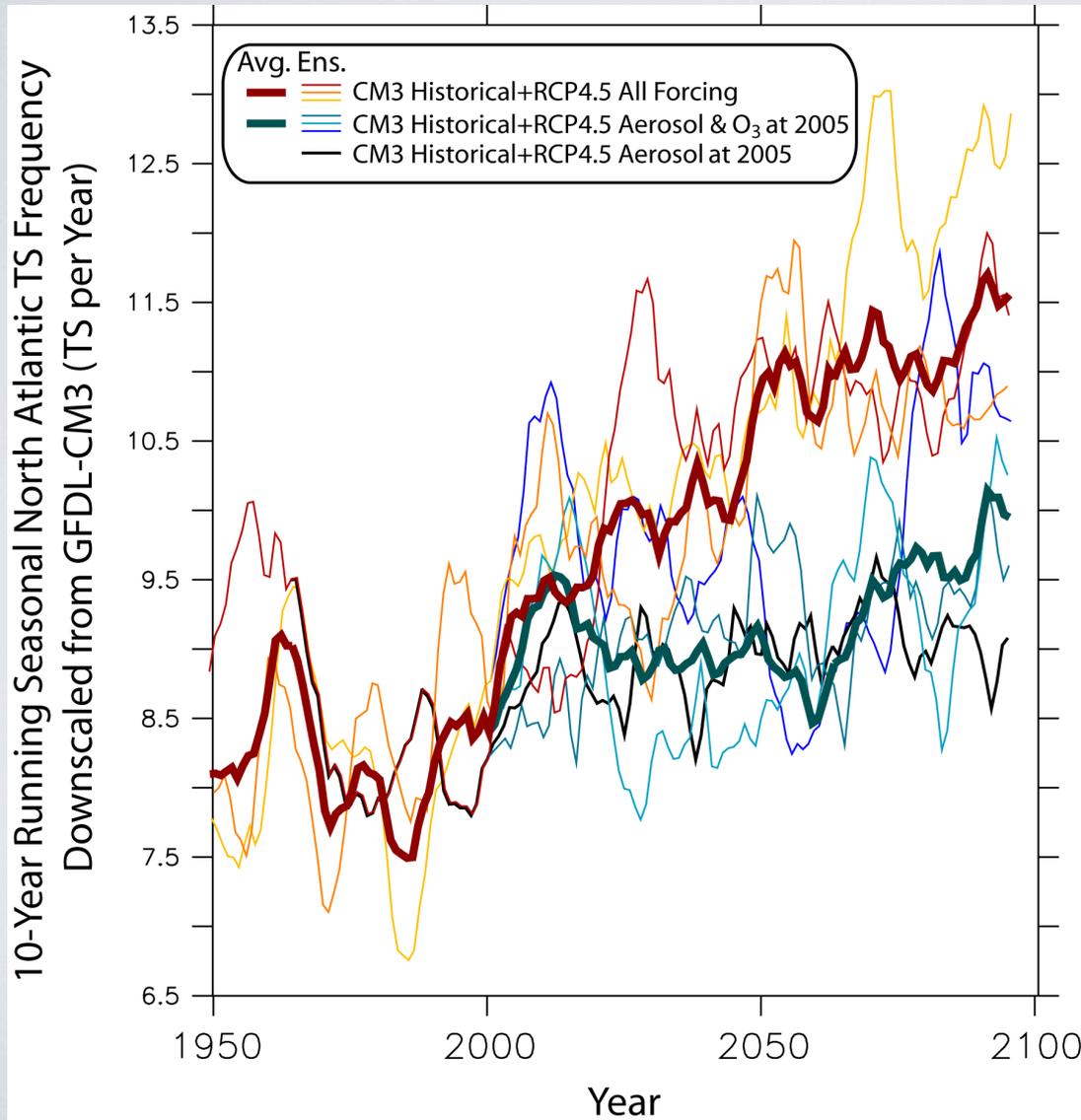
# Dynamical Projections of Atl. Hurricanes for end of 21<sup>st</sup> Century



Using GFDL-HiRAM

*Adapted from Zhao et al. (2009, J. Clim.) and Held et al. (2013, submitted)*

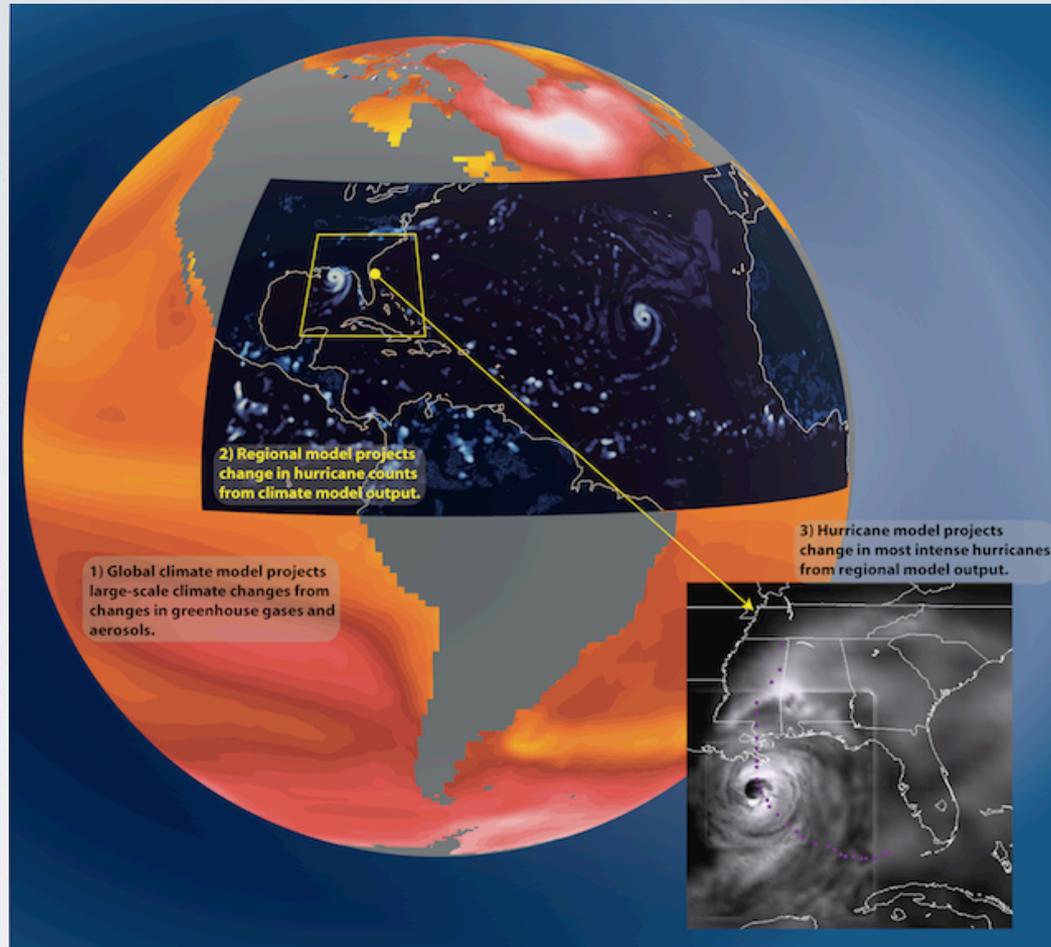
# GFDL-CM3 indicates aerosols key for NA TS projections (projected aerosol clearing -> more storms)



All Forcing  
No future aerosol or O<sub>3</sub>  
No future aerosol

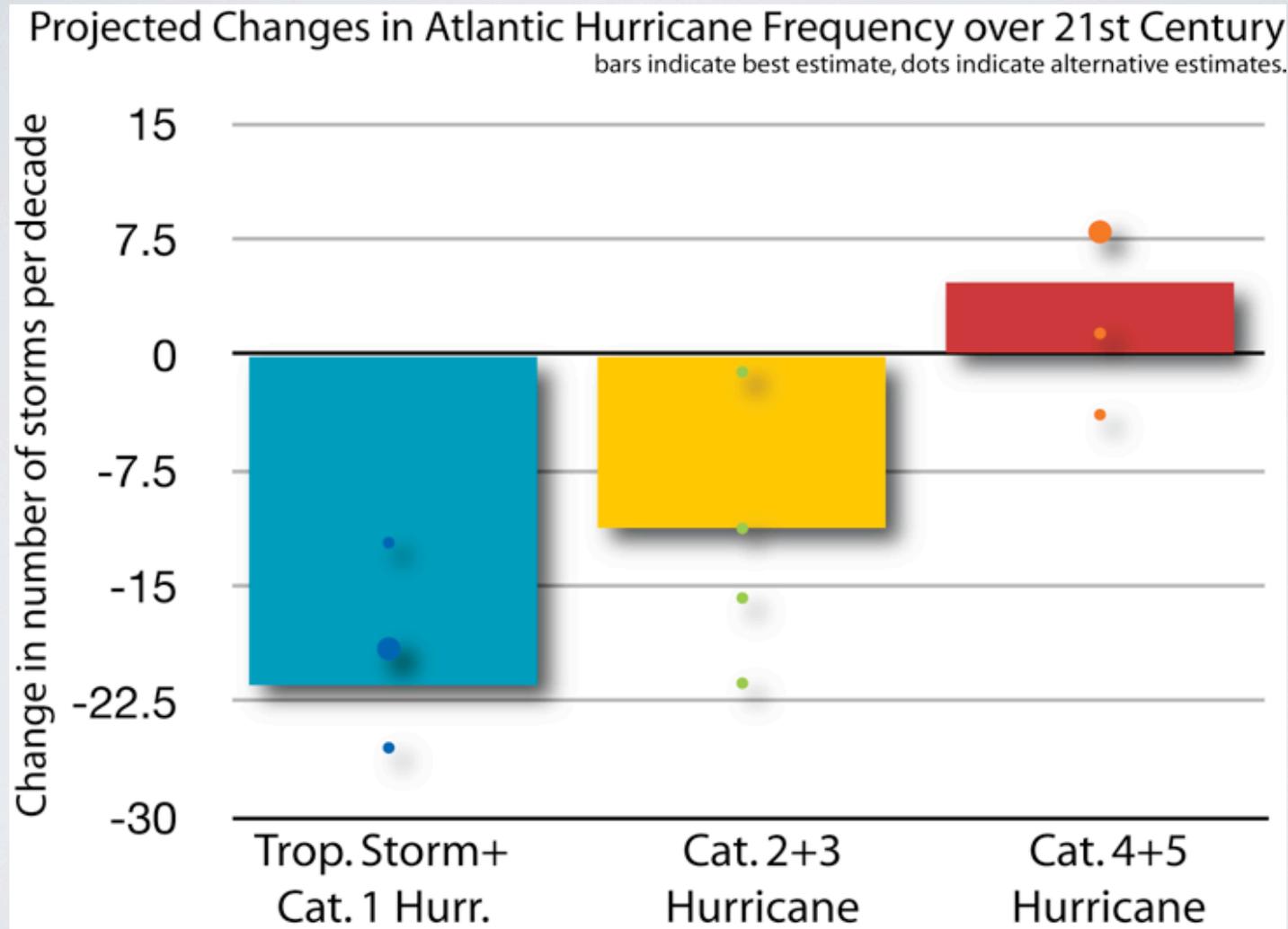
Villarini and Vecchi (2012, Nature C.C.)

# Multi-decadal projections



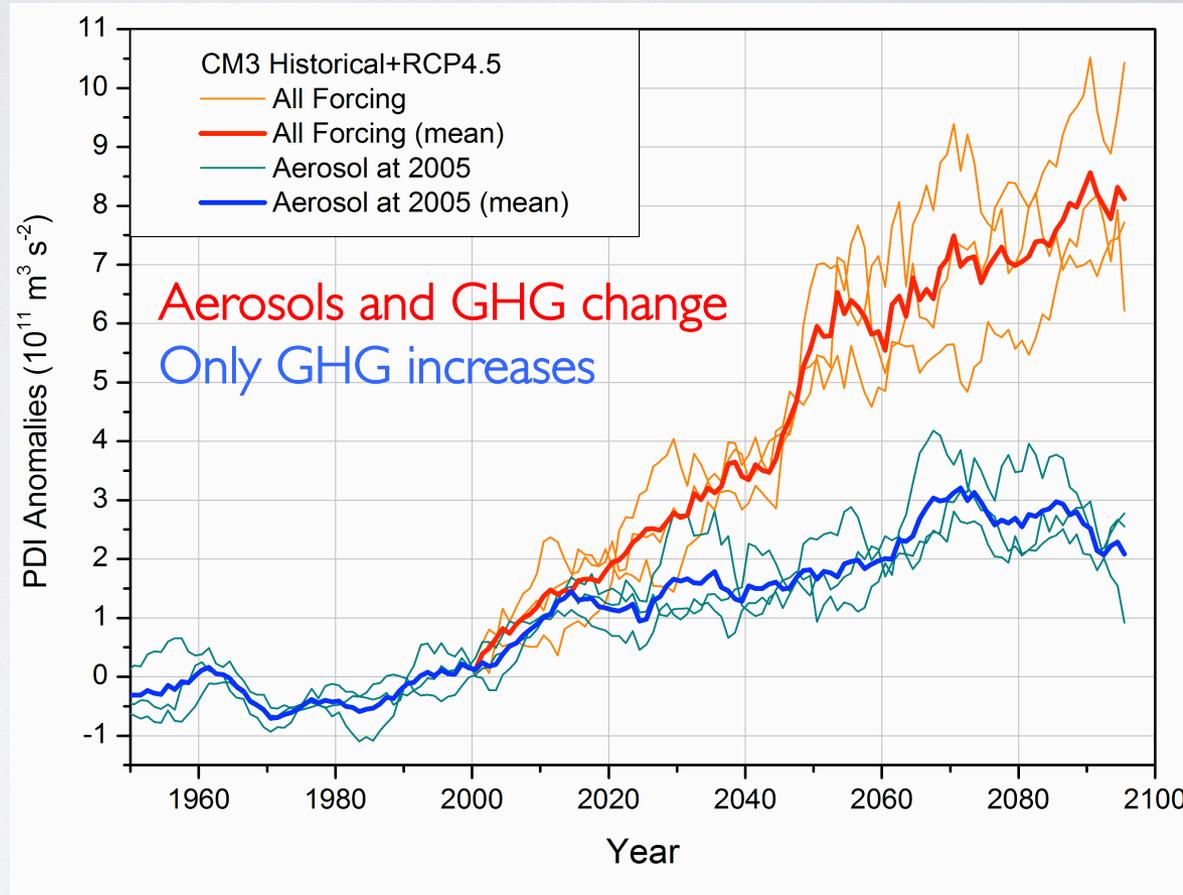
Global Climate Models -> High-Res Model -> Hurricane model  
Large-scale TS Frequency Intensity

Dynamical double downscaling for Atlantic:  
Overall frequency decrease projected,  
but more of the strongest storms



Adapted from Bender et al (2010, Science)  
see also Knutson et al. (2008, Nature Geosci.); Knutson et al. (2013, J. Clim., in press)

# Projections of changes in atmospheric aerosols contribute to projected increases in Atlantic hurricane intensity



Power Dissipation Index

$$PDI = \sum_{\text{storms}} U_{\text{max}}^3$$

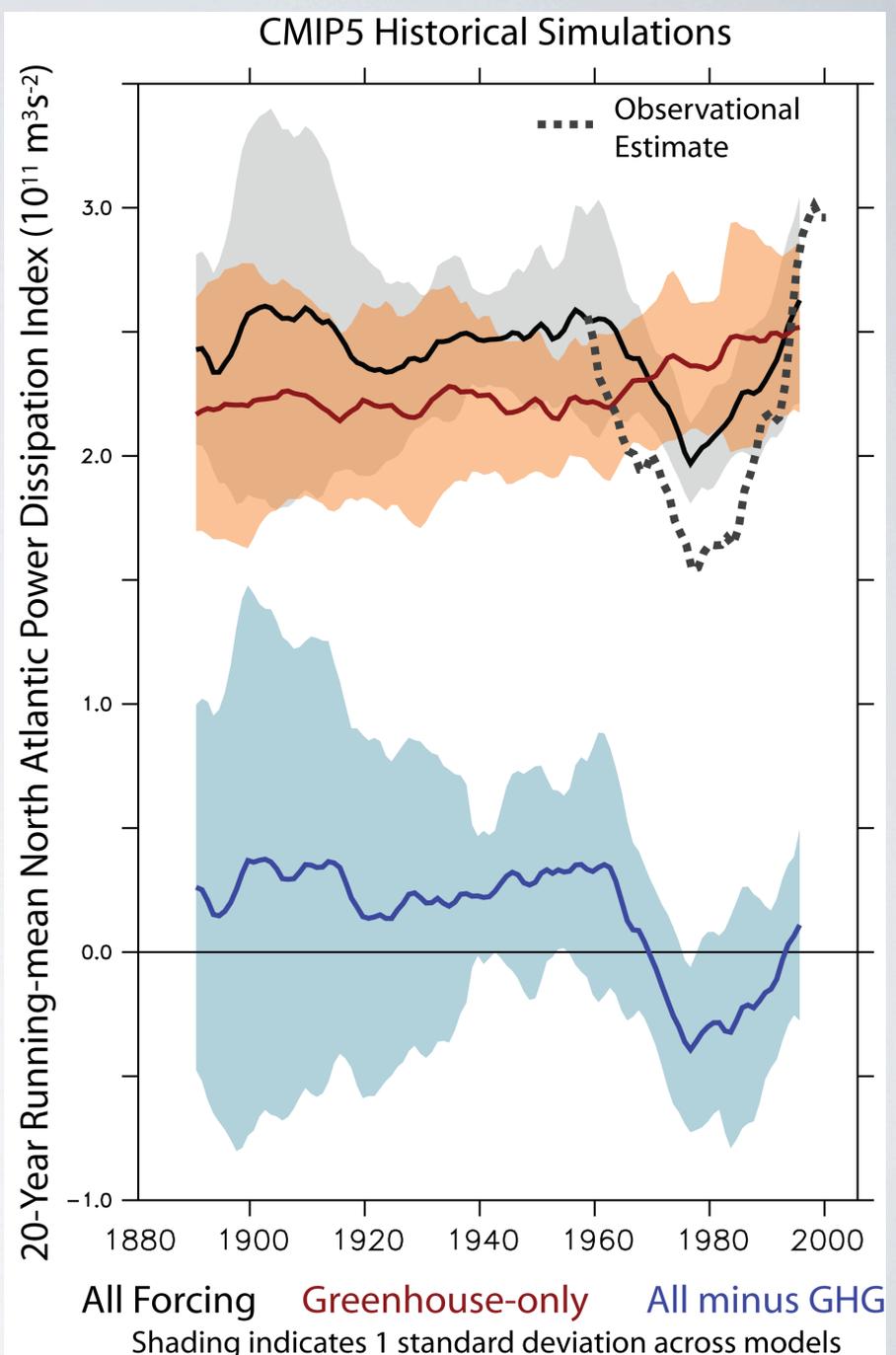
Villarini and Vecchi (2013.b, J. Climate)  
See also Knutson et al. (2013, J. Climate)

Historical **aerosol forcing** may have masked century-scale **greenhouse-induced intensification** in Atlantic

Power Dissipation Index

$$PDI = \sum_{storms} U_{\max}^3$$

*Villarini and Vecchi (2013.b, J. Climate)*



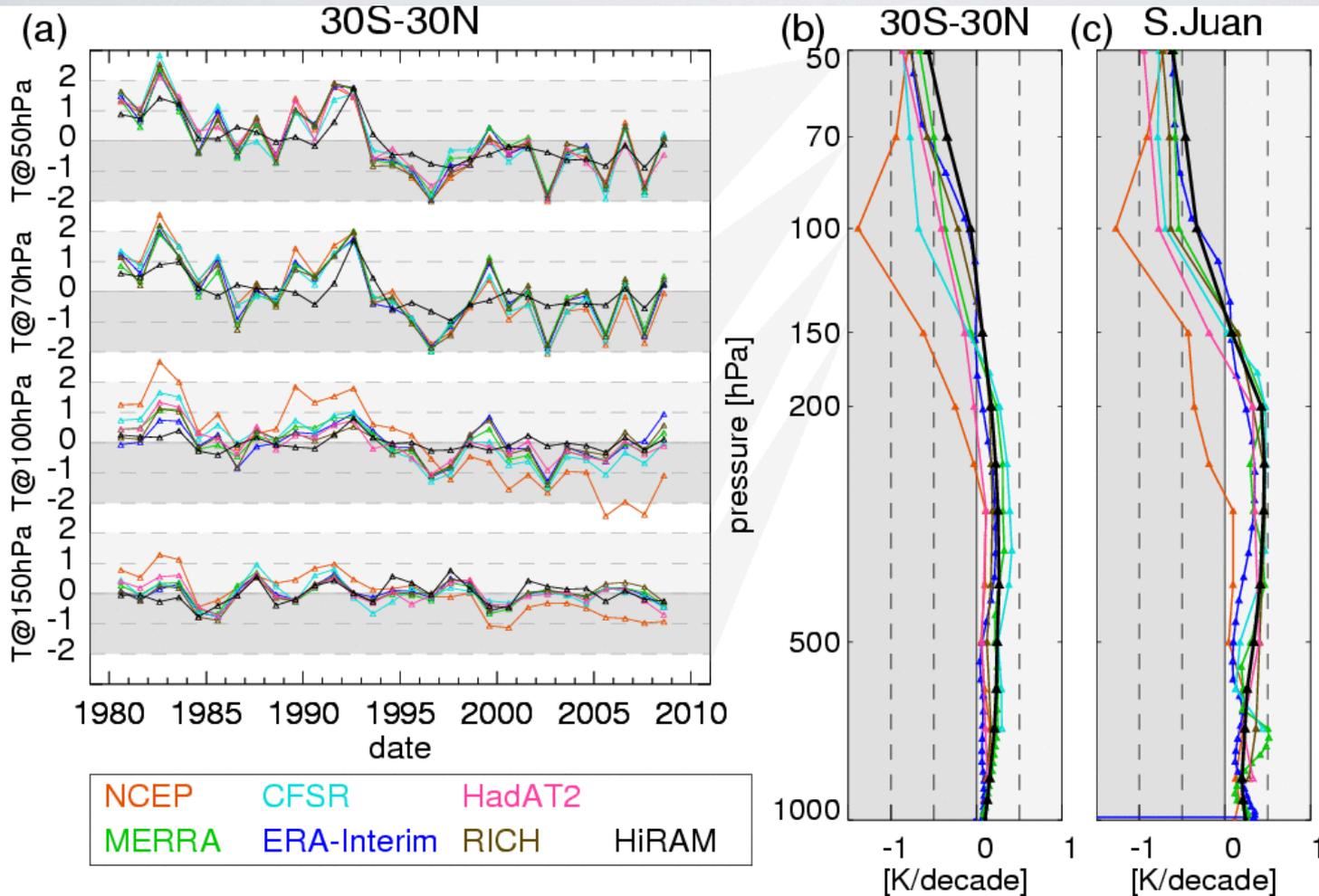
# Issues regarding non-moist-adiabatic warming

If warming something like moist adiabatic, then relative SST (through impact of tropical-SST on upper troposphere) can be an OK proxy for PI, circulation, humidity, shear, precip...changes.

# What about non-moist adiabatic warming?

## Estimates of past atmospheric $\Delta T$

Reanalyses   Radiosonde-only   AGCM



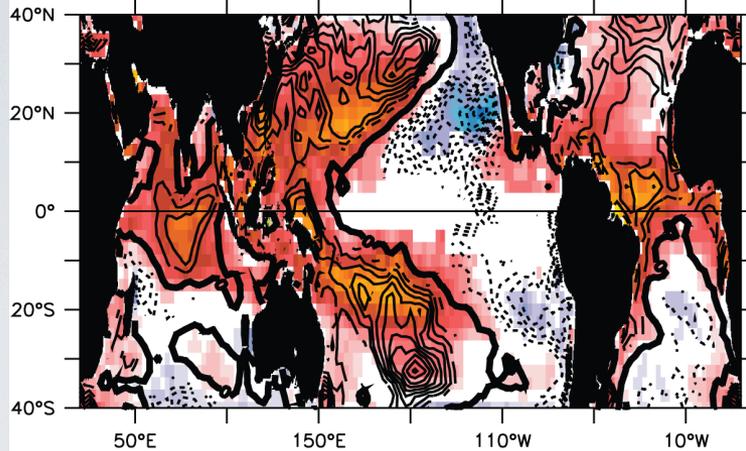
NCEP used in  
Knutson et al.  
(2008) and  
Emanuel et al.  
(2008)

HiRAM used in  
Zhao et al.  
(2009)

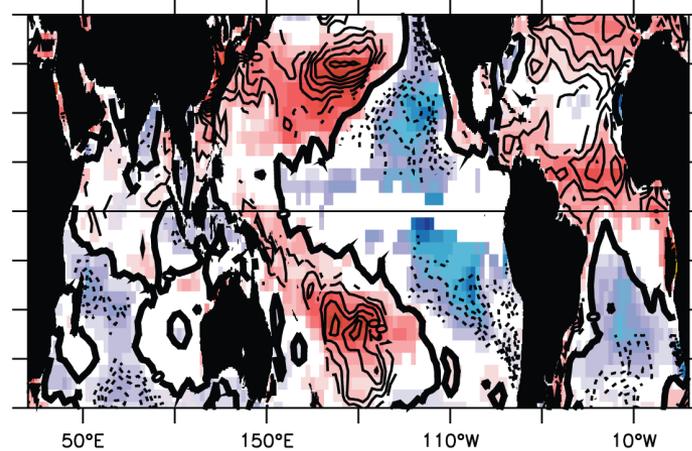
# Differences in vertical structure of $\Delta T$ lead to differences in $\Delta PI$ Largely from TTL and Upper Troposphere

NCEP

(a) NCEP-NCAR Reanalysis

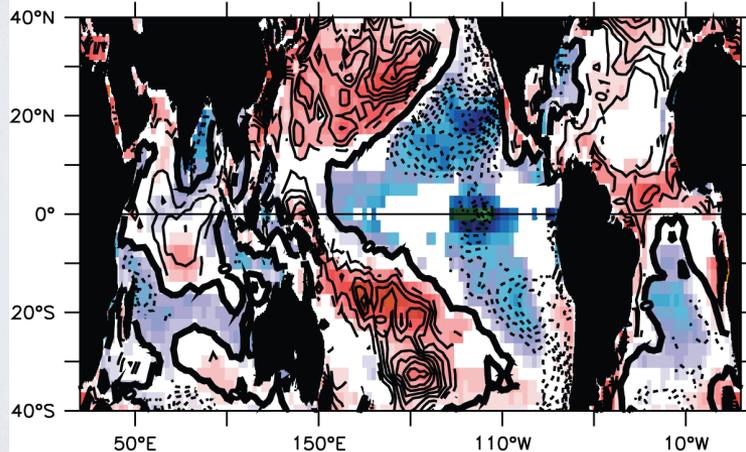


(b) HiRAM-C180

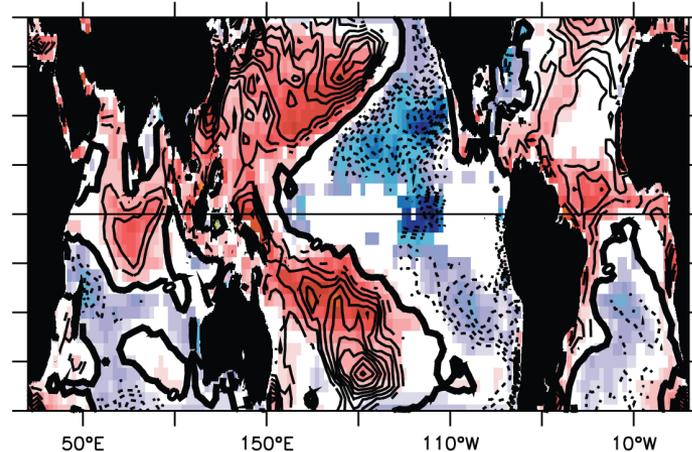


HiRAM  
(AGCM)

(c) NASA-MERRA Reanalysis

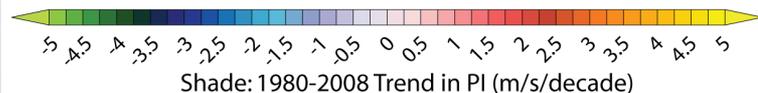


(d) NCEP-NCAR Reanalysis with tropical-mean  $T(p)$  trend from HiRAM-C180



NCEP with  
HiRAM trend

MERRA

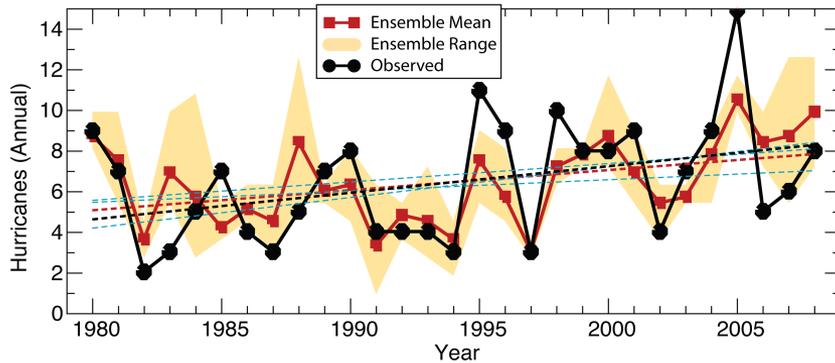


Contour: 1980-2008 Trend in Relative SST (K/decade)  
Values shaded/contoured if trend significant at  $p=0.1$ , two-sided

# Different TC downscaling studies assume/simulate different $\Delta T(p)$ in historical simulation: get similar correlation

## Atlantic Hurricanes (1980-2008): HiRAM-Simulated vs. Observed

Correlation: ens-mean = 0.69; Linear trends: +0.10 storms/yr (model ens mean)  
 ens-range = [0.47, 0.59] [+0.06, 0.15] storms/yr (model ens range) +0.13 storms/yr (observed).

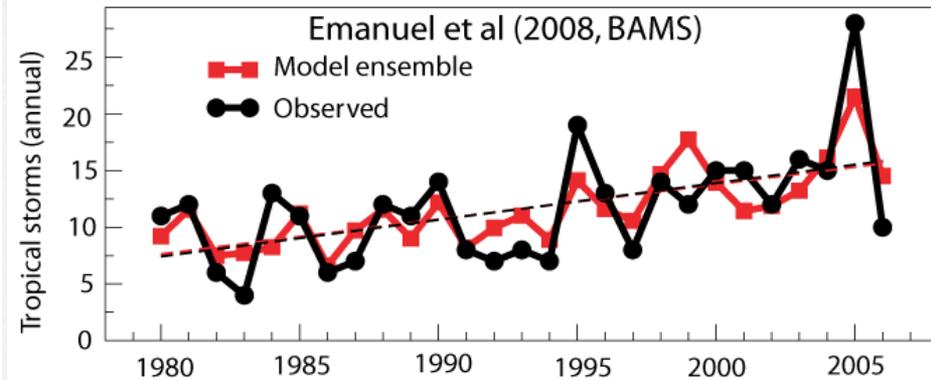
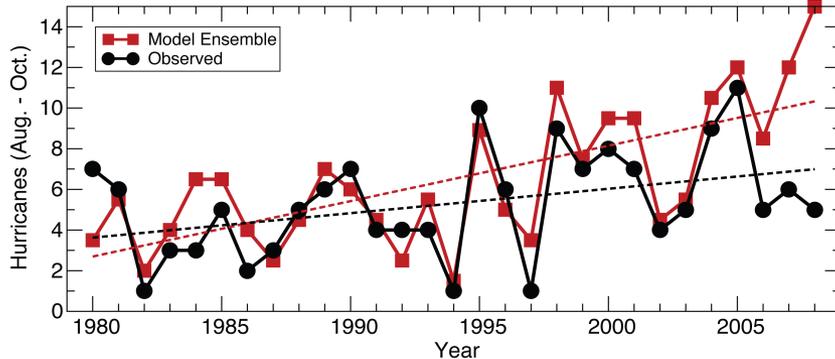


Simulates ~adiabatic warming

Use NCEP (assume UT/TTL cooling)

## Atlantic Hurricanes (1980-2008): ZETAC-Simulated vs. Observed

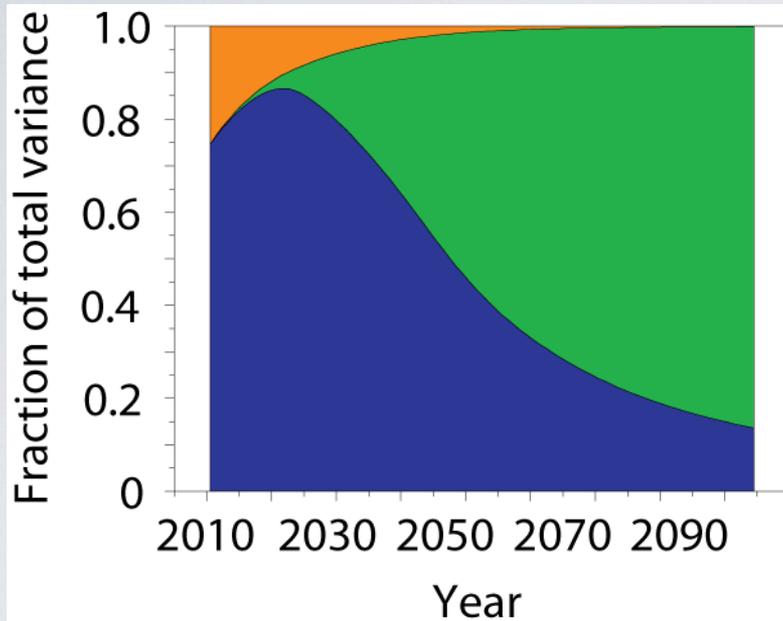
Correlation = 0.69; Linear trends: +0.27 storms/yr (model) and +0.12 storms/yr (observed).



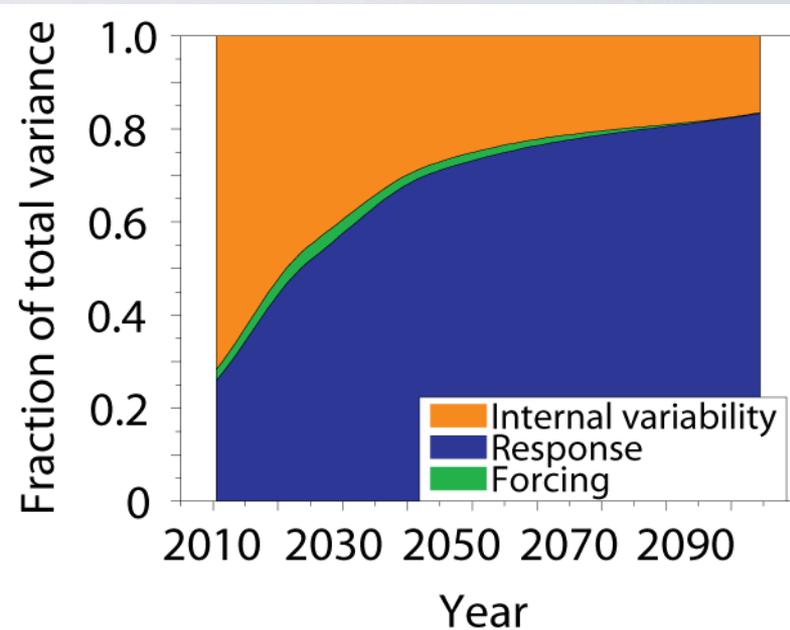
# Multi-year hurricane prediction

# Key uncertainty sources to projections of decadal TS activity

Tropical Atlantic SSTA



NA TS Frequency

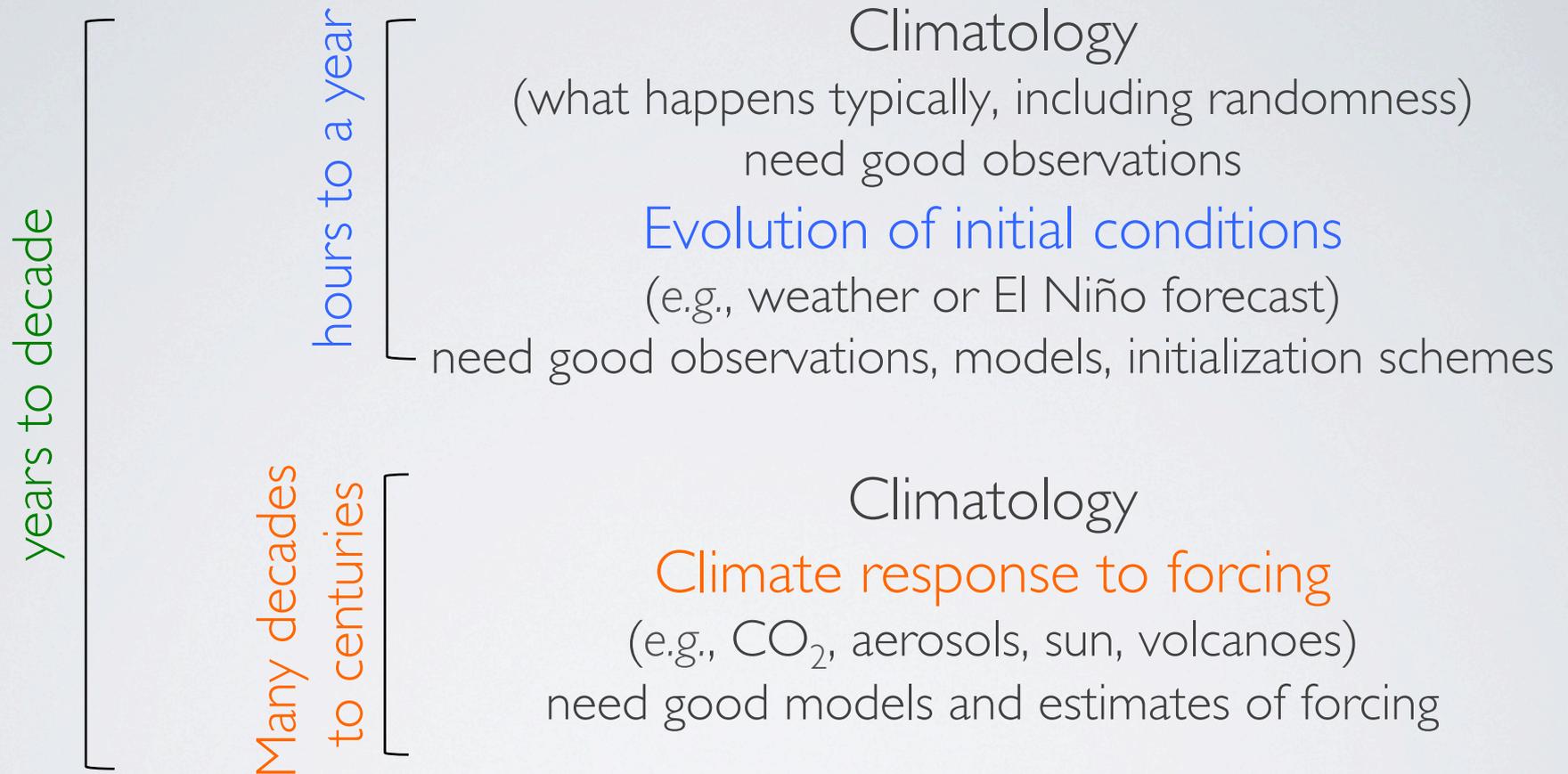


*Villarini et al. (2011), Villarini and Vecchi (2012)*

Sources of uncertainty (after Hawkins and Sutton, 2009)

- **Variability:** ~independent of radiative forcing changes
- **Response:** “how will climate respond to changing GHGs & Aerosols?”
- **Forcing:** “how will GHGs & Aerosols change in the future?”

# Sources of & Limitations on climate predictability



Decadal/multi-year prediction: New efforts focused mixed initial/boundary value problem

# Merge multiple tools and understanding to build experimental long-lead hurricane forecast system: skill from as early as October of year before

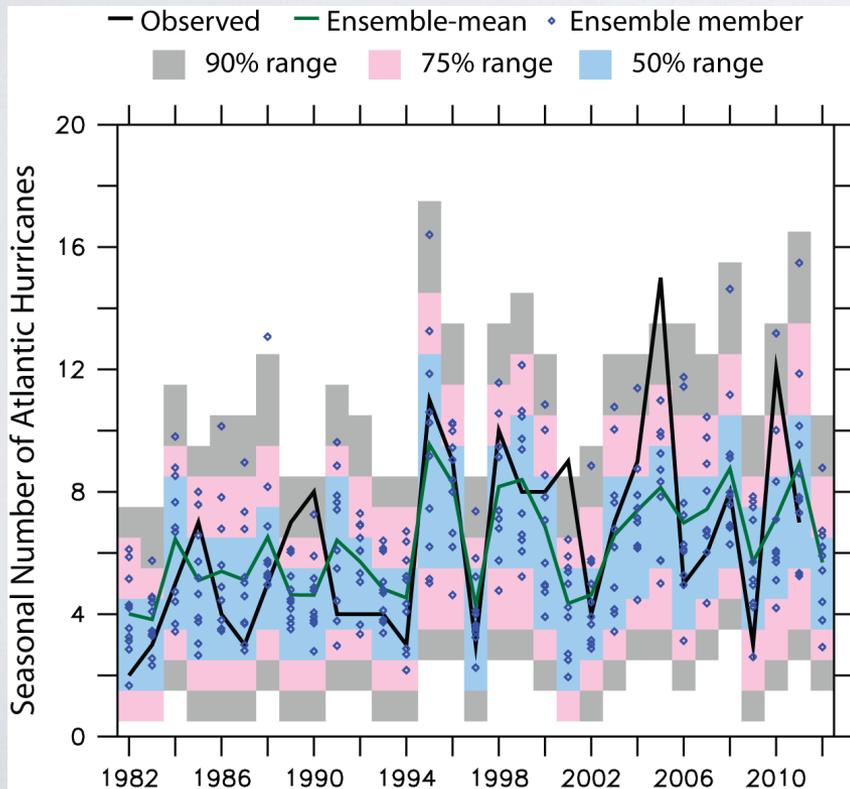
April & onward forecasts fed to NOAA Seasonal Outlook Team

Hi-Res AGCM in many different climates. Count storms.

Build statistical model of the response of hurricanes in HiRAM

Use initialized coupled model to forecast future values of SST

Initialized January:  $r=0.66$



Apply Stat model to Predicted SST

HyHuFS

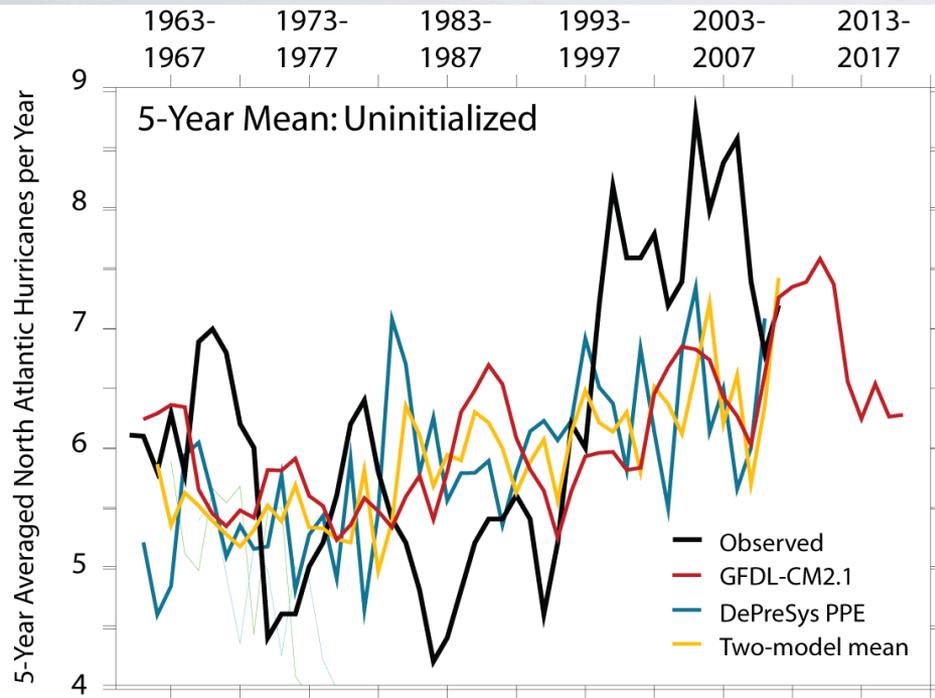
Make Prediction of Full PDF of Hurricane Activity

<http://gfdl.noaa.gov/HyHuFS>

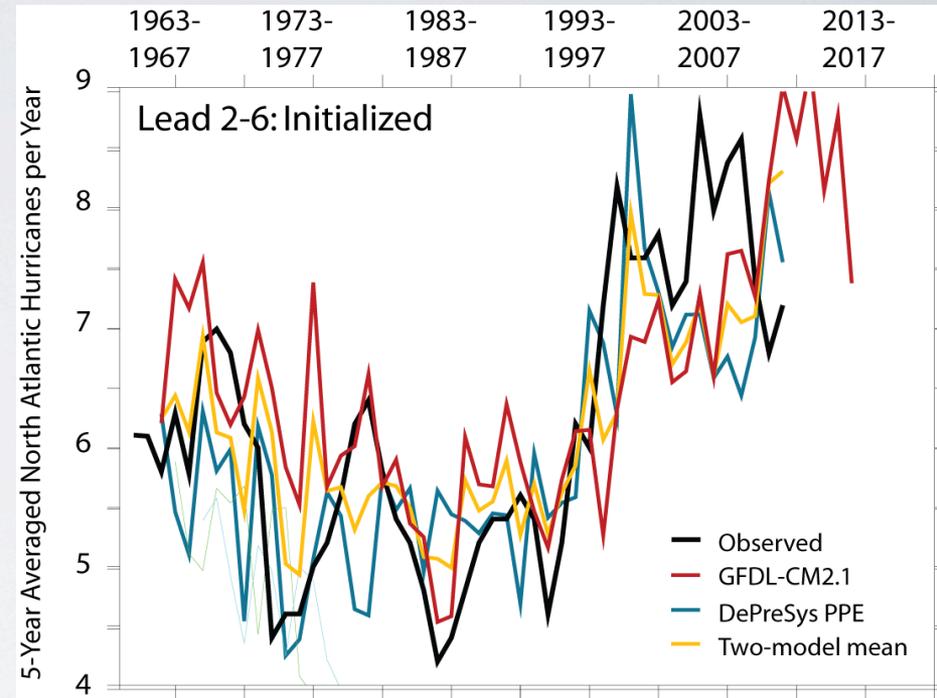
# Experimental decadal predictions

Hybrid system: statistical hurricanes, dynamical decadal climate forecasts

## FORCED



## FORCED & INITIALIZED



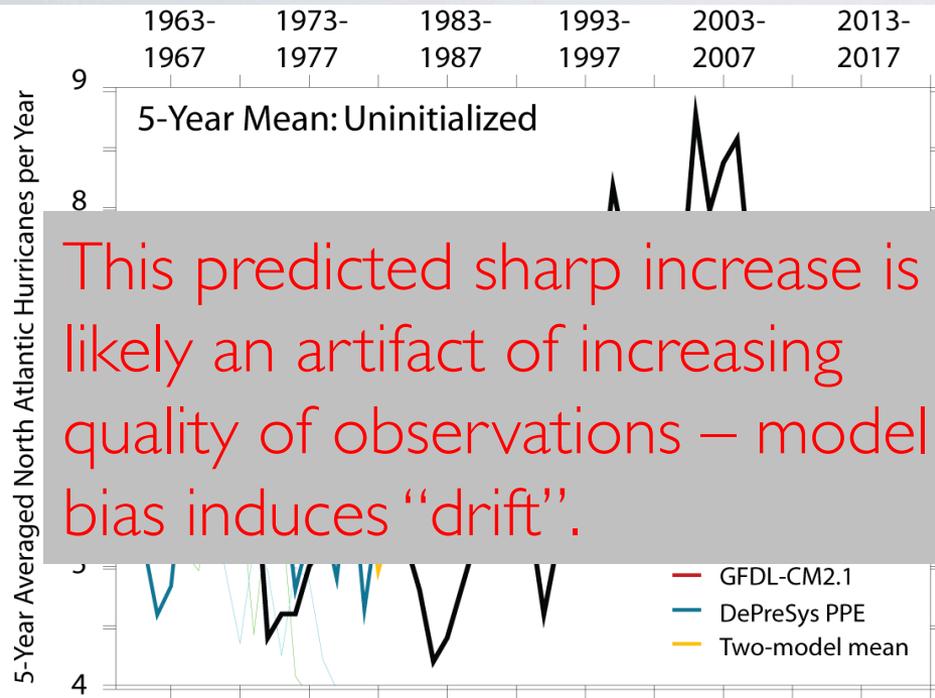
- Retrospective predictions encouraging.
- However, small sample size limits confidence
- Skill arises more from recognizing 1994-1995 shift than actually predicting it.
- This is for basinwide North Atlantic Hurricane frequency only.

**EXPERIMENTAL: NOT OFFICIAL FORECAST**

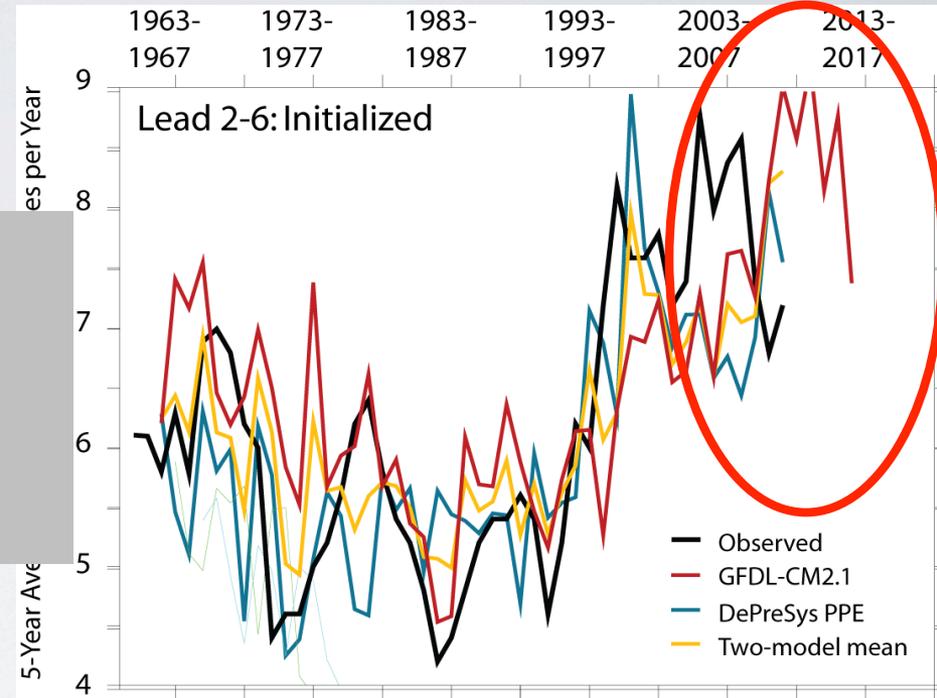
# Experimental decadal predictions

Hybrid system: statistical hurricanes, dynamical decadal climate forecasts

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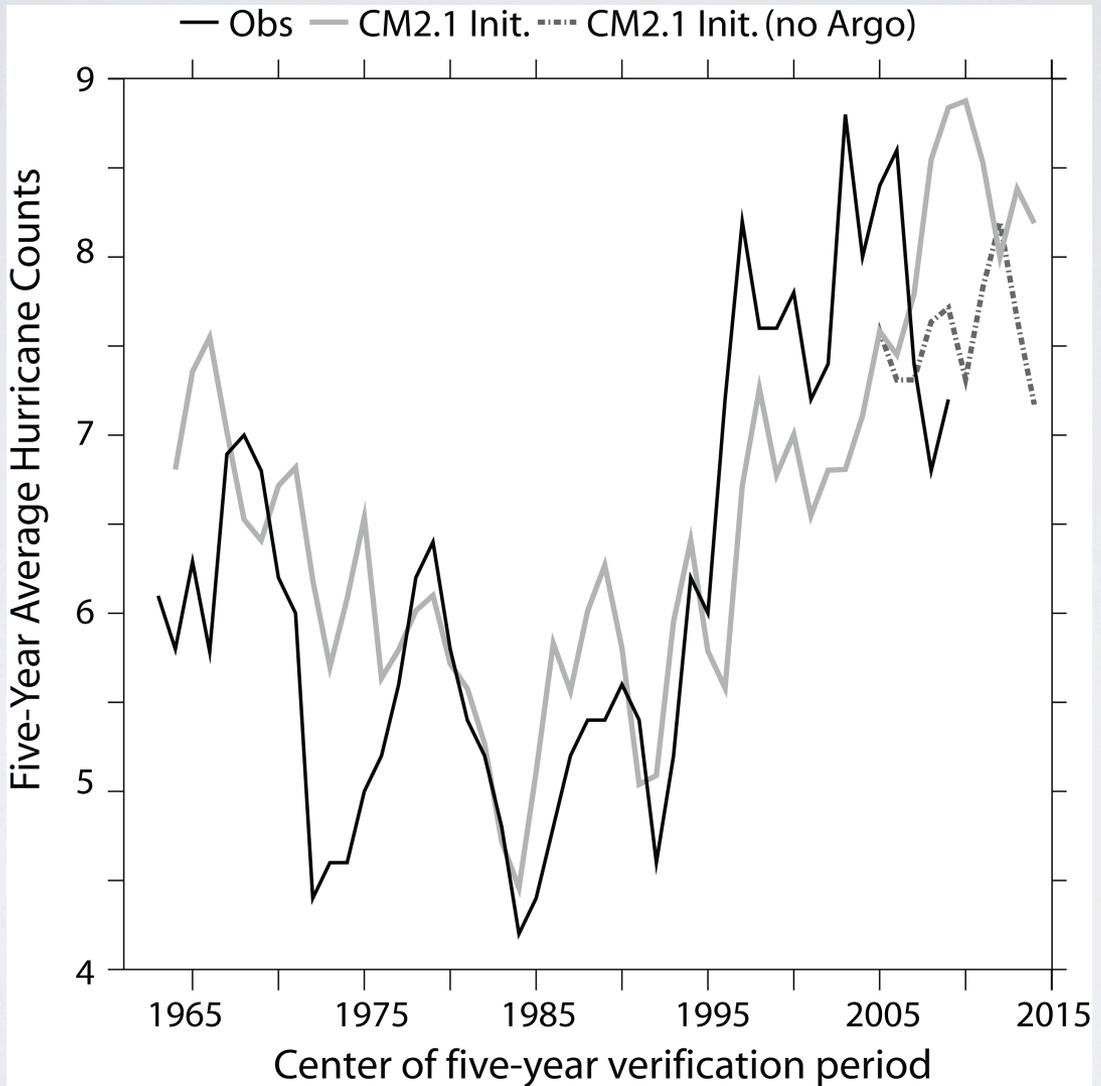
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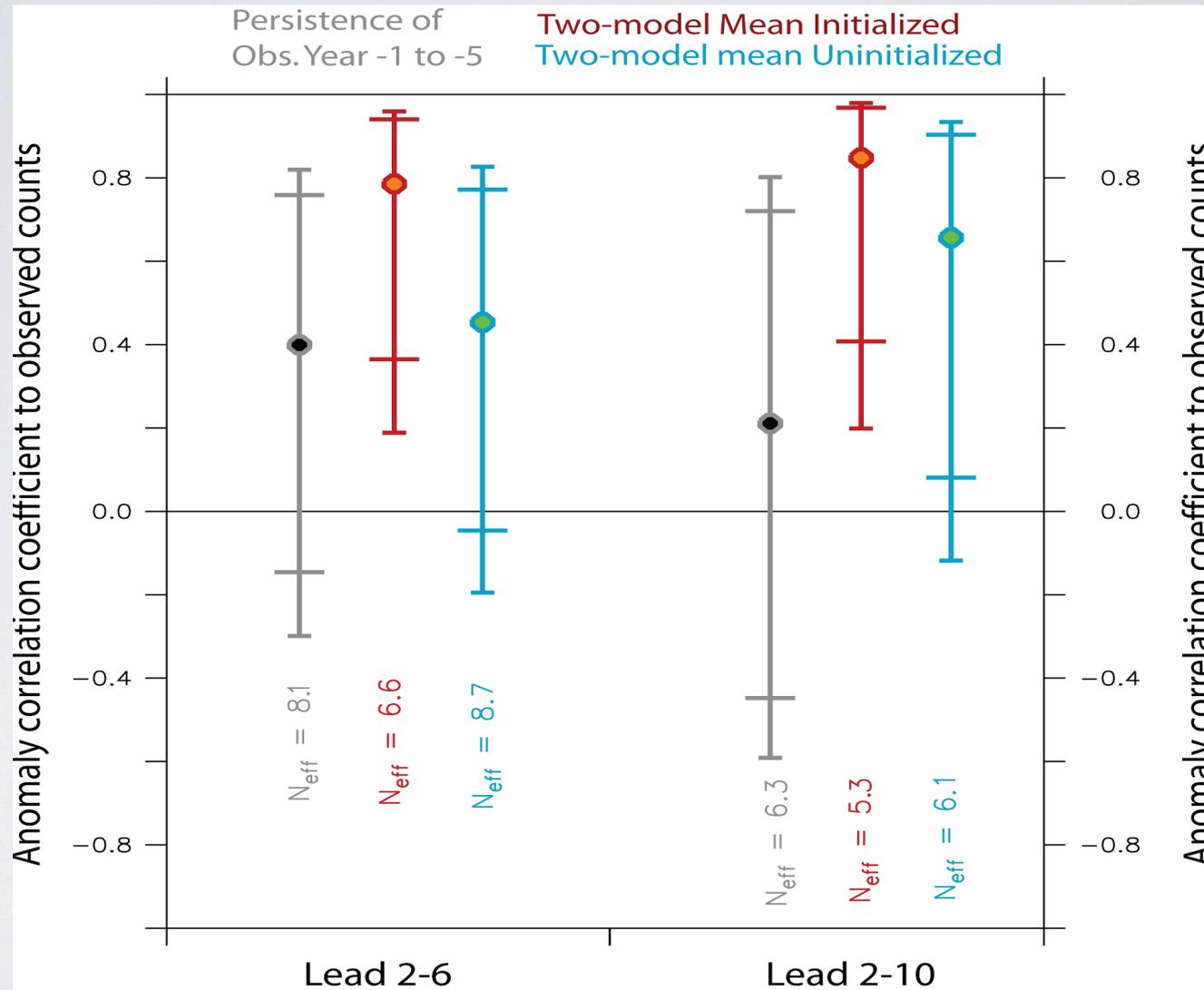
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# Removing observational inhomogeneity removes post-2004 upswing: need stable, sustained observations



# Experimental decadal predictions

Hybrid system: statistical hurricanes, dynamical decadal climate forecasts



# Summary

- Premature to conclude we have seen hurricane change due to CO<sub>2</sub>
- Models allow estimates of future activity – pattern of SST change key:
  - Next couple of decades: internal variability dominant player  
(some may be predictable, some not)
  - NA Hurr. Response to CO<sub>2</sub>: maybe fewer, probably stronger.
  - Aerosol forcing and response a key to next few decades.
  - Uncertainty in past and future changes in T(p) impacts interpretation of past, and perhaps TC prediction.
- Encouraging results from long-lead (multi-season and multi-year) experimental forecasts using hybrid system:

*“past performance no guarantee of future returns”  
but good past performance nice start...*
- High-resolution coupled and atmospheric models enable the next generation of hurricane prediction and projection.

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