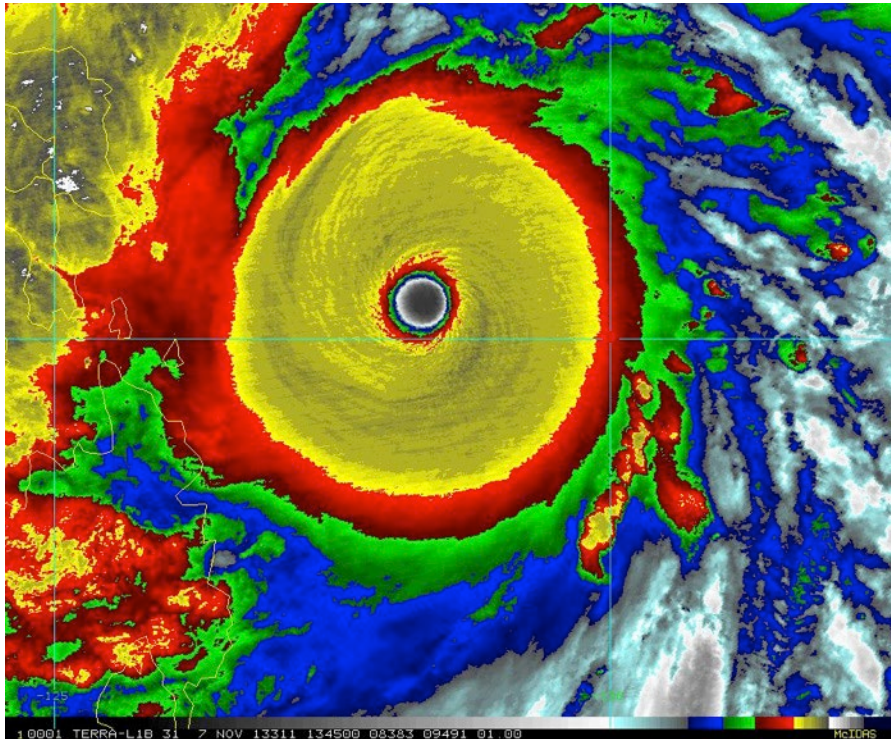


Assessing Climate Change in the Tropics



Super Typhoon Haiyan, 2013

Tom Knutson

NOAA/GFDL

Climate Impacts and Extremes Group

Princeton, New Jersey

November 2014

Collaborators (partial listing):

Andrew Wittenberg,
Fanrong Zeng, Joe Sirutis,
Ming Zhao, Gabe Vecchi,
Morris Bender, Bob Tuleya

Figure Credits: John Dunne,
Andrew Wittenberg

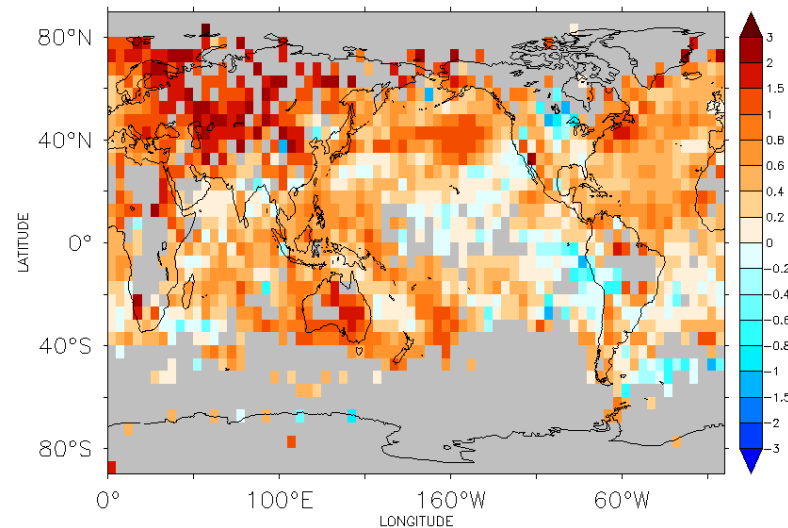
Main Points – with Recent GFDL Work as Examples

1. Anthropogenic climate change is affecting tropical climate (detection/attribution)
 - Especially evident in century scale surface temperature trends and recent extremes (examples)
2. Tropical cyclones and climate change – impact not as clear
 - Anthropogenic influence on tropical cyclones (hurricanes, typhoons, etc.) is difficult to detect.
 - Projections for late 21st century include increased intensity (~4%); decreased overall frequency (-16%); increased rain rates (+14%); sea level rise
3. ENSO and climate change: difficult to detect or project anthro. changes due to likely large internal variability fluctuations of amplitude, etc.
4. Heat stress increases – tropical temperatures are ‘expanding’ poleward

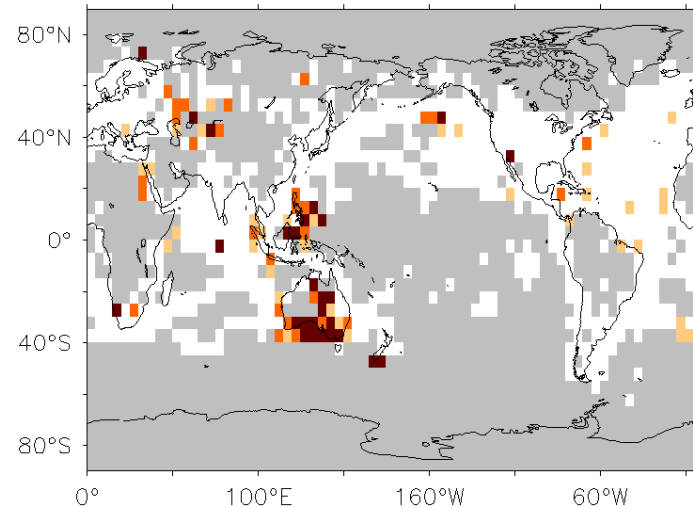
Explaining Extreme Events from a Climate Perspective...

Surface temperature: annual-mean extremes for 2013

Annual 2013 anomalies



Annual means: 2013 extremes

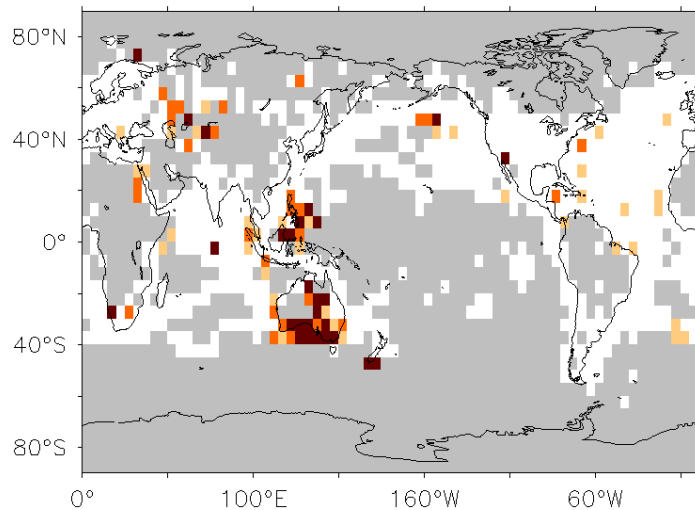


Map Legend:
(and percent
coverage by
category)

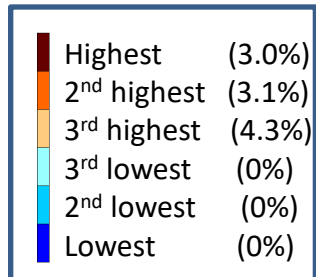
Highest	(3.0%)
2 nd highest	(3.1%)
3 rd highest	(4.3%)
3 rd lowest	(0%)
2 nd lowest	(0%)
Lowest	(0%)

Surface temperature annual-mean extremes for 2013: historical context

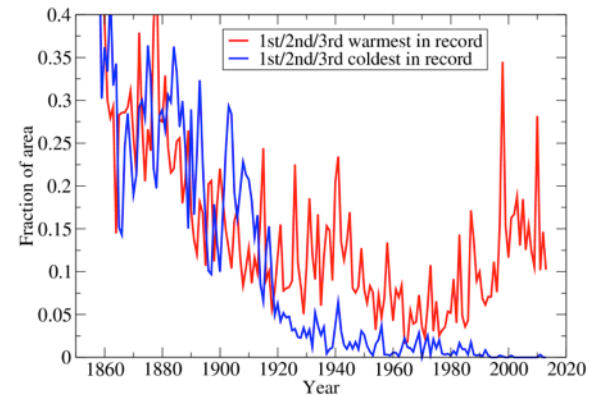
Annual mean surface temperature: 2013 extremes



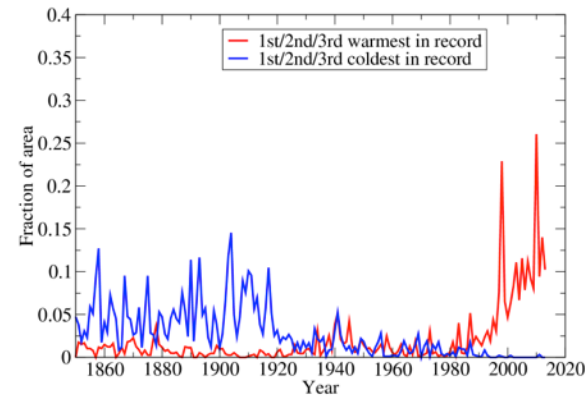
Map Legend:
(and percent coverage by category)



Area with warm vs cold annual-mean extremes (record to date)



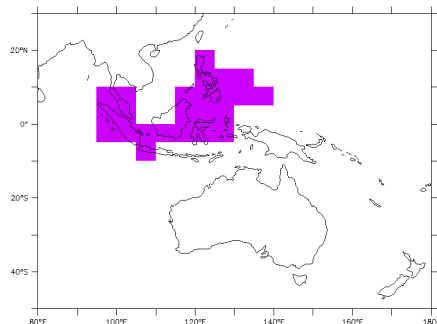
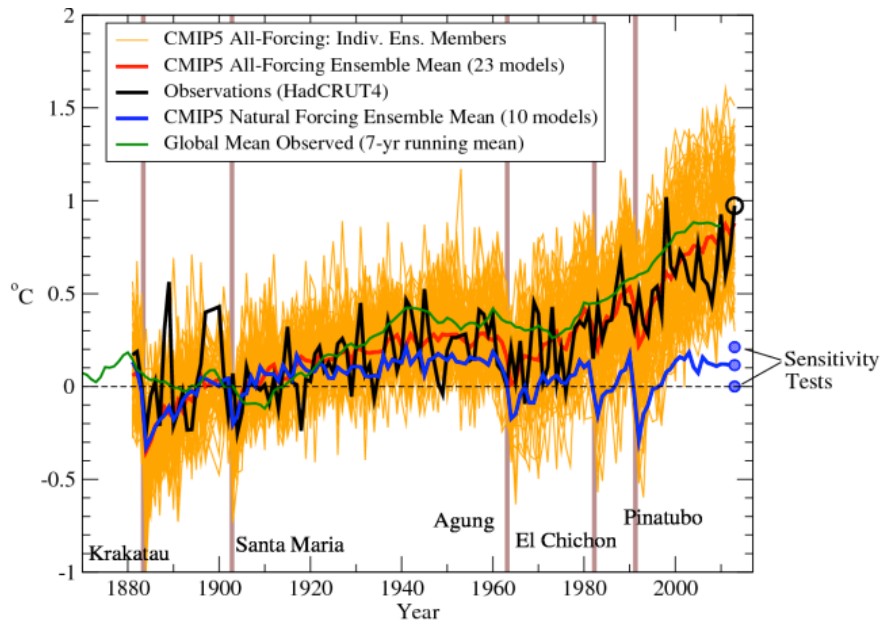
Area with warm vs cold annual-mean extremes (full record)



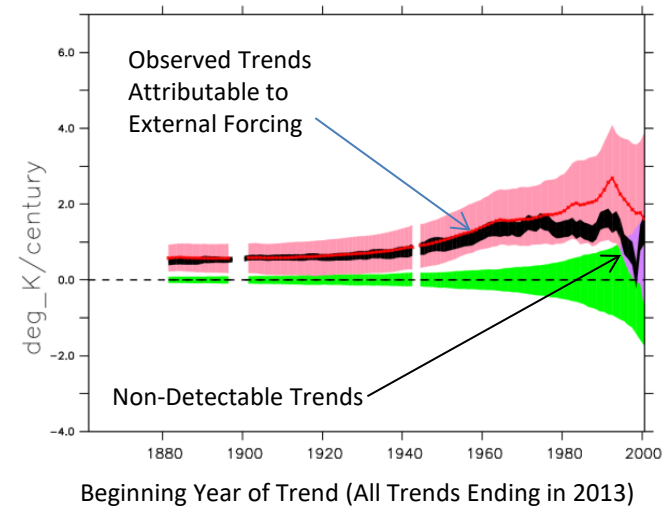
Source: Knutson, Zeng, and Wittenberg, *BAMS*, accepted (2014)

Western Pacific/Indonesia Region:

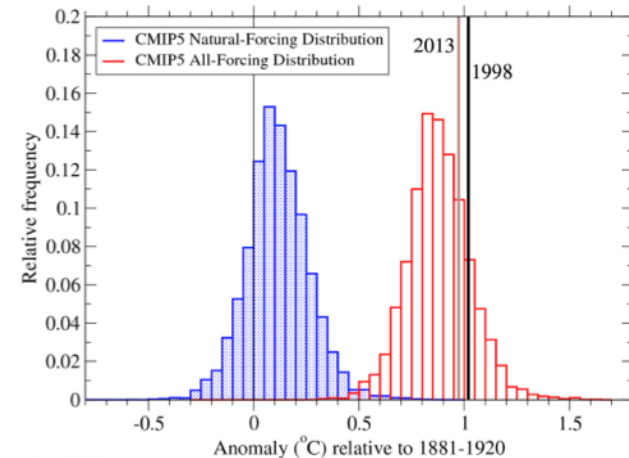
Annual Temperatures



Sliding Trend Analysis

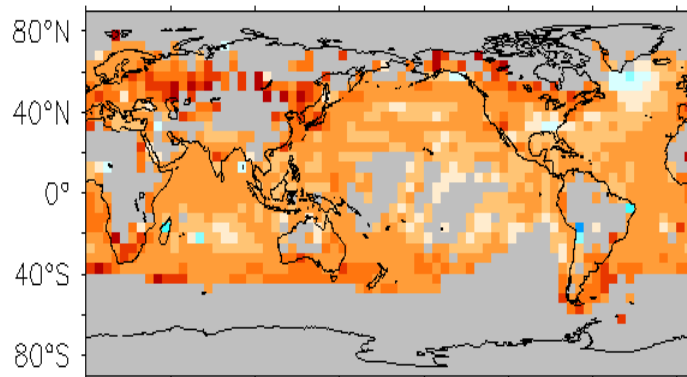


Attributable Risk Analysis

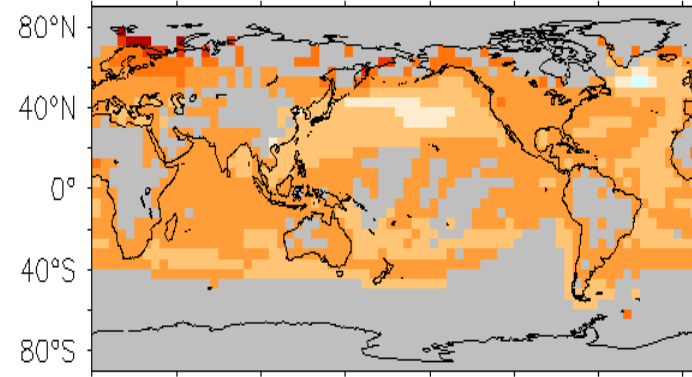


1901-2010 Surface Temperature Trend Assessment

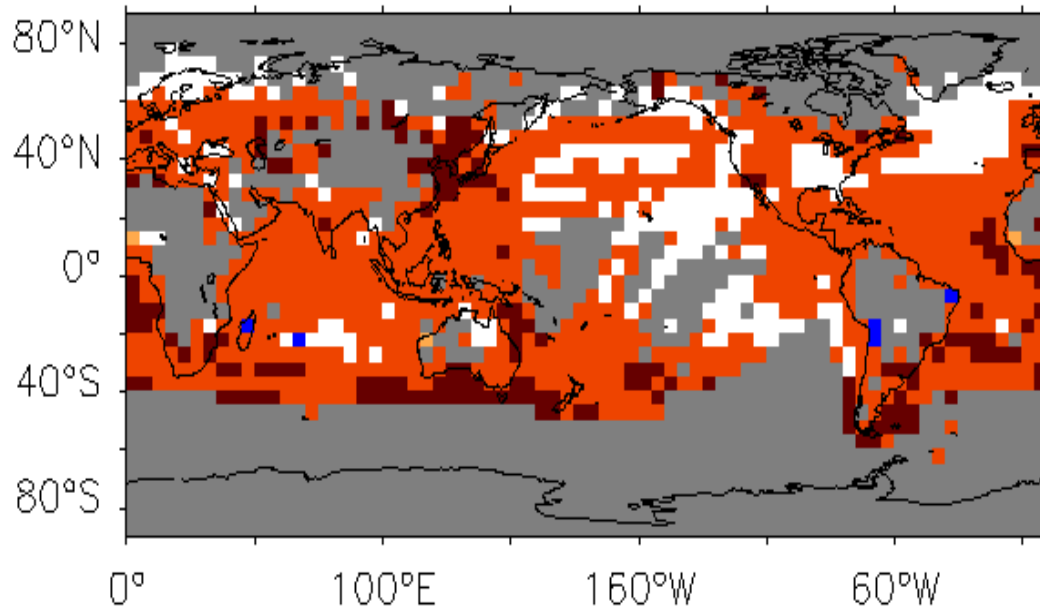
Observed trend (HadCRUT4)



CMIP5 All-Forcing ensemble trend



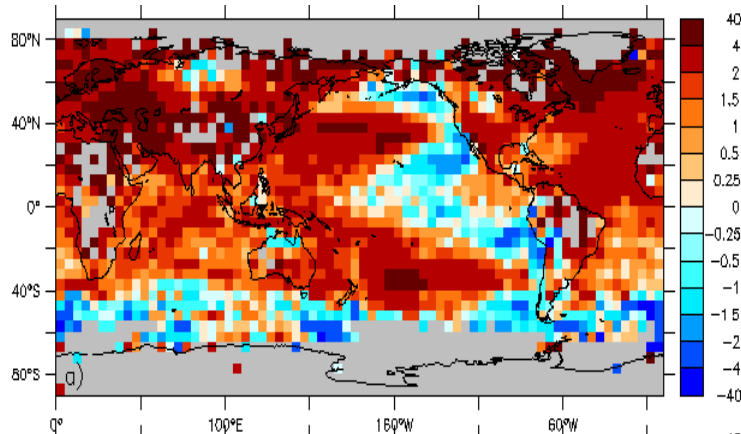
CMIP5 All-Forcing vs. Natural-Forcing assessment



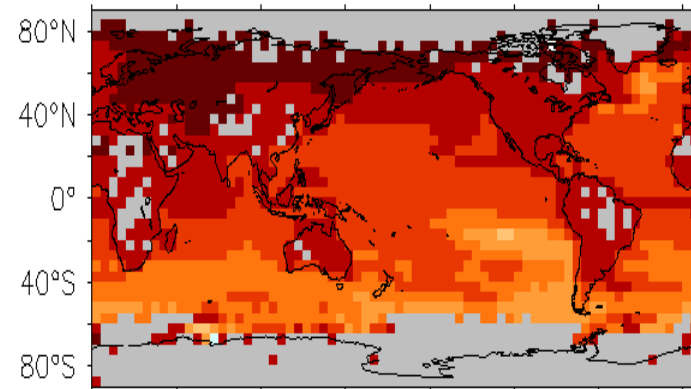
- Attrib. anthro. warming, but > simulated
- Attrib. & consistent anthro. warming
- Detectable warming: < simulated
- No detectable trend
- Detectable cooling: < simulated
- Attributable anthropogenic cooling
- Detectable cooling: > simulated

1981-2010 Surface Temperature Trend Assessment*

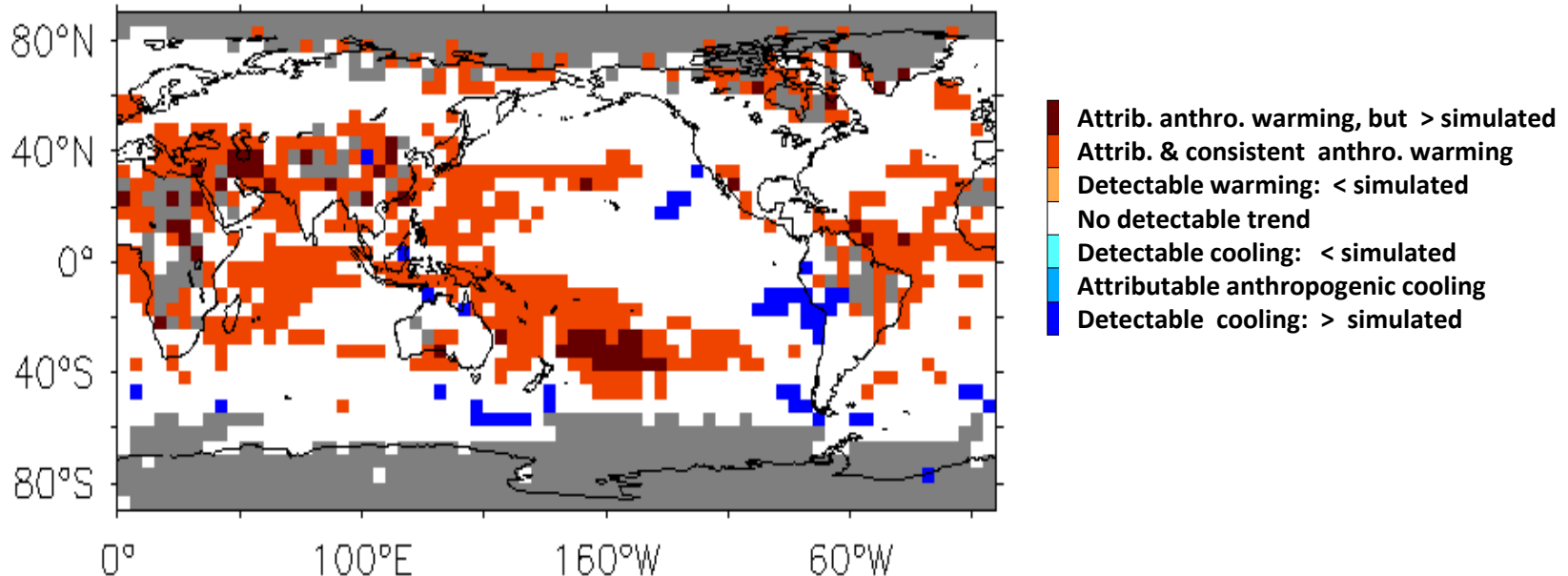
Observed trend (HadCRUT4)



CMIP5 All-Forcing ensemble trend



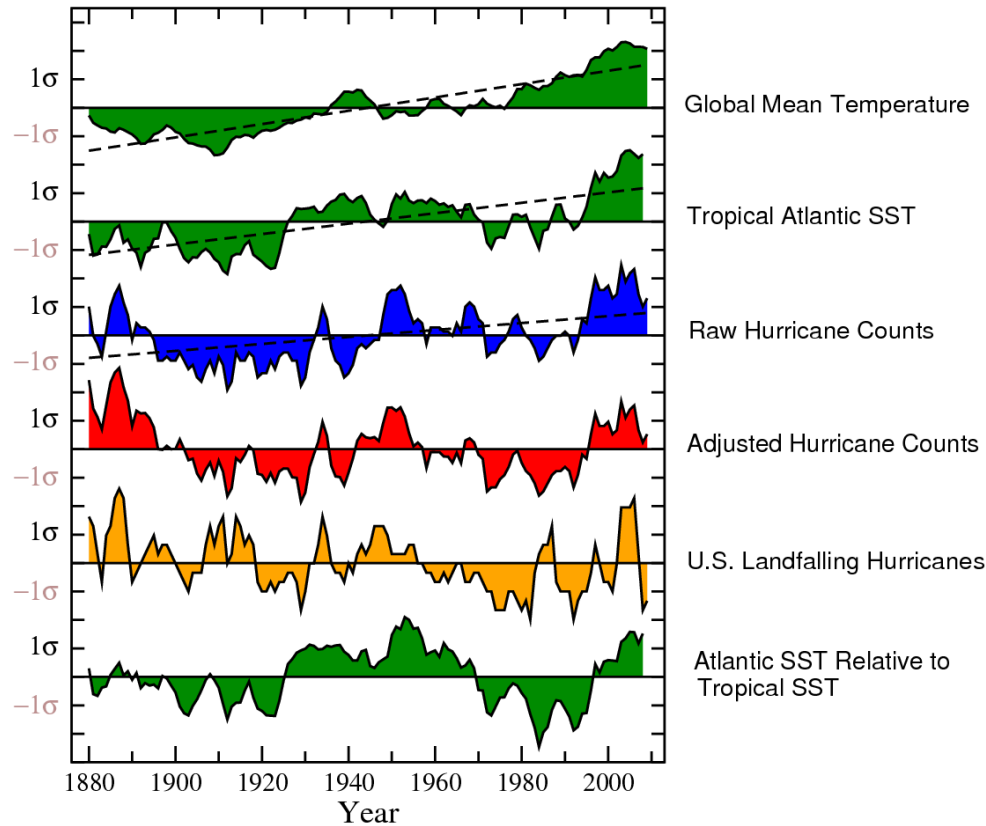
CMIP5 All-Forcing vs. Natural-Forcing assessment



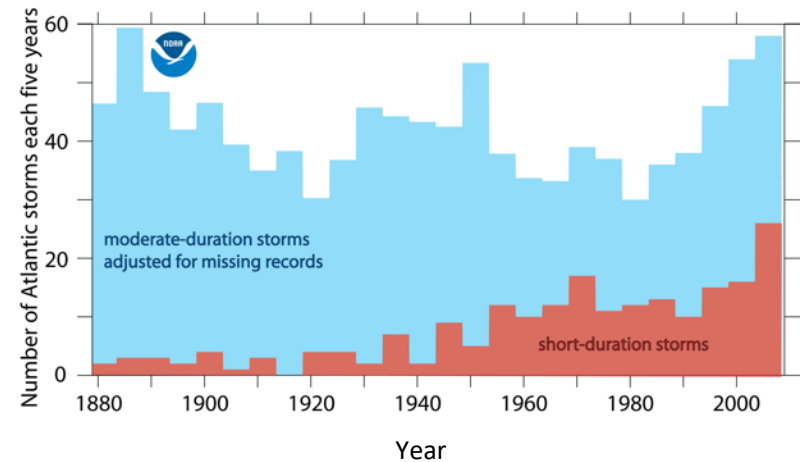
Source: Knutson, Zeng, and Wittenberg, *J. Climate* (2013)

Low confidence in long-term (centennial-scale) changes in TCs

Normalized Tropical Atlantic Indices

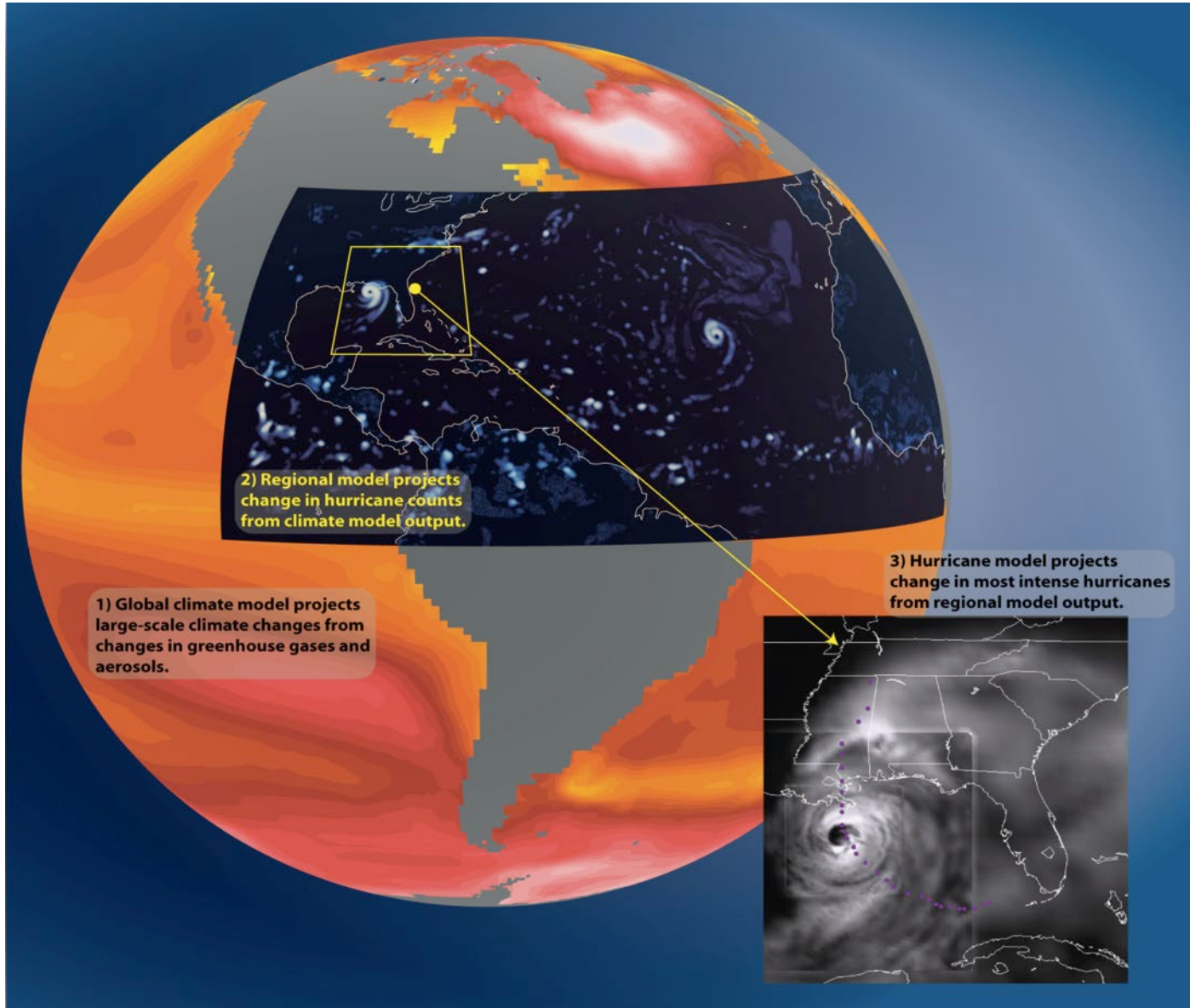


Moderate-duration tropical storms do not show a trend.



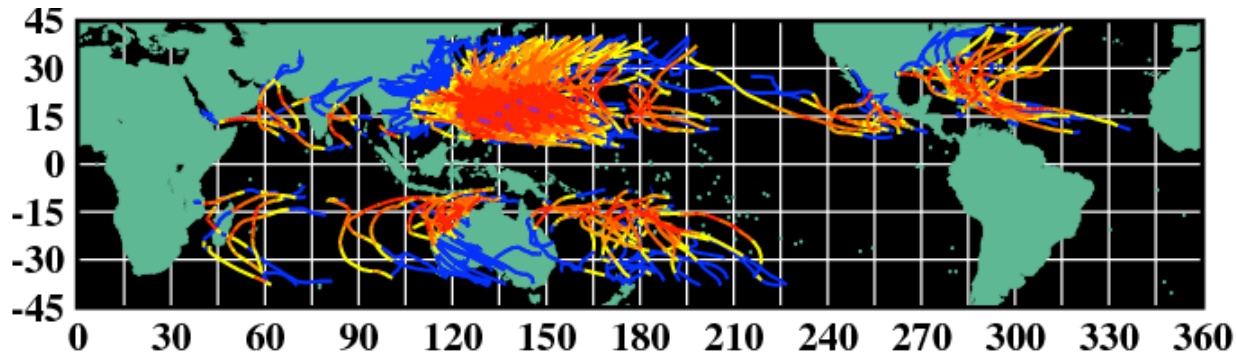
Sources: Vecchi and Knutson, *J. Climate* (2011); Landsea, Vecchi, Bengtsson, Knutson. *J. Climate* (2010).

A “double-downscaling” approach for modeling the frequency of intense Atlantic hurricanes.



Simulating intense (Category 4&5) hurricanes for present-day and late 21st century

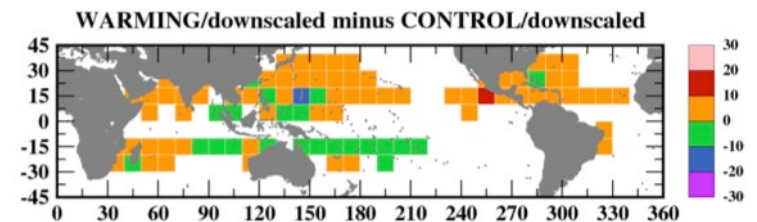
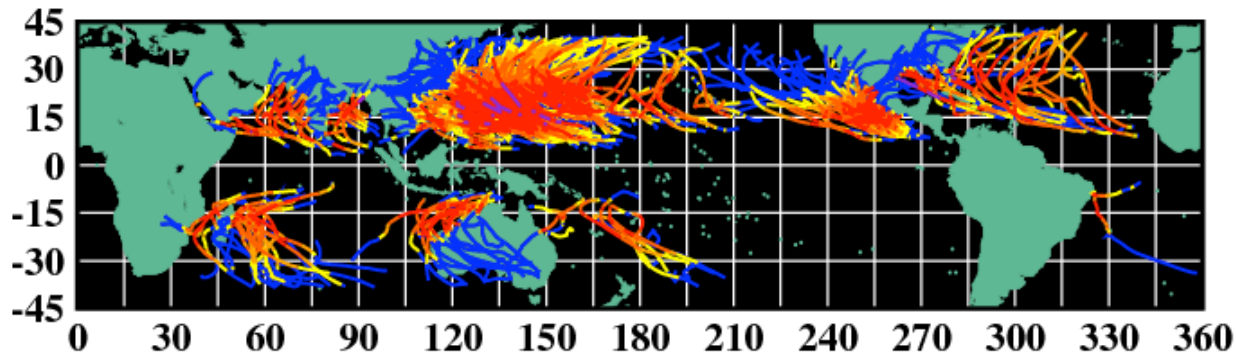
a) Present-Day Simulation: 244 Cat 4-5 storms



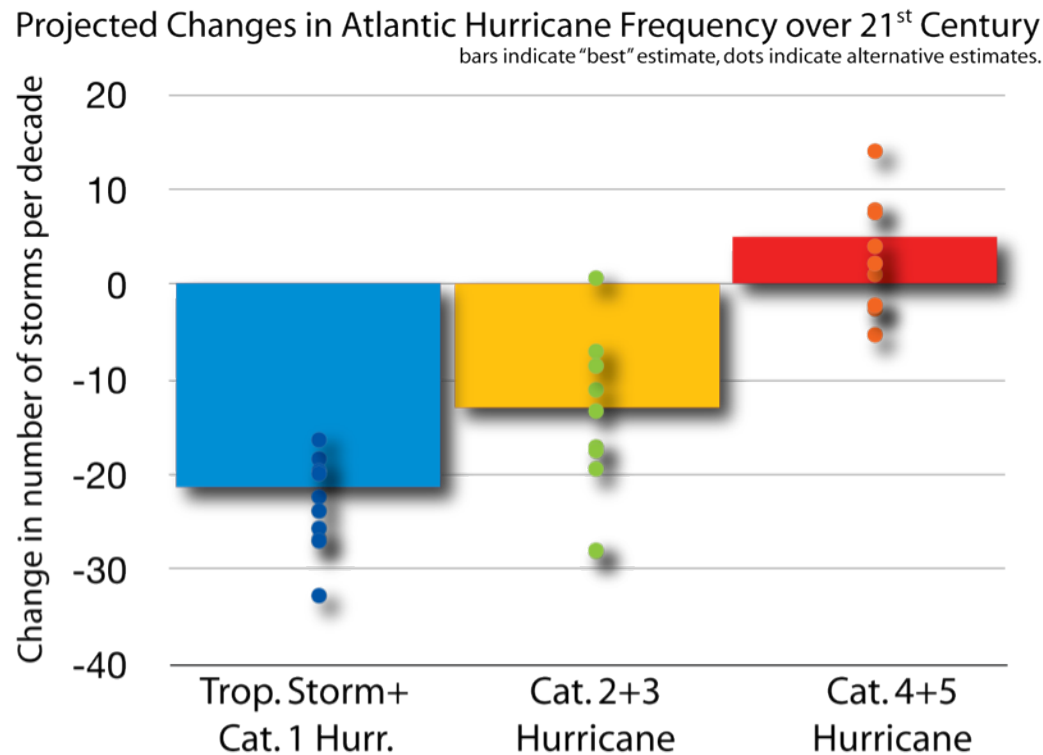
Storm Category



b) RCP4.5 Late 21st Century: 313 Cat 4-5 storms



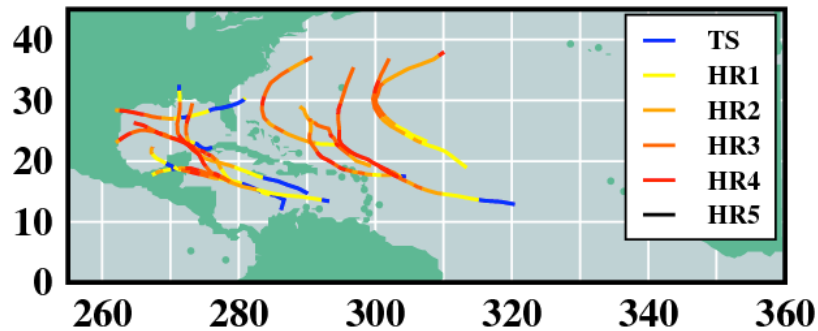
Summary of Atlantic Tropical Cyclone Projections over the 21st Century



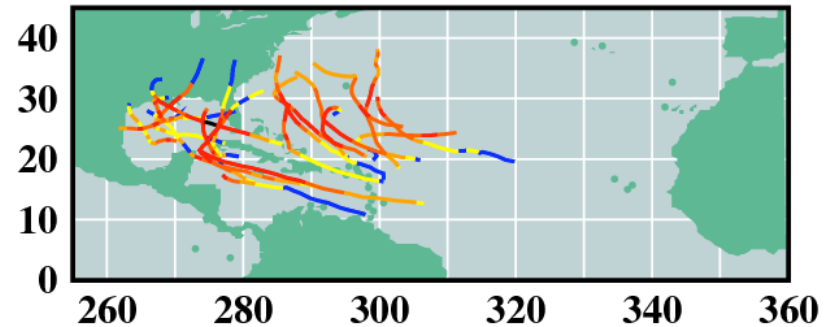
Adapted from Knutson et al. (2013, J. Clim.). See also: Knutson et al. (2009), Zhao et al. (2009), Bender et al. (2010), Villarini et al. (2011), Villarini and Vecchi (2012, 2013)

GFDL Hurricane Model: Category 4 & 5 Hurricane Tracks (27 simulation years)

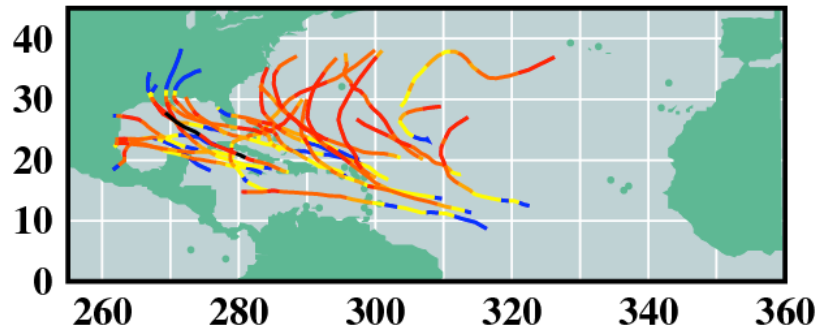
Present-Day (1980-2006): 14 storms



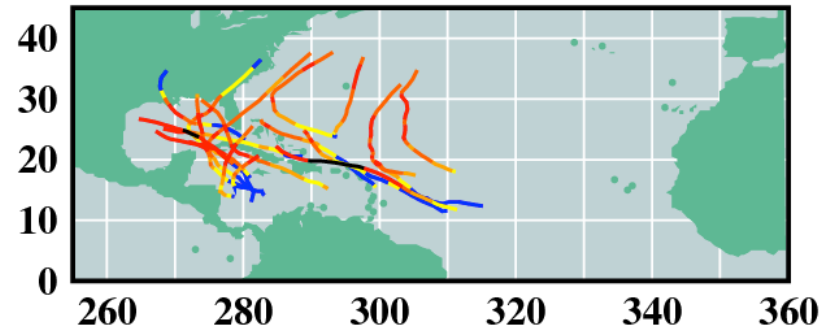
CMIP5 (Early 21st Century): 20 storms



CMIP3 (Late 21st Century): 28 storms

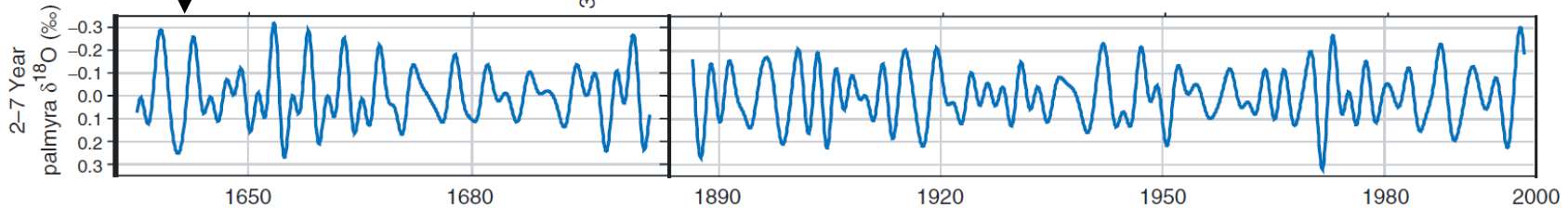
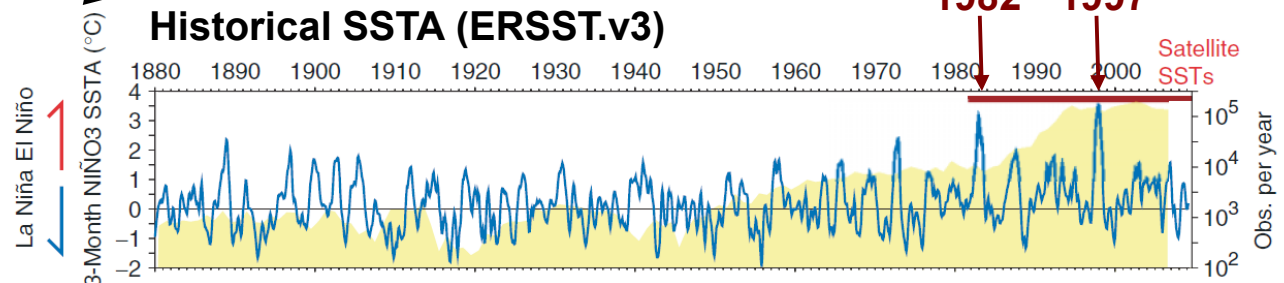
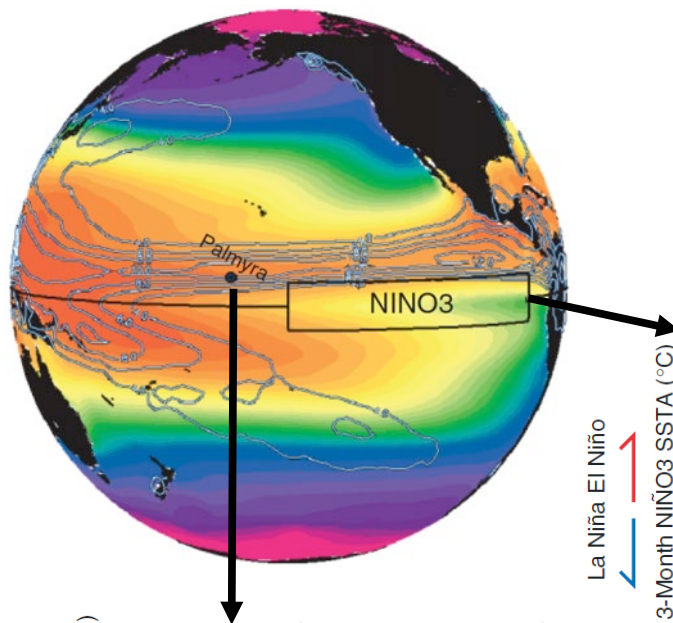


CMIP5 (Late 21st Century): 19 storms

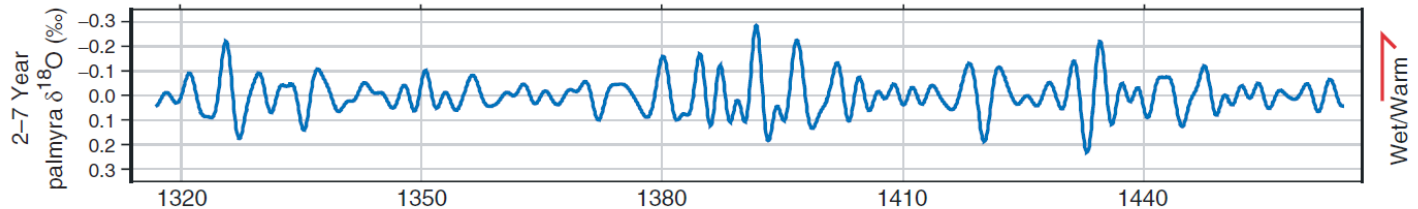


Both historical & paleo records suggest past modulation of ENSO

Vecchi & Wittenberg (WIREsCC 2010)

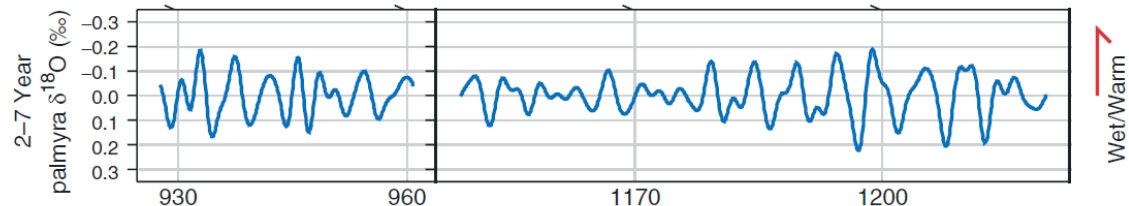


Palmyra corals
(Cobb et al.,
Nature 2003)



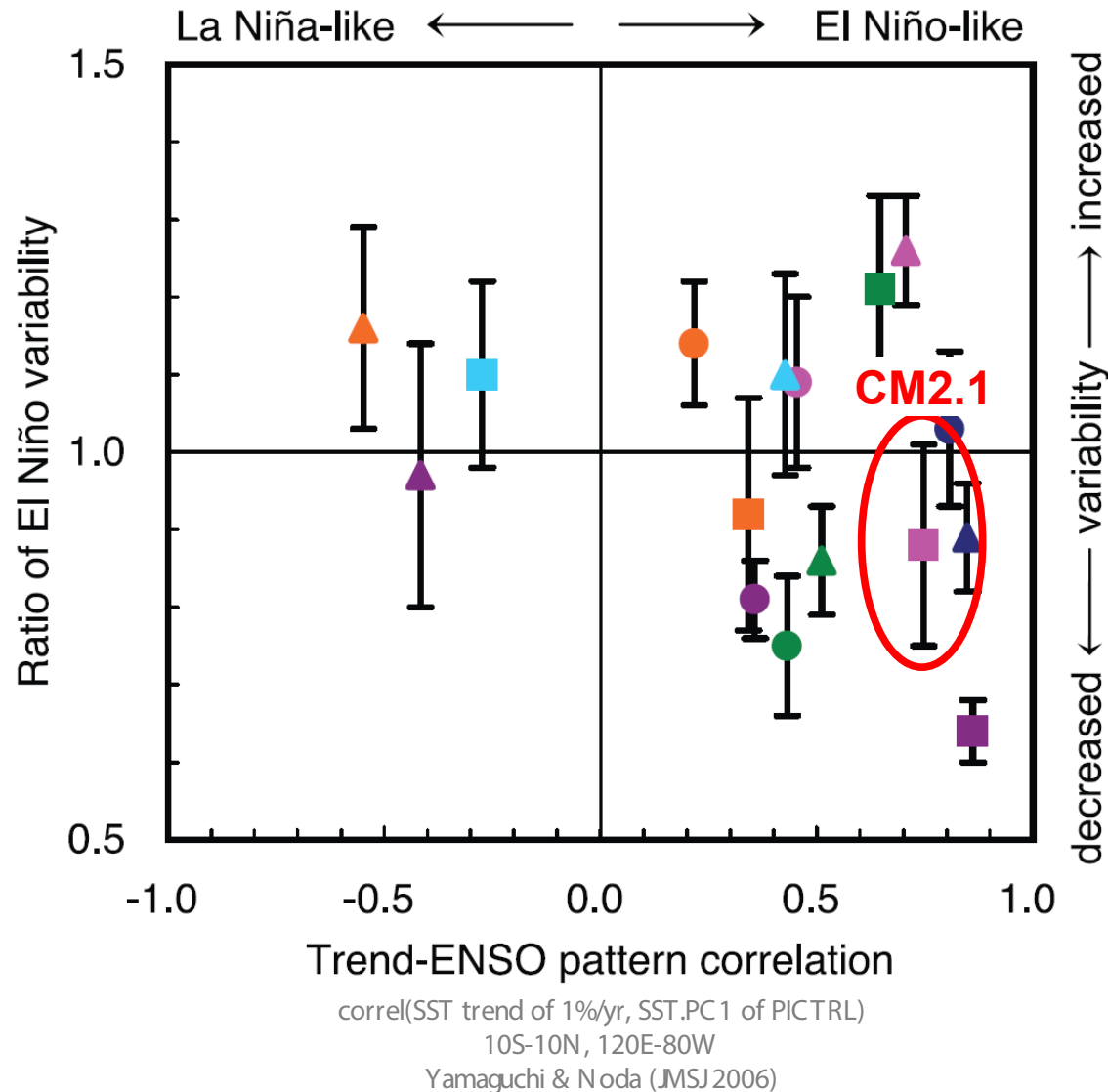
Multiproxy reconstructions:

e.g. Li et al. (NCC 2011);
Emile-Geay et al.
(J. Climate, 2013ab);
McGregor et al. (subm.)



ENSO has existed for thousands, perhaps millions, of years.
Obscures detection of slower climate changes (decadal, global warming).

Projected ENSO changes (CMIP3/AR4)



Weak/ambiguous
near-term
anthropogenic
impacts on ENSO

Intrinsic
modulation

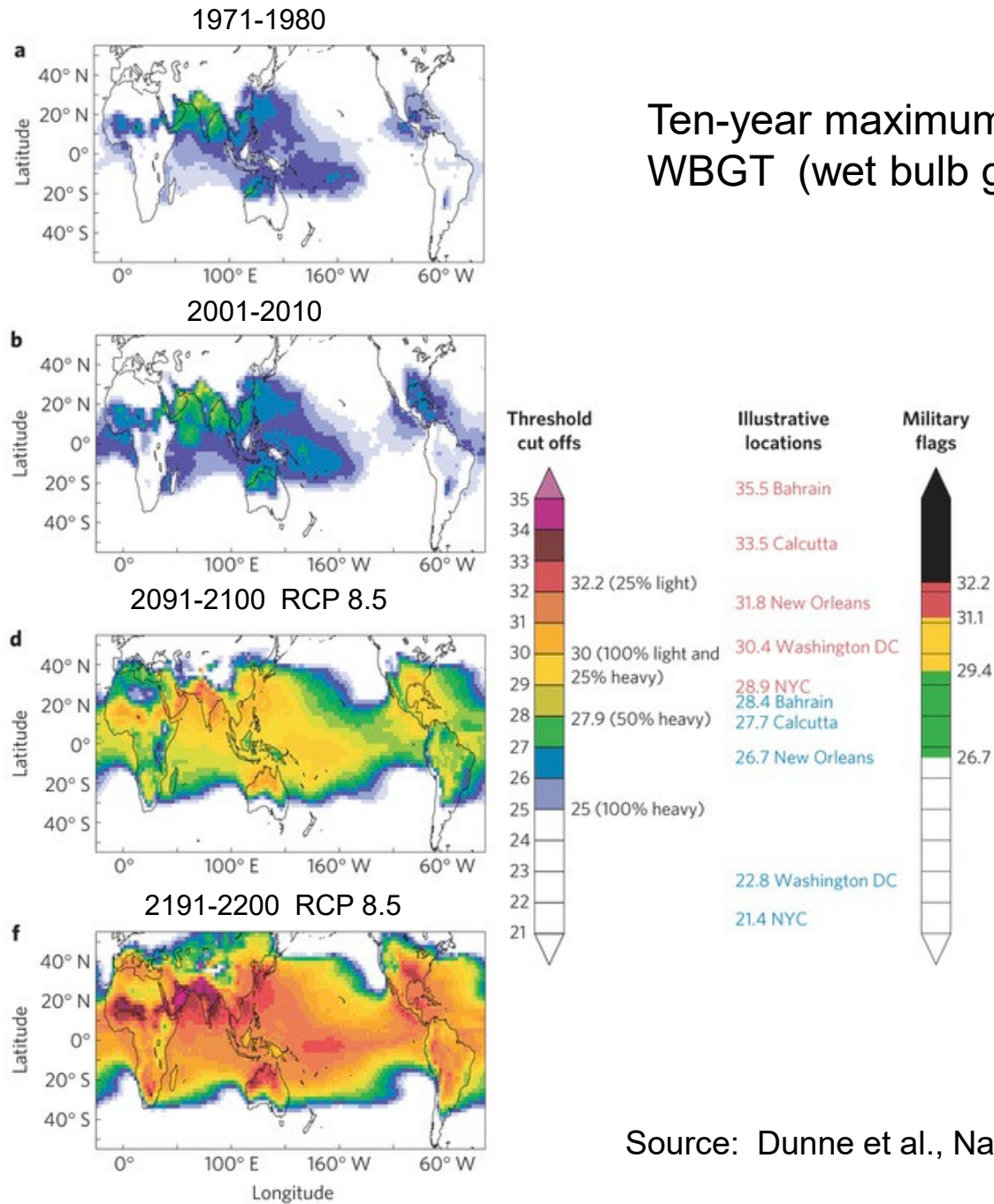
Reviews:

Meehl et al.
(IPCC-AR4 2007)

Guilyardi et al.
(BAMS 2009)

Vecchi & Wittenberg
(WIREs CC 2010)

Collins et al.
(Nature Geosci. 2010)



Ten-year maximum monthly mean
WBGT (wet bulb globe temperature)

Source: Dunne et al., Nature Geoscience, 2013.

Main Points – with Recent GFDL Work as Examples

1. Anthropogenic climate change is affecting tropical climate (detection/attribution)
 - Especially evident in century scale surface temperature trends and recent extremes (examples)
2. Tropical cyclones and climate change – impact not as clear
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4. Heat stress increases – tropical temperatures are ‘expanding’ poleward

IPCC AR5 Summary for Policymakers (Sept. 2013)

[Statements related to TCs and climate change]

Phenomenon:

- Increase in intense tropical cyclone activity

Assessment that changes occurred:

- Low confidence in long-term (centennial) changes
- Virtually certain in North Atlantic since 1970

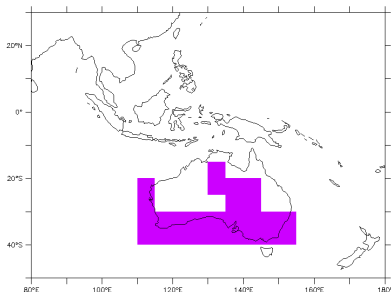
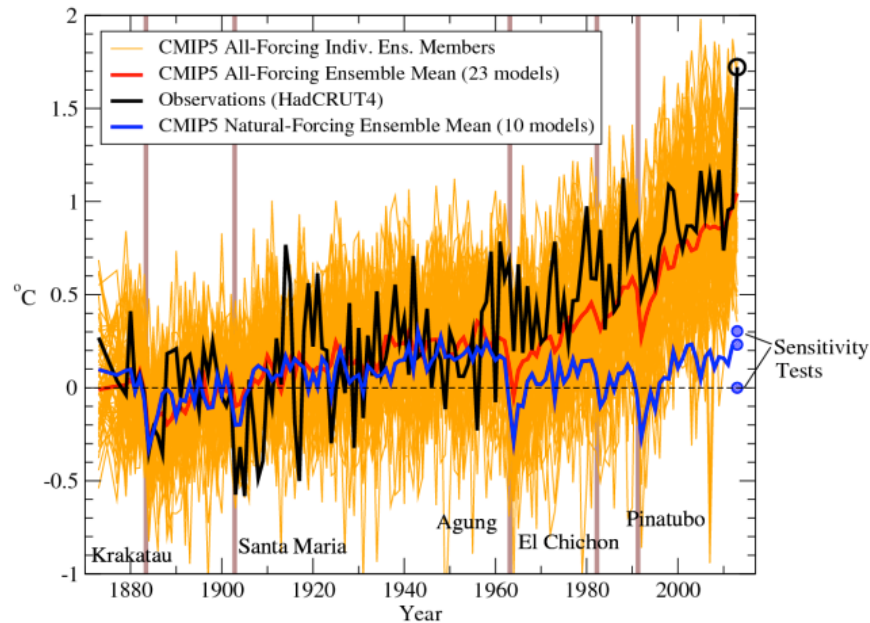
Assessment of a human contribution to observed changes:

- Low confidence
- “There is medium confidence that a reduction in aerosol forcing over the North Atlantic has contributed at least in part in the observed increase in tropical cyclone activity since the 1970s in this region.”

Likelihood of further changes (late 21st century):

- More likely than not (Western North Pacific and N. Atlantic)

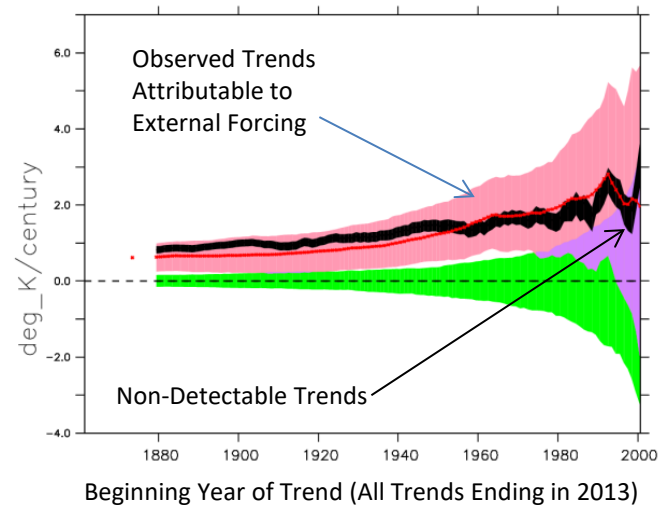
Australia Region: Annual Temperatures



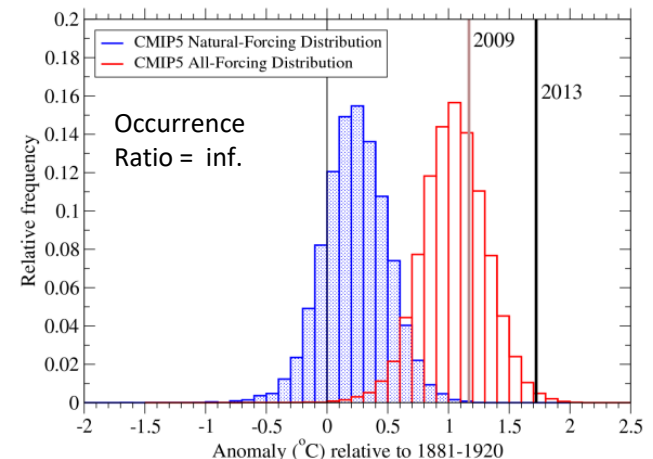
$$\text{Ratio} = \frac{p_{\text{ALL}}}{p_{\text{NAT}}}$$

p_{ALL} and p_{NAT} : probabilities of exceeding the threshold in the All Forcing and Natural distributions.
Source: Knutson, Zeng, and Wittenberg, *BAMS*, accepted (2014)

Sliding Trend Analysis

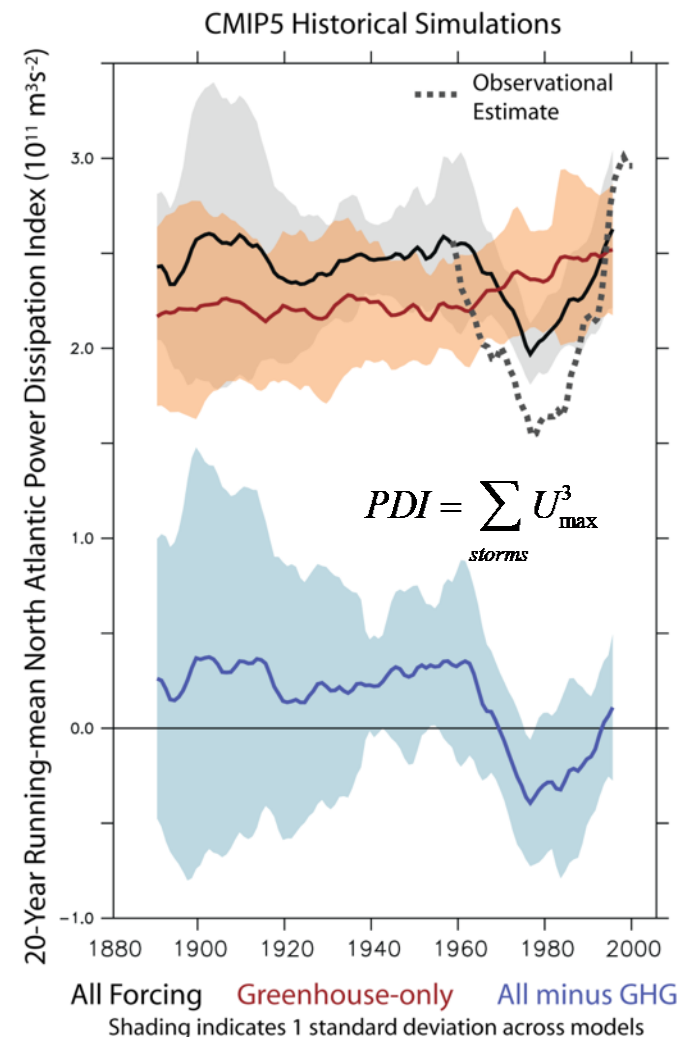
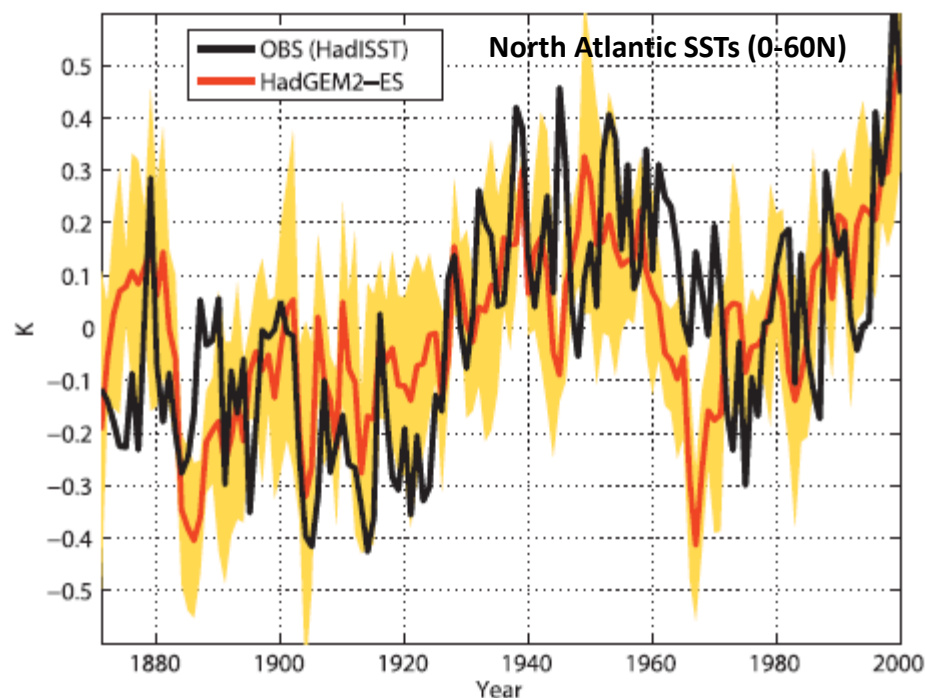


Attributable Risk Analysis



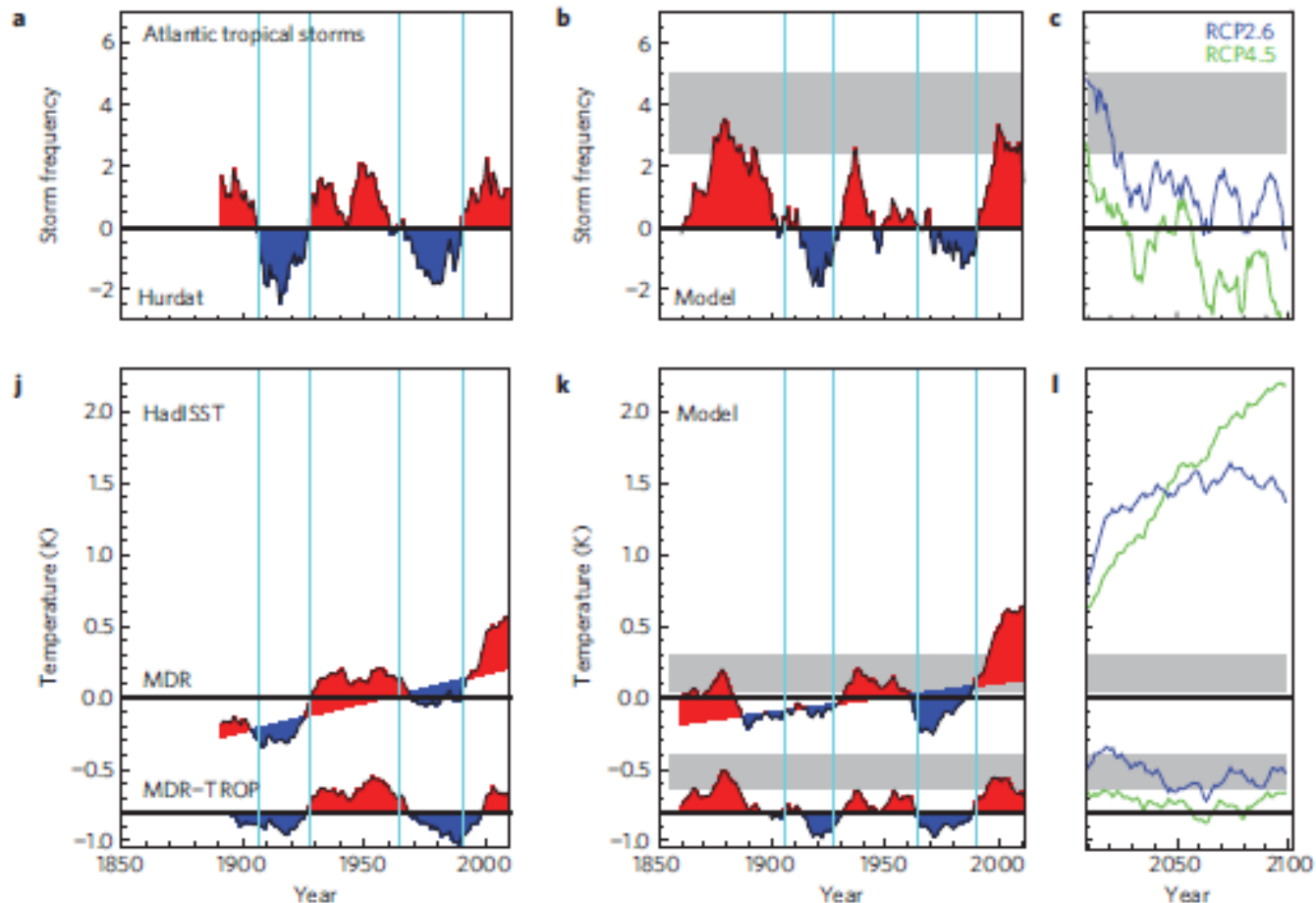
What caused the rise in Atlantic hurricane activity since the 1970s?

Booth et al. (2012) attribute North Atlantic multidecadal SST variations primarily to aerosol forcing. Villarini and Vecchi (2013) attribute part of the multidecadal 'lull' in Atlantic hurricanes (70s and 80s) to aerosol forcing.



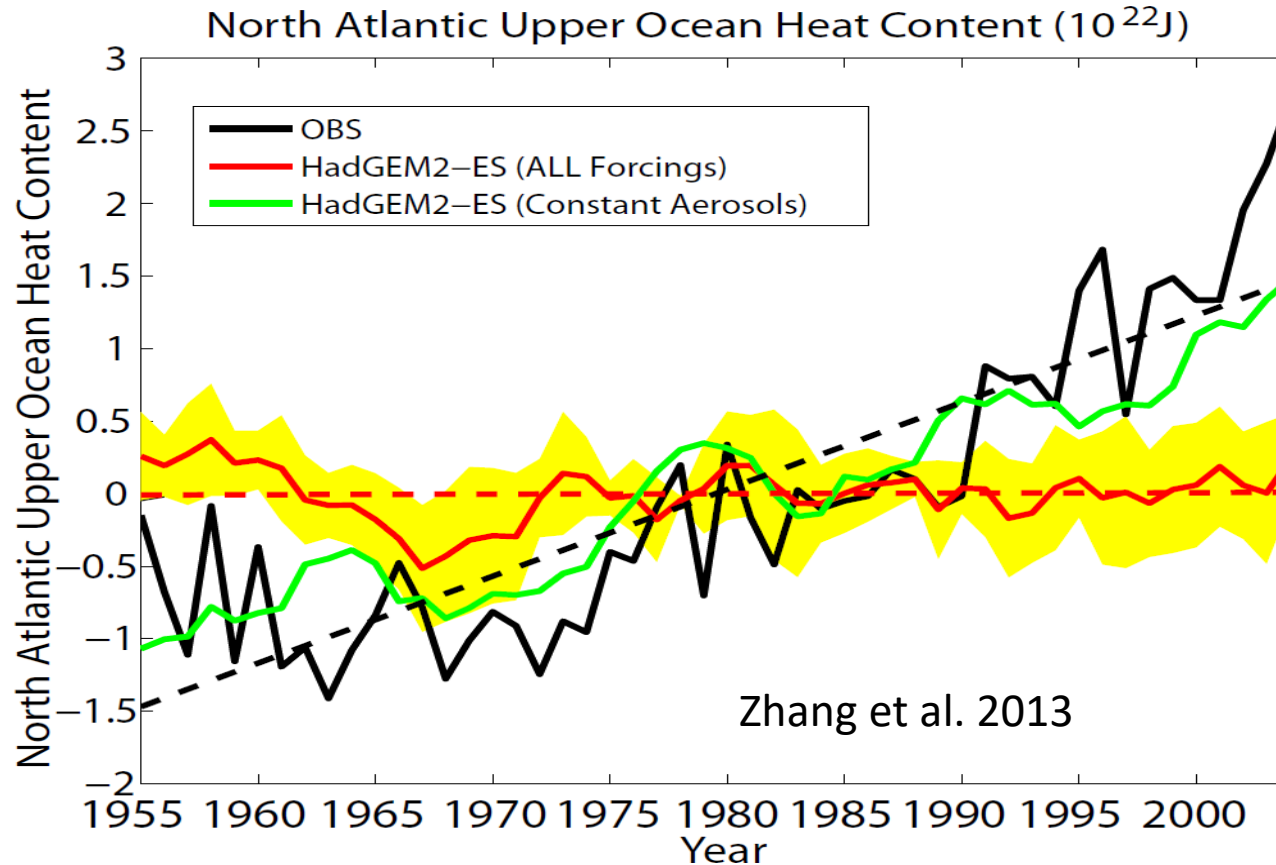
Sources: Left: Fig. 1 adapted from Booth et al., *Nature*, 2012 (Zhang et al. JAS, 2013); right: Villarini and Vecchi (J. Climate 2013).

- Did Aerosols force 20th century multi-decadal changes in Atlantic tropical storm frequency?
 - Hadley Centre model (HadGEM2-ES) suggests a strong aerosol forcing/SST/TC frequency link.
 - Their future projections (RCP2.5, RCP4.5) show a decline in TCs over the coming century...



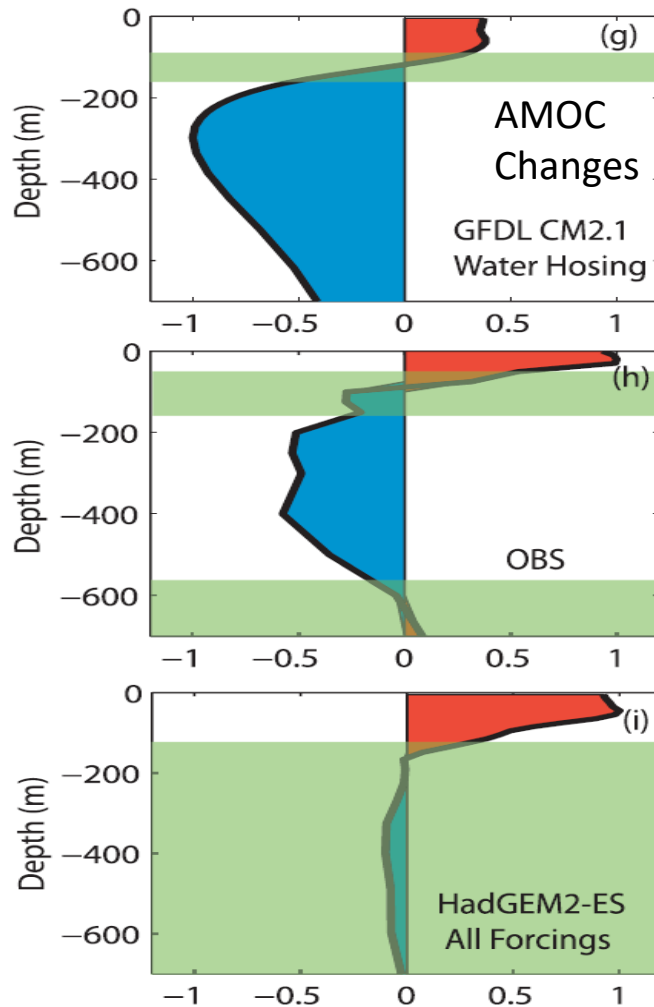
Reference: Dunstone et al., Nature Geoscience (2013).

Aerosol Effects and Upper Ocean Heat Content



- Observations show substantial warming trend in the North Atlantic upper ocean heat content
- All-forcing simulations used in Booth et al. (2012) show no warming trend
- The discrepancy is mainly due to anthropogenic sulfate aerosols and the indirect effects of sulfate aerosols are strongly overestimated

Anti-Correlated Multidecadal Variations in Tropical North Atlantic (TNA)

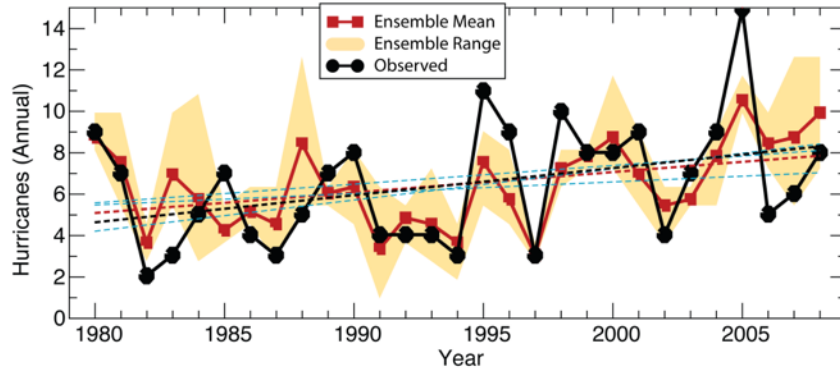


- The anti-correlated variations are seen for both observations and in model simulations of AMOC changes, but not in the simulation (HadGEM2-ES) used in Booth et al. 2012
- The aerosol mechanism cannot account for the observed anticorrelated multidecadal TNA SST and subsurface temperature variations

Two GFDL models reproduce the interannual variability of Atlantic hurricane counts; trend in NCEP reanalysis-forced ZETAC model is too large

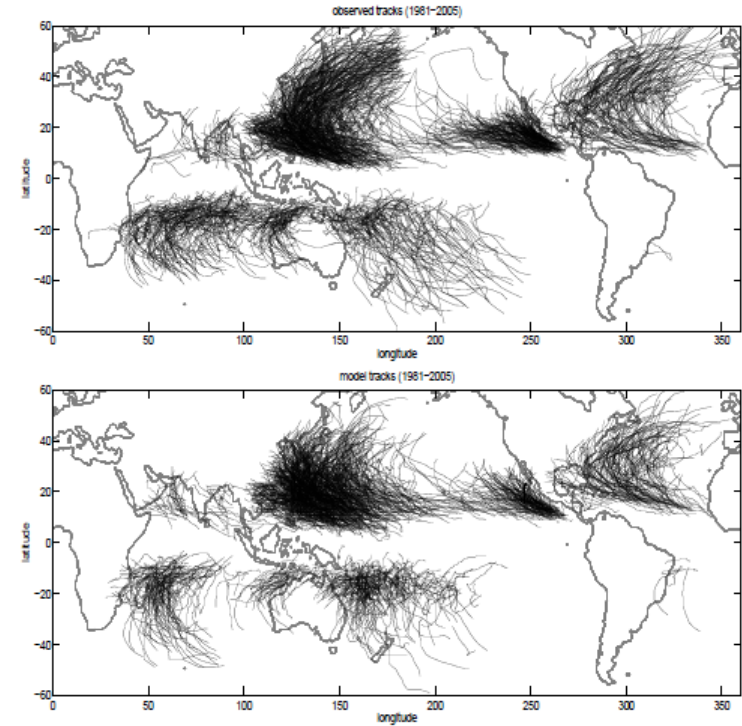
Atlantic Hurricanes (1980-2008): HiRAM-Simulated vs. Observed

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).



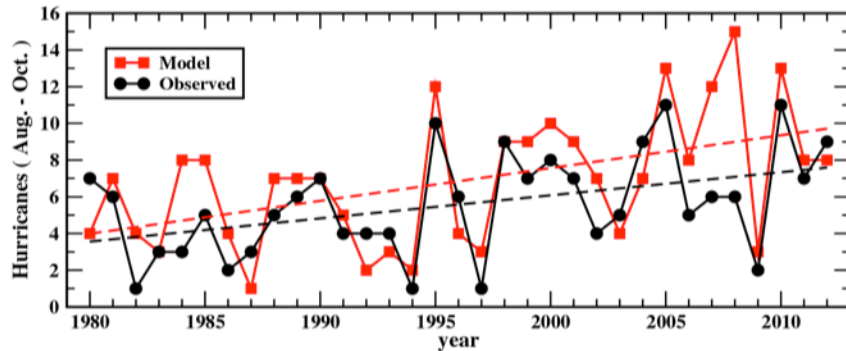
GFDL HIRAM 50km grid global model (SST-forced)

Simulated vs Observed Tropical Storm Tracks (1981-2005)



Atlantic Hurricanes (1980-2012): Simulated vs. Observed

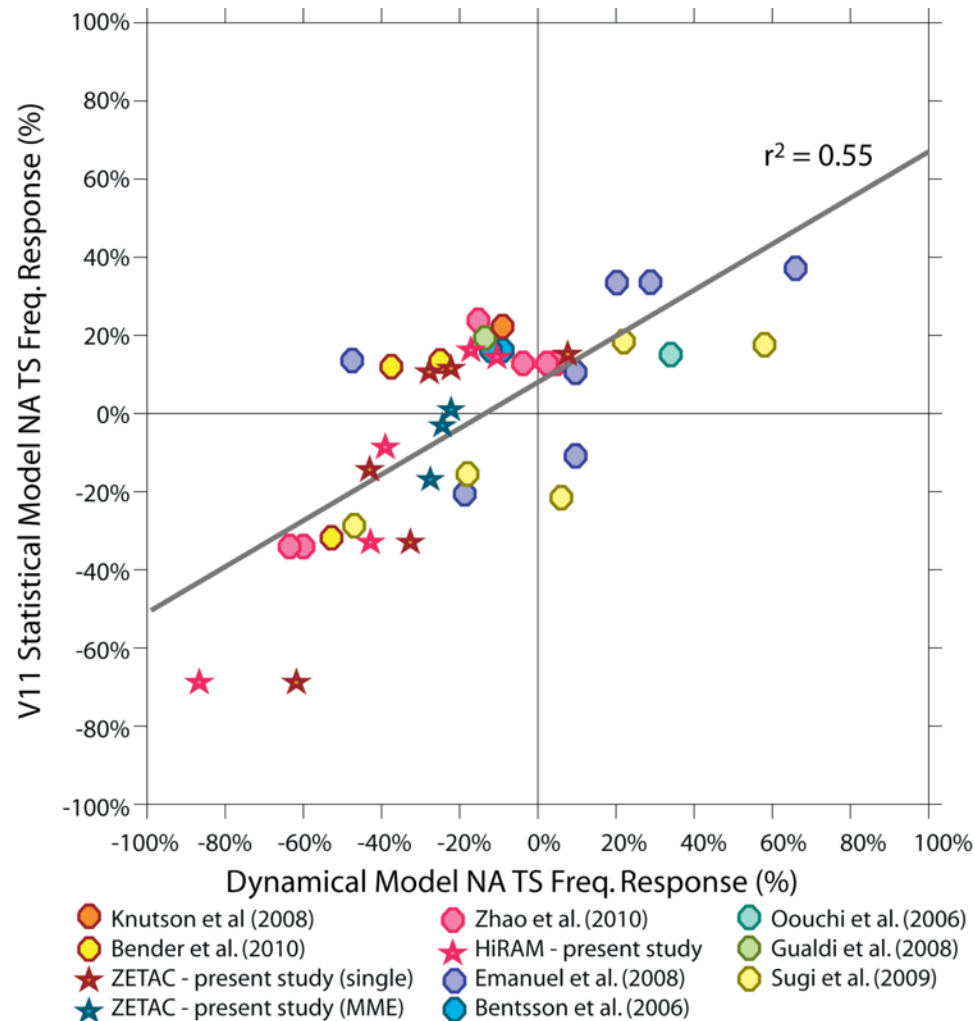
Correlation = 0.73; Linear trends: +0.18 storms/yr (model) and +0.13 storms/yr (observed)



ZETAC regional model: forced by NCEP Reanalysis



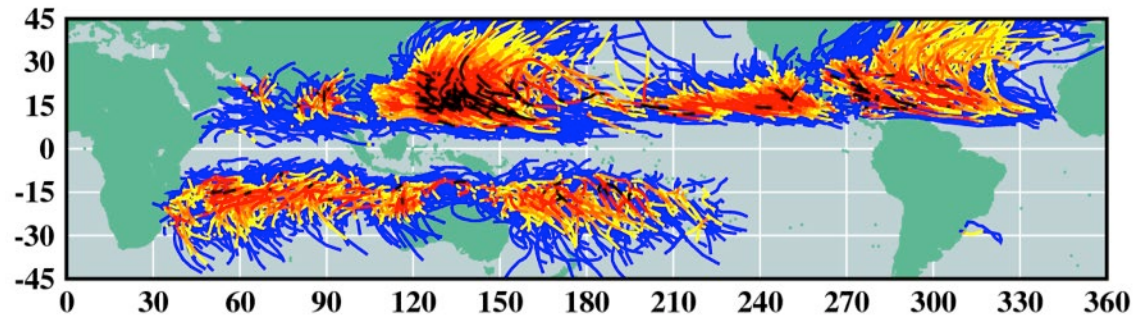
Relative SST-based statistical model describes Atlantic basin projected tropical storm changes fairly well:



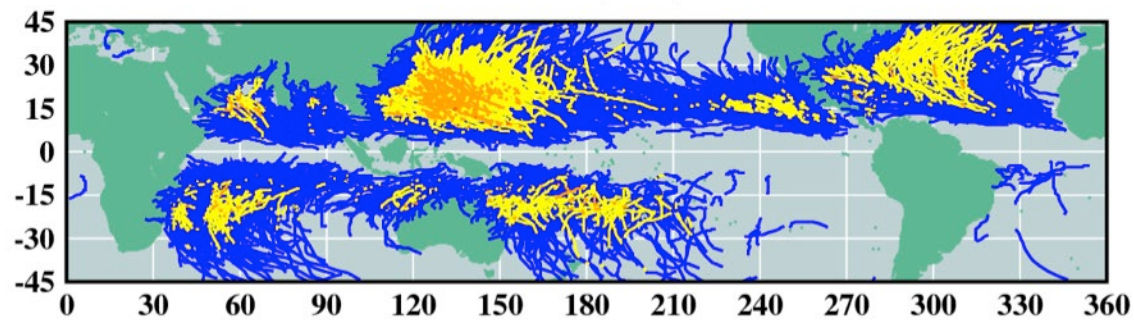
Tropical Storms (1980-2008)

Present-Day Climate

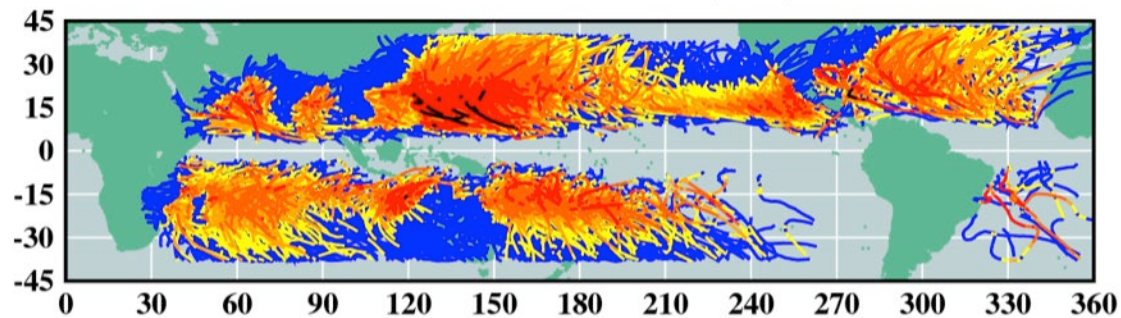
OBS (2518)



C180 (3081)



C180_HR/GFDL2012h (3031)

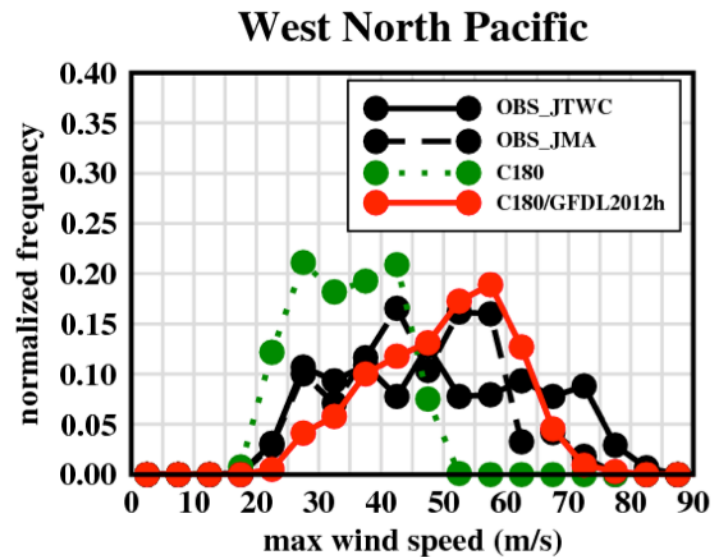
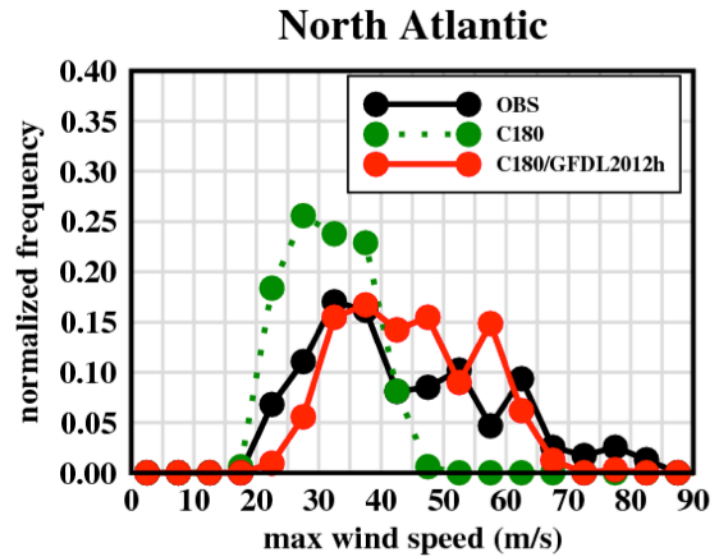


Storm
Category:

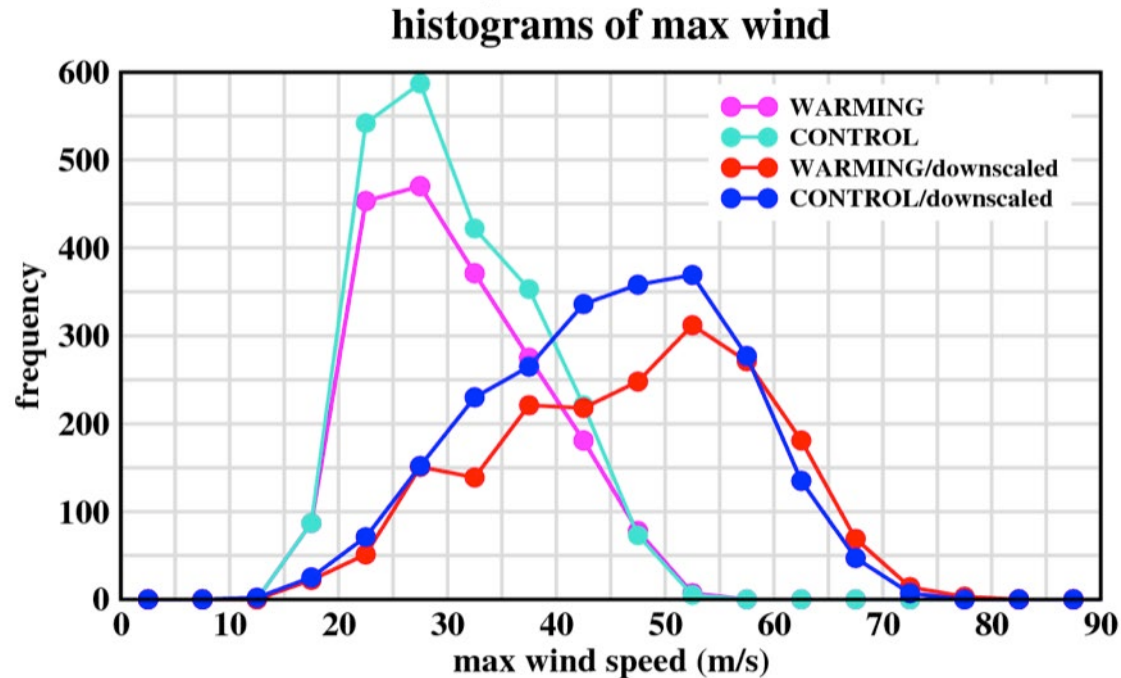


Normalized histogram of maximum winds (1980-2008 Obs. SSTs)

Present-Day Climate



CMIP5/RCP4.5 Late 21st Century Projections



Mean maximum windspeed changes for storm intensity of at least:

Tropical storms: Global: **+3.6%** [range: -5.6% (Southwest Pac) to +8.2% (NE Pac.)]

Hurricanes: Global: **+4.1%** [range: -3.1% (Southwest Pac.) to +7.8% (NE Pac.)]

Aggregate activity:

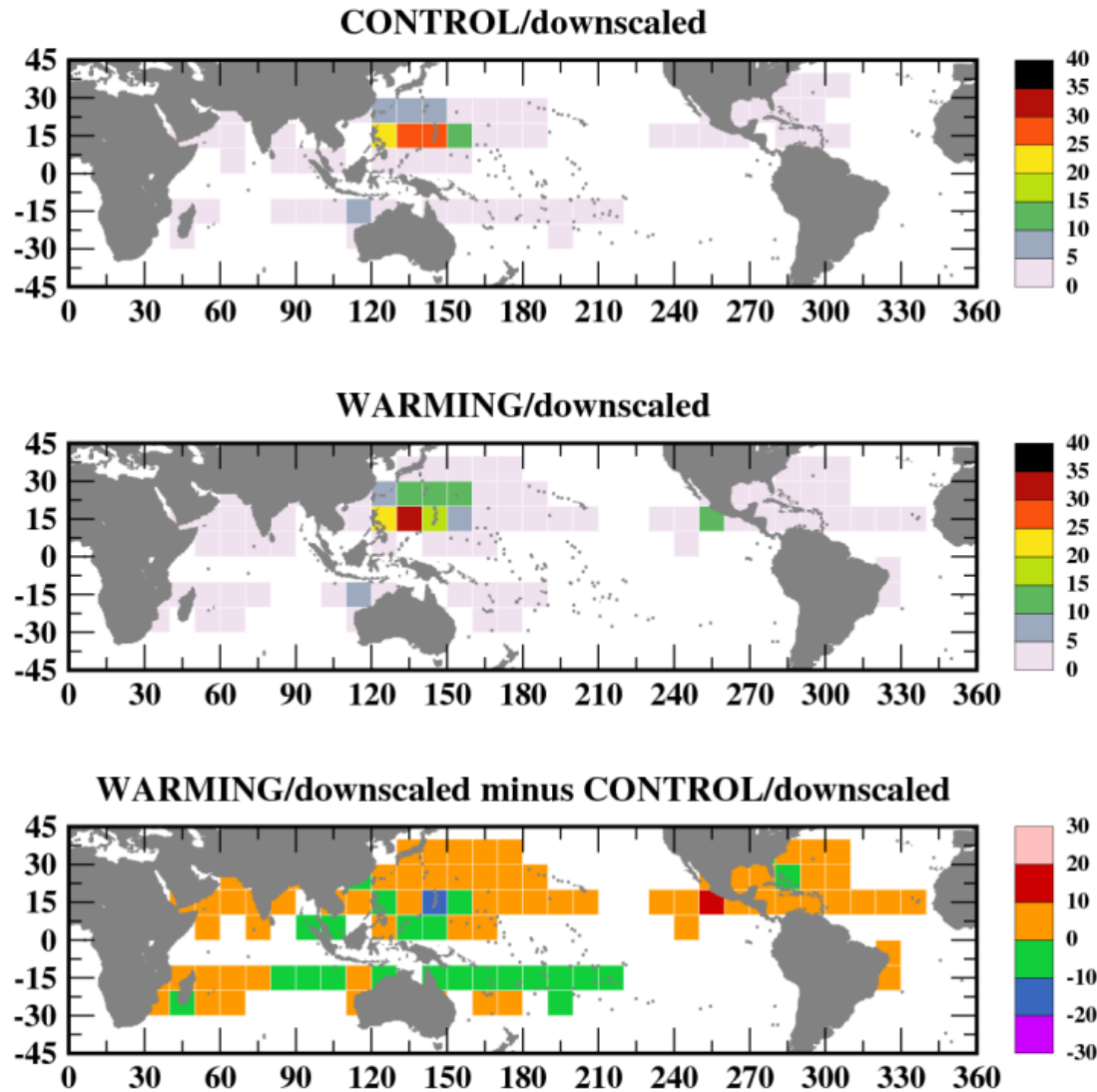
Power Dissipation Index: Global: **-9.7%**

Cat 4-5 storm days: Global: **+34.5%**

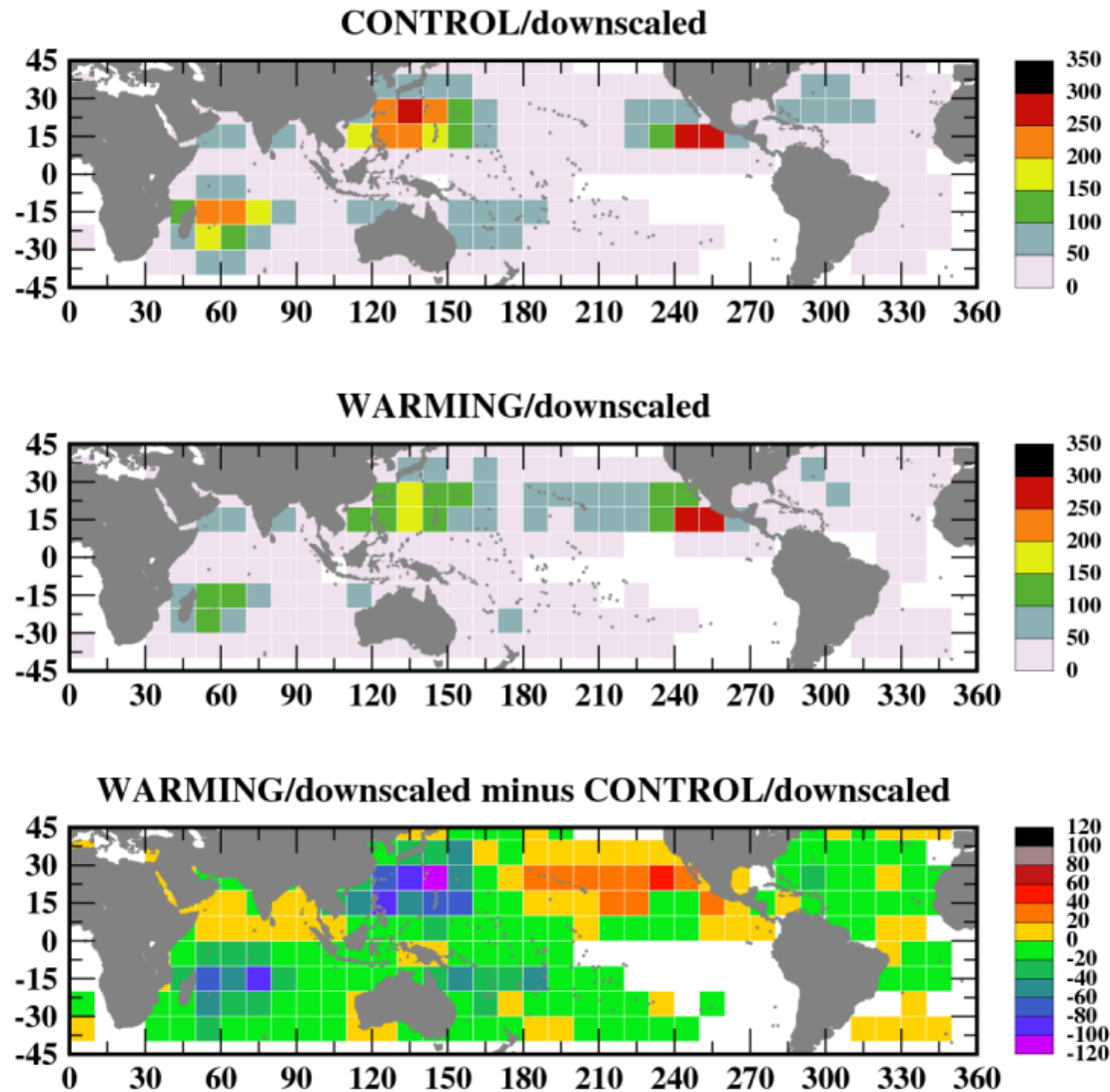
Global Frequency: Tropical storms: **-16%** [range: -37% (Southwest Pac) to +27% (N. Ind.)]

Cat 4-5 storms: **+24%** [range: -58% (Southwest Pac) to +340% (NE Pac.)]

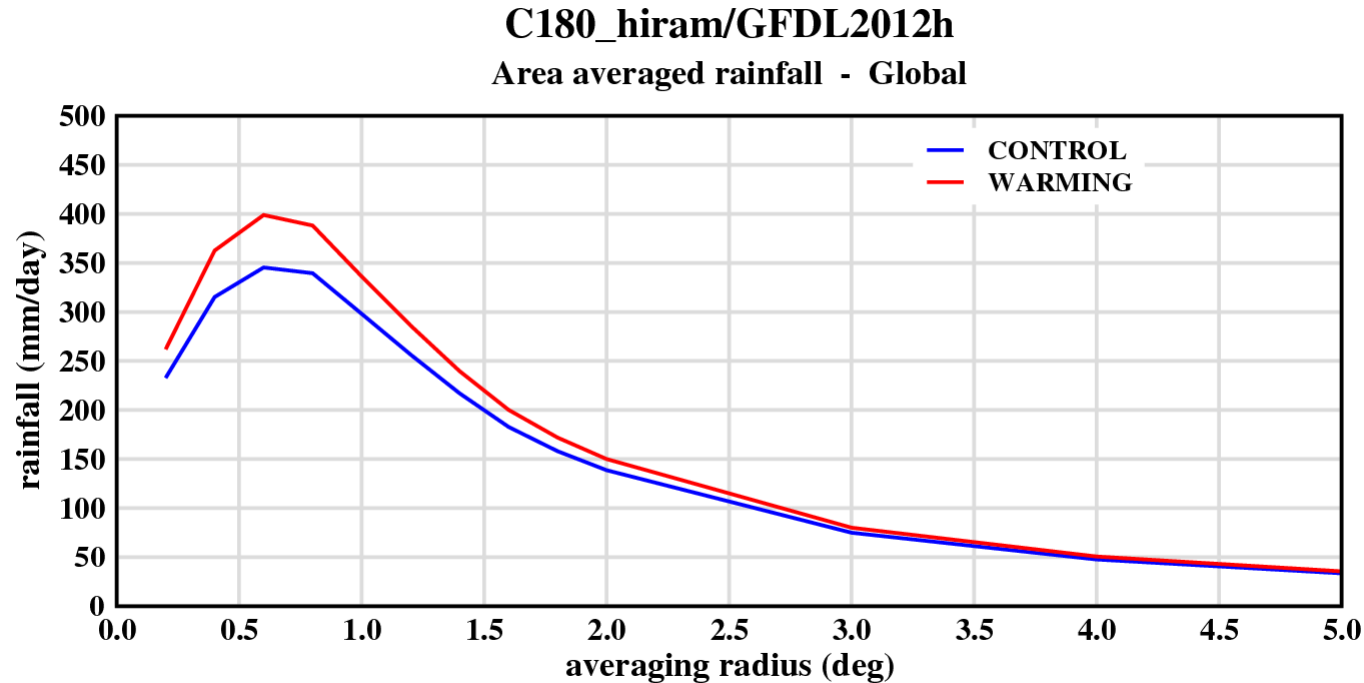
CMIP5/RCP4.5 Late 21st Century Projection: Cat 4-5 Occurrence



CMIP5/RCP4.5 Late 21st Century Projection: Tropical Storm Occurrence



CMIP5/RCP4.5 Late 21st Century Projection



Mean rain rate within 100 km radius of storm center:

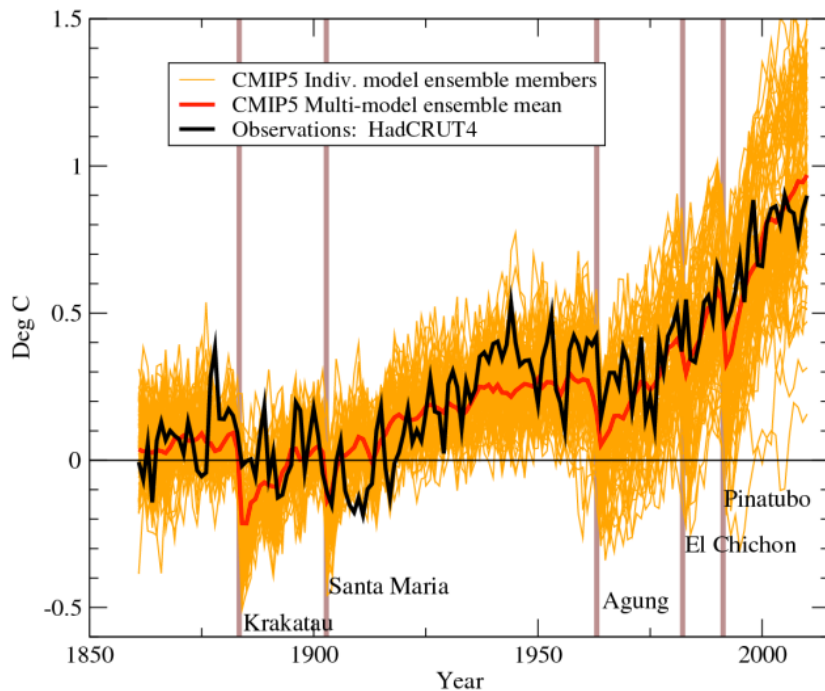
Tropical storms: Global: +14 % [range: -1.2% (Southwest Pac) to +21% (NW Pac.)]

Hurricanes: Global: +13 % [range: +3.4% (Southwest Pac.) to +20% (N. Atl.)]

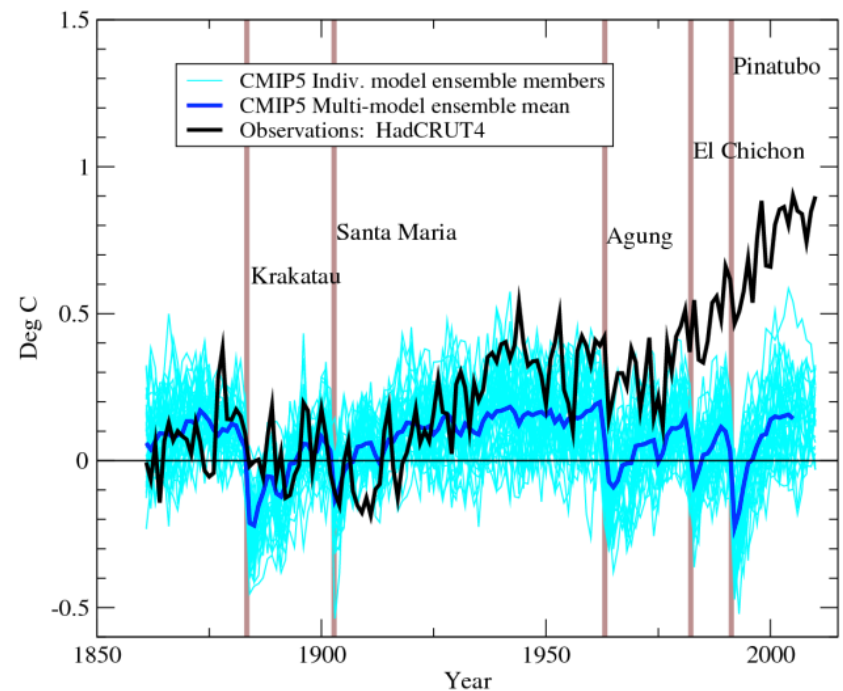
GFDL dynamical downscaling to 6 km grid model;
preliminary results, 2014.

Global Mean Surface Temperature Anomalies

a) CMIP5: All Forcings (Anthro. + Natural)



b) CMIP5: Natural forcing only (solar & volcanic)

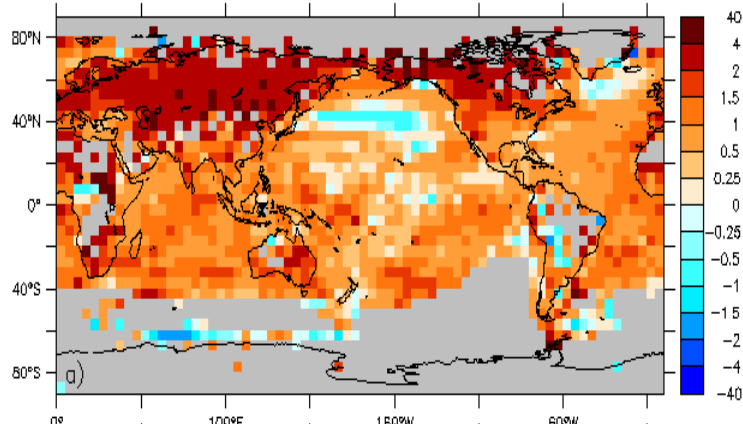


All Forcing: Anthropogenic (well-mixed GHGs, ozone, aerosols, land use change) + Natural Forcing

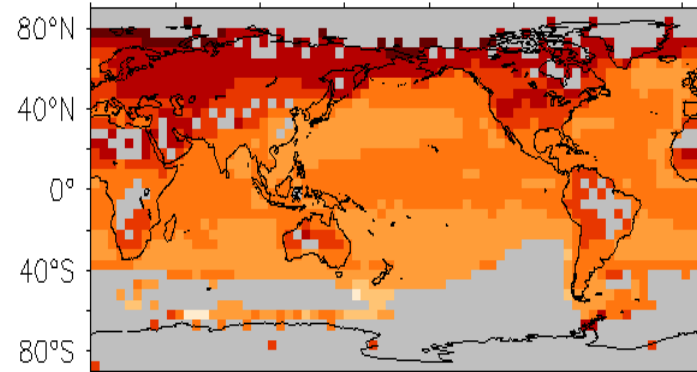
Natural Forcing: Solar variability; volcanic aerosols

1951-2010 Surface Temperature Trend Assessment *

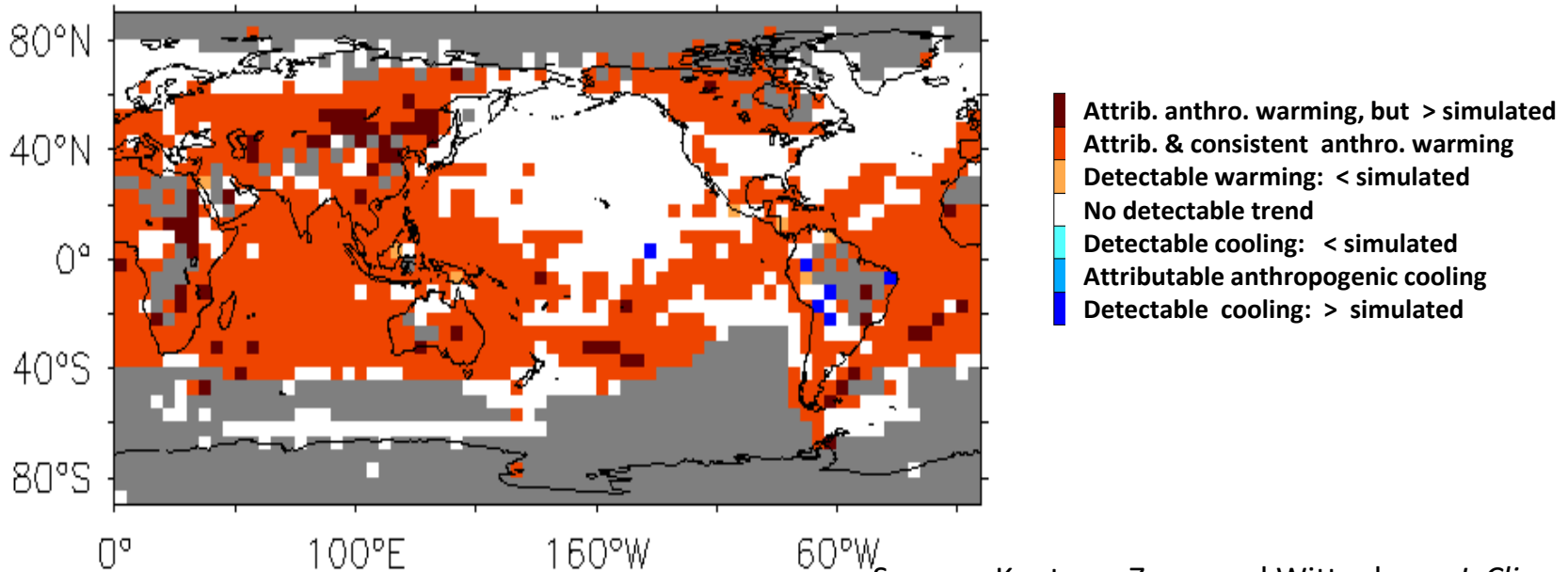
Observed trend (HadCRUT4)



CMIP5 All-Forcing ensemble trend



CMIP5 All-Forcing vs. Natural-Forcing assessment

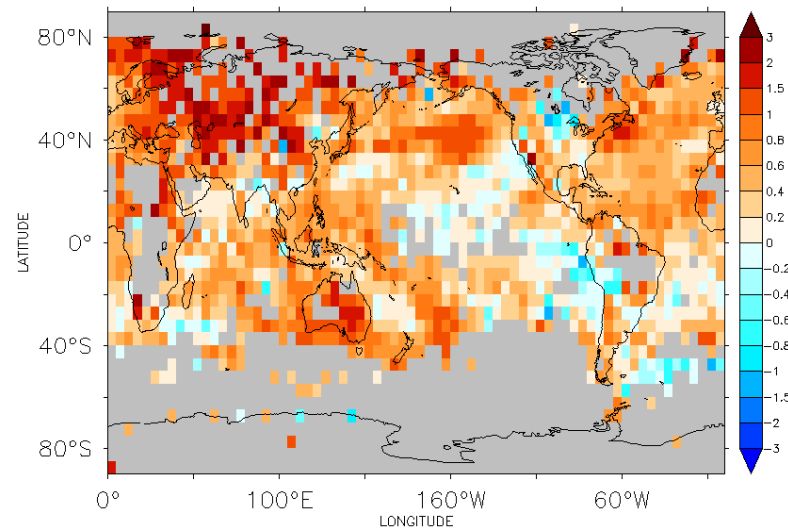


Source: Knutson, Zeng, and Wittenberg, *J. Climate* (2013)

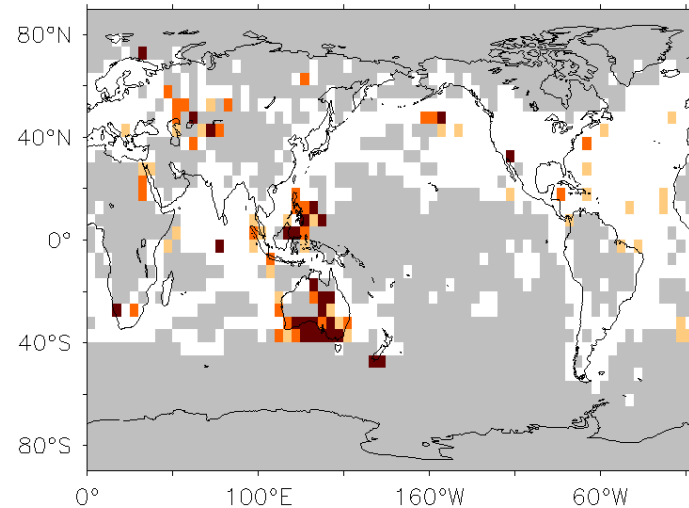
Explaining Extreme Events from a Climate Perspective...

Surface temperature: annual-mean extremes for 2013

Annual 2013 anomalies



Annual means: 2013 extremes

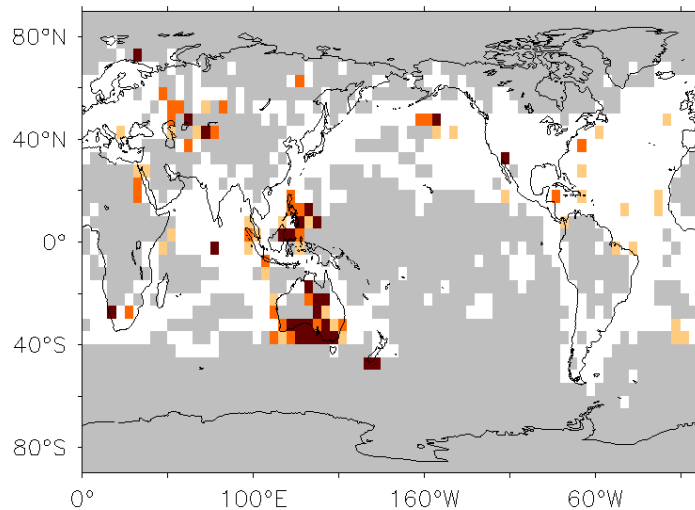


Map Legend:
(and percent
coverage by
category)

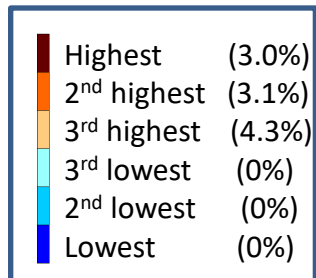
Highest	(3.0%)
2 nd highest	(3.1%)
3 rd highest	(4.3%)
3 rd lowest	(0%)
2 nd lowest	(0%)
Lowest	(0%)

Surface temperature annual-mean extremes for 2013: historical context

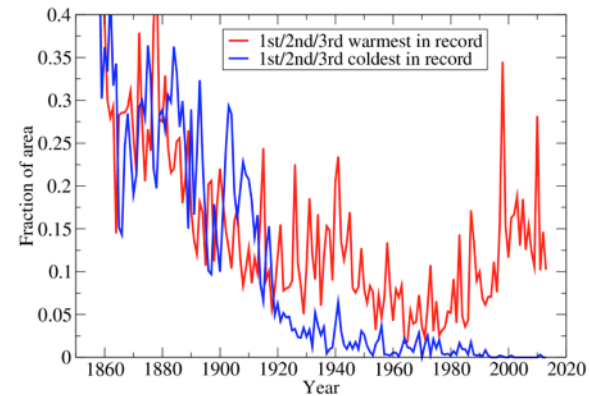
Annual mean surface temperature: 2013 extremes



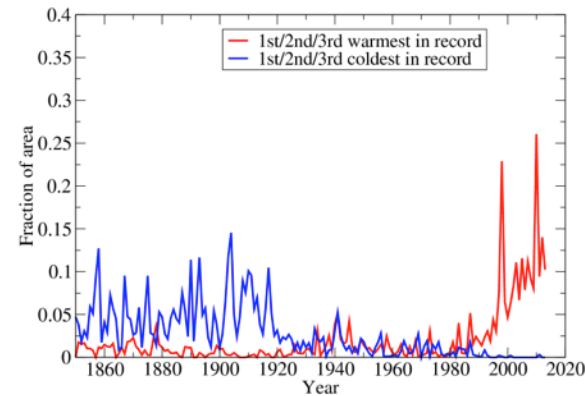
Map Legend:
(and percent coverage by category)



Area with warm vs cold annual-mean extremes (record to date)

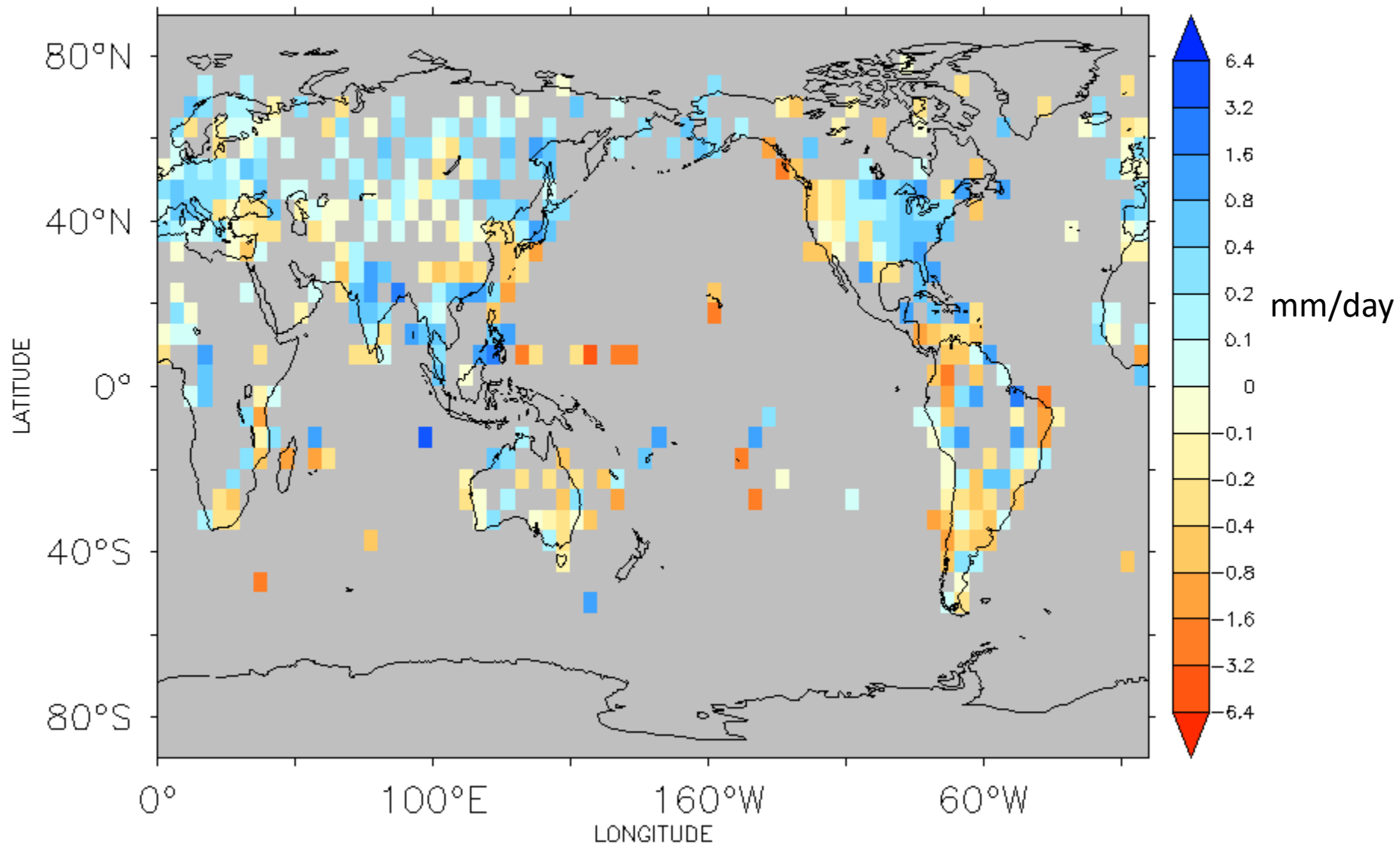


Area with warm vs cold annual-mean extremes (full record)

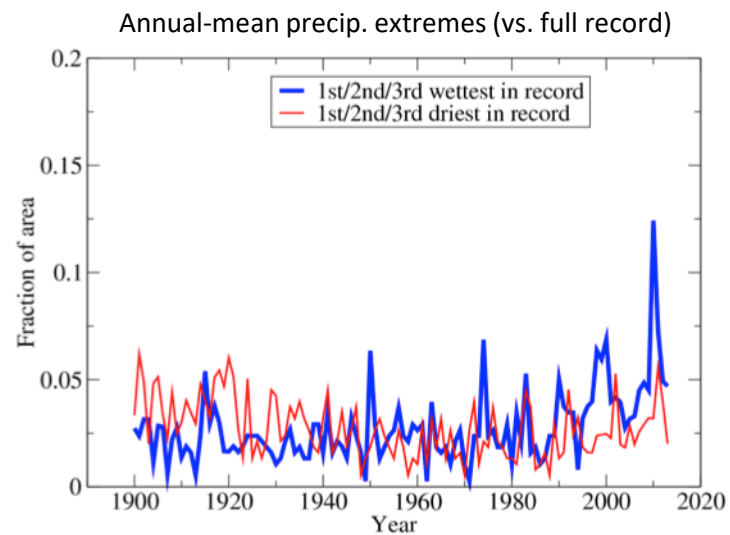
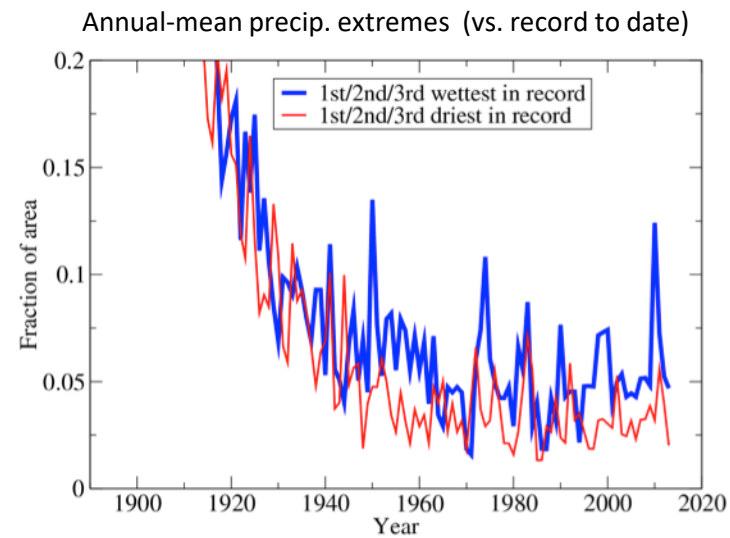
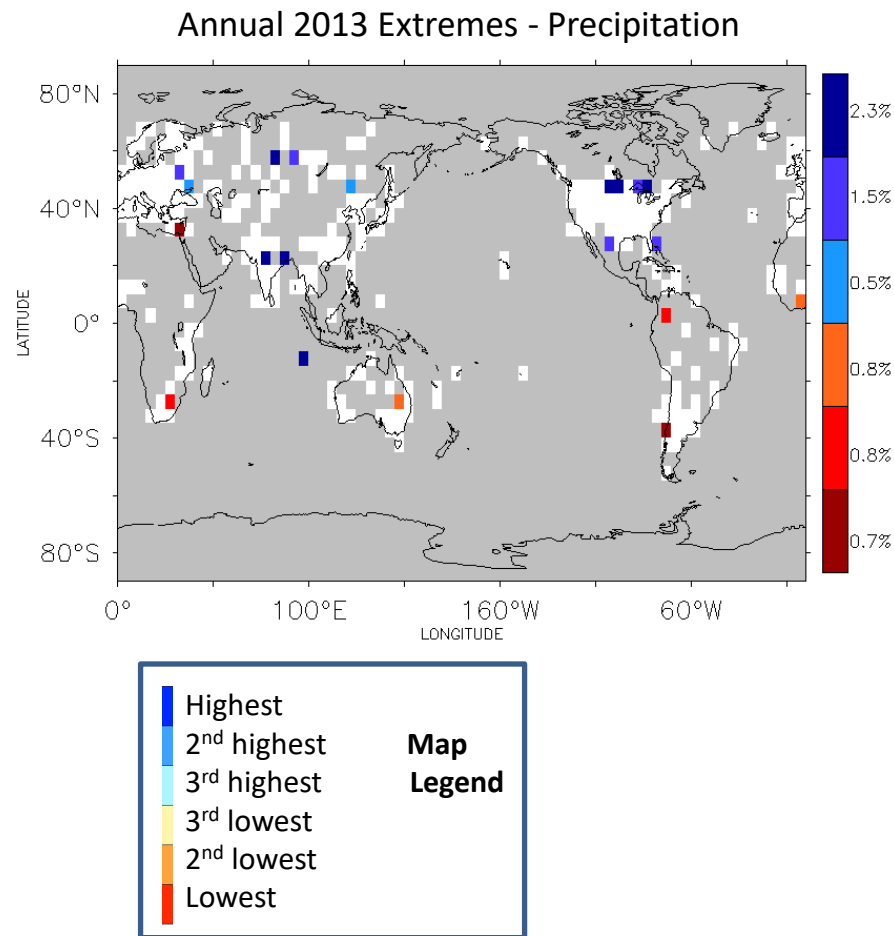


Source: Knutson, Zeng, and Wittenberg, *BAMS*, accepted (2014)

Annual Mean Precipitation Extremes for 2013 (100 yrs+ of record)



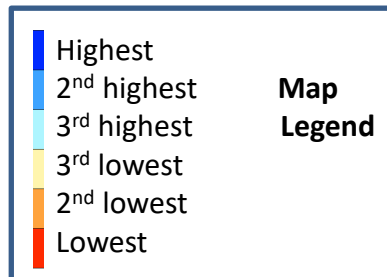
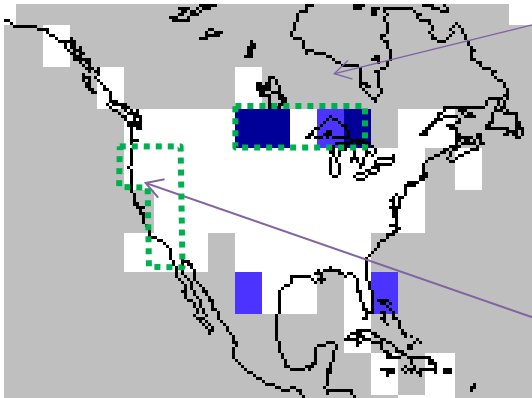
Source: Knutson, Zeng, and Wittenberg, *BAMS* accepted (2014)



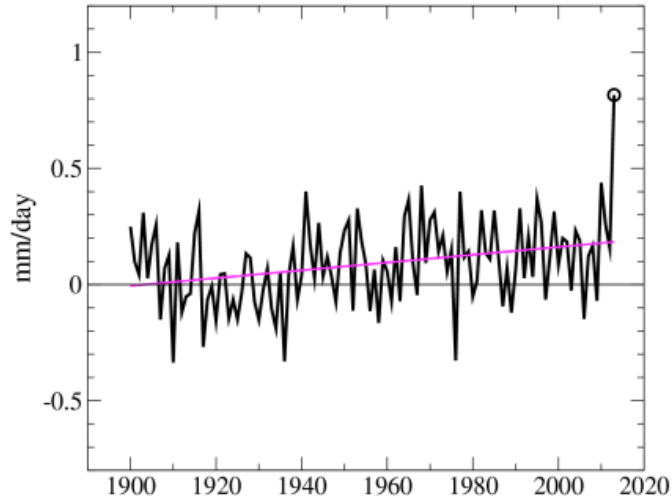
Source: Knutson, Zeng, and Wittenberg, *BAMS* accepted (2014)

2013 Annual Mean Precipitation Extremes: Climate Perspective

Annual 2013 Extremes - Precipitation

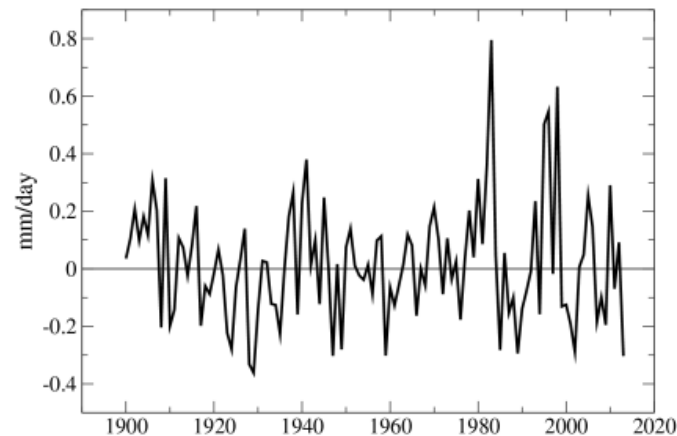


U.S./Canadian border region: annual means



U.S./Canadian border region —ANN:
Significant increasing trend;
Trend attributable to Anthro. + Natural

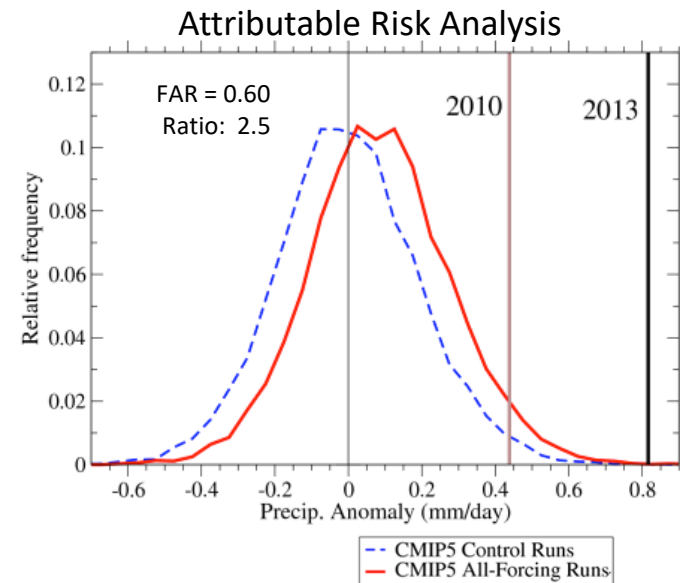
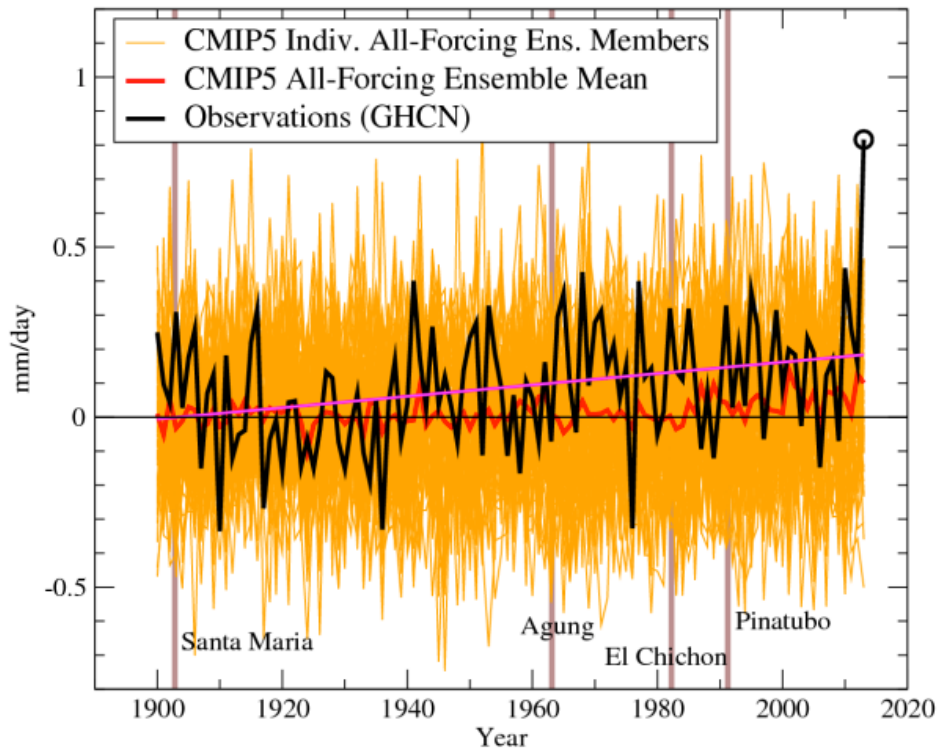
California region: annual means



California region -- ANN:
Non-significant trend

2013 Annual Mean Precipitation Extremes: Climate Perspective

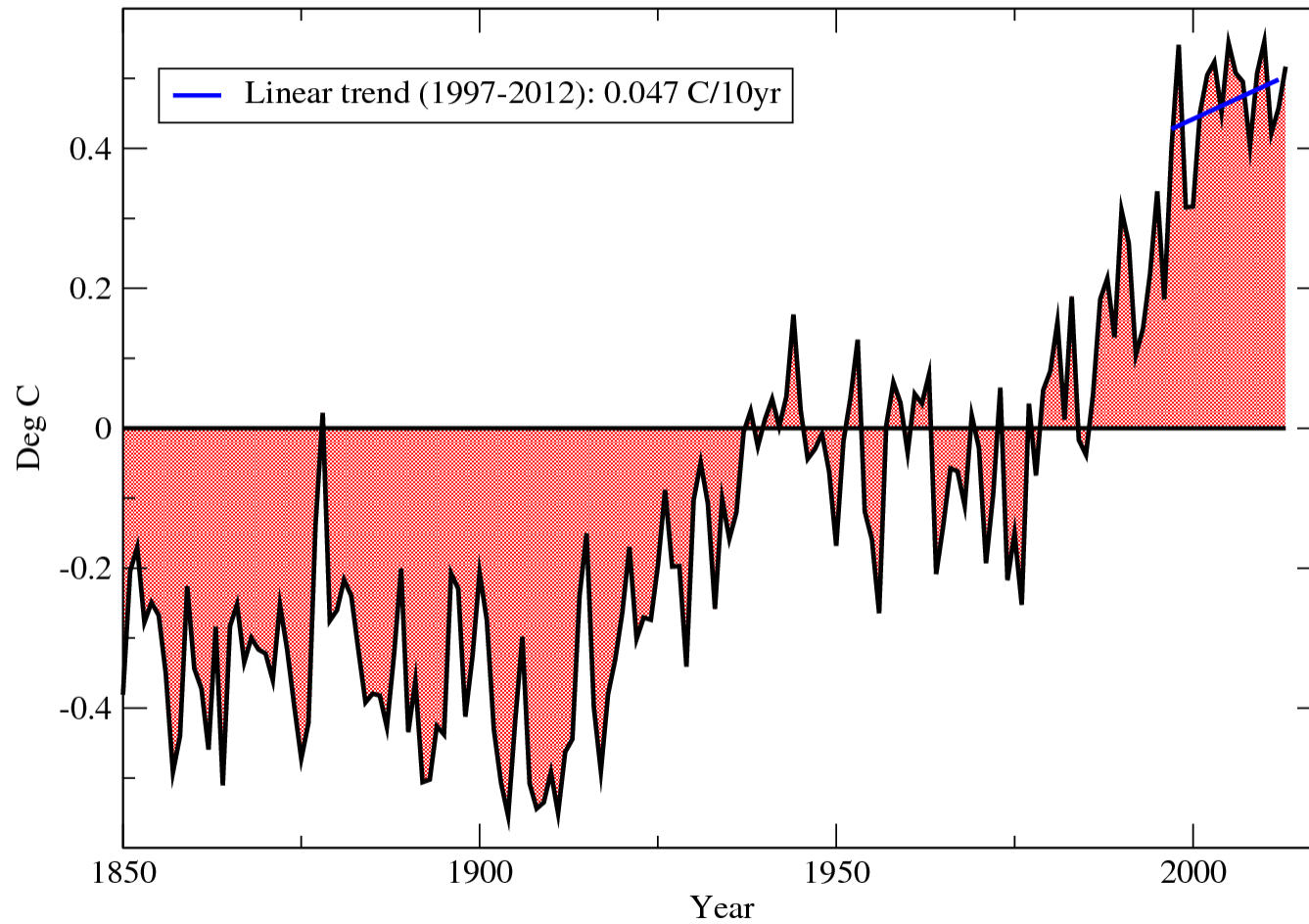
U.S./Canadian Border Region – Annual-mean Precipitation



$$\text{Ratio} = \frac{p_{\text{ALL}}}{p_{\text{CON}}}$$

p_{ALL} and p_{CON} : probabilities of exceeding the 2013 or 2010 thresholds in the All Forcing and Control distributions.

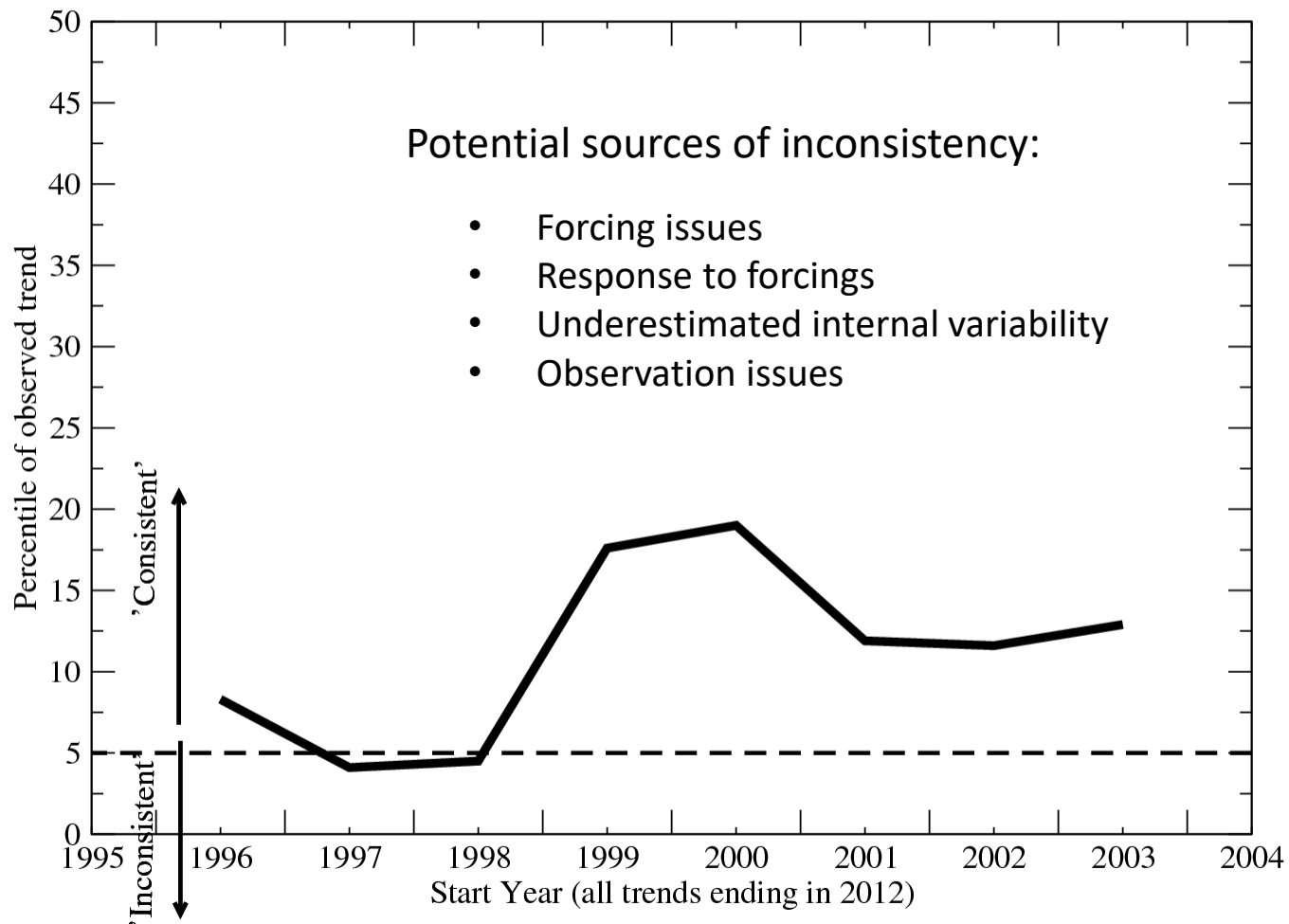
Global mean surface temperature anomaly (HadCRUT4)



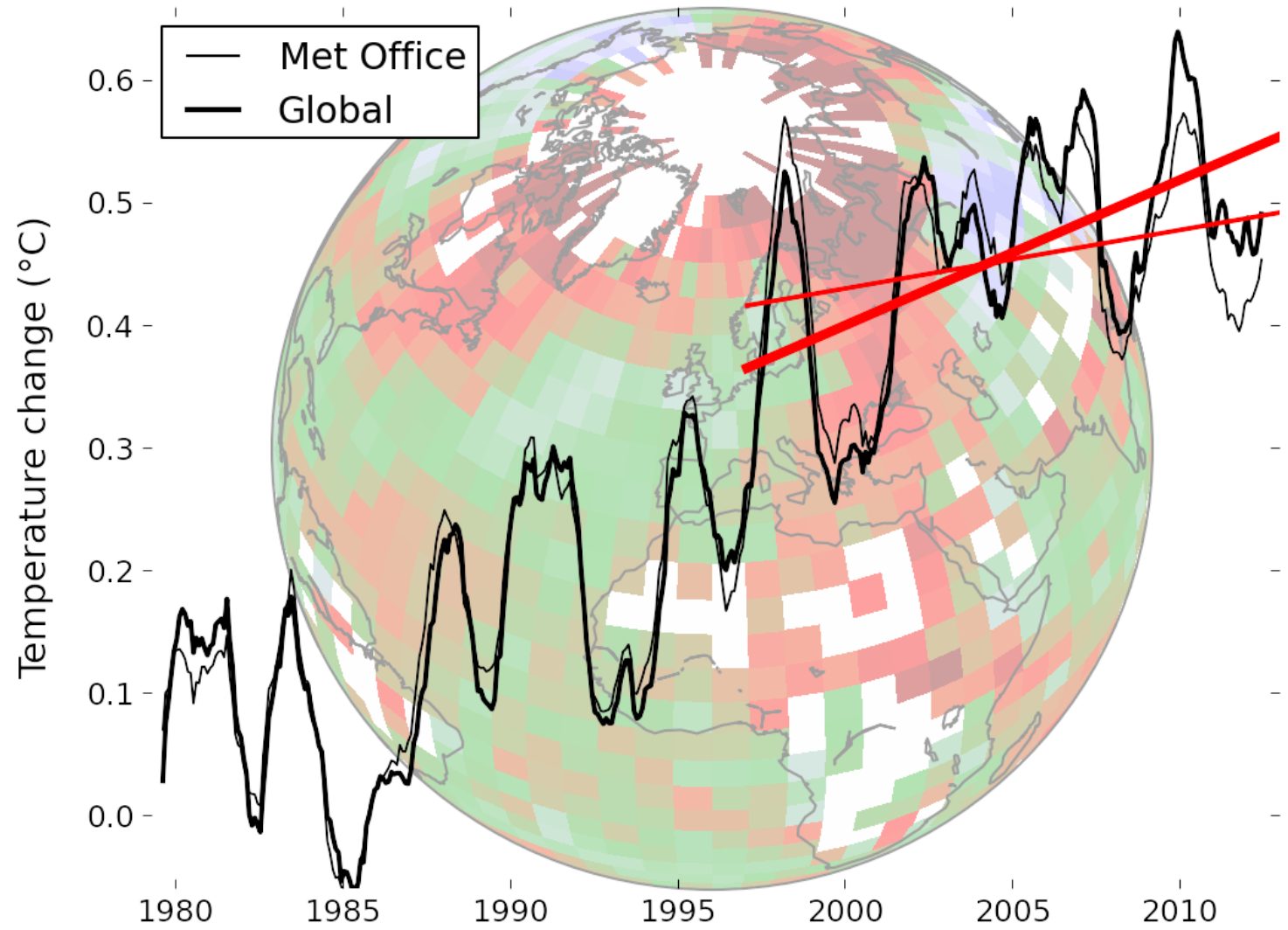
Note: Trend using previous year's version of HadCRUT4 was 0.0446 C/10yr.

Assessment of Global Surface Temperature Trends (1997-2012)

CMIP5 Historical/Control Runs; Base case: HadCRUT4 (available area only);



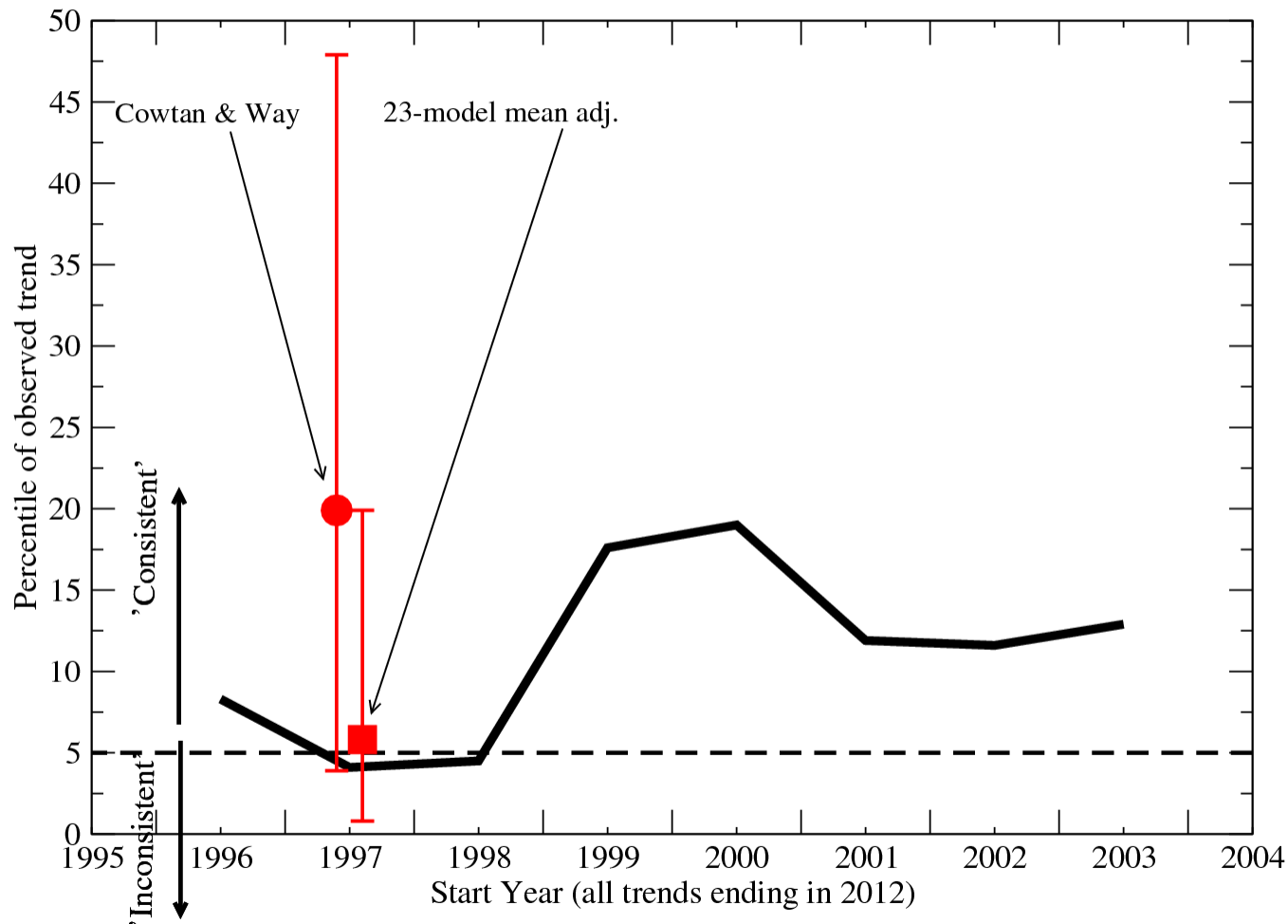
Are missing temperature observations in the Arctic causing the hiatus?



Source: Realclimate.org (Rahmsdorf, Nov. 13, 2013, after Cowtan and Way, QJRM, 2014.).

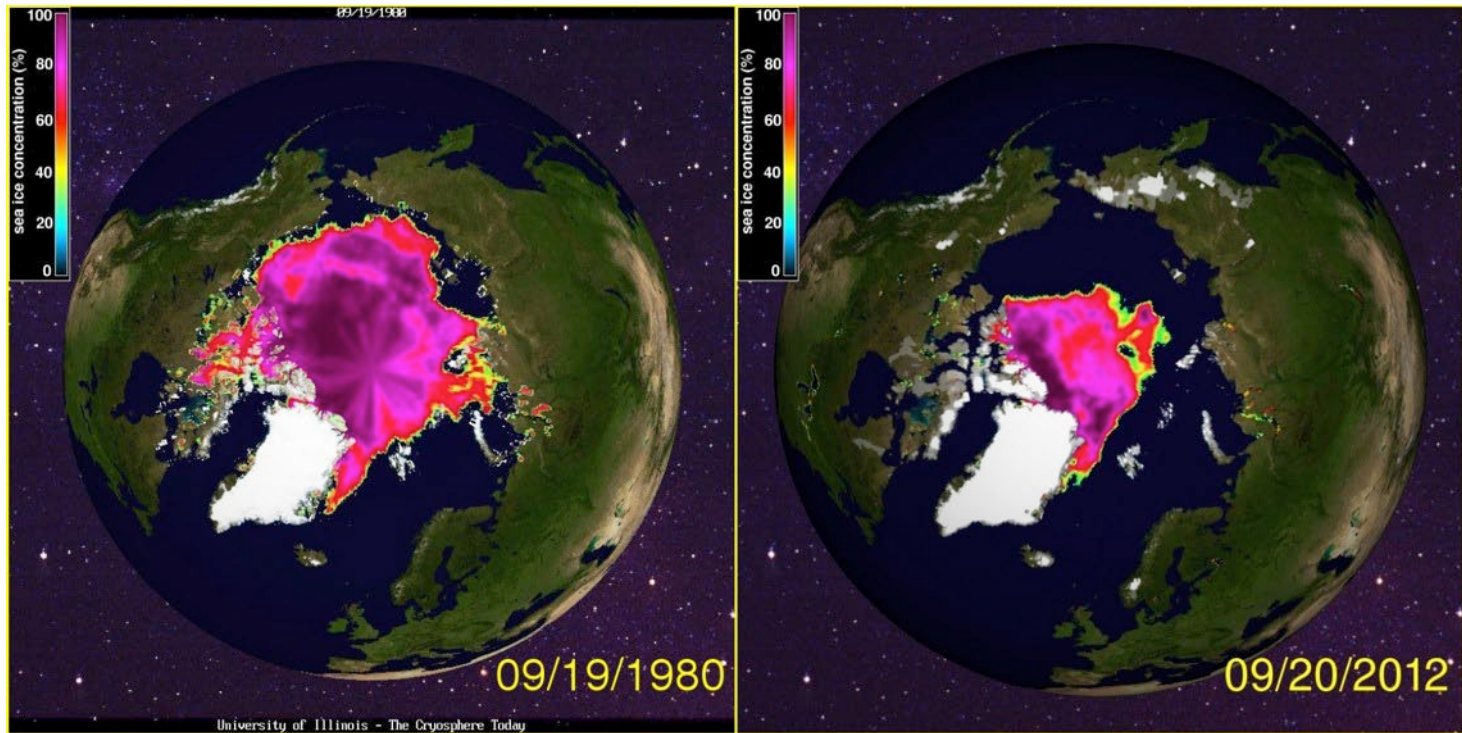
Assessment of Global Surface Temperature Trends (1997-2012)

CMIP5 Historical/Control Runs; Base case: HadCRUT4 (available area only); Adjusted cases (red) missing data imputed.



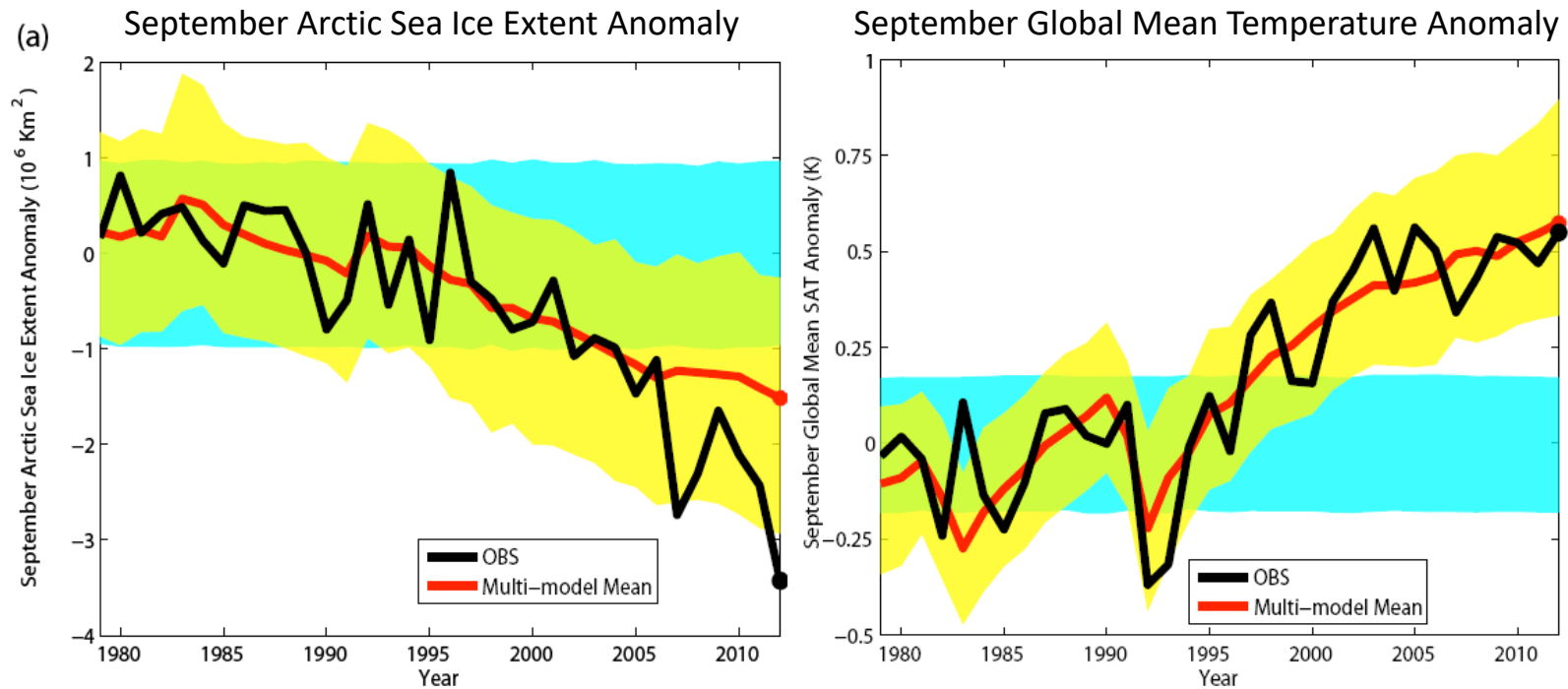
Note: Filled circle / error bar is percentile within 23-model combined distribution of Cowtan and Way's adjusted trend (and trend +/- 1 sigma).

Arctic Sea Ice Is Decreasing...



Source: University of Illinois – The Cryosphere Today

Arctic Sea Ice Extent Anomalies During 2012: An Extreme Year



Source: Rong Zhang and Thomas Knutson, BAMS, 2013.

Summary – Some Recent GFDL Work on Extremes

1. Hurricanes and Climate Change:

- No detectable human influence on hurricanes yet.
- Late 21st century projections: increased average intensity and precipitation rates; decreased overall tropical storm frequency. Sea level?

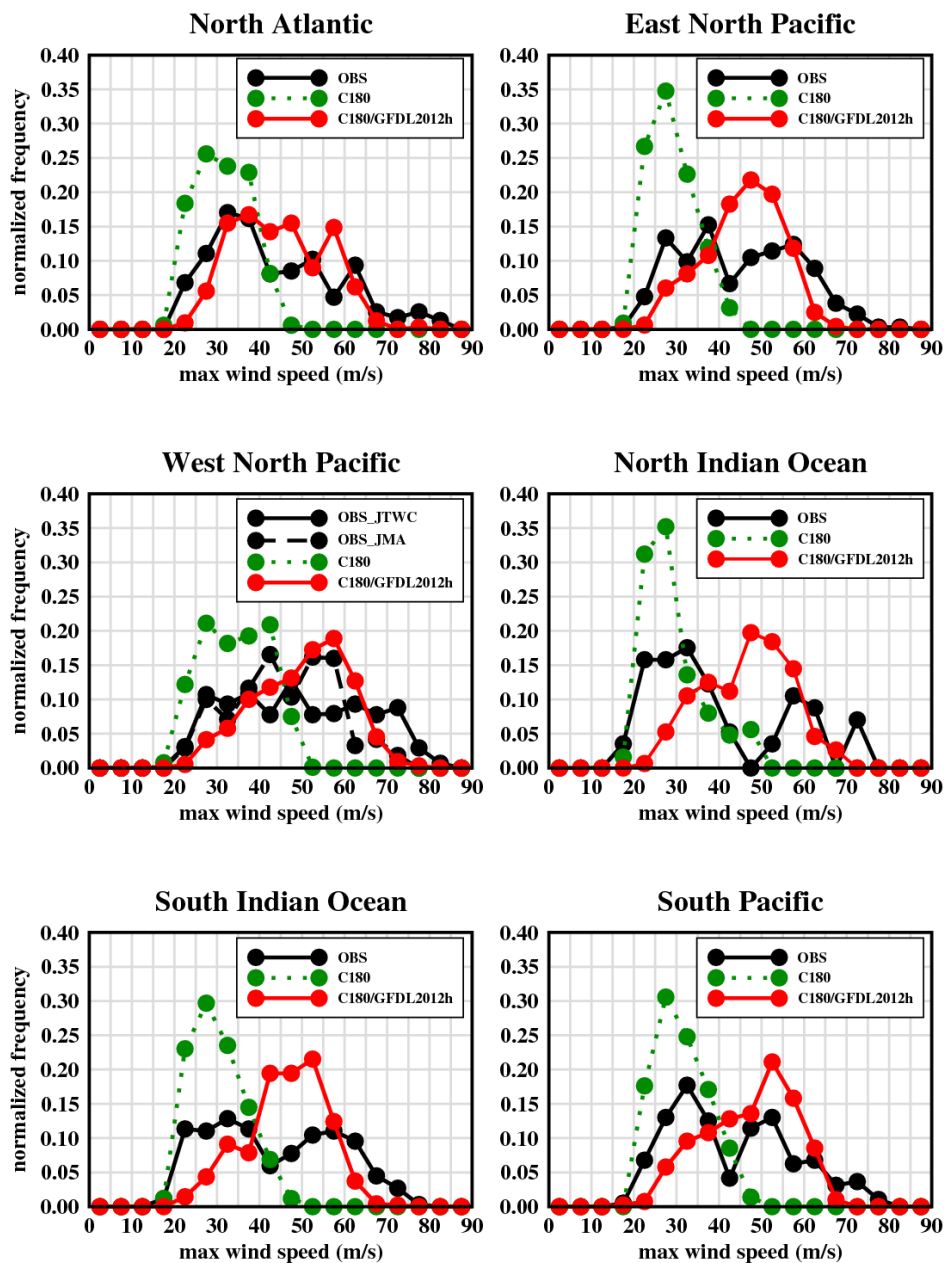
2. Examples of attribution for recent climate extremes

- Temperatures (seasonal- or annual-mean warm extremes)
 - Australia region (2013) – risk increase fully attributable to anthro. forcing, according to CMIP5 models
 - Eastern U.S. (Spring 2012) - risk increased 10x by anthro. + natural forcing
- Precipitation (seasonal- or annual-mean extremes)
 - U.S./Can. border (2013) – risk increased 2-3x by anthro. + nat. forcing combined, according to CMIP5 models
- Arctic sea ice: 2012 extreme loss – difficult for models to capture

3. The “global warming hiatus”

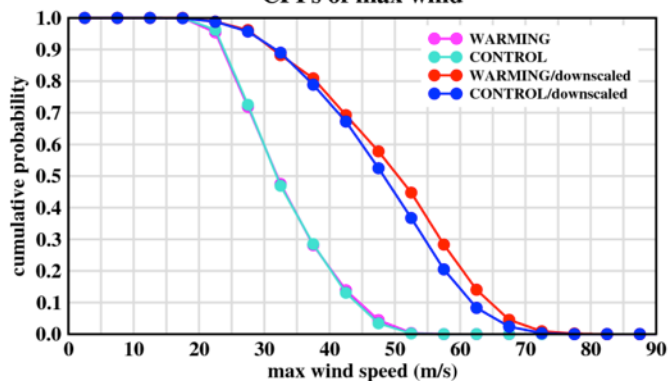
- CMIP5 models are inconsistent with observations (data-available regions)
- lack of observations in Arctic may affect this conclusion for global mean

Normalized histograms of max wind tropical storms (1980-2008)

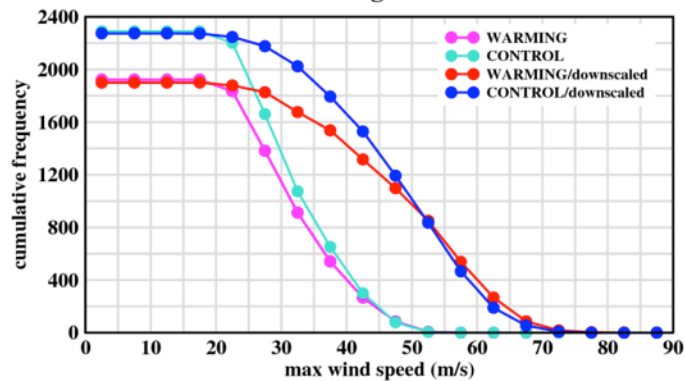


Present-Day Climate

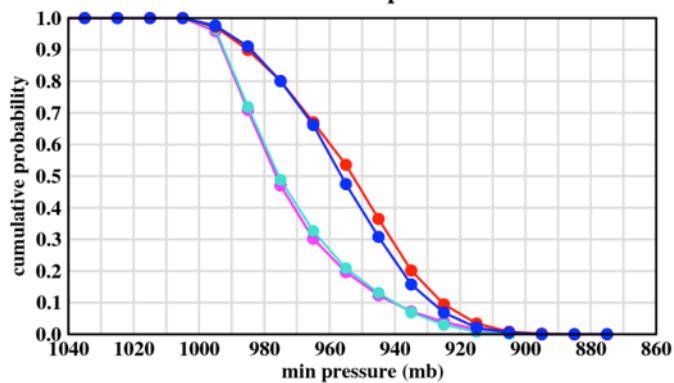
C180_hiram
Global Tropical Storms (1981-2000)
CPFs of max wind



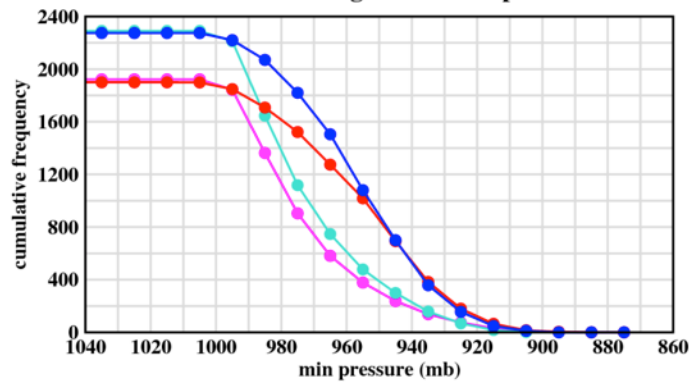
C180_hiram
Global Tropical Storms (1981-2000)
Cumulative Histograms of max wind



CPFs of min pressure

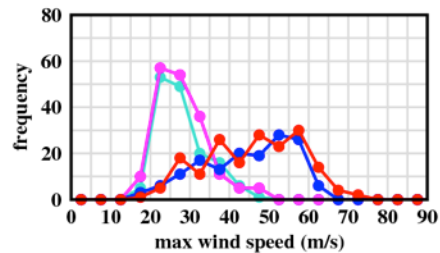


Cumulative histograms of min pressure

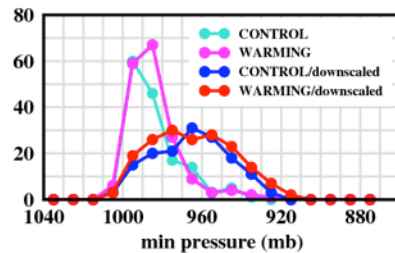


C180_hiram Intensity Histograms

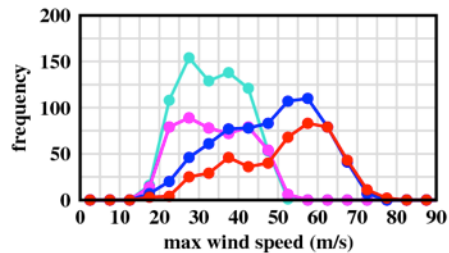
North Indian Ocean



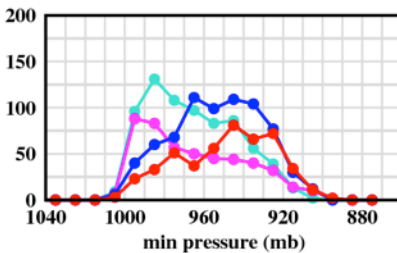
North Indian Ocean



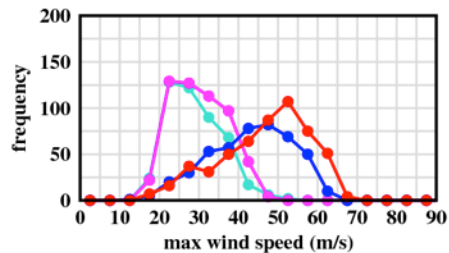
West North Pacific



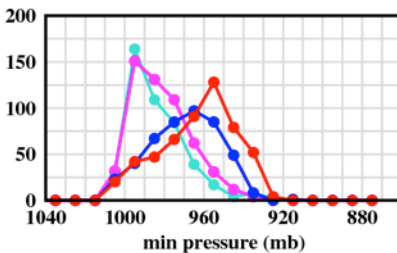
West North Pacific



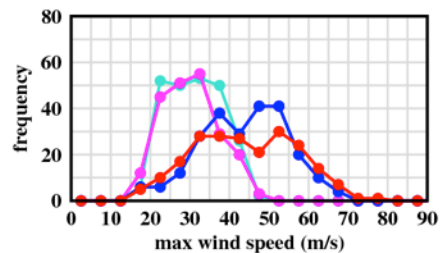
East North Pacific



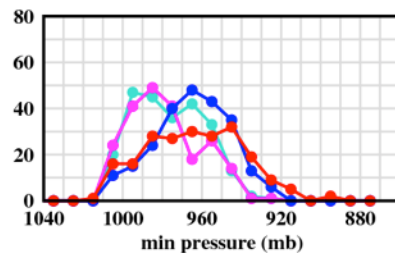
East North Pacific



North Atlantic

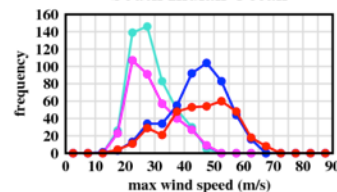


North Atlantic

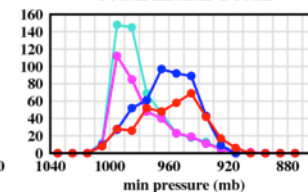


C180_hiram Intensity Histograms

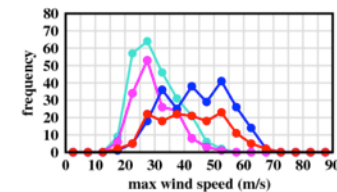
South Indian Ocean



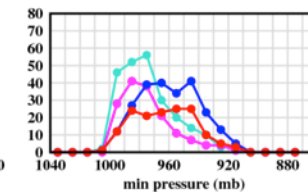
South Indian Ocean



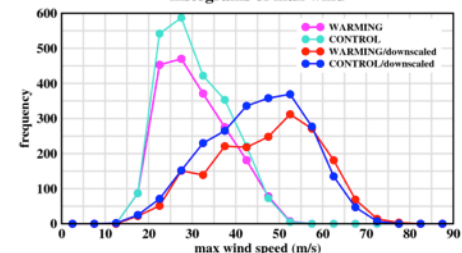
South Pacific



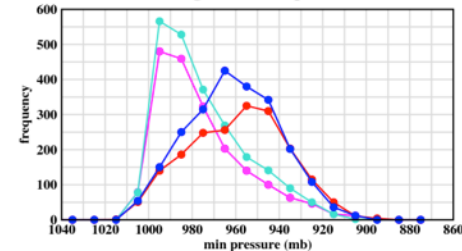
South Pacific



C180_hiram Global Tropical Storms (1981-2000) histograms of max wind

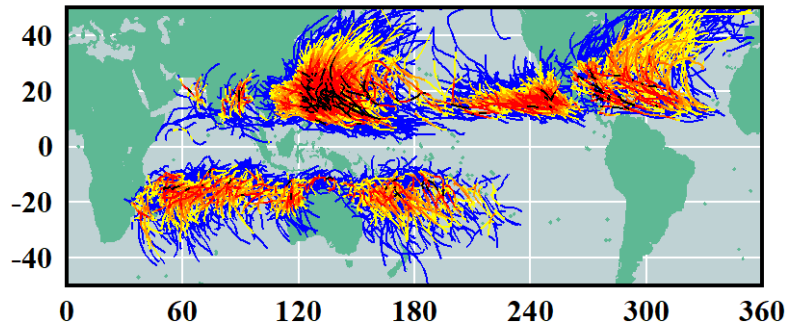


histograms of min pressure



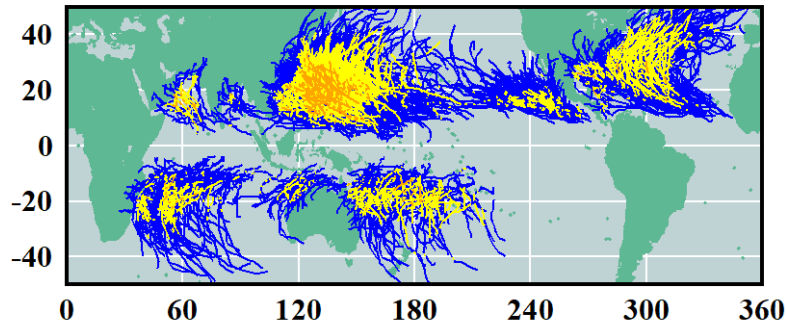
Hurricanes (1980-2008)

OBS (1391)

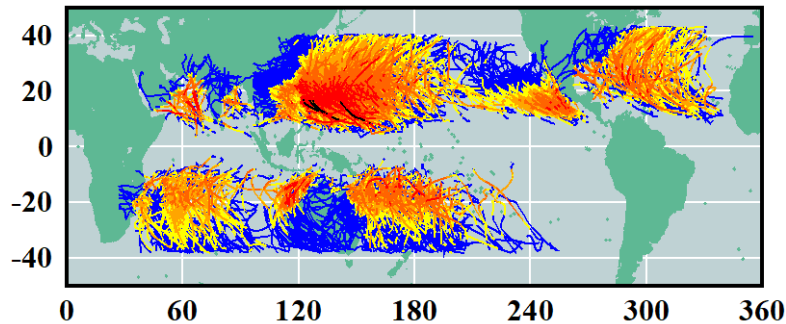


GFDL2012f (9 km grid,
no vortex replacement)

C180 (1440)



C180_HR/GFDL2012f (1318)



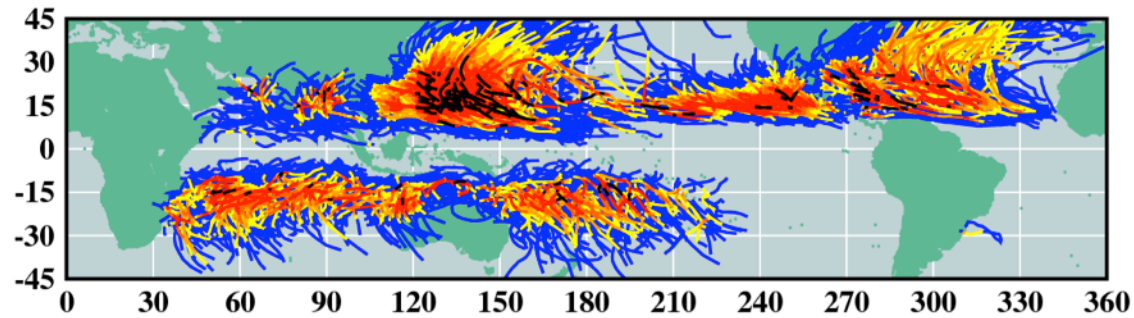
Storm Category



Tropical Storms (1980-2008)

Present-Day Climate

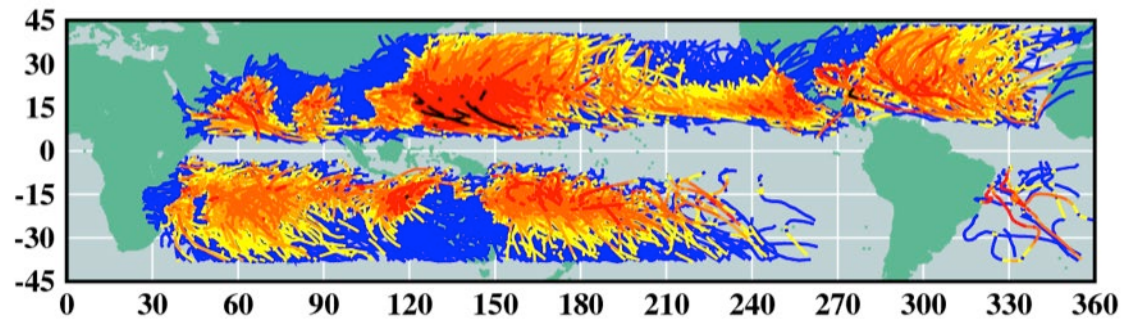
OBS (2518)



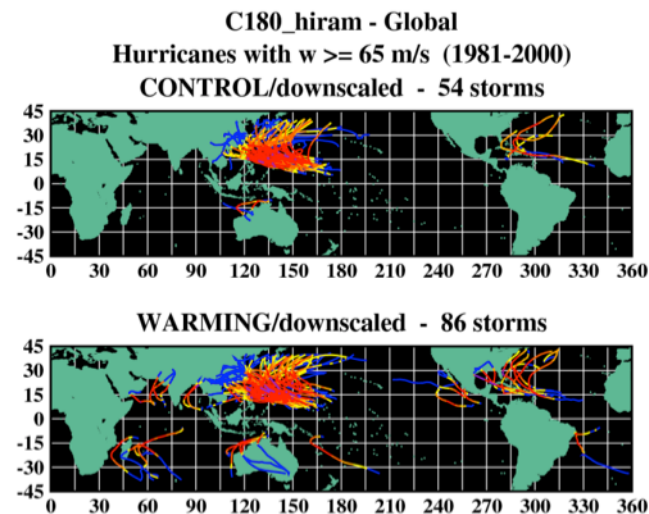
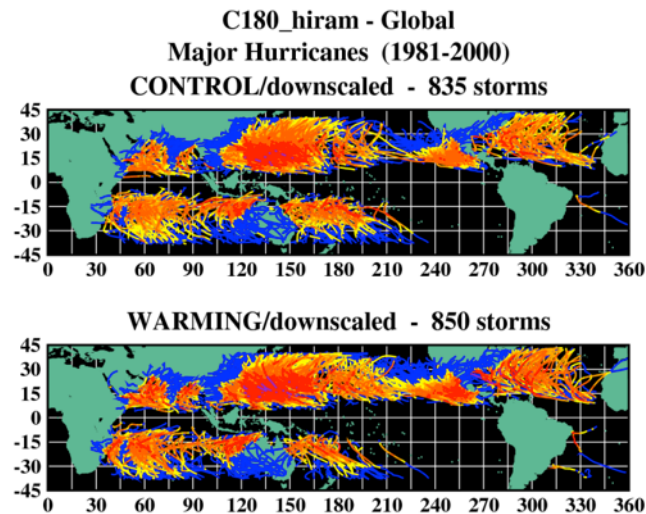
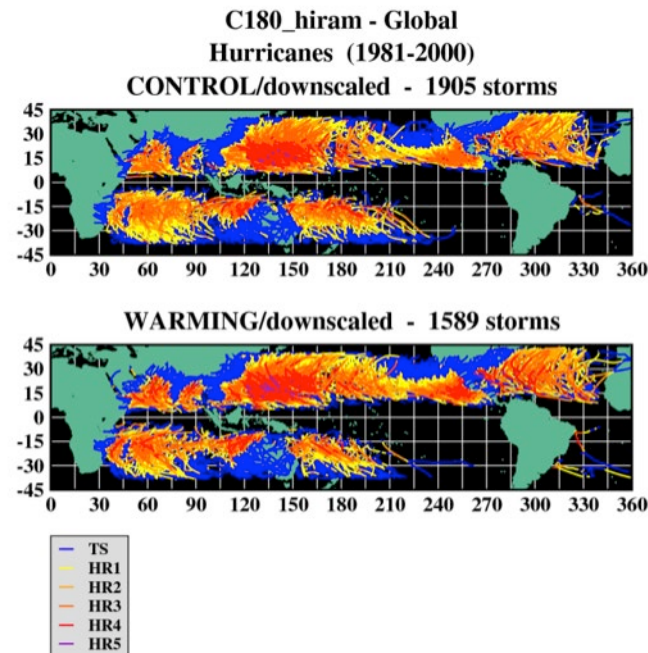
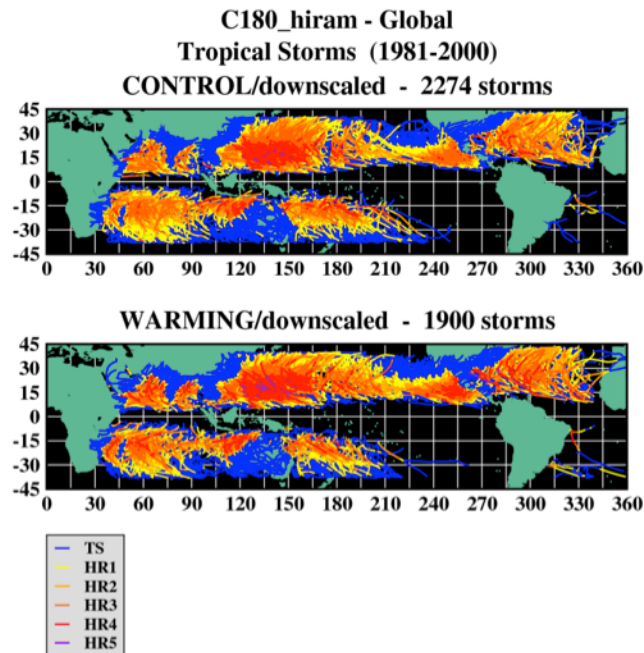
Storm
Category:

- TS
- HR1
- HR2
- HR3
- HR4
- HR5

C180_HR/GFDL2012h (3031)



CMIP5/RCP4.5 Late 21st Century Projection



Atlantic TC projections for late 21st century:

Tropical storm frequency: In the Atlantic, GFDL downscaling approaches support a reduced frequency (~-25%, range 0 to -50%)), but the projected range is even wider across a range of studies (-70% to +40%). Relative SST statistically describes this variation across dynamical model projections fairly well ($r^2=0.55$).

Hurricane intensity: Our models simulate about 5% increase in lifetime maximum intensity (range -4 to +11%).

Frequency of intense hurricanes: does not behave like overall TC frequency. Our model projects +87% for CMIP3 (range -90 to +240%); for CMIP5 it projects +45% (Early 21st) and +39% (Late 21st) though only marginally significant.

Tropical cyclone precipitation: robust increase in rate in model projections. Simulated increase is at a rate expected from Clausius-Clapeyron (total water vapor) or about +11% at 200-400 km radius, but with higher percentage increase (~+30%) closer to the storm center (50-150km). For 100 km radius the range of changes across the models was: -3 to +38%.

Tropical Cyclones and Climate Change

- Tropical cyclones can be extremely damaging
 - Cyclone Nargis (2008; Myanmar; 138,000 deaths)
 - Hurricanes Katrina (\$130B), Sandy (NY/NJ), Iniki (Hawaii)
 - SuperTyphoon Haiyan (2013; Philippines; 6200+ deaths)
- Sea-level rise a concern; here we focus on changes in storm characteristics with climate warming
- No detectable influence yet of greenhouse warming on TC (e.g., long-term trends).
- Atlantic Basin projections study: see Journal of Climate (Sept. 2013)
- Today's talk: Preliminary results of new global study

TROPICAL CYCLONES SUMMARY ASSESSMENT:

Detection and Attribution:

It remains uncertain whether past changes in any tropical cyclone activity (frequency, intensity, rainfall, etc.) exceed the variability expected through natural causes, after accounting for changes over time in observing capabilities.

Source: WMO Expert Team on Climate Change Impacts on Tropical Cyclones. February 2010

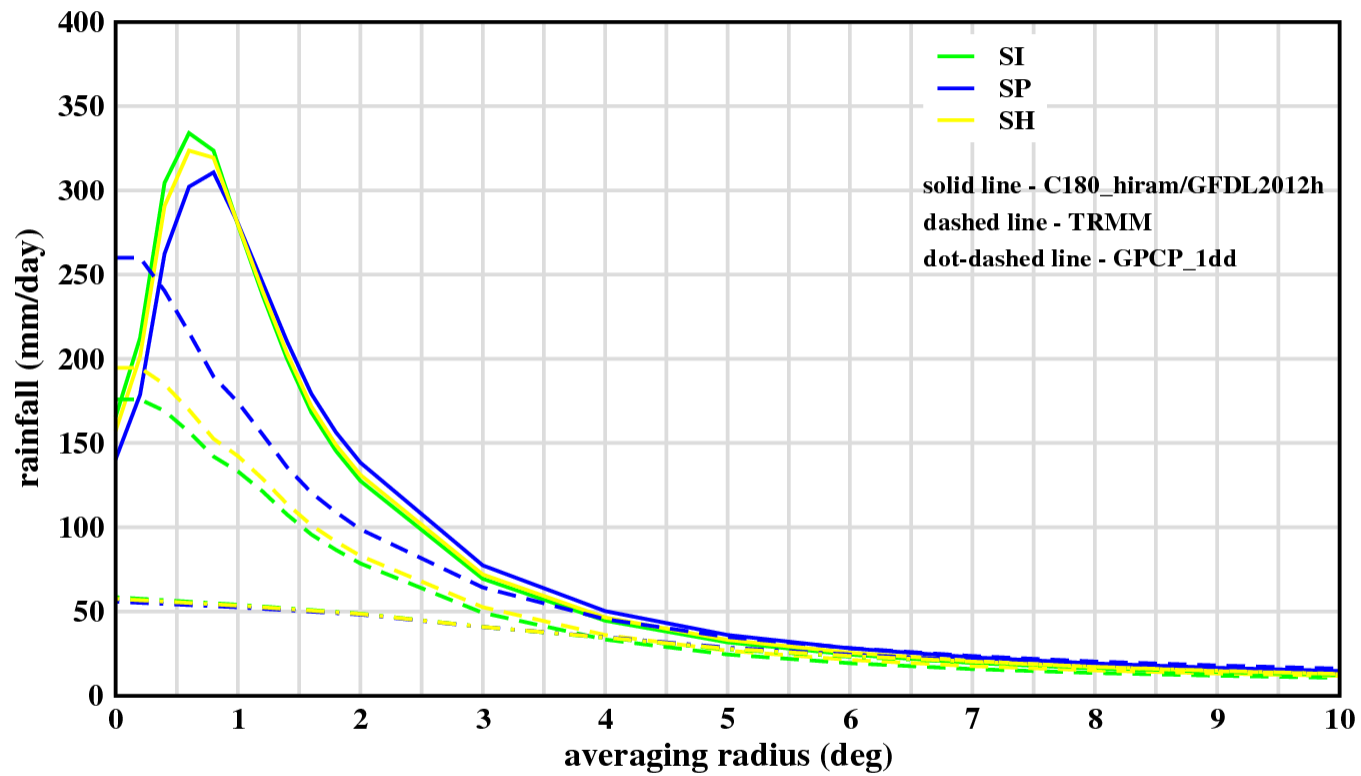
Future Climate Projections-

Some notes on ocean coupling

- GFDL hurricane model includes a three-dimensional ocean component to simulate cool wakes and their interaction with the storm. We are one of just a few groups that attempt to incorporate this effect in our TC/climate change studies for high-resolution (intense TC) simulations.
- Knutson, Tuleya, Shen, and Ginis (J. Climate 2001) found that while ocean coupling reduces storm intensity, the percent increase in TC intensity with climate warming is about the same with or without ocean coupling. Based on CO₂-warming experiment with GFDL R30 coupled model.
- Vertical structure of ocean temperature change: Ensemble mean SST change from CMIP5 climate models is initially applied uniformly over the observed climatological ocean mixed layer depth (MLD, where $SST - T_{ocn}$ reaches 0.5°C). The change tapers to zero below the MLD. The tapering also affects temperatures in the mixed layer, reducing the MLD compared to control conditions. {CHECK ON THIS PROCEDURE TO CONFIRM DETAILS}

TC Composites

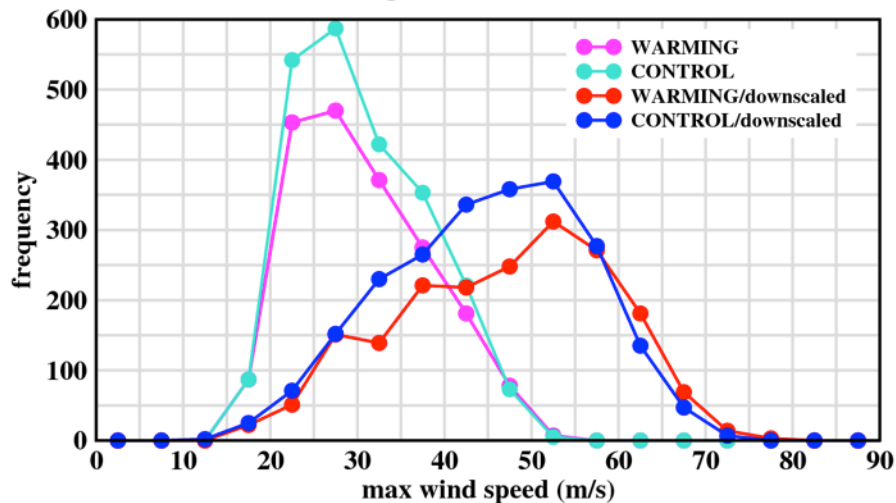
Area averaged rainfall - Southern Hemisphere



CMIP5/RCP4.5 Late 21st Century Projection

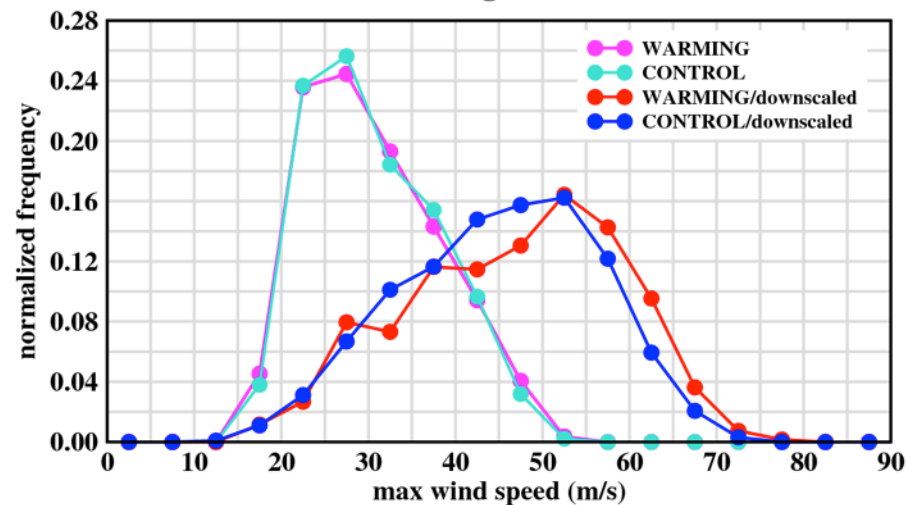
C180_hiram

Global Tropical Storms (1981-2000)
histograms of max wind

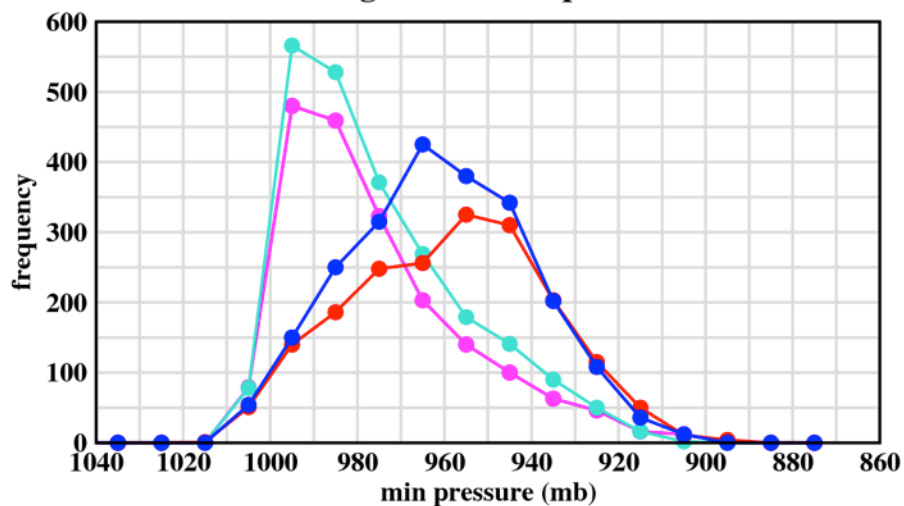


C180_hiram

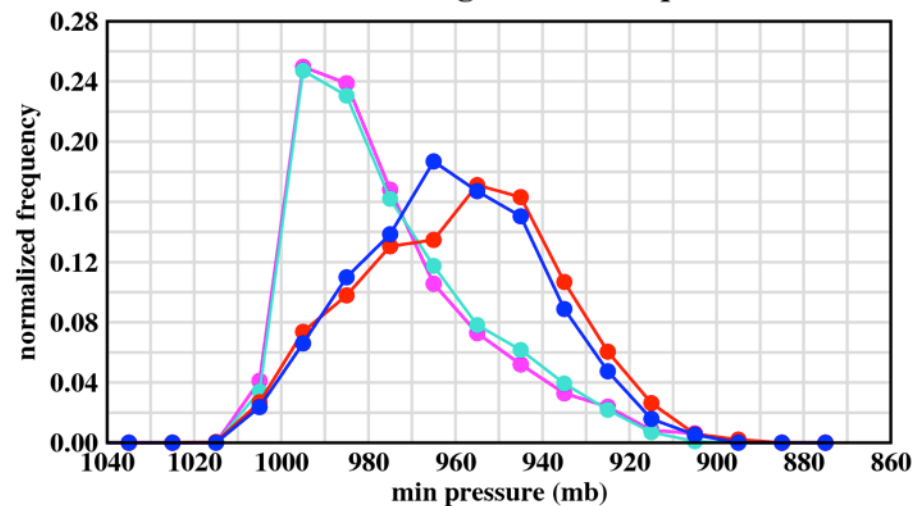
Global Tropical Storms (1981-2000)
normalized histograms of max wind



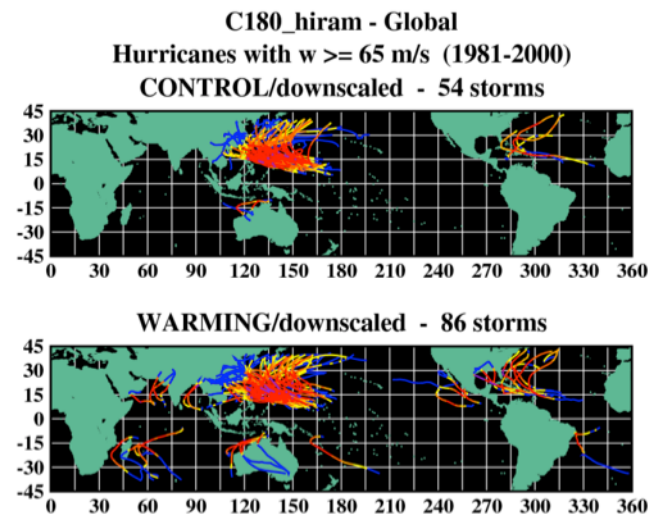
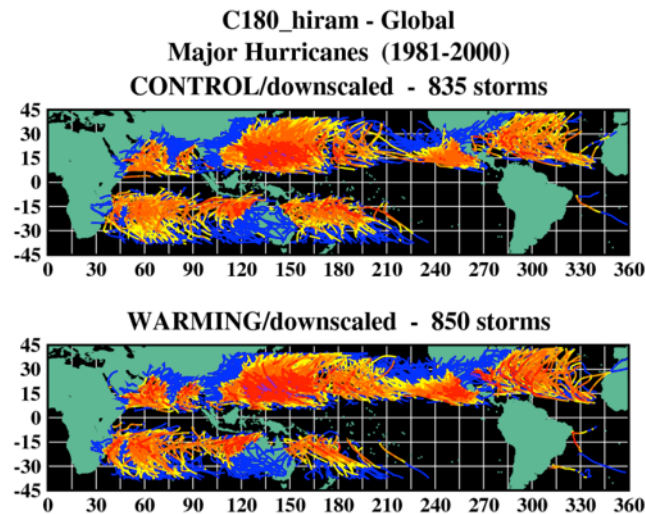
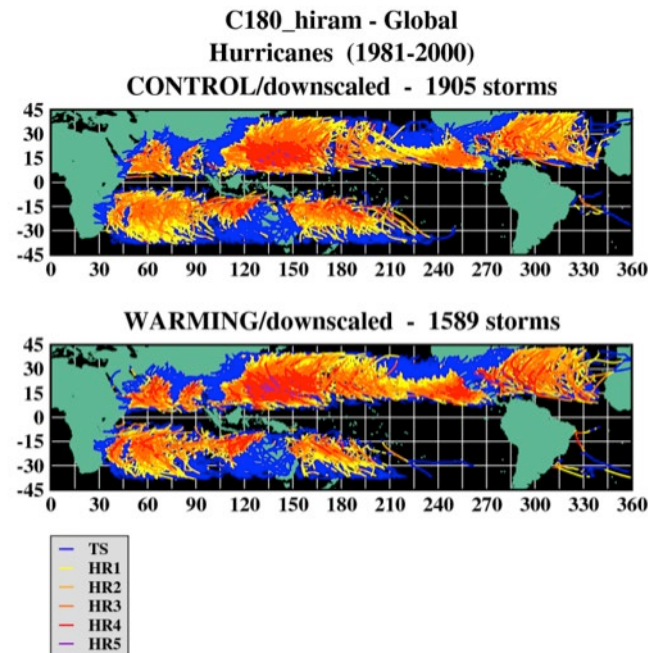
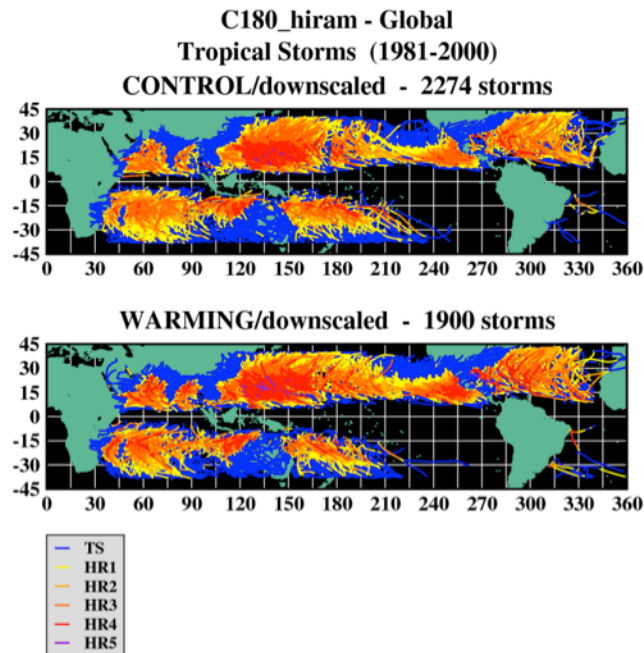
histograms of min pressure



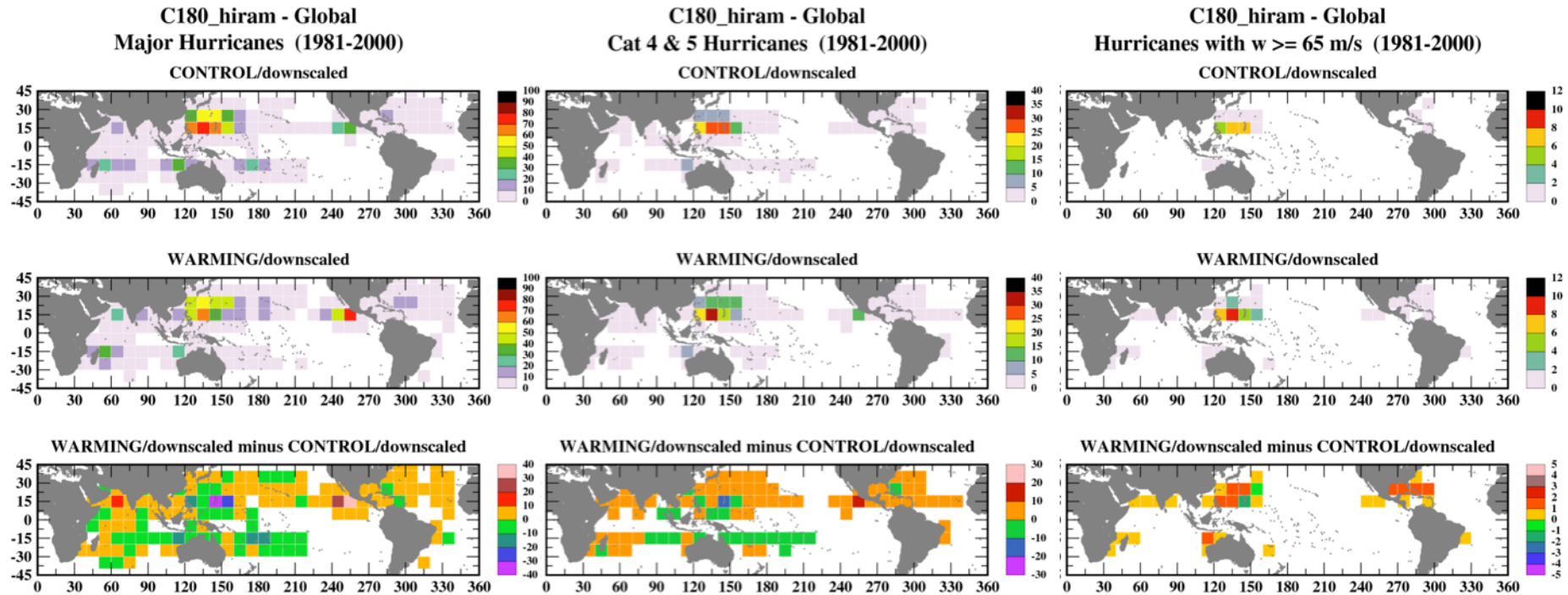
normalized histograms of min pressure



CMIP5/RCP4.5 Late 21st Century Projection

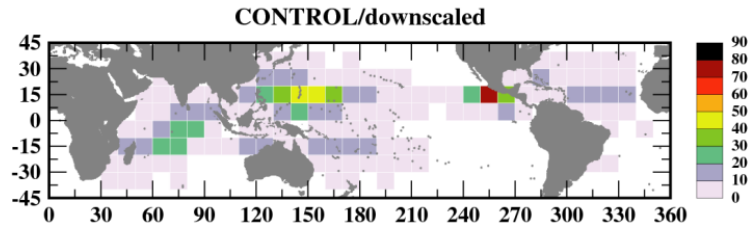


CMIP5/RCP4.5 Late 21st Century Projection: TC Occurrence

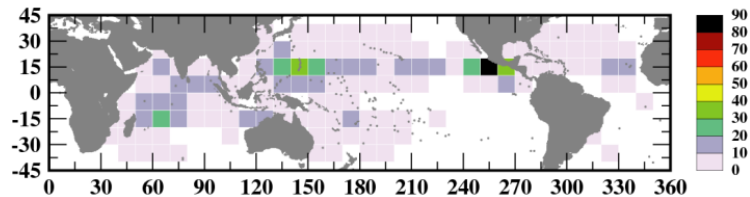


CMIP5/RCP4.5 Late 21st Century Projection: Tropical Storm Formation vs. Occurrence

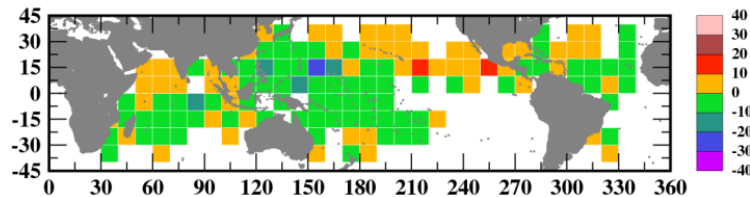
**C180_hiram - Global
Tropical Storm Formation (1981-2000)**



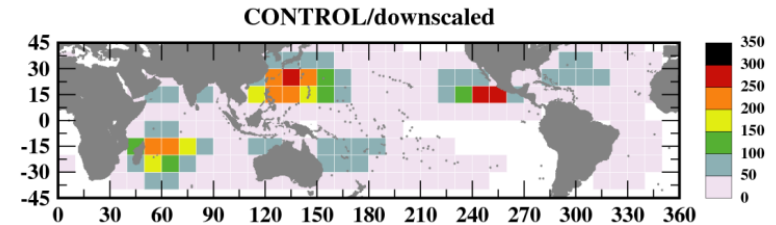
WARMING/downscaled



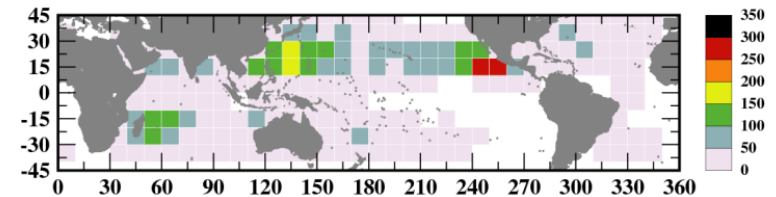
WARMING/downscaled minus CONTROL/downscaled



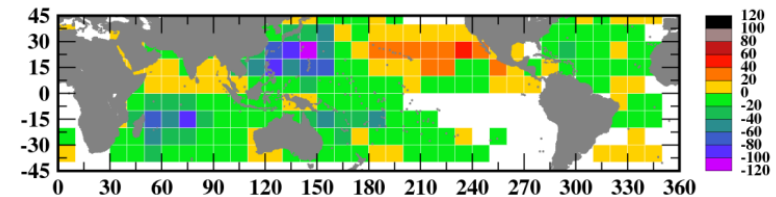
**C180_hiram - Global
Tropical Storm Occurrence (1981-2000)**



WARMING/downscaled

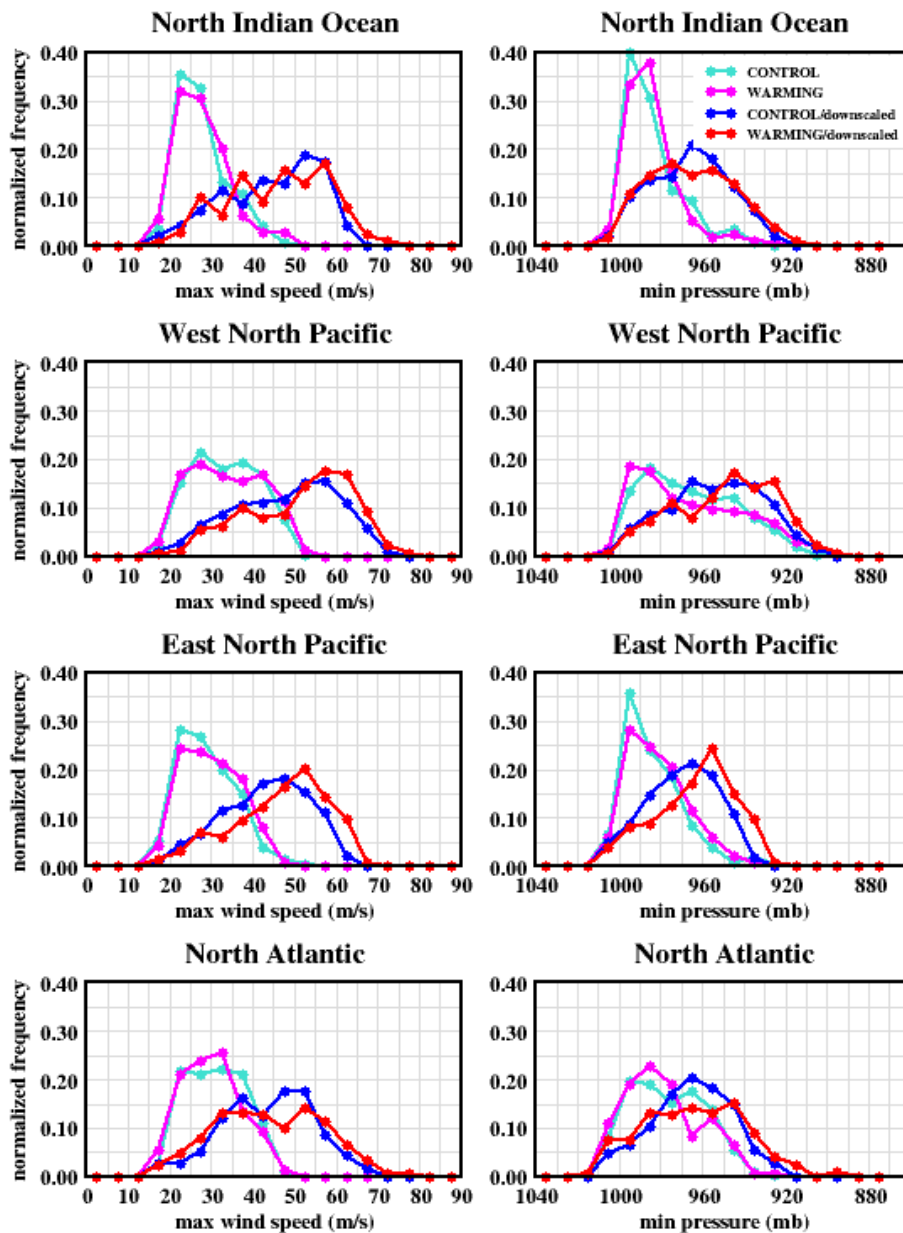


WARMING/downscaled minus CONTROL/downscaled



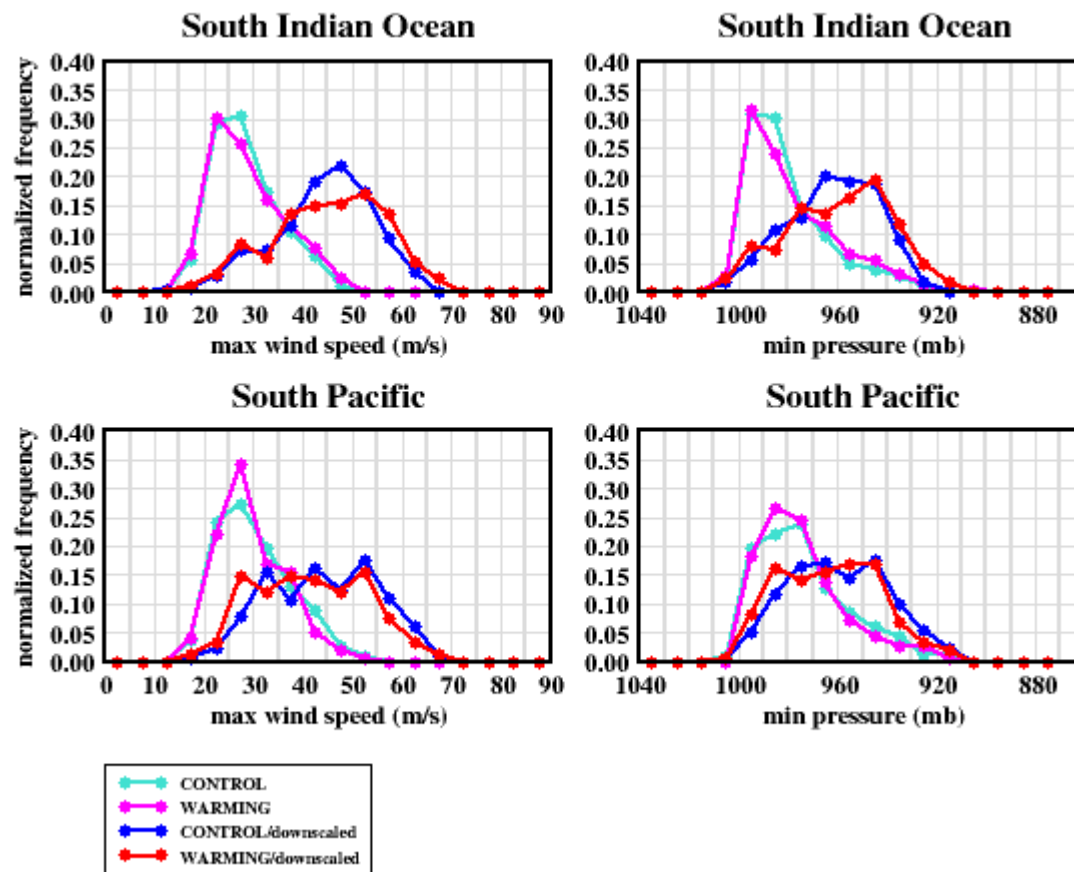
CMIP5/RCP4.5 Late 21st Century Projection

C180_hiram Normalized Histograms

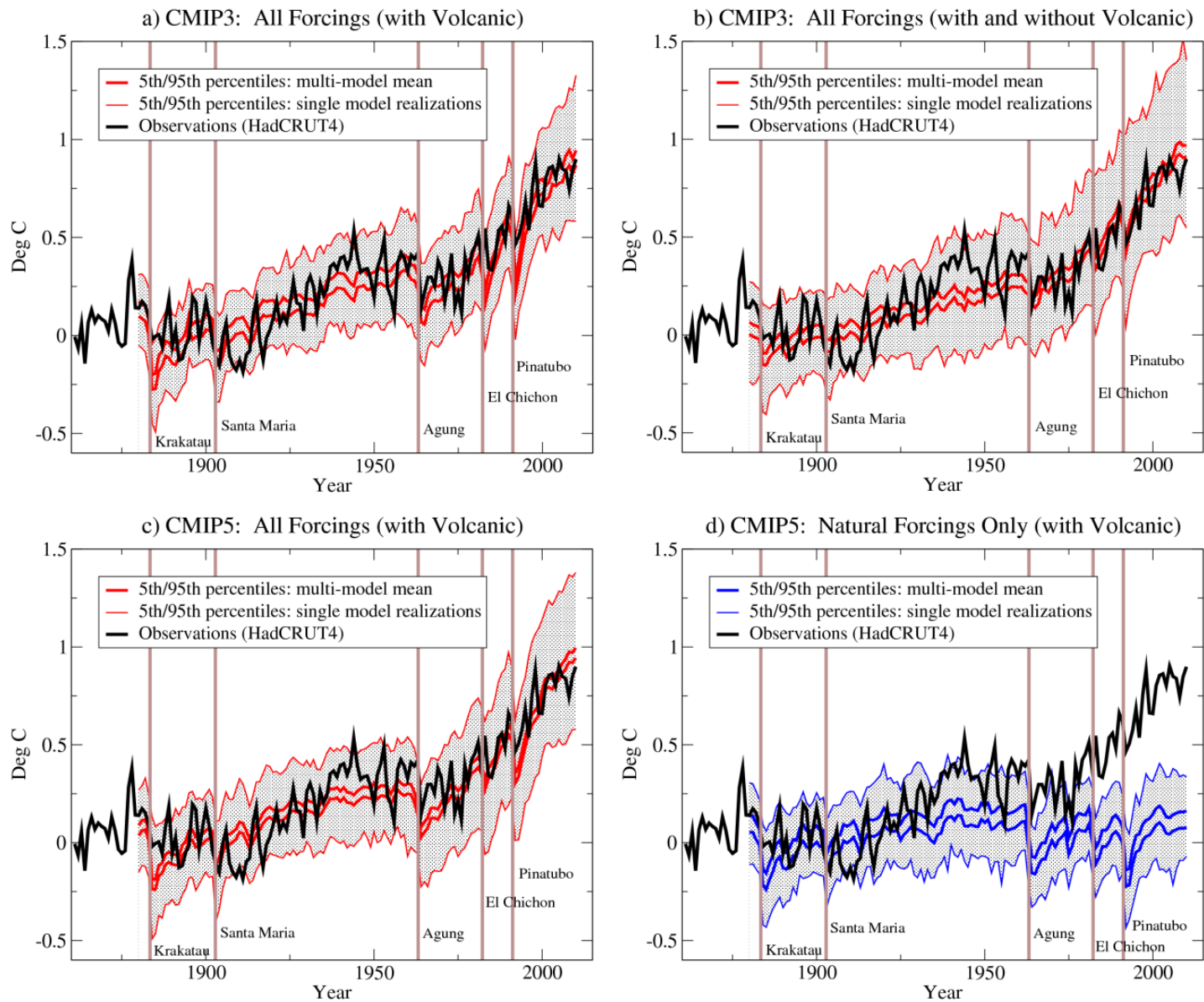


CMIP5/RCP4.5 Late 21st Century Projection

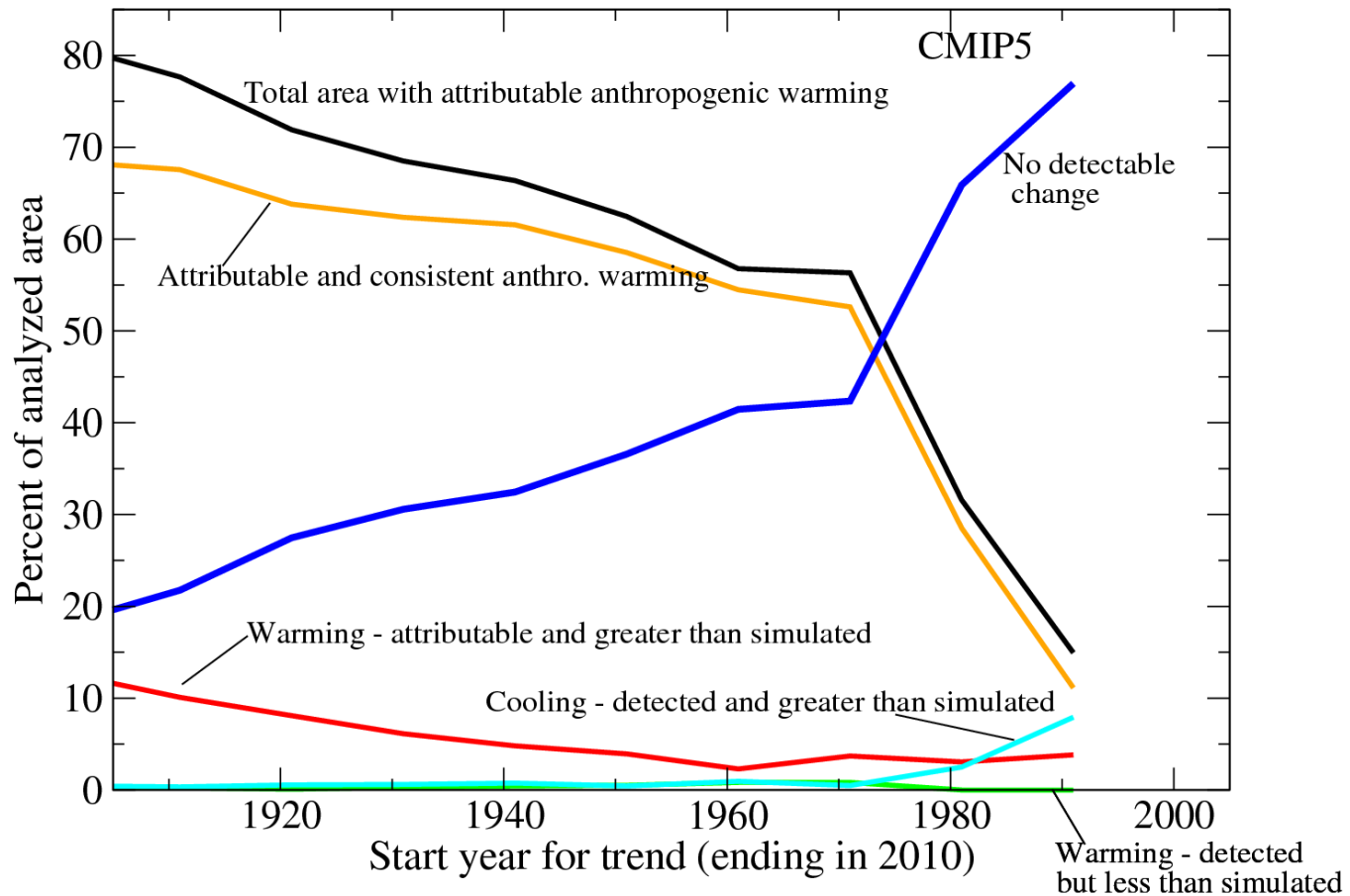
C180_hiram Normalized Histograms



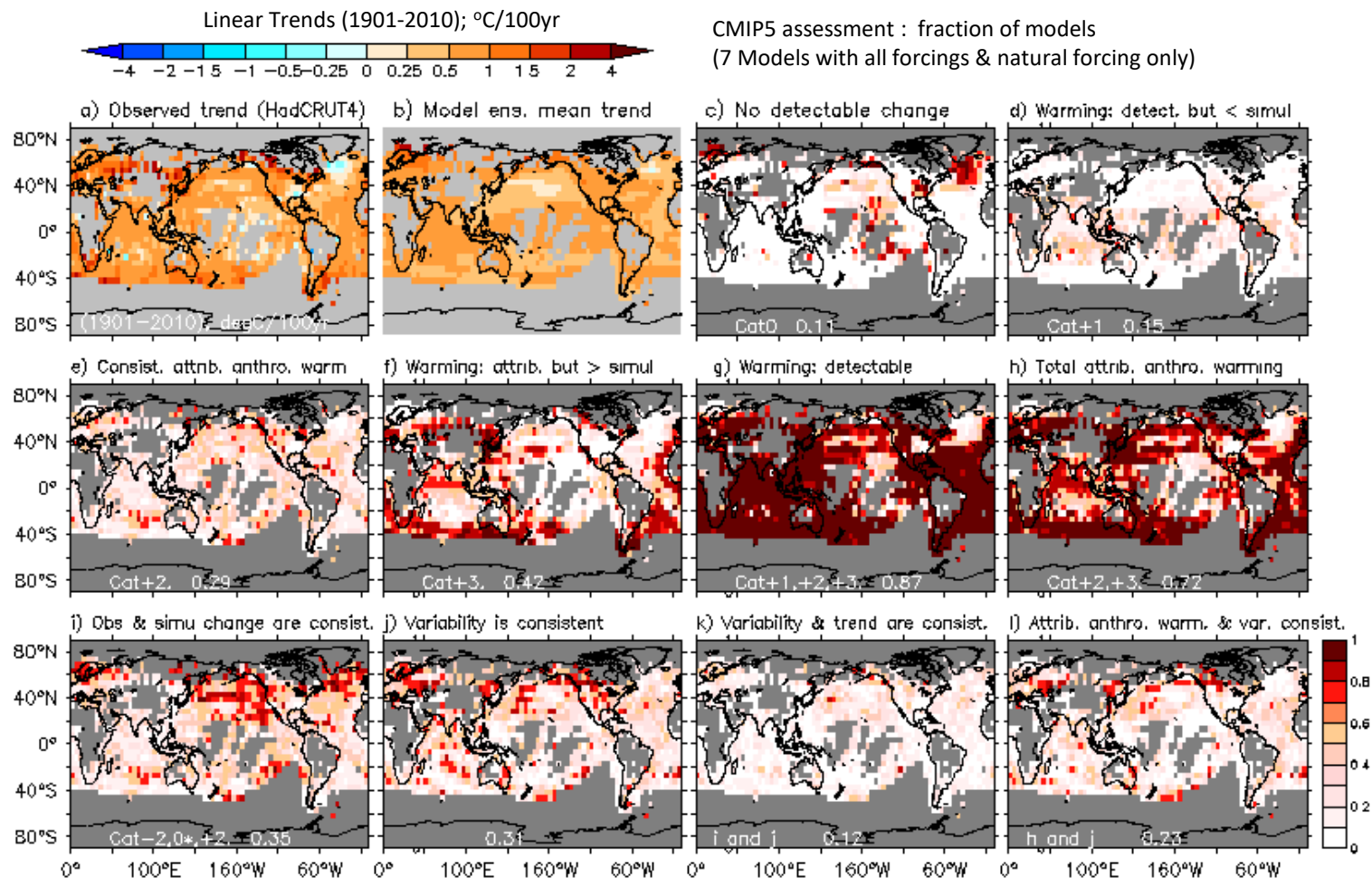
Global Mean Surface Temperature Anomalies



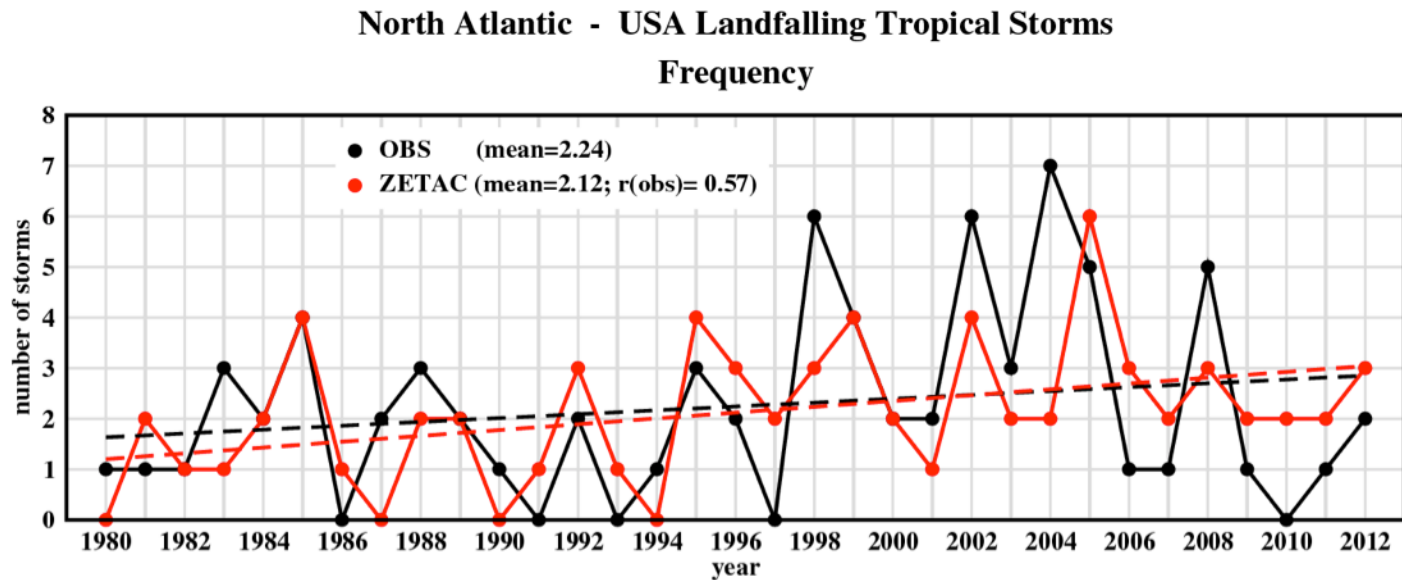
Comparison of CMIP5 ensemble mean trend (7-model subset) vs. Observations



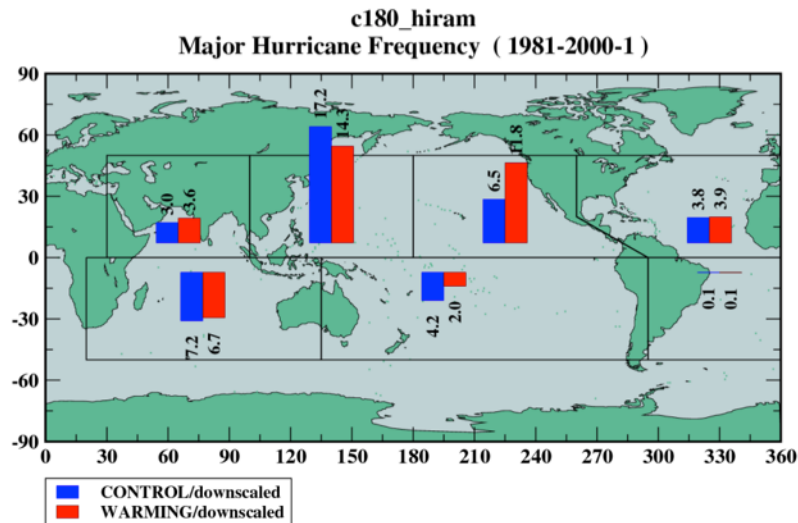
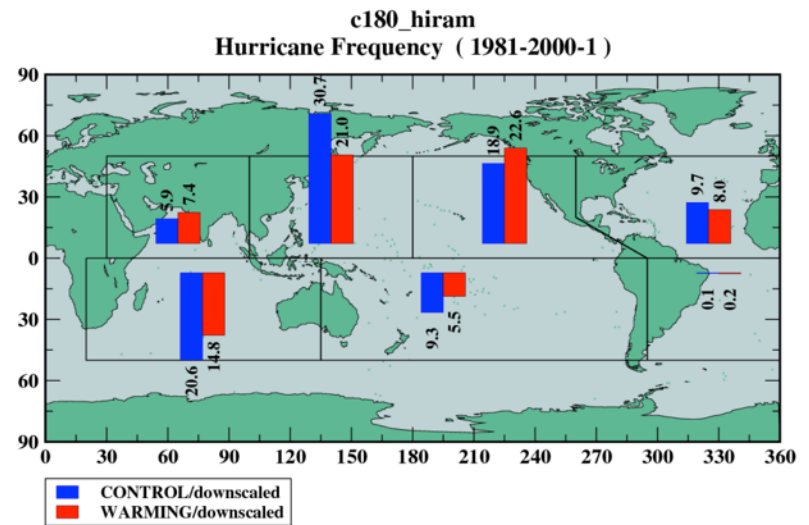
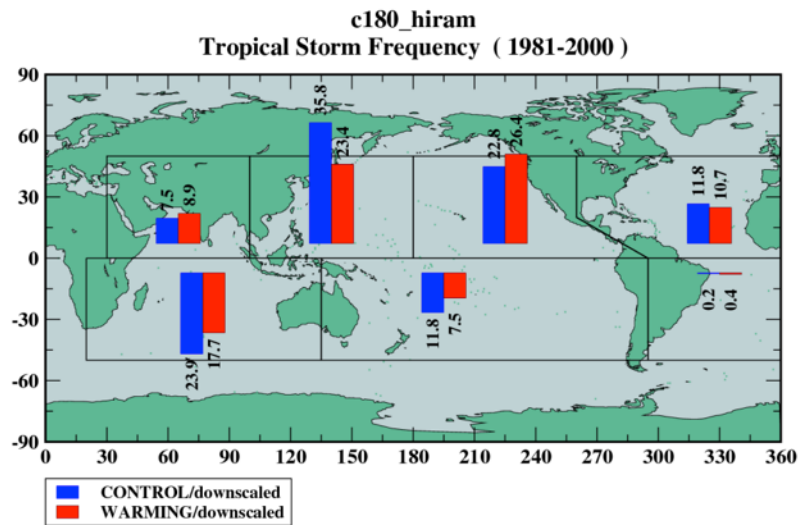
Fraction of CMIP5 models meeting certain detection/attribution criteria (7 CMIP5 Models with All-forcing runs & Natural Forcing Only runs)



Future work: Simulations of US landfalling tropical storms

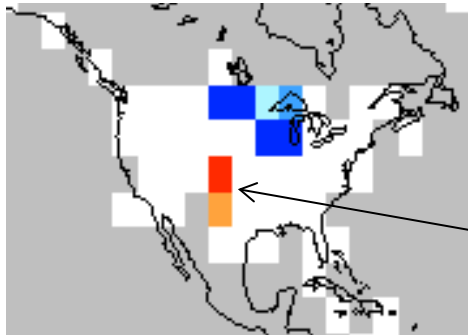


CMIP5/RCP4.5 Late 21st Century Projection

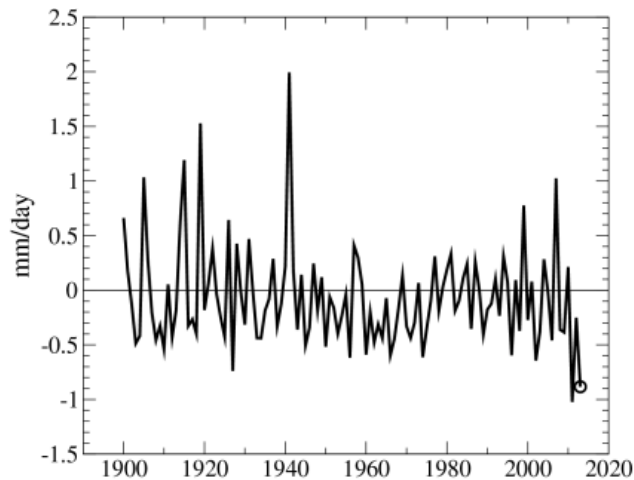


2013 Seasonal-Mean Precipitation Extremes: Climate Perspective

Mar.-May 2013 Extremes - Precipitation



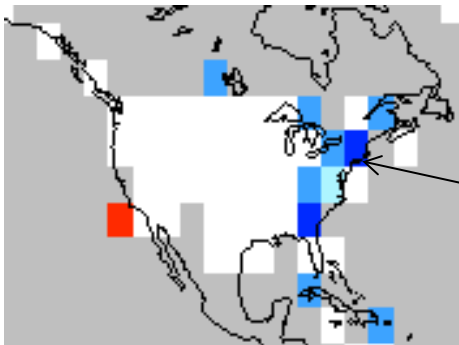
U.S. Southern Plains—Mar.-May



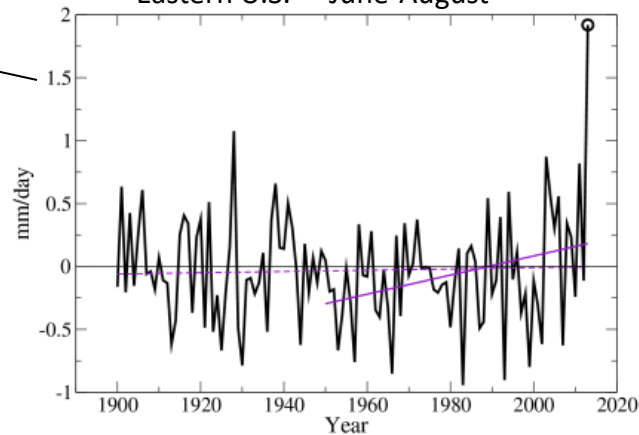
U.S. Southern Plains region—Mar.-May:

Non-significant trend;
Data inhomogeneities?

June-Aug. 2013 Extremes - Precipitation

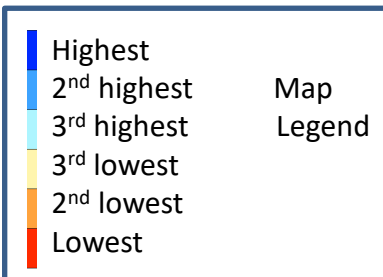


Eastern U.S. – June-August



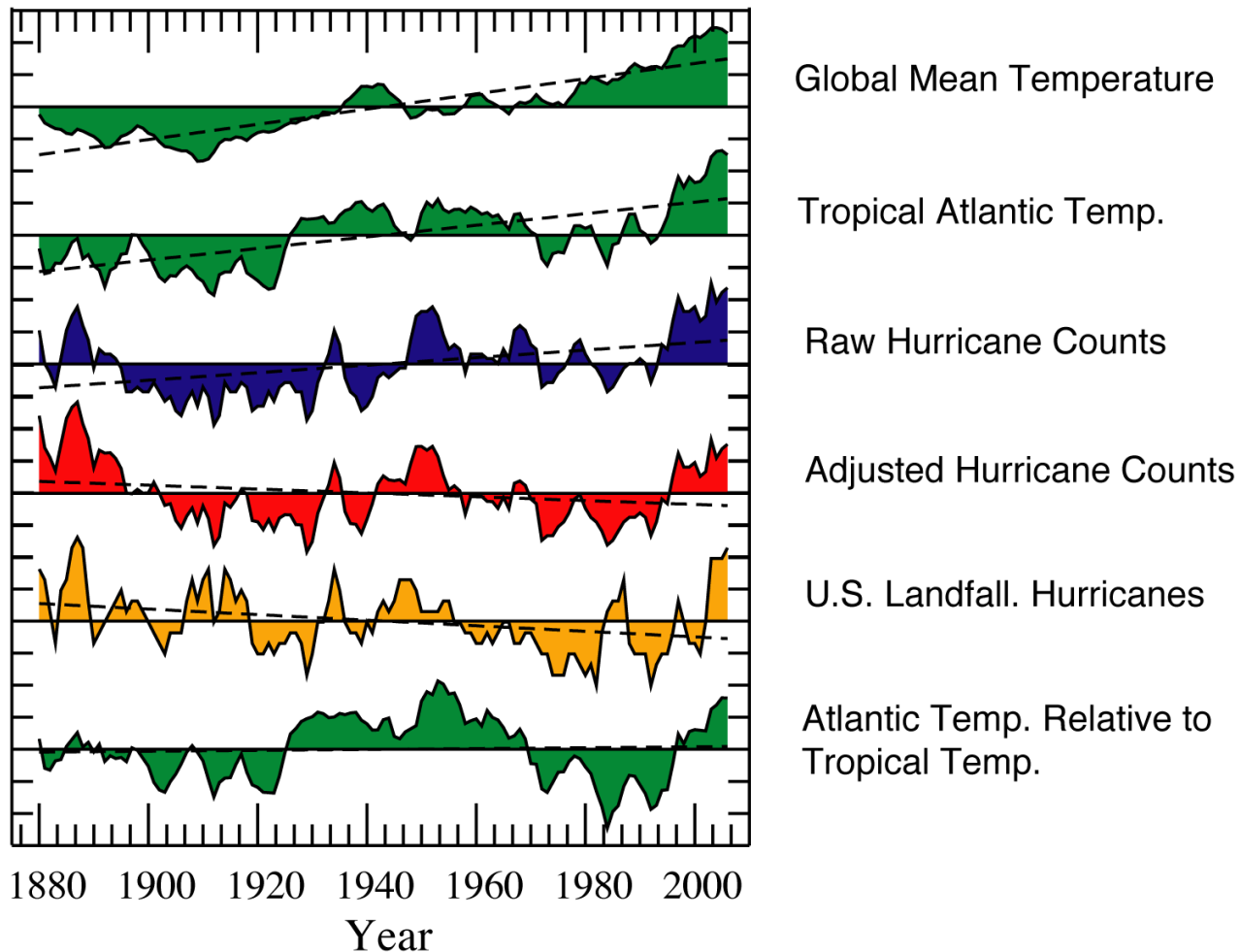
Eastern U.S. region -- JJA:

Non-significant trend from 1900;
Detectable trend from 1950 or later;
Detection not robust to excluding 2013
Trend attributable to Anthro. + Natural
Occurrence Ratio = 1.7 or undefined



Low confidence in long-term (centennial-scale) changes in TCs

Normalized Tropical Atlantic Indices



Source: Vecchi and Knutson, *J. Climate* (2011)

Future TC Projections: Atlantic Basin Methodology

- Simulate Atlantic tropical cyclone activity with 18 km grid regional atmospheric model (Zetac)
 - Observed SSTs and NCEP Reanalyses (1980-2008)
 - Control boundary conditions + CMIP3 or CMIP5/RCP4.5 Early and Late 21st century climate changes
- Downscale all individual storm cases into GFDL hurricane model (9-km grid, moveable mesh, with ocean coupling)

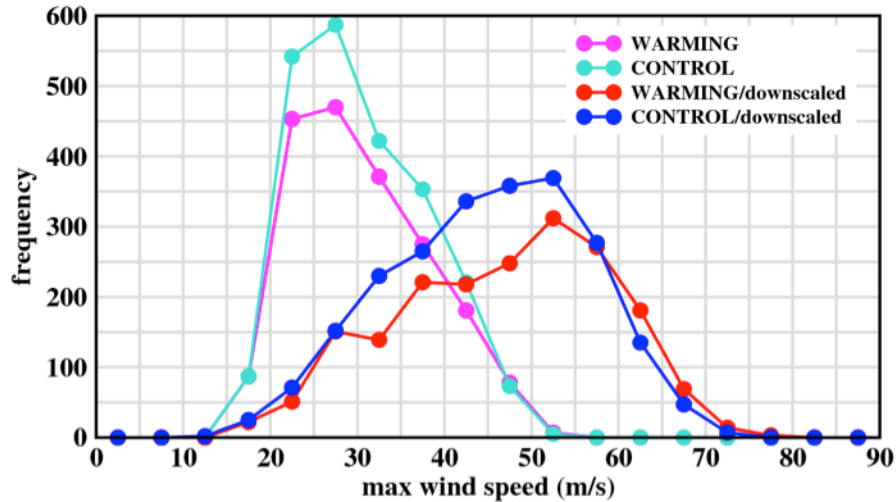
Future TC Projections: Global Methodology

- Simulate global tropical cyclone activity with 50 km grid atmospheric model (HiRAM C180)
 - Observed SSTs (1980-2008)
 - Climatological SSTs
 - Climatological SSTs + CMIP5/RCP4.5 Late 21st century climate change
- Downscale all individual storm cases into GFDL hurricane model (6-km grid, moveable mesh, with ocean coupling)

CMIP5/RCP4.5 Late 21st Century Projections

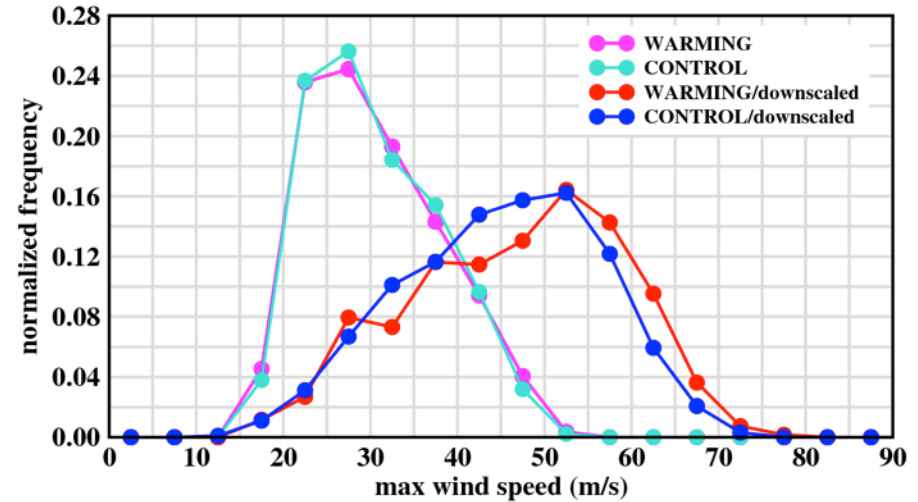
C180_hiram

Global Tropical Storms (1981-2000)
histograms of max wind



C180_hiram

Global Tropical Storms (1981-2000)
normalized histograms of max wind



Mean maximum windspeed changes for storm intensity of at least:

Tropical storms: Global: **+3.6%** [range: -5.6% (Southwest Pac) to +8.2% (NE Pac.)]

Hurricanes: Global: **+4.1%** [range: -3.1% (Southwest Pac.) to +7.8% (NE Pac.)]

Aggregate activity:

Power Dissipation Index: Global: **-9.7%**

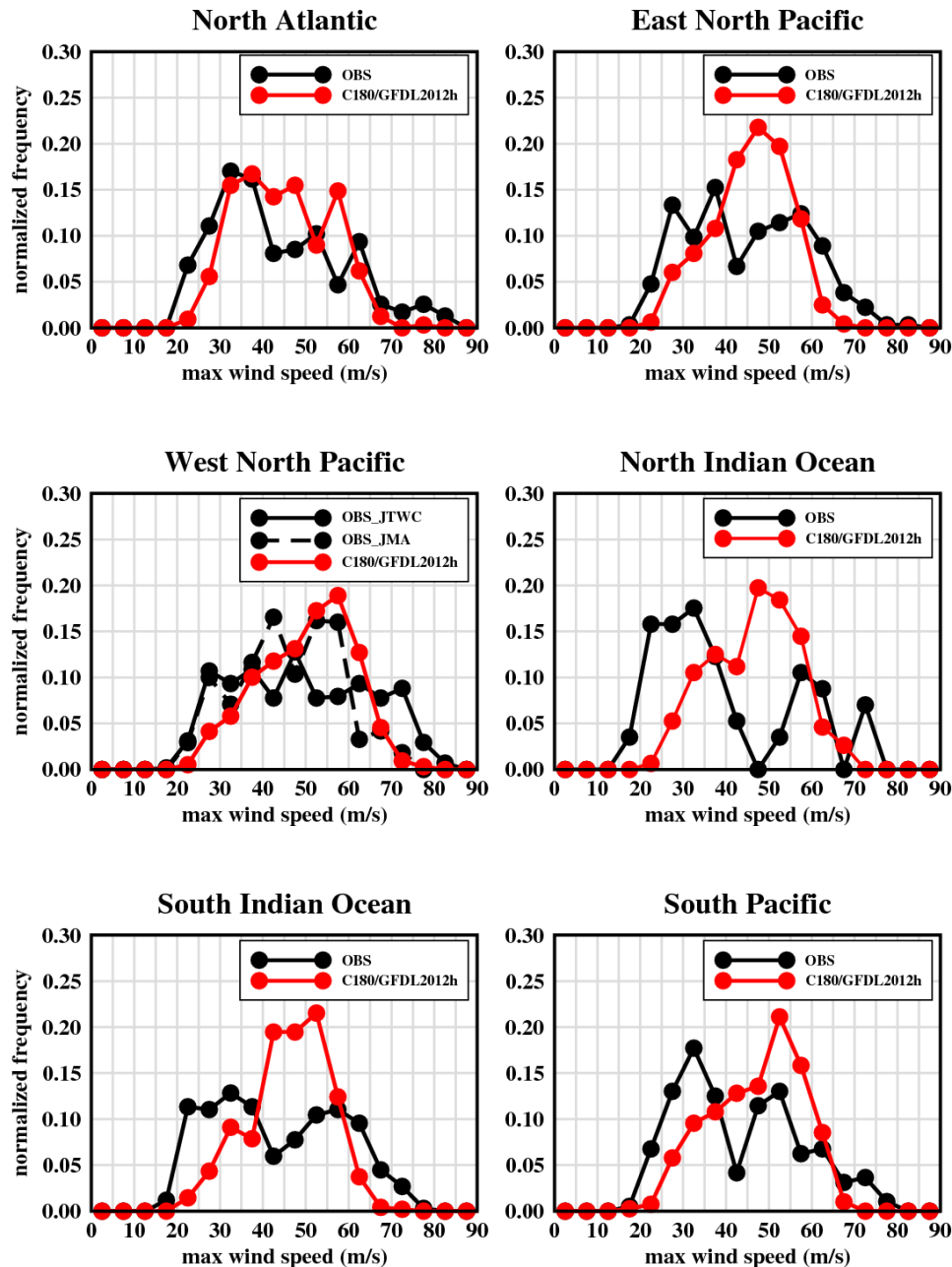
Cat 4-5 storm days: Global: **+34.5%**

Global Frequency: Tropical storms: **-16%** [range: -37% (Southwest Pac) to +27% (N. Ind.)]

Cat 4-5 storms: **+24%** [range: -58% (Southwest Pac) to +340% (NE Pac.)]

Normalized histograms of max wind tropical storms (1980-2008)

Present-Day Climate

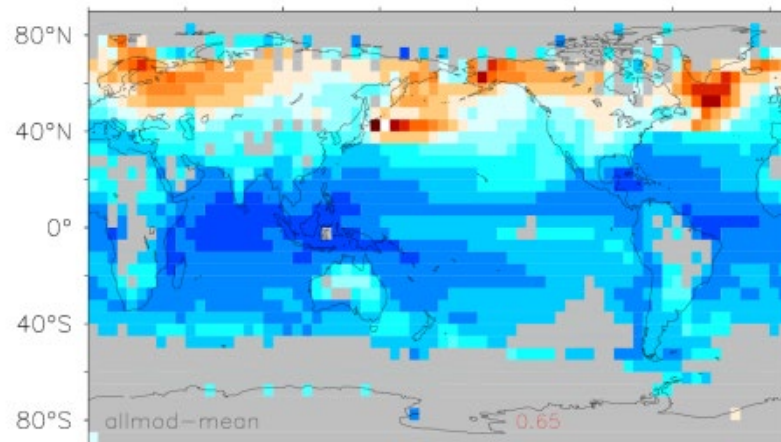


Preliminary Conclusions: Global TC Projections

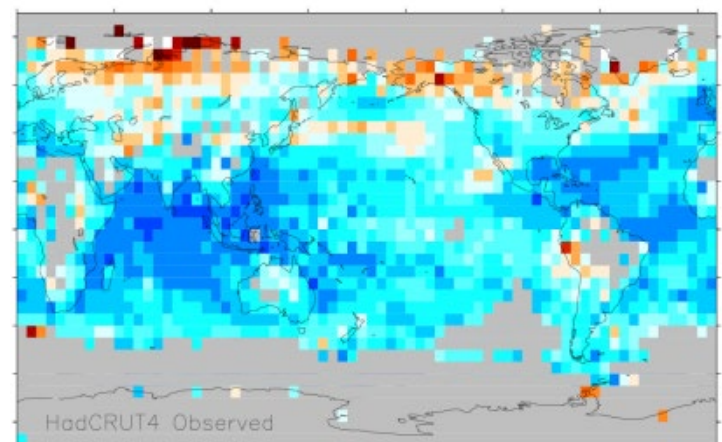
1. GFDL downscaling models continues to project:
 - decrease in global tropical cyclone frequency: -16%
 - increase in the occurrence of the most intense tropical cyclones (cat 4-5): +24%
 - increase in the average maximum intensity of tropical cyclones: +4%
 - increase in the precipitation rates (100 km radius) near tropical cyclones: +14%
2. These projections vary considerably by basin:
Cat 4-5 frequency increases +24% globally; +42 in North Atlantic; +340% in NE Pacific; +200% in N. Indian Ocean; but decreases by -6% in NW Pacific and -59% in SW Pacific.

St. Deviation of low-freq. (>10 yr) variability: Model vs. Observed*

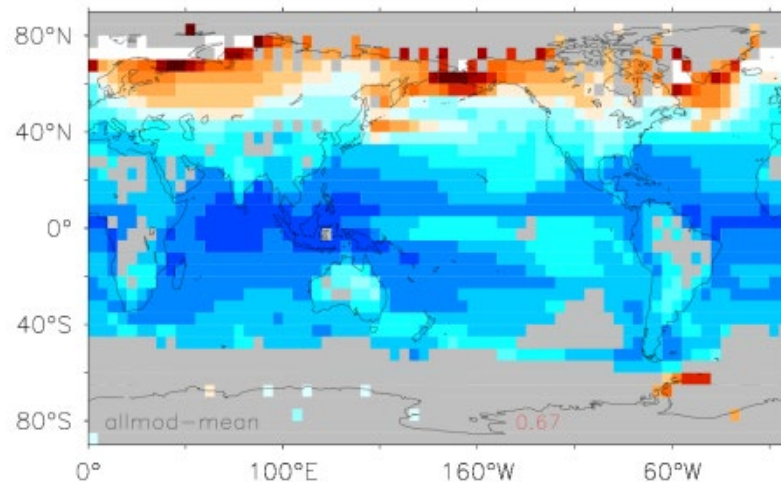
a) CMIP3: 8-model-avg.



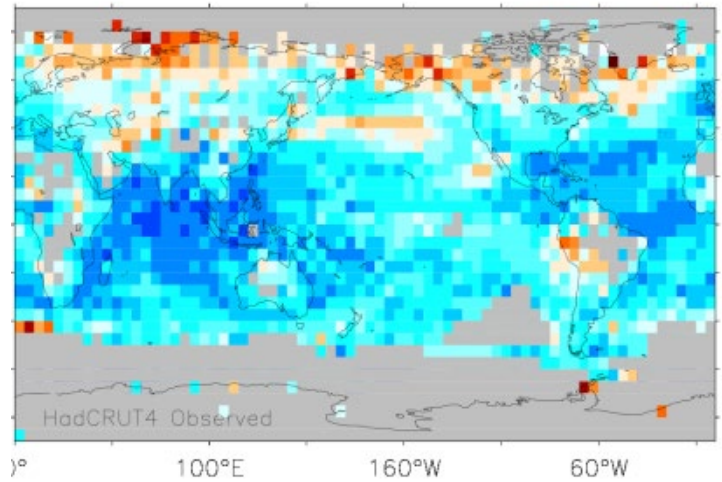
b) Obs. St. Dev.* (CMIP3)



c) CMIP5: 23-model-avg



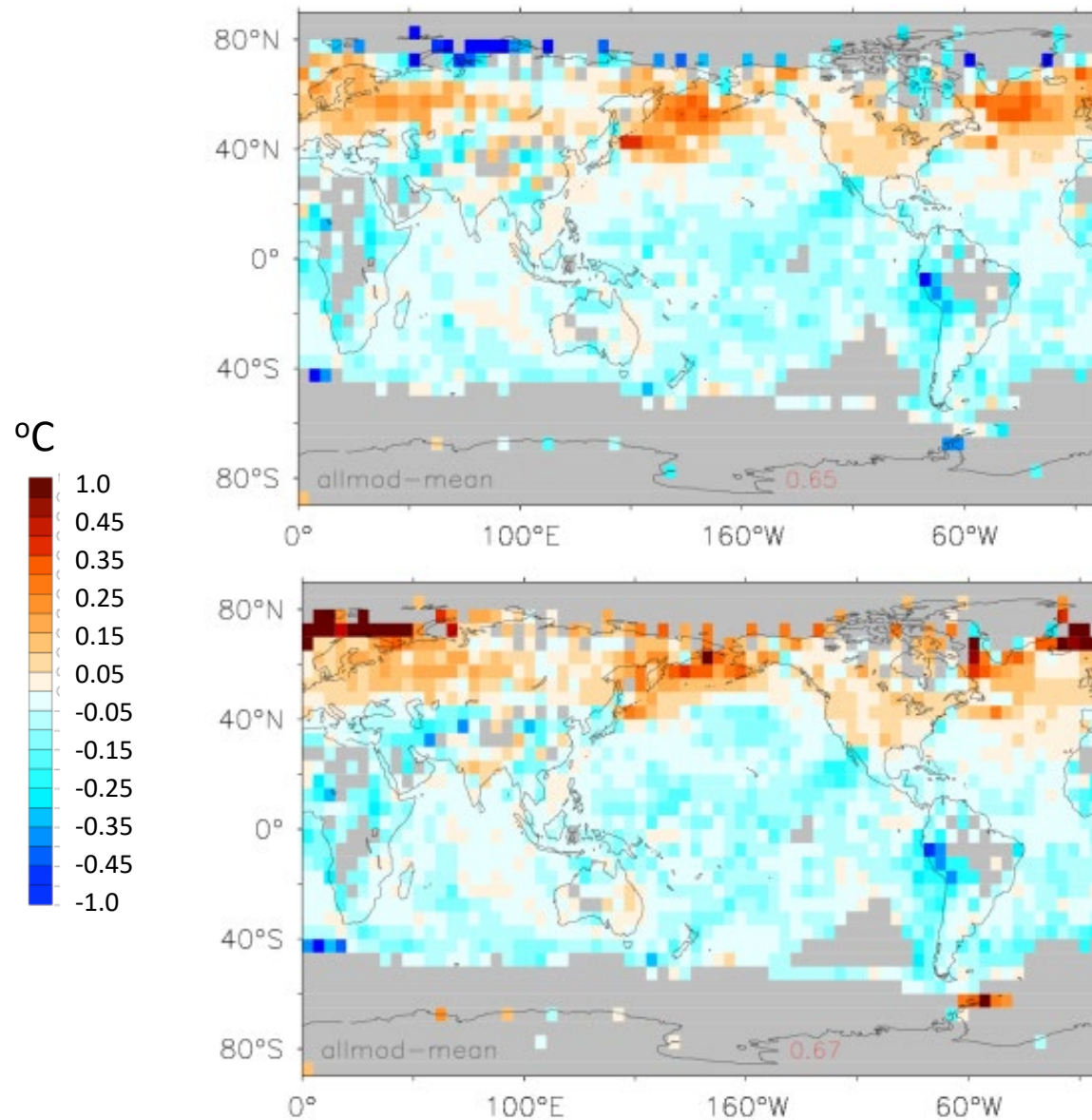
d) Obs. St. Dev.* (CMIP5_23)



Notes: Model estimate is from control runs; observed estimate is based on the residual with All-Forcing ensemble mean subtracted. An additional adjustment was made to reduce the systematic error due to the computation method for creating the residual. We let each ensemble member substitute for observations in the computation procedure.

Source: Knutson, Zeng, and Wittenberg; J. Climate 2013.

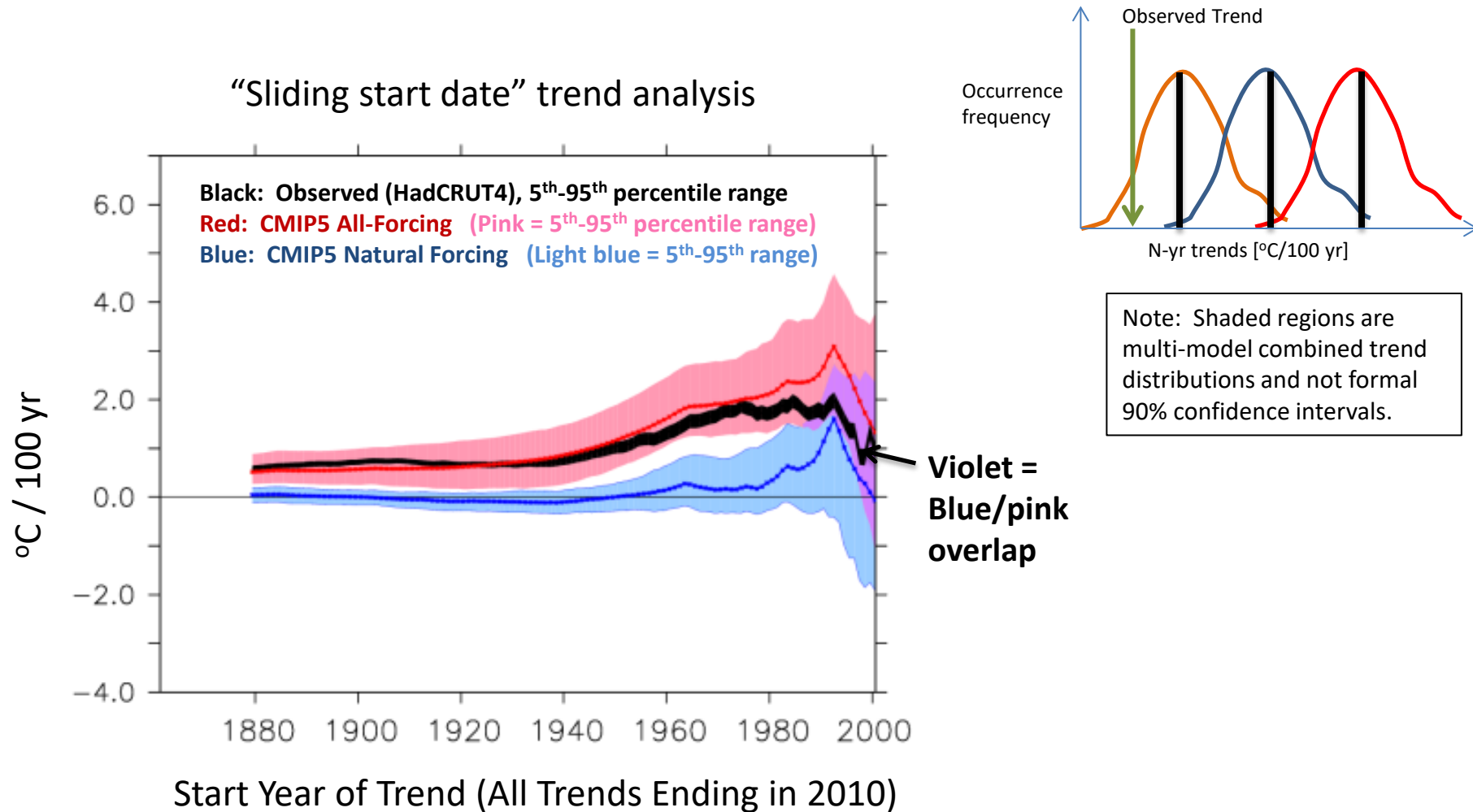
St. Deviation of low-freq. (>10 yr) variability: Model – Observed*



CMIP3: 8 models

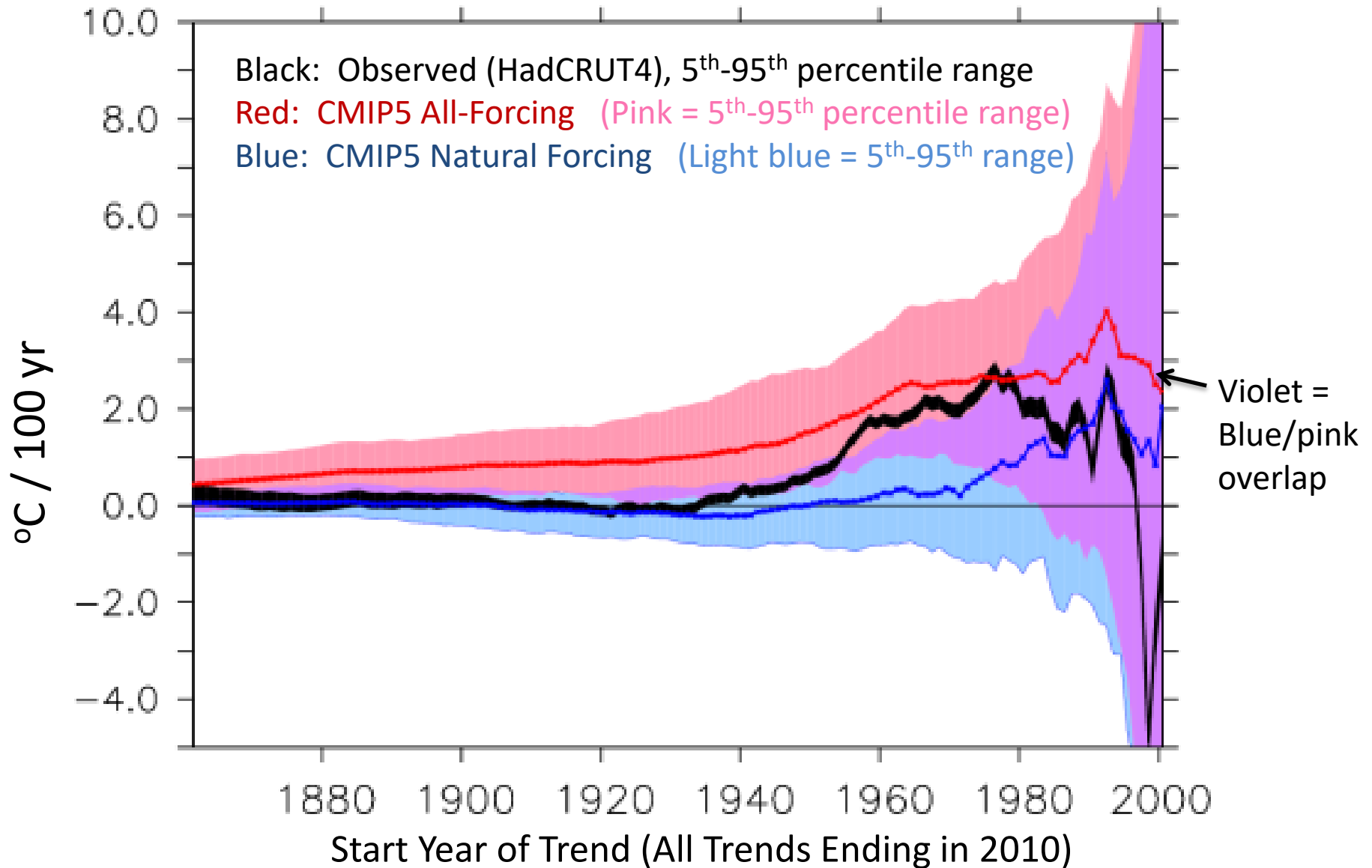
CMIP5: 23 models

Global temperature attribution analysis: CMIP5 7-model ensemble



Source: Knutson, Zeng, and Wittenberg, *J. Climate* (2013)

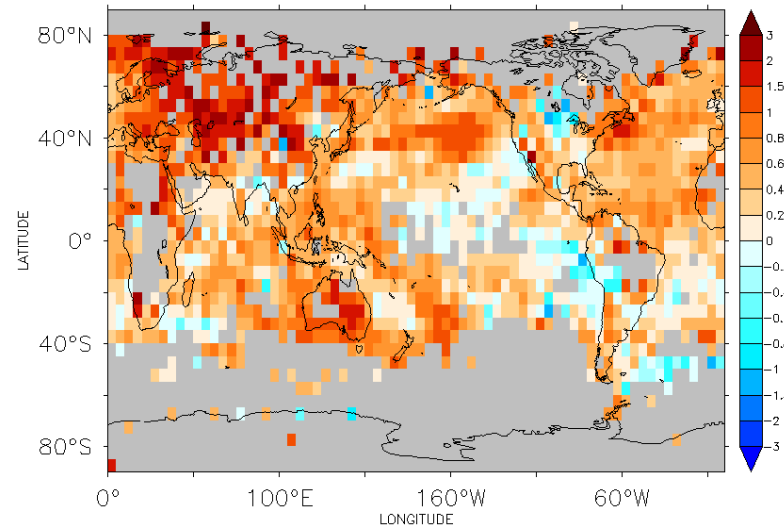
Southeast United States: Sliding Trend Analysis



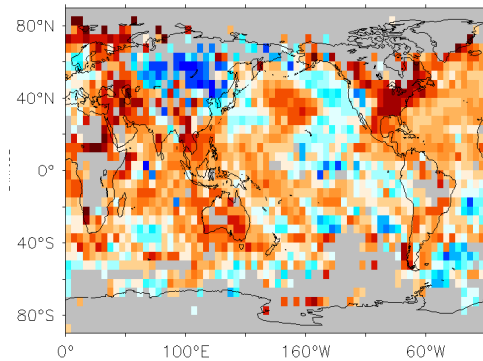
Explaining Extreme Events from a Climate Perspective...

Regional Surface Temperature anomalies for 2013

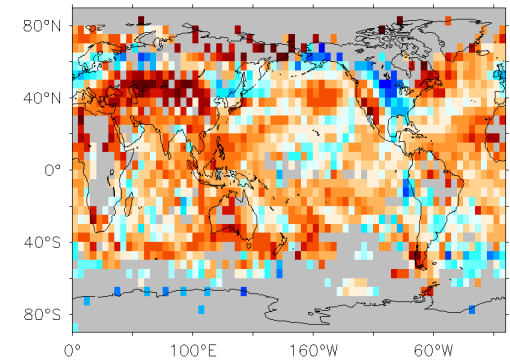
Annual 2013 anomalies



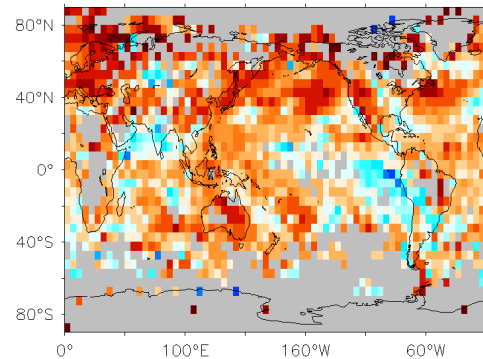
Dec.-Feb. 2013 anomalies



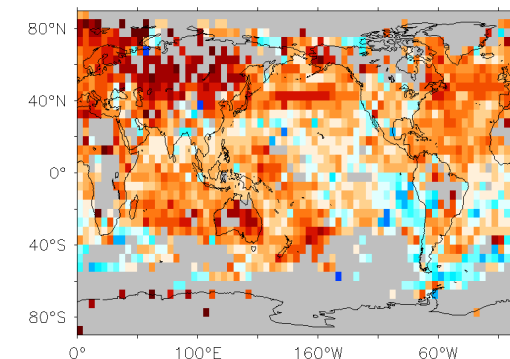
Mar.-May 2013 anomalies



June-Aug. 2013 anomalies

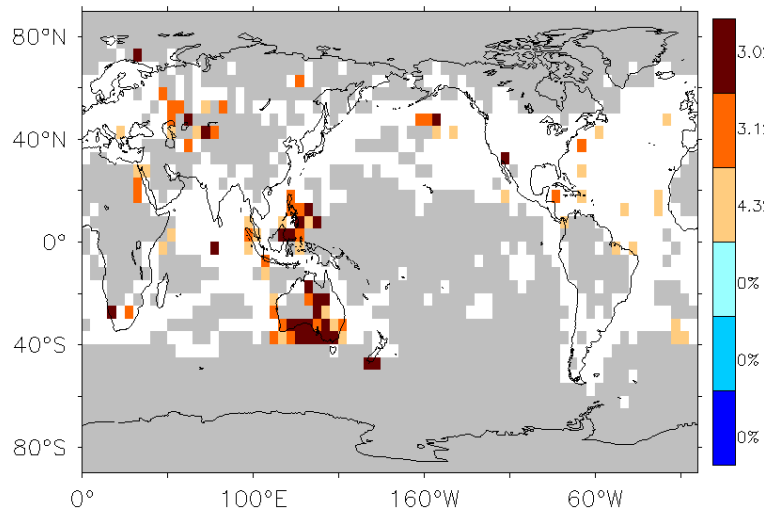


Sept.-Nov. 2013 anomalies



Surface temperature seasonal- or annual-mean extremes for 2013

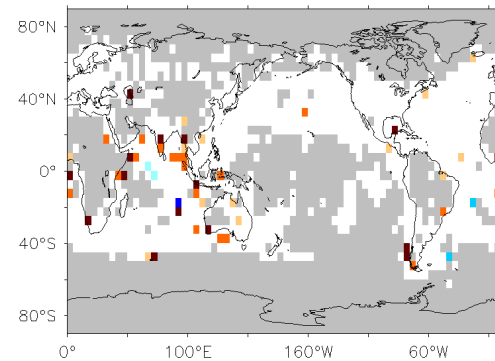
Annual means: 2013 extremes



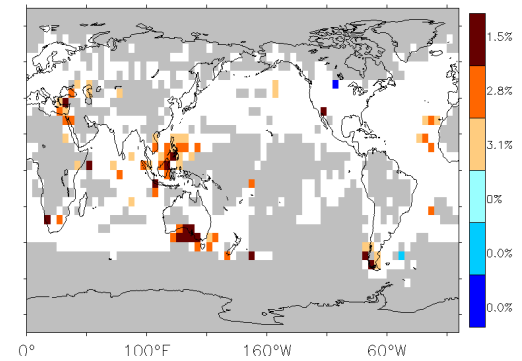
Map Legend

- Highest
- 2nd highest
- 3rd highest
- 3rd lowest
- 2nd lowest
- Lowest

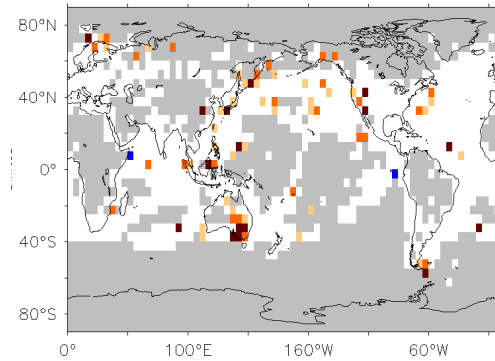
Dec.-Feb. 2013 seasonal extremes



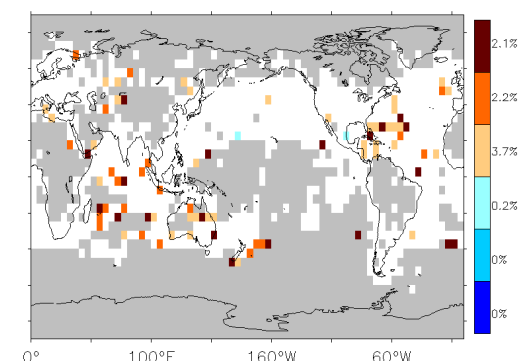
Mar.-May 2013 seasonal extremes



June-Aug. 2013 seasonal extremes

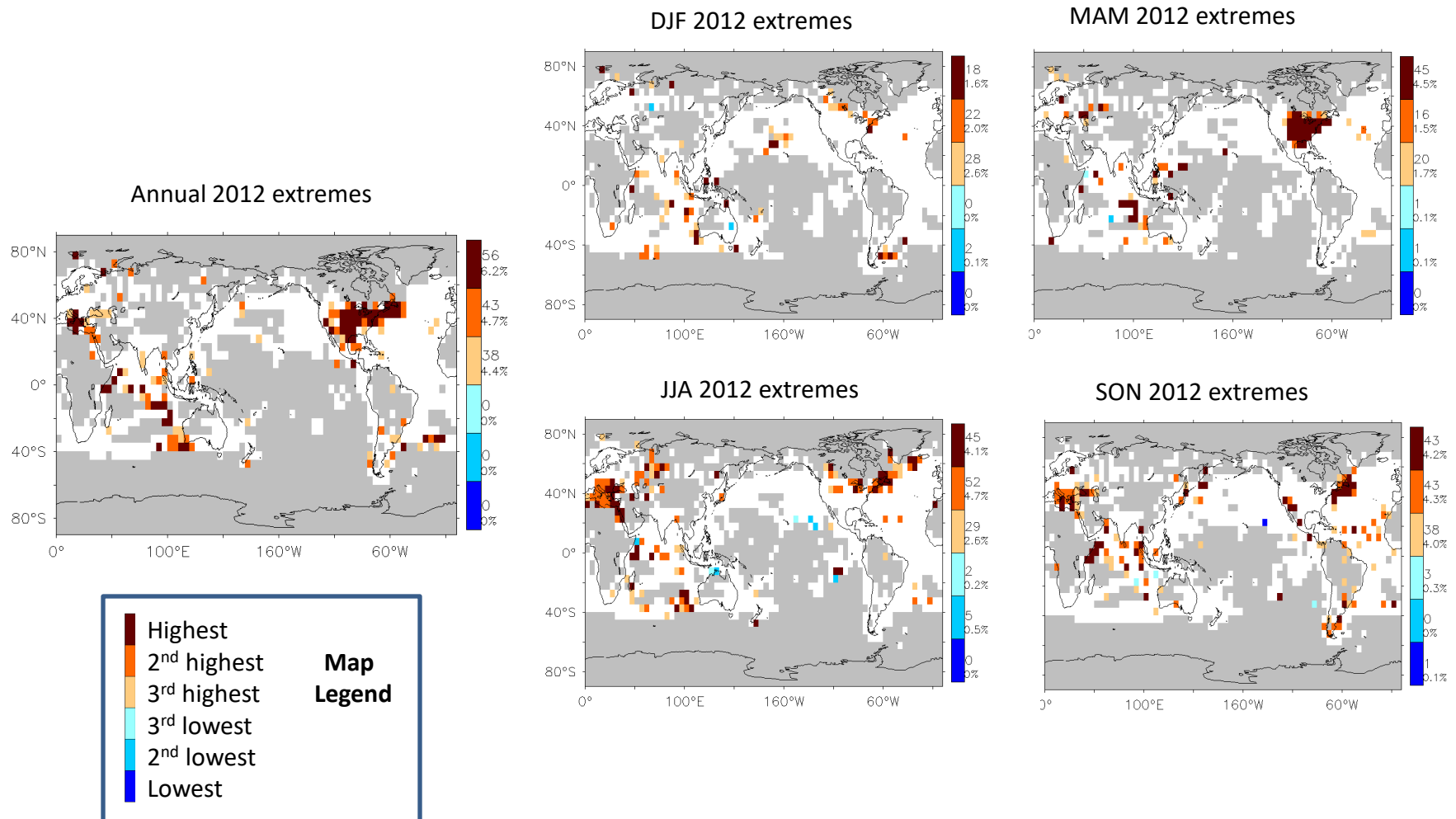


Sept.-Nov. 2013 seasonal extremes



Source: Knutson, Zeng, and Wittenberg, *BAMS*, accepted (2014)

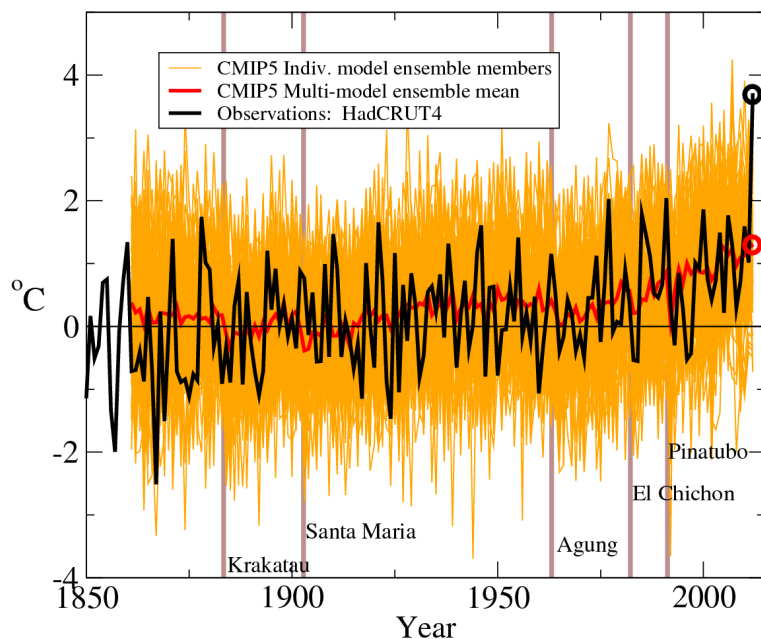
Where were the 2012 anomalies ranked 1st, 2nd, 3rd warmest or coldest?



Source: Knutson, Zeng, and Wittenberg, *BAMS* (2013)

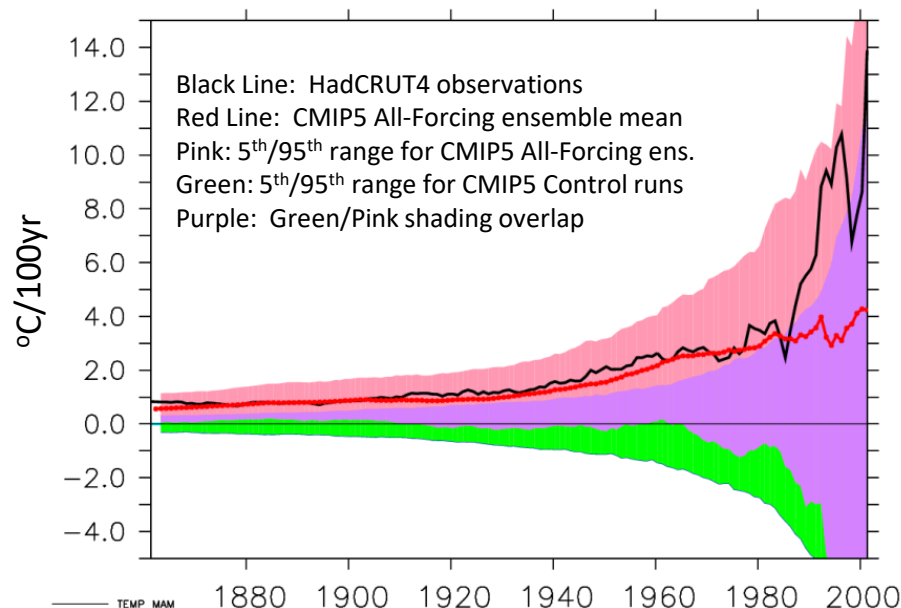
An assessment of the extreme March-May 2012 temperatures over the eastern U.S.

Eastern U.S. Surface Temperature Anomalies (March-May)
1881-1920 reference period. CMIP5 23-model ensemble; Anthropogenic + Natural Forcing



Thu Sep 19 10:11:20 2013

b) Trend assessment



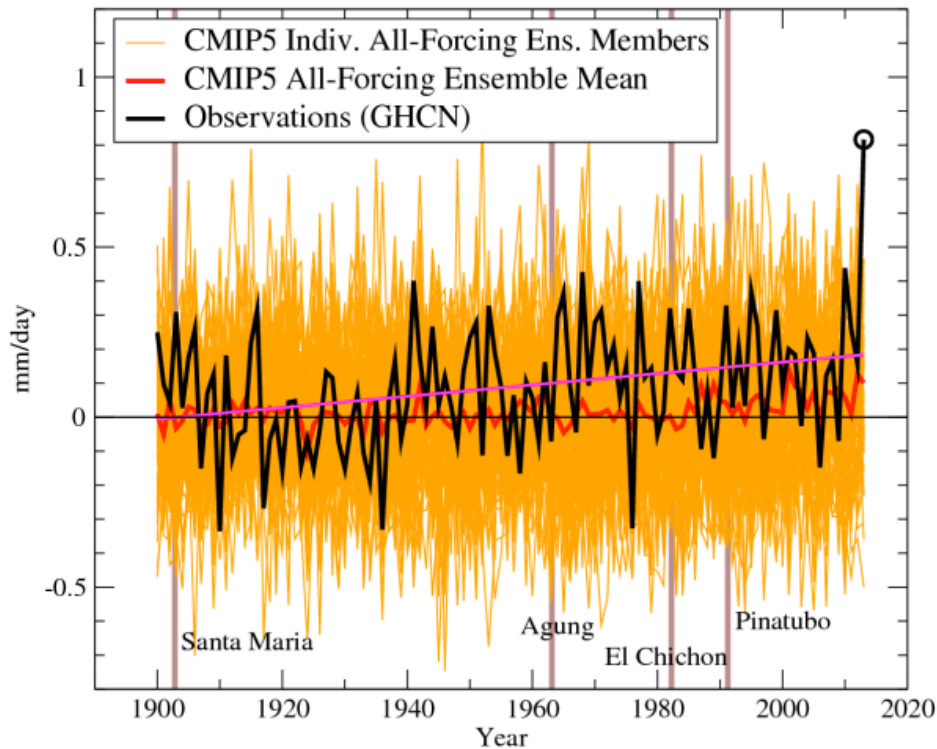
Trend start year (all trends ending in 2012)

$$\text{Ratio} = \frac{p_{\text{ALL}}}{p_{\text{CON}}} = 11 \text{ to } 12$$

p_{ALL} and p_{CON} : probabilities of exceeding the 2012 or 1991 thresholds in the All Forcing and Control distributions.
Source: Knutson, Zeng, and Wittenberg, *BAMS* (2013)

2013 Annual Mean Precipitation Extremes: Climate Perspective

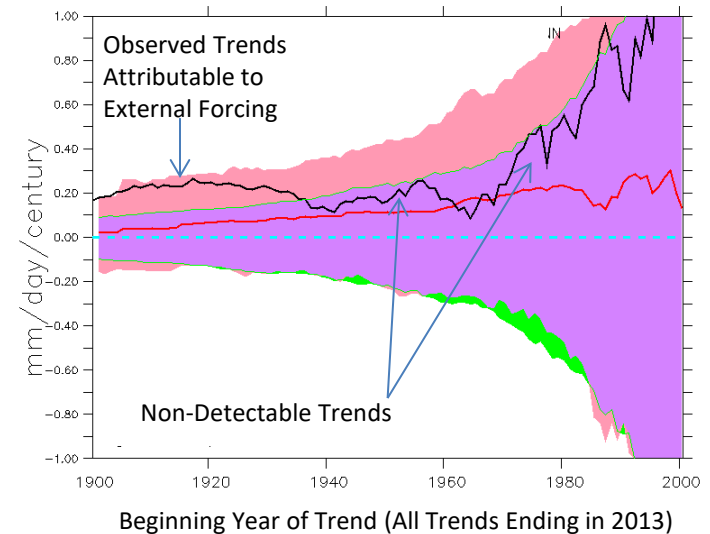
U.S./Canadian Border Region – Annual-mean Precipitation



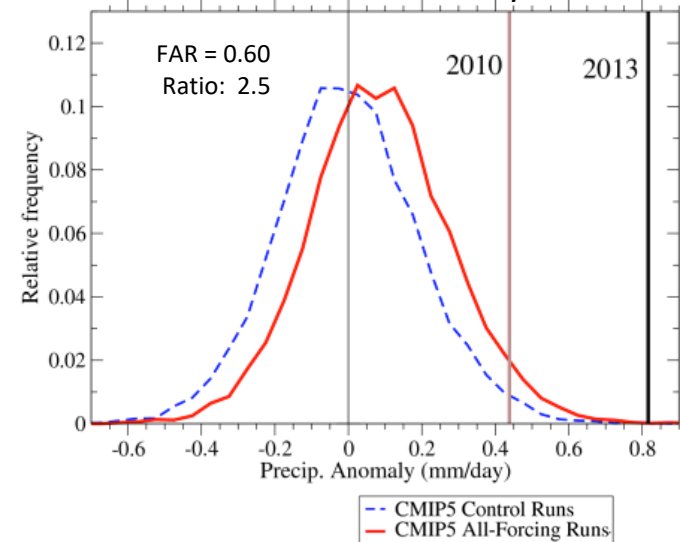
$$\text{Ratio} = \frac{p_{\text{ALL}}}{p_{\text{CON}}}$$

p_{ALL} and p_{CON} : probabilities of exceeding the 2013 or 2010 thresholds in the All Forcing and Control distributions.
Source: Knutson, Zeng, and Wittenberg, *BAMS* accepted (2014)

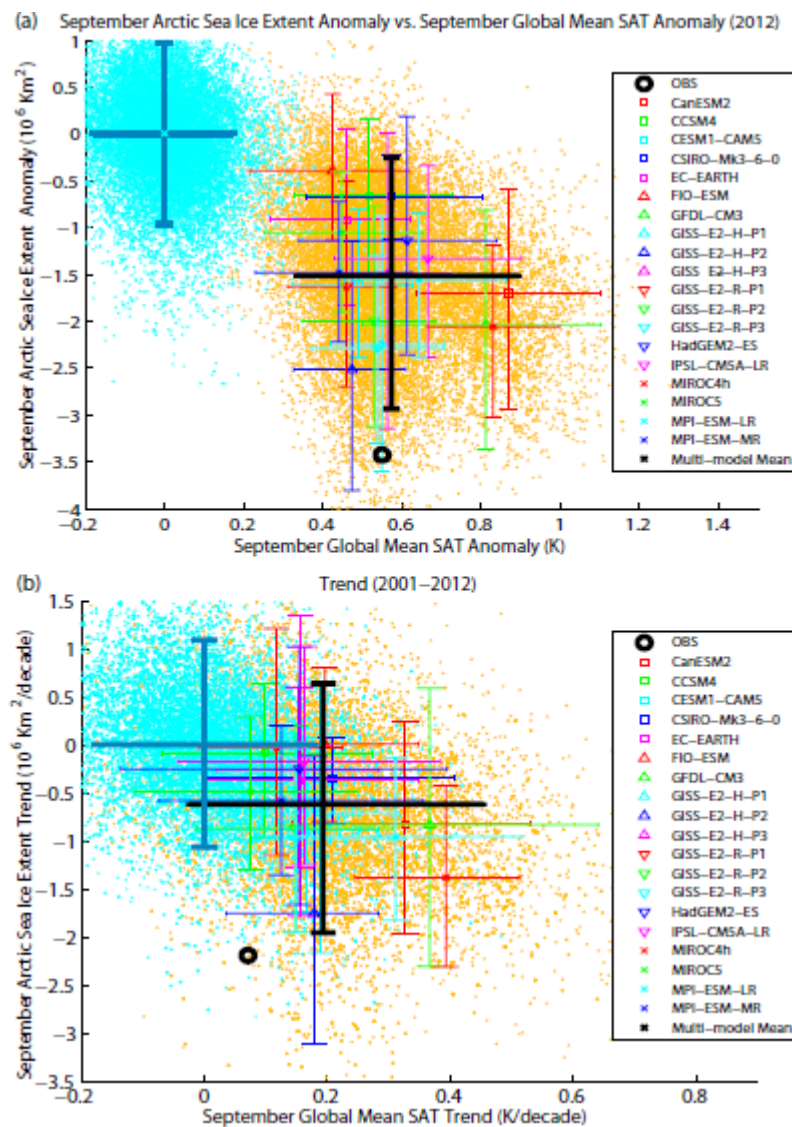
Sliding Trend Analysis



Attributable Risk Analysis



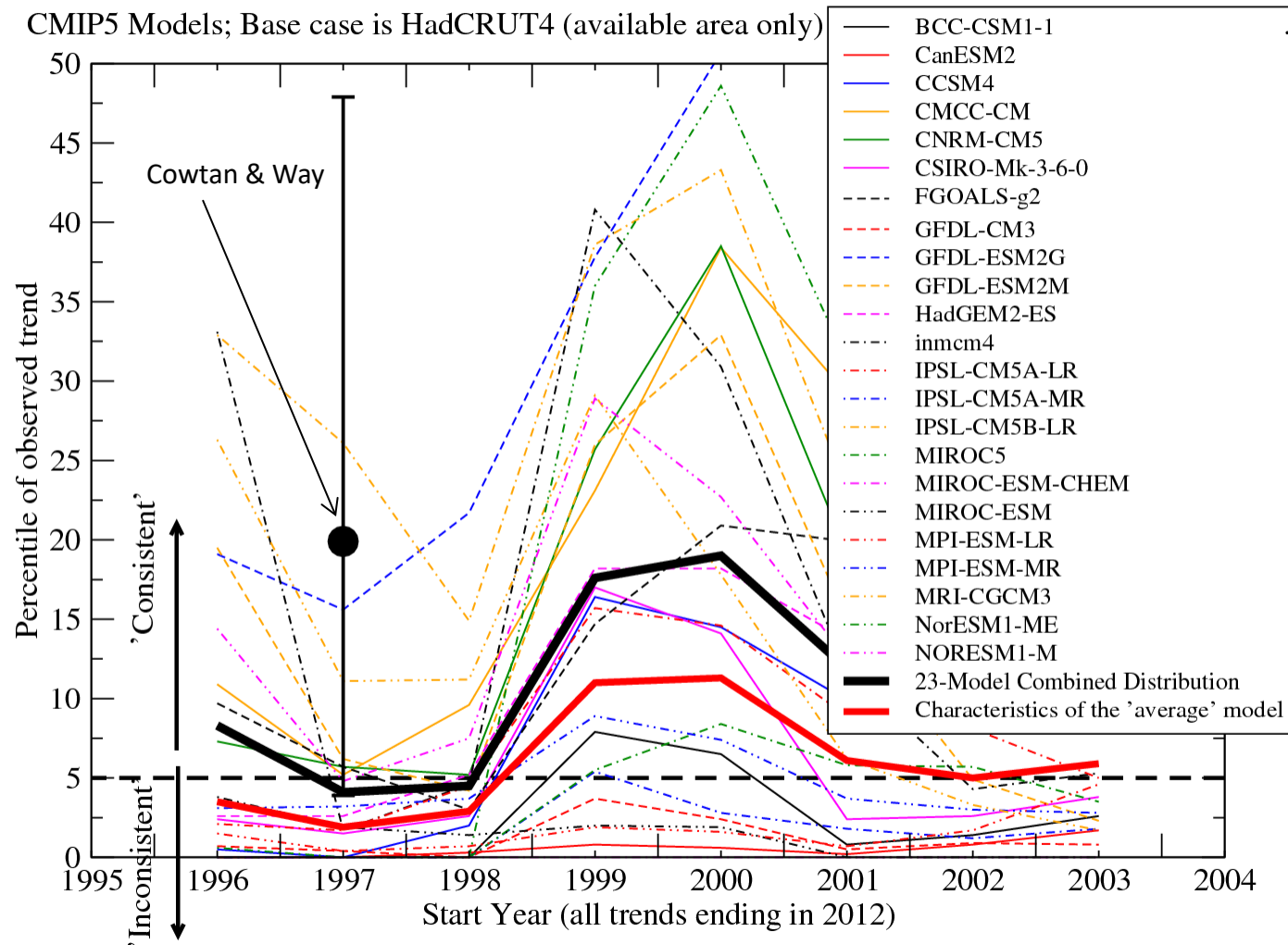
September 2012: Arctic Sea Ice Extent Anomaly vs. Global SAT Anomaly



Source: R. Zhang and T. Knutson, BAMS, 2013.

Assessment of Recent Near-Global Surface Temperature Trends

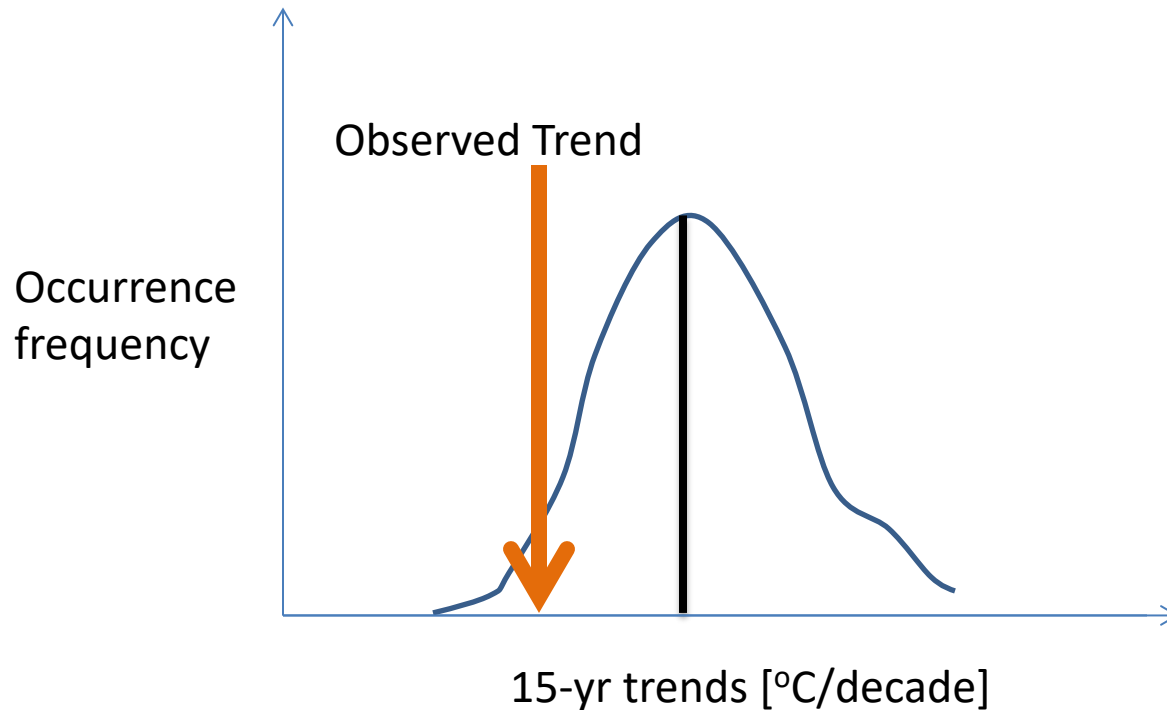
CMIP5 Models; Base case is HadCRUT4 (available area only)



Note: Filled circle / error bar is percentile within 23-model combined distribution of Cowtan and Way's adjusted trend (and trend +/- 1 sigma).

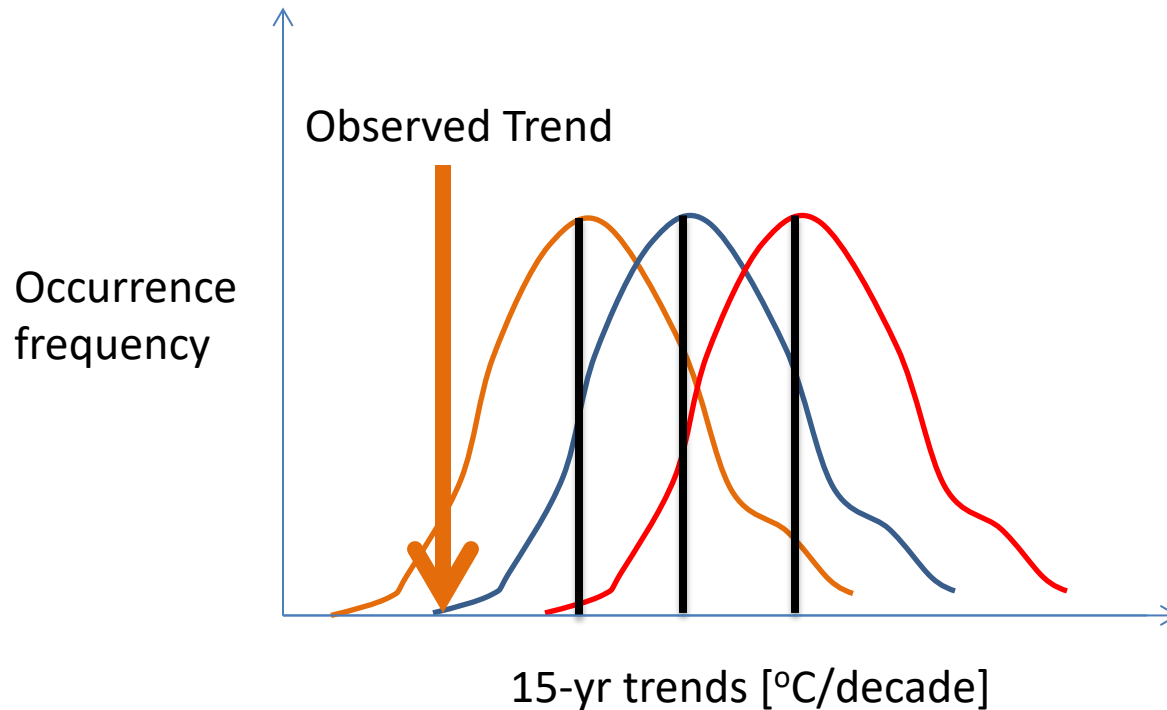
Consider the distributions of 15-yr trends from a climate model for the period 1997-2012.

- The mean of the model's distribution is the ensemble mean of the model's historical run ensemble over the period in question.
- The spread about the mean for the model is the distribution of 15-year trends from the model's control run.



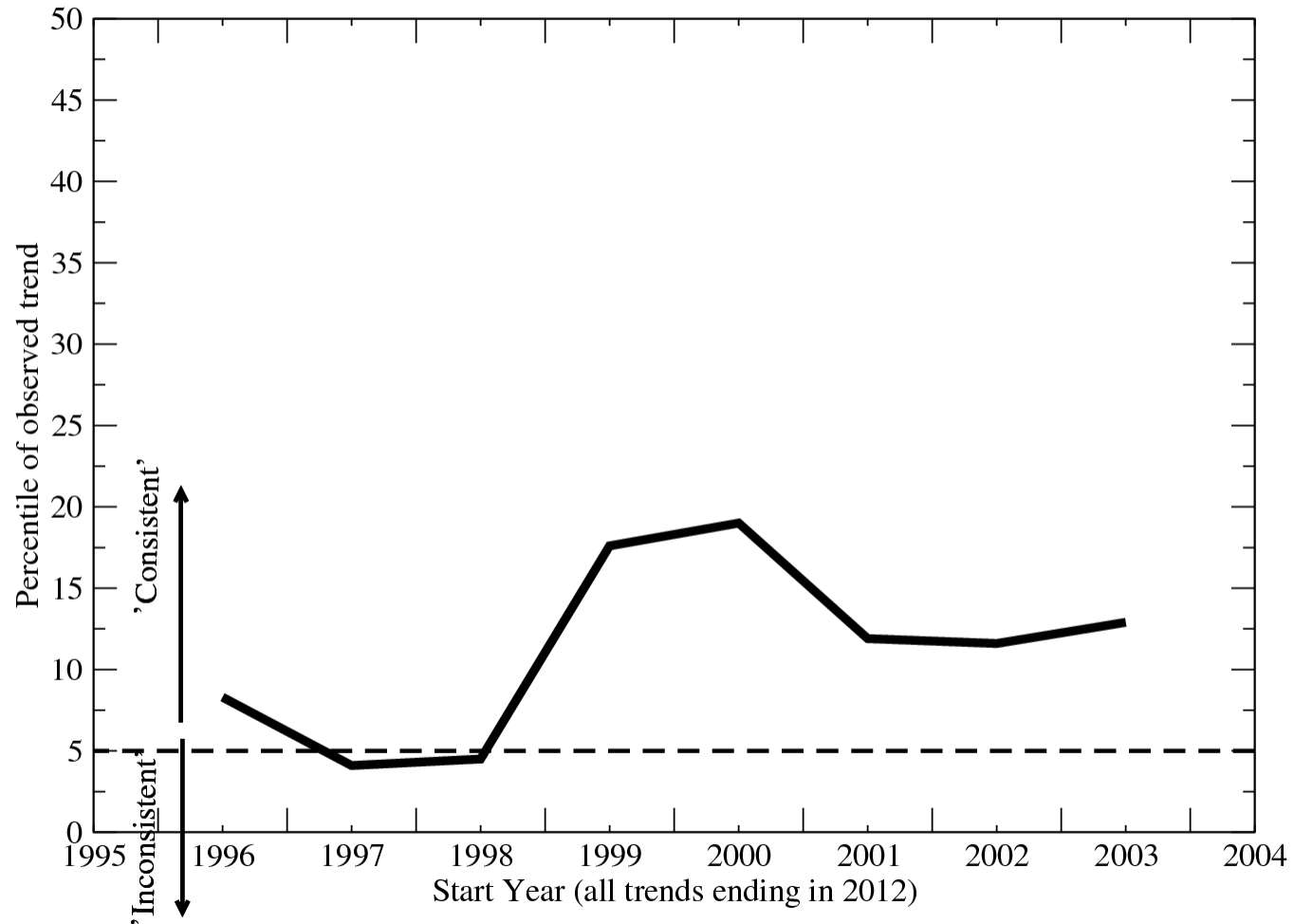
Consider three distributions of 15-yr trends from three different models for the period 1997-2012.

- The mean of each model's distribution is the ensemble mean of that model's historical run ensemble over the period in question.
- The spread about the mean for each model is the distribution of 15-year trends from the control run of that model.



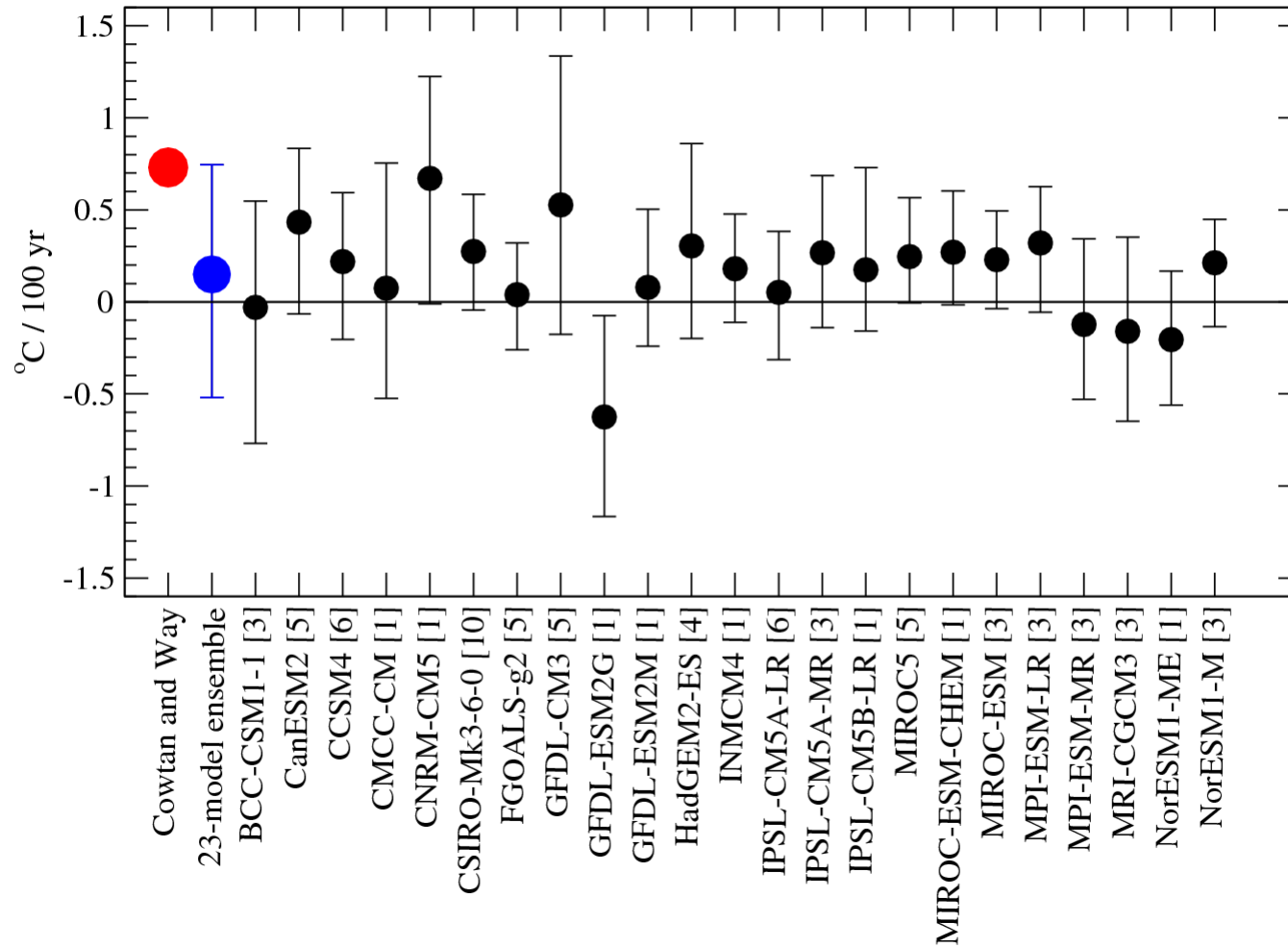
Assessment of Global Surface Temperature Trends (1997-2012)

CMIP5 Historical/Control Runs; Base case: HadCRUT4 (available area only);

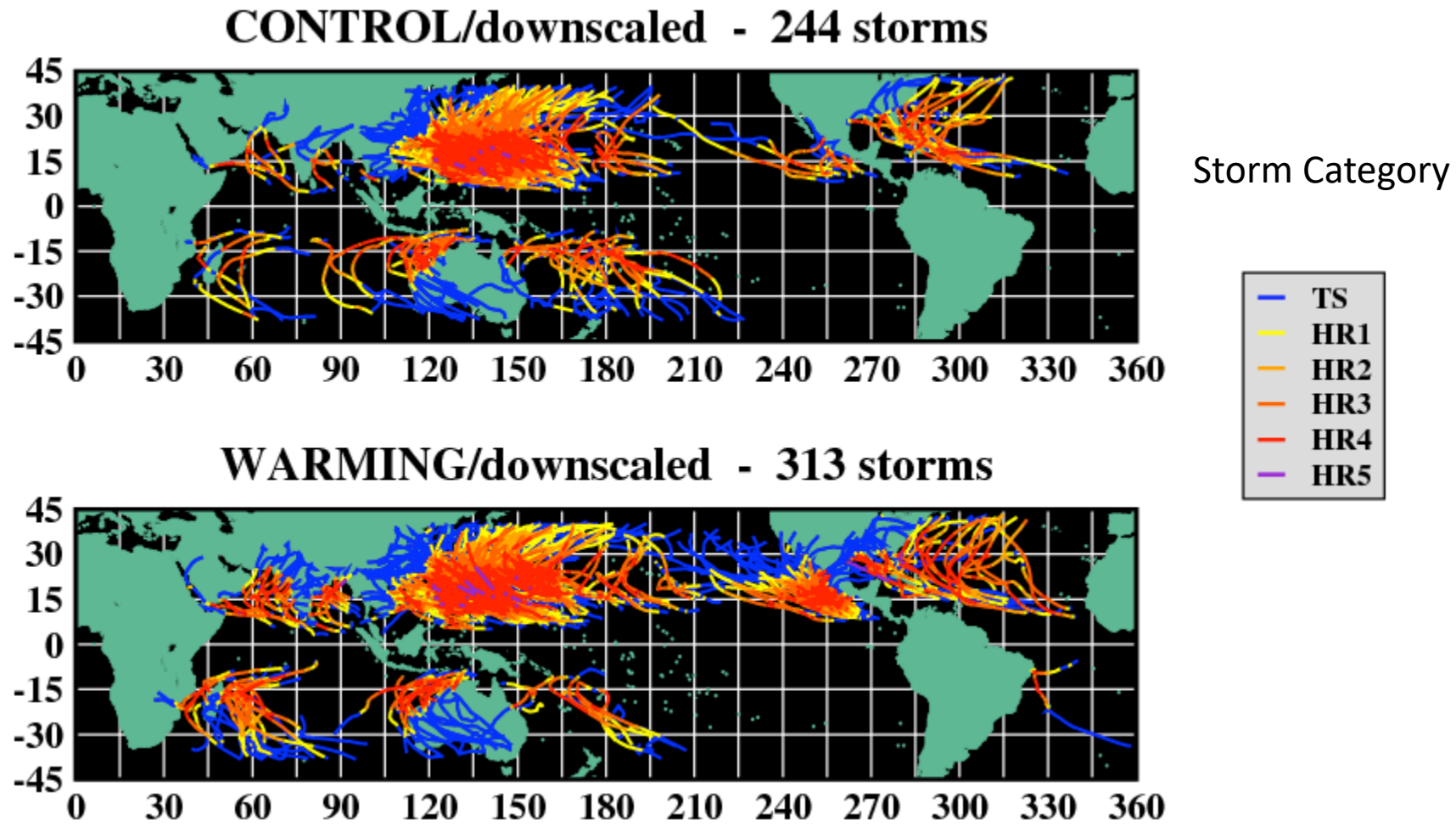


Global mean temperature trend adjustments due to missing data

1997-2012 (annual means for models); 5th-95th percentile ranges about the historical run ensemble means



Category 4-5 Tropical Cyclones: 20 yr simulations CMIP5/RCP4.5 Late 21st Century vs. Present Day



24% increase in Cat 4-5 frequency globally

Hurricane-related precipitation rate changes

SST averaged 10°N-25°N, 20°W-80°W; Aug-Oct.; Black = CMIP3; Red = CMIP5

