



**Atlantic Basin Seasonal Hurricane  
Prediction: Past, Present and Future**

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Department of Atmospheric Science  
Colorado State University**

**Seasonal Hurricane Forecasting Workshop**

**November 2, 2018**

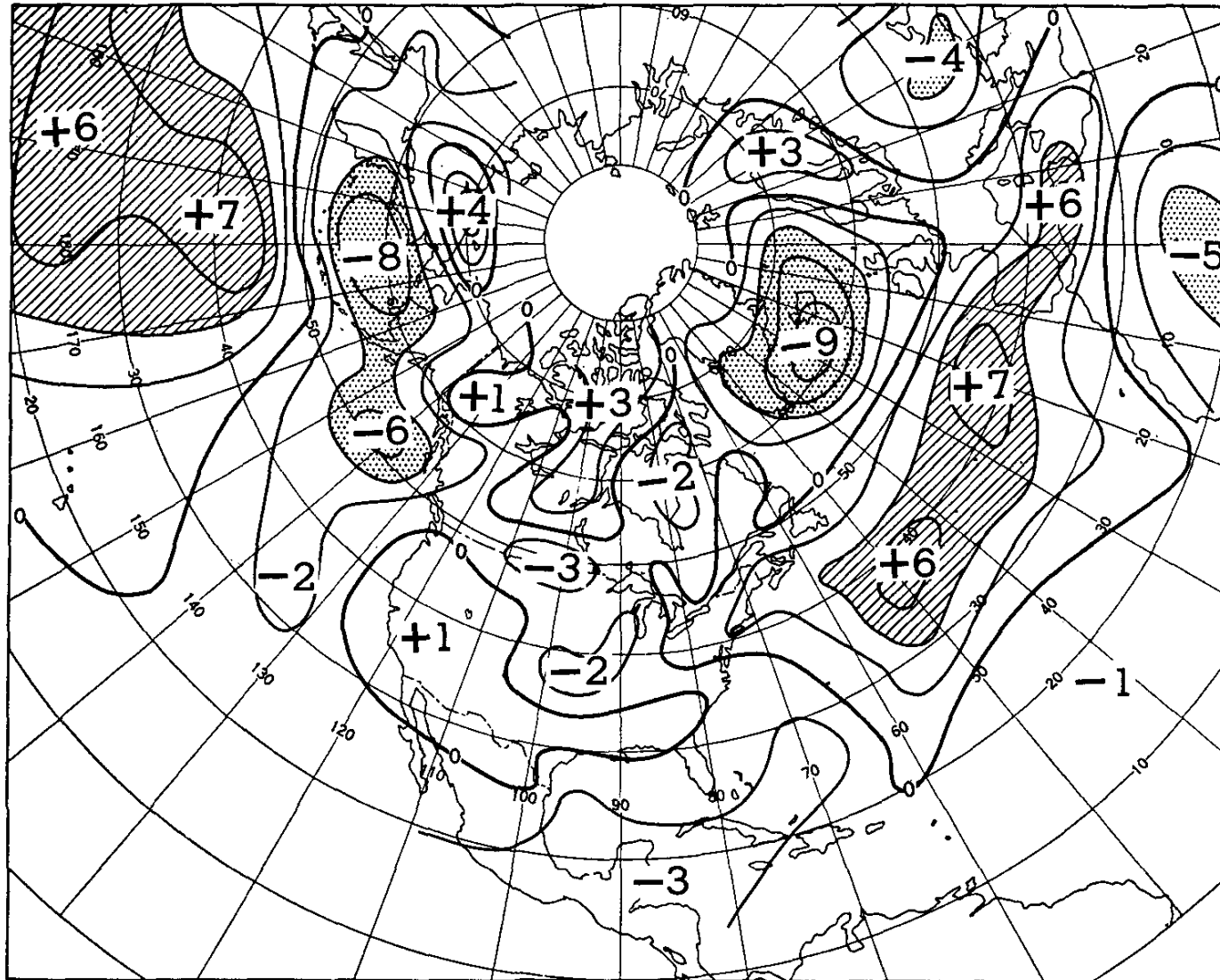
## In Memory of Bill Gray (1929-2016)



Klotzbach, P. J., J. C. L. Chan, P. J. Fitzpatrick, W. M. Frank, C. W. Landsea, and J. L. McBride, 2017: The science of William M. Gray: His contributions to the knowledge of tropical meteorology and tropical cyclones. *Bulletin of the AMS*, **98**, 2311-2336.

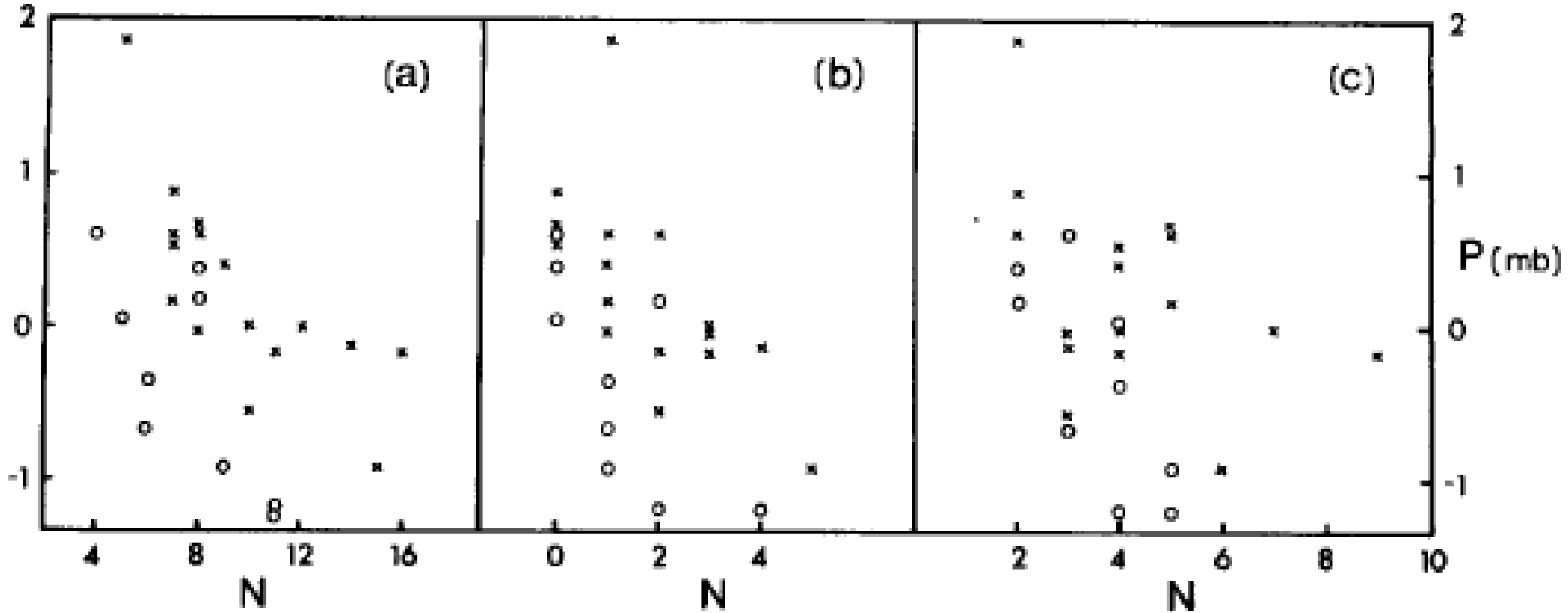
Seasonal Forecasting is more than this!



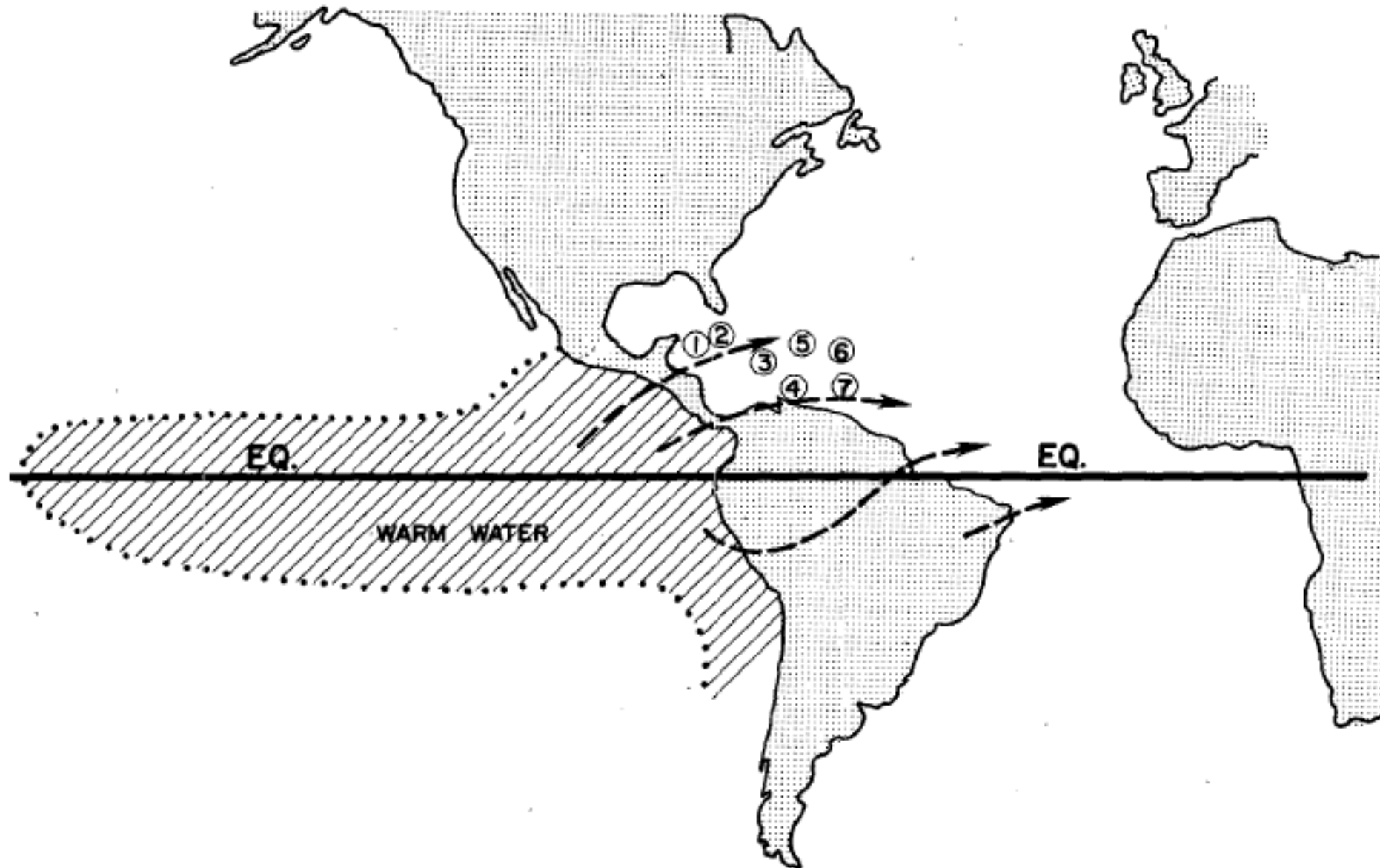


**August-October-averaged 700 mb height anomalies in the five most active tropical cyclone seasons: 1933-1955**

**Positive Southern Oscillation Index (e.g., La Niña) = More Australian Tropical Cyclones**

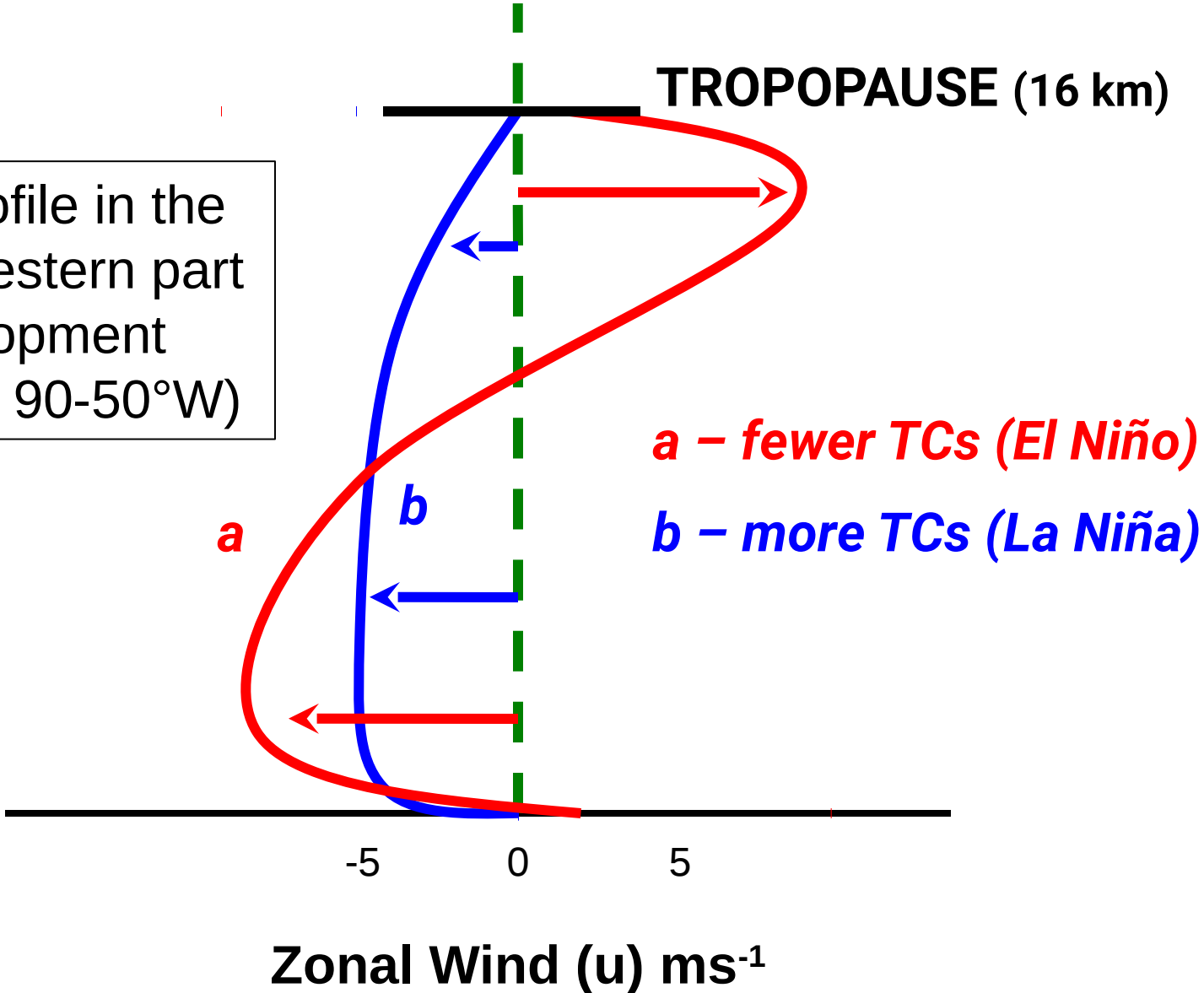


**Relationship between Darwin austral winter pressure and tropical cyclone frequency during (a) entire season, (b) October-December and (c) January-February.**

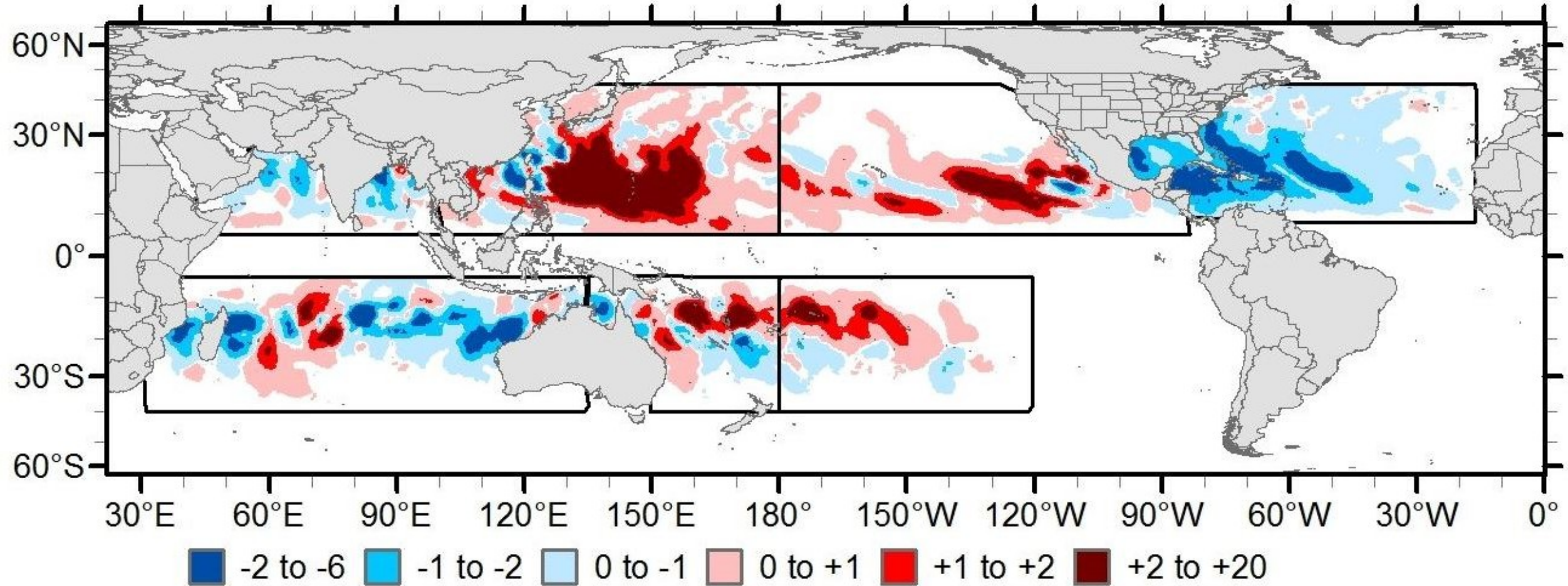


200-hPa zonal wind anomalies associated with El Niño Events – Increased Caribbean Shear

Vertical Wind Profile in the Caribbean and western part of Main Development Region (10-20°N; 90-50°W)

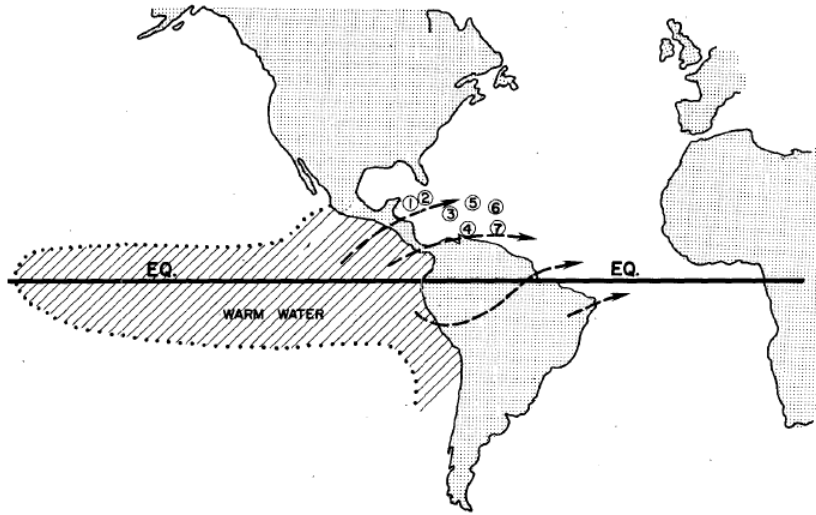


# El Niño minus La Niña Accumulated Cyclone Energy Generation (1985-2014)

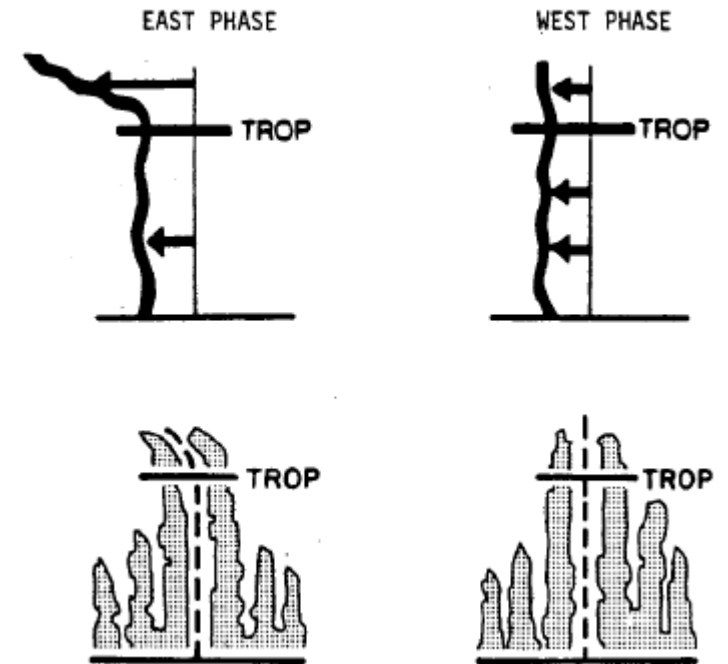




# Original CSU Seasonal Forecast – Gray (1984)



**ENSO**

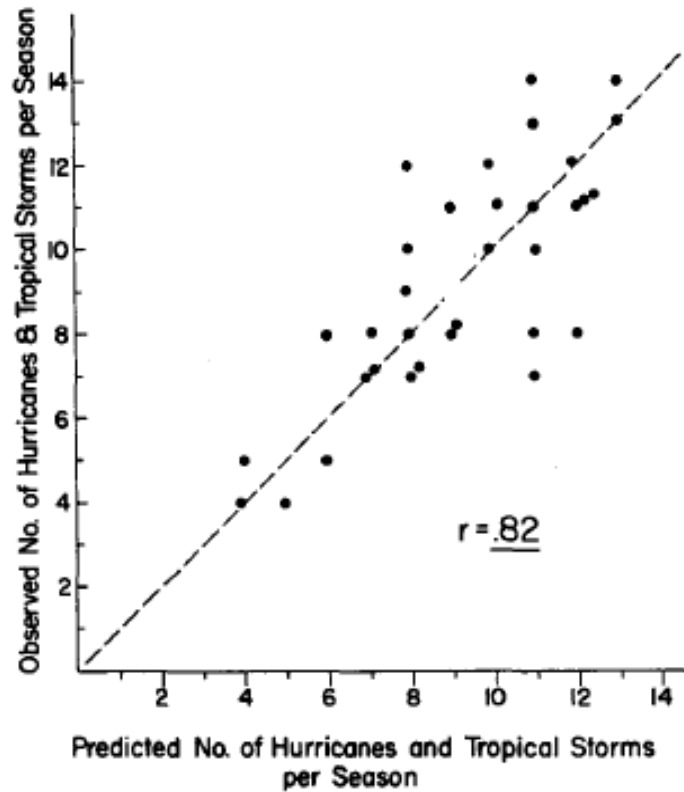


**QBO**

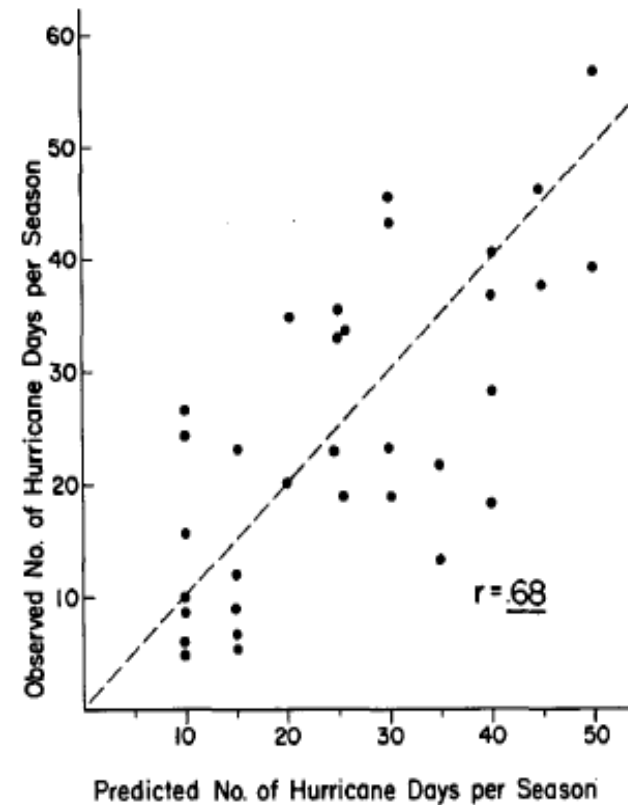


**Caribbean SLP**

Named Storm Skill ( $r = 0.82$ )  
(1950-1982)



Hurricane Day Skill ( $r = 0.68$ )  
(1950-1982)



# Seasonal Predictors used in early August Forecasts by CSU (late 1990s through early 2000s)

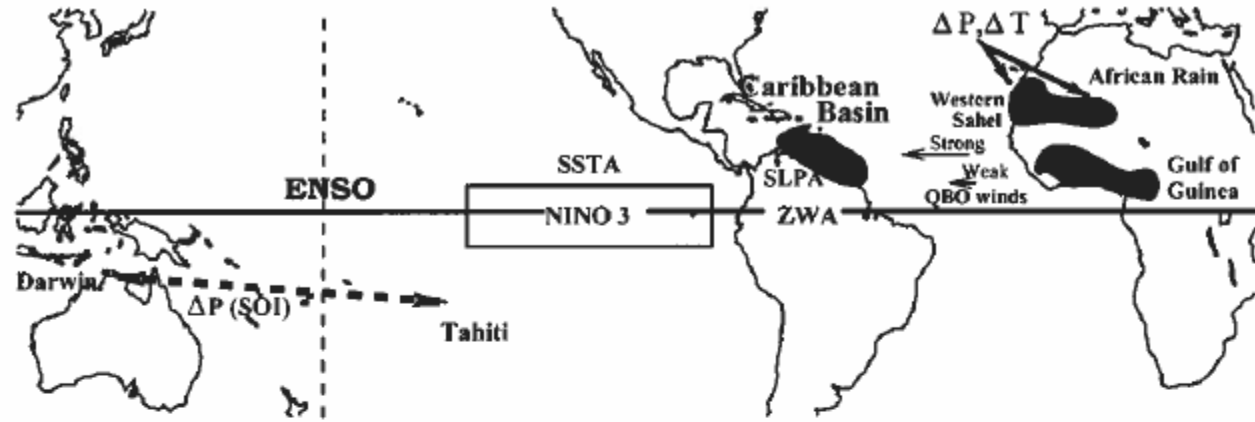


Figure 1: Meteorological parameters used in various prior versions of our early August (Gray et al. 1994a) seasonal forecast.

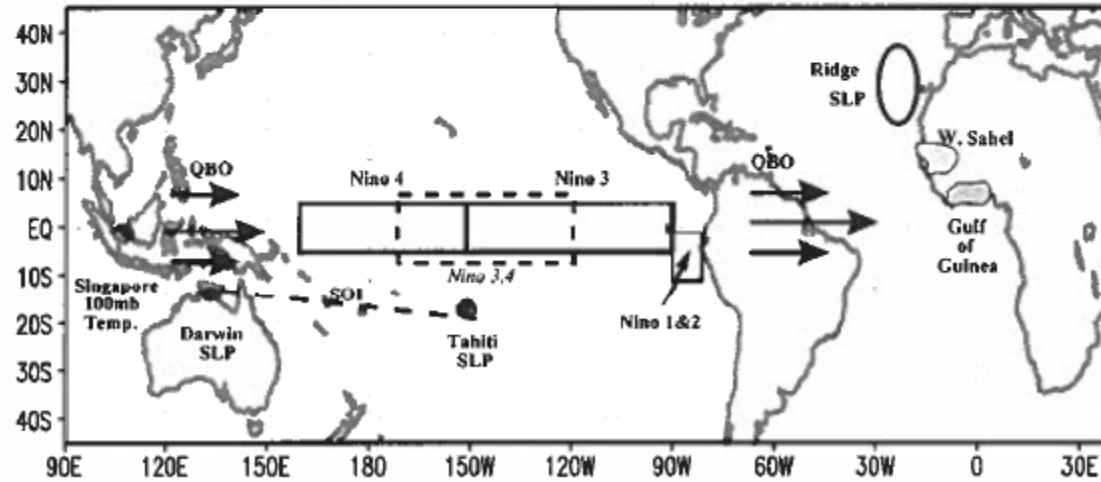


Figure 2: Additional parameters used or consulted in making the actual extended-range forecasts.

# TOO MANY PREDICTORS!!

## Predictors used in Statistical Model by CSU in August 2000

Table 5: Listing of the pool of predictive parameters and their estimated values for the early August 2000 prediction, based on meteorological data available through July 2001. See Figs. 2 through 4 for the locations of the sources of these predictor data.

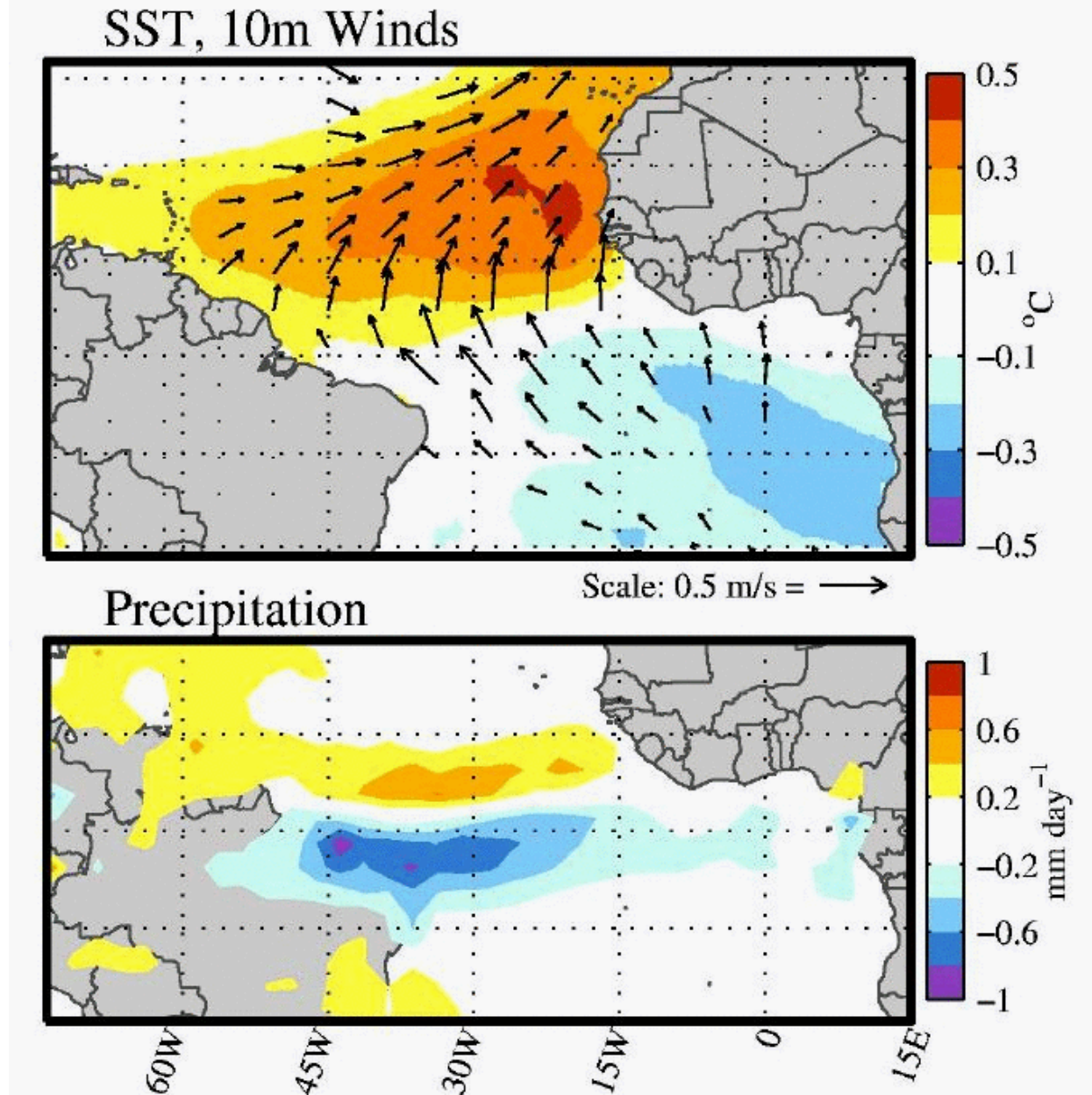
Predictive Parameter	
1 = QBO 50 mb 2-month extrapolation of zonal wind at 12°N to Sept. 2001	-18 $ms^{-1}$
2 = QBO 30 mb 2-month extrapolation of zonal wind at 14°N to Sept. 2001	-17 $ms^{-1}$
3 = QBO absolute value of shear between 50 and 30 mb at 8°N to Sept. 2001	1 $ms^{-1}$
4 = Rgc AN Gulf of Guinea rainfall anomaly (Aug-Nov of 2000)	-0.5 SD
5 = Rws West Sahel rainfall anomaly (June-July 2001)	(assume) 0.0 SD
6 = SST3.4 Nino 3.4 SSTA in June-July 2001	+0.3°C
7 = ZWA June-July 2001 Caribbean basin zonal wind anomaly	+0.2 m/s
8 = SLPA June-July 2001 Caribbean basin sea level pressure anomaly	+0.2 mb
9 = Temp West-East Sahel temperature gradient(Feb-May 2001)	+0.5 SD
10 = NATL North Atlantic SSTA anomaly (50-60°N,10-50°W) (June-July)	+0.75°C
11 = SATL South Atlantic SSTA anomaly (5-18°S,50°W-10°E) (June-July)	+0.2°C
12 = TATL Tropical Atlantic SSTA anomaly (10-22°N,18-50°W) (June-July)	+0.1°C
13 = R-M: Mar Azores surface pressure ridge strength in Mar 2001	-1.60 SD
14 = R-ON: Azores surface pressure ridge strength in Oct-Nov 2000	+1.1 SD
15 = D-SST3.4: Nino 3.4 SSTA for June-July minus April-May 2001	+0.3°C
16 = NSD-S: Named storm days south of 23.5°N and east of 75°W before 1 August	0

# The Atlantic Meridional Mode: SST, wind, and precip anom

- Leading mode of basin-wide ocean-atmosphere interaction between SST and low-level winds

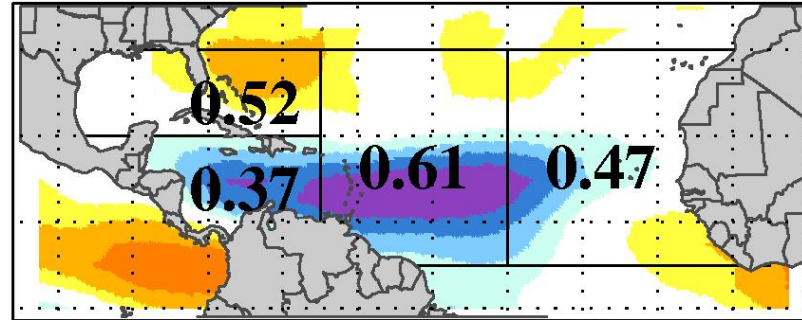
- Amplifies via the **wind-evaporation-SST (WES)** feedback mechanism

- Strongest signal during the spring, but persists into hurricane season

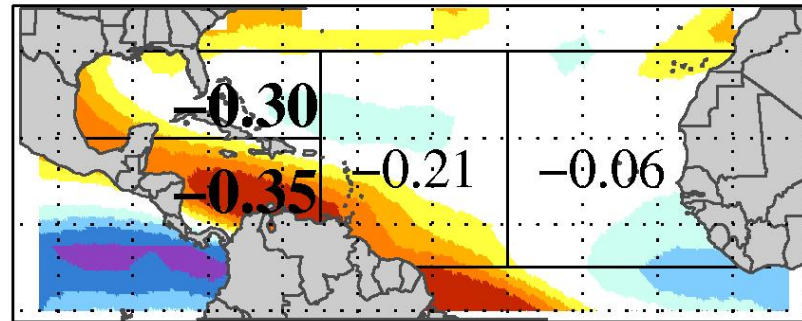


# Comparative effects of the AMM (local) and ENSO (remote) on vertical wind shear in the Atlantic

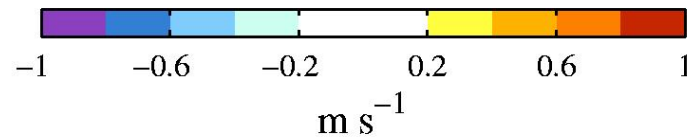
**a. AMM**



**b. Nino 3.4**

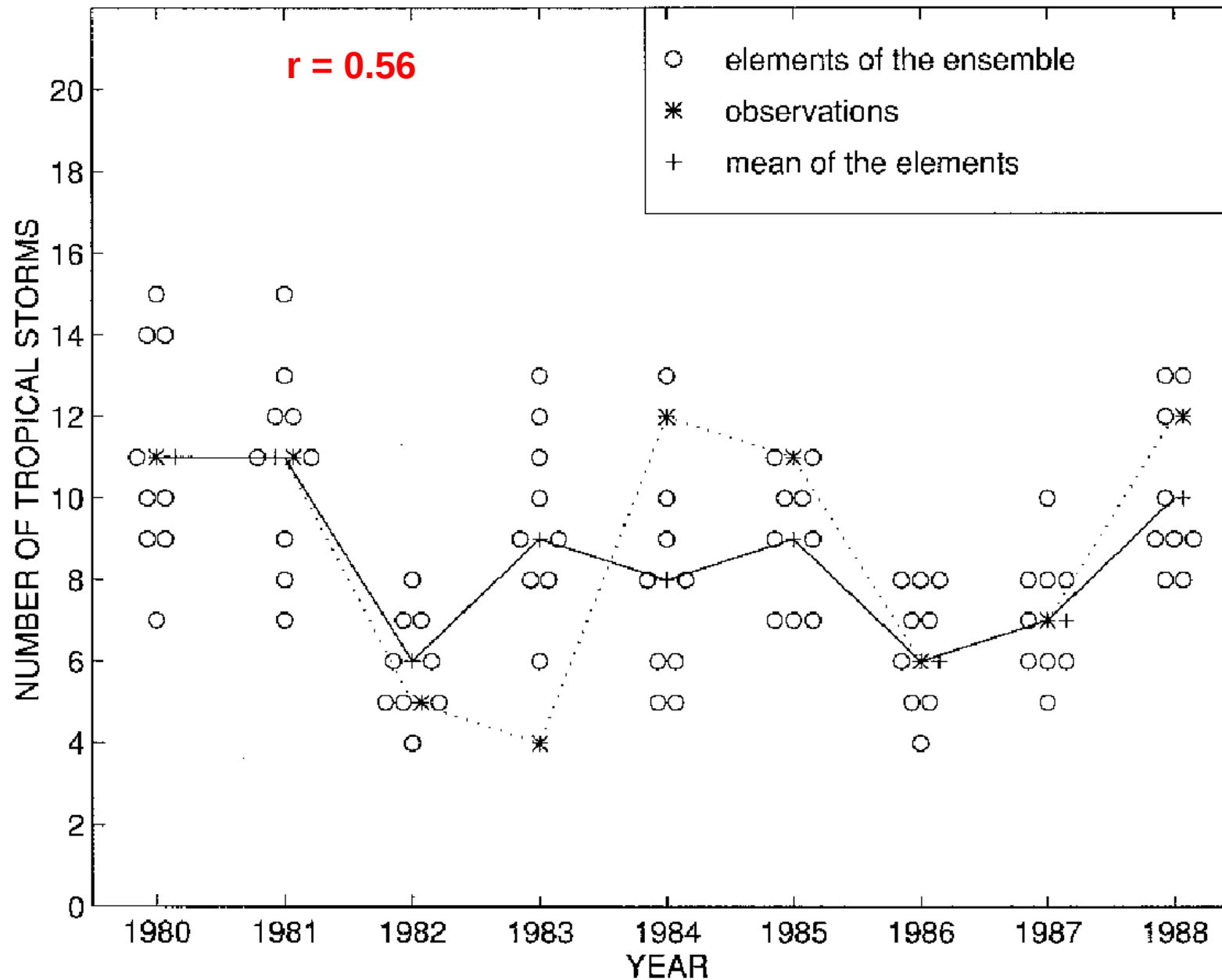


units: m/s per  
standard deviation



**Shear regressed onto AMM and Nino 3.4 indices, and correlations between the indices and storm activity.**

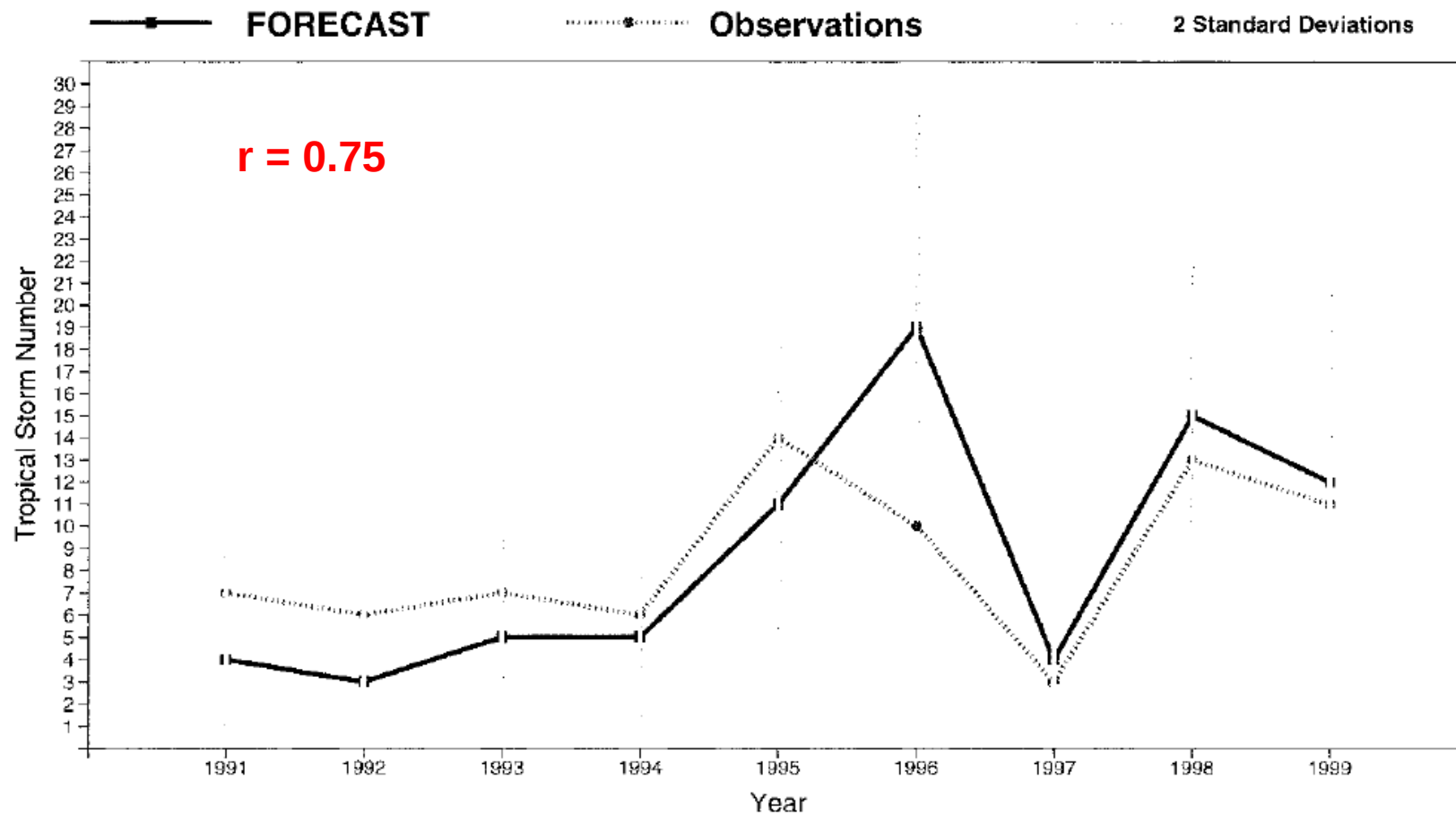
# ECMWF Hindcasts using Observed SSTs



# ECMWF Hindcasts using Model Forecast SSTs

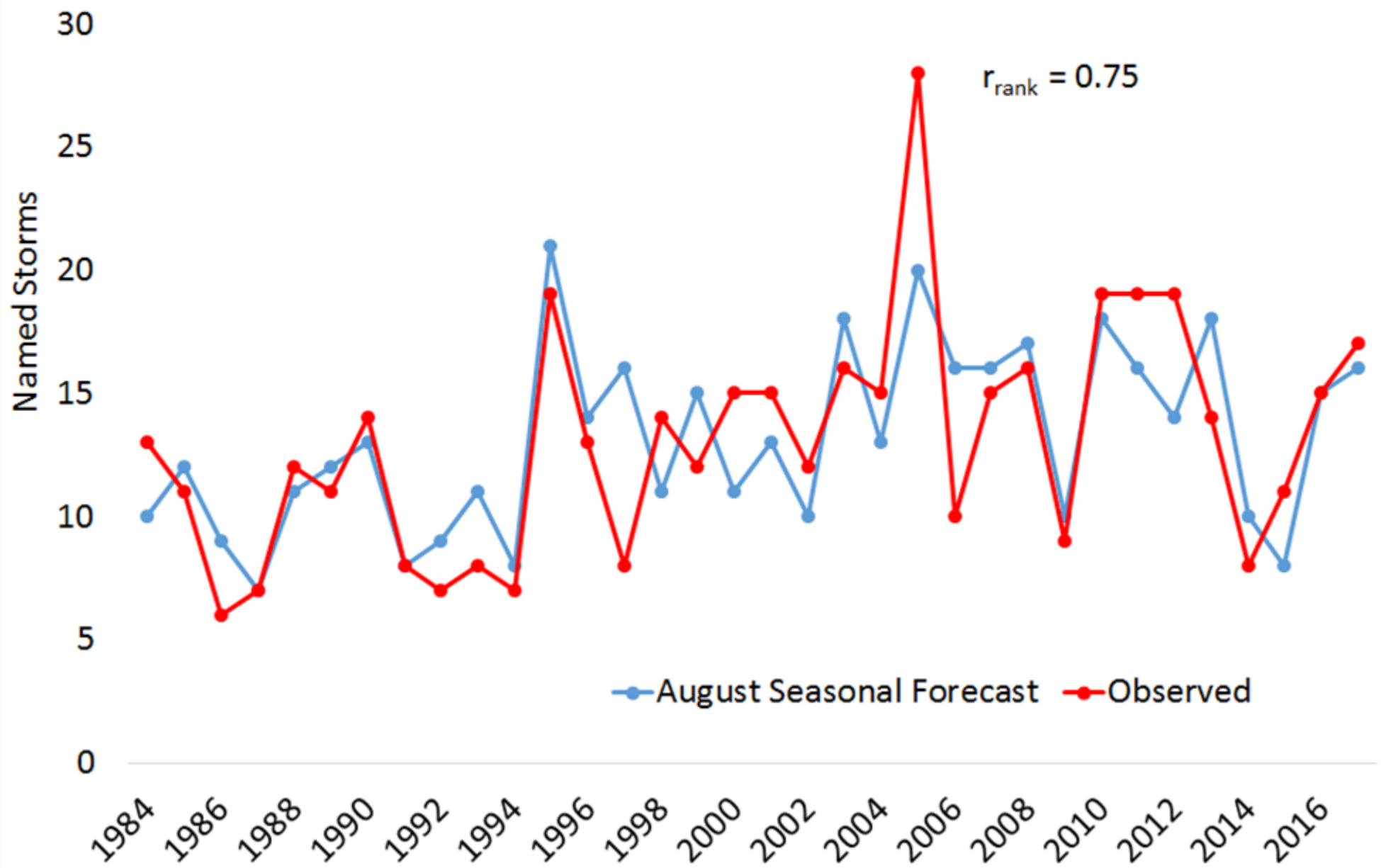
Tropical Storm Frequency over the North Atlantic (ASOND)  
Forecast starting on 1st July

ECMWF Seasonal Forecast, Cycle 15r8

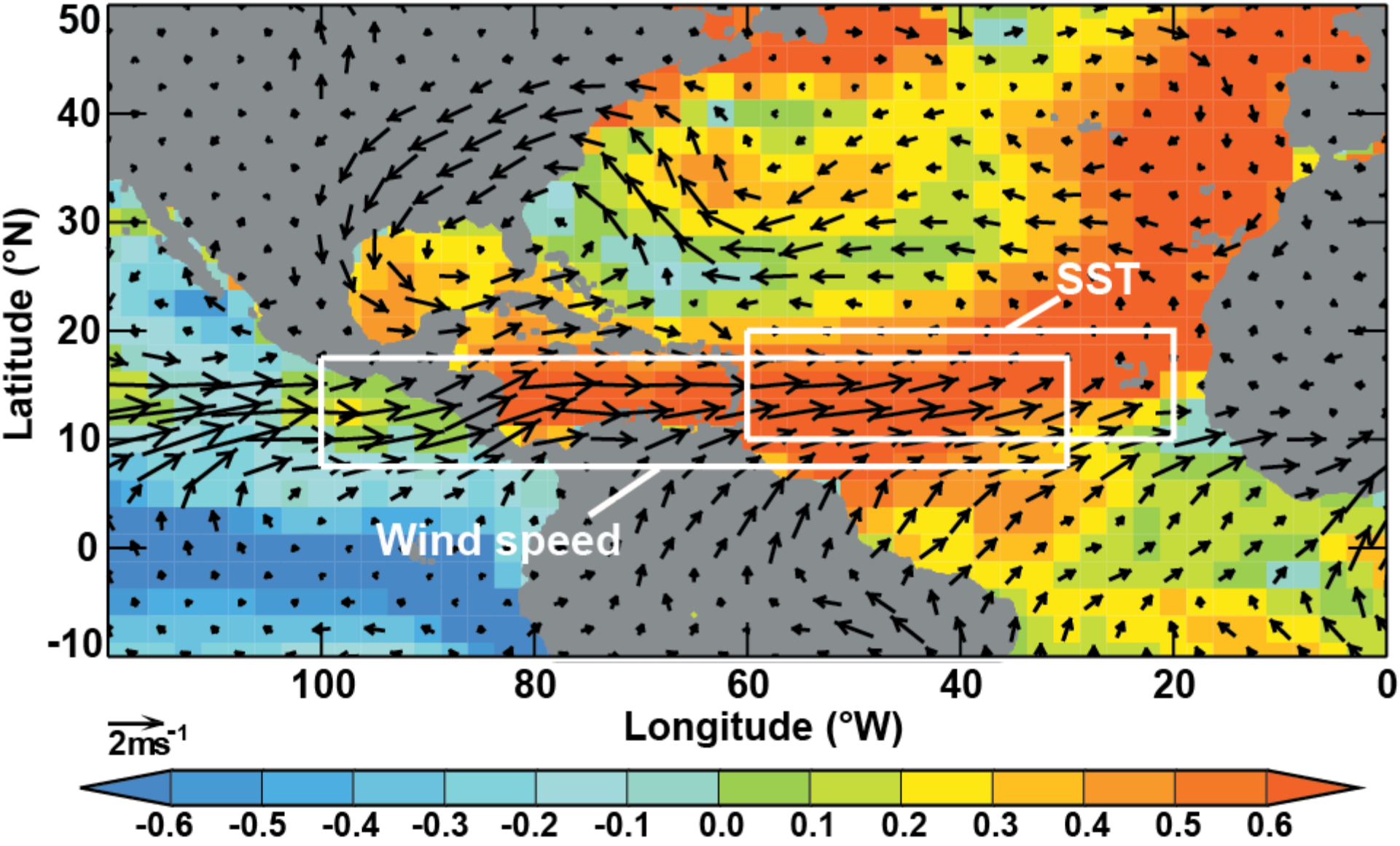




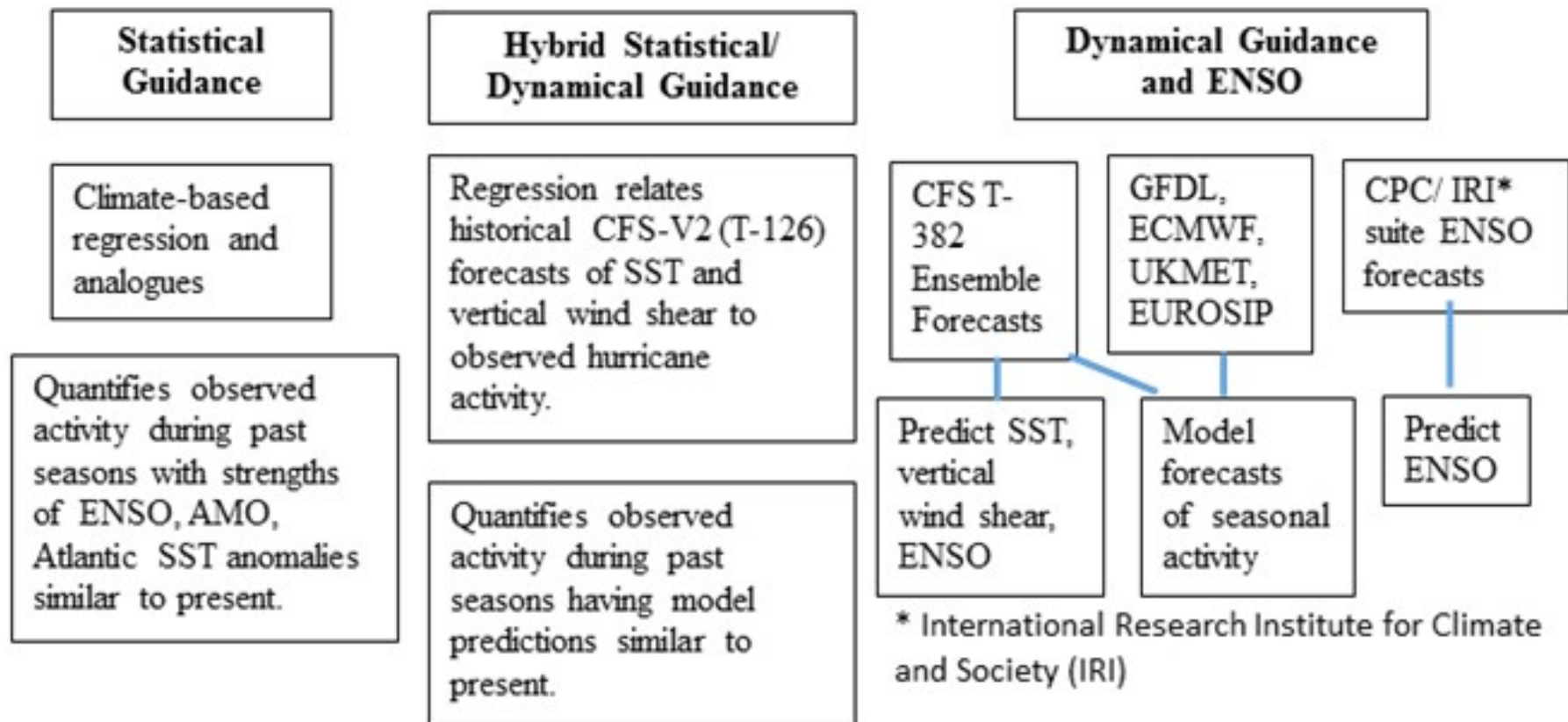
CSU Predicted vs. Observed Atlantic Named Storms (1984-2017) - Early August Forecast



# Tropical Storm Risk Statistical Prediction Model



## NOAA's Atlantic Hurricane Season Outlook Guidance

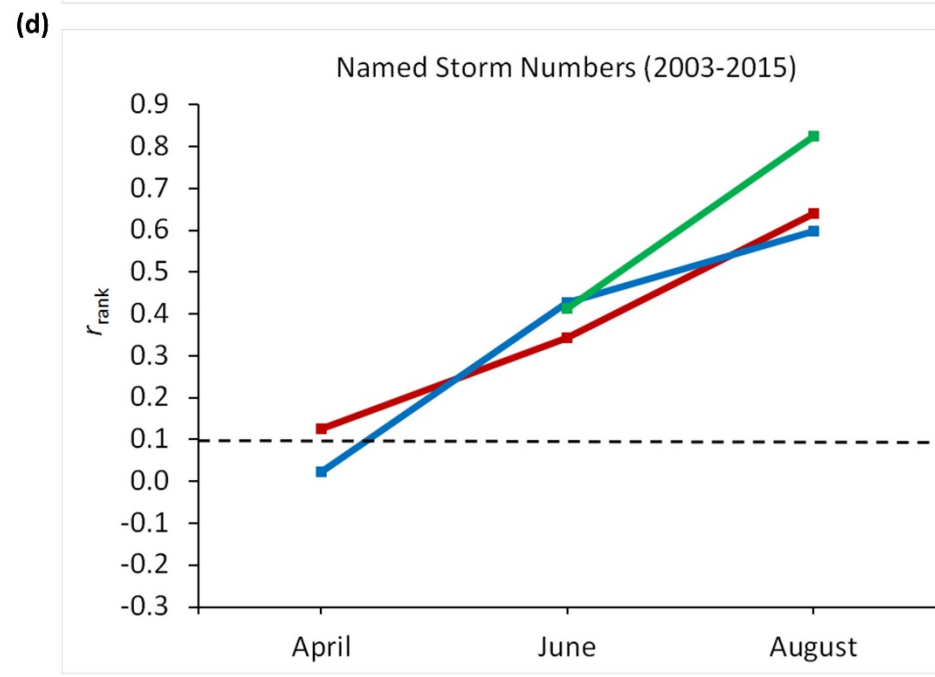
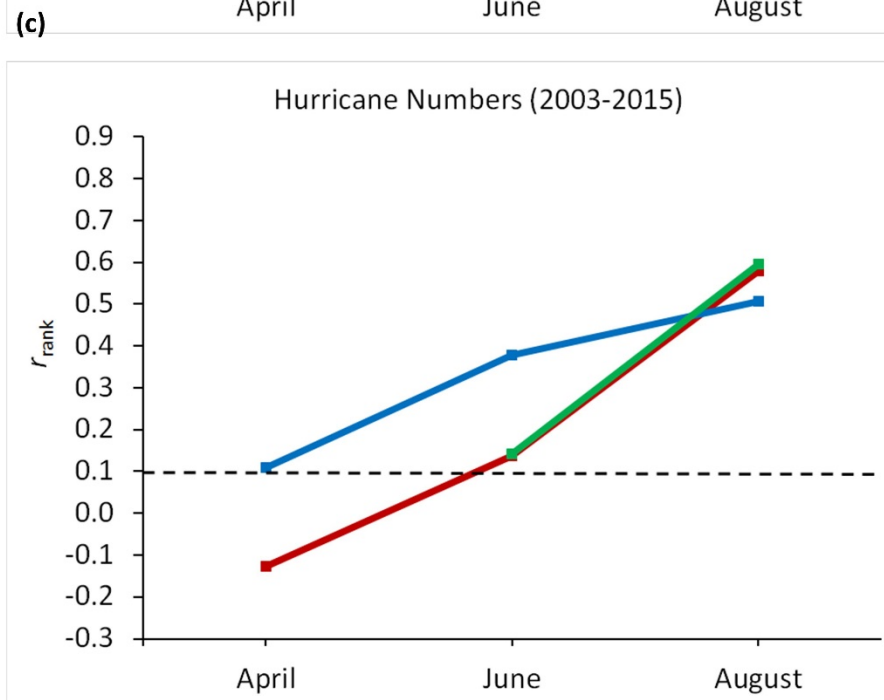
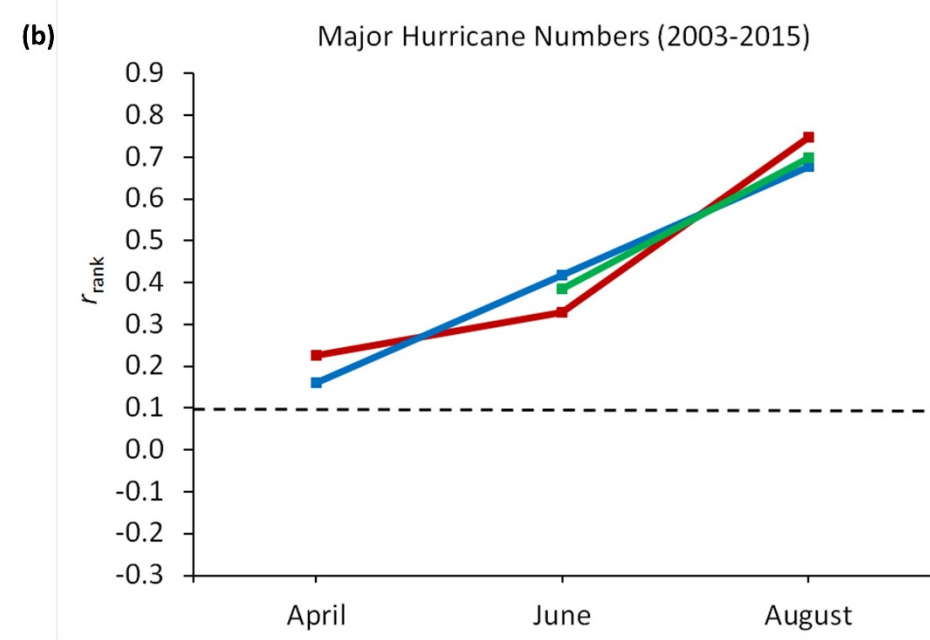
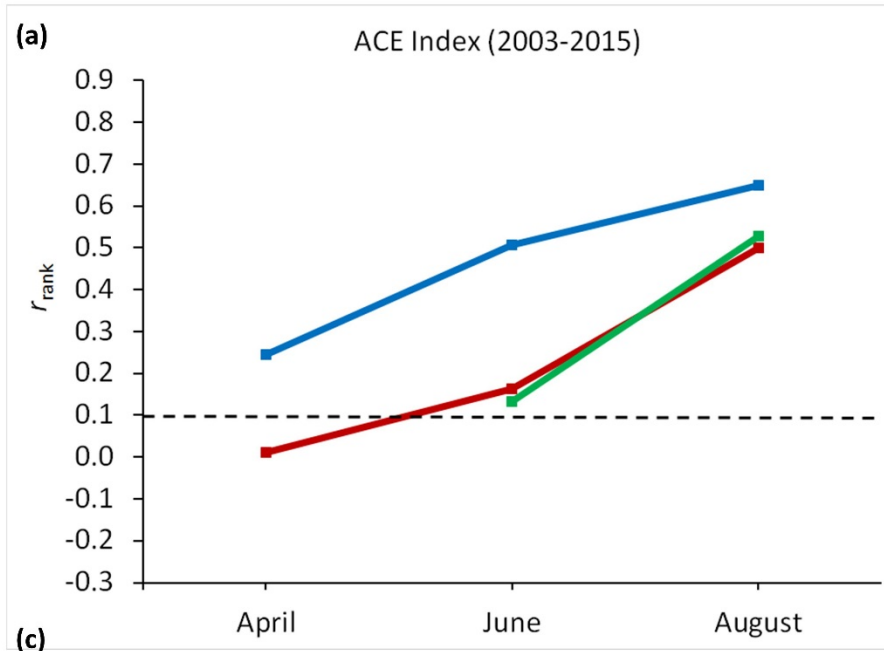


**Forecast tool consensus guidance provides 70% probability ranges of activity\*\***

**Forecast team members each predict 70% probability ranges of activity.**

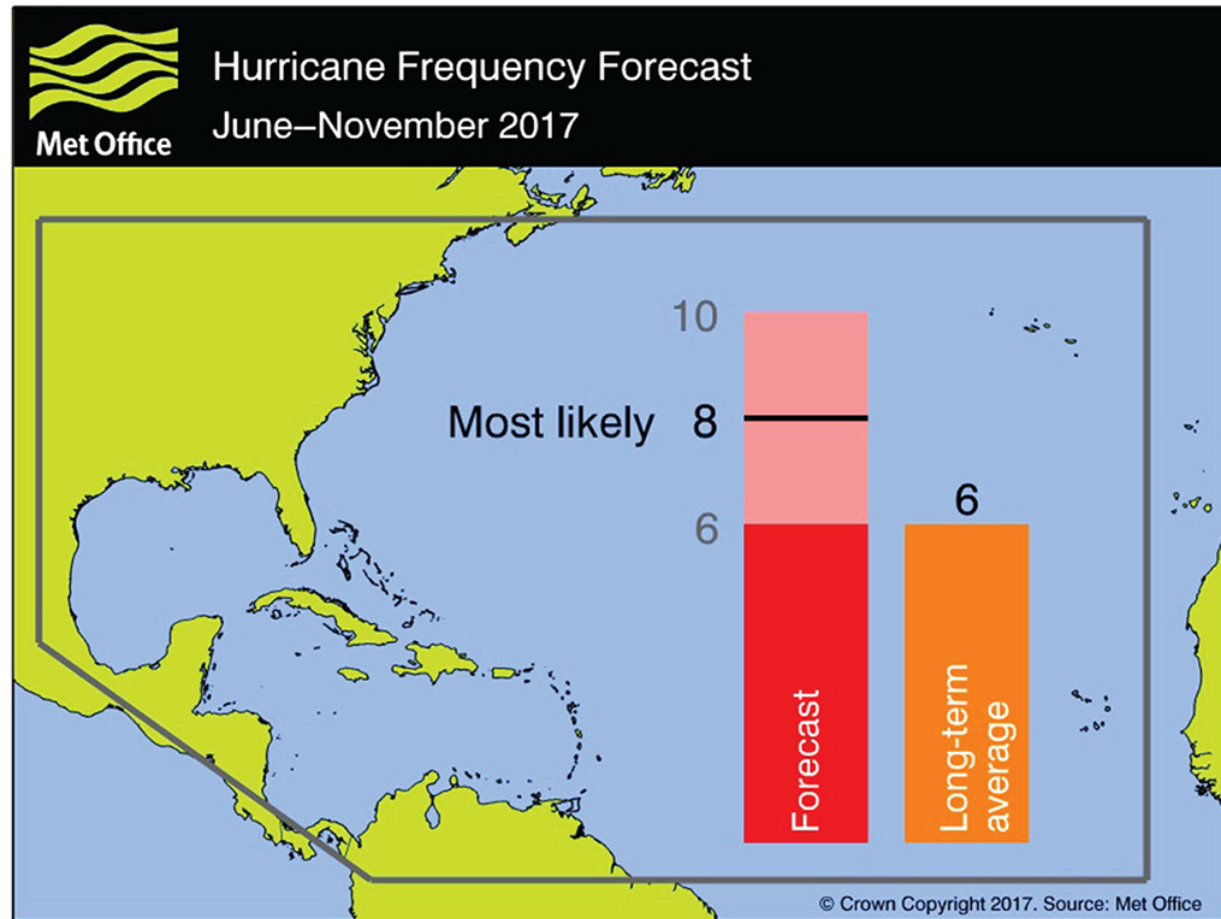
**Final outlook is consensus of individual forecaster predicted ranges.**

\*\* Prediction parameters include named storms, hurricanes, major hurricanes, ACE, and probabilities for the season being above- near- and below-normal

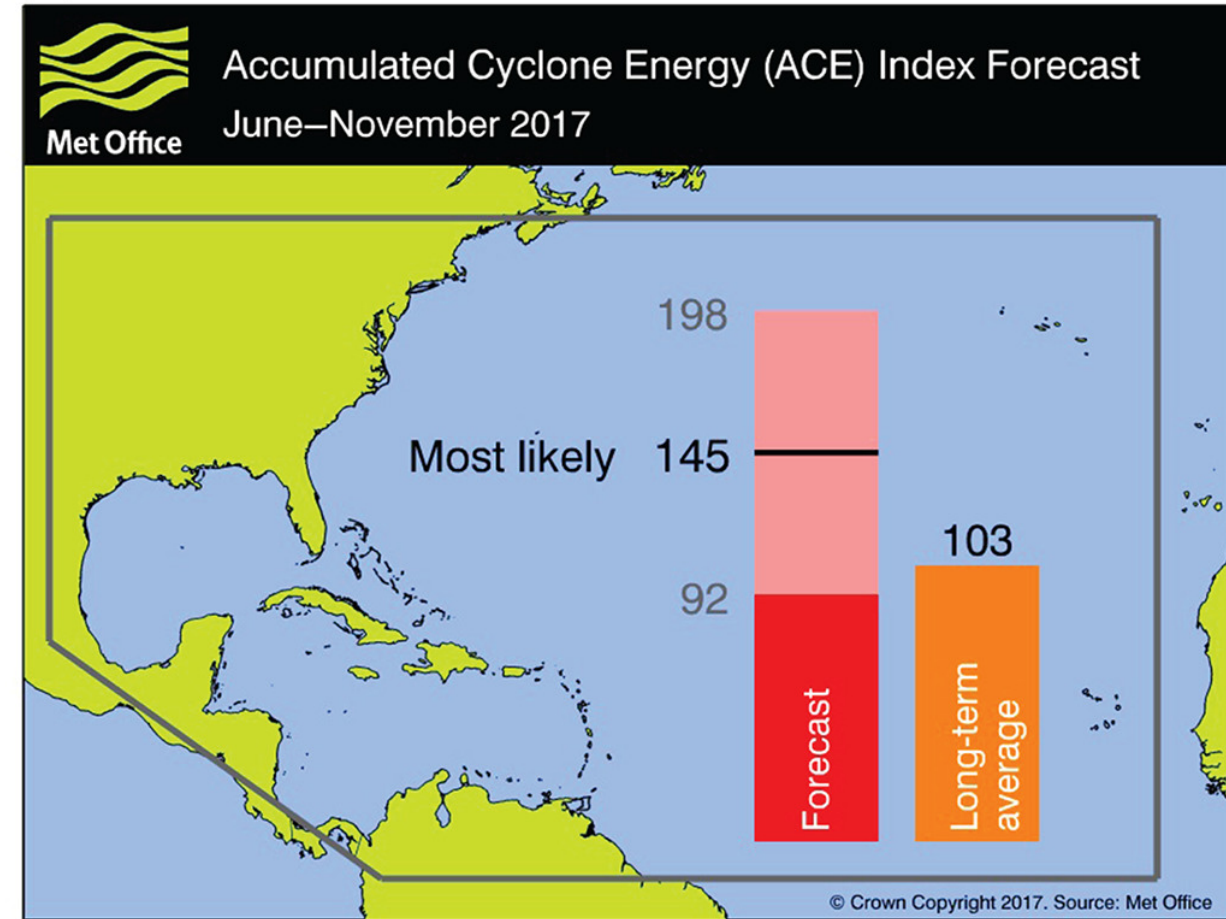


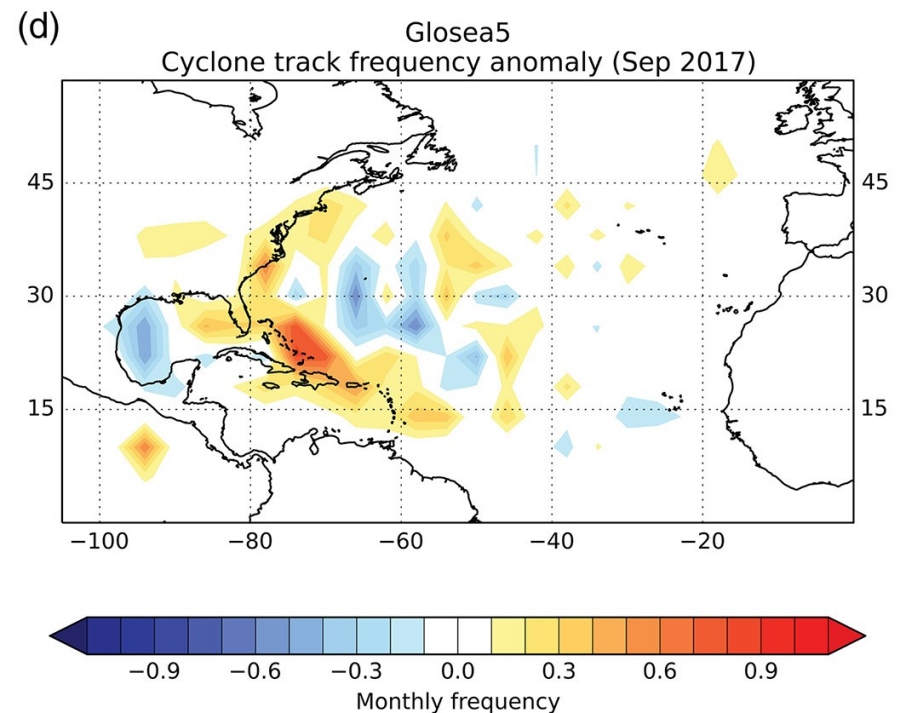
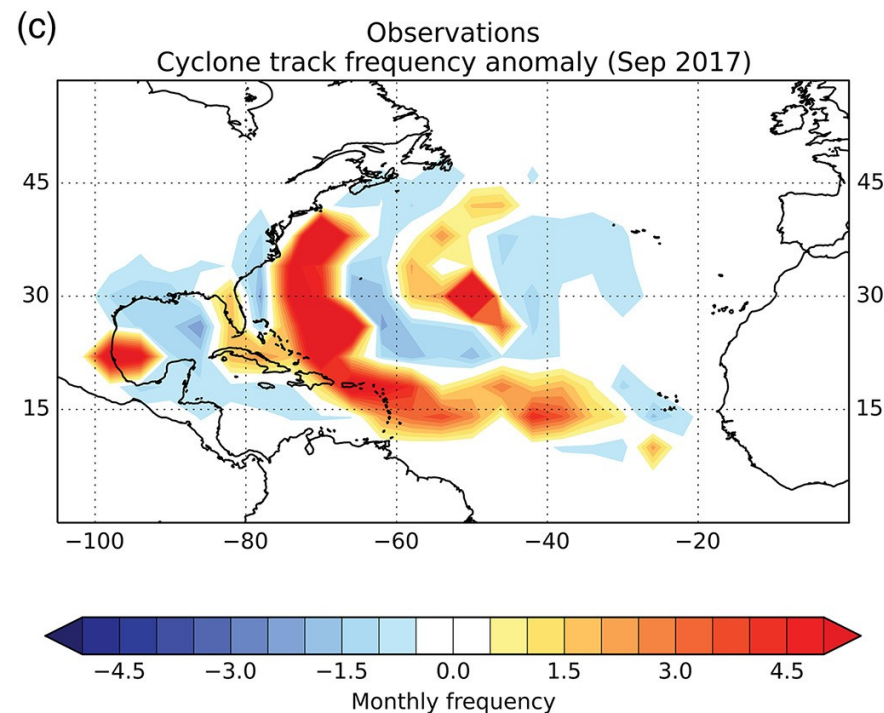
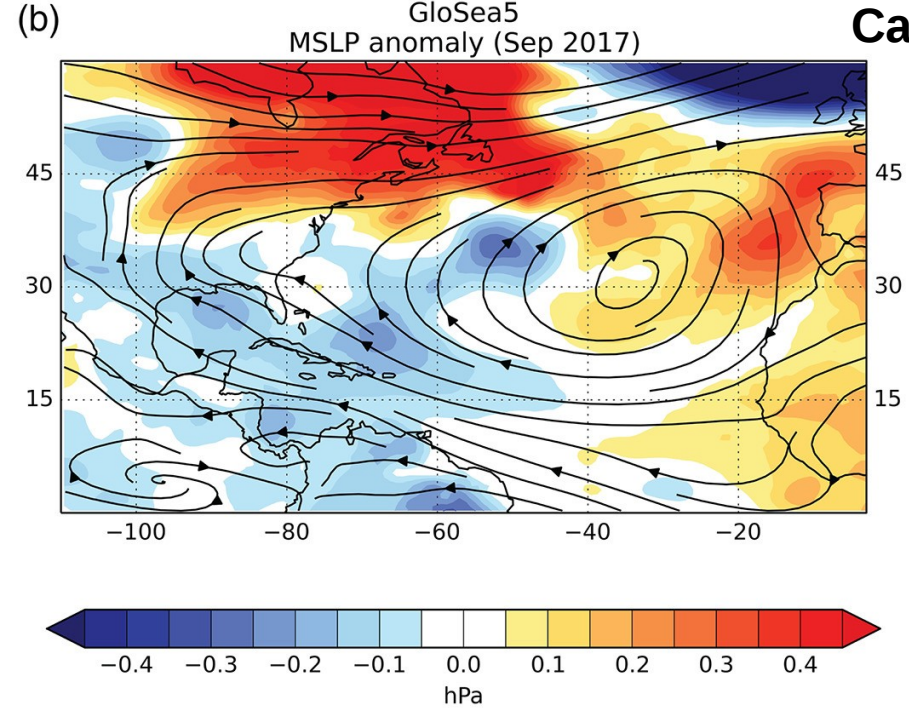
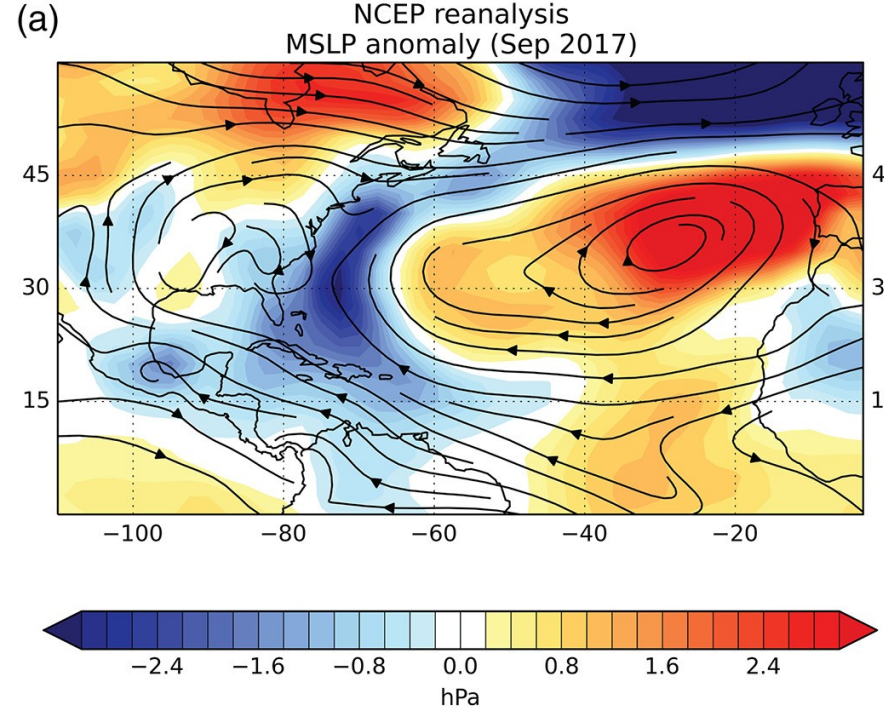
CSU TSR NOAA

(a)

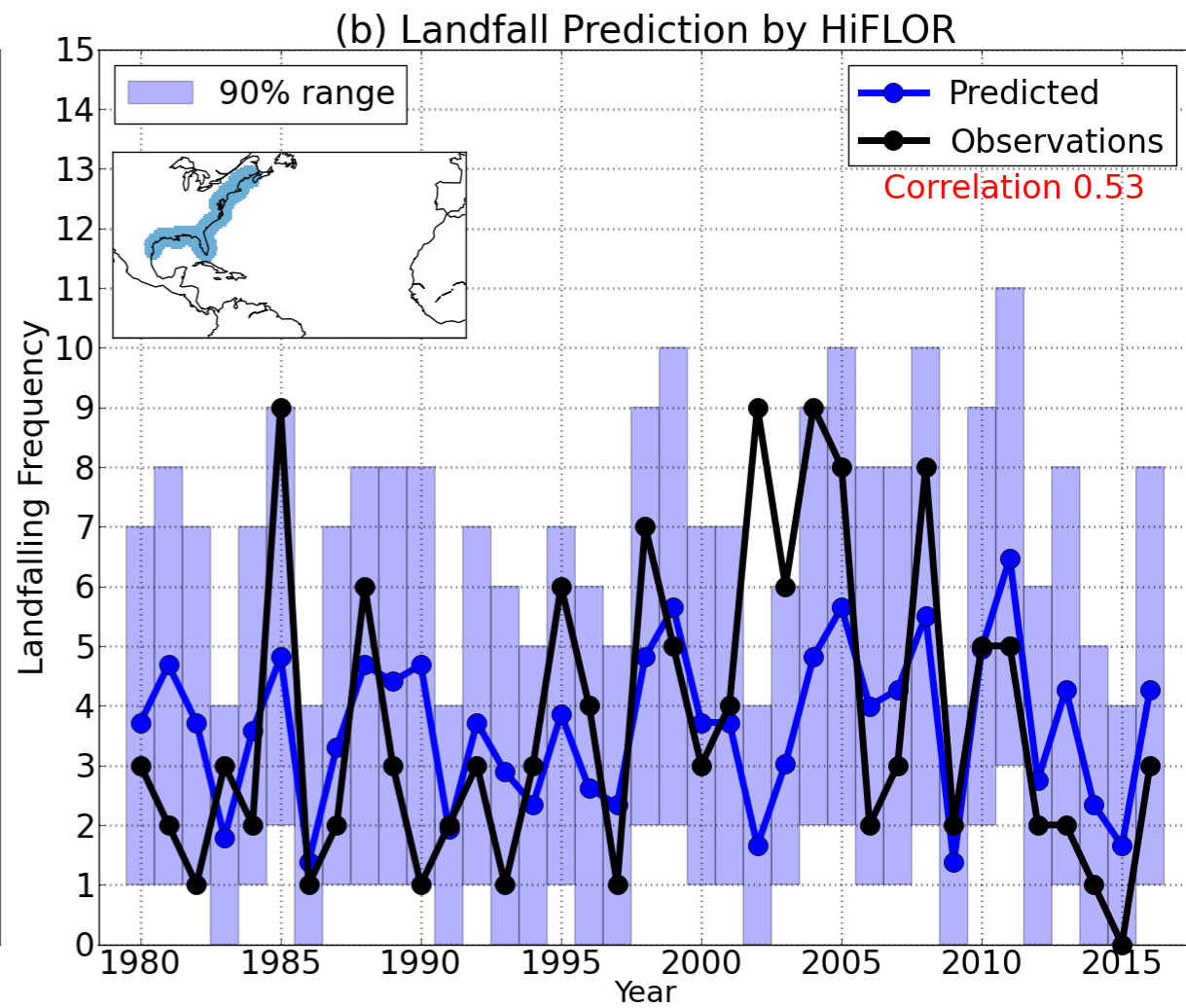
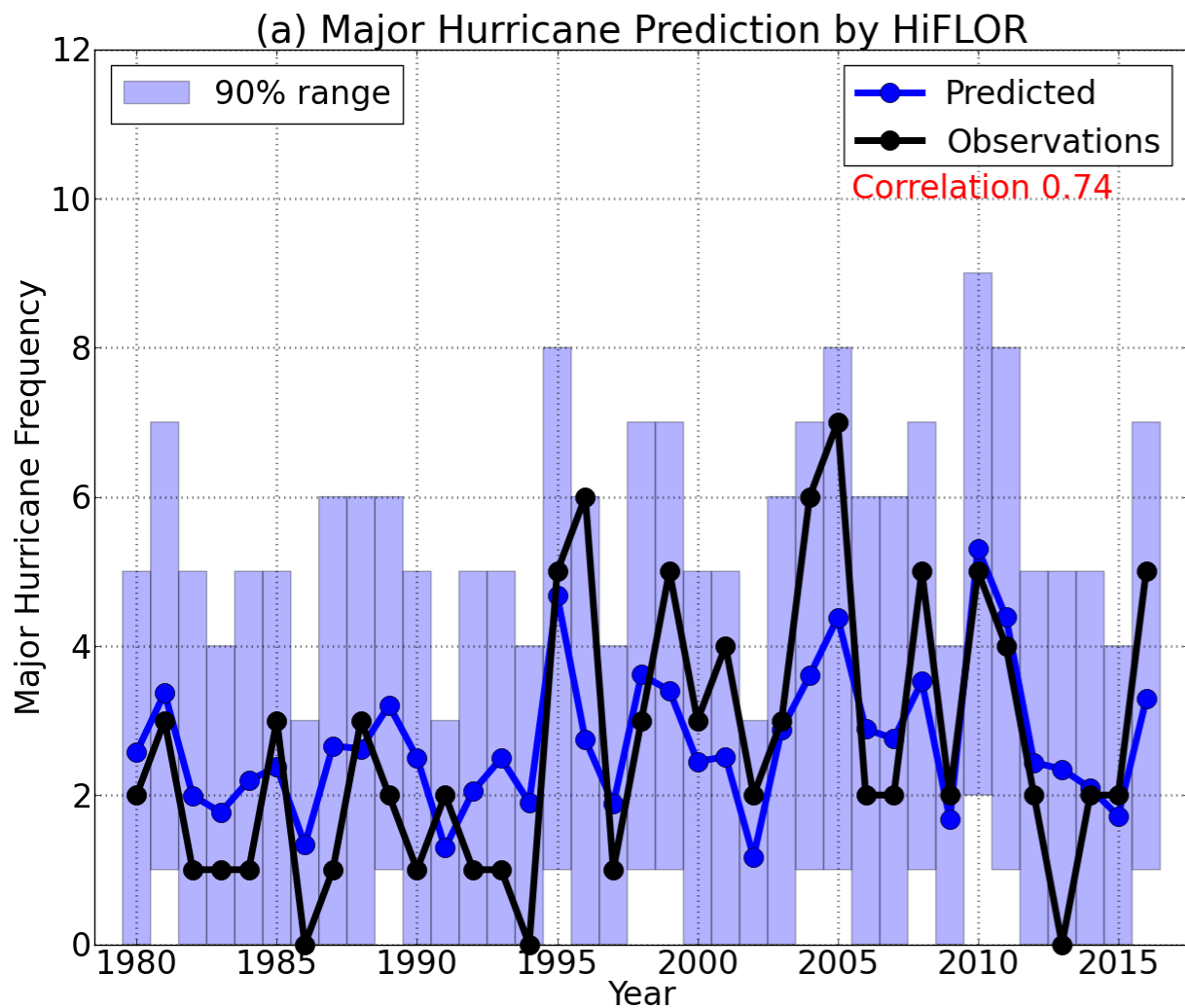


(b)





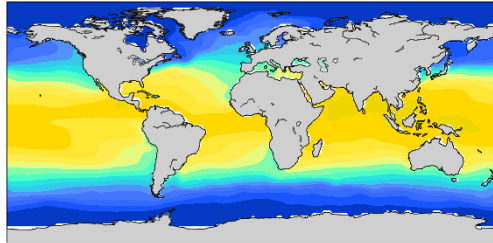
# HiFLOR Prediction from Geophysical Fluid Dynamics Laboratory



# Methodology - From reask

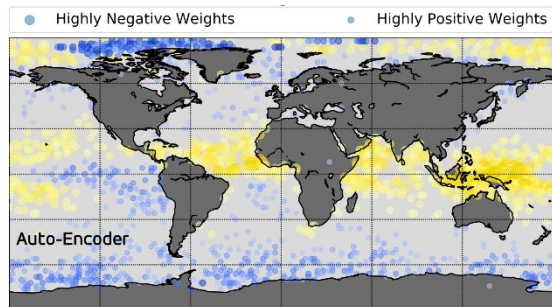
## Physical feature selection

Monthly reanalysis



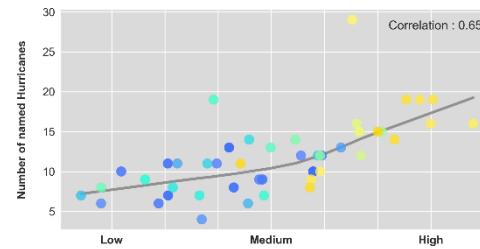
Dimensionality Reduction

- PCA
- Auto-Encoders

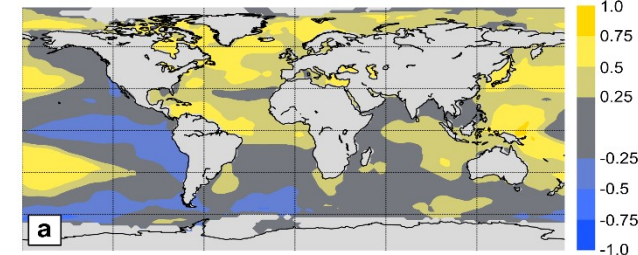


Unsupervised learning

1 - Correlation to number of TC



2 - Correlation with ASO patterns

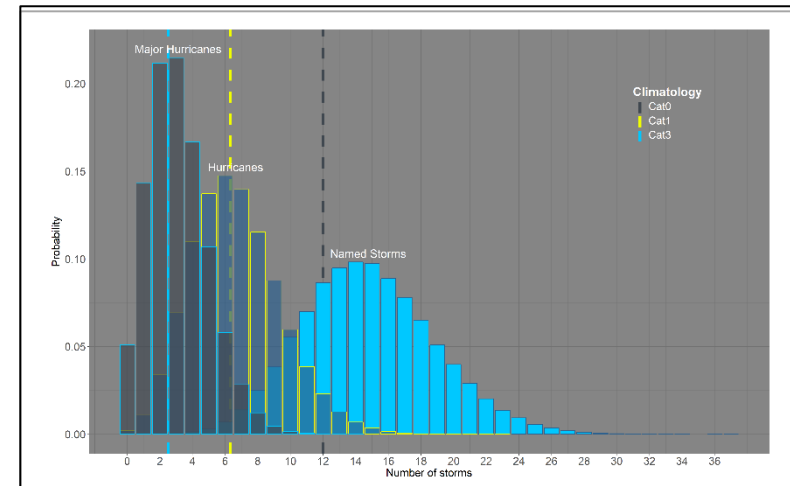


Statistical selection

Ensemble of models

~ 10 selected over 10k

Predictive Bayesian model

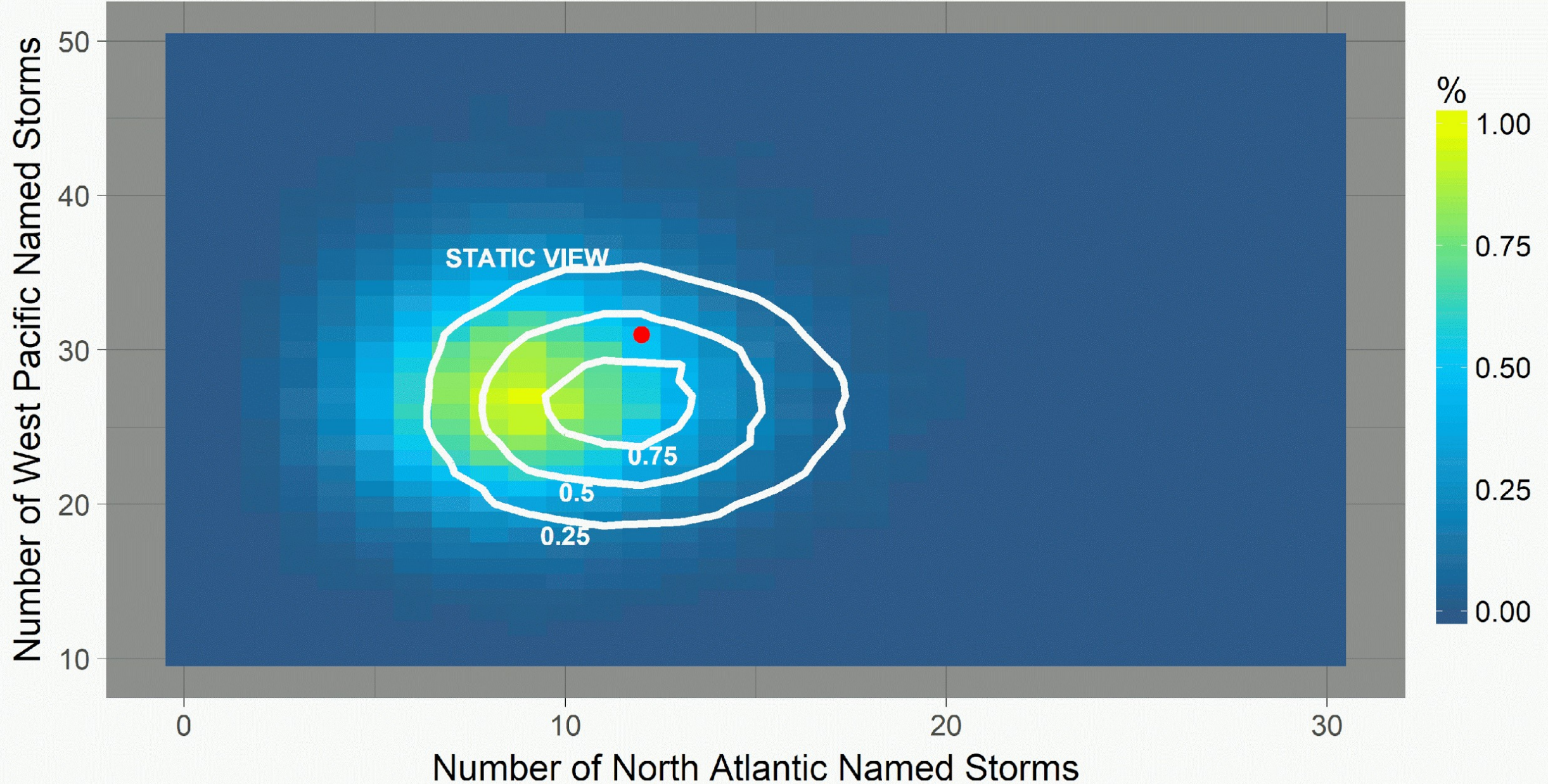


Supervised learning



# Static vs predictive views of TC risk 1978

North Atlantic and West Pacific





<http://www.seasonalhurricanepredictions.org>

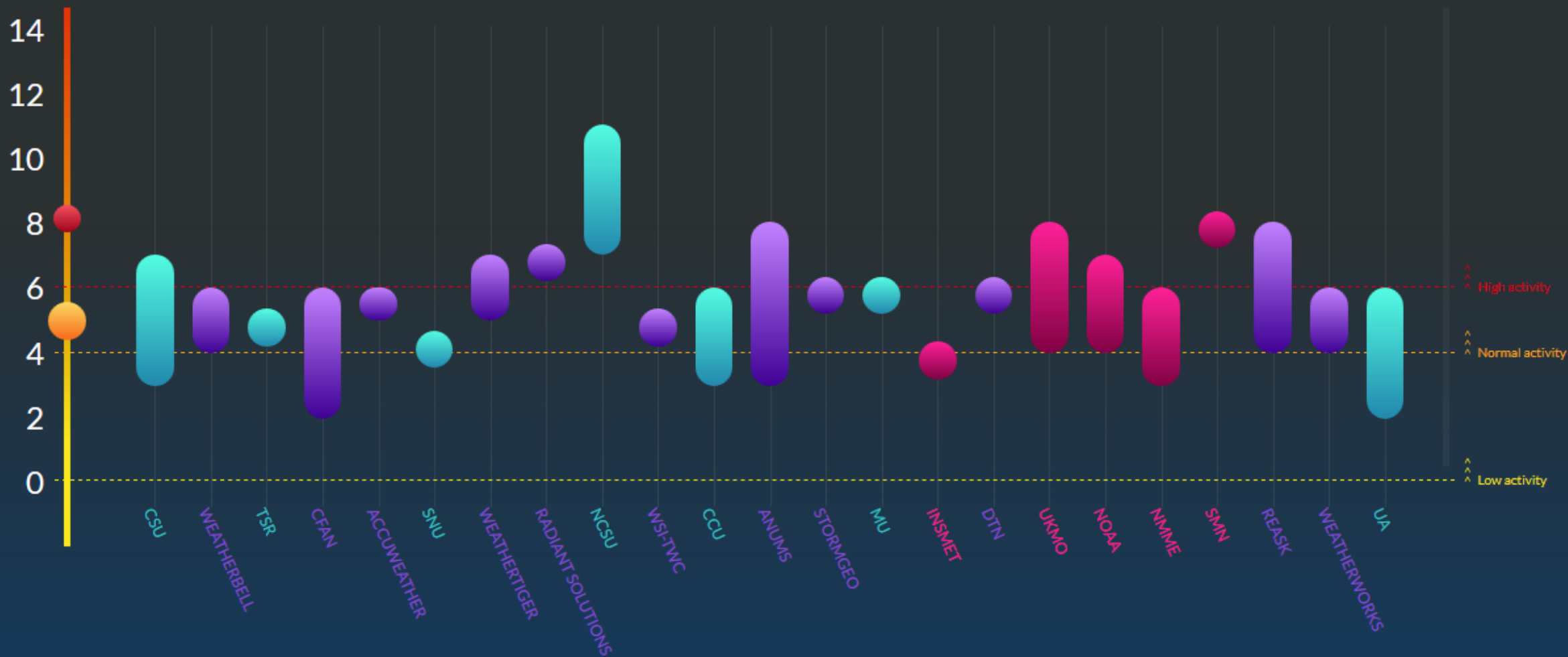
## Contributing Forecast Groups





# Seasonal Hurricane Forecast Compilation Website

<http://seasonalhurricanepredictions.org>



# New Product from CSU

Real-Time Global Tropical Cyclone Statistics Website:

<http://tropical.atmos.colostate.edu/Realtime/>

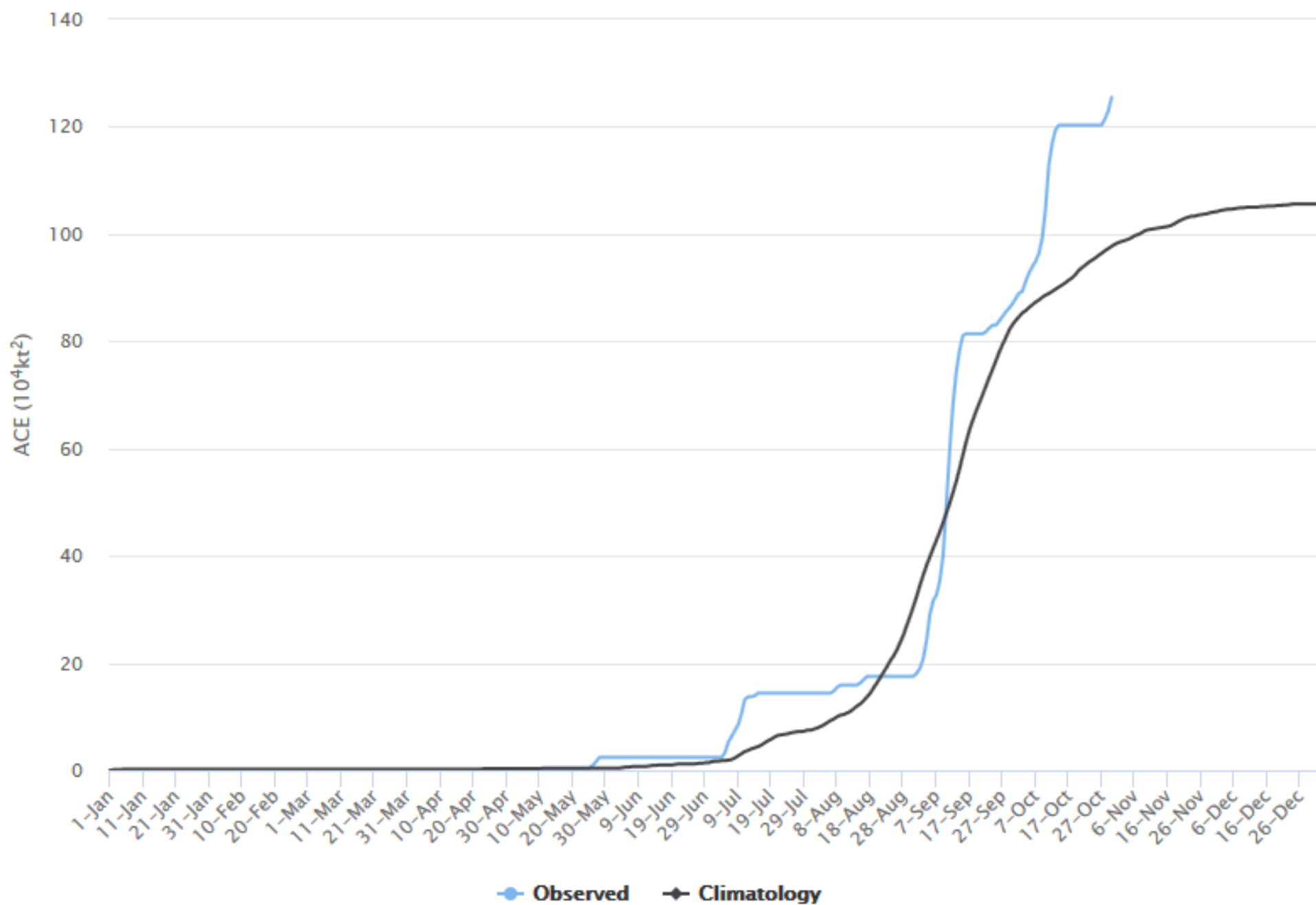
Northern Hemisphere Tropical Cyclone Activity for 2018 (2018/2019 for the Southern Hemisphere)

1981-2010 Climatological Activity Through October 30 in Parentheses

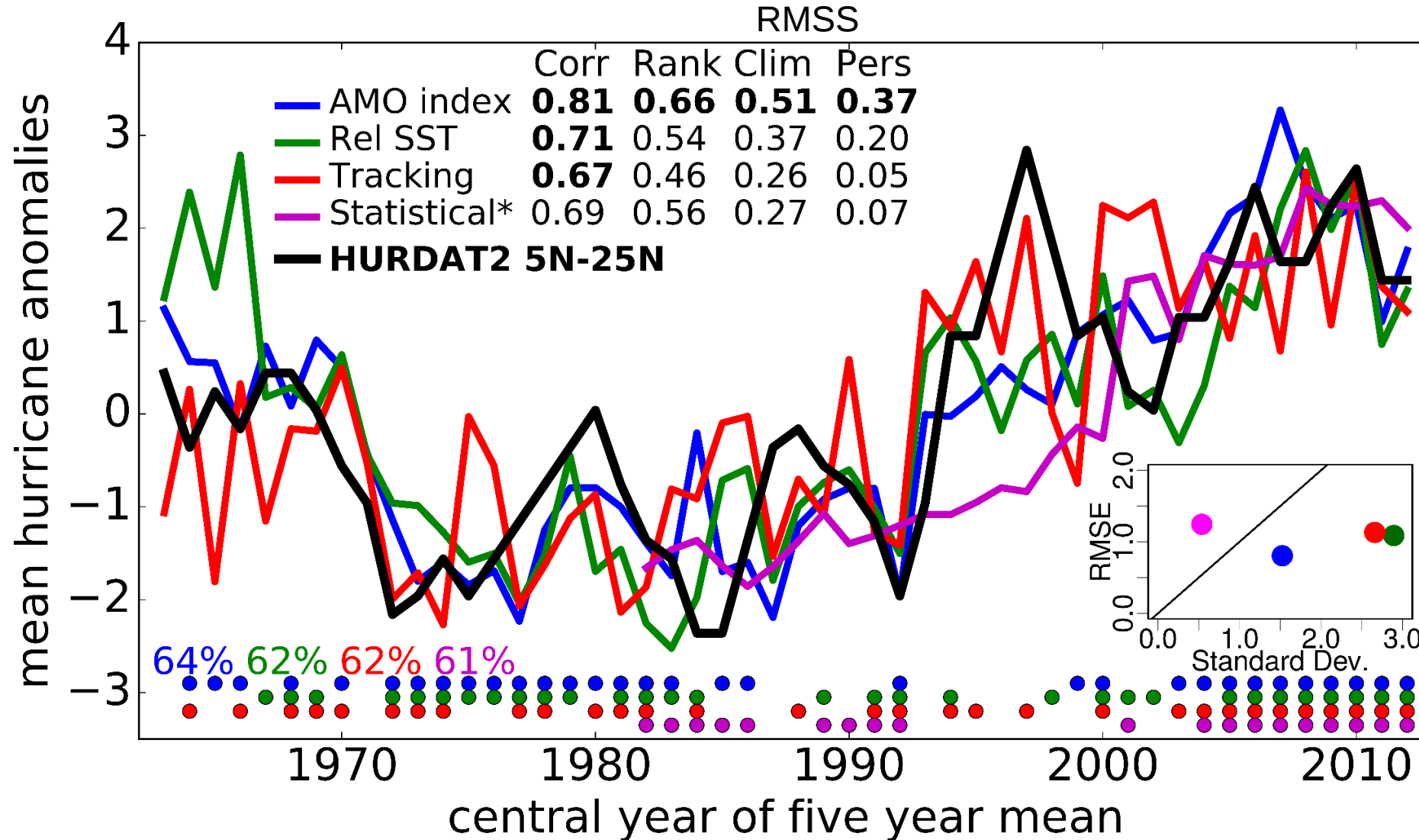
Basin	Named Storms	Named Storm Days	Hurricanes	Hurricane Days	Major Hurricanes	Major Hurricane Days	Accumulated Cyclone Energy
<u>North Atlantic</u>	15 (11.1)	86.25 (53.9)	8 (5.8)	25.75 (22.4)	2 (2.5)	5.00 (6.0)	127.0 (97.7)
<u>Northeast Pacific (East of 180°)</u>	22 (16.2)	123.25 (71.5)	13 (8.7)	67.50 (29.5)	10 (4.3)	35.00 (8.9)	313.5 (129.7)
<u>Northwest Pacific (West of 180°)</u>	26 (22.6)	128.50 (116.3)	14 (14.3)	60.25 (56.7)	9 (7.3)	29.00 (19.1)	320.7 (250.3)
<u>North Indian</u>	5 (3.0)	15.75 (8.0)	3 (0.8)	5.75 (1.7)	1 (0.5)	0.50 (0.7)	23.2 (10.6)
<u>Northern Hemisphere</u>	68 (52.9)	353.75 (249.7)	38 (29.6)	159.25 (110.3)	22 (14.6)	69.50 (34.7)	784.4 (488.3)
<u>South Indian (West of 135°E)</u>	1 (1.0)	1.50 (2.6)	0 (0.1)	0.00 (0.3)	0 (0.0)	0.00 (0.0)	0.8 (2.2)
<u>South Pacific (East of 135°E)</u>	1 (0.1)	1.75 (0.3)	0 (0.0)	0.00 (0.1)	0 (0.0)	0.00 (0.0)	0.9 (0.5)
<u>Southern Hemisphere</u>	2 (1.1)	3.25 (2.9)	0 (0.1)	0.00 (0.4)	0 (0.0)	0.00 (0.0)	1.7 (2.7)

Global statistics were last modified: October 30 2018 09:00 MT

# Current Season North Atlantic Ocean ACE (1981-2010 Climo)



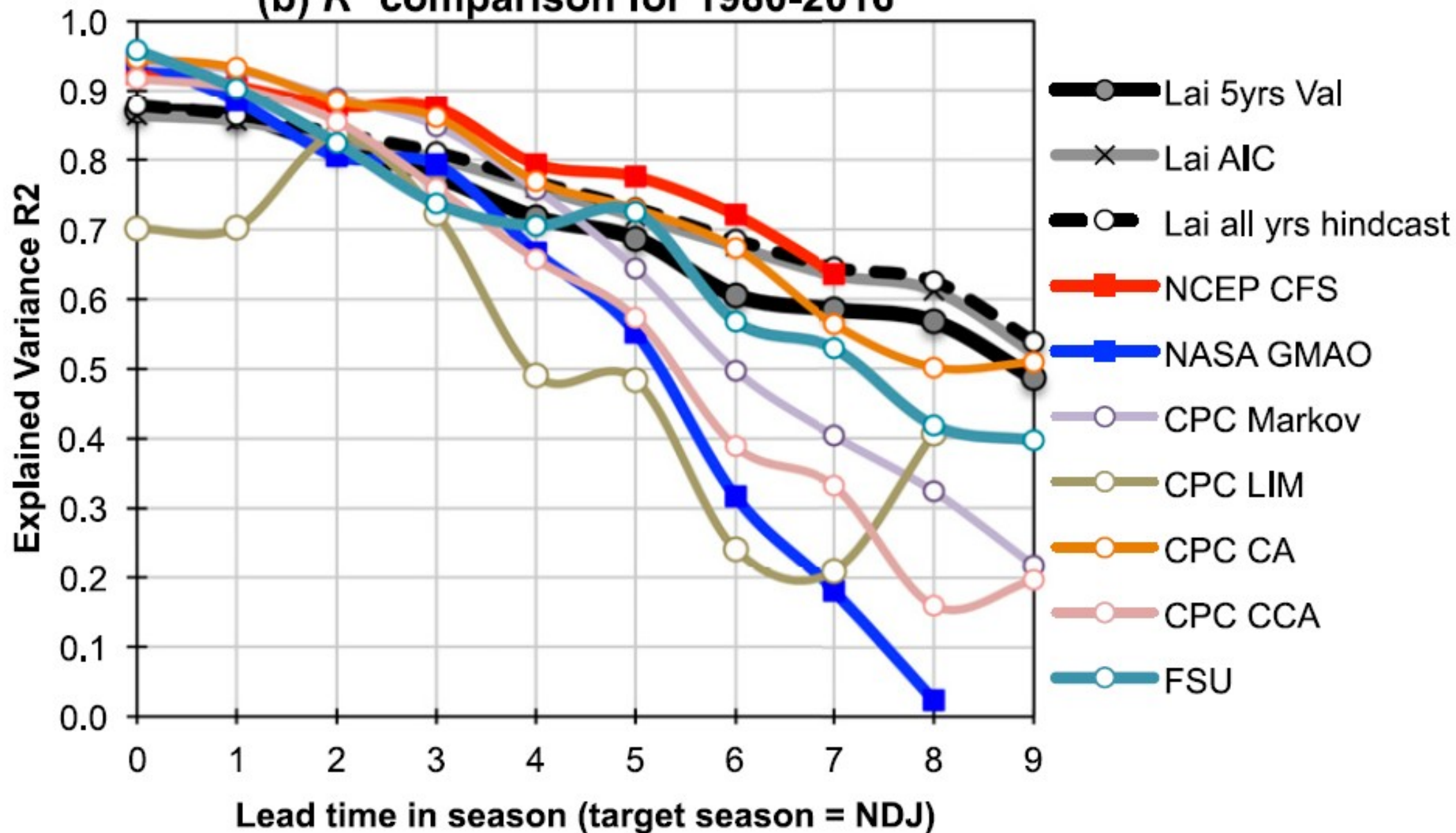
# Skill, average year 1-5



# Seasonal Hurricane Forecast Challenges

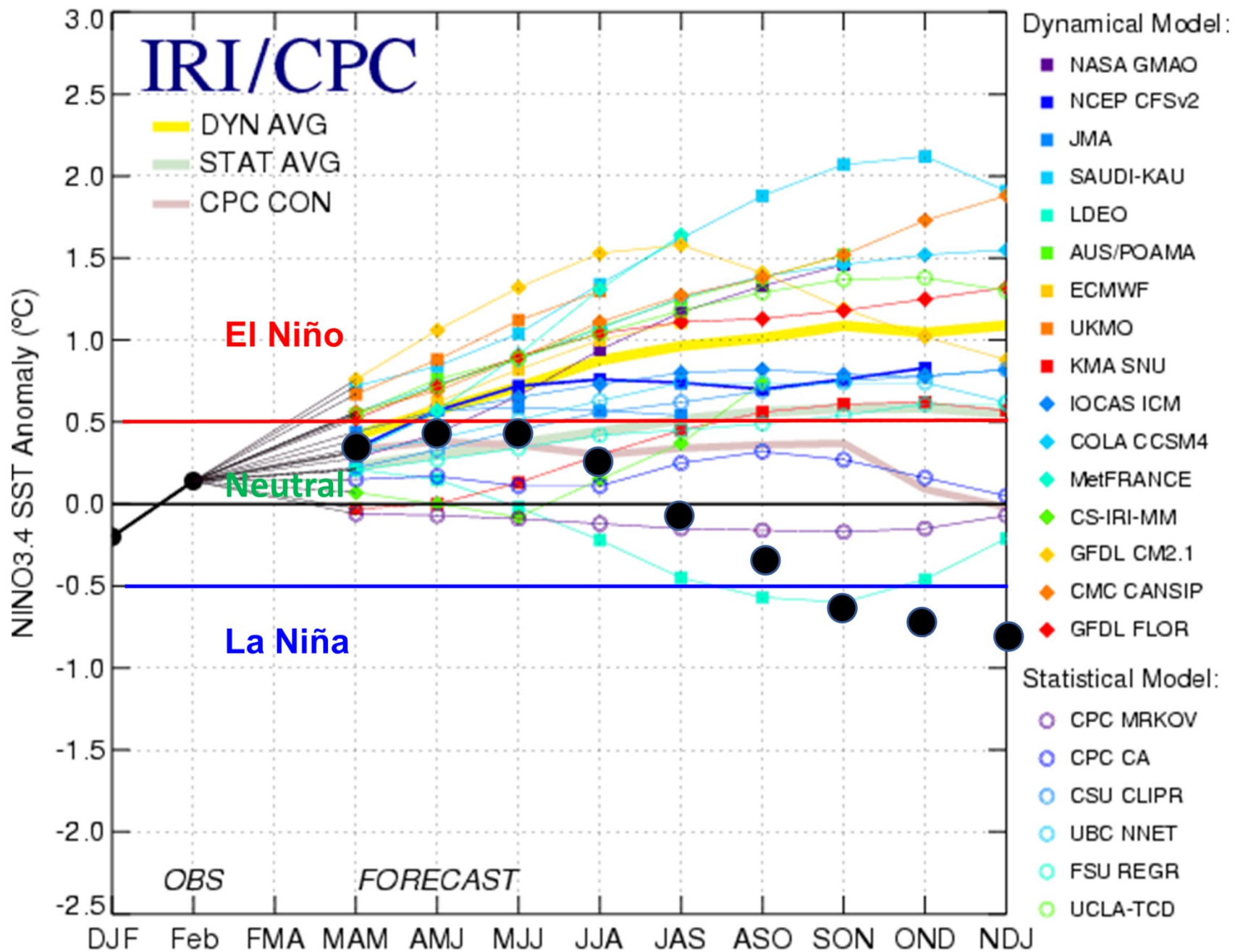


CSU 1997 Hurricane Forecast Verification Paper – 7 Hurricanes Predicted, 3 Observed

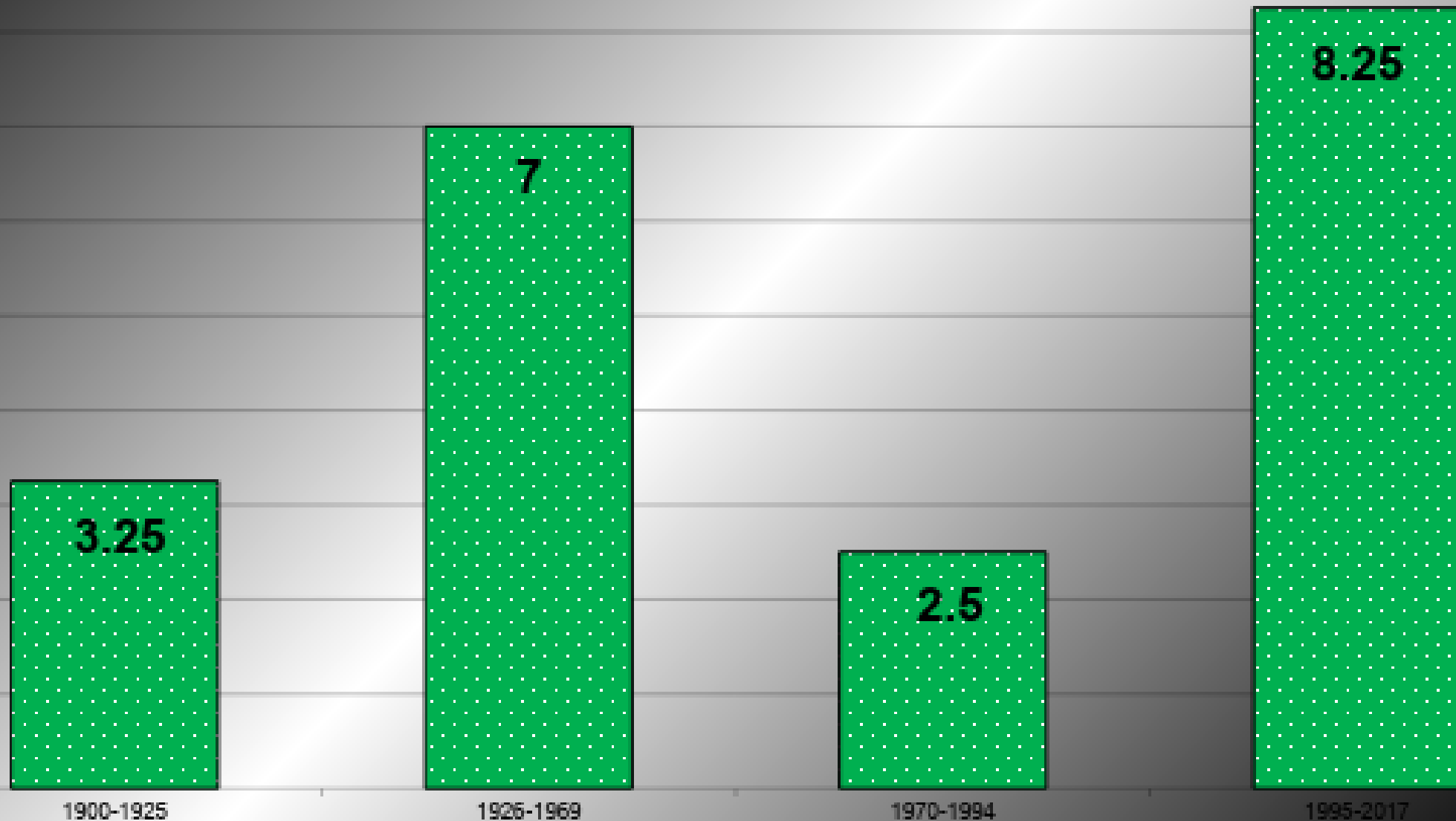
(b)  $R^2$  comparison for 1980-2016



# Mid-Mar 2017 Plume of Model ENSO Predictions

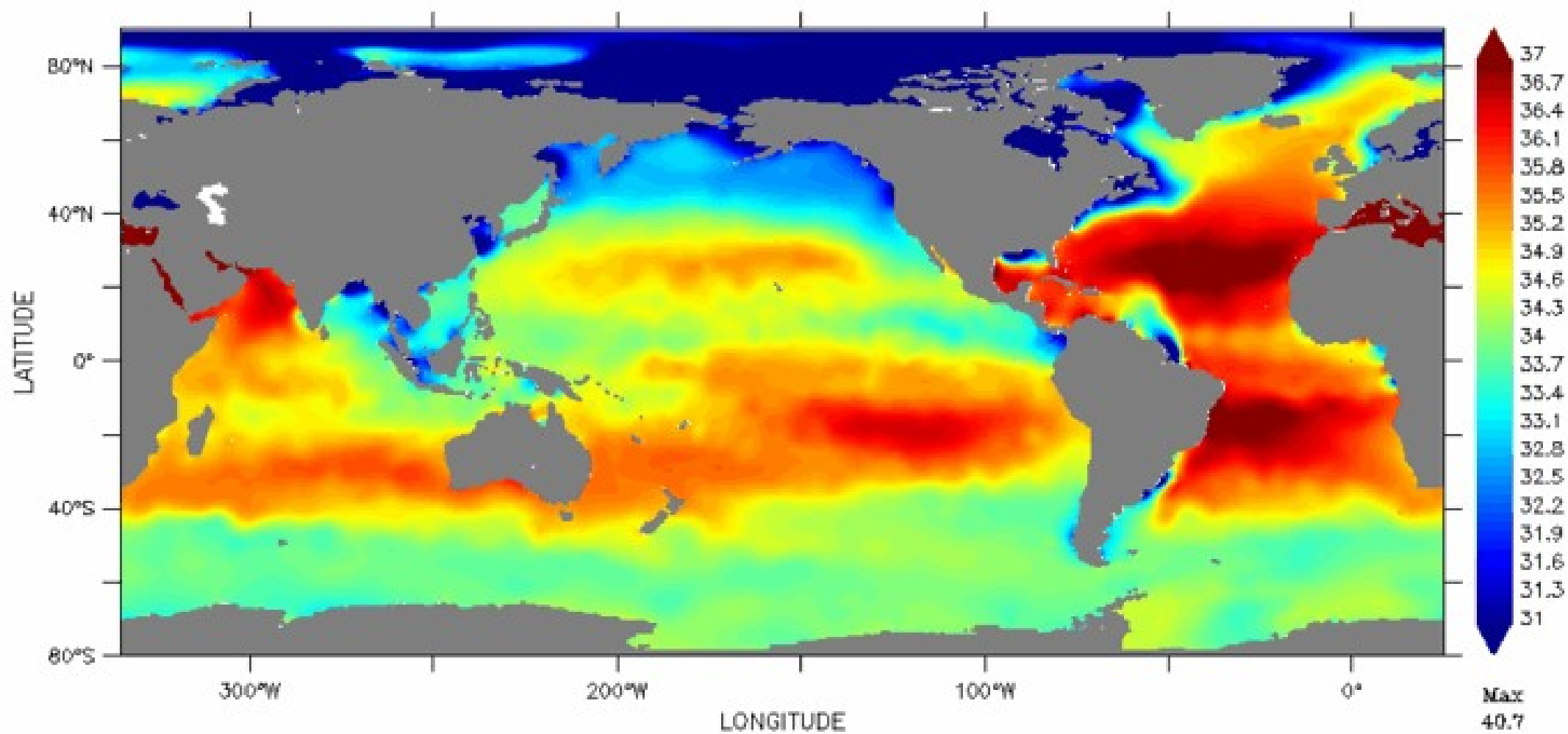


# Annual Number of Days with Cat 3-4-5 Hurricanes



# GLOBAL SURFACE SALINITY

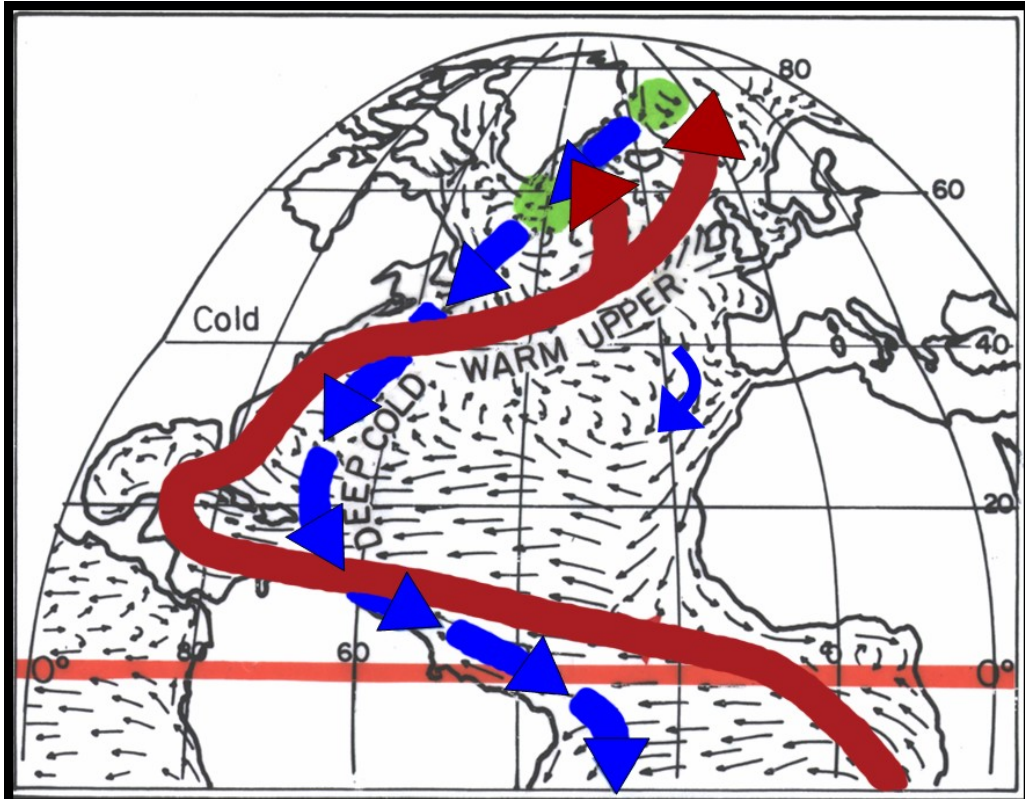
Global



Depth (m) : 0  
time : 01-jul-2005 (climatology)

Salinity (psu)

Max  
40.7  
Min  
3.3  
Average  
34.5

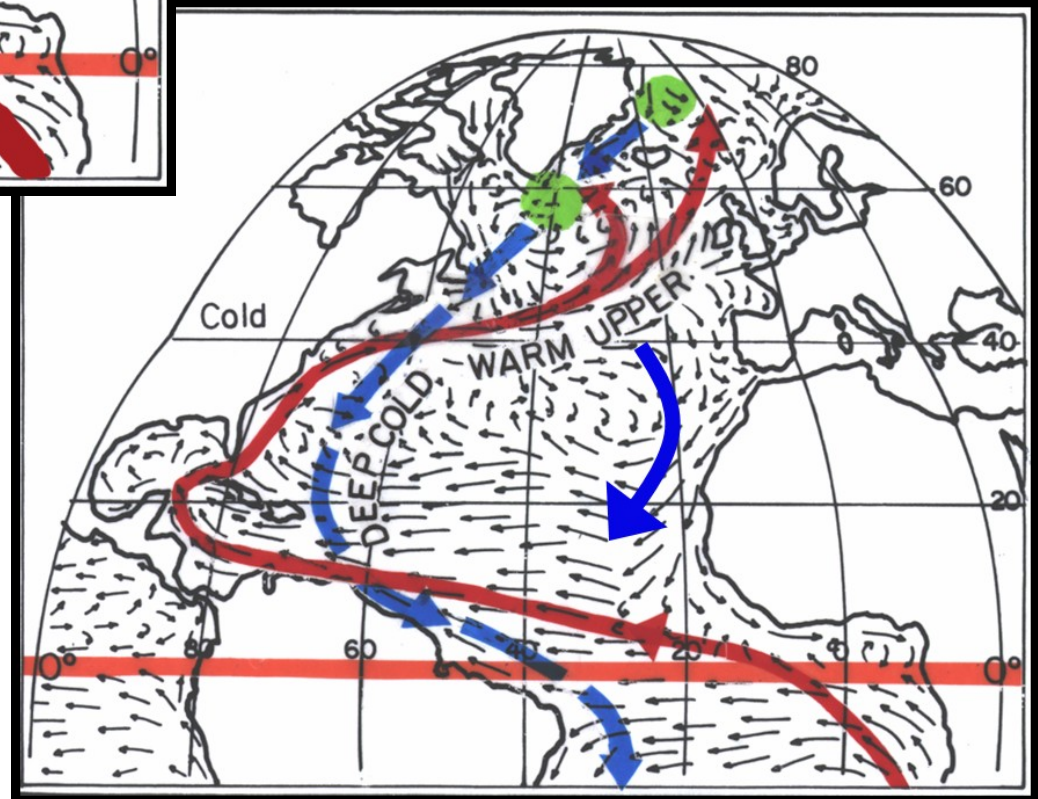


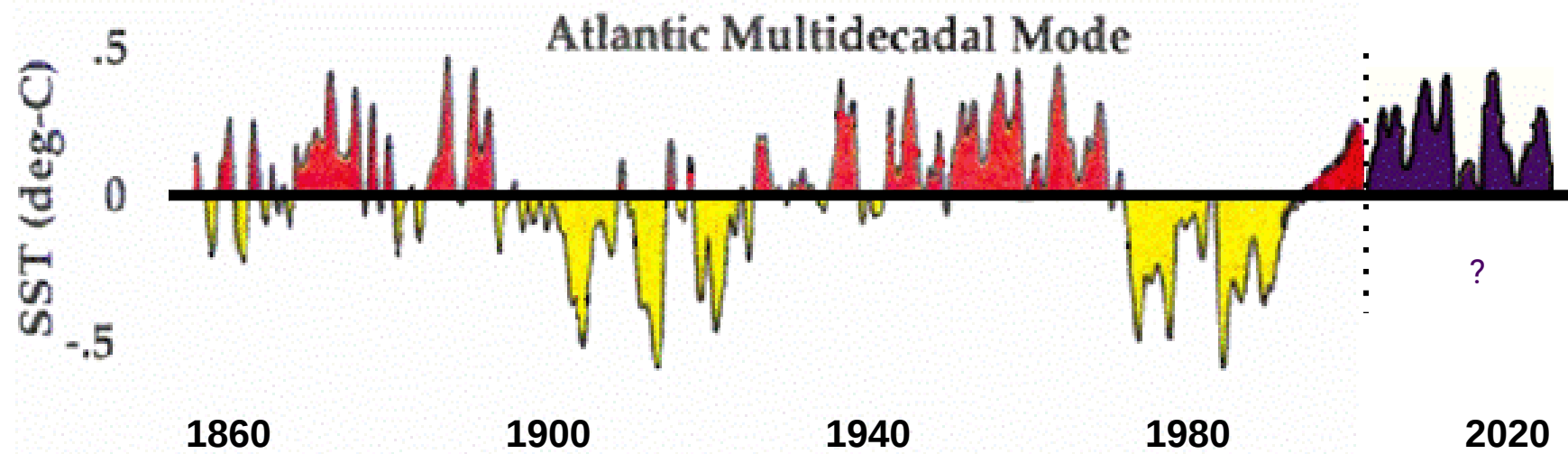
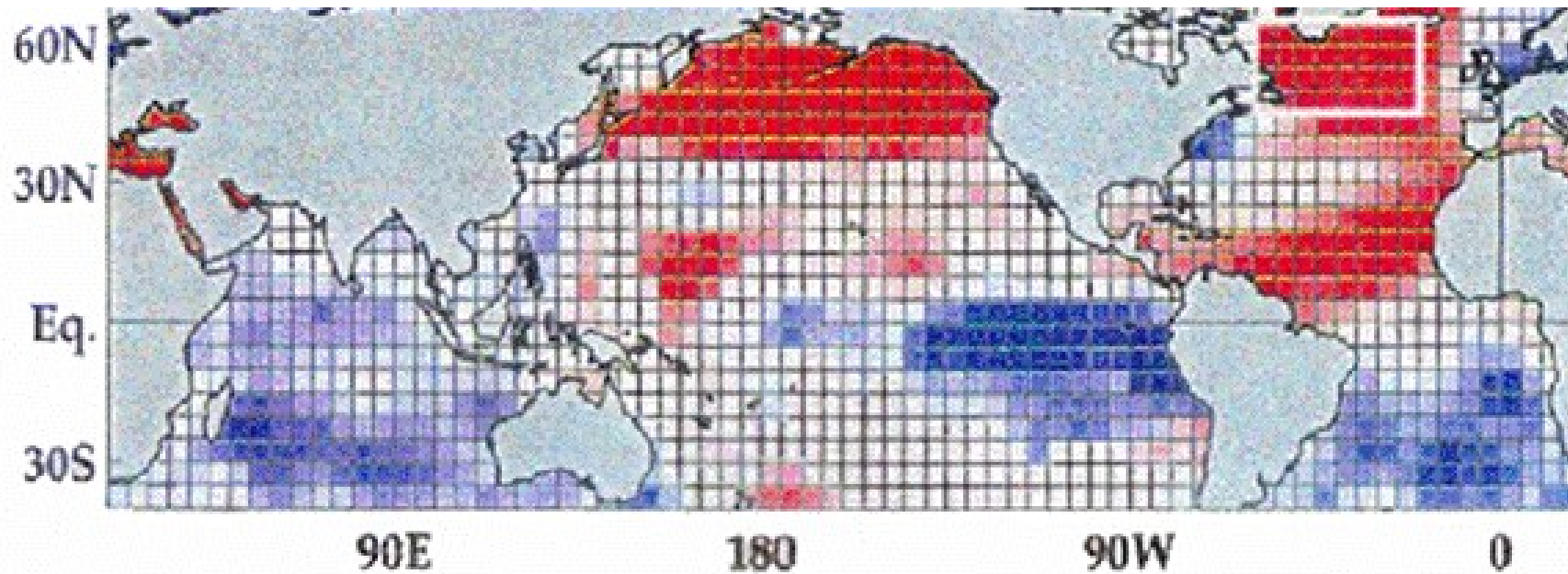
**THC (or AMO)**

**←  
STRONG**

**THC (or AMO)**

**→  
WEAK**

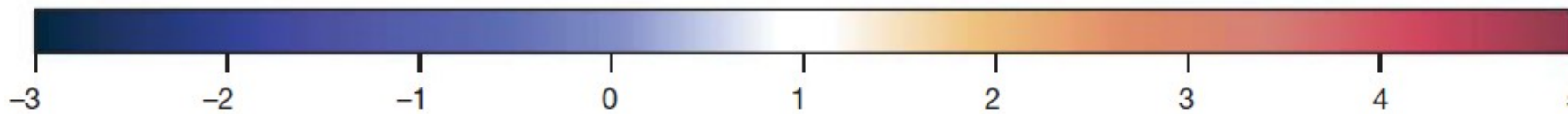
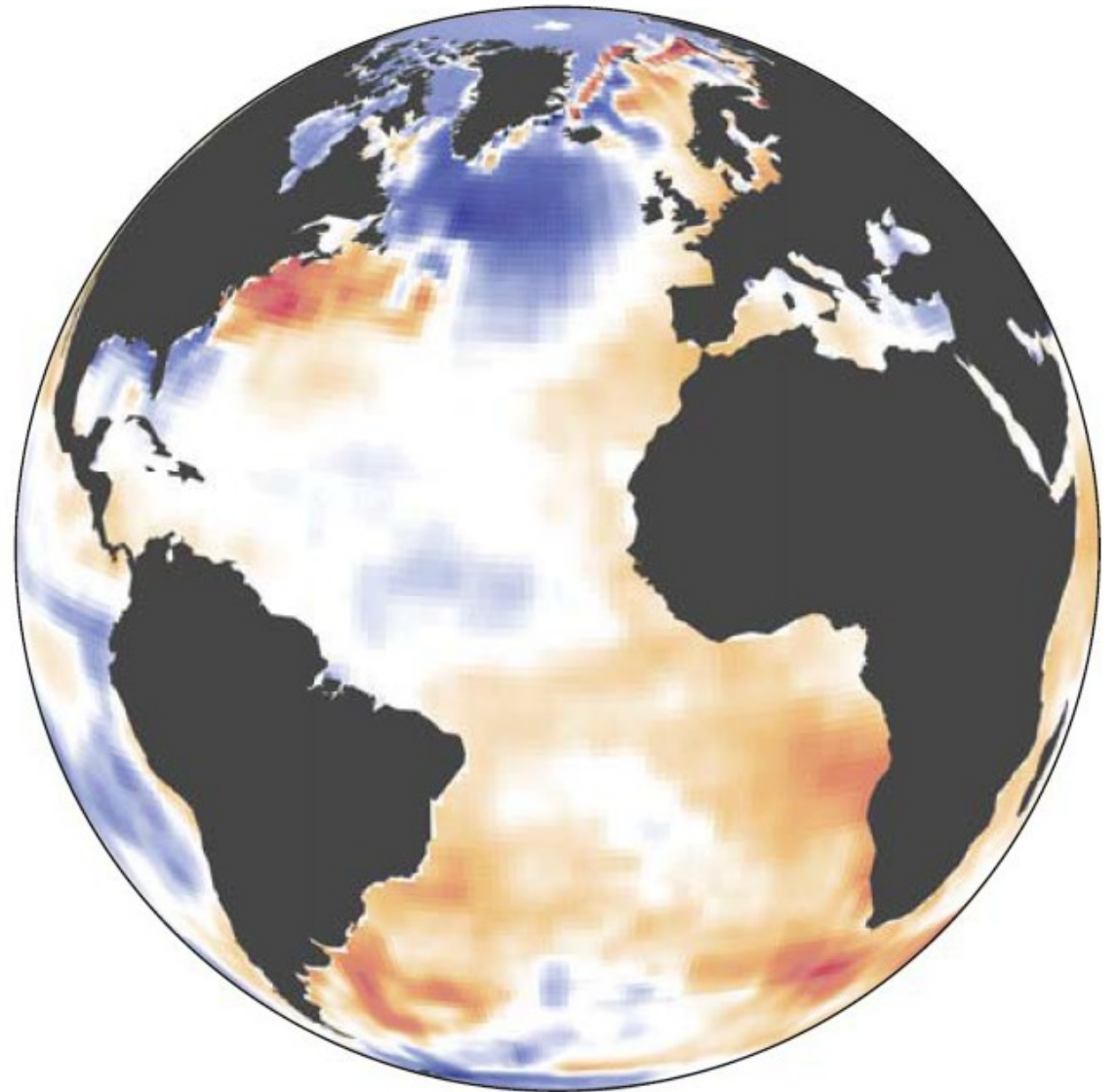
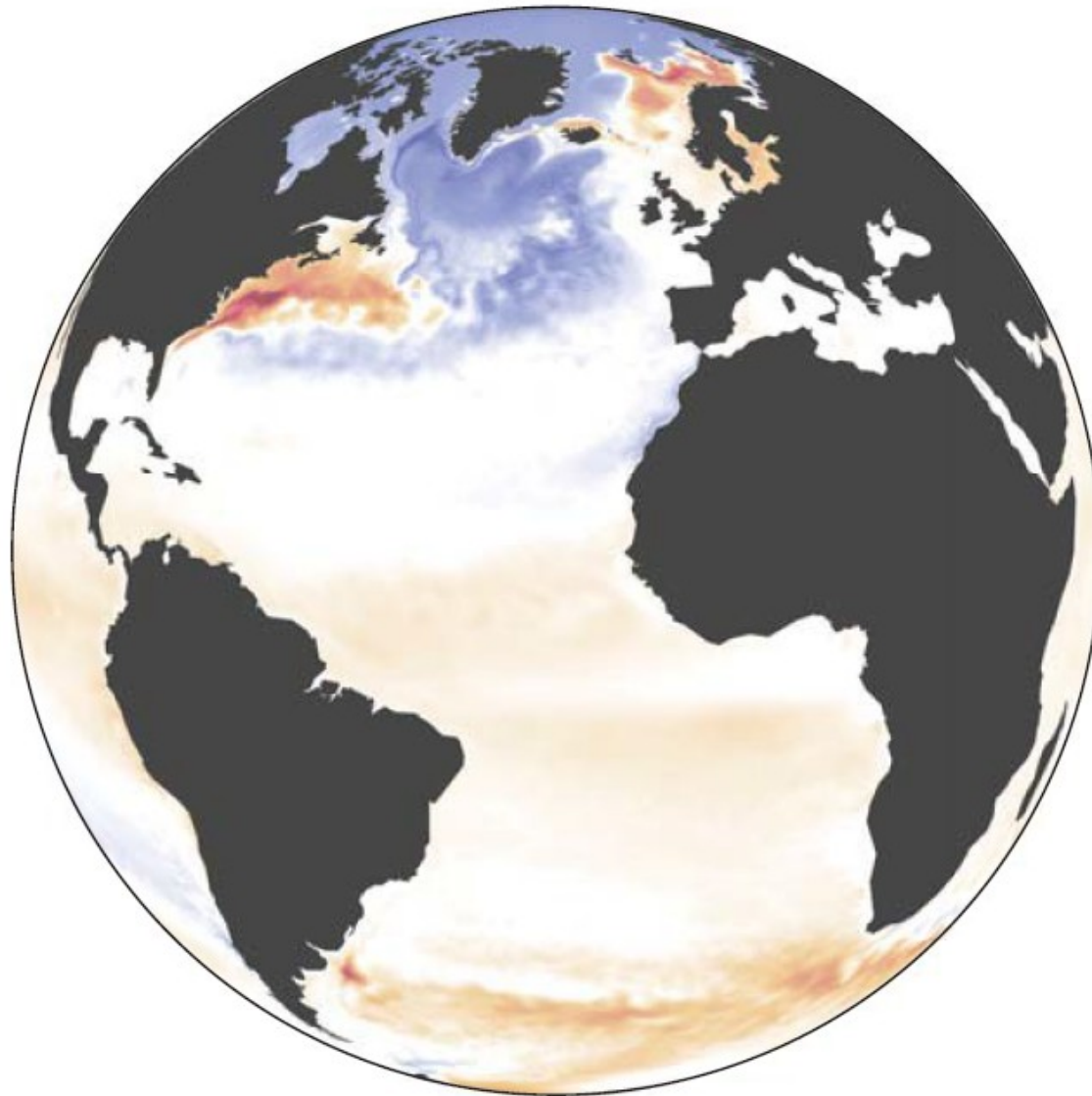




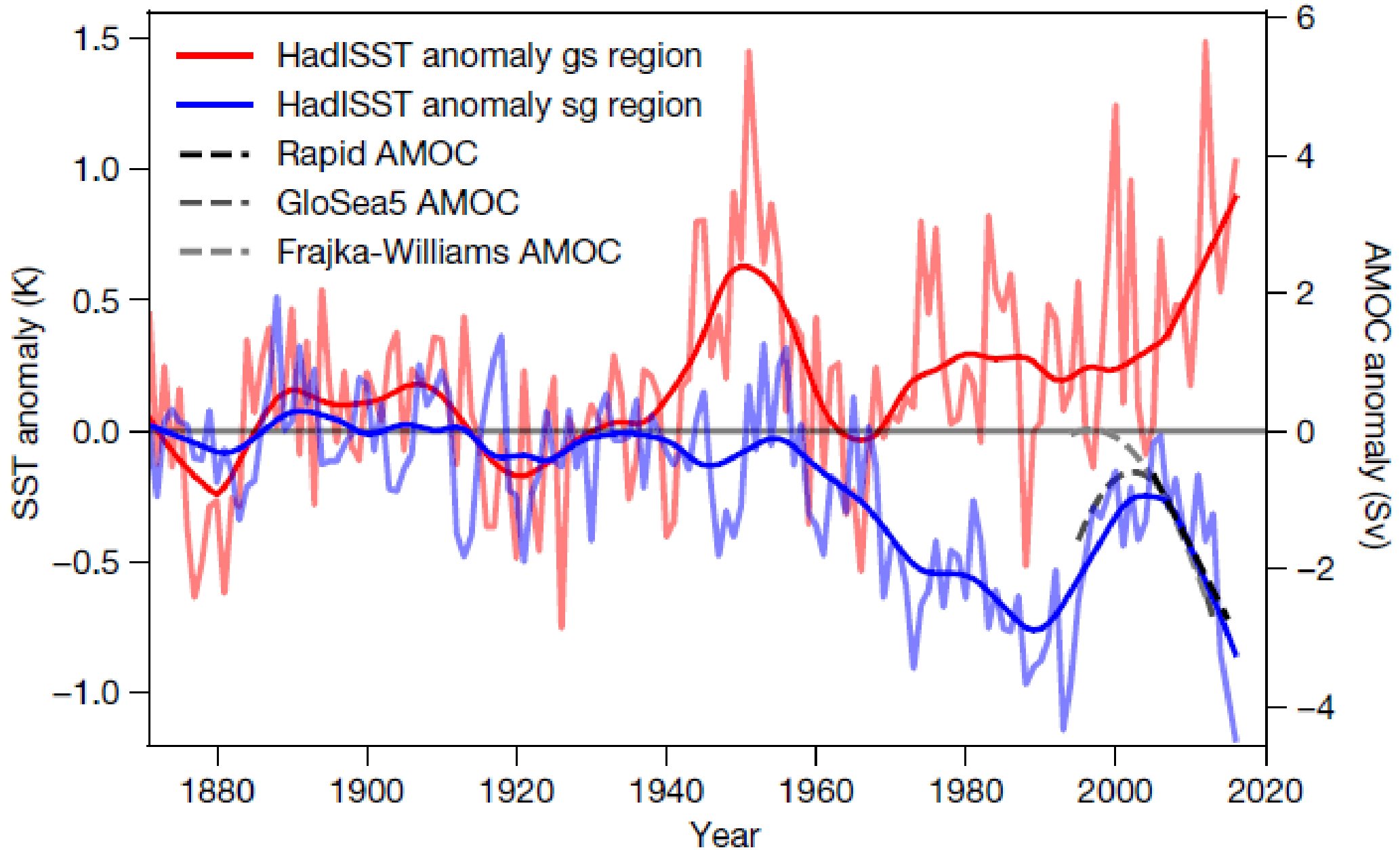
*Goldenberg et al. (2001)*

CM2.6 model

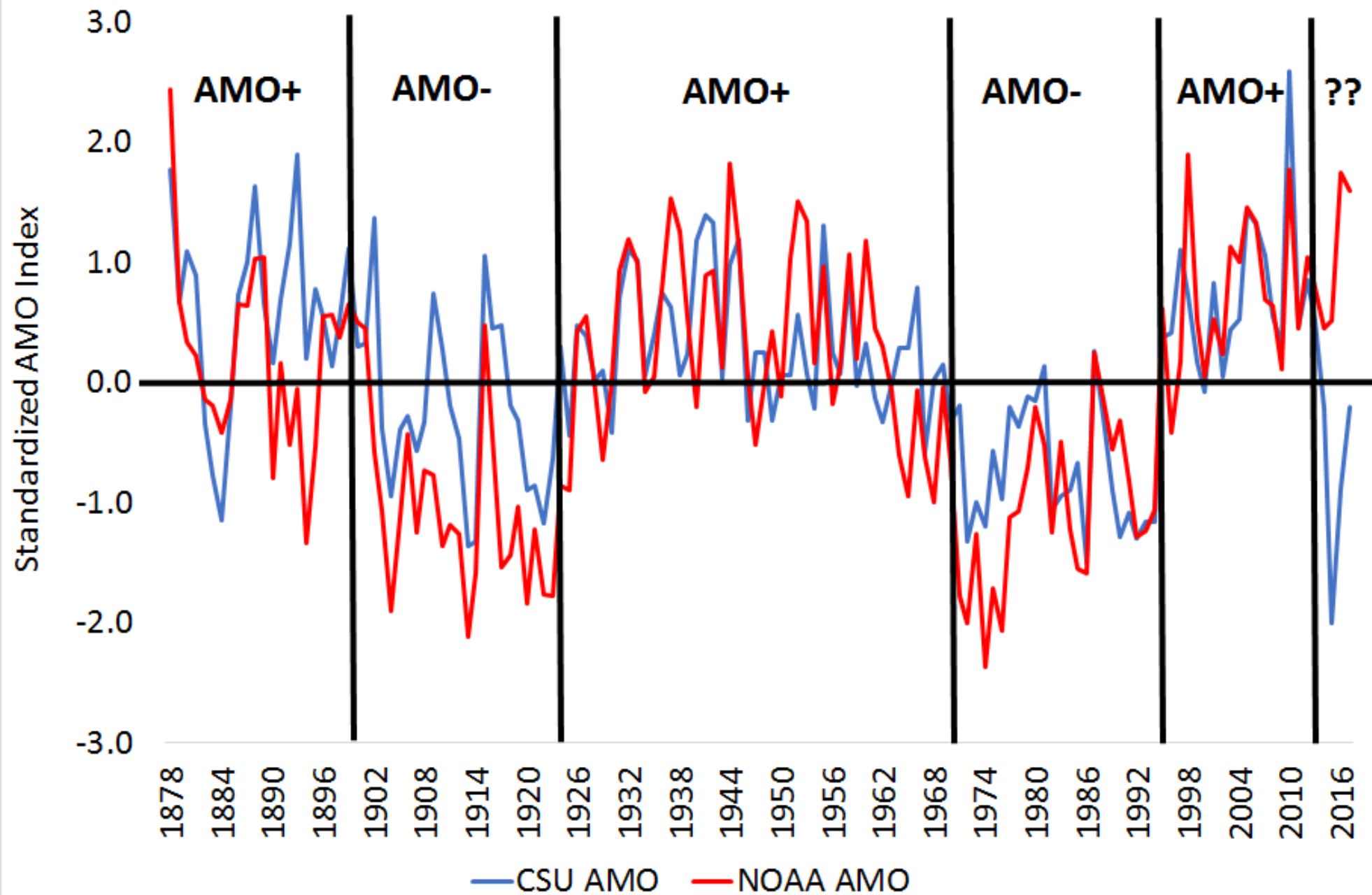
HadISST data



Local SST trend normalized to global SST trend



### Annual CSU AMO vs. NOAA AMO (1878-2017)

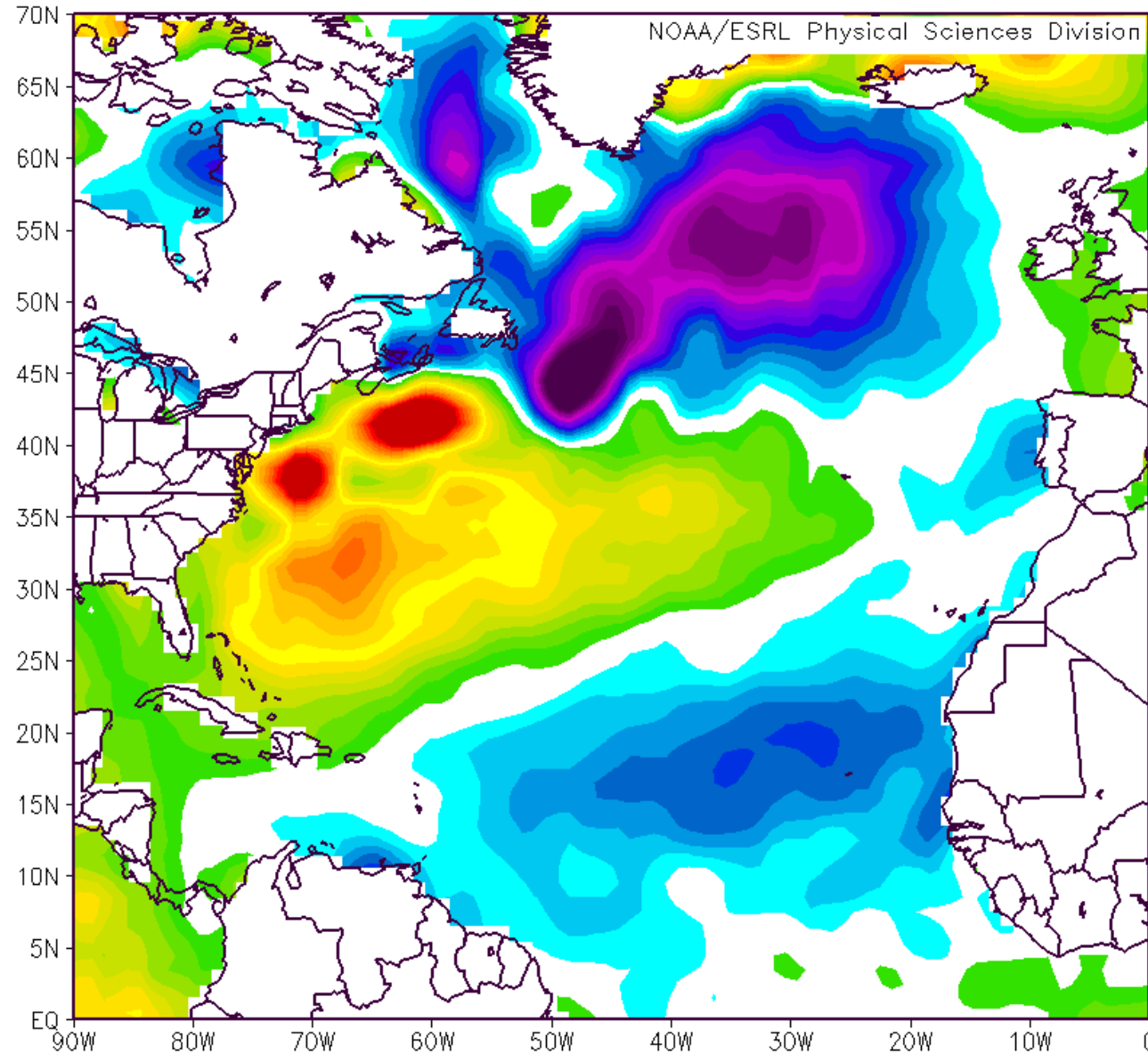




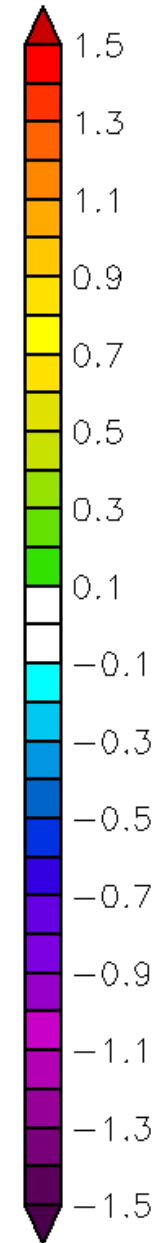
NOAA OI SST

Surface SST (C) Composite Anomaly 1981-2010 climo

**April to June:  
2014-2018 minus  
1995-2012**



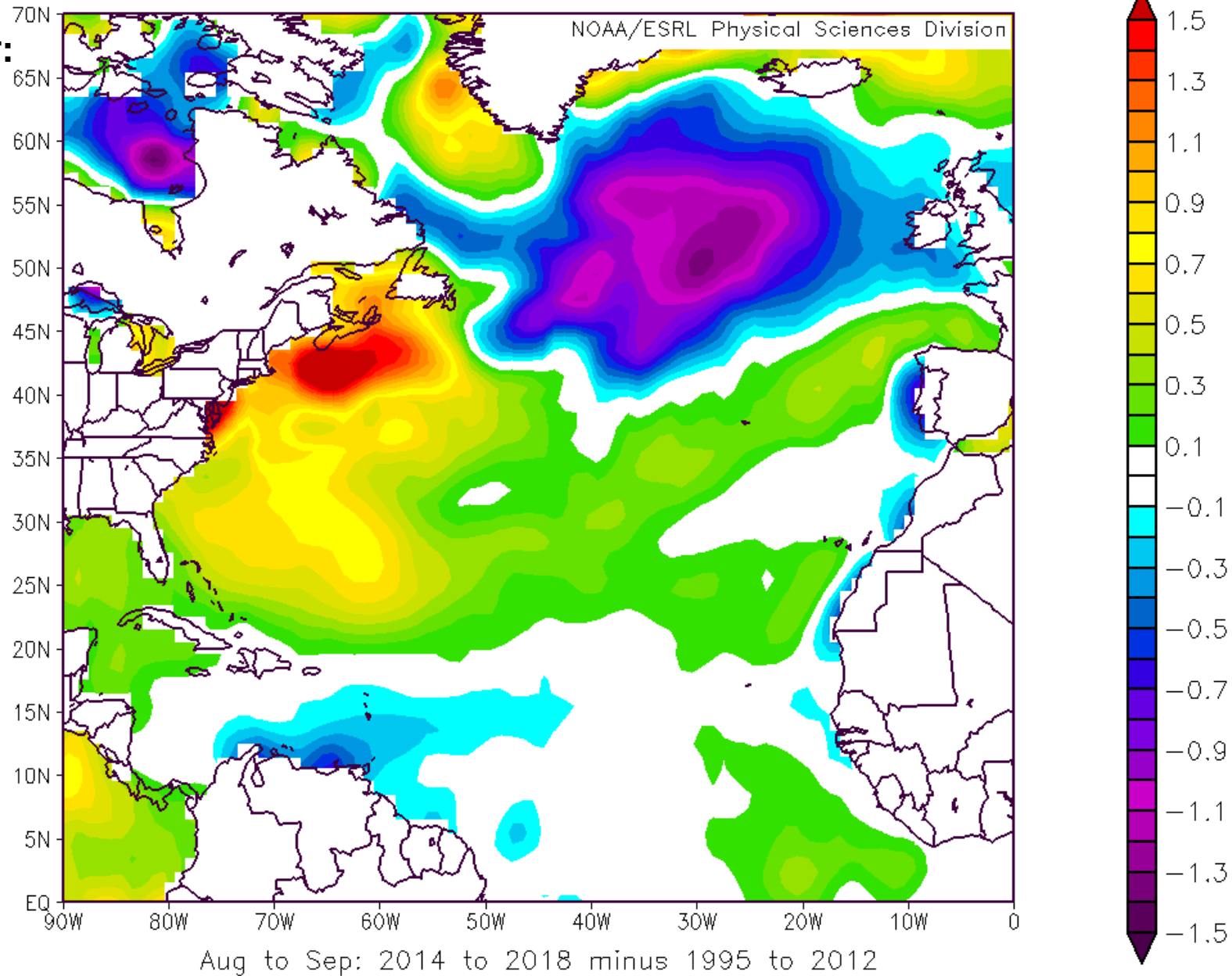
Apr to Jun: 2014 to 2018 minus 1995 to 2012



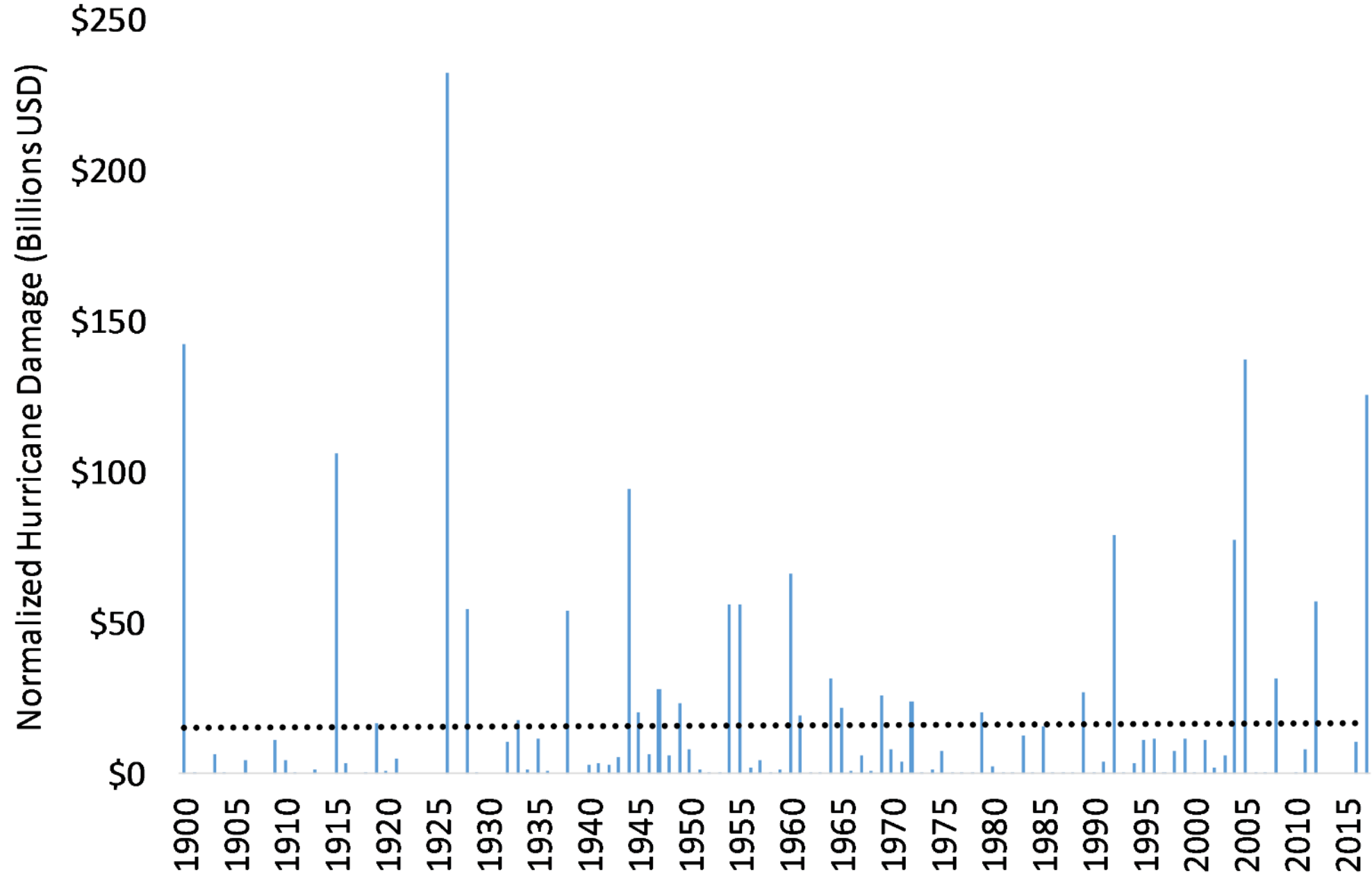
NOAA OI SST

Surface SST (C) Composite Anomaly 1981-2010 climo

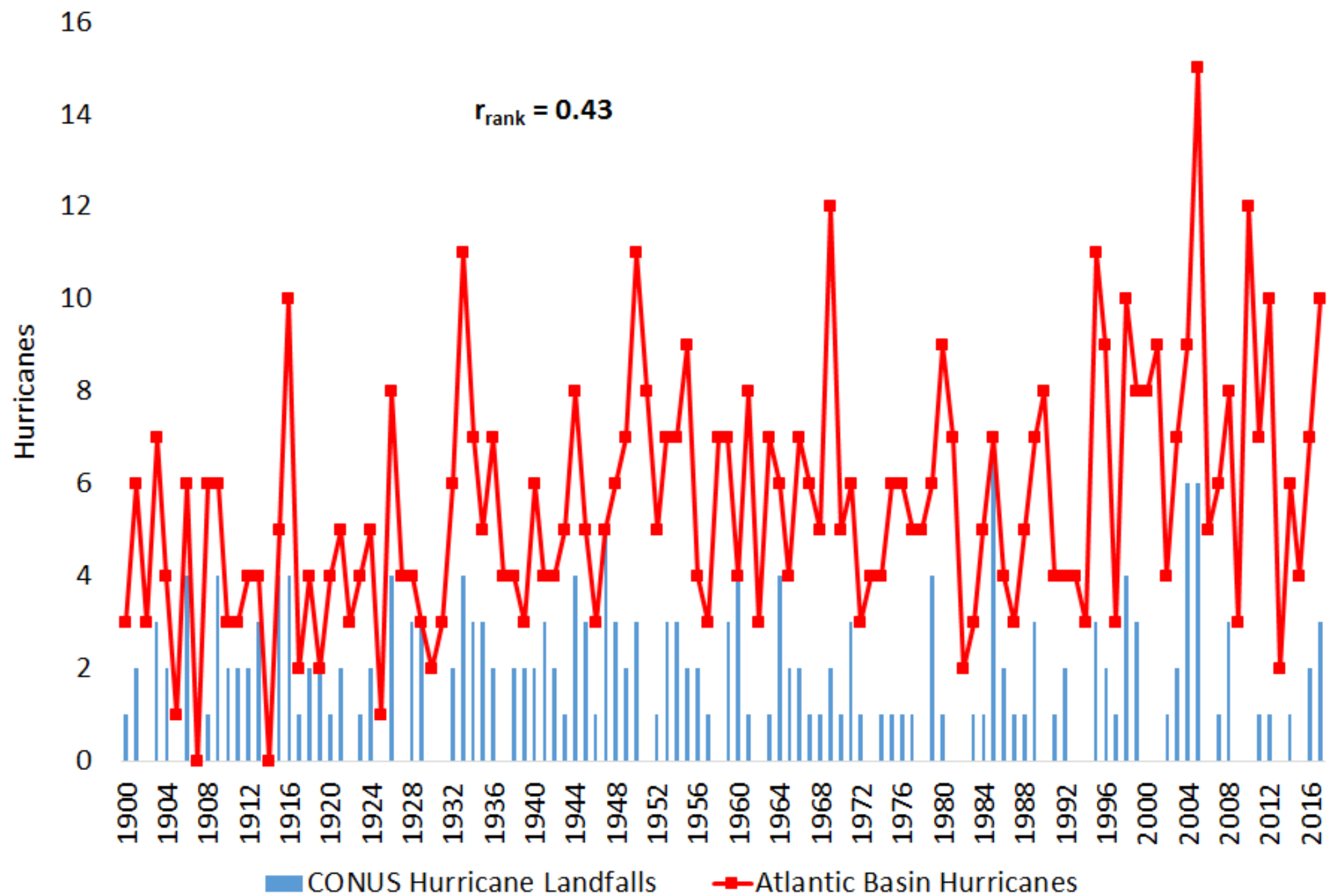
**August to September:  
2014-2018 minus  
1995-2012**



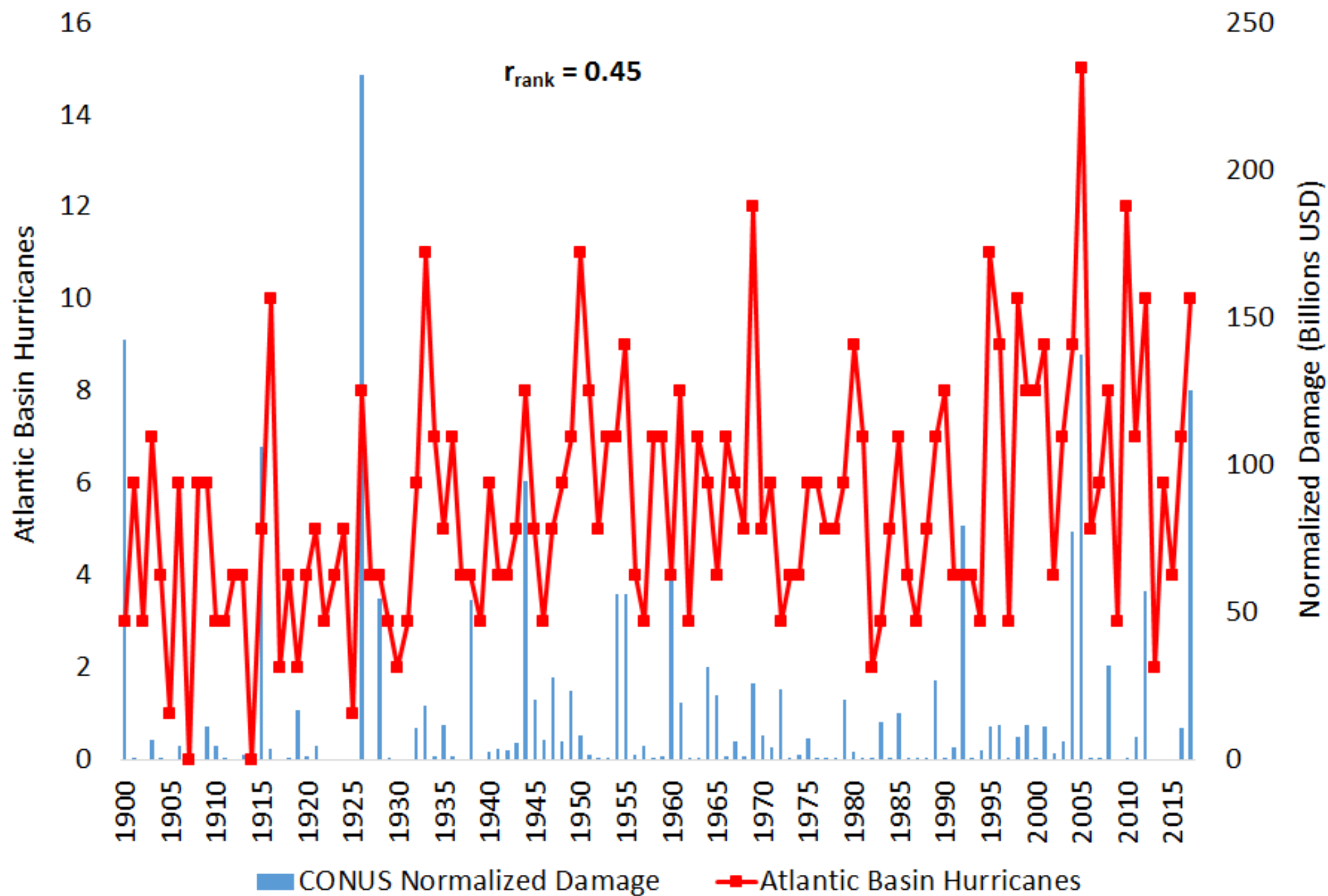
# Continental US Landfalling Hurricane Normalized Total Economic Damage (1900-2017)



Continental US Landfalling Hurricanes vs. Atlantic Basin Hurricanes (1900-2017)



Atlantic Basin Hurricanes vs. Continental US Normalized Damage (1900-2017)



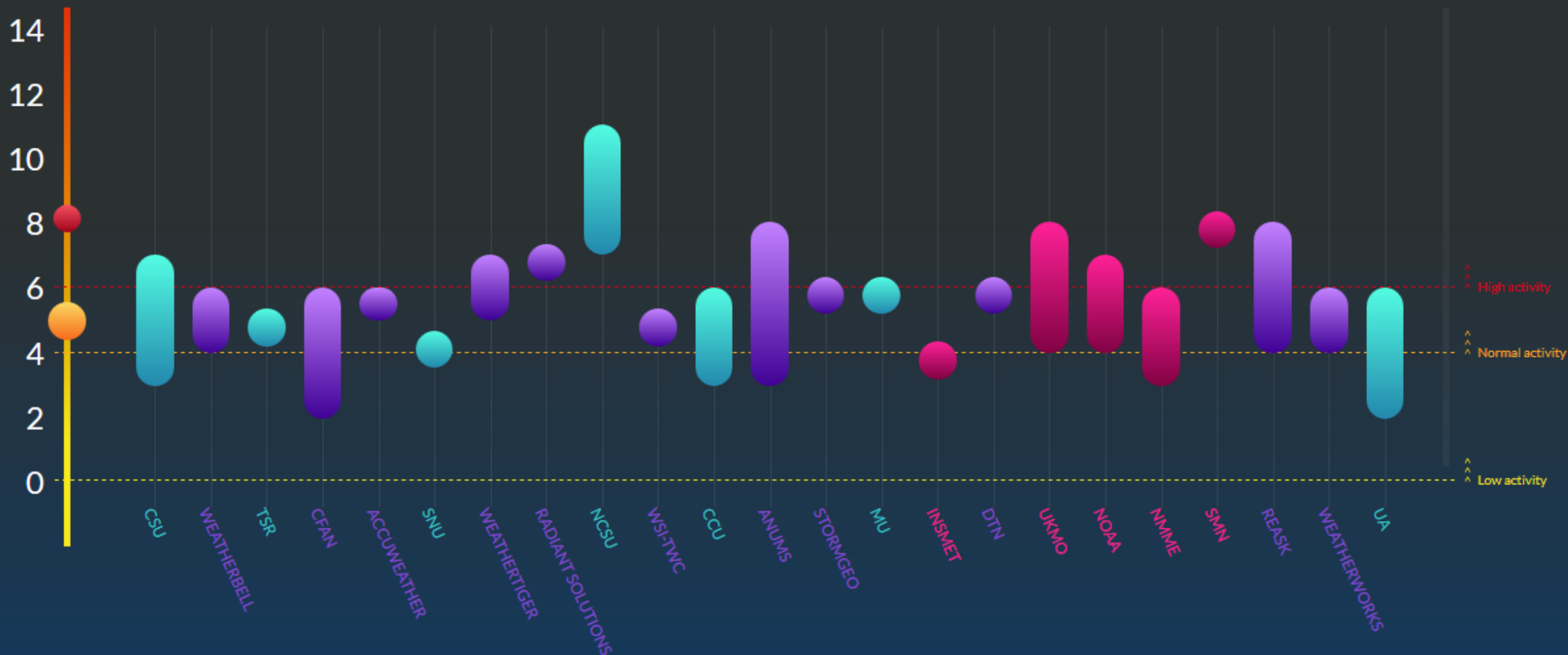
		<b>CSU Forecasts vs. Landfalling Hurricanes (1984-2017)</b>				
		<b>Average</b>	<b>Average</b>	<b>Average</b>	<b>Average</b>	
	Years Occurred	Observed Hurricanes	US Landfalling NS	US Landfalling H	US Landfalling MH	
June Forecast >= 8 Hurricanes	13	8.1	5.3	2.5	0.9	
June Forecast <= 5 Hurricanes	10	4.8	2.4	1.1	0.3	
August Forecast >= 8 Hurricanes	12	7.9	4.8	2.4	0.8	
August Forecast <= 5 Hurricanes	10	4.2	3.0	1.1	0.3	
Observed >= 8 Hurricanes	12	9.8	5.1	2.3	0.8	
Observed <= 5 Hurricanes	14	3.8	2.8	0.7	0.1	

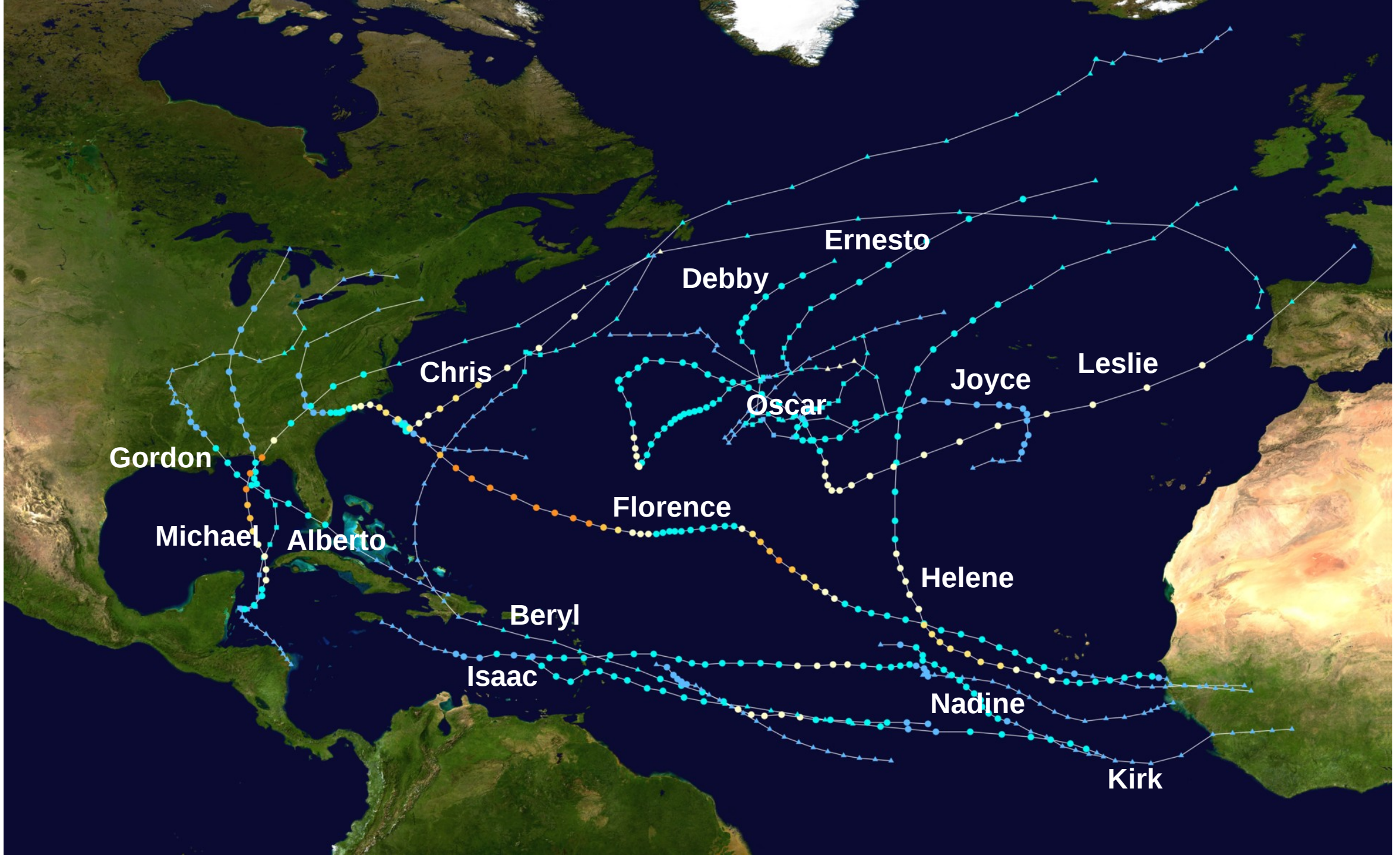


# What Happened in 2018?



Seasonal Hurricane Forecast Compilation Website  
<http://seasonalhurricanepredictions.org>



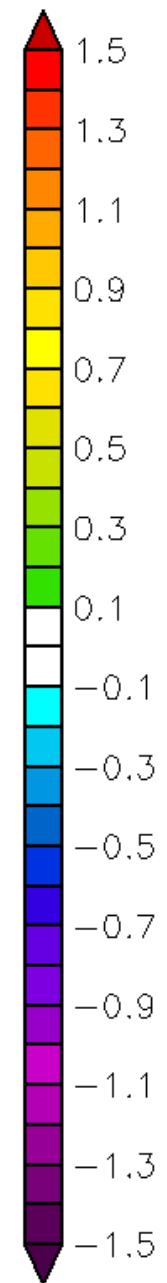
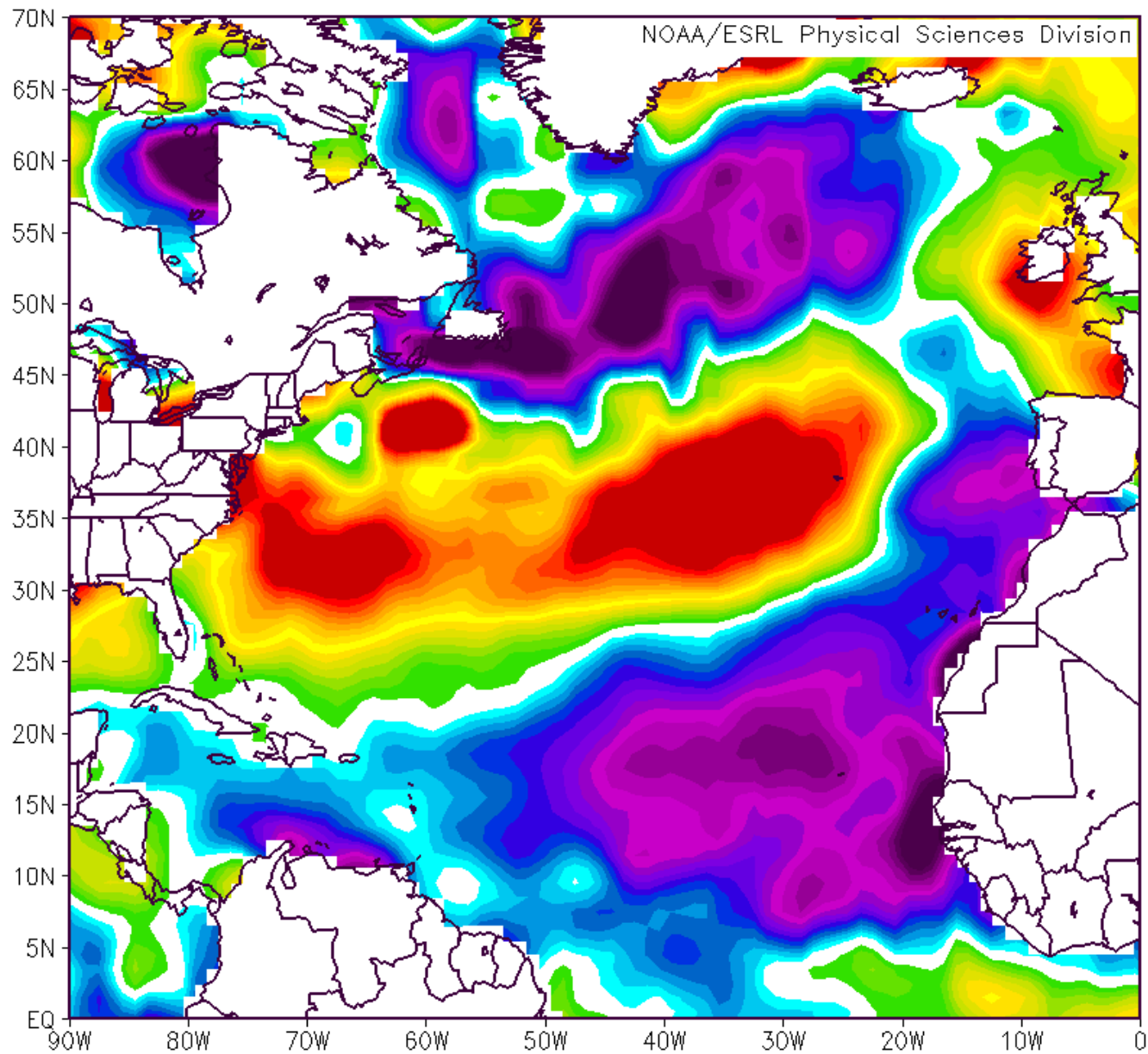




# 2018 Atlantic TC Activity Thru October 30

Forecast Parameter	Observed 2018 Atlantic TC Activity thru October 30	Atlantic thru October 30 1981-2010 Average	2018 as Percentage of October 30 1981-2010 Average	Atlantic Full Season 1981-2010 Average
Named Storms (NS)	15	11.1	135%	12.1
Named Storm Days (NSD)	87	53.9	161%	59.3
Hurricanes (H)	8	5.8	138%	6.4
Hurricane Days (HD)	26	22.4	116%	24.2
Major Hurricanes (MH)	2	2.5	80%	2.7
Major Hurricane Days (MHD)	5	6.0	83%	6.2
Accumulated Cyclone Energy (ACE)	128	98	131%	106

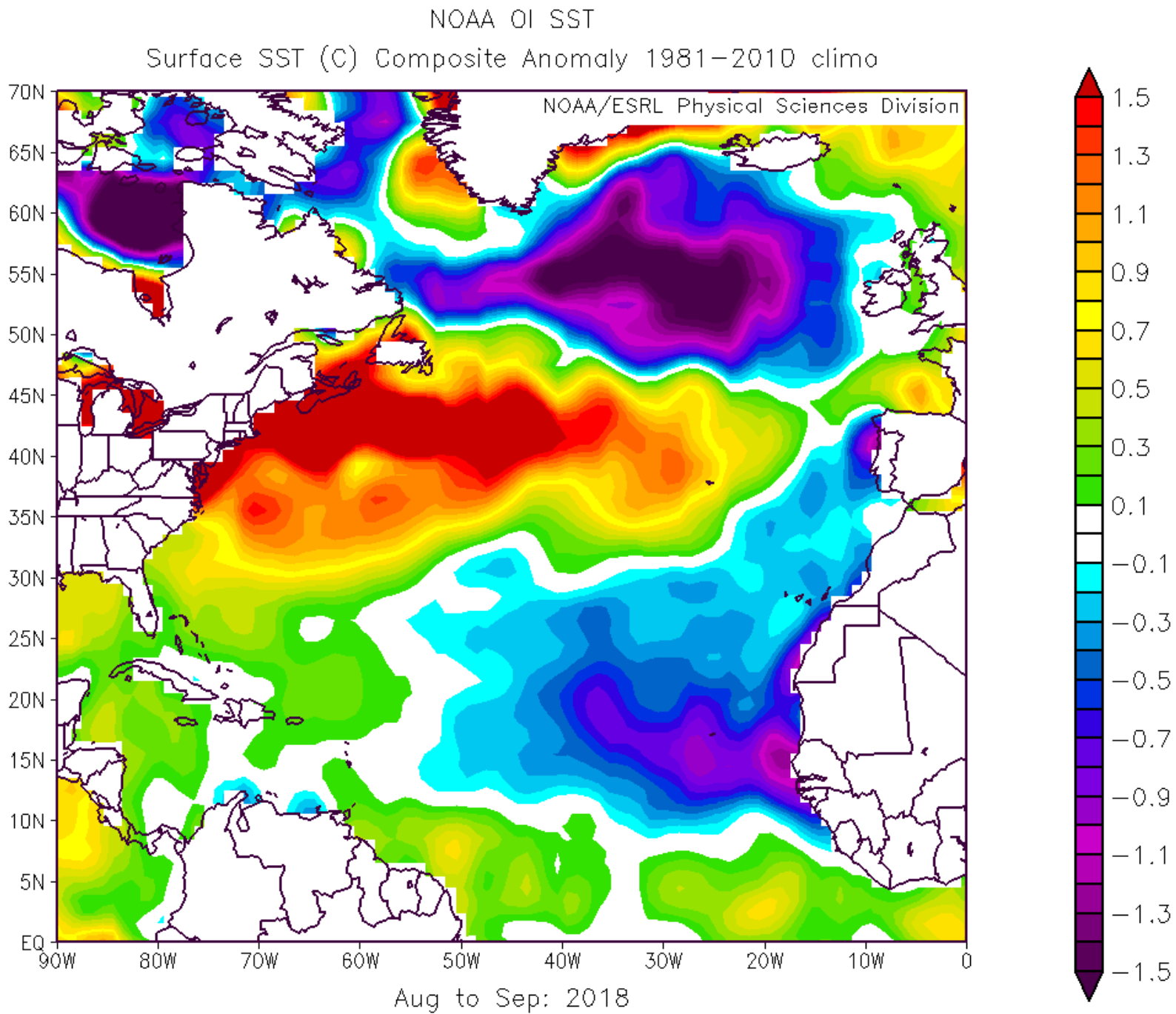
Surface SST (C) Composite Anomaly 1981–2010 climo



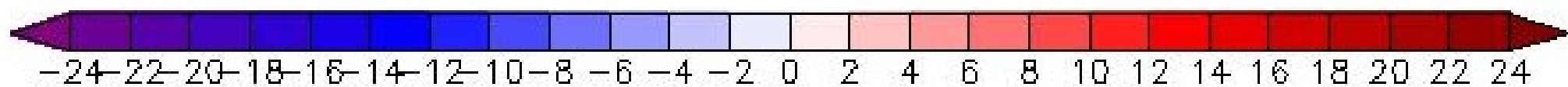
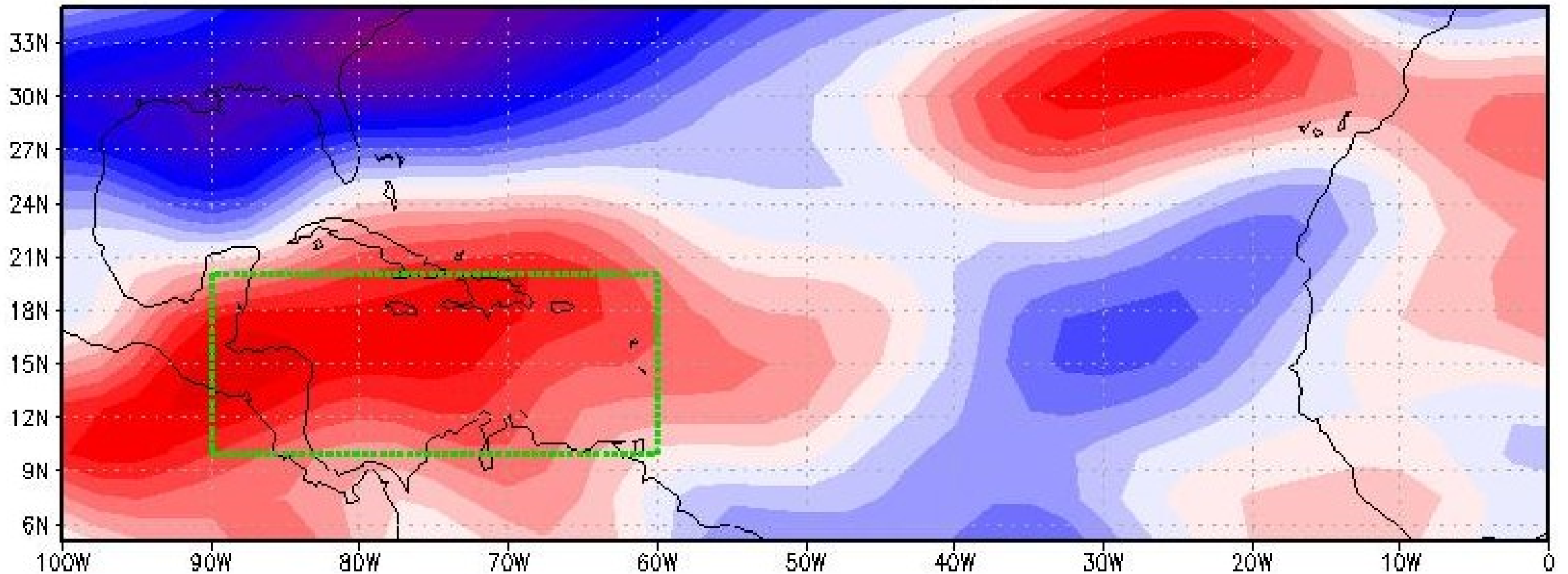
**June 2018  
SST Anomalies**

Jun 2018

# Aug-Sep 2018 SST Anomalies



August 15 Through October 13, 2018 Average  
Zonal (200–850 mb) Vertical Wind Shear Anomaly (kts)  
(1981–2010 Climatology)



## **Arago's Admonition:**

“Never, no matter what may be the progress of science, will honest scientific men who have regard for their reputations venture to predict the weather.”

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