

# **Attribution Methodologies Applied to Tropical Cyclones**

**Hiroiyuki Murakami**

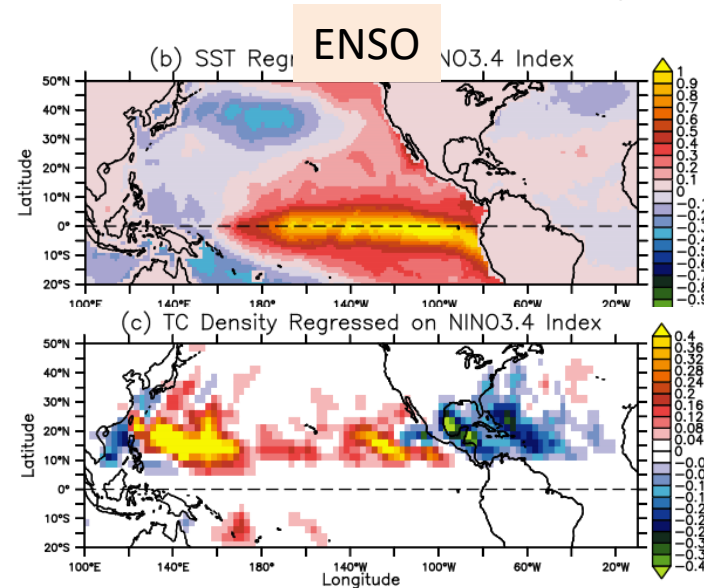
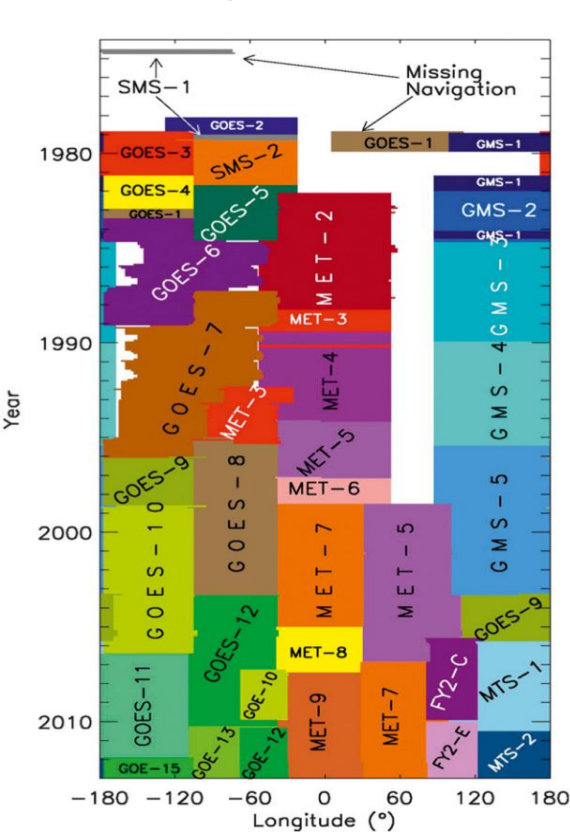
**Geophysical Fluid Dynamics Laboratory**

**[Hiroiyuki.Murakami@noaa.gov](mailto:Hiroiyuki.Murakami@noaa.gov)**

Blackboard Lecture at the 2022 Princeton AOS workshop

It is very difficult to attribute extreme tropical cyclone (TC) events to any climate changes. Why?

- (1) Limited availability of long-term TC observations
- (2) Significant influence of intrinsic internal variability on TC activity

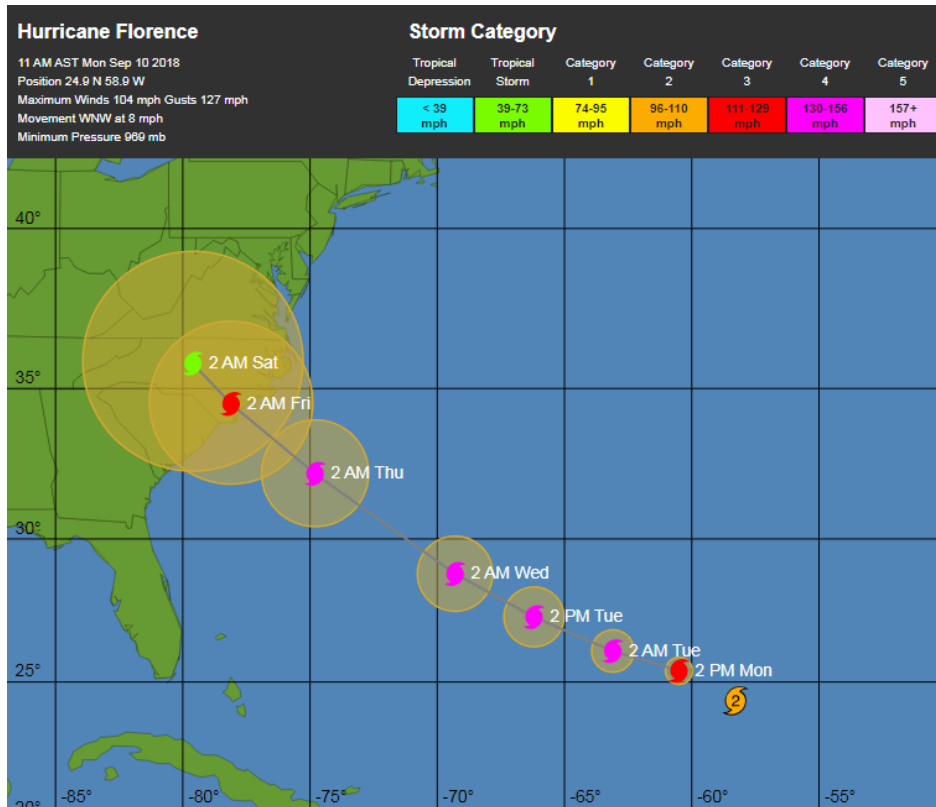


- (3) Expensive computational cost for conducting high-resolution climate model simulations

Despite the challenges, there are some new studies that addressed the attribution of extreme TC events to climate changes.

1. Extreme single TC event (e.g., Cat 5 hurricane; Katrina, Florence)  
Weather Forecast Model, Pseudo-warming experiment
2. Extreme TC seasons (e.g., the 2015 active hurricane season in the Eastern North Pacific)  
Seasonal Forecast Model, SST nudging experiment
3. An unusual decade or trend (e.g., Increased North Atlantic hurricanes during the 2010s)  
Large ensemble experiment
4. Statistical-dynamical downscaling methodology  
Synthetic tropical cyclone climate model

# 1. Extreme single TC event (e.g., Cat 5 hurricane; Katrina, Florence)



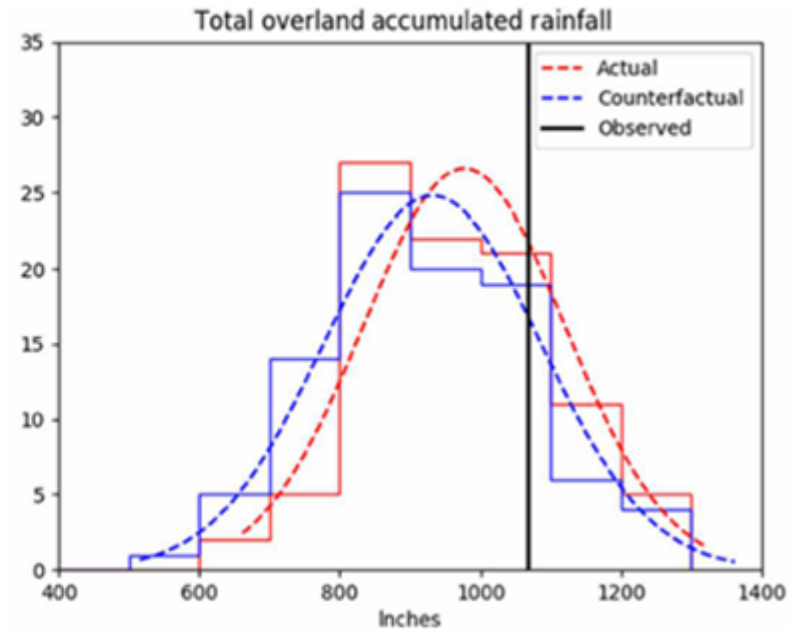
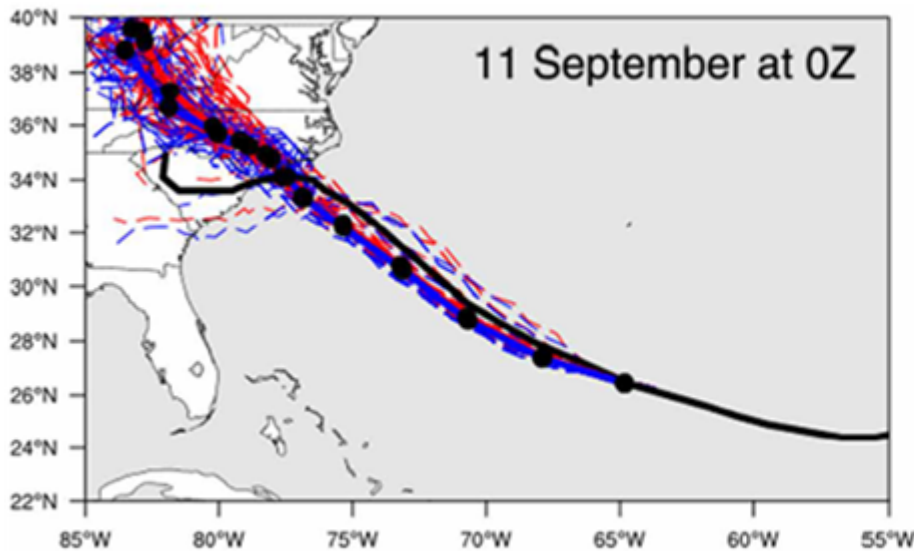
Hurricane Florence (2018)

How much did anthropogenic warming affect the heavy precipitation of Hurricane Florence?

# 1. Extreme single TC event (e.g., Cat 5 hurricane; Katrina, Florence)



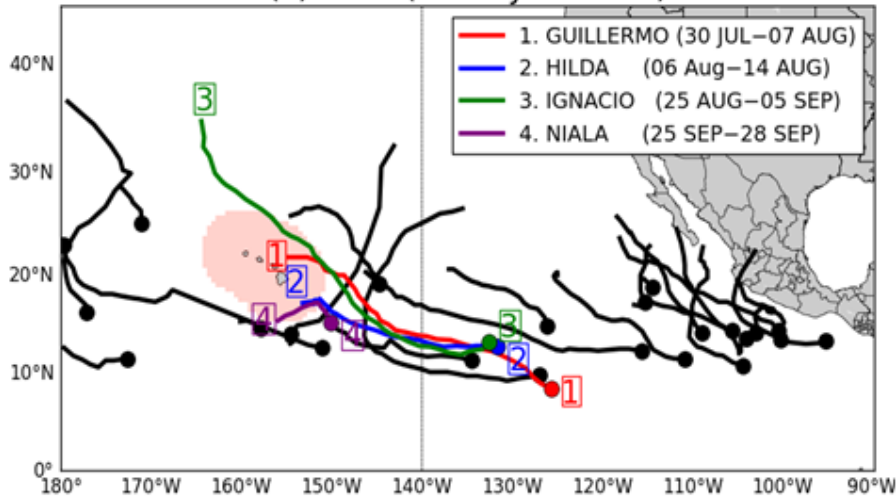
Wehner et al. (2019), Patricola and Wehner (2020), and Reed et al. (2020, 2022) applied so-called **"pseudo global warming sensitivity experiments"**.



# 2. Extreme TC season

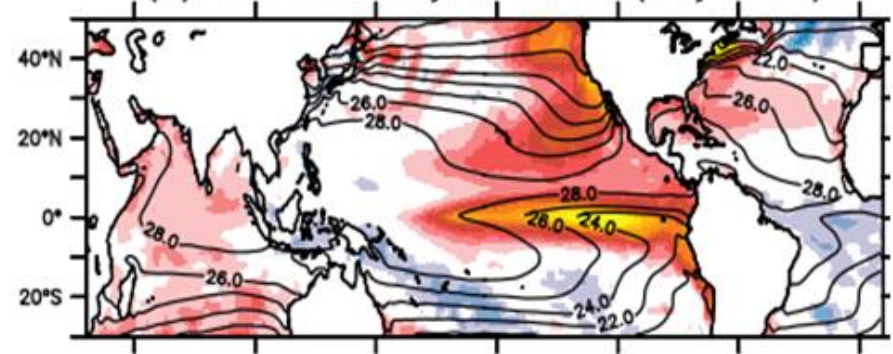


(a) 2015 (01 May–30 Nov)



27 TCs in 2015 in the Eastern North Pacific

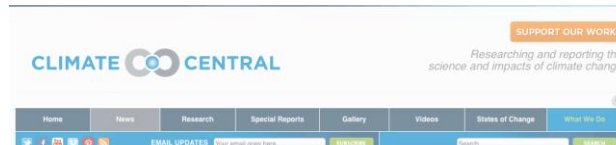
(a) SST anomaly in 2015 (May–Nov)



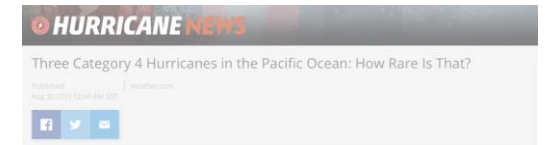
Observed SST anomaly in 2015 showing strong El Niño.



*“The spike in cyclone activity is tied to well a still developing, significant El Niño”.*

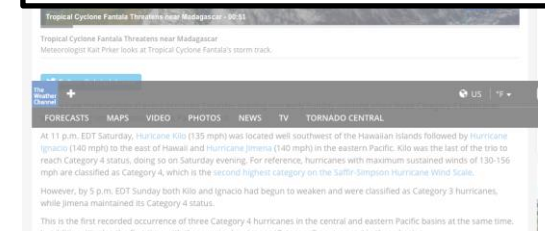
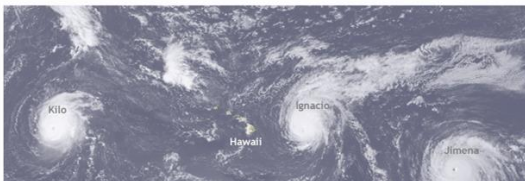


*“El Niño helps boost Pacific storm season”.*



*“The eastern Pacific basin sees an increase in named storms during strong El Niño...”.*

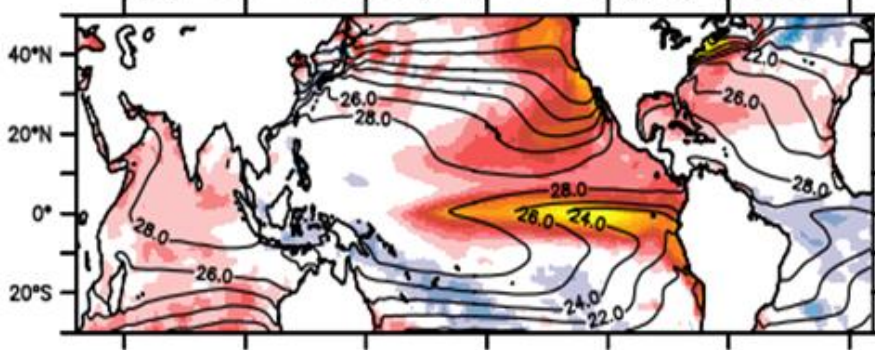
which were classified as major hurricanes (winds in excess of 110mph). In fact, major hurricanes Kilo, Ignacio and Jimena were category four storms with wind speeds greater than 130mph.



# 2. Extreme TC season

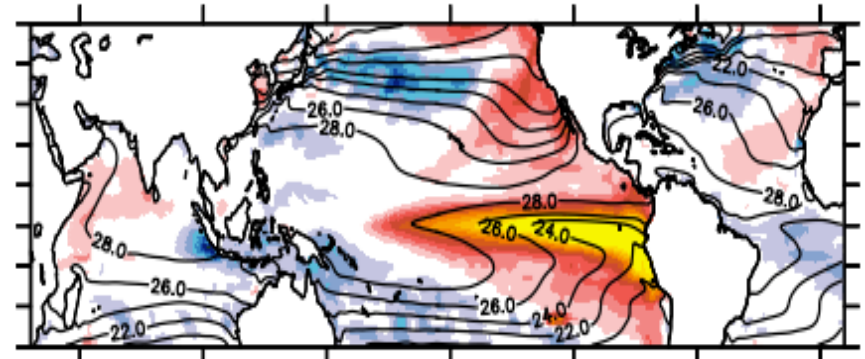


(a) SST anomaly in 2015 (May–Nov)



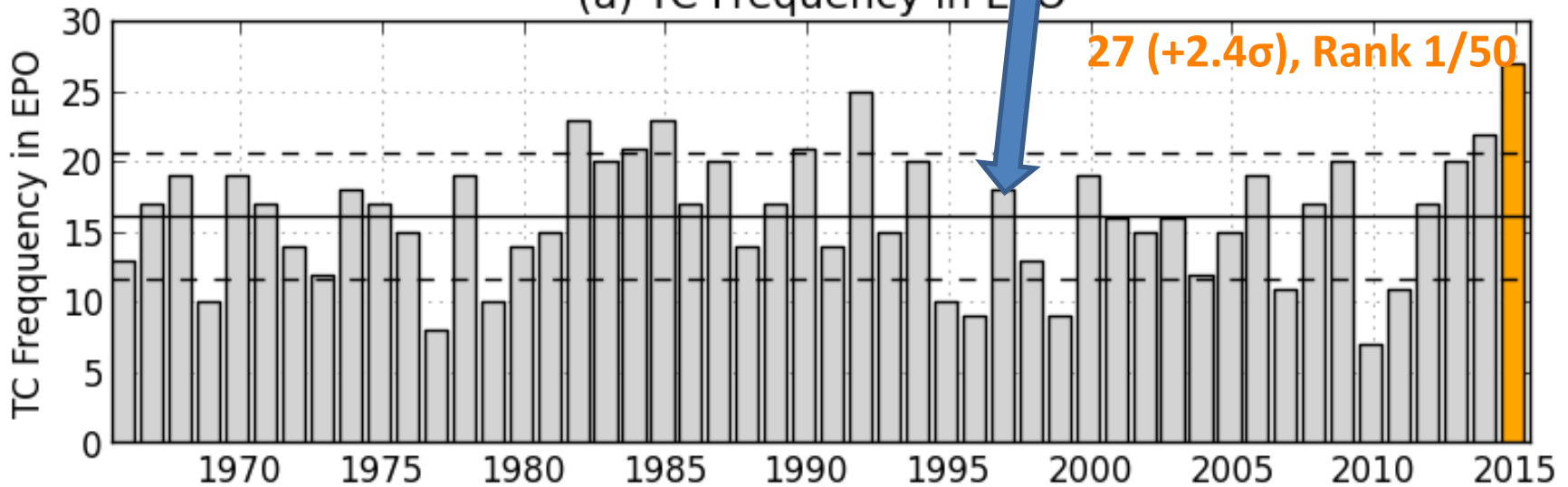
Observed SST anomaly in 2015 showing strong El Niño.

ANOM1997



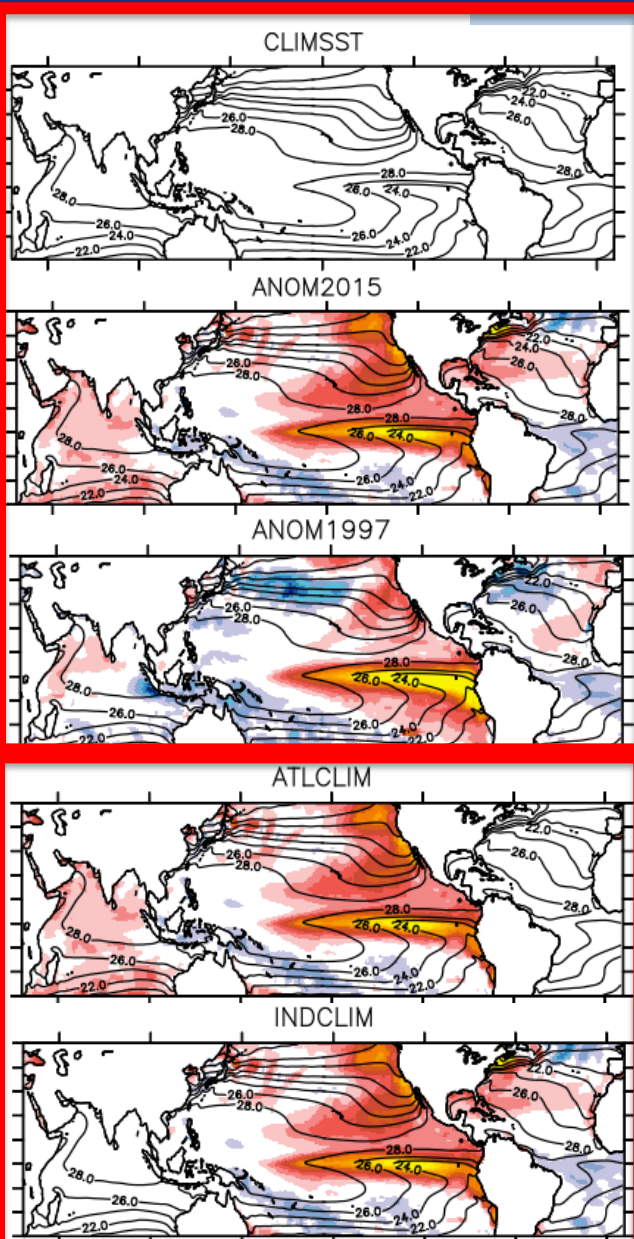
1997 was also a strong El Niño. But TC was not active.

(a) TC Frequency in EPO

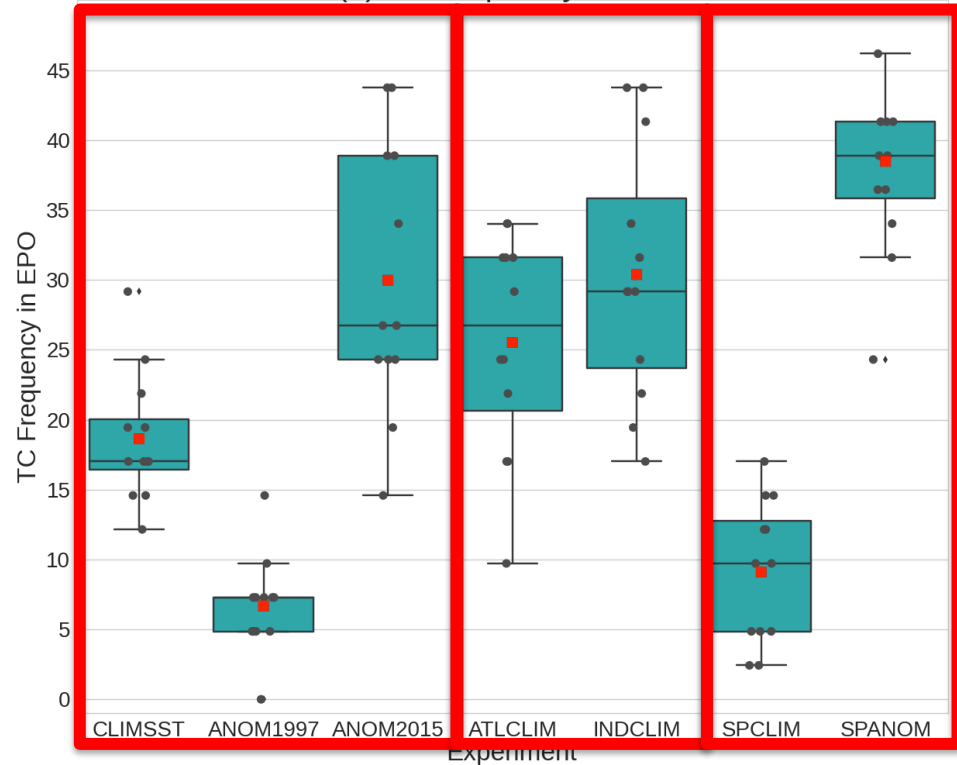


Murakami et al. (2016, J. Climate)

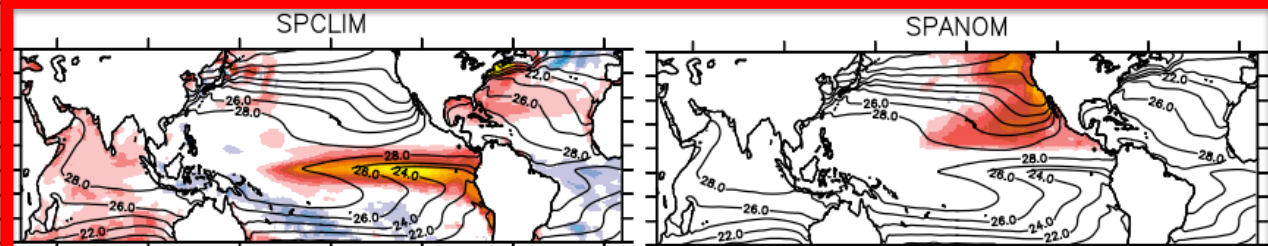
# 2. Extreme TC season



(a) TC frequency in EPO



Subtropical SST anomaly is critical for the extreme TC year of 2015.

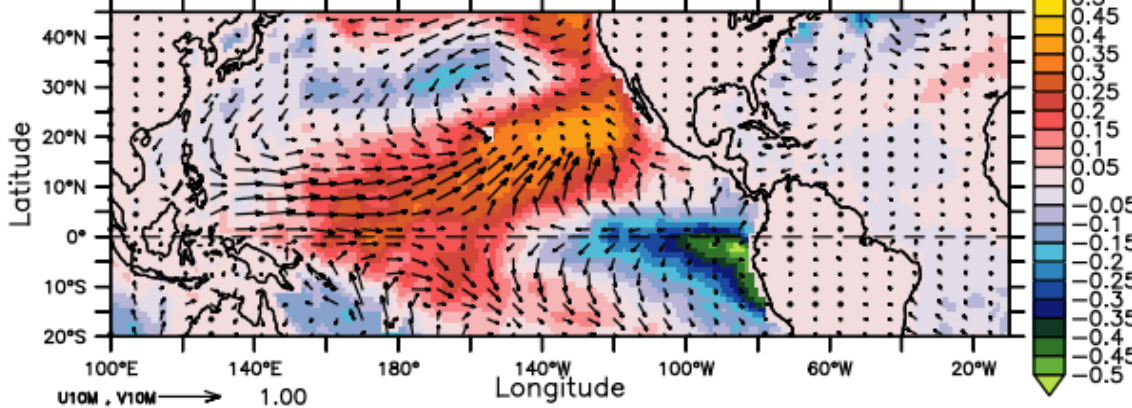




# 2. Extreme TC season

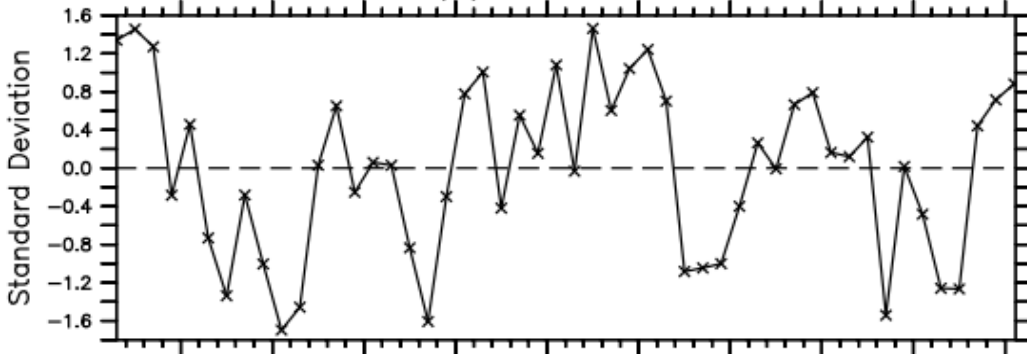


(a) SST and 10-m Winds Regressed on PMM Index



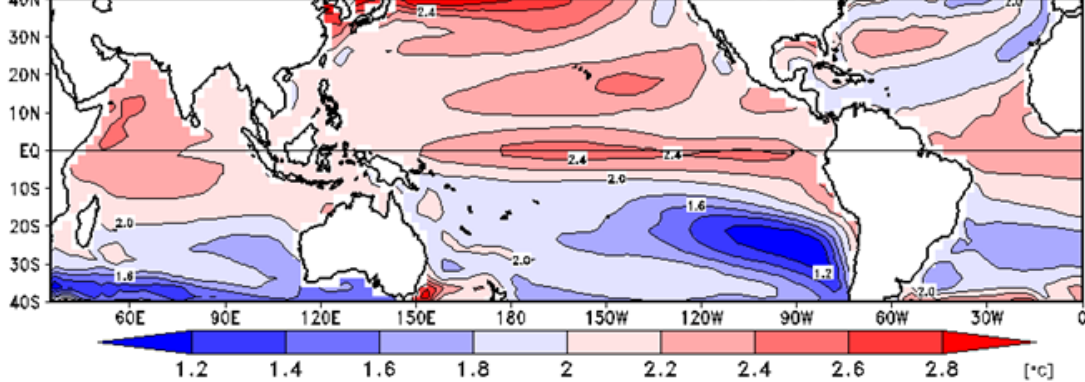
The PMM is the 1<sup>st</sup> singular decomposition (SVD) mode for the SST and zonal and meridional components of the 10-m wind field (*Chiang and Vimont 2004*).

(b) PMM Index



	Niño-3.4	PMM
1997 (May–Nov)	+2.4 $\sigma$	-1.0 $\sigma$
2015 (May–Nov)	+2.4 $\sigma$	+0.9 $\sigma$

Future change in annual mean SST [ $^{\circ}$ C]



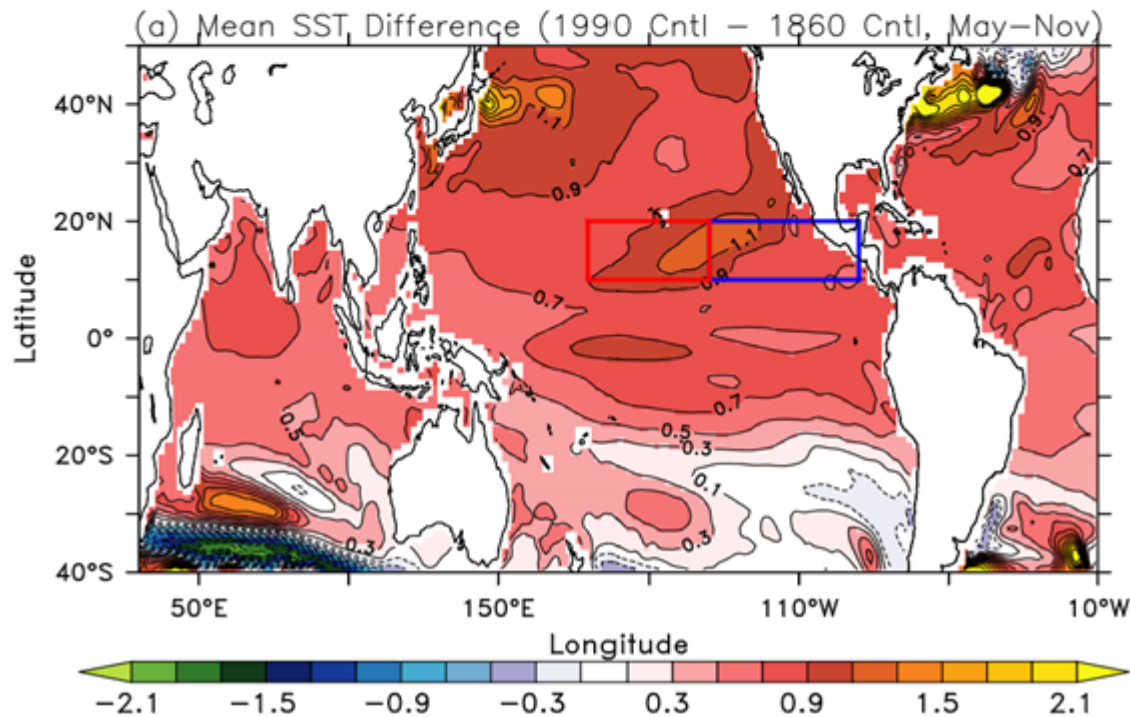
Projected future changes in SST by CMIP5 models.

Murakami et al. (2016, J. Climate)

# 2. Extreme TC season



Experiment	Radiative Forcing	Simulation Years
1860 Control	1860 Level	3500
1990 Control	1990 Level	500



## 2. Extreme TC season



### Probability of Exceedance

$$P(x) \equiv \frac{\text{Number of years with TC number} \geq x}{\text{Total number of years}}$$

$x$  : TC frequency in a year

### Fraction of Attributable Risk (FAR)

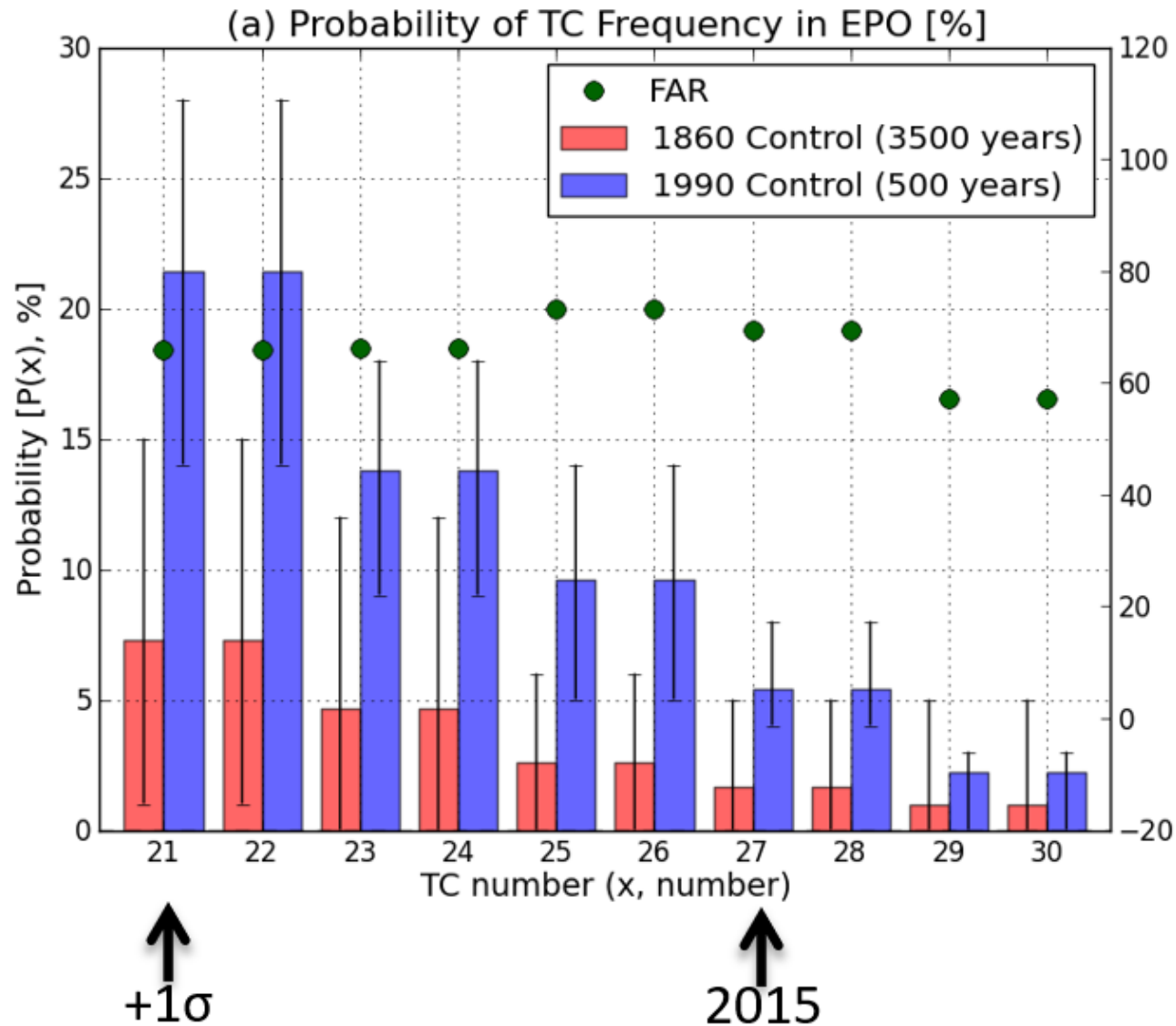
$$FAR(x) \equiv \frac{P(x|E_1) - P(x|E_0)}{P(x|E_1)}$$

$E_1$ : Anthropogenic Forcing (1990 Contl)

$E_0$ : Non-anthropogenic Forcing (1860 Contl)

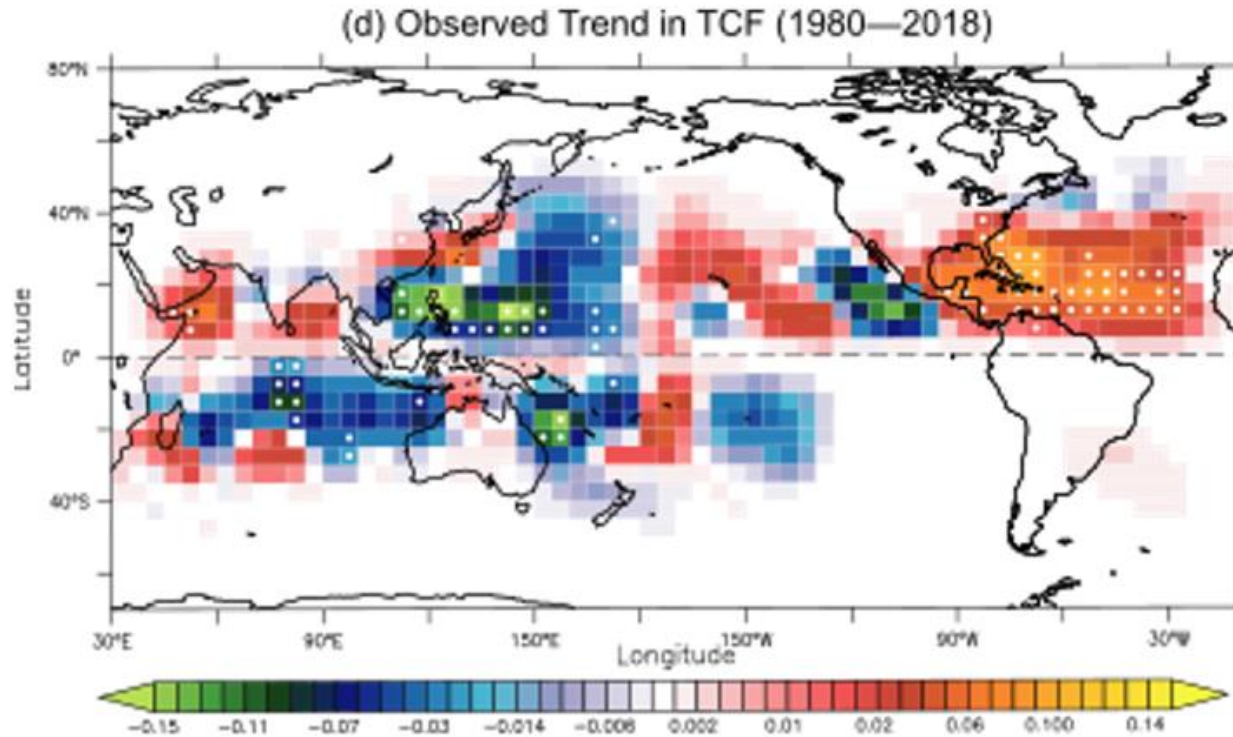
$-\infty$  (not attributable) < FAR  $\leq$  +1.0 (attributable)

## 2. Extreme TC season



$P(x)$  for 1860 Control (red) and 1990 Control (blue). FAR is shown in green dots.

# 3. An unusual decade or trend



Observed TC density trend over the period 1980-2018.

An open question:

Is the spatial pattern of the trends caused by anthropogenic forcing or internal variability?

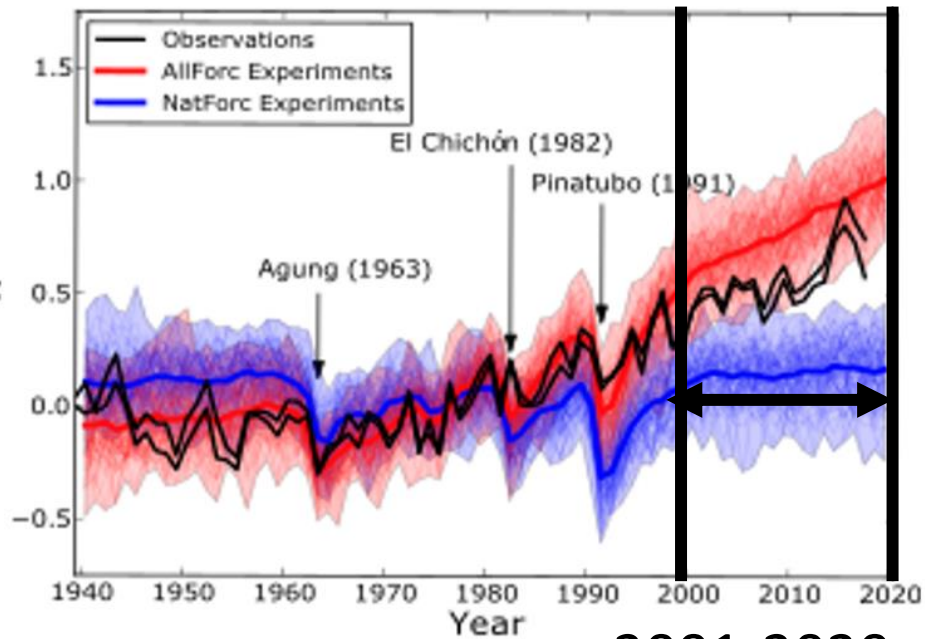
The results will be shown in the plenary talk this afternoon.

Keywords: SVD, Fingerprint Analysis, **Large Ensemble Simulations**

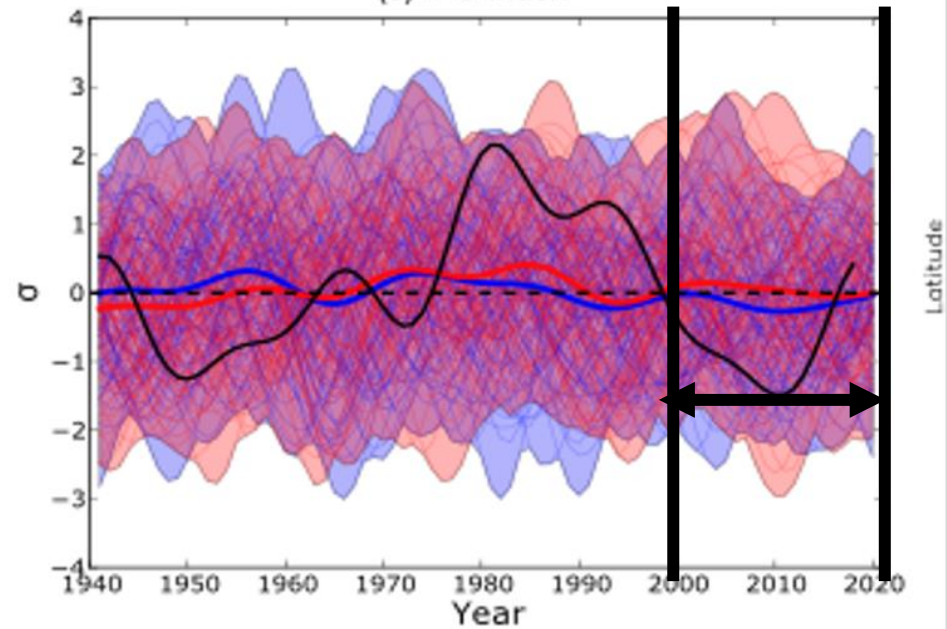
# 3. Large ensemble simulations



(a) Anomalies of Global Mean Surface Temperature



(c) IPO Index



2001-2020

20 years x 35 members = 700 samples

## 2. Extreme TC season



### Effect of natural variability on the occurrence of extreme TC season

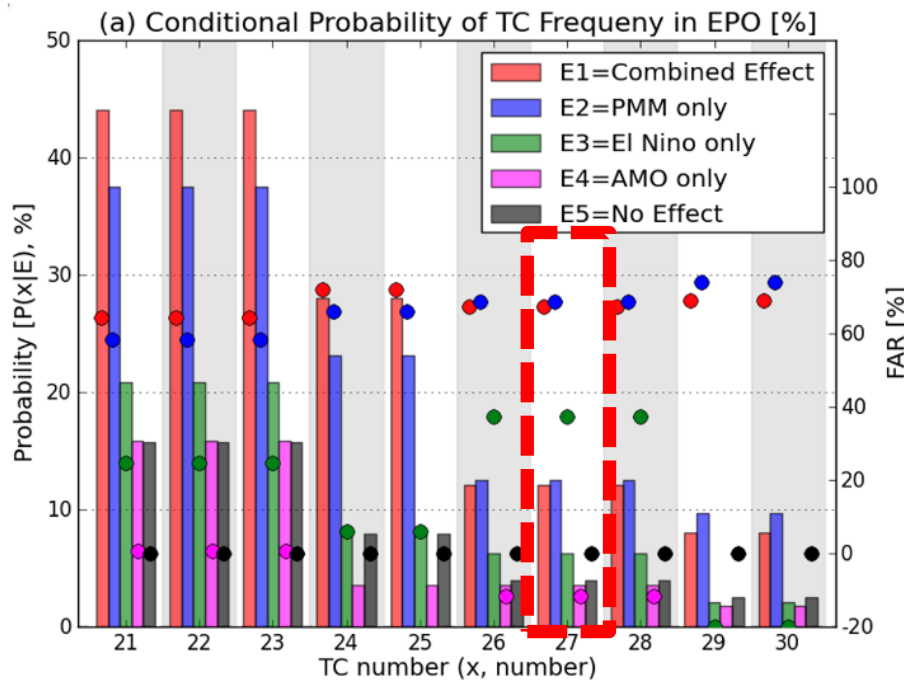
$$FAR(x|E_i) \equiv \frac{P(x|E_i) - P(x|E_5)}{P(x|E_i)}$$
$$i = 1, \dots, 4$$

$E_i$ : A group of members showing a specific phase of natural variability

$E_5$ : A group of members under neutral conditions

$-\infty$  (not attributable)  $< FAR \leq 1.0$  (attributable)

# 2. Extreme TC season



Using the 700 samples during 2001–2020 period in the AllForc, additional five conditional provability  $P(x|E_n)$  are computed.

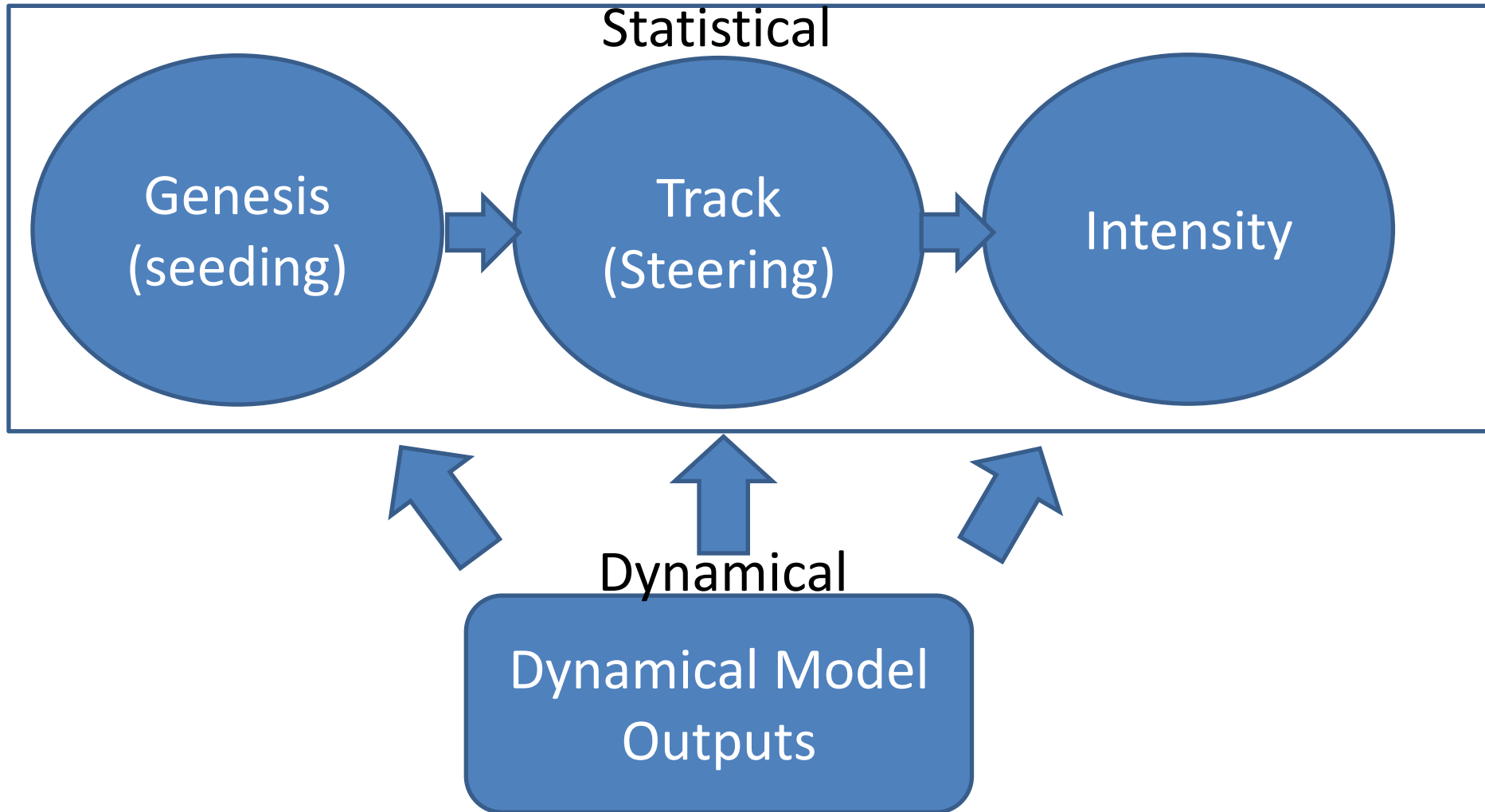
x: Number of TCs in the Eastern North Pacific

**PMM(+)** >> **Nino-3.4 (+)** > **AMO (-)**

$E_n$	PMM $\geq +1\sigma$	Niño-3.4 $\geq +1\sigma$	AMO $\leq -1\sigma$	Sample size	Effect
<b>E1</b>	✓	✓	✓	44/700	Combined Effect
<b>E2</b>	✓			94/700	Positive PMM only
<b>E3</b>		✓		83/700	Positive Niño-3.4 only
<b>E4</b>			✓	55/700	Negative AMO only
<b>E5</b>				282/700	No Effect

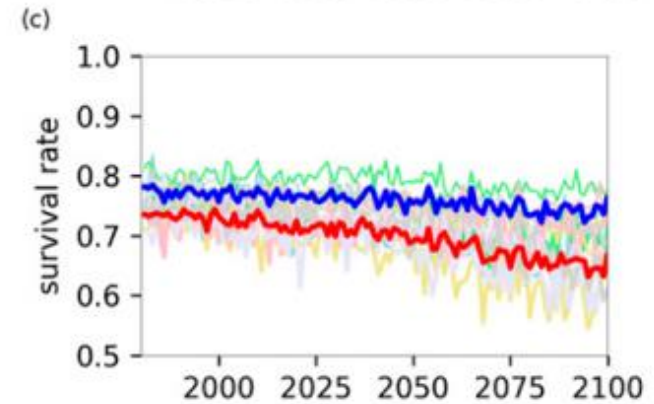
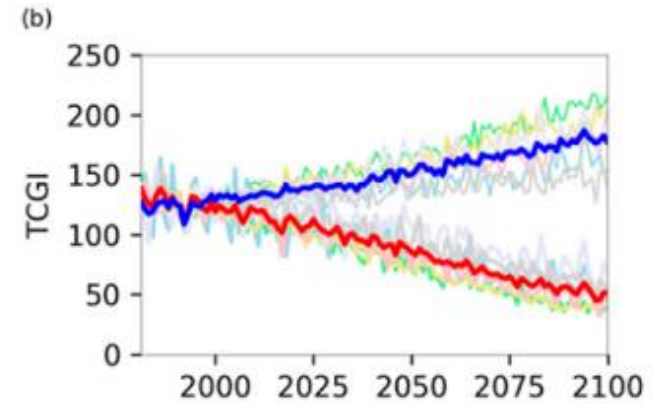
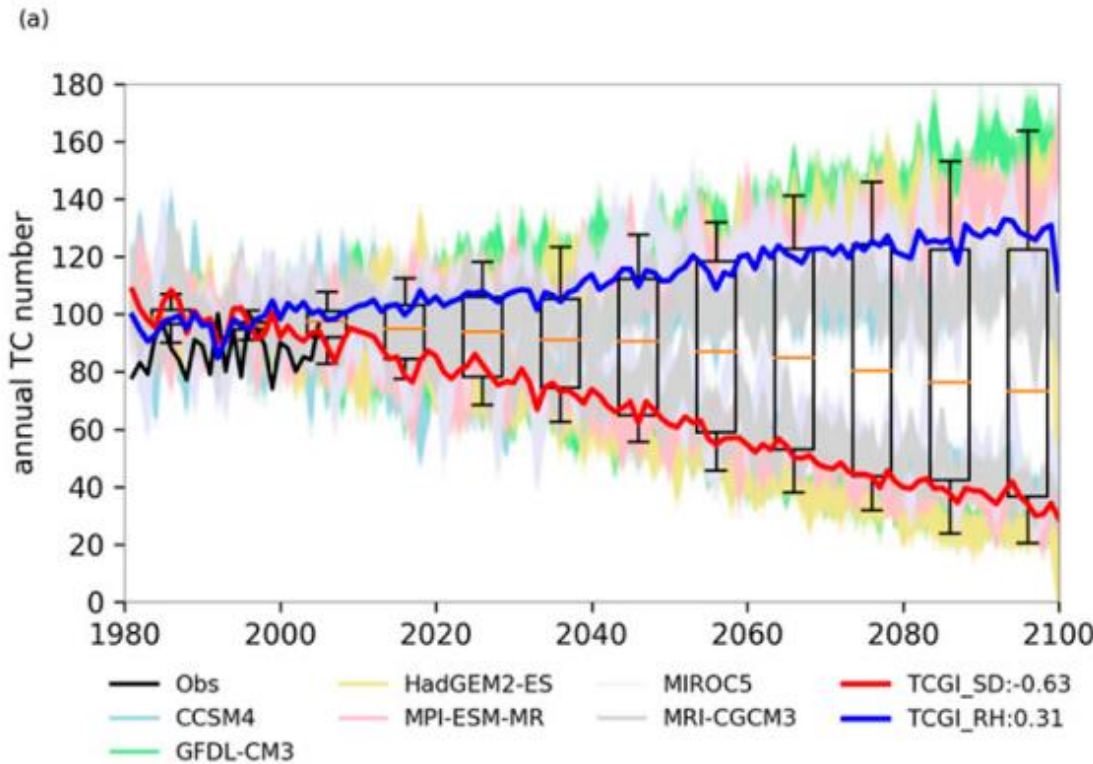


# 4. Statistical-dynamical downscaling



Emanuel (2006, 2008, 2013, 2021), Lee et al. (2018, 2020)

# 4. Statistical-dynamical downscaling



CRH case:  $\mu = \exp(b + b_{\eta} \eta_{850,c} + b_{CRH} CRH + b_{PI} PI + b_{SHR} SHR),$

SD case:  $\mu = \exp(b + b_{\eta} \eta_{850,c} + b_{SD} SD + b_{PI} PI + b_{SHR} SHR).$

## Let's discuss the pros and cons of each methodology.

1. Extreme single TC event (e.g., Cat 5 hurricane; Katrina, Florence)

Weather Forecast Model, Pseudo-warming experiment

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3. An unusual decade or trend (e.g., Increased North Atlantic hurricanes during the 2010s)

Large ensemble experiment

4. Statistical-dynamical downscaling methodology

Synthetic tropical cyclone climate model