

Detected Climate Change in Global Distribution of Tropical Cyclones

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In this presentation, I would like to clarify the following open questions.

1. Are there any significant changes in global tropical cyclone activity over the past 40 years?
2. If so, were they affected by external forcing and distinguishable from internally generated noise?
3. If they can be distinguished from noise, by what year did they occur?
4. How did anthropogenic aerosols change global tropical cyclones over the past 40 years?

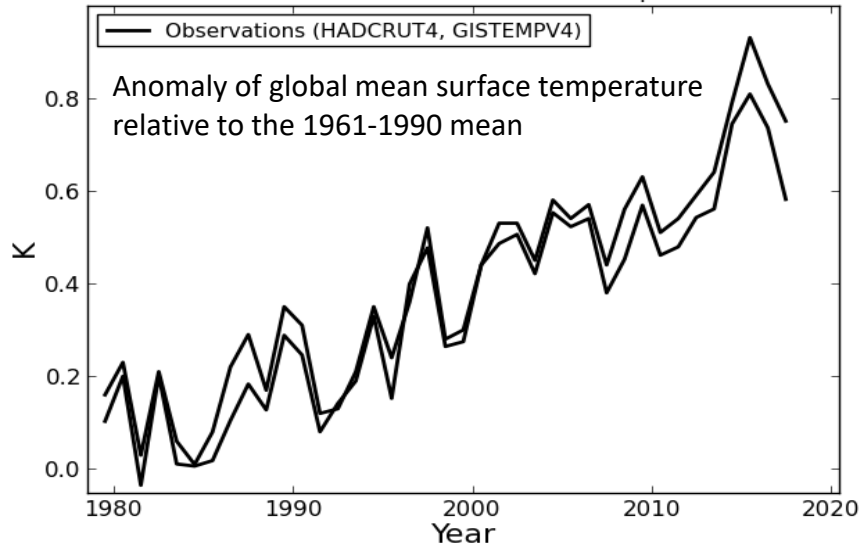
Keywords: Large-Ensemble Simulations, Fingerprint Analysis, SVD analysis

Reference: Murakami et al. (2020, PNAS), Murakami (2022, Science Advances)

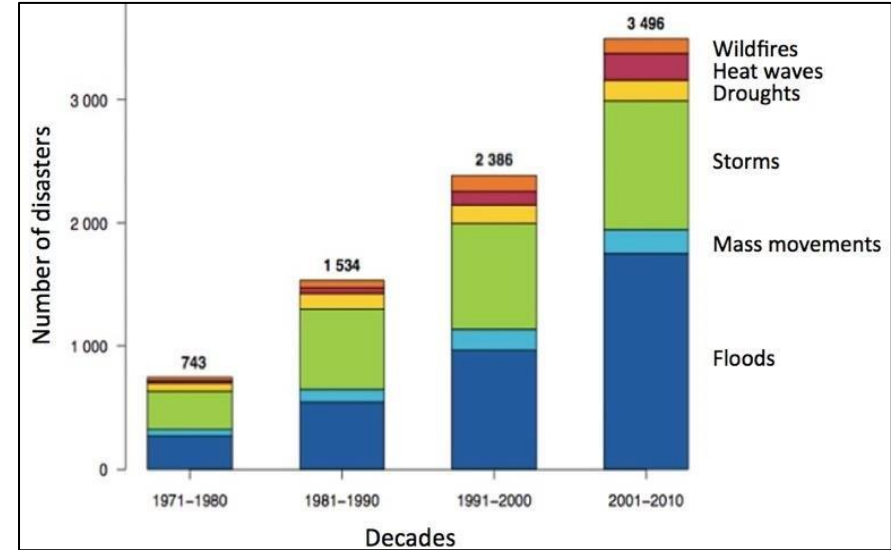
Observed Trends in Global Mean Surface Temperature and Number of Global Tropical Cyclones (1980-2018)



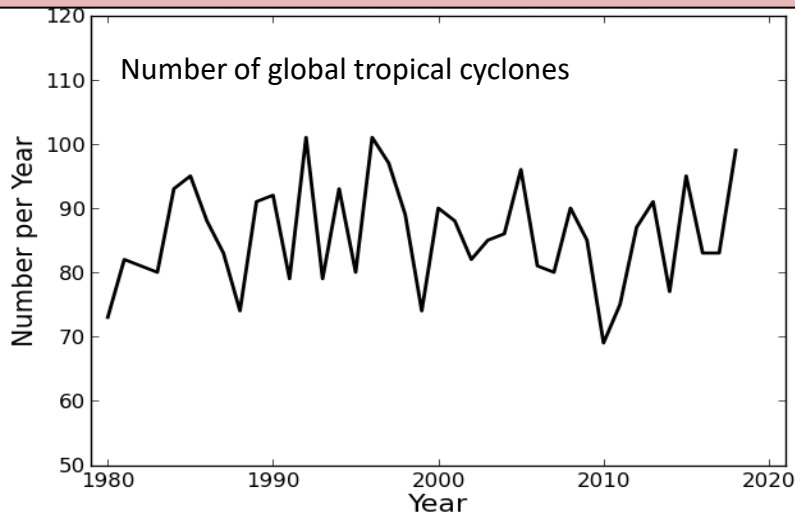
The observed global mean surface temperature shows an increase between 1980 and 2018.



Global Frequency of Natural Disasters (1971–2010)



There is no significant trend in global TC number, indicating no impact of global warming on global TC.



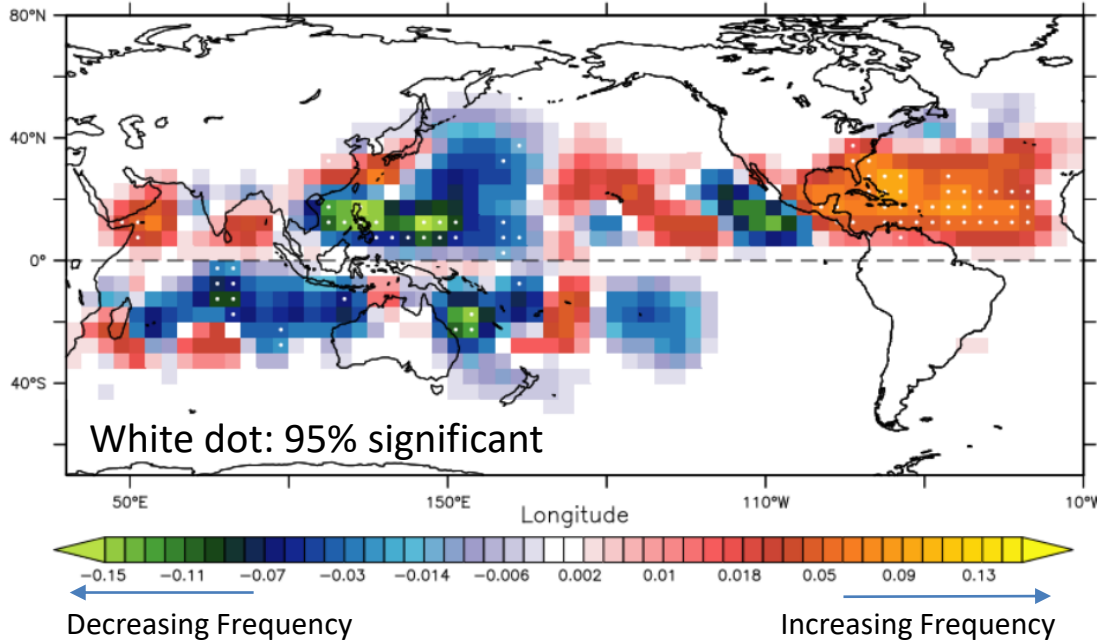
An open question:

Are there indeed no climatic changes emerged in the global tropical cyclone activity?

Observed Trend in Global TC Activity (1980-2018)



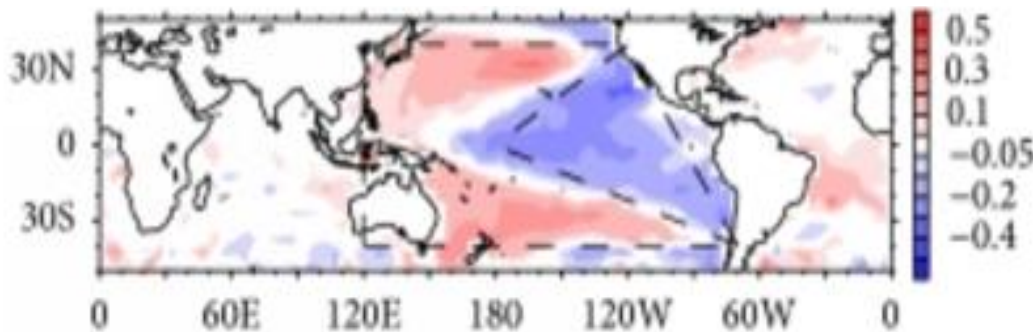
Observed Trend in TCF (1980-2018)



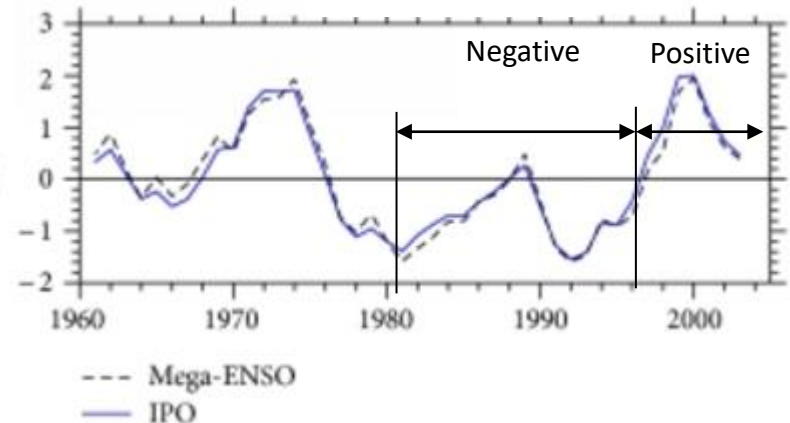
- TCF (or TC density) is defined as total TC frequency of occurrence for every 5x5 degree grid cell.
- TCF shows significant negative and positive trends depending on region over 1980-2018.
- **Is this spatial pattern of the trends due to the external forcing or internal variability?**

Inter-decadal Pacific Oscillation (IPO)

Observed SST regressed on $-1 \times$ IPO index



$-1 \times$ IPO index



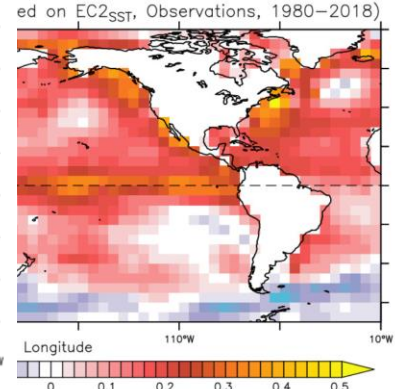
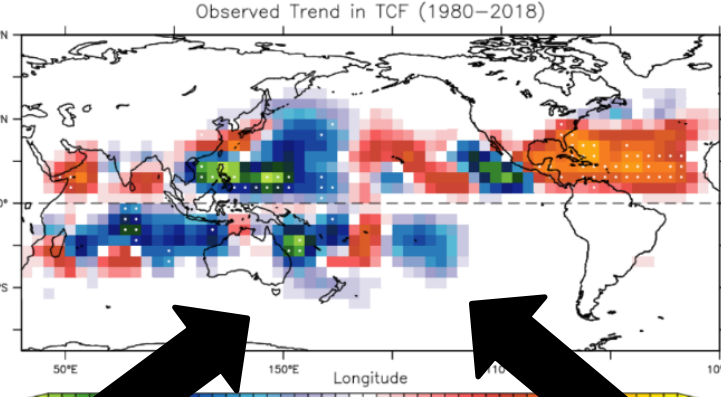
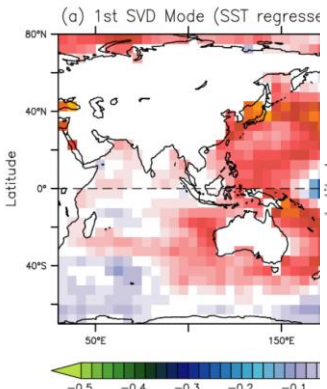
SVD Analysis



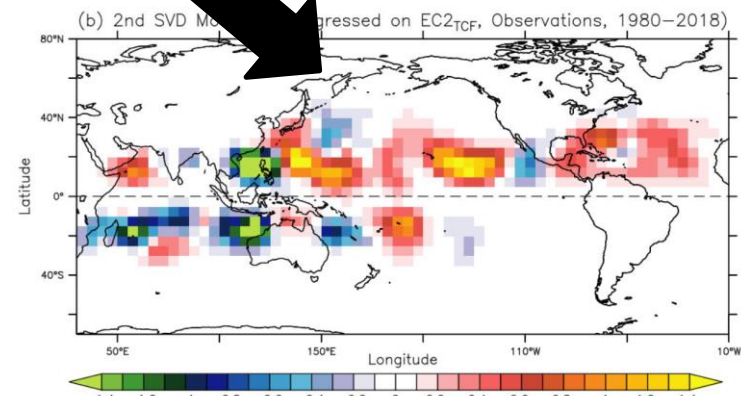
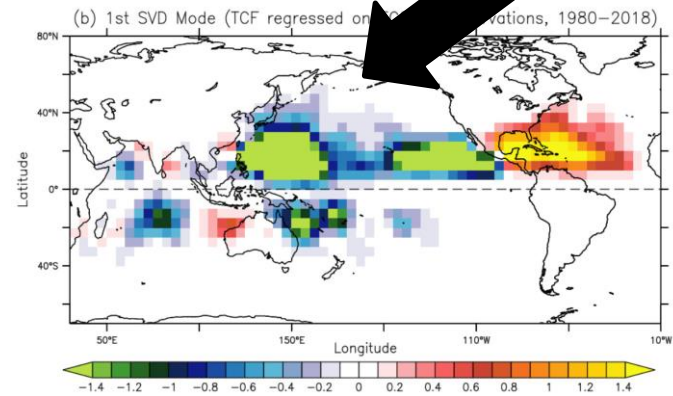
1st SVD Mode (61%, IPO mode)

2nd SVD Mode (12%, Global Warming Mode)

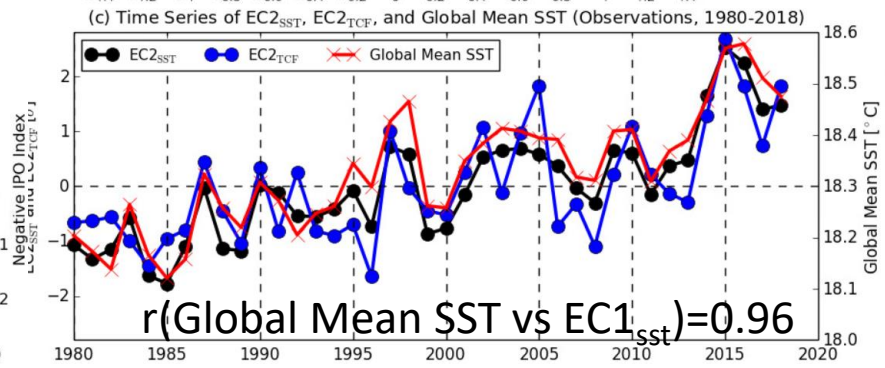
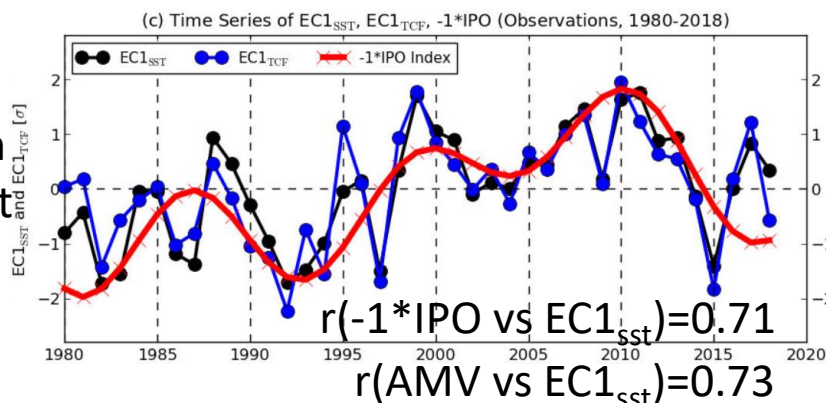
SST



TCF

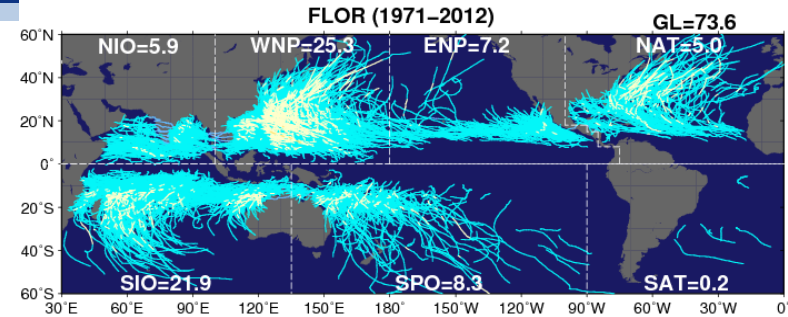


Expansion coefficient





GFDL-FLOR Vecchi et al. (2014)

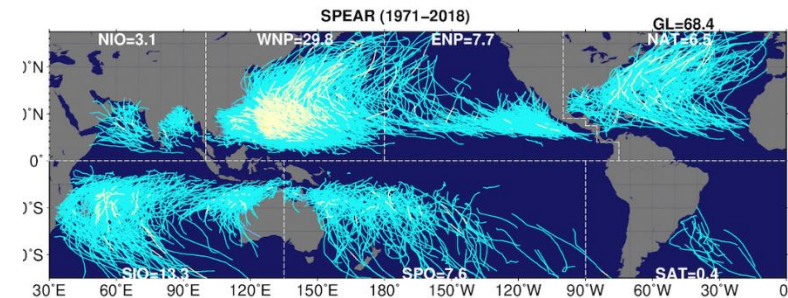


A modified version of CM2.5 (Delworth et al. 2012):

- 50km cubed-sphere atmosphere (Same as CM2.5)
- 1° ocean/sea ice (low res enables prediction work; 0.25° for CM2.5)
- Former operational seasonal forecast model for NMME (Vecchi et al. 2014)



GFDL-SPEAR Delworth et al. (2020)



A modified version of AM4 (atmosphere) & MOM6 (ocean) & SIS2 (ice) & LM4 (land)

- 50km cubed-sphere atmosphere for SPEAR-MED (Same as FLOR)
- 1° ocean/sea ice (Same as FLOR)
- Current operational seasonal forecast model for NMME (Lu et al. 2020)

TC tracks are detected using 6-hourly outputs considering maximum wind speed (15.75m/s), warm core (1K), and duration (36 hours) (Harris et al. 2016).

Impact of IPO on TCF (Long-term Control Experiments)

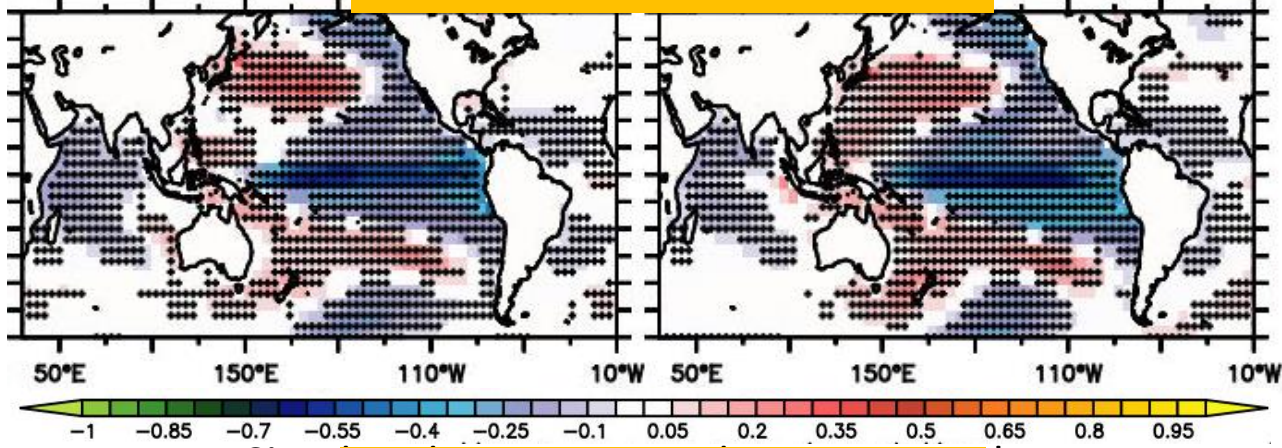


1850Cntl: Free running coupled-model simulations forced with the fixed anthropogenic forcing at the 1850 level (or say PiControl).

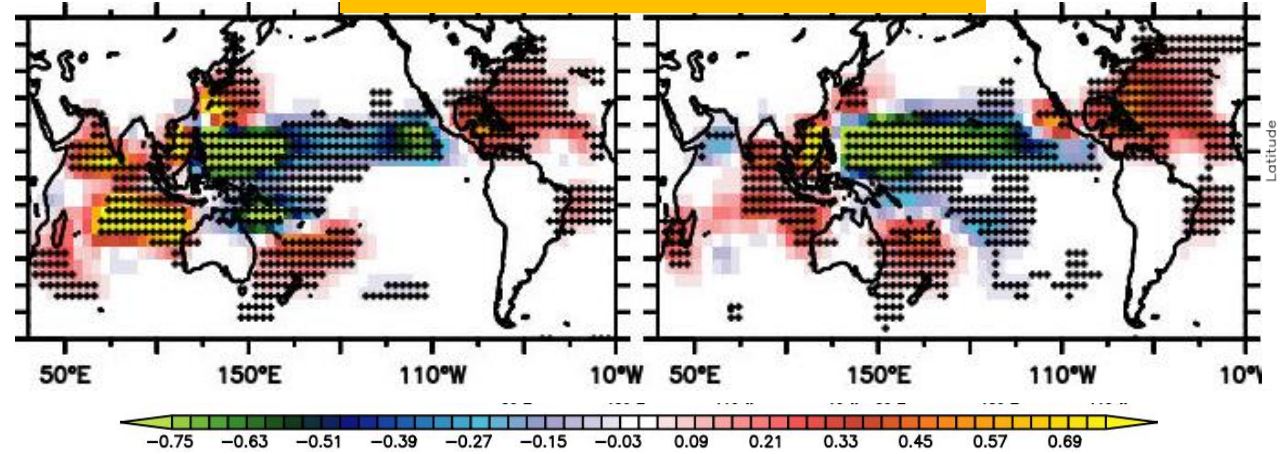
FLOR (1000-years)

SPEAR (1000-years)

Regressed SST on $-1 \times$ IPO Index

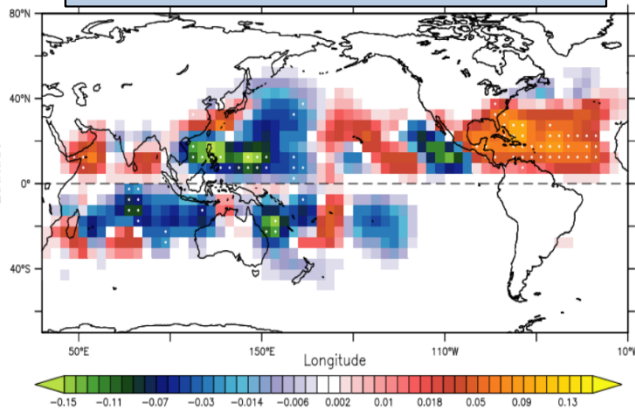


Regressed TCF on $-1 \times$ IPO Index



We hypothesized that the observed TCF trend is **not only caused by the multidecadal internal variability** like IPO, but other external forcing may be related.

Observed Trend in TCF (1980-2018)



Large-Ensemble Simulations by SPEAR, FLOR, and FLOR-FA



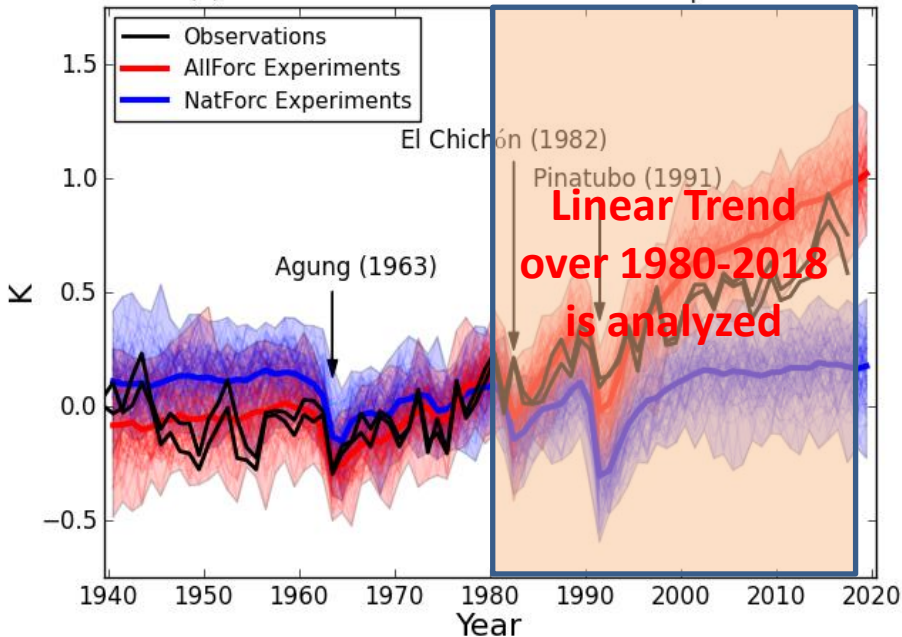
AllForc: Historical simulations by prescribing time-varying external forcing (greenhouse gases, aerosols, volcanic forcing, and solar constant)

95 ensemble members: SPEAR (30 members), FLOR (30 members), and FLOR-FA (35 members)

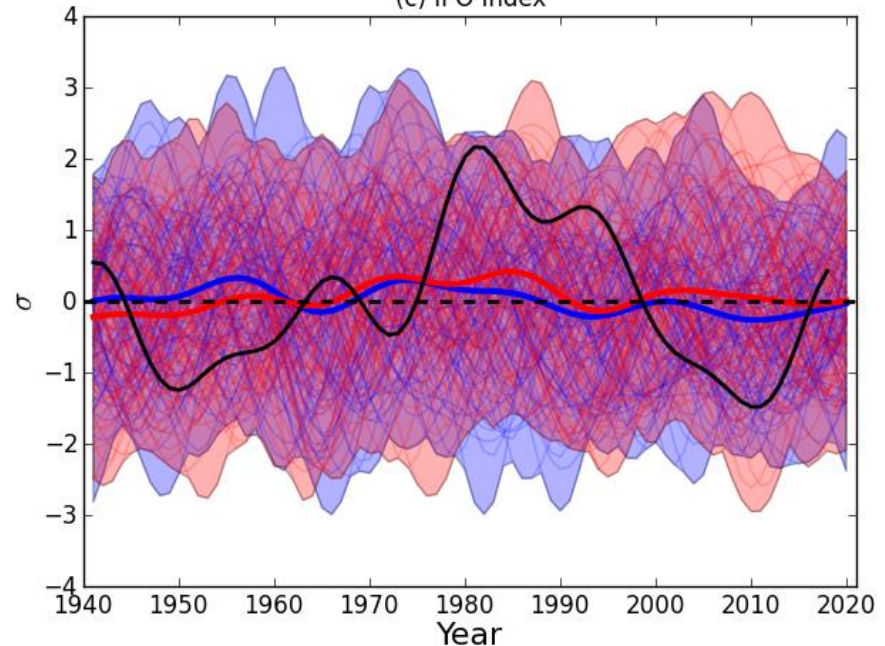
NatForc: As in AllForc, but only with time-varying volcanic forcing and solar constant.

90 ensemble members = SPEAR (30 members), FLOR (30 members), and FLOR-FA (30 members)

(a) Anomalies of Global Mean Surface Temperature



(c) IPO Index

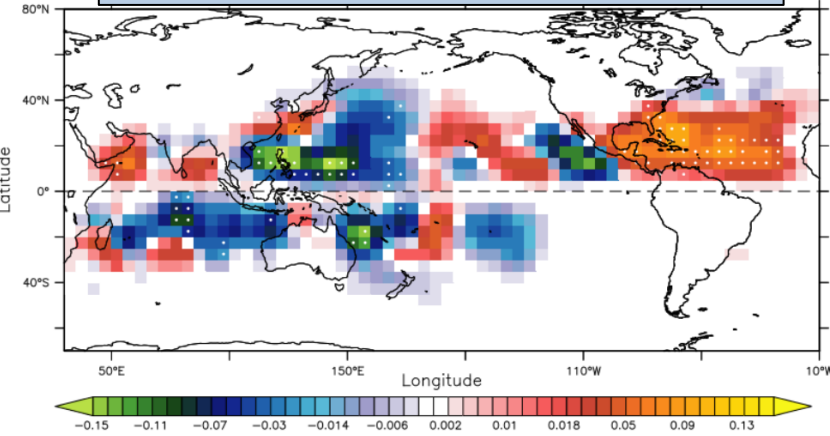


Because of the different initial states, each ensemble member shows a different phase of internal variability. Internal variability can be canceled out by averaging the members.

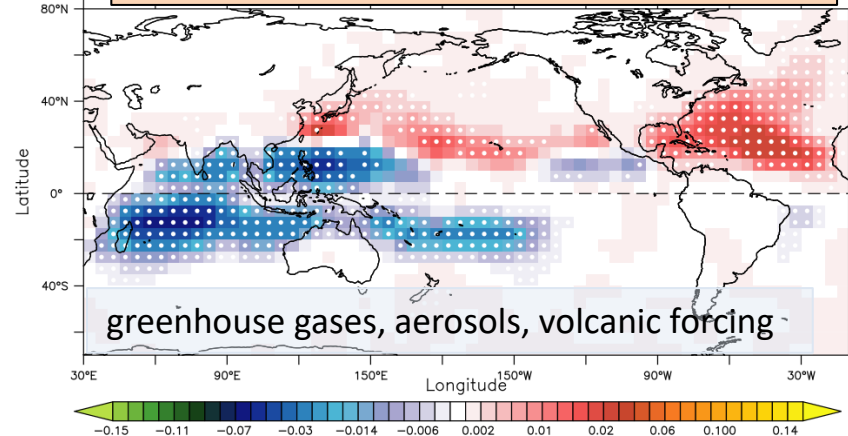
Effect of External Forcing on the TCF Trend



Observed Trend in TCF (1980-2018)

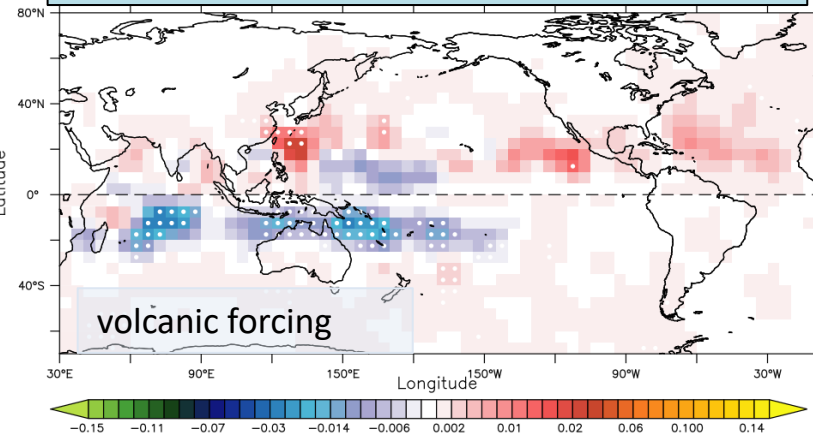


AllForc (95-member mean, 1980-2018)



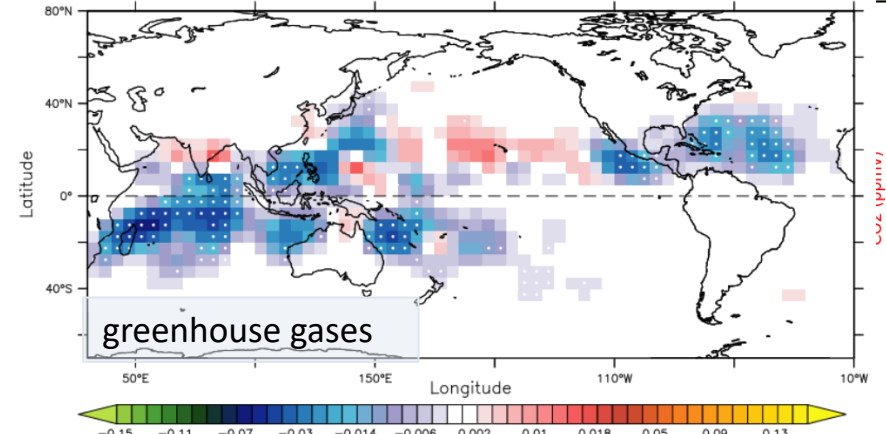
A similar spatial pattern with observations indicates marked influence of external forcing on global TCF.

NatForc (90-member mean, 1980-2018)



Volcanic forcing causes a northward shift in TCF, which is also similar to the observed TCF trend.

Transient 2xCO₂ (3-member mean, 70 yrs)



transient +1%/yr CO₂ experiment

- Fully Coupled
- +1% CO₂ increase up to 2xCO₂ (at year 171) then fixed

Effect of External Forcing on the TCF Trend



SVD analysis is applied to the ensemble mean for each experiment.

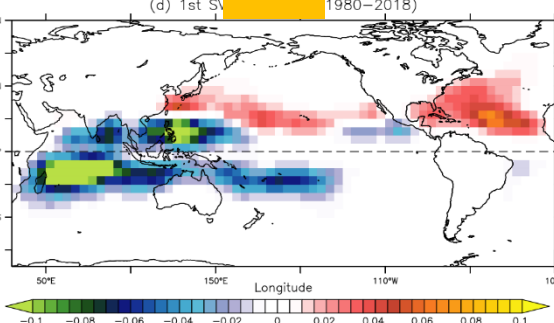
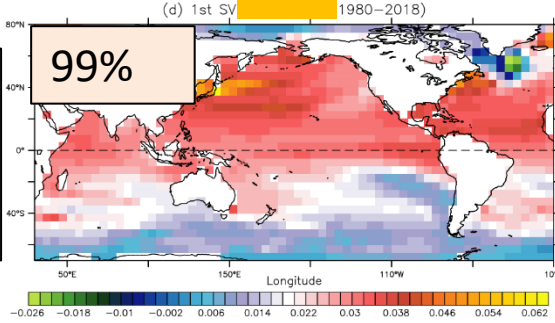
1st SVD Mode

SST

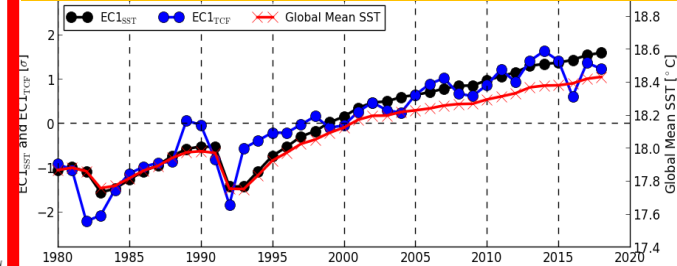
TCF

AllForc

99%

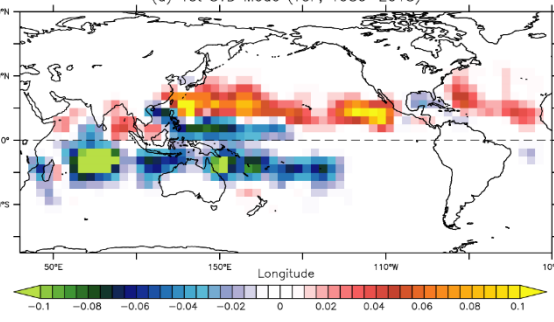
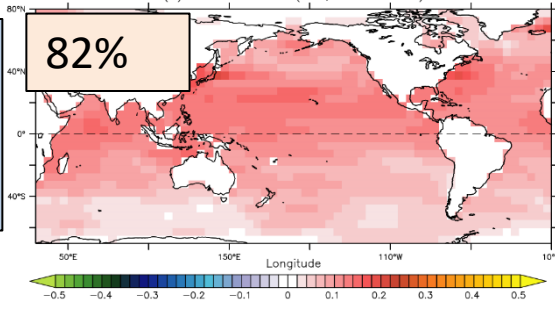


EC1 (Black: SST, Blue: TCF), Red: GMTemp

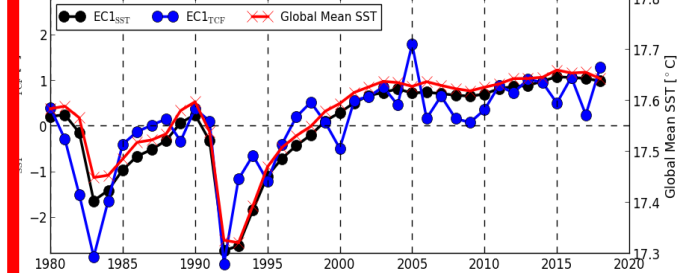


NatForc

82%

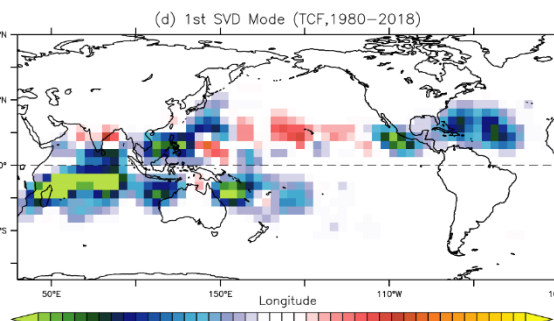
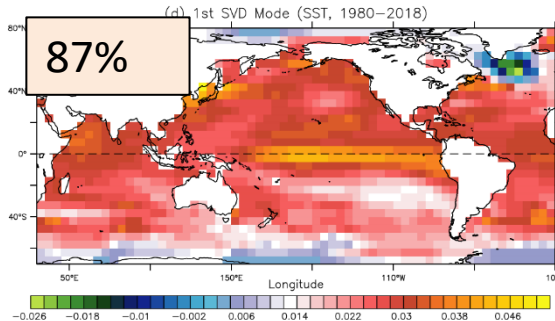


(c) Time Series of EC1_{SST}, EC1_{TCF}, and Global Mean SST (1980-2018)

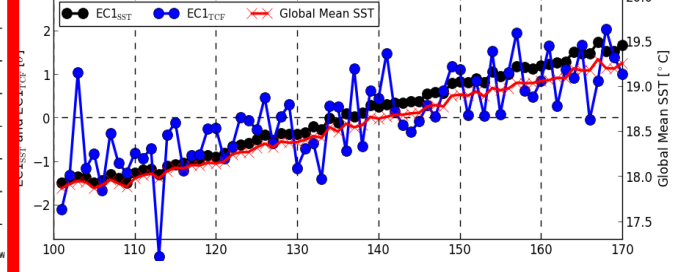


Transient 2xCO₂

87%



(c) Time Series of EC1_{SST}, EC1_{TCF}, and Global Mean SST (1980-2018)



The 1st SVD mode of TCF is assumed to be the expected climate signal of TCF

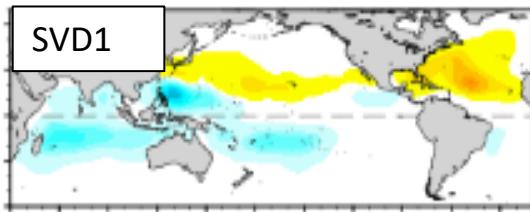
Optimal Fingerprint Analysis



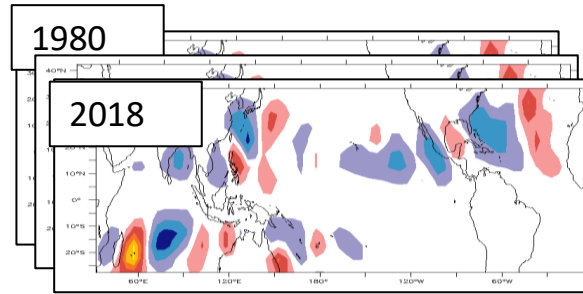
Question: How much of the observed TCF trends over 1980–2018 can be statistically distinguishable from internally generated noise? If they can be distinguished from noise, by what year did this occur?

An Expected Climate Signal Pattern Observed Annual TCF Anomaly (1980–2018)

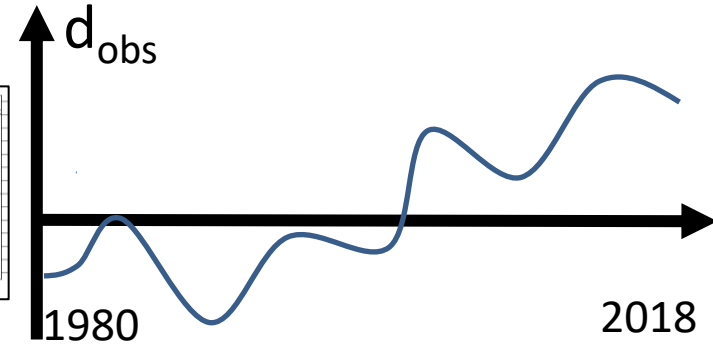
(Guess, or Fingerprint)



$G(x,y)$

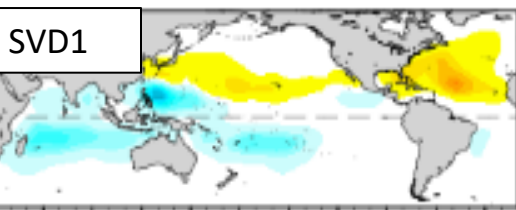


$TCF_{obs}(x,y,t)$

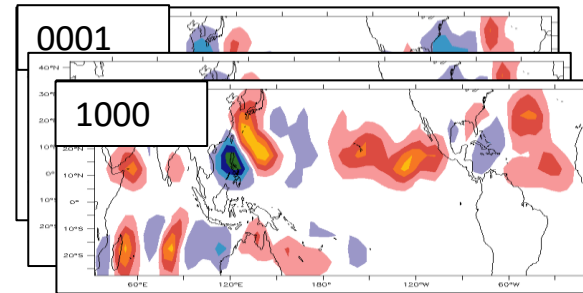


An Expected Climate Signal Pattern (Guess, or Fingerprint)

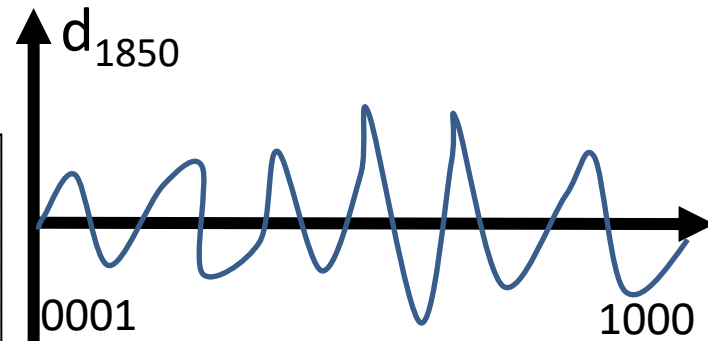
1850Cntl (1000 years)



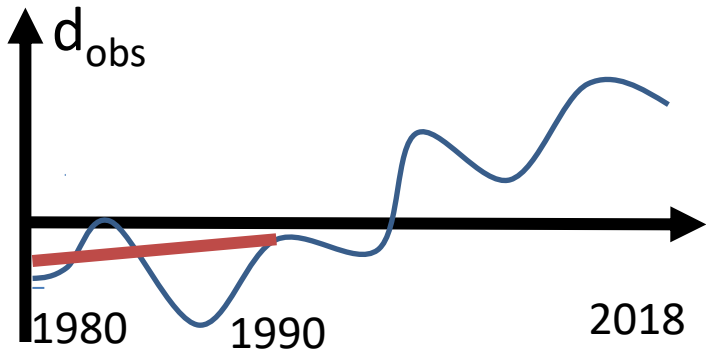
$G(x,y)$



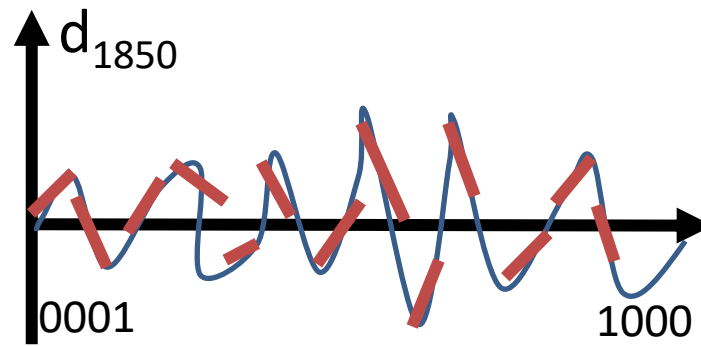
$TCF_{1860}(x,y,t)$



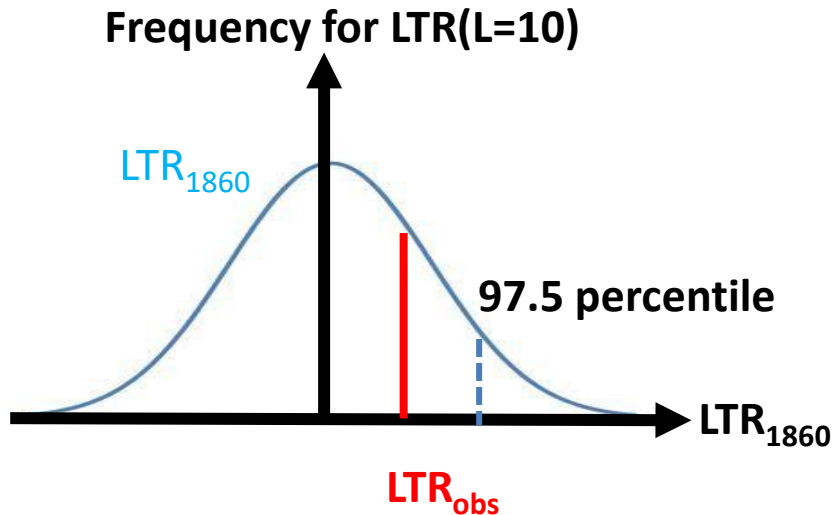
Optimal Fingerprint Analysis (Concept)



Observed linear trend
between 1980 – 1990: $LTR_{obs}(L=10)$

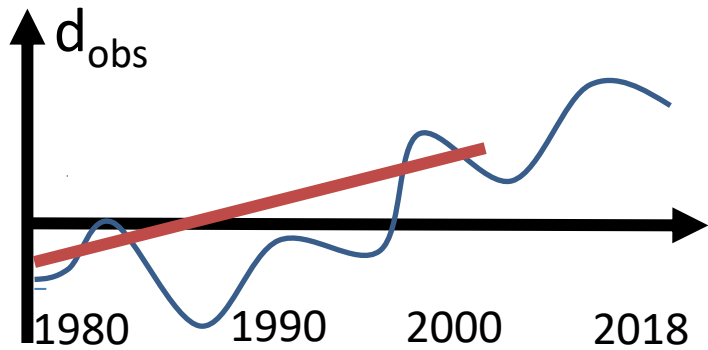


Many $LTR_{1860}(L=10)$ samples can be obtained
from 1850Cntl.

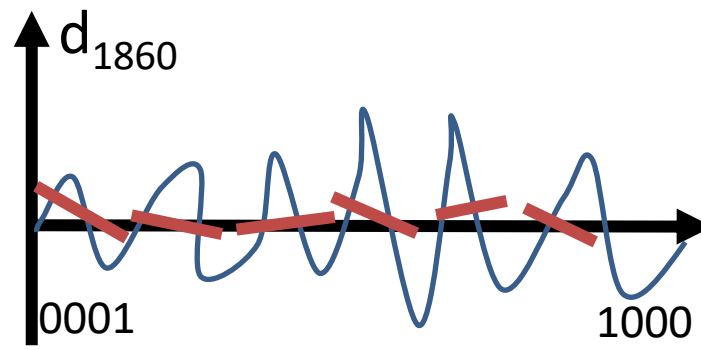


LTR_{obs} is not distinguishable from noise
(not detected)

Optimal Fingerprint Analysis (Concept)

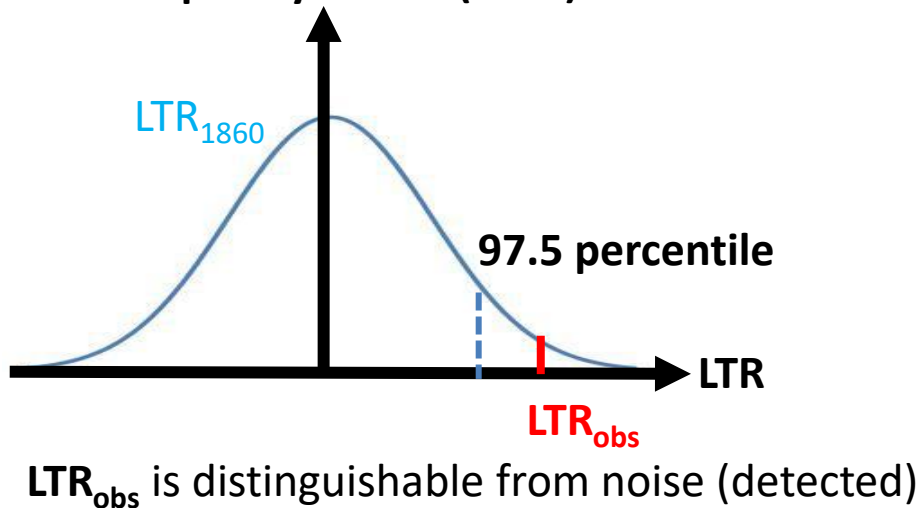


Observed linear trend between 1980 – 2000: $LTR_{obs}(L=20)$

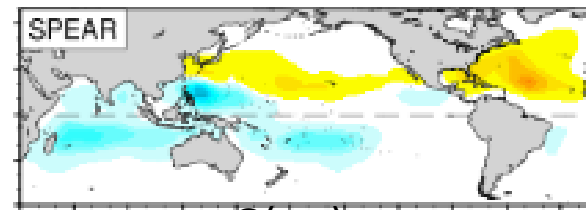


Many $LTR_{1860}(L=20)$ samples can be obtained from 1860Cntl.

Frequency for $LTR(L=20)$



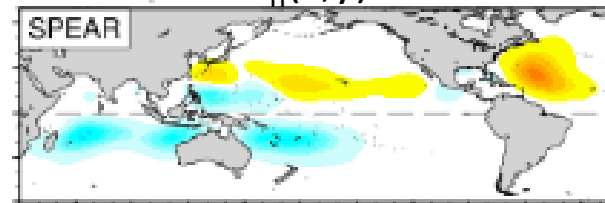
An Expected Climate Signal Pattern (Guess)



$G(x,y)$

Optimizing using the first n -th EOF modes.

$F_n(x,y)$



1911 1916 1921 1926 1931 1936 1941 1946 1951 1956 1961 1966 1971 1976 1981 1986 1991 1996 2001 2006 2011

Optimal Fingerprint Analysis (Guess or Fingerprint)



Fingerprints			1850Cntl
AllForc	FLOR-FA	G, F ₅ , F ₁₀ , F ₁₅	SPEAR
	FLOR		SPEAR
	SPEAR		FLOR-FA
Transient 2xCO ₂	FLOR-FA		SPEAR
	FLOR		SPEAR
	SPEAR		FLOR-FA
NatForc	FLOR-FA		SPEAR
	FLOR		SPEAR
	SPEAR		FLOR-FA

- There are 36 fingerprints prepared (3 x 3 x 4).
- To avoid artificial skill, independent models should be used for fingerprint and 1850Cntl.



- The detection time is referenced to 1980.
- We begin with L10 (a linear trend from 1980 to 1990) to see if it is detected. So that the earliest detection year is 1990.
- In case of no detection, we repeat the analysis by increasing the length by one year (e.g., L11, L12,..., L38) until it shows a detection.

Optimal Fingerprint Analysis (Guess or Fingerprint)



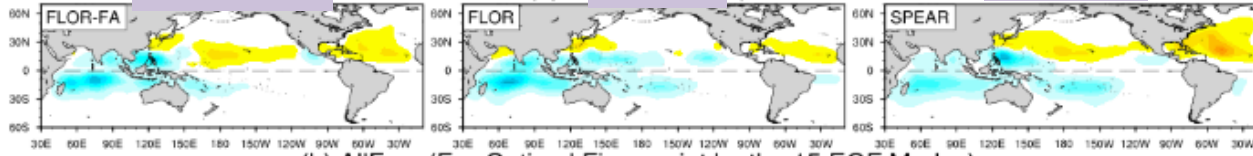
AllForc

FLOR-FA

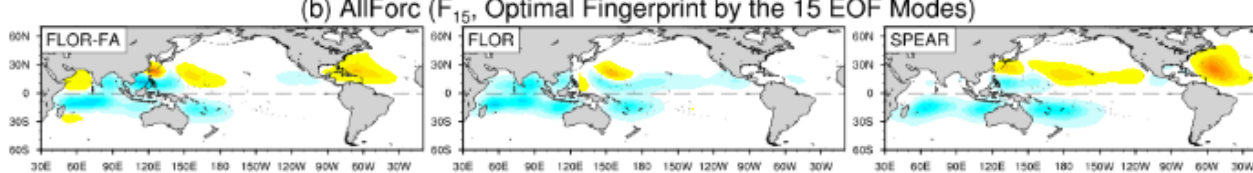
(a) AllForc (FLOR s)

SPEAR

$G(x,y)$



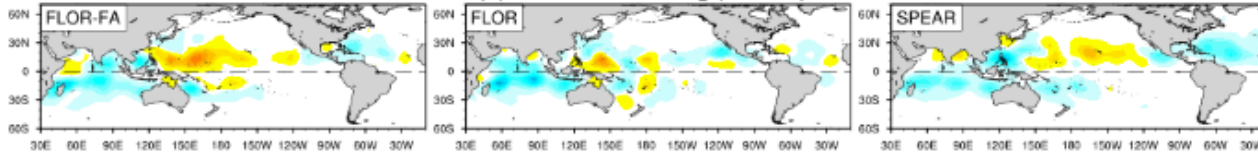
$F_{15}(x,y)$



(c) Transient 2xCO₂ (Guess)

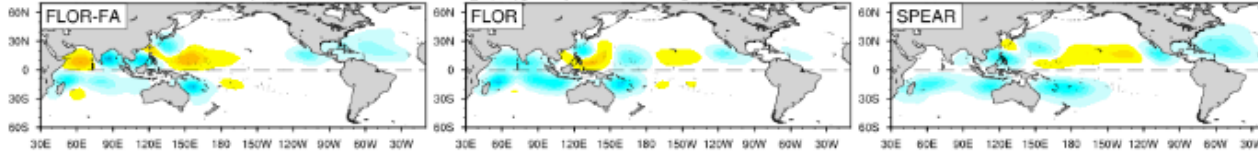
Transient 2xCO₂

$G(x,y)$



(d) Transient 2xCO₂ (F₁₅, Optimal Fingerprint by the 15 EOF Modes)

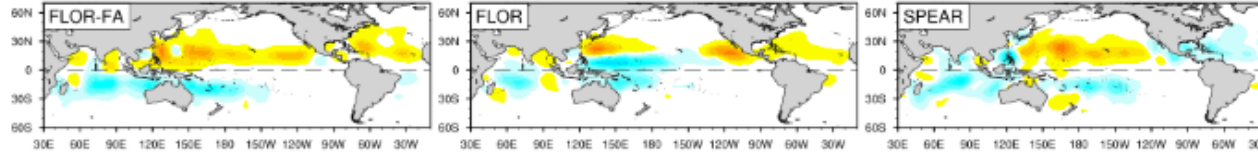
$F_{15}(x,y)$



(e) NatForc (Guess)

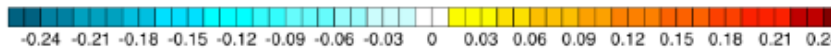
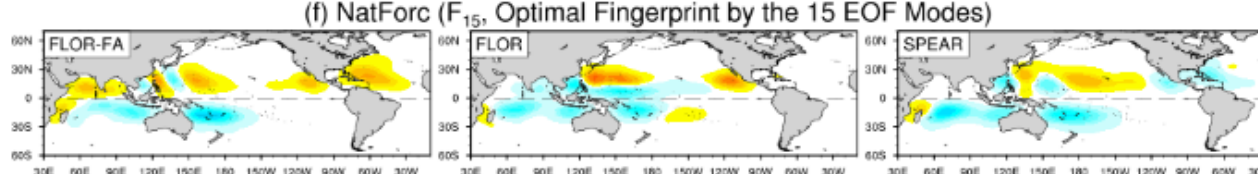
NatForc

$G(x,y)$



(f) NatForc (F₁₅, Optimal Fingerprint by the 15 EOF Modes)

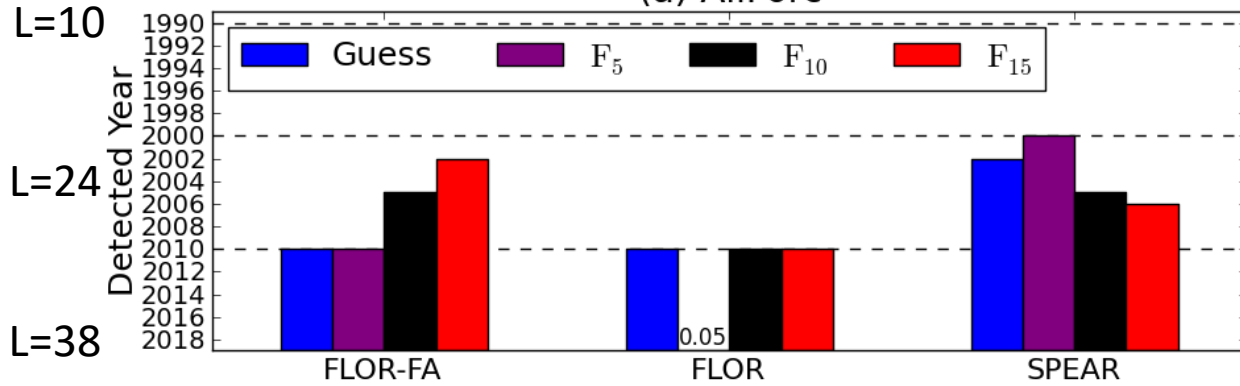
$F_{15}(x,y)$



Optimal Fingerprint Analysis

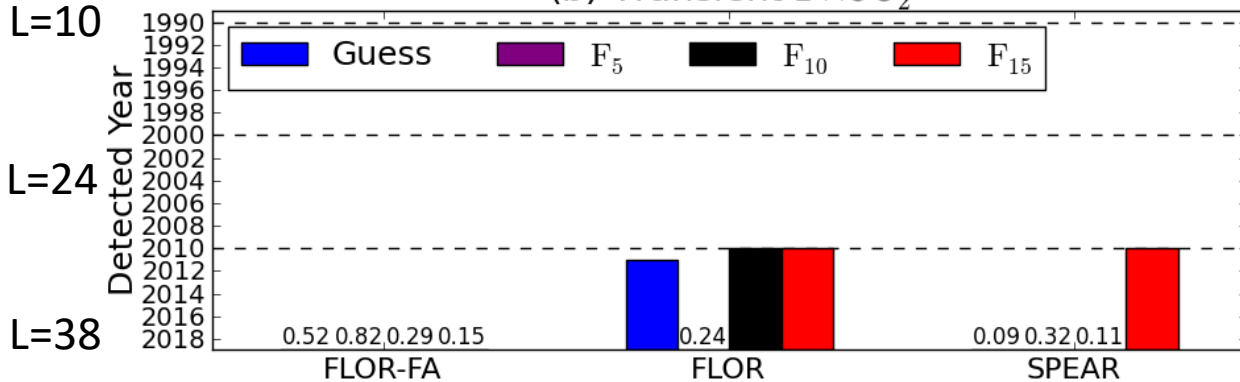


(a) AllForc



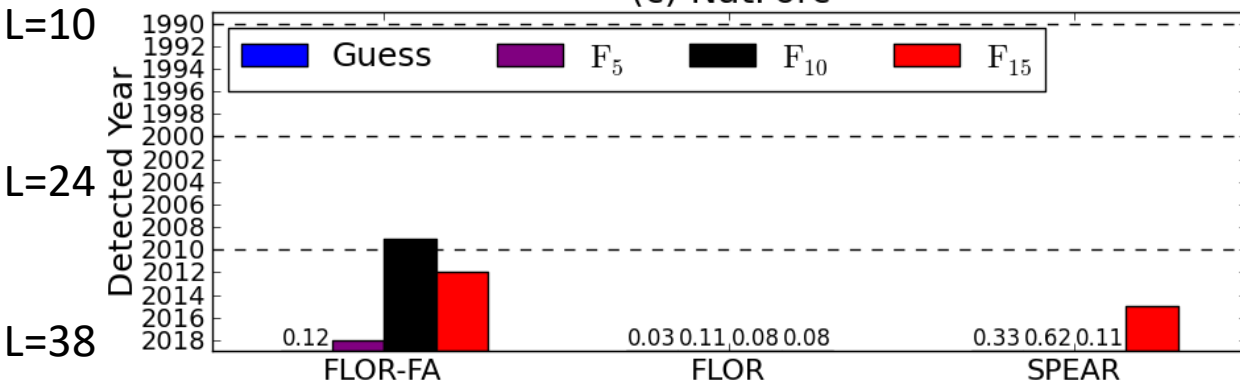
Detected around 2010
 ⇒ External forcing play an important role for the observed trend.

(b) Transient 2 ×CO₂



Detected around 2010
 ⇒ Increase in greenhouse gases (CO₂) partially contributes to the observed trend.

(c) NatForc

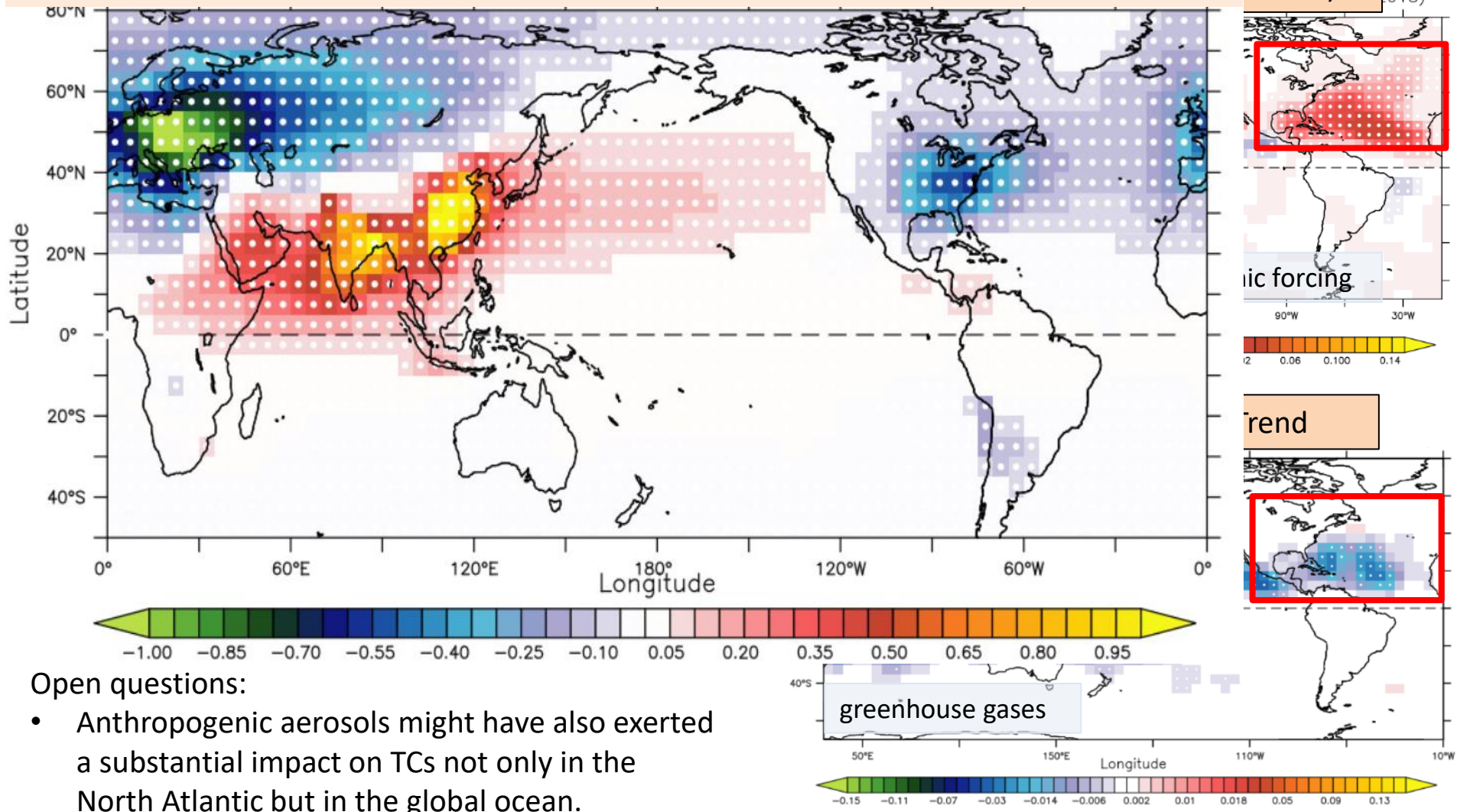


Volcanic forcing also plays a minor role.

Effect of Aerosols on Atlantic TCs



Sulfate Change (2001-2020 minus 1980-2000)



Open questions:

- Anthropogenic aerosols might have also exerted a substantial impact on TCs not only in the North Atlantic but in the global ocean.
- Regional changes in aerosols may differently influence global TCs.

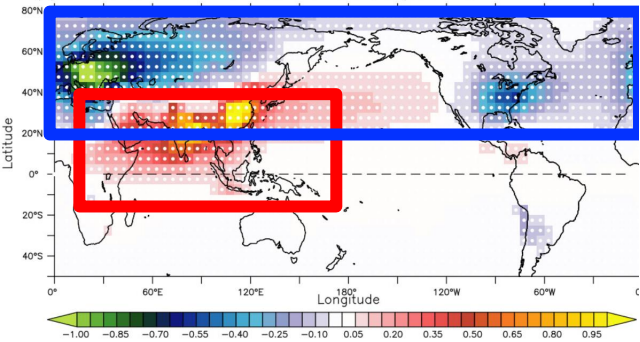
There is a marked difference in the North Atlantic.

Idealized Model Experiments



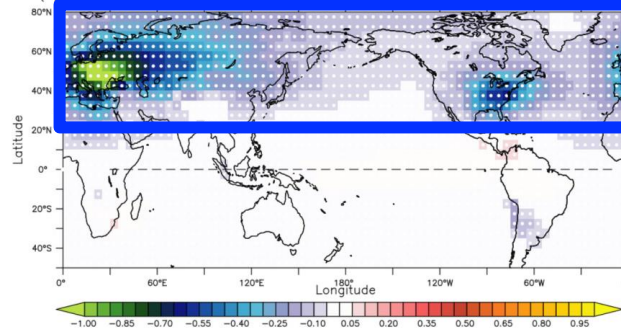
Δ ALL21, Sulfate

(a) Difference in Prescribed Sulfate Aerosols (2001–2020 minus 1980–2000)



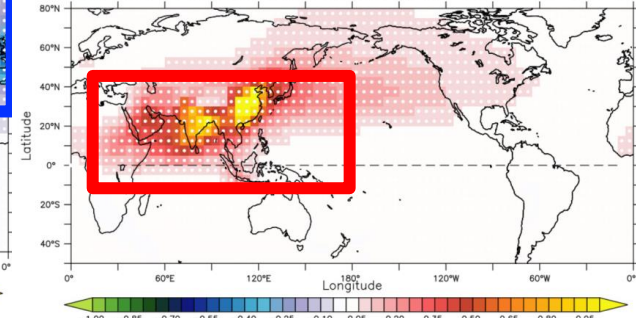
Δ W21, Sulfate

(c) Difference in Prescribed Sulfate Aerosols (w2001–2020 minus 1980–2000)



Δ IP21, Sulfate

(b) Difference in Prescribed Sulfate Aerosols (ip2001–2020 minus 1980–2000)



Using SPEAR, additional idealized experiments were conducted by specifying different aerosol emissions.

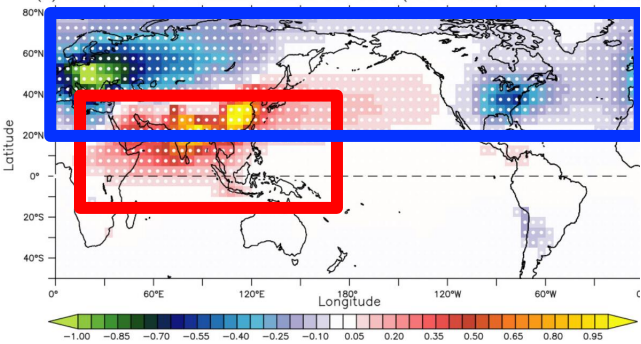
Exp Name	Level of Anthropogenic Aerosols	Other external forcing	Simulation length	Difference from CNTL
CNTL	Mean of 1980-2000	Fixed at 2000 level	200 years	—
ALL21	Mean of 2001-2020			Δ ALL21
W21	Same as CNTL, but 2001-2020 mean for Europe and the US.			Δ W21
IP21	Same as CNTL, but 2001-2020 mean for China and India.			Δ IP21

Simulated Changes in TCF by the Idealized Experiments

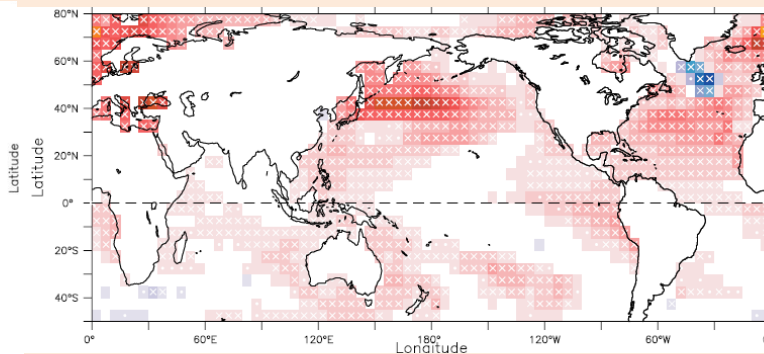


Δ ALL21, Sulfate

(a) Difference in Prescribed Sulfate Aerosols (2001–2020 minus 1980–2000)

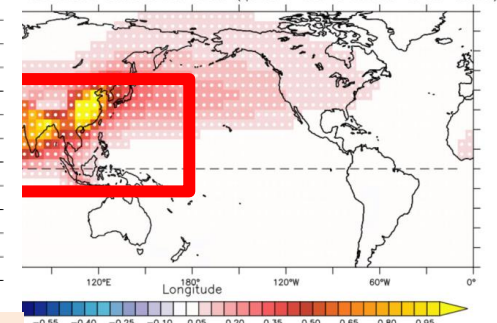


Δ ALL21, SST

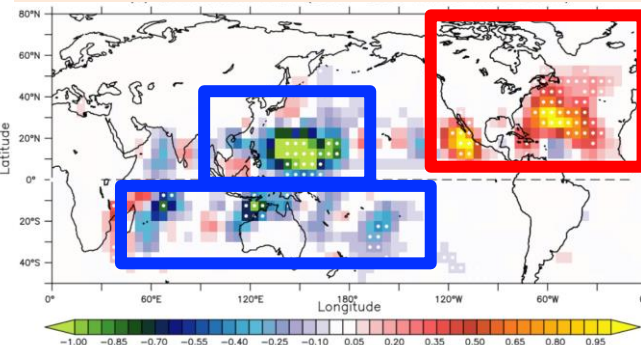


Δ IP21, Sulfate

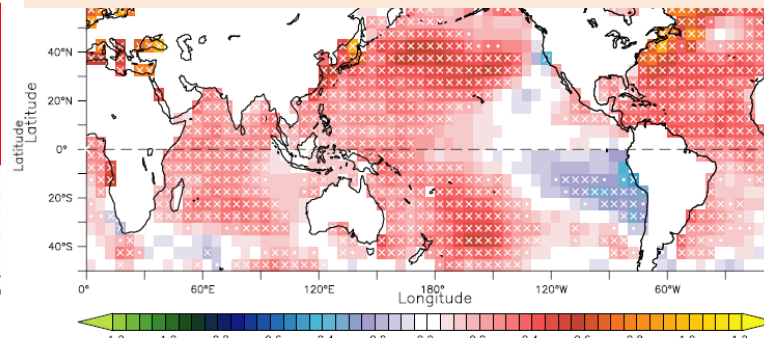
Prescribed Sulfate Aerosols (ip2001–2020 minus 1980–2000)



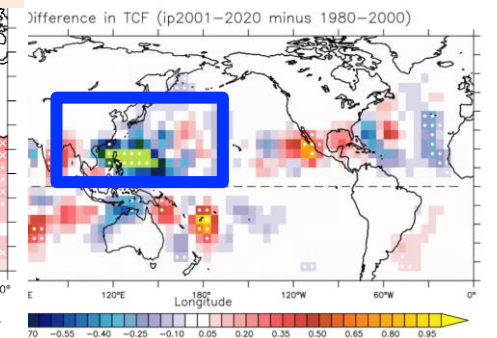
Δ ALL21, TCF



Observed SST Change (2001–2020
minus 1980–2000)



Δ IP21, Sulfate



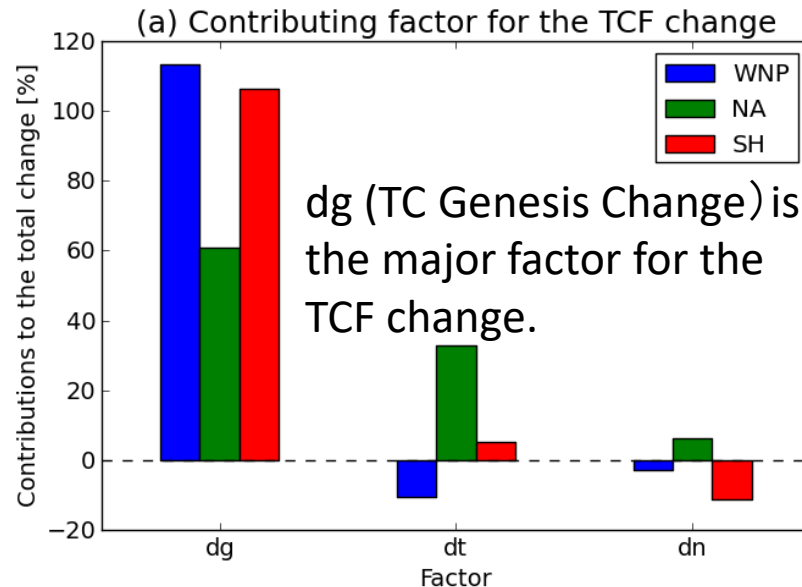
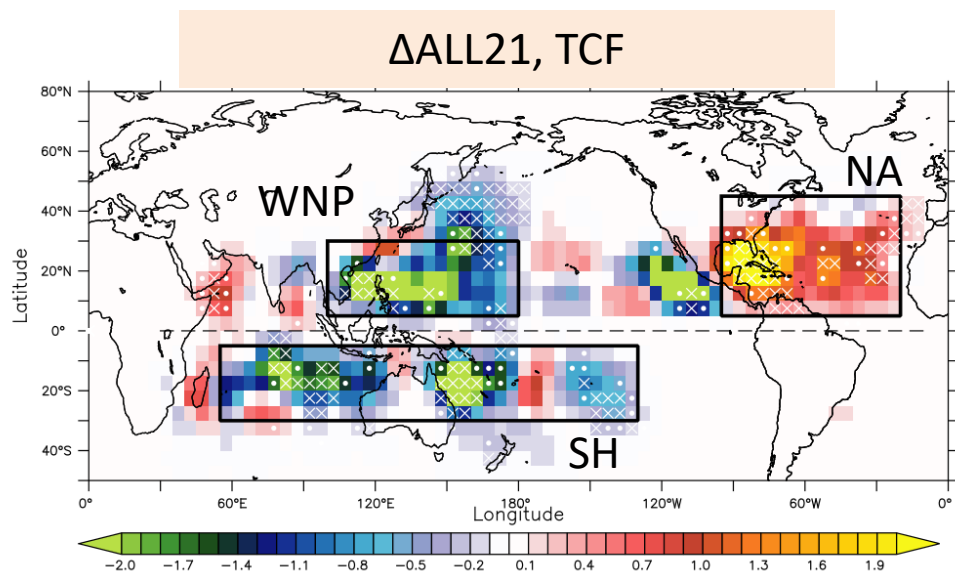
Decreased Aerosols in US & Europe => **Increased TCs in the North Atlantic**

Decreased TCs in the Southern Hemisphere

Increased Aerosols in China & India => **Decreased TCs in the Western North Pacific**

The potential effect of aerosols on the La Nina-like SST decadal change

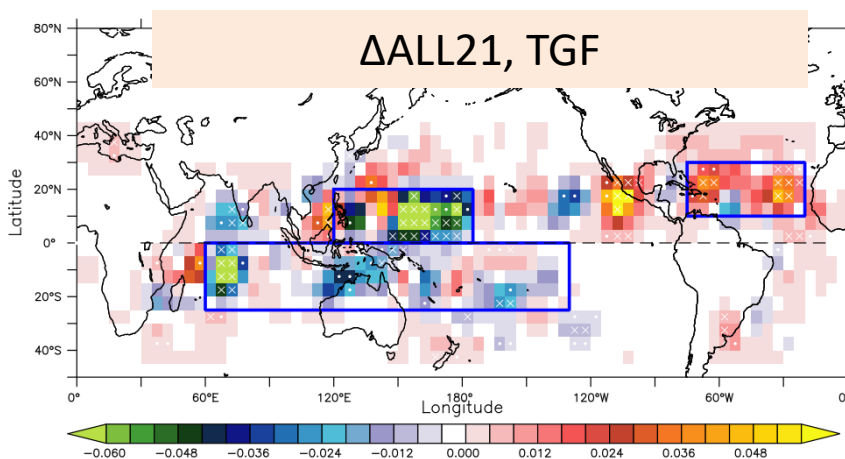
Empirical Analysis of TCF Change



An empirical TCF analysis (Murakami et al. 2013)

$$\delta f(A) = \underbrace{\iint_C \delta g(A_0) \times \overline{t(A, A_0)} dA_0}_{dg} + \underbrace{\iint_C \overline{g(A_0)} \times \delta t(A, A_0) dA_0}_{dt} + \underbrace{\iint_C \delta g(A_0) \times \delta t(A, A_0) dA_0}_{dn}$$

TCF Change = TC Genesis Change (dg) + TC Track Change (dt) + Non-Linear Effect (dn)



Analysis of TC Genesis Change via Genesis Potential Index



A new Dynamic GPI (Wang and Murakami 2020, Murakami and Wang 2022)

$$DGPI = (2.0 + 0.1 \times V_s)^{-1.7} \left(5.5 - \frac{du_{500}}{dy} \times 10^5\right)^{2.3} (5.0 - 20 \times \omega_{500})^{3.4} (5.5 + |\zeta_{a500} \times 10^5|)^{2.4} e^{-11.8} - 1.0$$

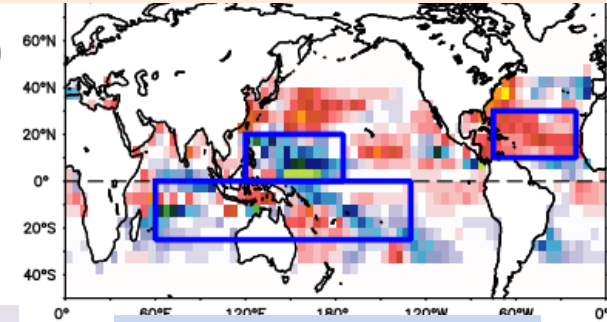
Vertical
Wind
Shear

Mid-level
vorticity

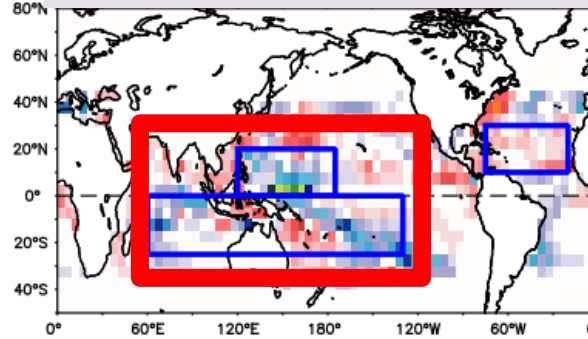
Vertical
Motion at
500 hPa

Low-level
vorticity

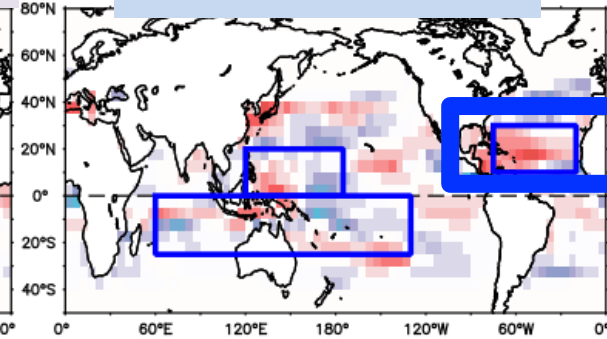
$\Delta ALL21$, DGPI Change



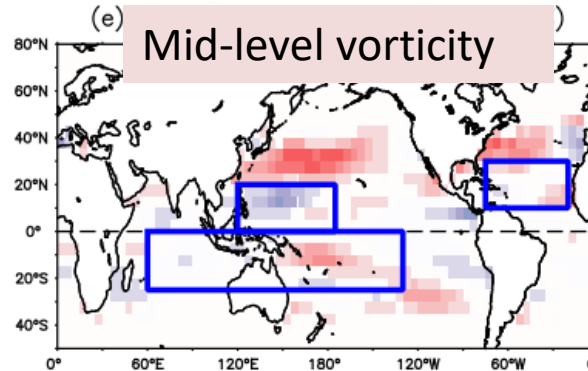
Vertical Motion at 500 hPa



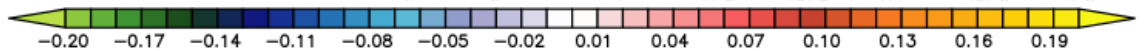
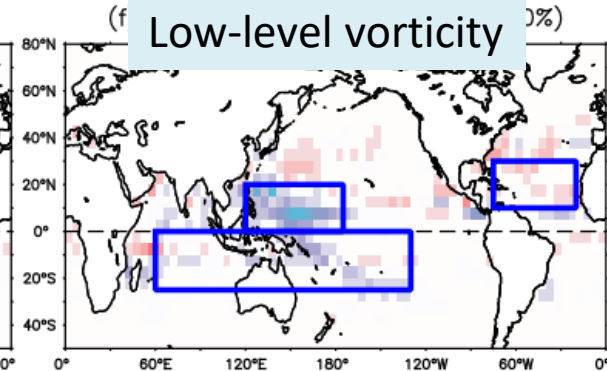
Vertical Wind Shear



Mid-level vorticity



Low-level vorticity (%)

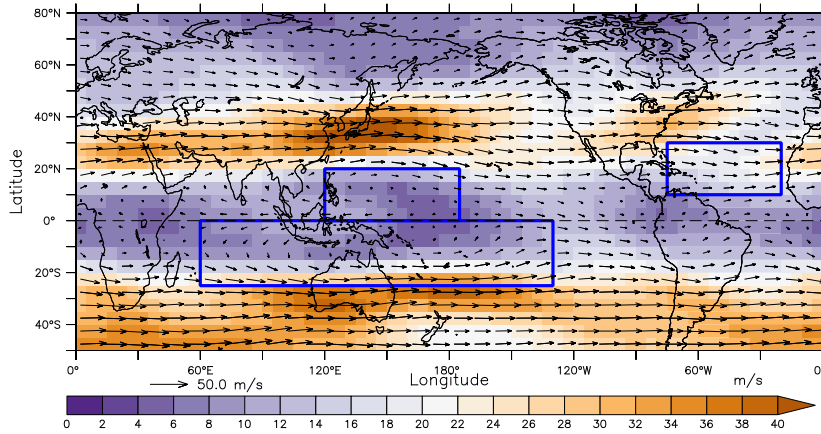


Region	The Critical Element for the GPI Change
North Atlantic	Vertical Wind Shear
Western North Pacific	Vertical Motion at 500 hPa
Southern Hemisphere	Vertical Motion at 500 hPa

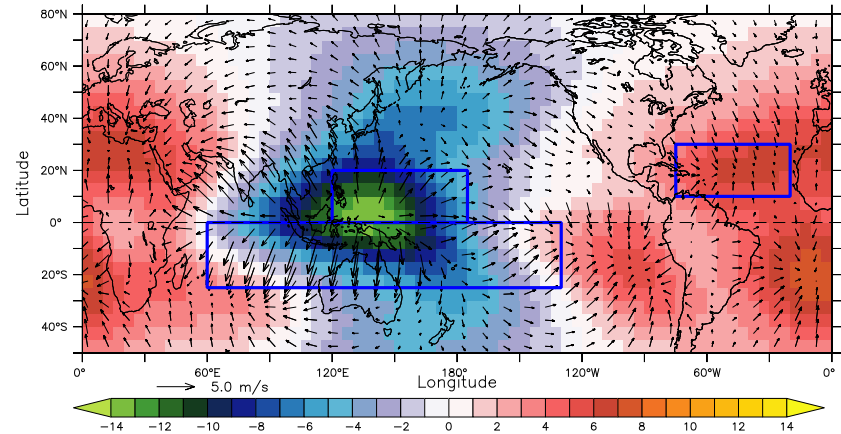
Large-scale Flow Changes (Δ ALL21)



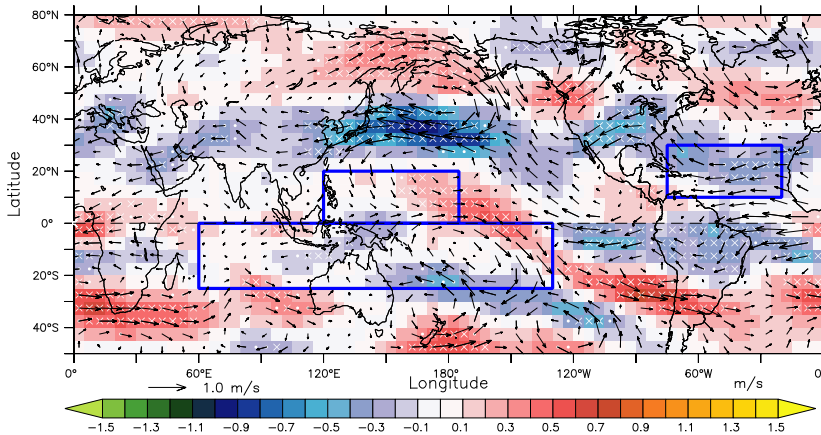
(a) Winds at 200 hPa (CNTL)



(b) X_{200} and Divergence Winds (CNTL)

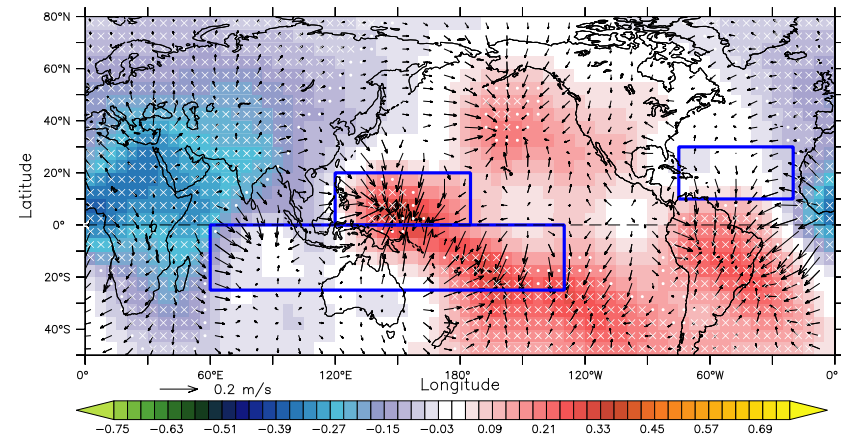


(c) Winds at 200 hPa (δ ALL21)



A northward shift in subtropical jet caused decreased wind shear in the North Atlantic
->Increased TCs in North Atlantic

(d) X_{200} and Divergence Winds (δ ALL21)

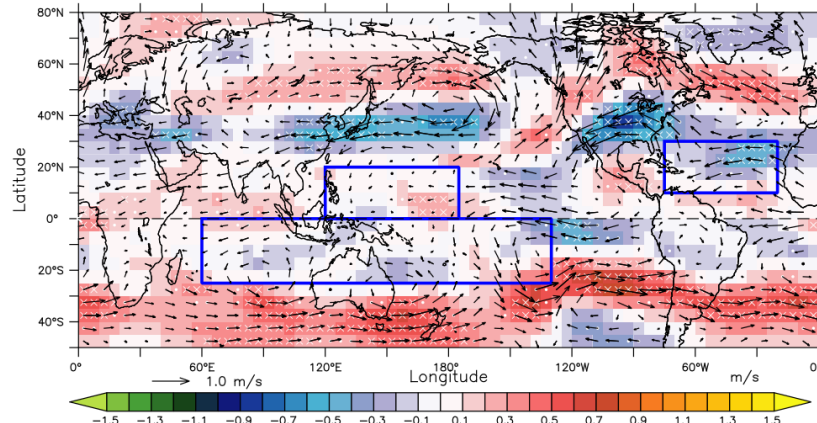


Decreased divergence at the upper-level troposphere in W. Pacific and S. Hemisphere
->Weakened convections
->Decreased TCs in W. Pacific and S. Hemisphere

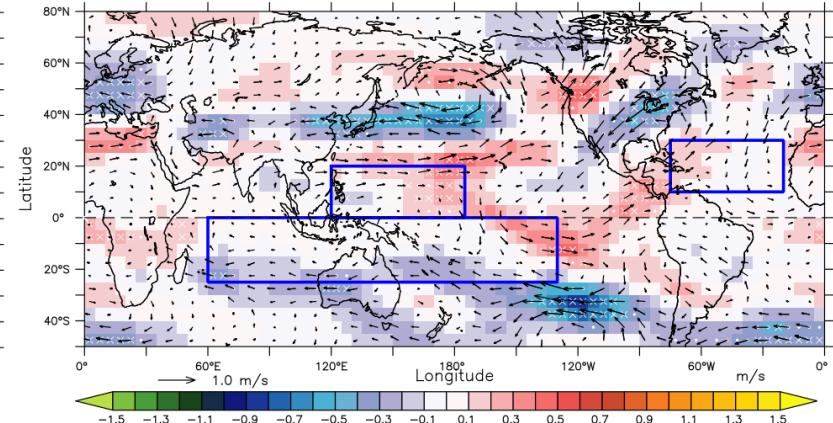
Large-scale Flow Changes ($\Delta W21$ and $\Delta IP21$)



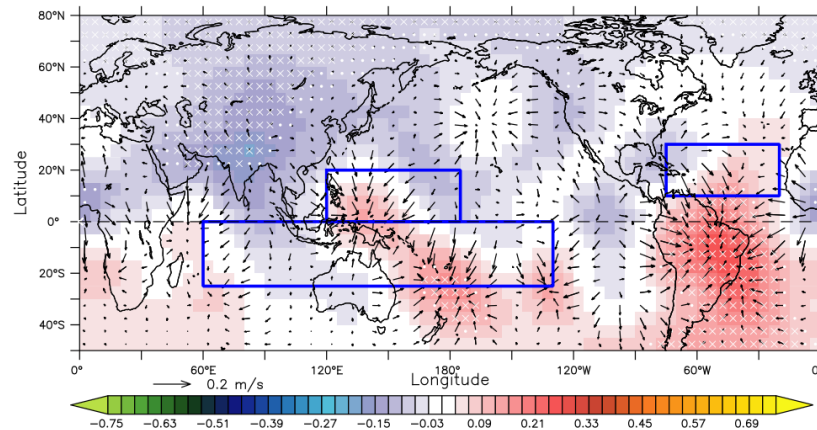
(c) Winds at 200 hPa ($\delta W21$)



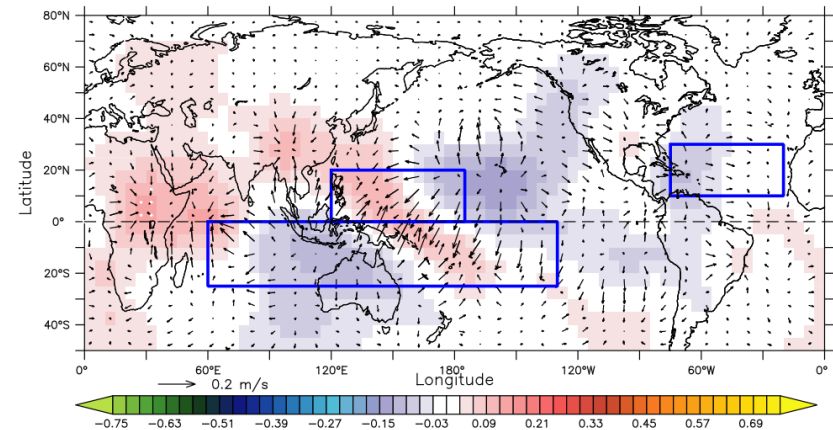
(g) Winds at 200 hPa ($\delta IP21$)



(d) X_{200} and Divergence Winds ($\delta W21$)



(h) X_{200} and Divergence Winds ($\delta IP21$)



A northward shift in jet is seen in $\Delta IP21$, but not extended to the North Atlantic.

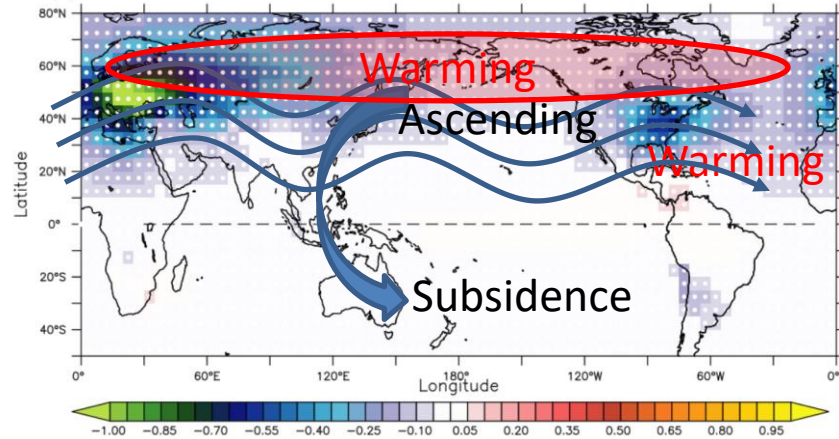
The convergence changes are larger in $\Delta W21$ than in $\Delta IP21$ in the Southern Hemisphere.

Schematic Diagram for the Effect of Aerosols on Global TCs



$\Delta W21$

(c) Difference in Prescribed Sulfate Aerosols (w2001–2020 minus 1980–2000)



Decreased Aerosols -> Warming Local Ocean

-> Increased TCs in the North Atlantic

Decreased Aerosols -> Decreased meridional gradient of atmospheric temperature

-> Poleward shift in subtropical jet

-> Decreased wind shear

-> Increased TCs in the North Atlantic

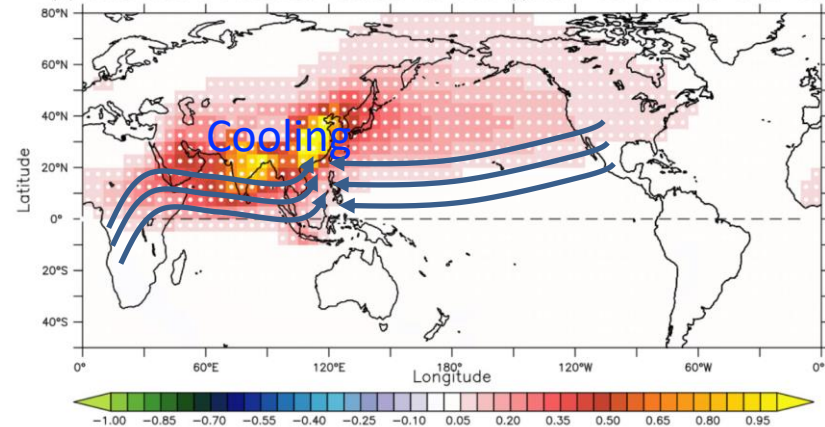
Warming North Hemisphere -> Hadley Circulation Anomaly

-> Subsidence anomaly in the Southern Hemisphere

-> Decreased TCs in the Southern Hemisphere

$\Delta IP21$

(b) Difference in Prescribed Sulfate Aerosols (ip2001–2020 minus 1980–2000)



Increased Aerosols -> Cooling South-East Asian Continent

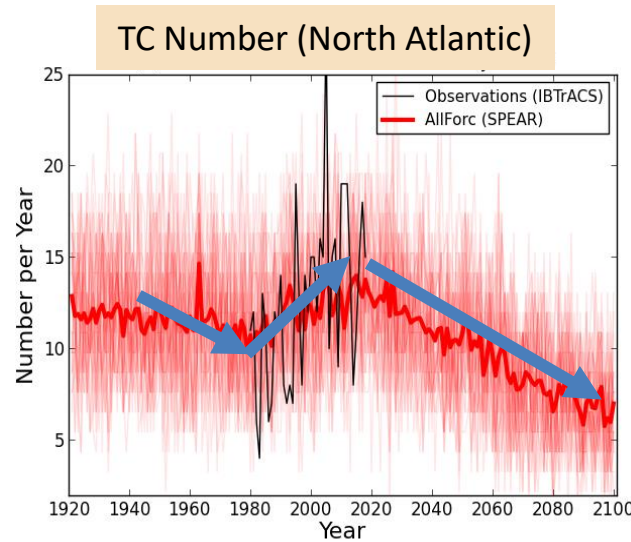
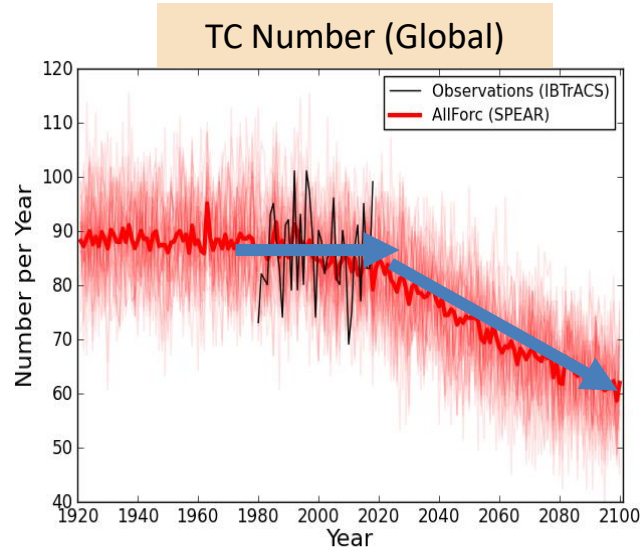
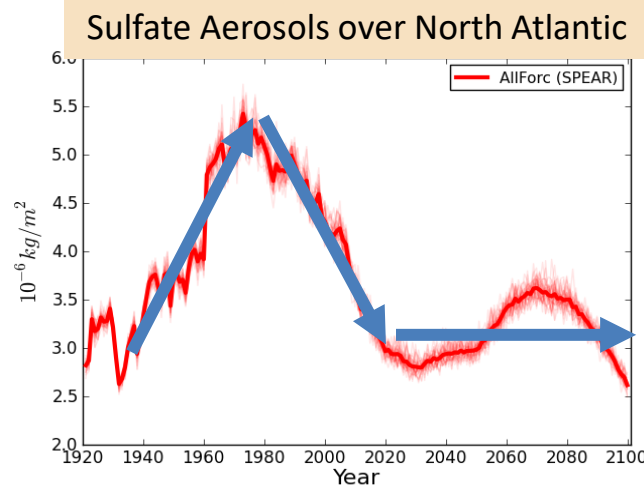
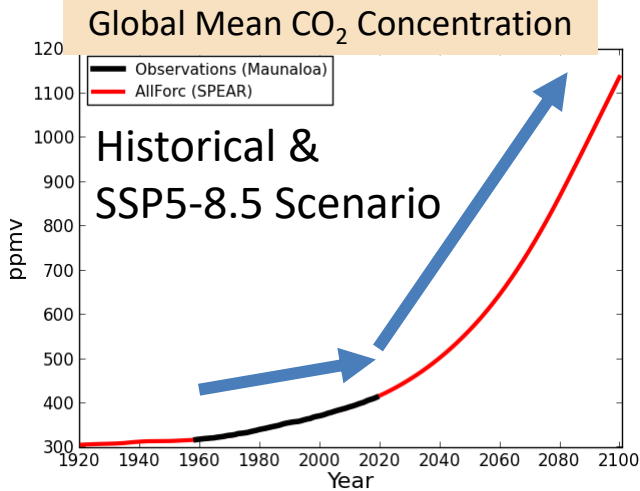
-> Weakening of Indian Monsoon

-> Weakening of Monsoon Trough in the western North Pacific

-> Decreased TCs in the Western North Pacific

Consistent with Ramasamy and Chen (1997), Ming and Ramaswamy (2009), Bollasina et al. (2011)

Future Projections



The decreased aerosols may be the important factor for the increased TCs over the North Atlantic over 1980-2020.

The 30-member SPEAR projects decreased global TC number toward the end of this century due to increased CO₂.

TC number of North Atlantic is also projected to decrease in the future due to the dominant effect of increased CO₂.

Summary



- A climate change in global TC activity over the period 1980–2018 has been more evident in the spatial pattern of TC occurrence, rather than the overall number of global TCs.
- The observed spatial pattern of trends is very unlikely to be explained entirely by underlying multi-decadal internal variability; rather, external forcing such as greenhouse gases, aerosols, and volcanic eruptions likely played an important role.
- The decreased anthropogenic aerosols in the US and Europe may play an important role in the increased TCs over the North Atlantic since 1980, whereas the increased aerosols in China & India may play an important role in the decreased TCs over WNP.
- The models project decreasing trends in global (including North Atlantic) TCs toward the end of this century owing to the dominant effect of CO₂ increases.

Murakami, H., T. L. Delworth, W. F. Cooke, M. Zhao, B. Xiang, and P. -C. Hsu, 2020: Detected climatic change in global distribution of tropical cyclones. *Proc. Natl. Acad. Sci. U.S.A.*, **117(20)**, 10706-10714.

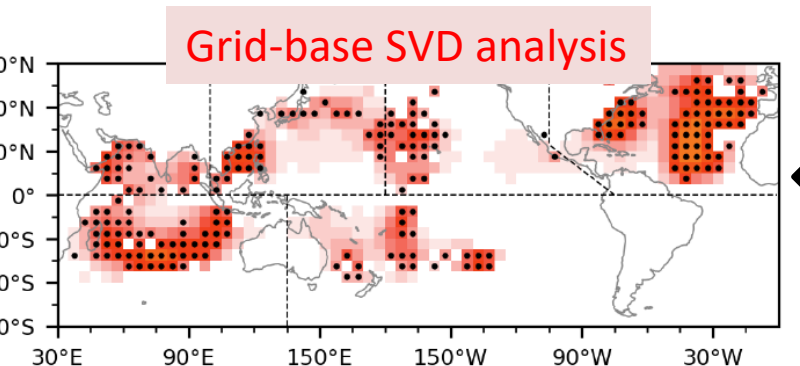
Murakami, H., 2022: Substantial global influence of anthropogenic aerosols on tropical cyclones over the past 40 years. *Sci. Adv.*, **8**, eabn9493.

Murakami, H. and B. Wang, 2022: Patterns and frequency of projected future tropical cyclone genesis are governed by dynamic effects. *Nature Commun. Earth Environ.*, **3**, 77.

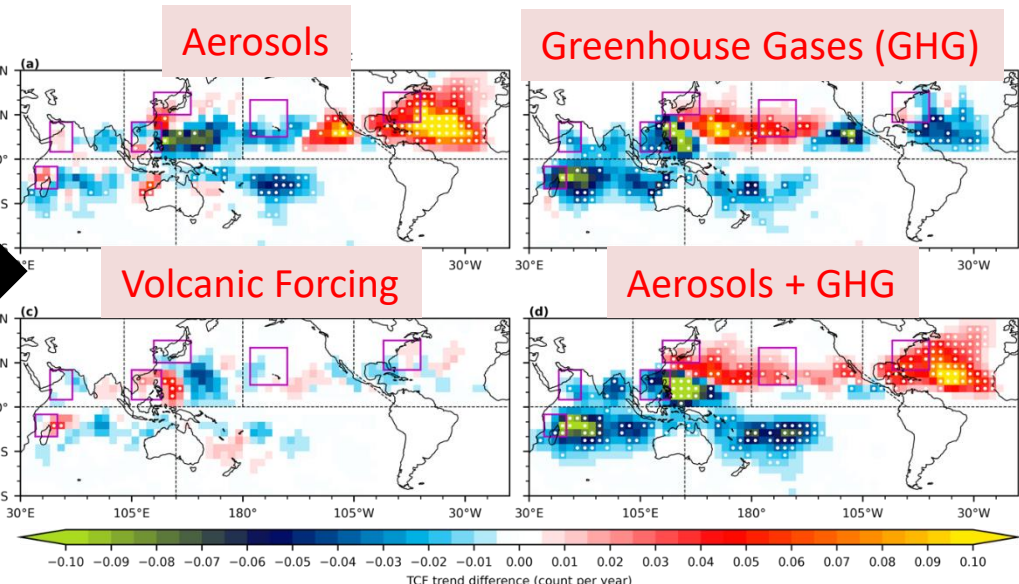
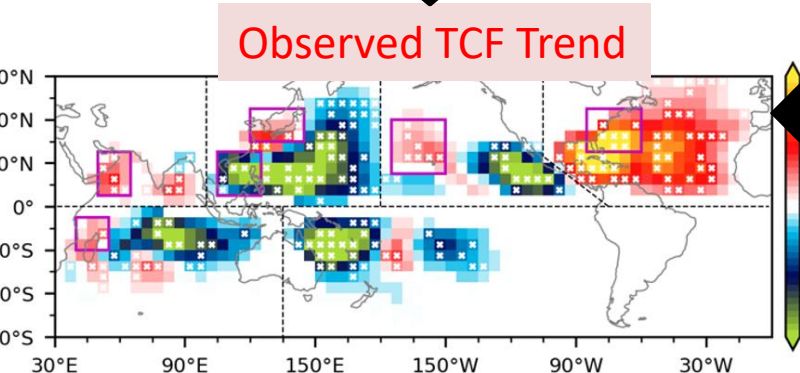
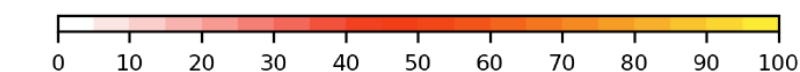
Ongoing Research (Part I)



Goal: To identify the regions where anthropogenic climate changes may play a dominant role in the past 40-yr observed TCF trends relative to the internal variability.



Black dots indicate TCF changes that are highly correlated with the global warming mode than the internal mode based on a “grid-base SVD analysis”.



We focus on the 6 coastal regions where global warming mode is dominant for the TCF trend.

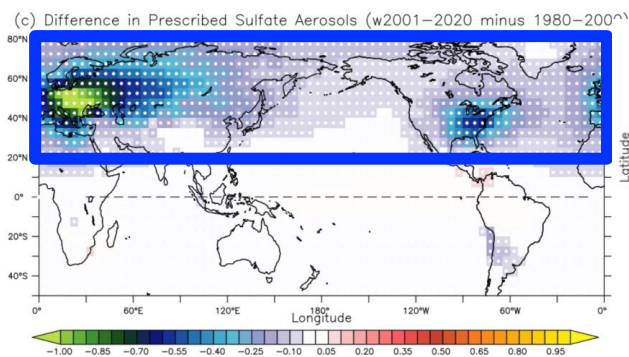
The trends of ensemble mean by the large-ensemble experiments that consider the single or multiple external forcing.

Shuai Wang and Hiro Murakami (in preparation)

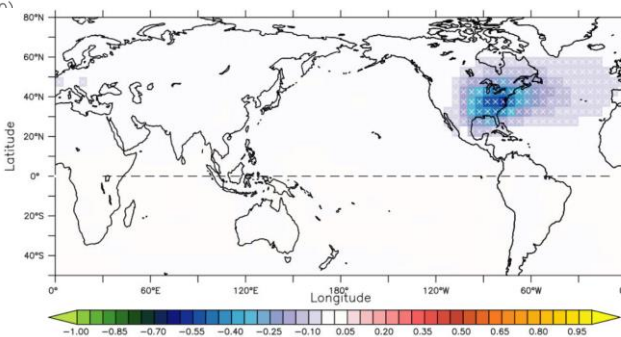
Ongoing Research (Part II)

Goal: To identify which of the aerosols decreases in Europe or the U.S. played important role in the global TCF.

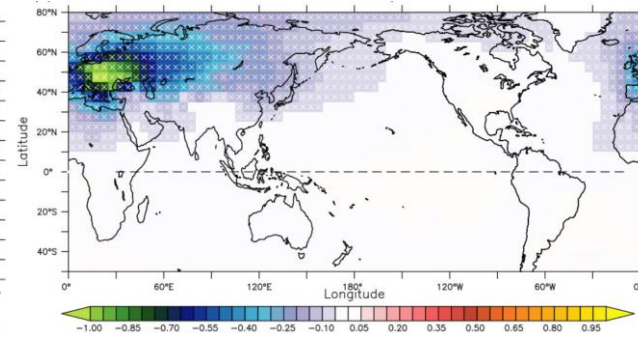
$\Delta W21$, Sulfate



$\Delta US21$, Sulfate

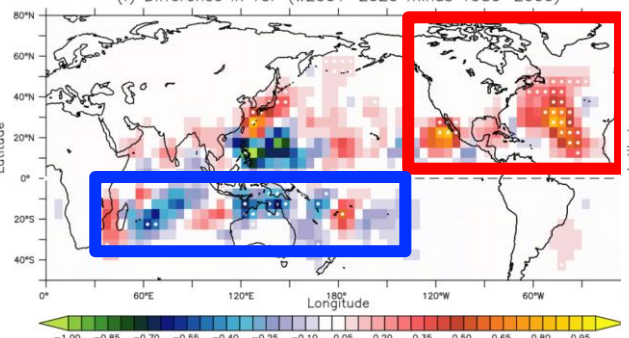


$\Delta EURO21$, Sulfate

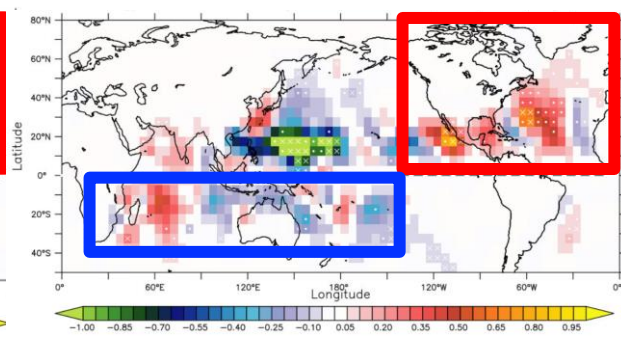


$\Delta W21$, TCF

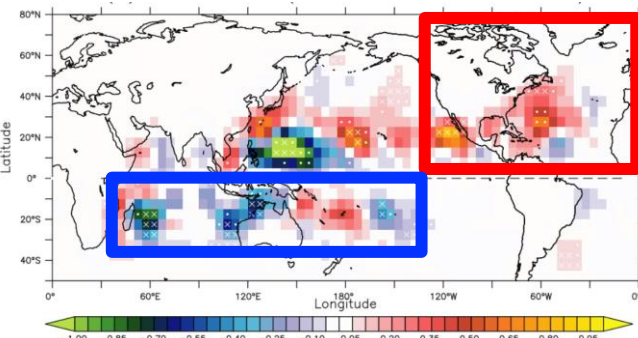
(f) Difference in TCF (w2001–2020 minus 1980–2000)



$\Delta US21$, TCF



$\Delta EURO21$, TCF

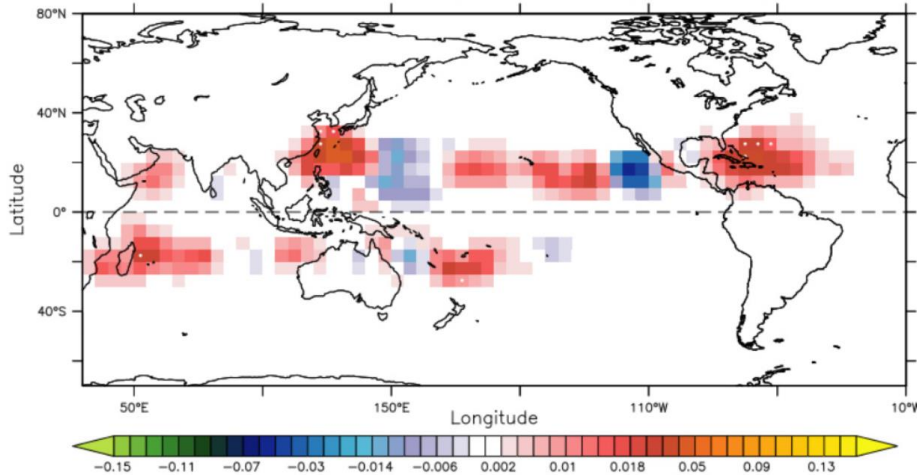


Decreased Aerosols in both US & Europe => **Increased TCs in the North Atlantic**

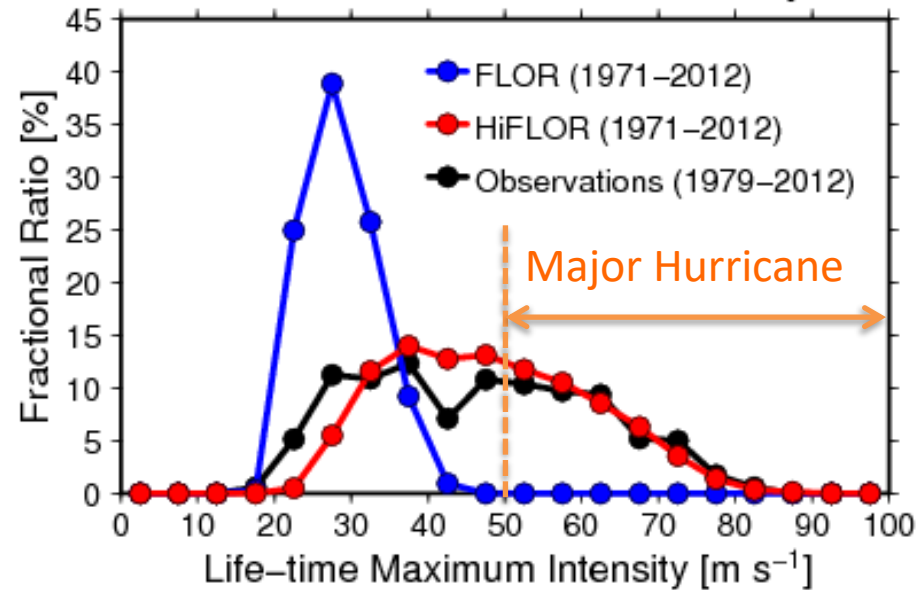
Decreased Aerosols in Europe => **Decreased TCs in the Southern Hemisphere**

Goal: To identify the cause for the observed trends in major hurricane density

Observed Trend in Major Hurricanes (1980-2018)



PDF of Life-time Max Intensity



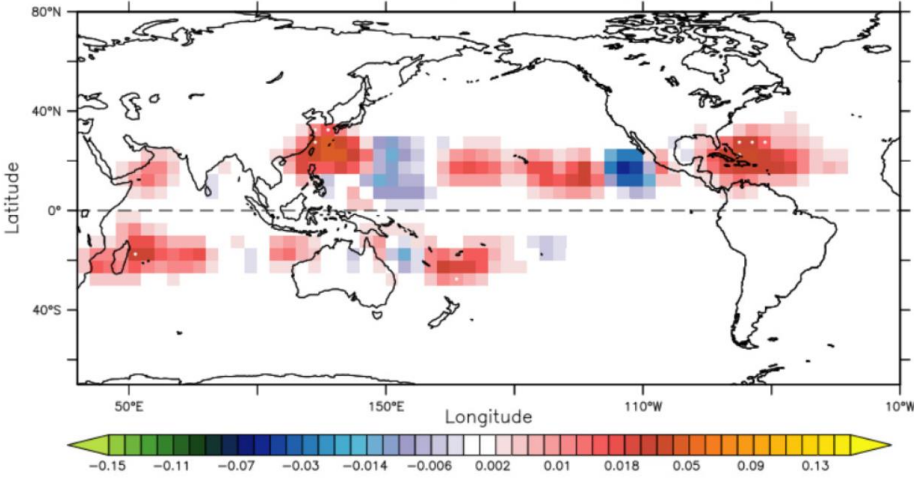
	FLOR	HiFLOR
Base Model	AM2.5 (Atmosphere model of CM2.5), MOM4 (Ocean model of CM2.1)	
Resolution	Atmosphere: 50 km , L32 Ocean: 100 km, L50	Atmosphere: 25 km , L32 Ocean: 100 km, L50

We also plan to use SPEAR-Hi (25-km-mesh SPEAR) in the future.

Linear Trend in Major Hurricanes

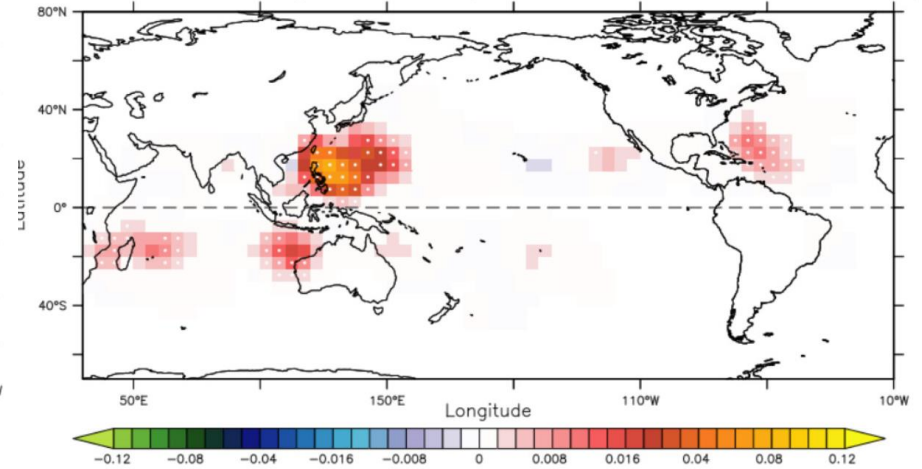


Observed Trend in Major Hurricanes (1980-2018)

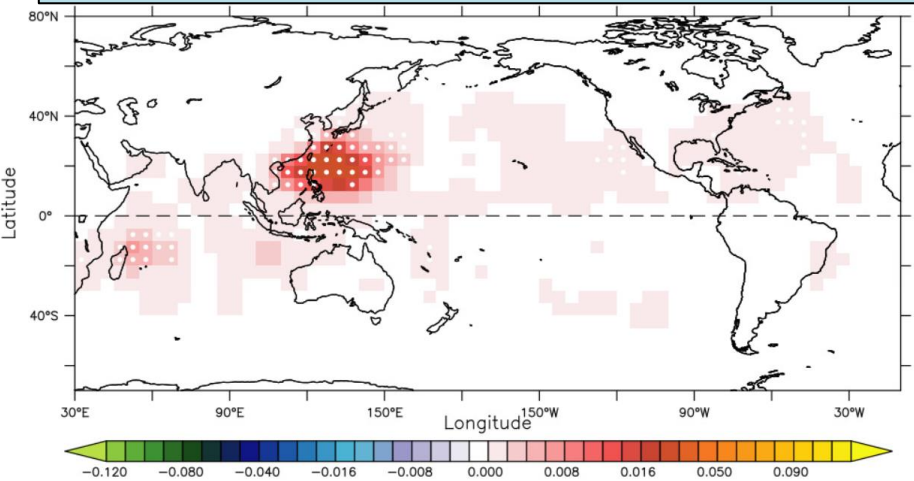


AllForc (15-member mean, HiFLOR, 1980-2018)

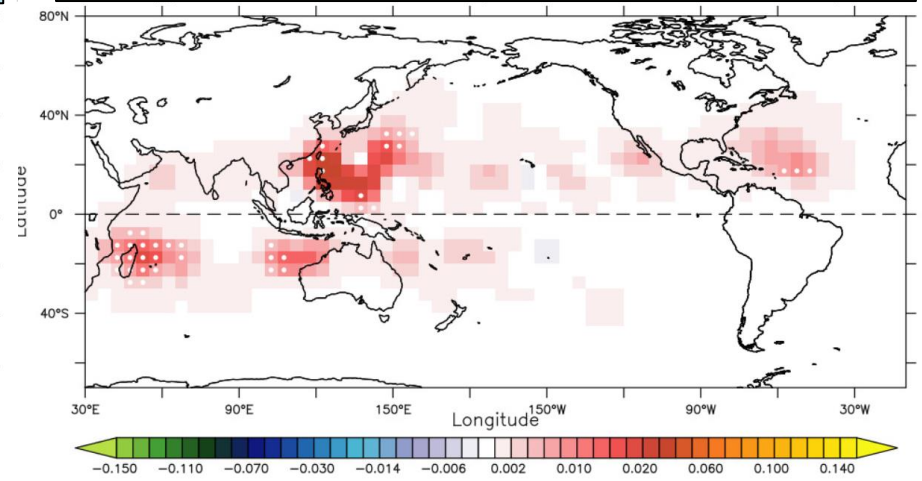
Simulated Trend in Major Hurricanes (AllForc, 15-member mean, 1980-2018)



NatForc (15-member mean, HiFLOR, 1980-2018)



Transient 2xCO₂ (one member, HiFLOR, 70 yrs)



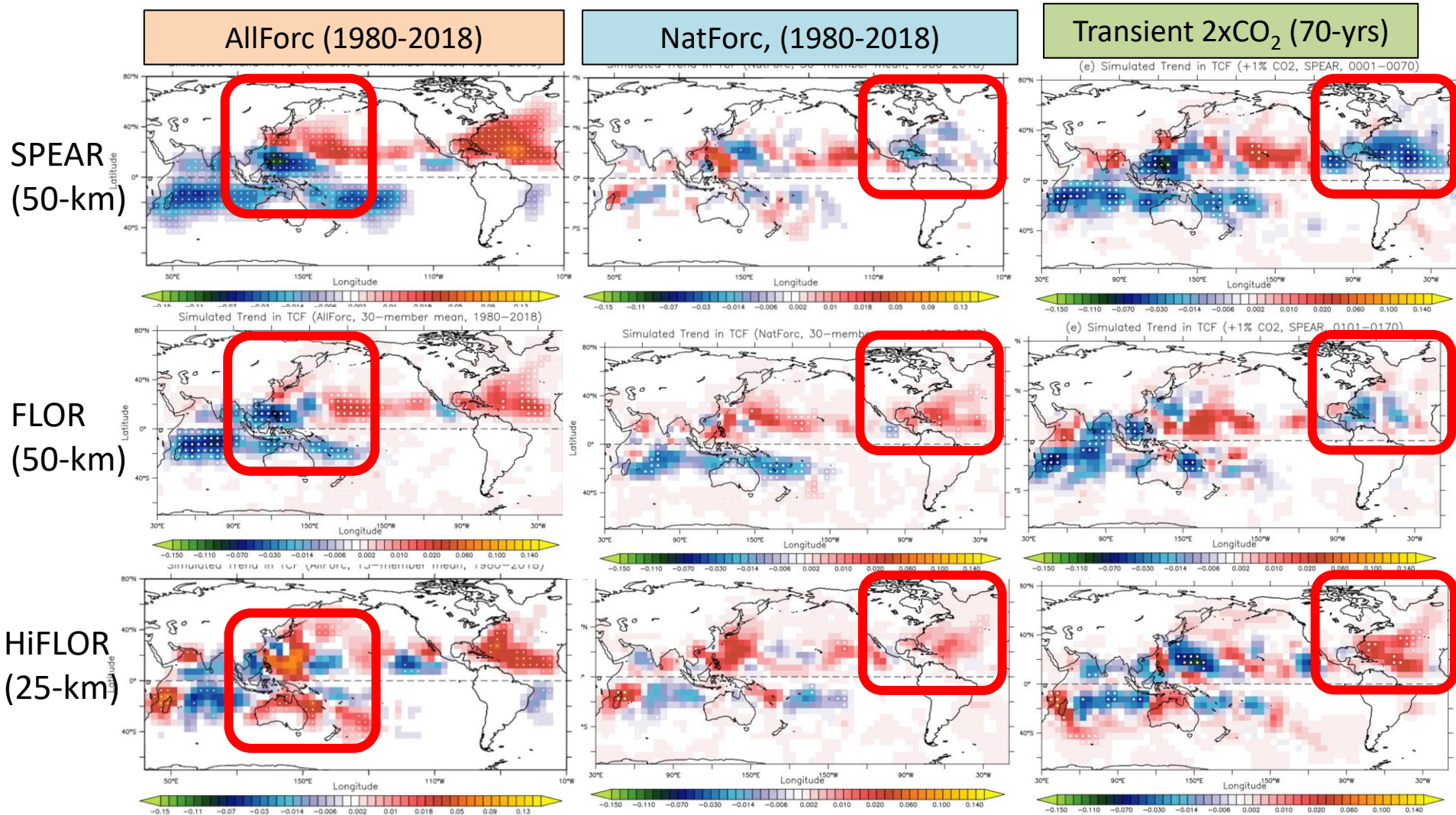
Effect of volcanic events on major hurricanes?

End

Difference between SPEAR(50km) and HiFLOR(25-km)



Linear Trend in TCF



Consistent except for West Pacific

Different in the North Atlantic