

# **ENSO - Monsoon Teleconnections: Reforecasting the 1972-73 ENSO and Asian Summer Monsoon**

**Jagadish Shukla**

Department of Atmospheric, Oceanic and Earth Sciences (AOES),

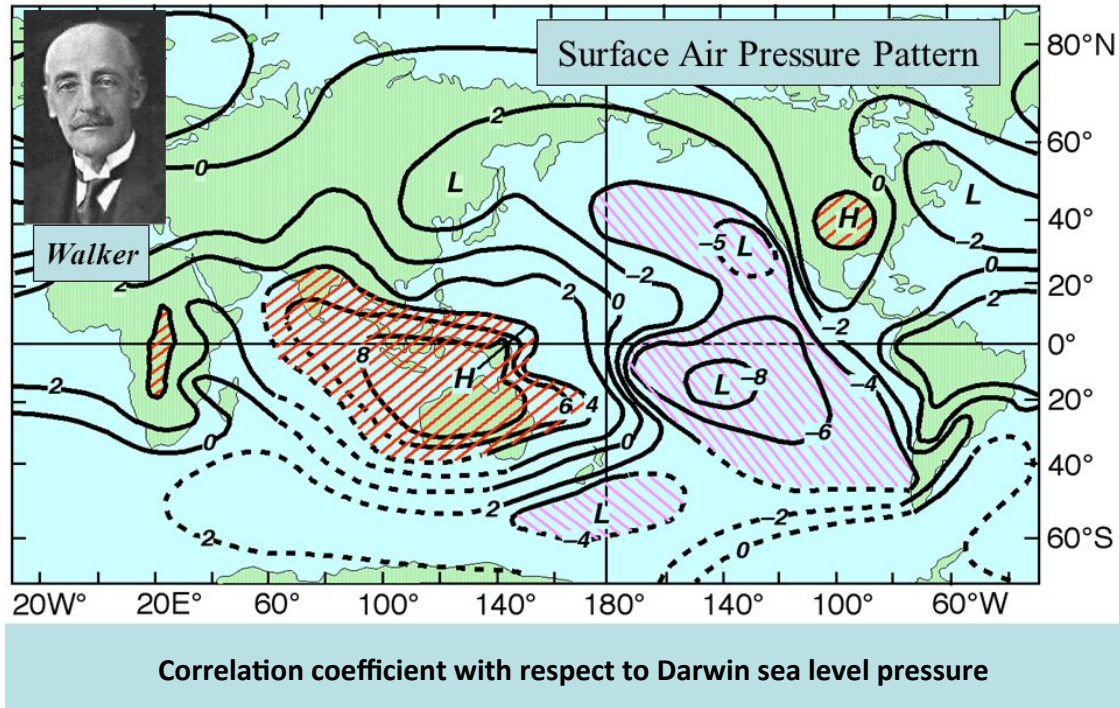
*George Mason University (GMU)*

Center for Ocean-Land-Atmosphere Studies (COLA)

**ICTP, October 27, 2016**

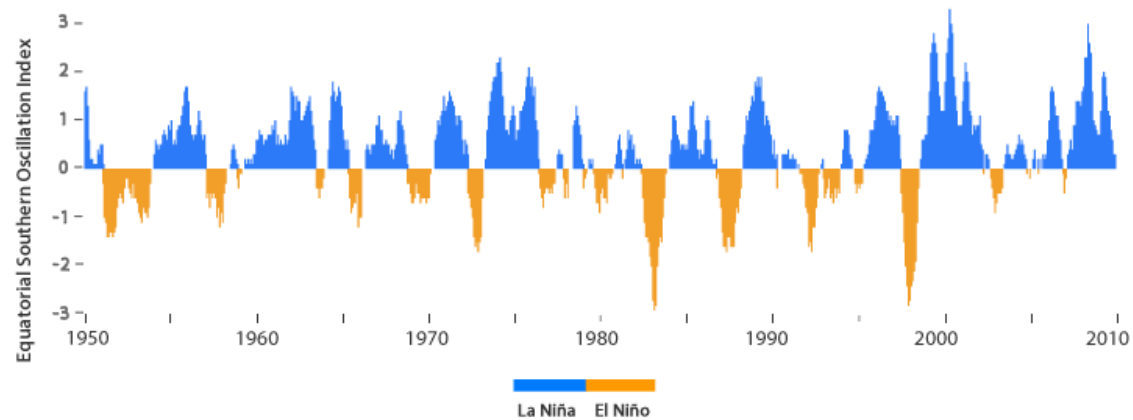


# The Southern Oscillation



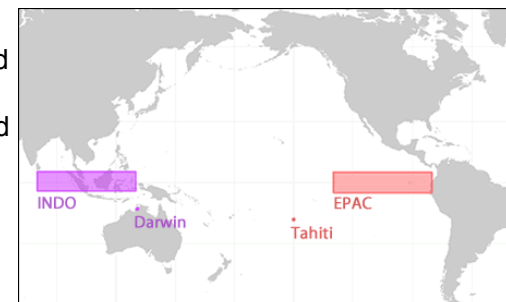


## Equatorial Southern Oscillation Index (SOI)

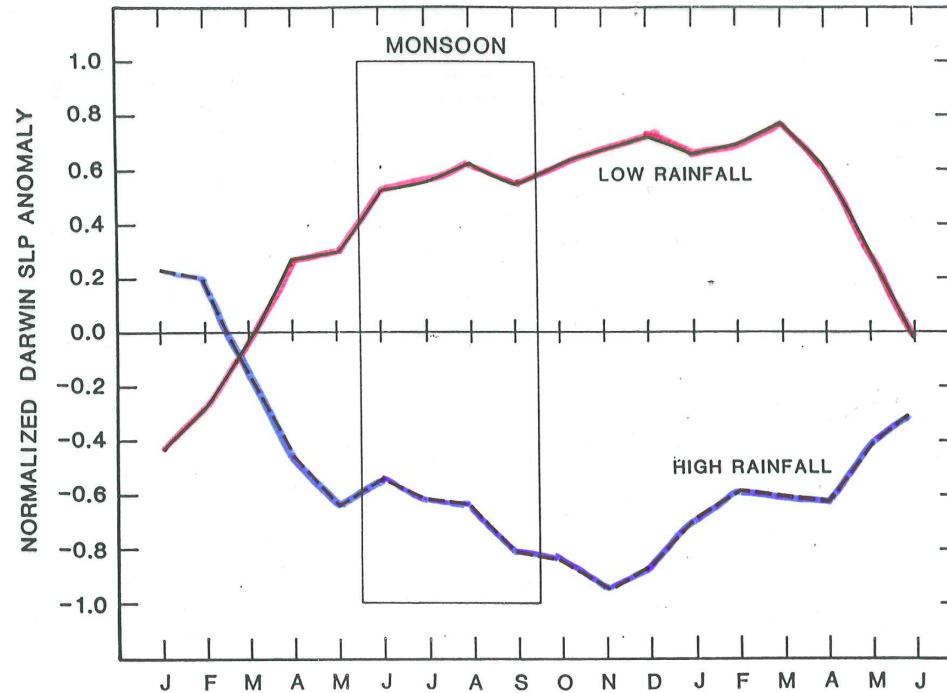


Similarly, the Equatorial Southern Oscillation Index or EQSOI represents the difference in air pressure measured over the eastern and western Pacific. The EQSOI is calculated as the difference in standardized mean sea level pressure over a swath of the eastern equatorial Pacific Ocean (5°N-5°S, 80°W-130°W) and another swath that spans Indonesia (5°N-5°S, 90°E-140°E).

$$\text{SOI} = \text{EPAC} \text{ minus } \text{INDO}$$

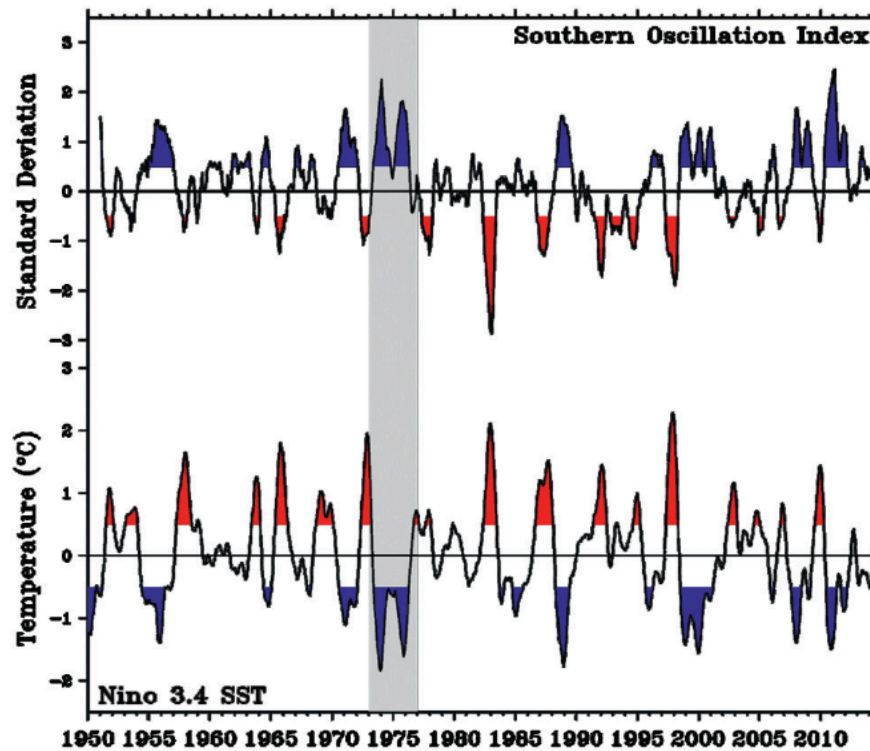


**ENSO has large amplitude after the monsoon season:  
to predict monsoon, we must predict ENSO first**



# SOI and Nino 3.4 SST

ENSO occur on irregular basis, ~ 4-7 years



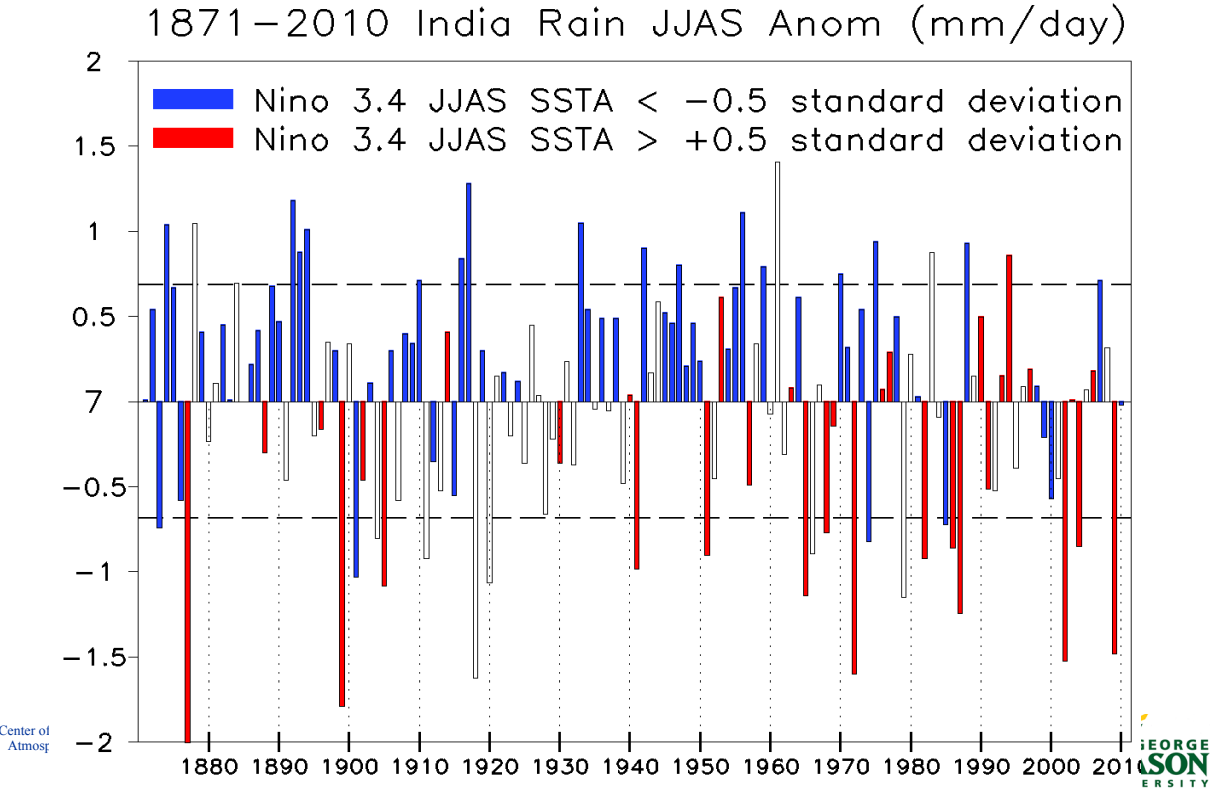
SOI:

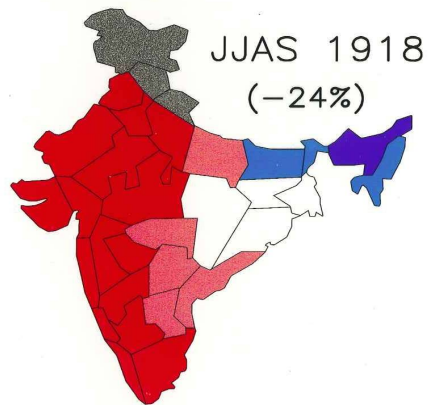
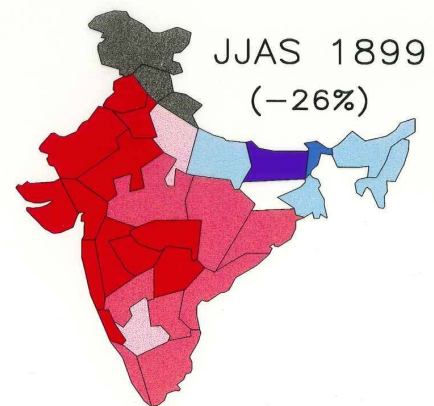
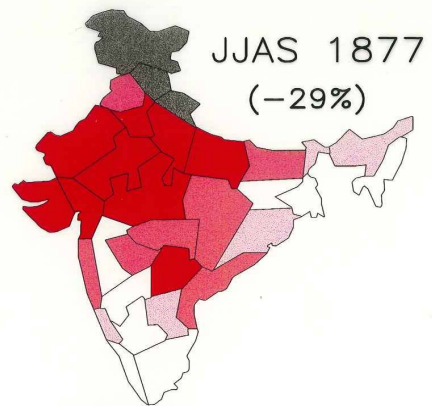
Tahiti – Darwin  
SLP

Nino 3.4

5N – 5S; 120 – 170 W

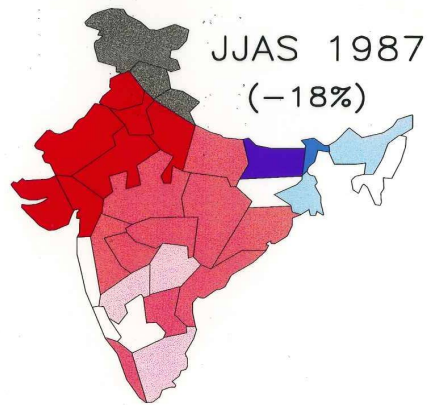
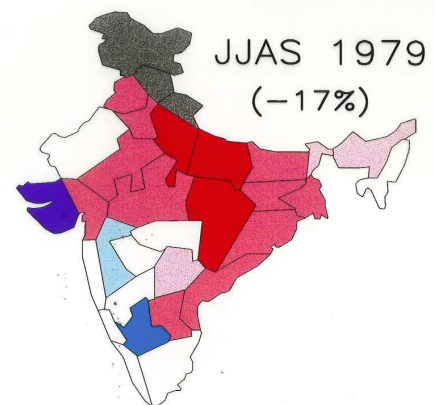
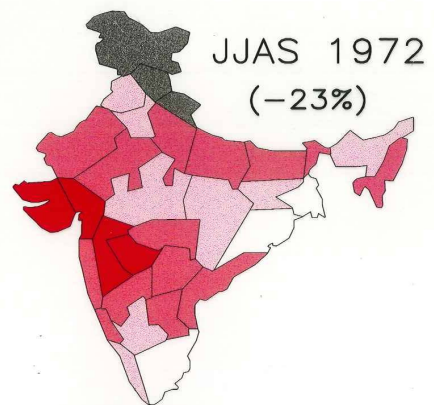
# Interannual Variability of Indian Summer Monsoon Rainfall





Rainfall Percentage Departure from 1871-1990 mean

- Rain > 40%
- 20% to 40%
- 10% to 20%
- 10% to -20%
- 20% to -40%
- Rain < -40%



Rainfall Percentage Departure  
from 1871-1990 mean

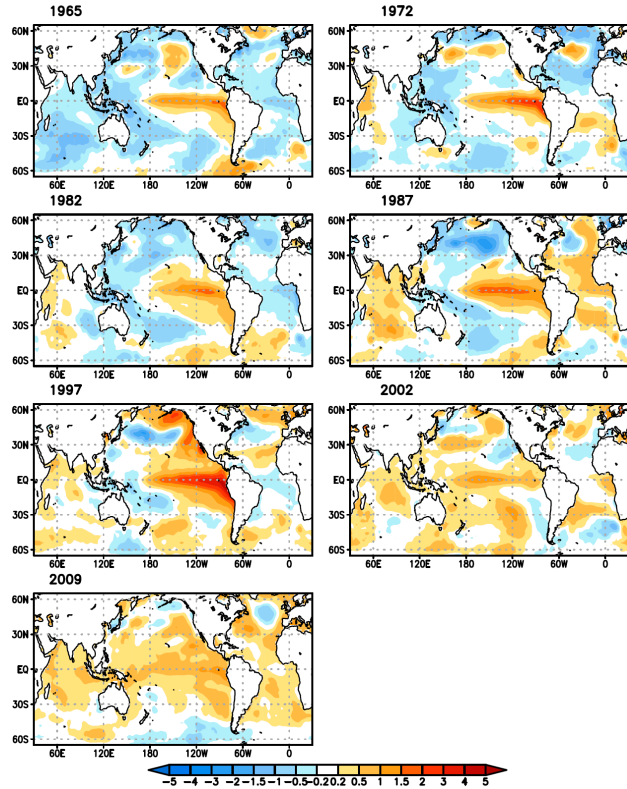
- Rain > 40%
- 20% to 40%
- 10% to 20%
- 10% to -20%
- 20% to -40%
- Rain < -40%



# JJAS Mean Anomalies (Warm El Nino Events)

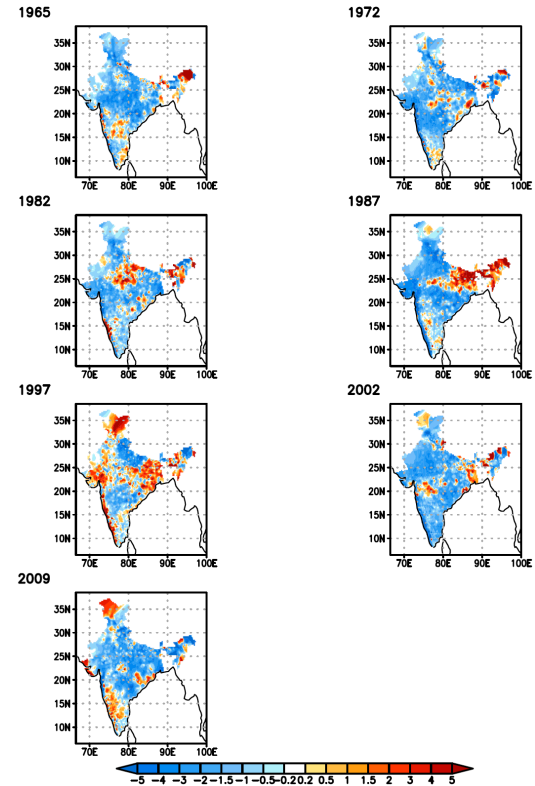
SST [°C]

Observed JJAS mean SST anomalies (warm ENSO events)



Precipitation [mm/day]

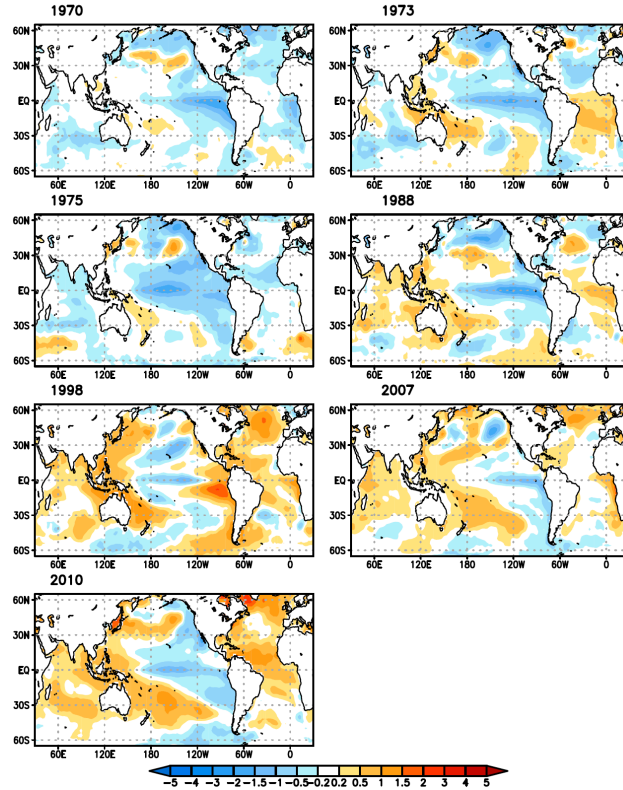
JJAS mean rainfall anomalies over India (warm ENSO events)



# JJAS Mean Anomalies (Cold La Nina Events)

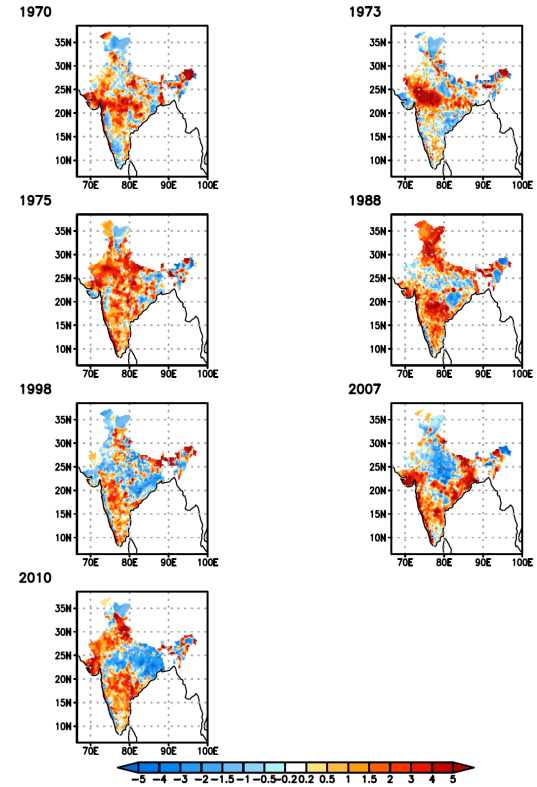
## SST [°C]

Observed JJAS mean SST anomalies (cold ENSO events)



## Precipitation [mm/day]

JJAS mean rainfall anomalies over India (cold ENSO events)



## JJAS All India Rainfall

### Strong Monsoon Years ( $> 1$ SDEV)

1916  
1917  
1933  
1942  
1947  
1956  
1959  
1961  
1970  
1975

### Weak Monsoon Years ( $< 1$ SDEV)

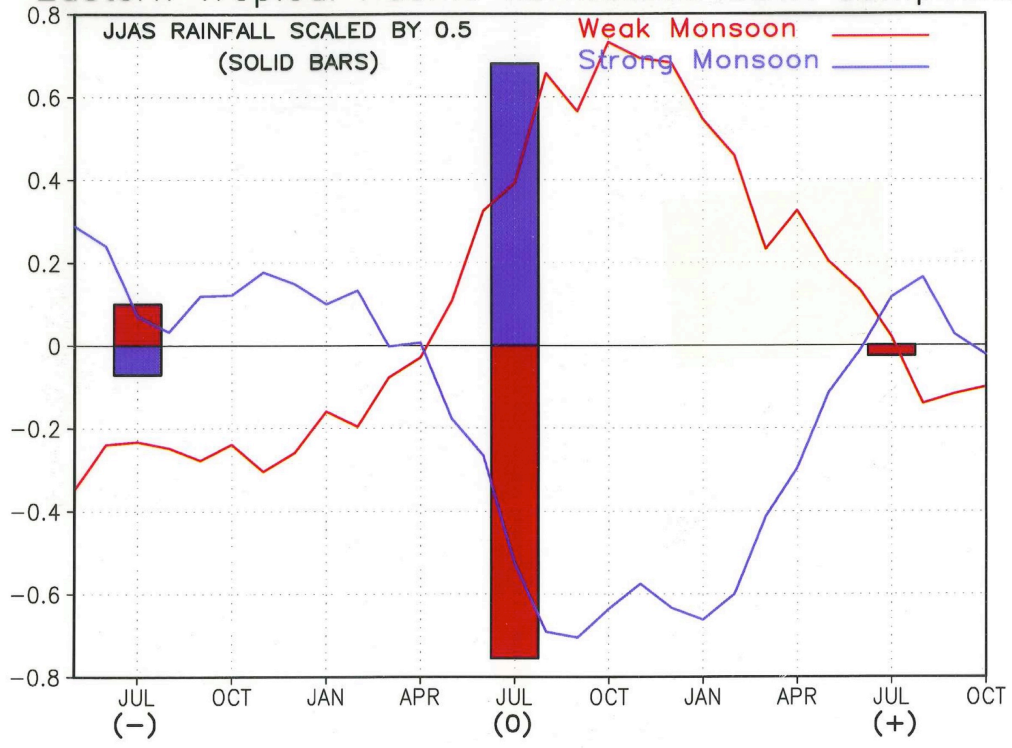
1904  
1905  
1911  
1918  
1920  
1928  
1941  
1951  
1965  
1966  
1968  
1972  
1974

### SST Composites:

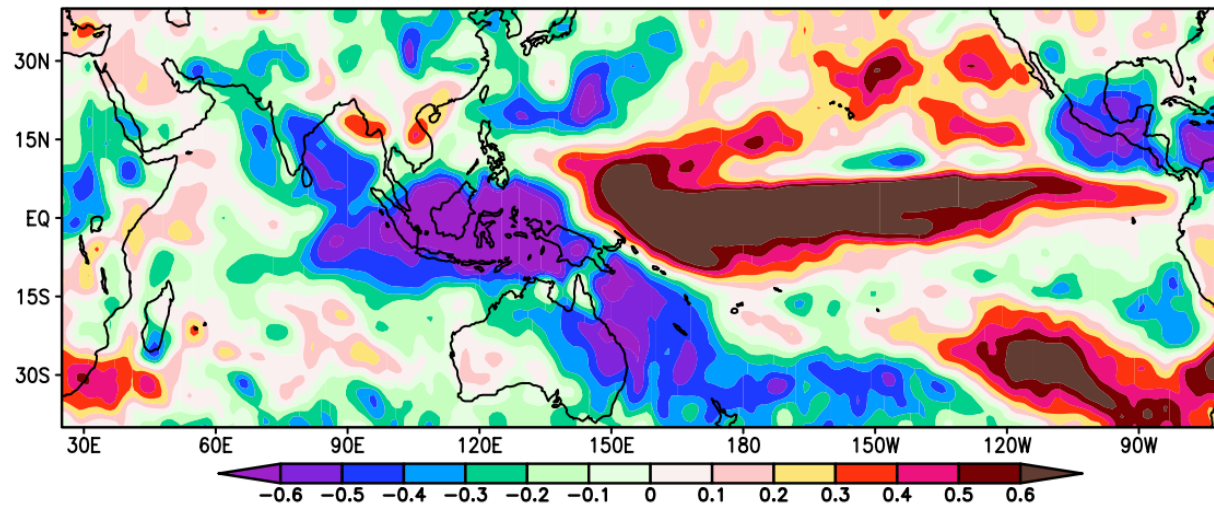
Eastern Tropical Pacific:  $160^{\circ}\text{E} - 80^{\circ}\text{W}$ ,  $10^{\circ}\text{S} - 10^{\circ}\text{N}$

North Indian Ocean:  $40 - 100^{\circ}\text{E}$ , equator - coast

### Eastern Tropical Pacific normalized SSTA composite



## Correlation Coefficient between Nino 3.4 SSTA and Observed Precip for JJAS (1981-2010)



*Ravi P. Shukla & Huang (2015)*

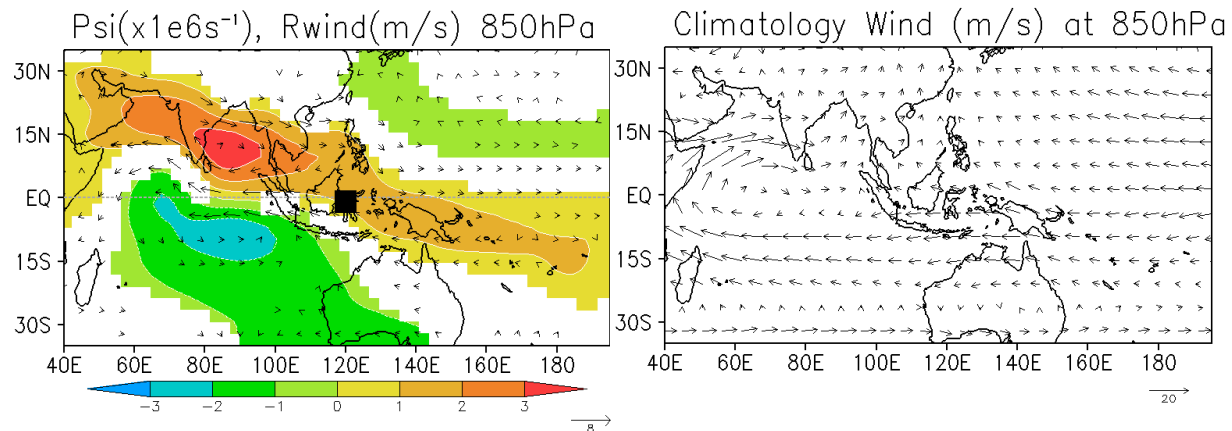
# Mechanisms Proposed to Explain ENSO-Monsoon Teleconnection

1. Gill response to forced heating ( $\delta SST - \delta Q$ ) in the presence of mean wind, and mean wind shear  
(*Wang et al, 2003; Li and Wang, 2013; Jang and Straus 2013*)
2. Modulation of Walker circulation and local Hadley circulation by ENSO forced ( $\delta SST - \delta Q \rightarrow \delta V$ ) circulation anomalies  
(*Slingo and Annamalai, 2000; and Pillai and Annamalai, 2012*)
3. ENSO-Monsoon interaction through tropospheric biennial oscillation  
(*Meehl, 1997; Arblaster and Meehl, 2002*)



## Cooling Exp: GCM effect

➤ WP Cooling ~ Weakens the monsoon flow

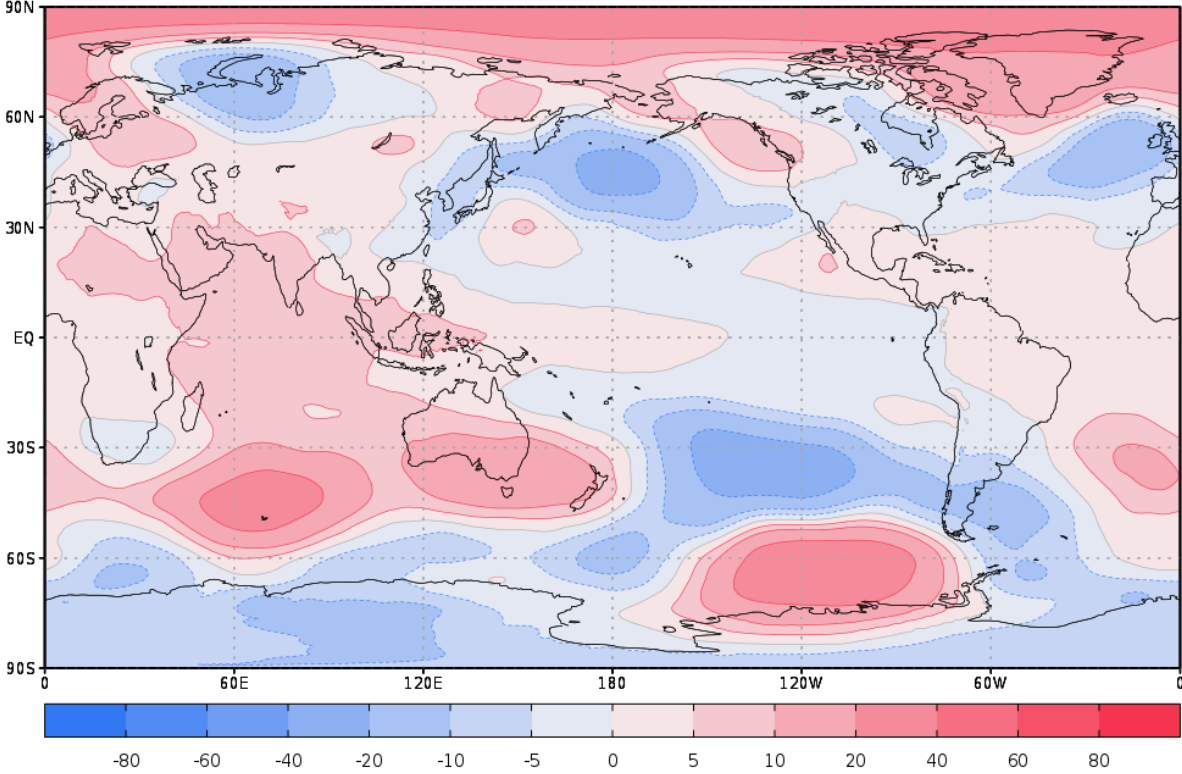


**Experiments from Jang and Straus with added cooling at 120°E.**

Jang, Y. and D. M. Straus, 2013: Tropical Stationary Wave Response to ENSO: Diabatic Heating Influences on the Indian Summer Monsoon. *J. Atmos. Sci.*, 30, 193-222.

# JJA 700mb Height Anomaly for Warm Events

1982 1987 1997 2002 2009 2015



GrADS/COLA

## 57-Year (1958-2014) Reforecasts

- The first time a seasonal reforecast of this length is conducted using CFSv2
- Extends the seasonal reforecasts to ENSO events in 1960s-70s
- Examines predictability at different phases of climate change and multidecadal variability (60s-70s, 80s-90s, 2000-)

B. Huang, C.-S. Shin, J. Shukla, L. Marx, M. A. Balmaseda, S. Halder, P. A. Dirmeyer, J. L. Kinter III, 2016: Reforecasting the ENSO Events in the Past Fifty-Seven Years (1958-2014). *J. Climate*, submitted



## 57 years (1958-2014) CFSv2 Reforecast Experiment

Initial Conditions (ICs)

1958-1978

1979-2014

<b>Atmosphere</b>	ERA-40	<b>CFSR</b>	<b>4 members</b> (The first 4 days of each month)
<b>Land</b>	NASA GLDAS2		
<b>Sea Ice</b>	<b>CFSR</b> (January 1, 1979, April 1, 1979, July 1, 1979, October 1, 1980 )		
<b>Ocean</b>	<b>ORA-S4</b>		<b>5 members*</b>

\* Perturbed through ocean data assimilation.

***20 total ensemble members***

**Reforecast Duration:** 12 months (total model years: **4560**)

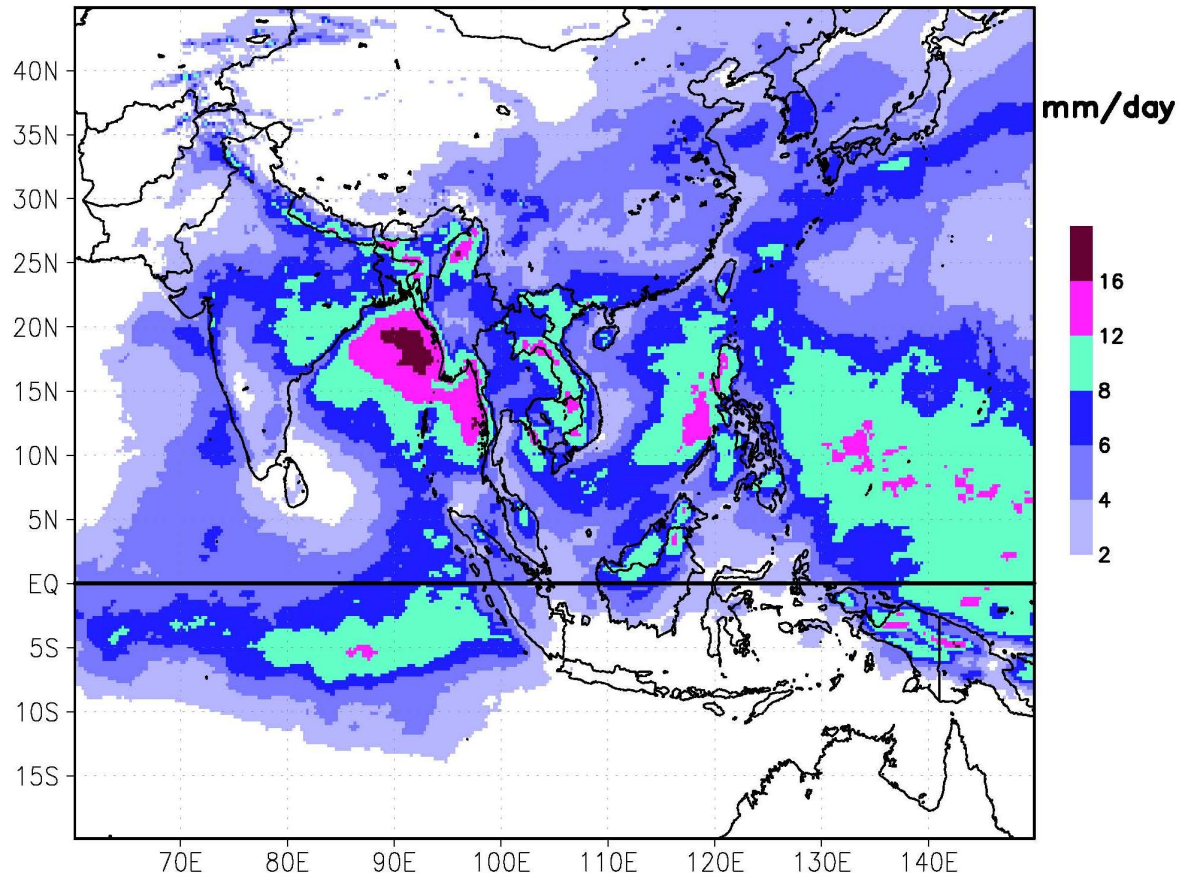
**Output:**

Monthly mean (12 months)

Daily (90 days, selected atmosphere and ocean fields)

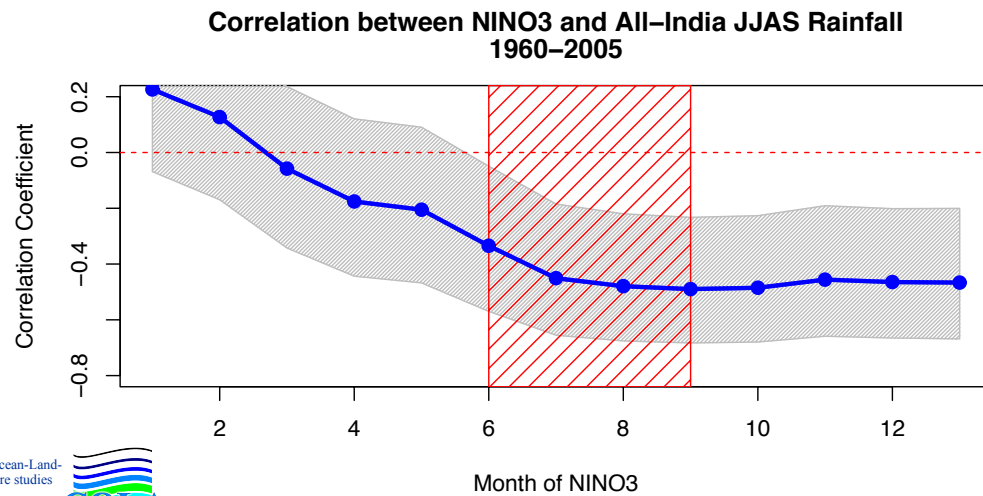


CMORPH OBS Precip Climo JJAS (2003–2006)



# In Spite of Large Biases in Simulated SST, Predictions of SST Anomalies Have Some Skill

**In Some Cases**  
Small Skill in Predicted SST is Enough to Give Statistically  
Significant Skill in Predicted Monsoon Rainfall



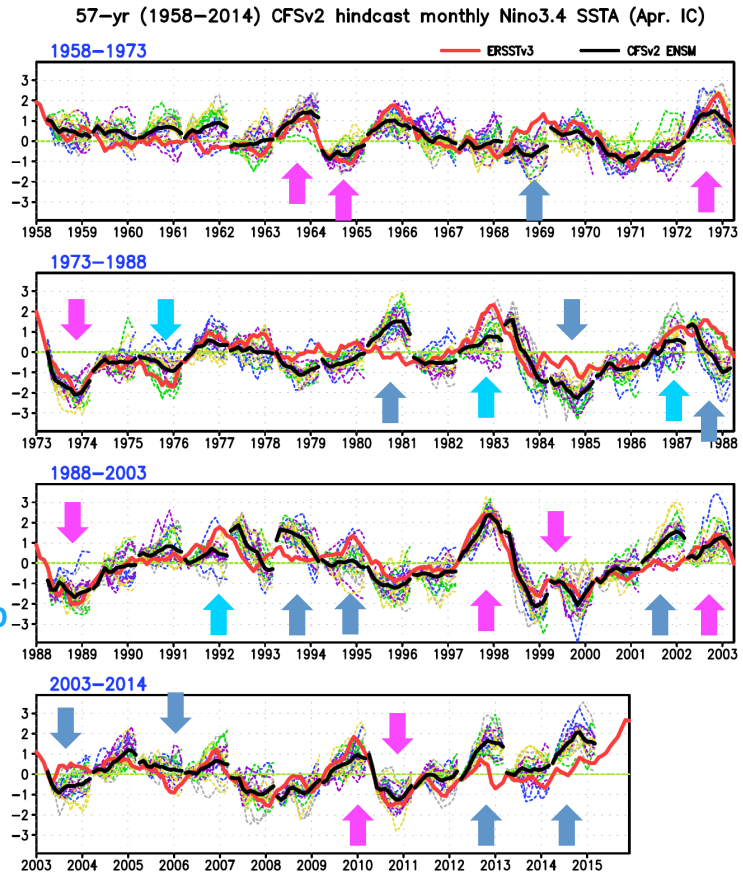


# April IC

predicted events

More missed events and false alarms in 1979-2014

Underestimate ENSO growth



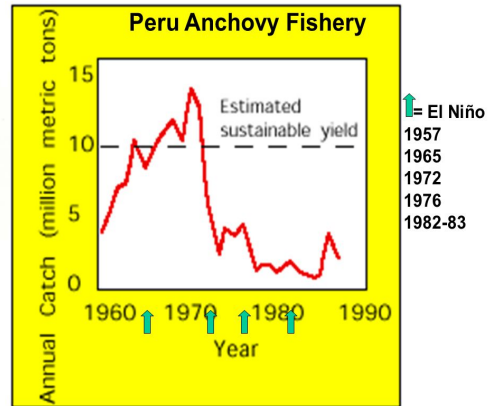
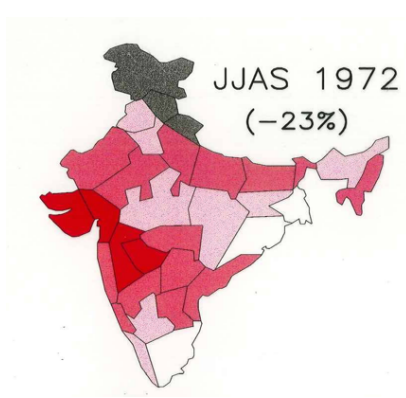
ERSSTv3

CFSv2 ENSM

# Reforecasting 1972-73 ENSO and Monsoon

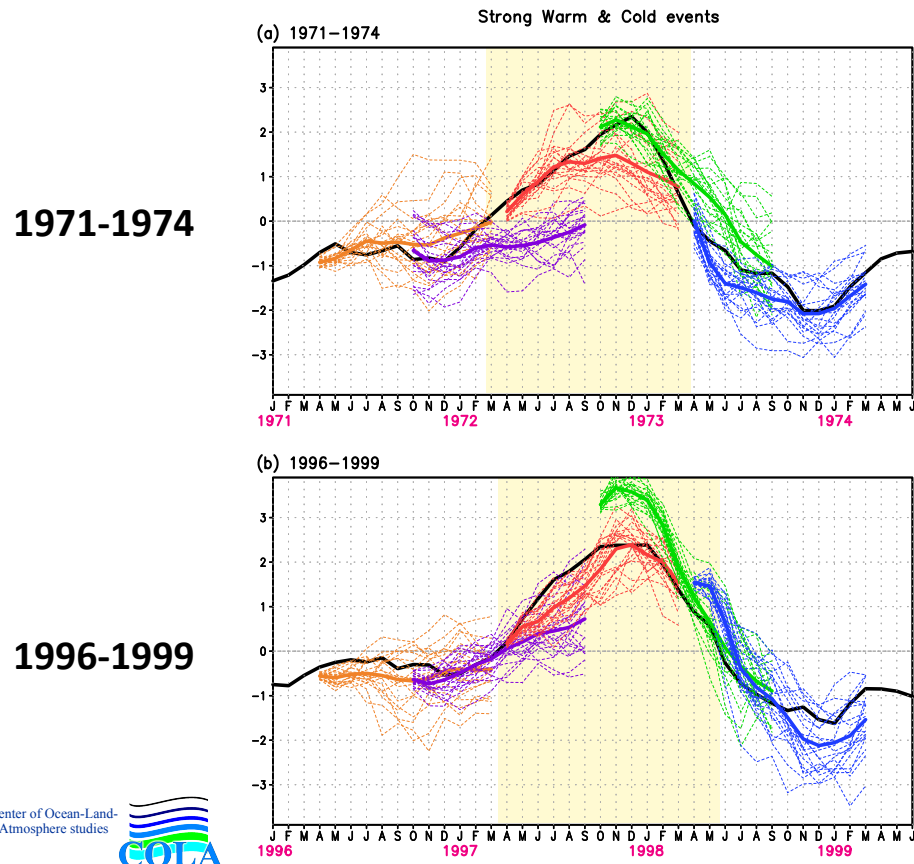


# 1972-73 El Niño Devastates Peruvian Fisheries; Causes Severe Drought Over India



Guano Mountain (1860) in Peru  
- 60 ft tall

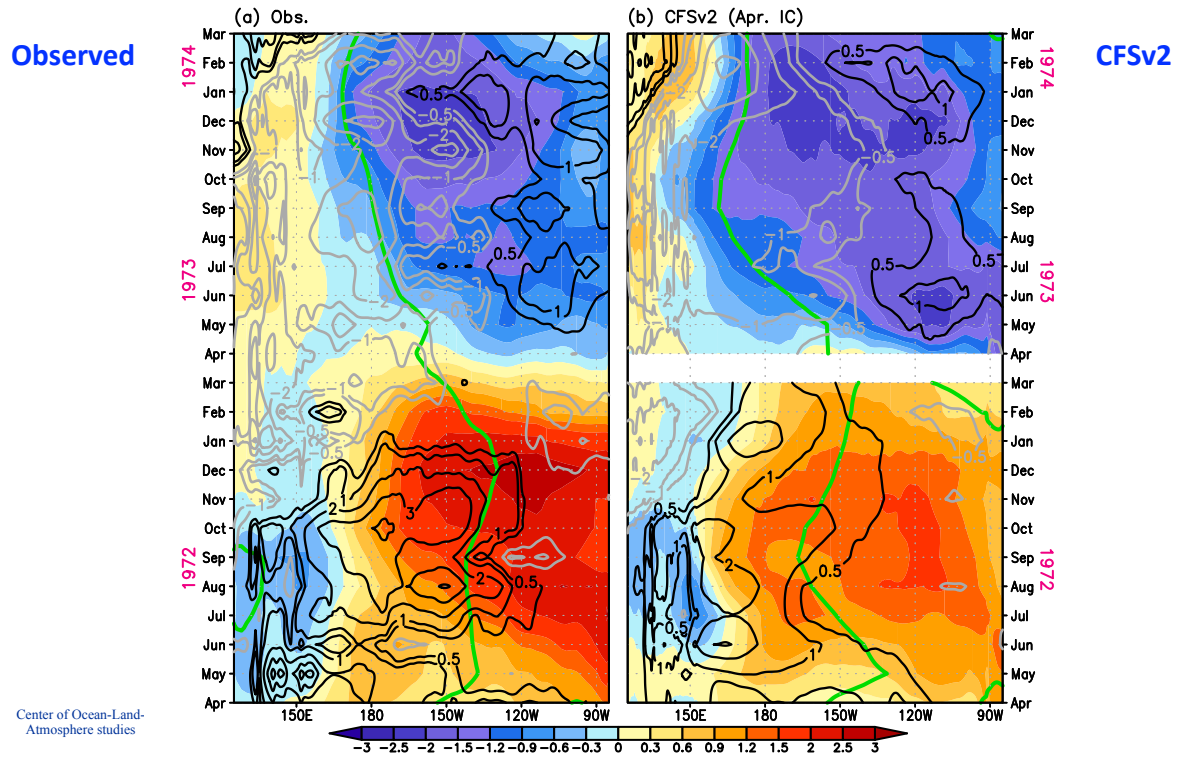
## Observed and Forecast SST Anomalies for April and October IC (CFSv2)



# Observed and Predicted SST Anomalies for 1972-74

April IC

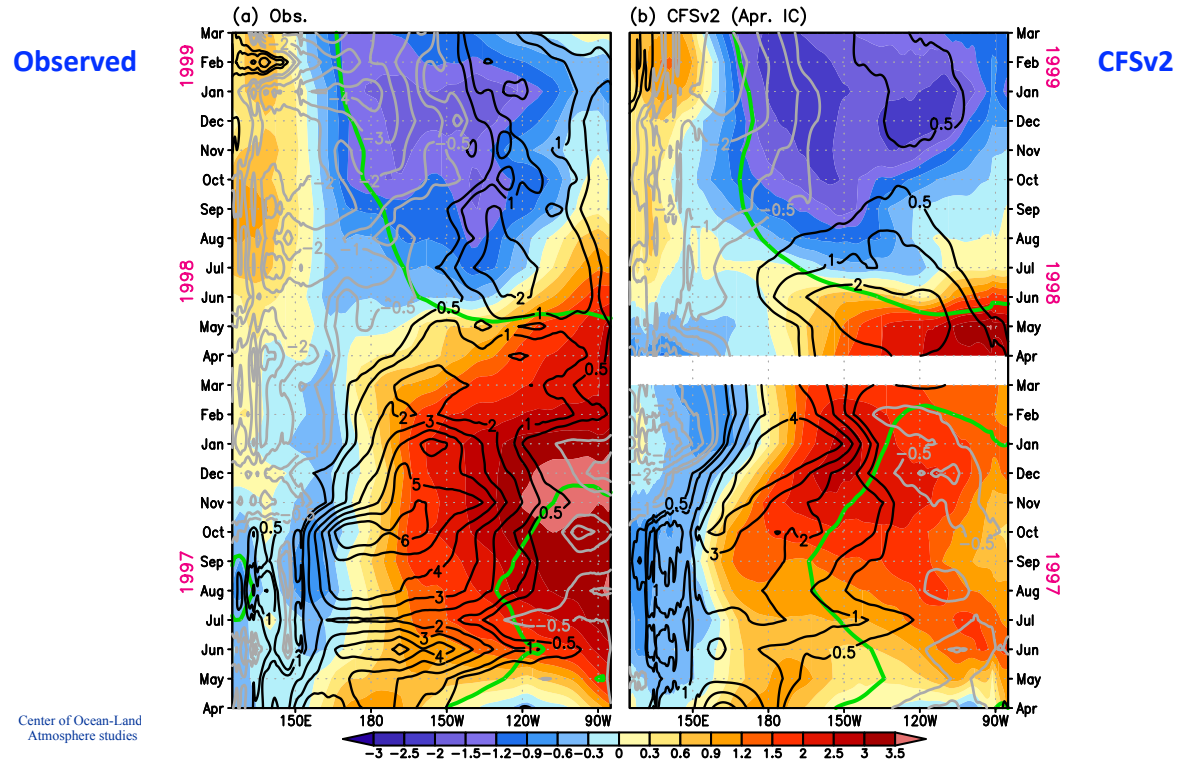
Anomalies of equatorial SST and zonal wind stress (1972-73)



# Observed and Predicted SST Anomalies for 1997-99

April IC

Anomalies of equatorial SST and zonal wind stress (1997-98)





# NDJ SST Anomalies

Observed

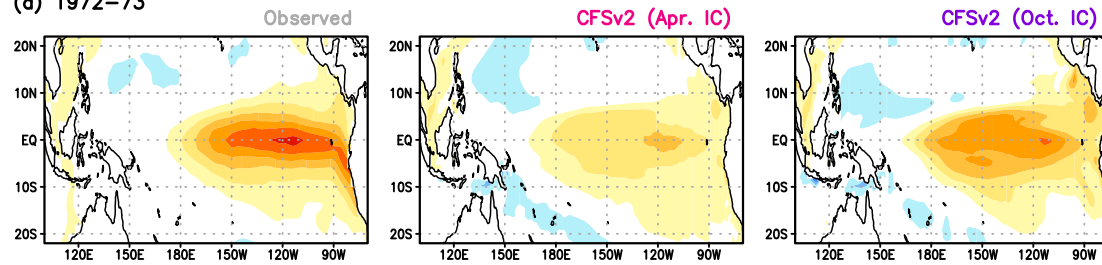
Forecast (Apr. IC)

Forecast (Oct. IC)

November–January mean of SST Anomalies

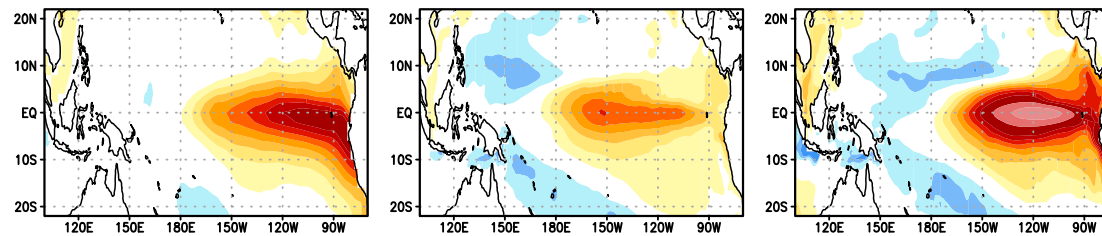
1972-73

(a) 1972-73



(b) 1997-98

1997-98



c

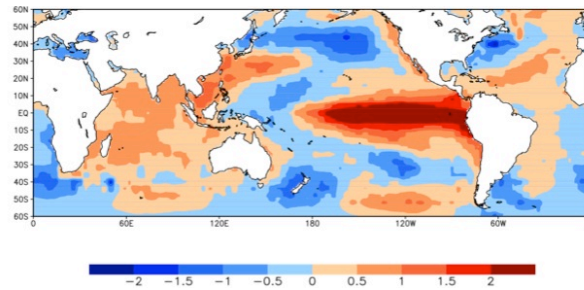
GE  
N  
TY

# ENSO - Monsoon Teleconnections

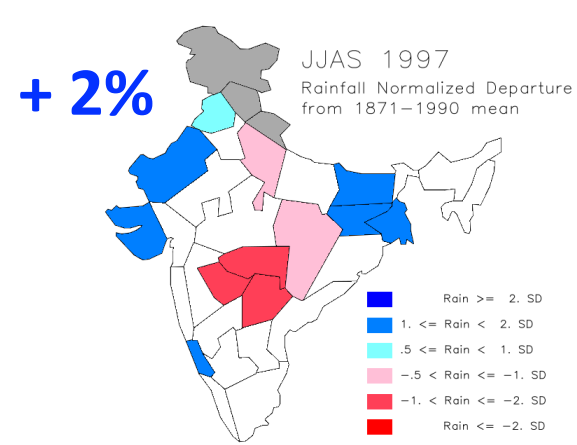
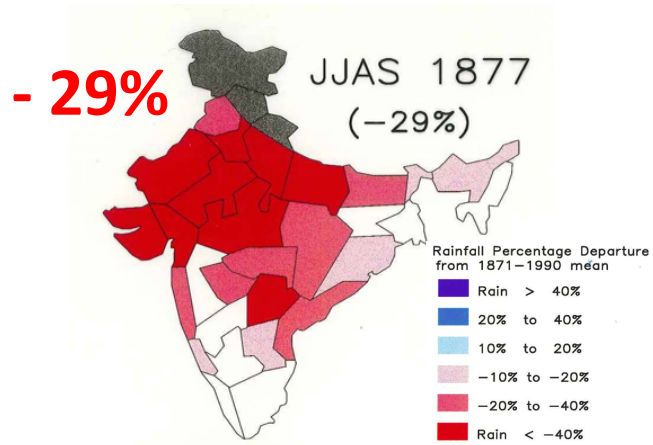
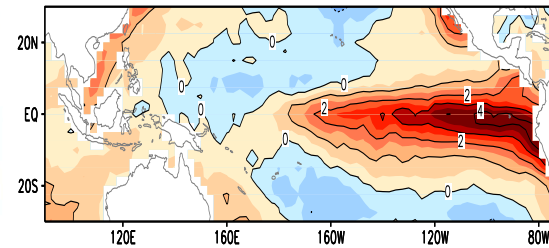
Sometimes they work marvelously,  
and sometimes they fail miserably.

# ENSO & ISMR for JJAS 1877 and 1997

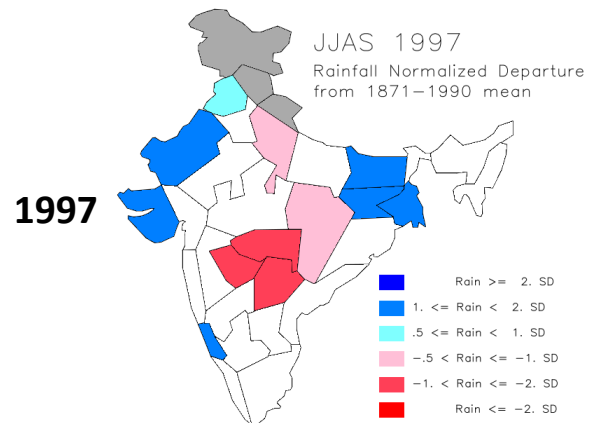
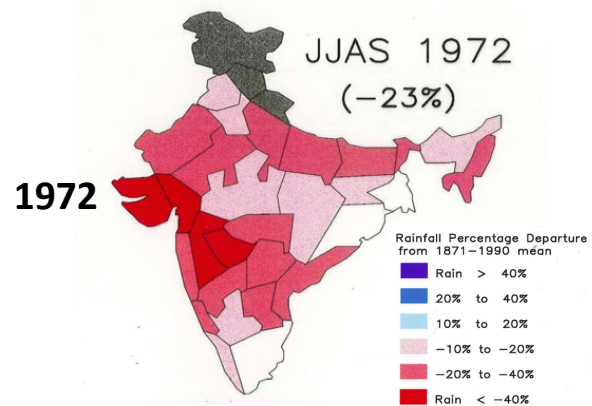
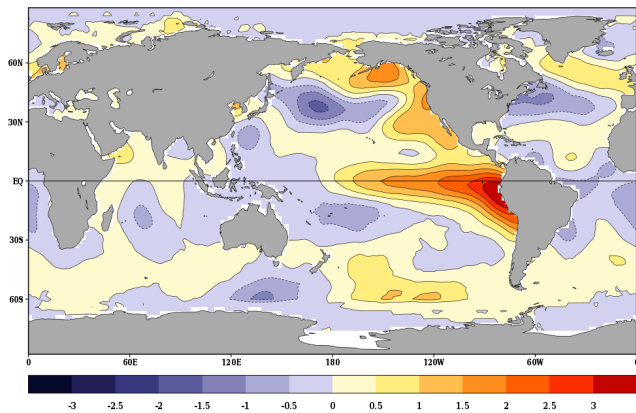
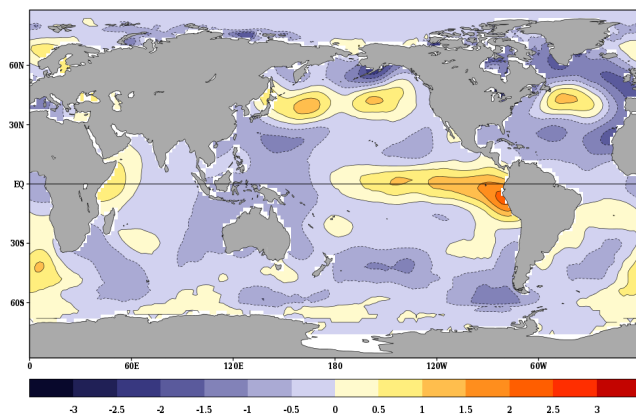
1877



1997

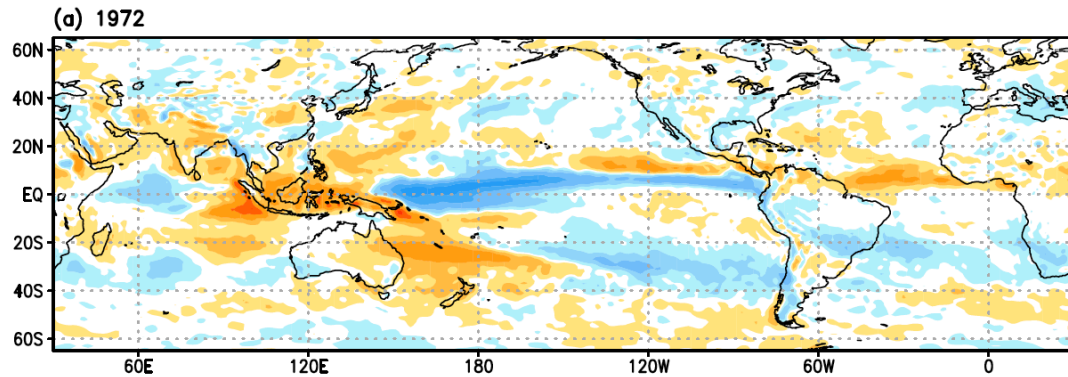


## JJA Mean SST and Precip. Anomaly for 1972 and 1997

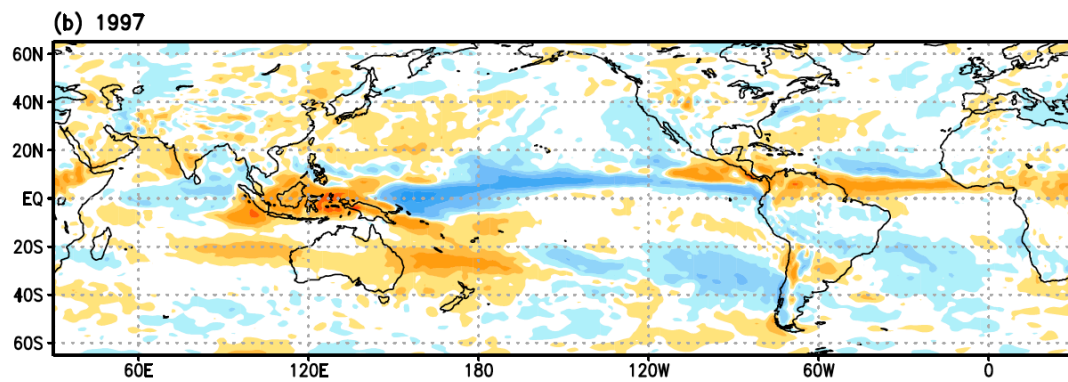


## JJA Mean Vertical Velocity ( $\omega$ ) for 1972 and 1997

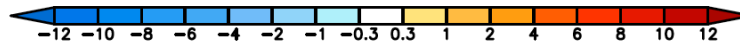
Anomalies of JJA mean Vert. Velocity [ $0.01\text{Pa/s}$ ] (CFSv2, April IC)



1972



1997



# Forecast (April 72, IC) and Observed (IMD) Rainfall Anomalies for JJAS 1972 (mm/day)

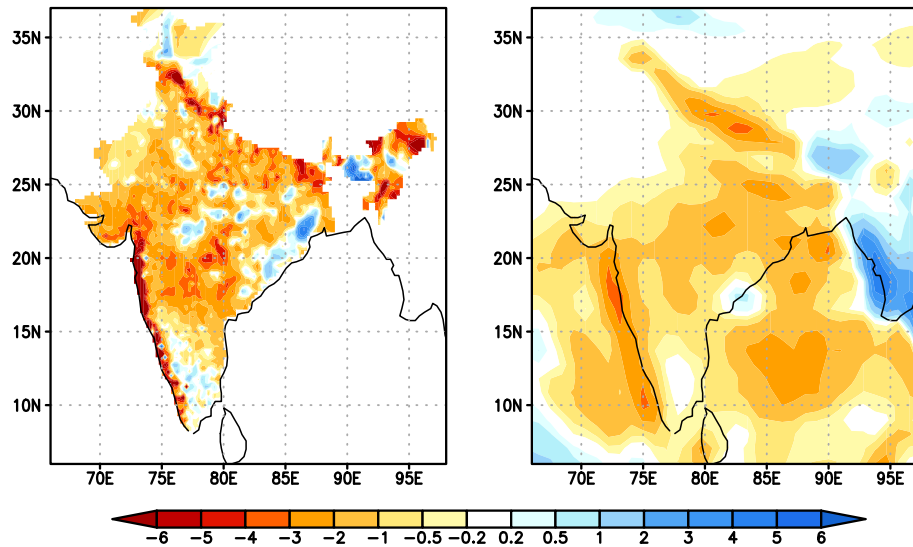
## Observed IMD

## Model CFSv2

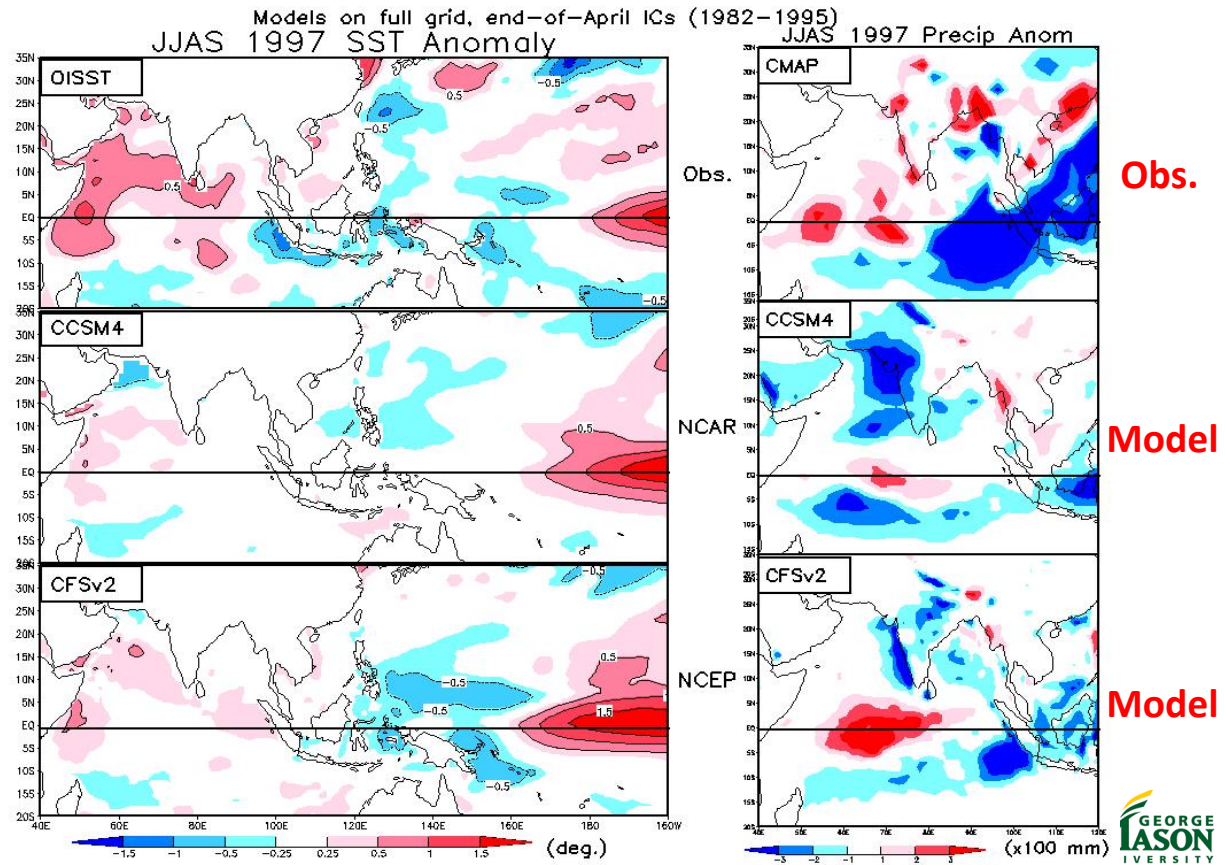
Anomalies of the Indian monsoon rainfall in 1972 [mm/day]

(a) Observation (IMD)

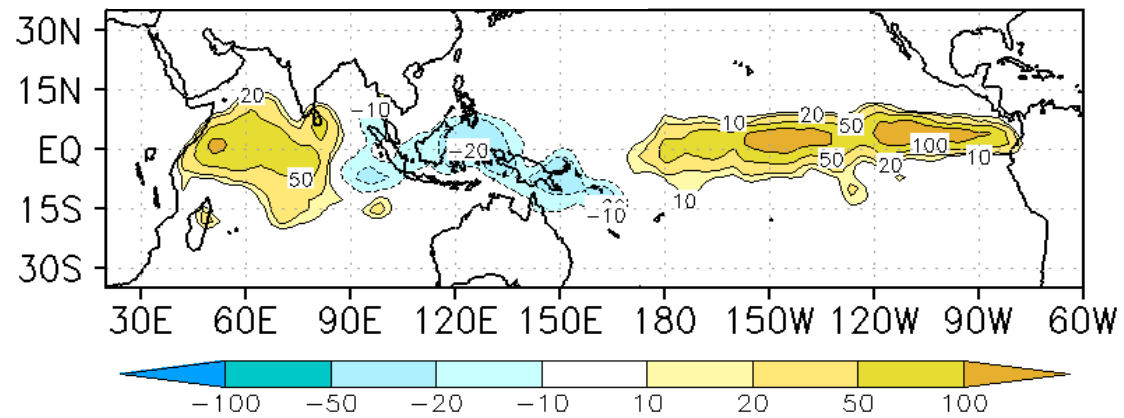
(b) CFSv2 Reforecast (IC: April 1972)



# Forecast SSTA & Precip. Anomaly for JJAS 1997



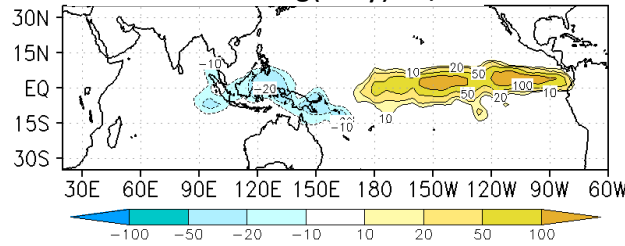
## 1997 Diabatic Heating Anomaly ( $W/m^2$ ) (Based on Observations)



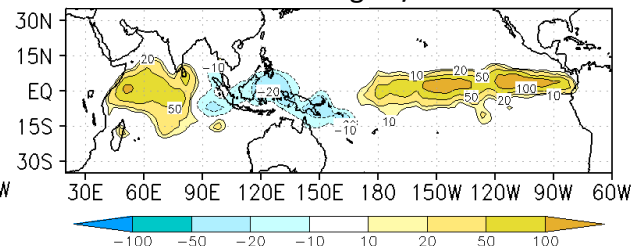


# Pacific Only vs. Pacific + Indian Ocean

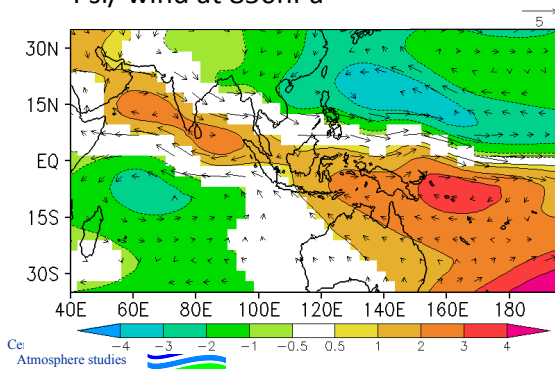
➤ 1997 Pacific forcing(only) W/m<sup>2</sup>



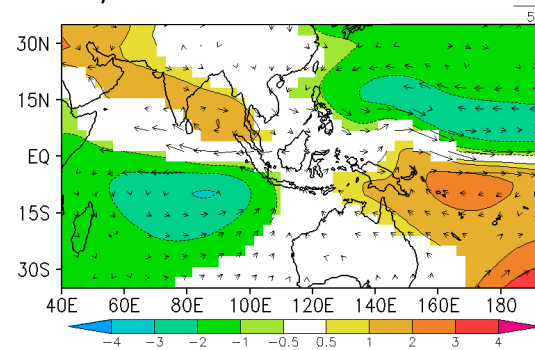
➤ 1997 Pacific + IO forcing W/m<sup>2</sup>



➤ Response:  
Psi/ wind at 850hPa



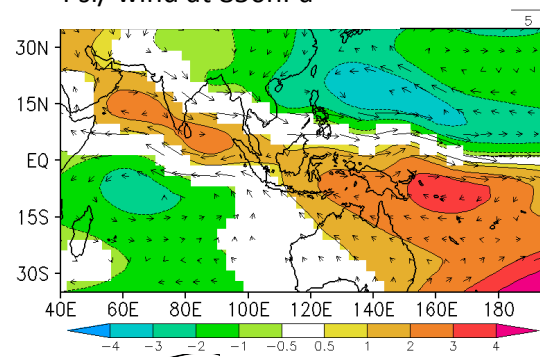
➤ Response:  
Psi/ wind at 850hPa



## Pacific Only vs. Pacific + Indian Ocean 1997 ENSO

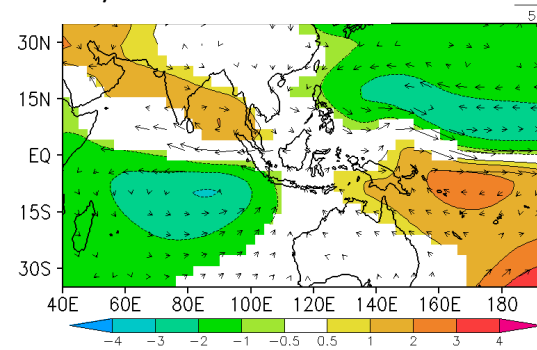
- The Pacific heating and cooling associated with 1997/98 El Nino produced a weaker monsoon circulation (drought!) over India. However, the superposition of Pacific El Nino and Indian Ocean warming produced a normal monsoon circulation over India.

➤ Response:  
Psi/ wind at 850hPa



Center of Ocean-Land-  
Atmosphere studies  
**COLA**

➤ Response:  
Psi/ wind at 850hPa



**GEORGE  
MASON  
UNIVERSITY**

# Comments

- **There is significant unrealized seasonal predictability.** The most dominant **obstacle** in realizing the potential predictability of short-term climate variations is **inaccurate models**, and unbalanced initial conditions rather than an intrinsic limit of predictability. *(Models with higher fidelity have higher prediction skill.)*
- Advances in NWP did not come by some major theoretical or conceptual breakthrough; it came by comprehensive, persistent, and simultaneous efforts in prediction, model development and predictability research.
- To enhance predictive understanding, a vigorous, collaborative, and simultaneous effort is needed for **model development, predictability research, and seamless prediction of weather and climate.**

# Summary

- After 50 years of climate modeling, models have just begun to show some skill in prediction of seasonal mean rainfall over India, (Current statistical method have no demonstrable skill)
- The reasons for dramatic breakdown of ENSO-Monsoon Teleconnections in some years is not well understood.
- Realistic simulation of SST and diabatic heat sources in **West-Pacific & IO** appear to be important for accurate seasonal mean monsoon rainfall prediction, and intraseasonal variations during the monsoon season.

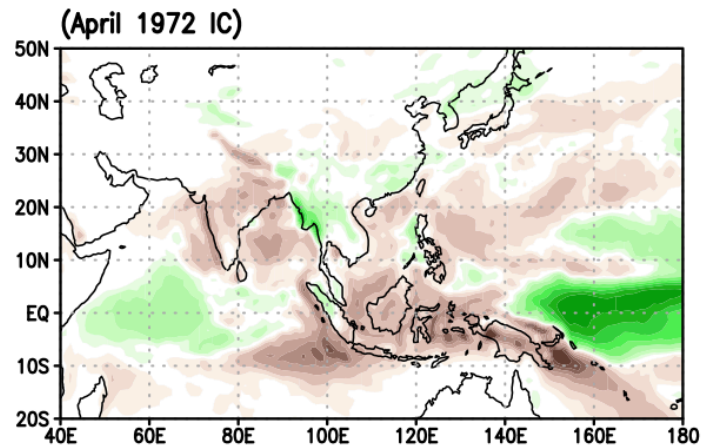
**THANK YOU!**

**ANY QUESTIONS?**

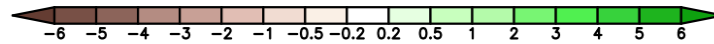
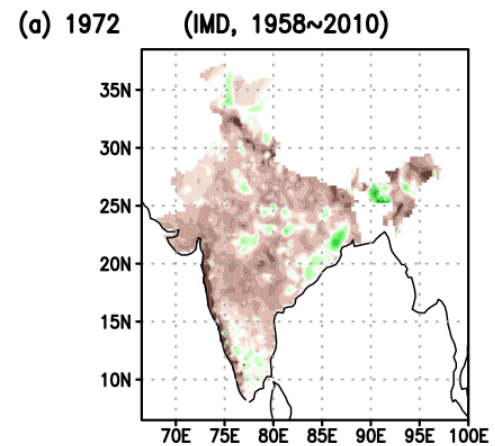


# Forecast (April 72, IC) and Observed (IMD) Rainfall Anomalies for JJAS 1972 (mm/day)

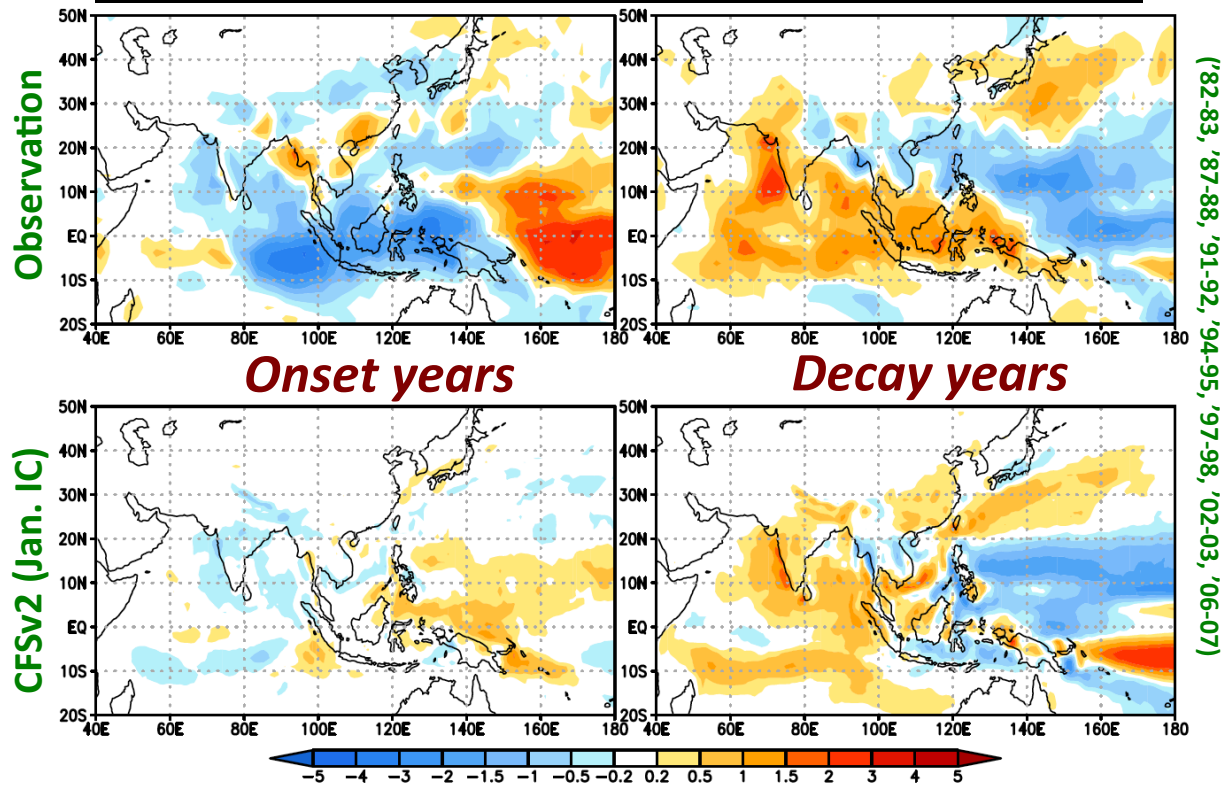
Forecast Model Anomaly CFSv2



Observed Anomaly IMD

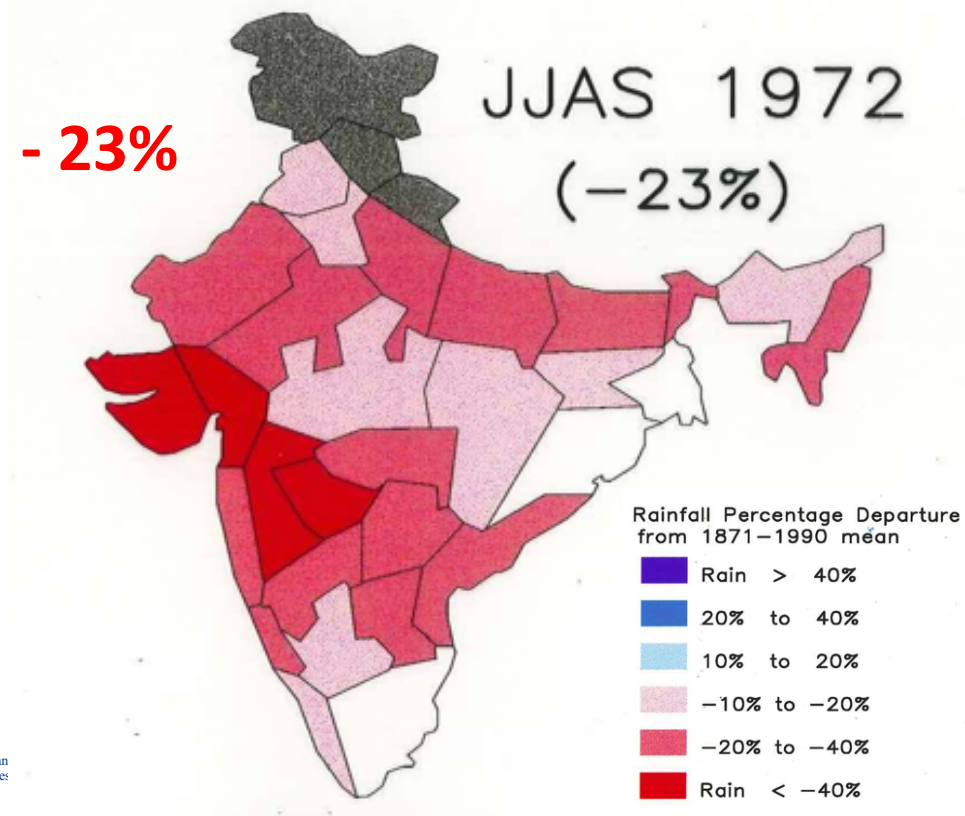


## Composite anomalies of monsoon rainfall in all warm events



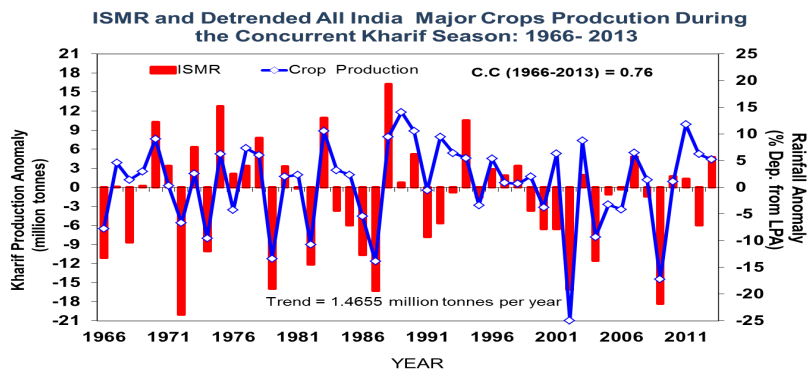
**Monsoon is more predictable in the summer after a major El Niño event**

# JJAS Rainfall Anomalies Over India

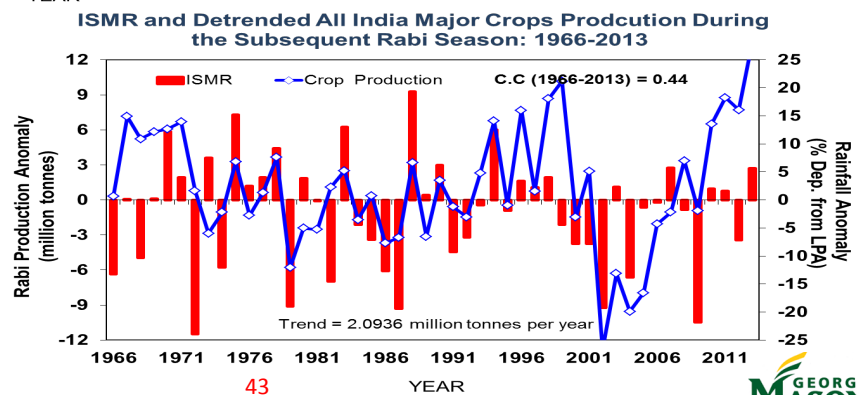




# Monsoon Rainfall & Agriculture (India)



Crop production deviation for any year is a measure of the impact of the monsoon rainfall of that year.



# Predictive Understanding

## *Prediction Skill and Predictability as a Metric of Understanding*

- To enhance predictive understanding, a vigorous, collaborative, and simultaneous effort is needed for **model development, predictability research, and seamless prediction of weather and climate.** Diagnostic evaluation and prediction must be an integral part of model development.
- Advances in NWP did not come by some major theoretical or conceptual breakthrough; it came by comprehensive, persistent, and simultaneous efforts in prediction, model development and predictability research by a team of qualified scientists.  
*(A similar effort for Dynamical Seasonal Prediction is needed. )*

# Summary

- The most dominant **obstacle** in realizing the potential predictability of short-term climate variations is **inaccurate models**, and unbalanced initial conditions rather than an intrinsic limit of predictability.  
*(Models with higher fidelity have higher prediction skill.)*
- **There is significant unrealized seasonal predictability.**
- A multi-institutional (multinational) enhanced research effort and computational infrastructure is needed to develop the next generation of **high fidelity** climate models for **improved climate predictions**, utilization of **space observations**, and to suggest policies and strategies for **adaptation and mitigation**.

## Summary

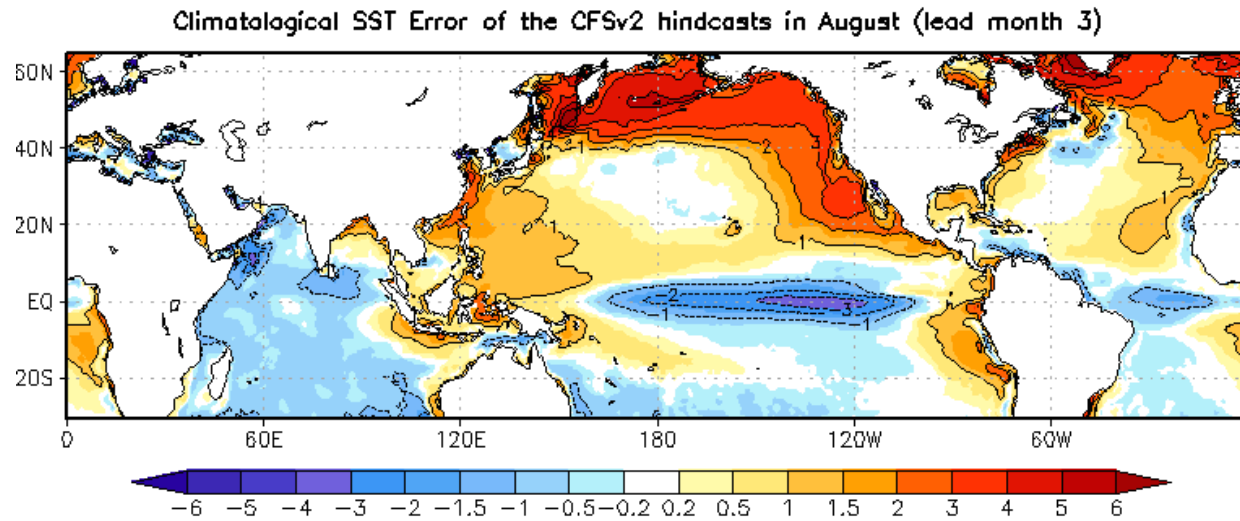
- ENSO prediction skill is comparable between 1958-78 and 1979-2014.
- The growth of some ENSO events is underestimated, possibly due to cold bias.
- ENSO skill decreases more quickly in spring during 1958-78 (model events persist longer).
- RMS errors are larger during summer-fall in 1979-2014 (overshooting strong events).

**In Spite of Large Biases in Simulated SST,  
Predictions of SST Anomalies Have Some  
Skill  
In Some Cases**

**Small Skill in Predicted SST is Enough to Give Statistically  
Significant Skill in Predicted Monsoon Rainfall**

**That is why statistical models using April/May SST to predict JJAS  
monsoon rainfall have no skill, but coupled models with April/May initial  
conditions of A & O have statistically significant skill**

## SST Bias in 3 Month Forecasts (CFSv2), 1982-2008, I.C. May, 1



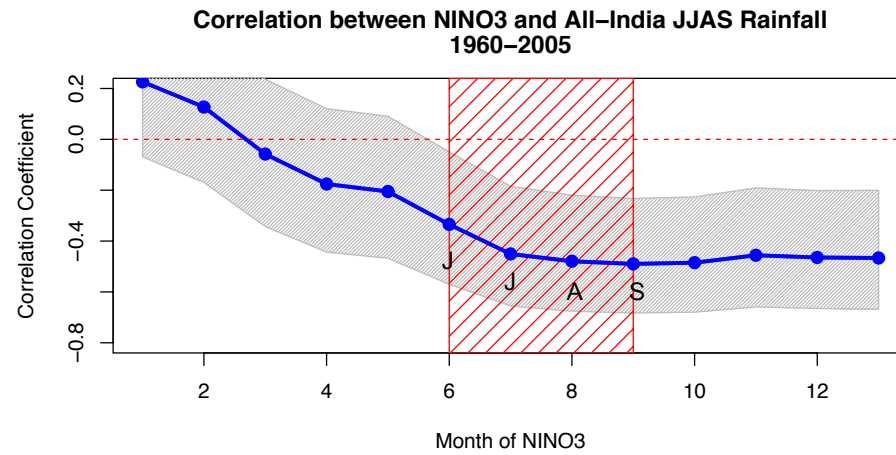
### CFSv2 hindcasts (1982-2008)

Atmospheric and Land ICs : first 4 days in May (4 ensemble members), CFSR

Ocean ICs : NEMO reanalysis

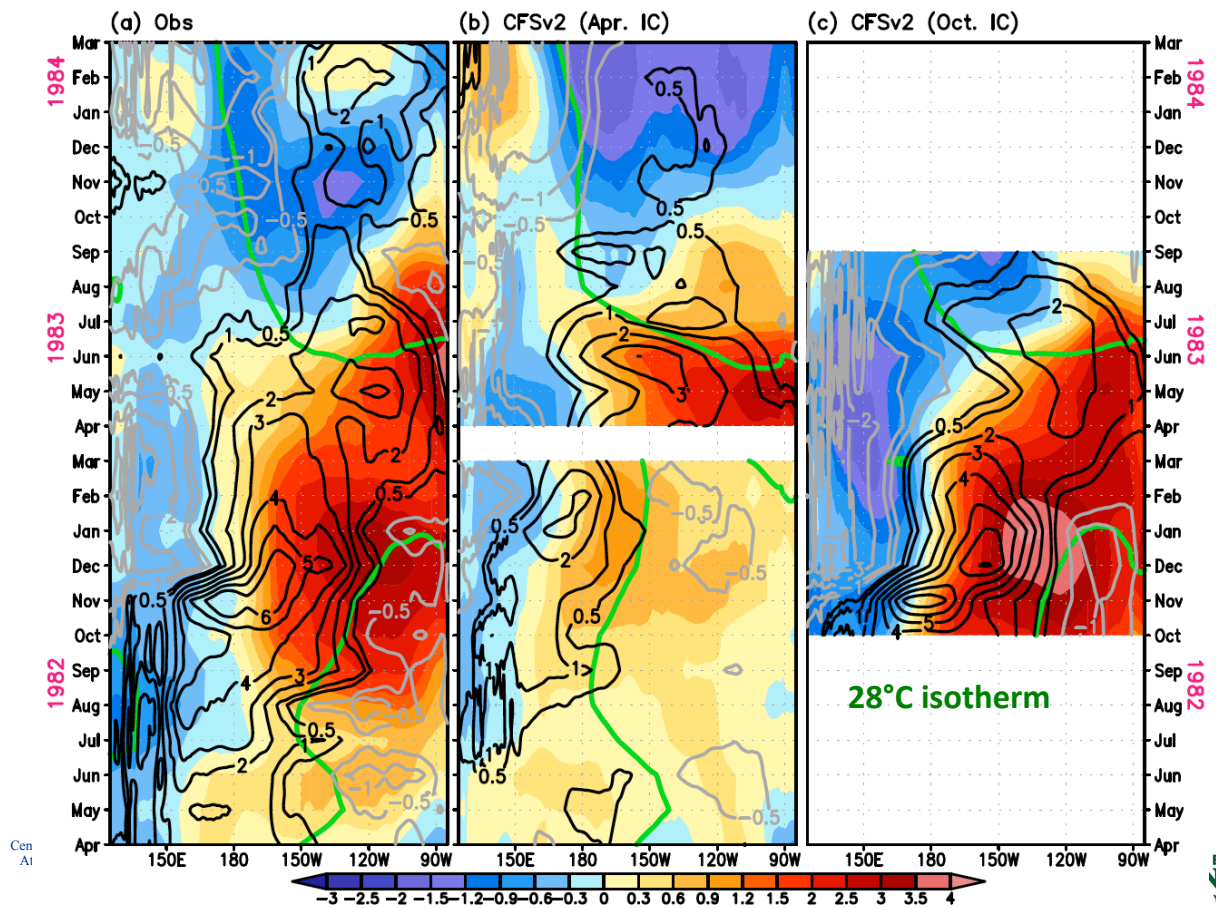
### Observation

: daily NOAA OI SST ver2



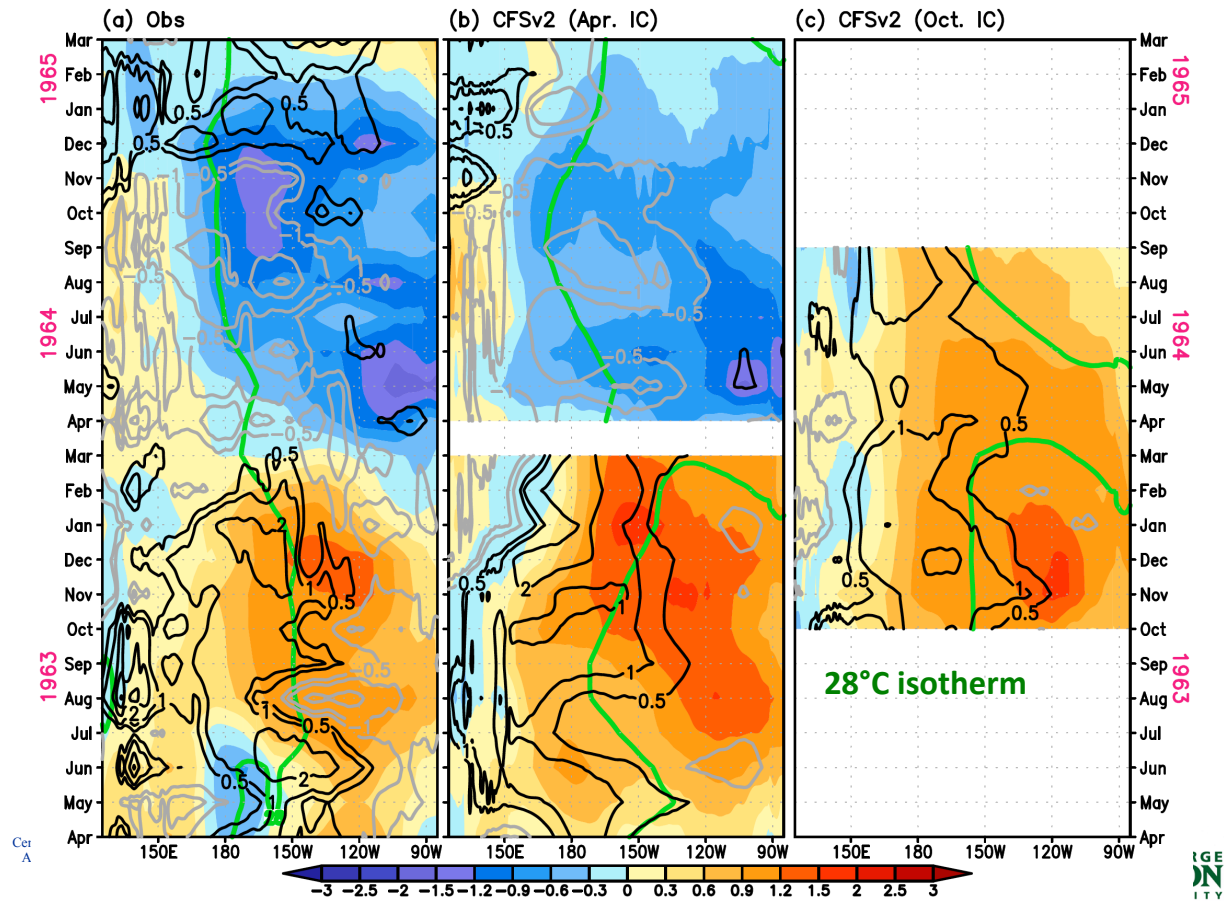
**Time lagged correlation between all-India JJAS Monsoon Rainfall and the NINO3 index during the period 1960-2005. The red hatching indicates the JJAS period, the horizontal red dashed line indicates zero, and the grey shading indicates the 95% confidence interval for the time lagged correlation.**

### Anomalies of equatorial SST and zonal wind stress (1982–83)





### Anomalies of equatorial SST and zonal wind stress (1963–64)

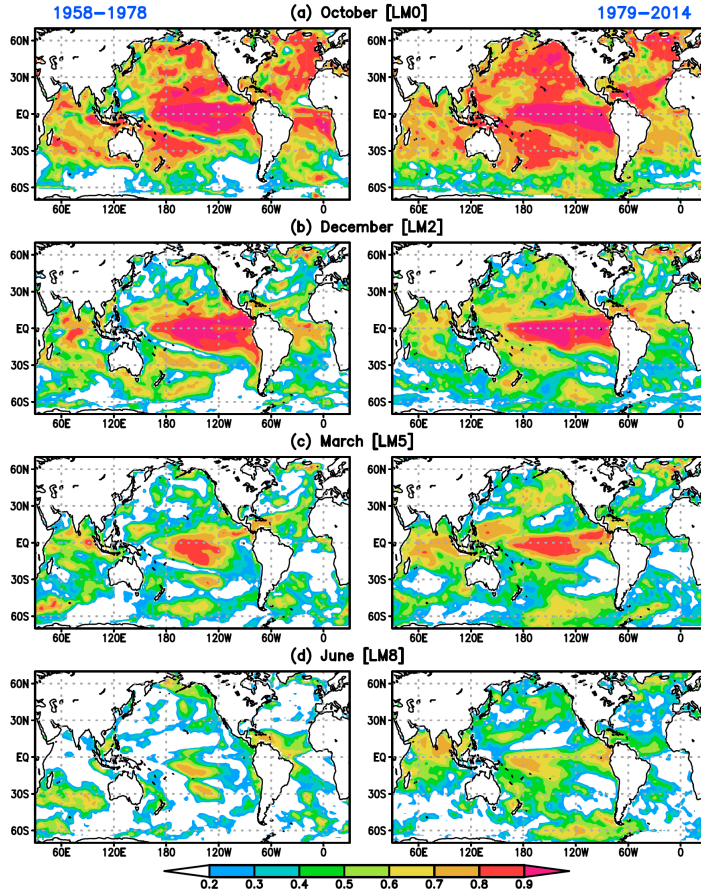


Oct. IC

1958-1978

1979-2014

Correlation skill of CFSv2 reforecast SST (Oct. IC)



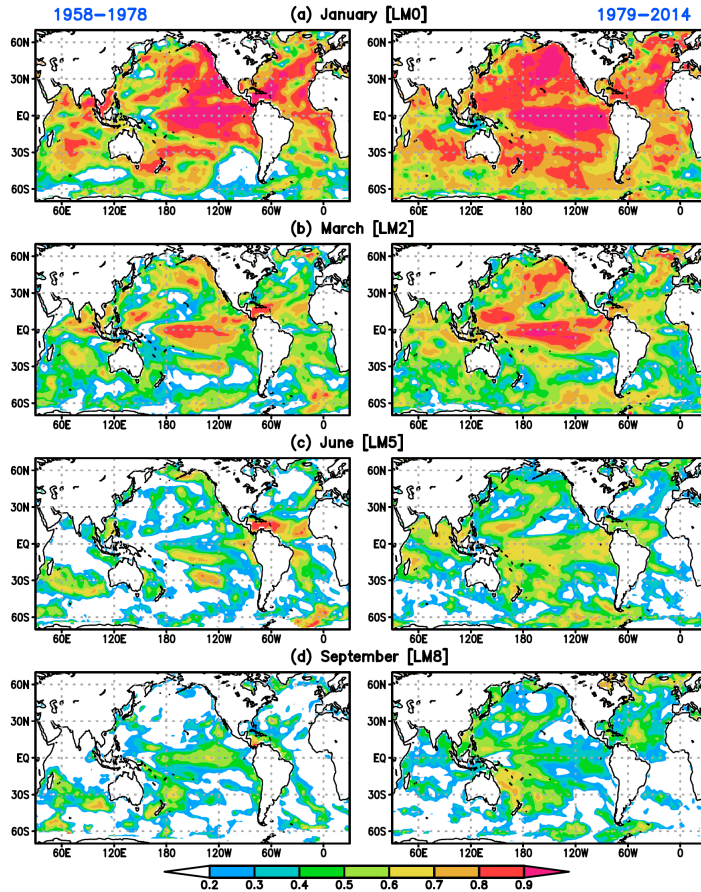
Verified against  
ERSSTv3

Jan. IC

1958-1978

1979-2014

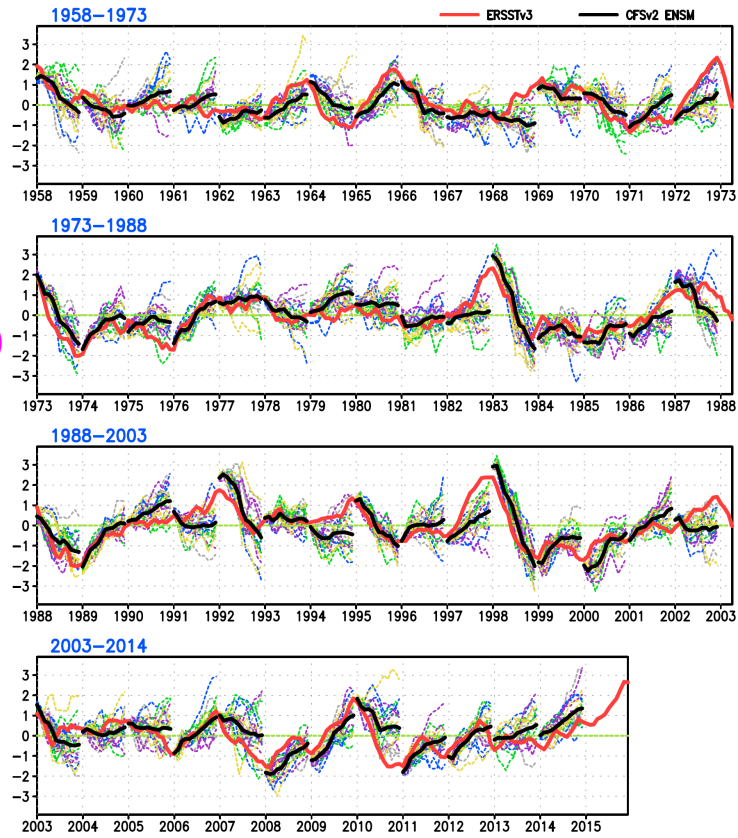
Correlation skill of CFSv2 reforecast SST (Jan. IC)



Verified against  
ERSSTv3

# Jan. IC

57-yr (1958-2014) CFSv2 hindcast monthly Nino3.4 SSTA (Jan. IC)

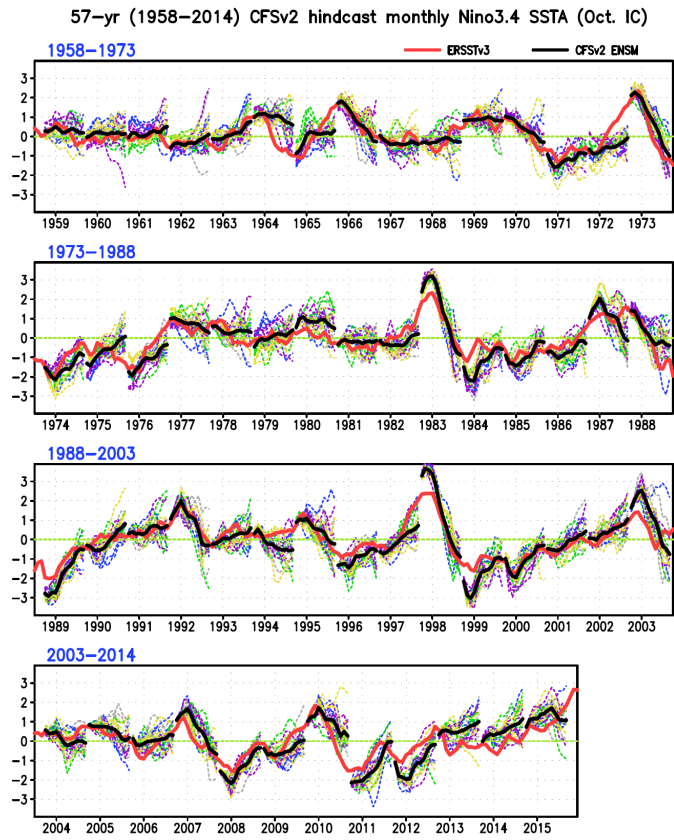


ERSSTv3

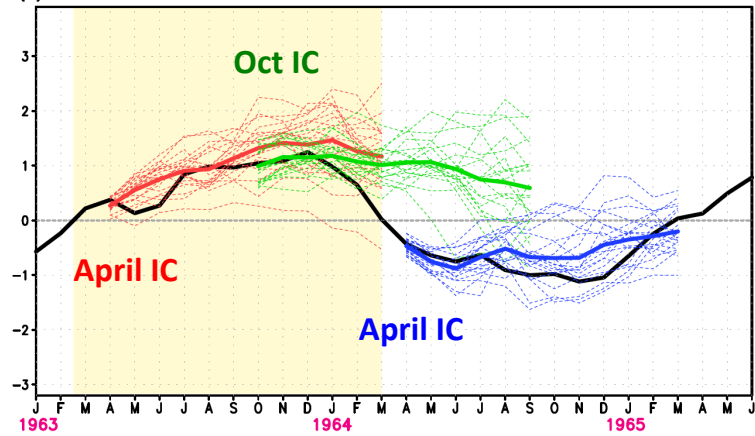
CFSv2 ENSM

Ensemble spread is the greatest. (higher uncertainty)

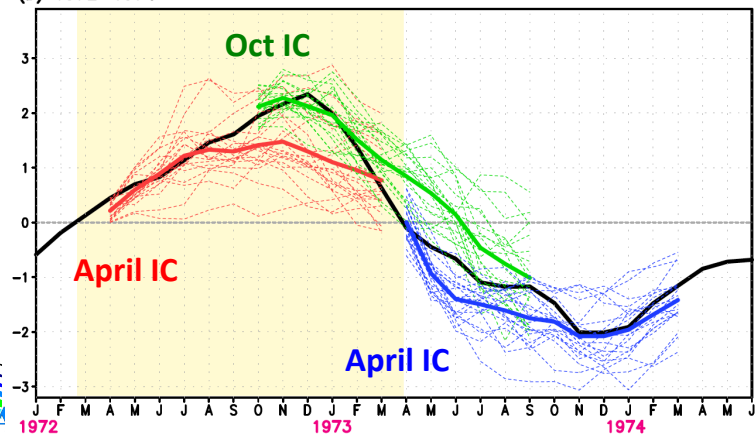
# Observed and Forecast (Oct IC) Nino 3.4, 1958-2014



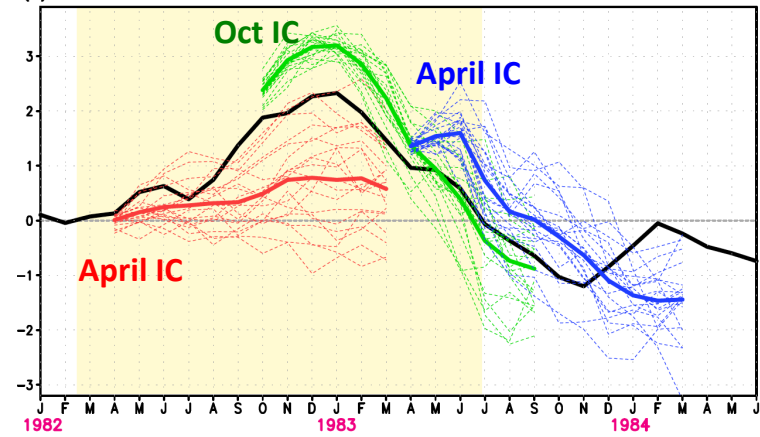
(a) 1963–1965



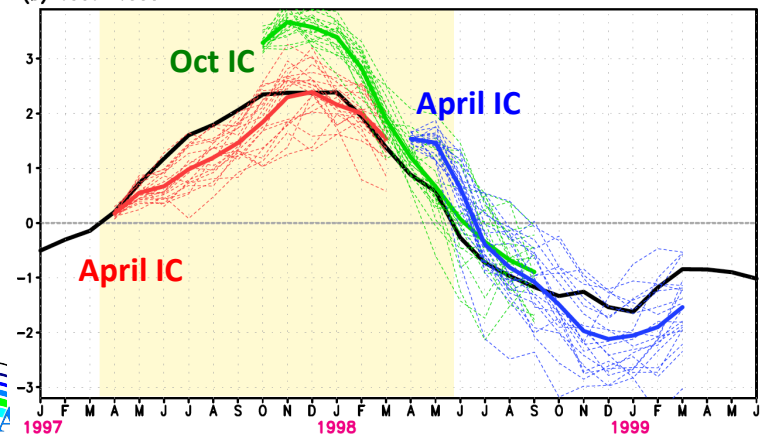
(b) 1972–1974



(a) 1982-1984

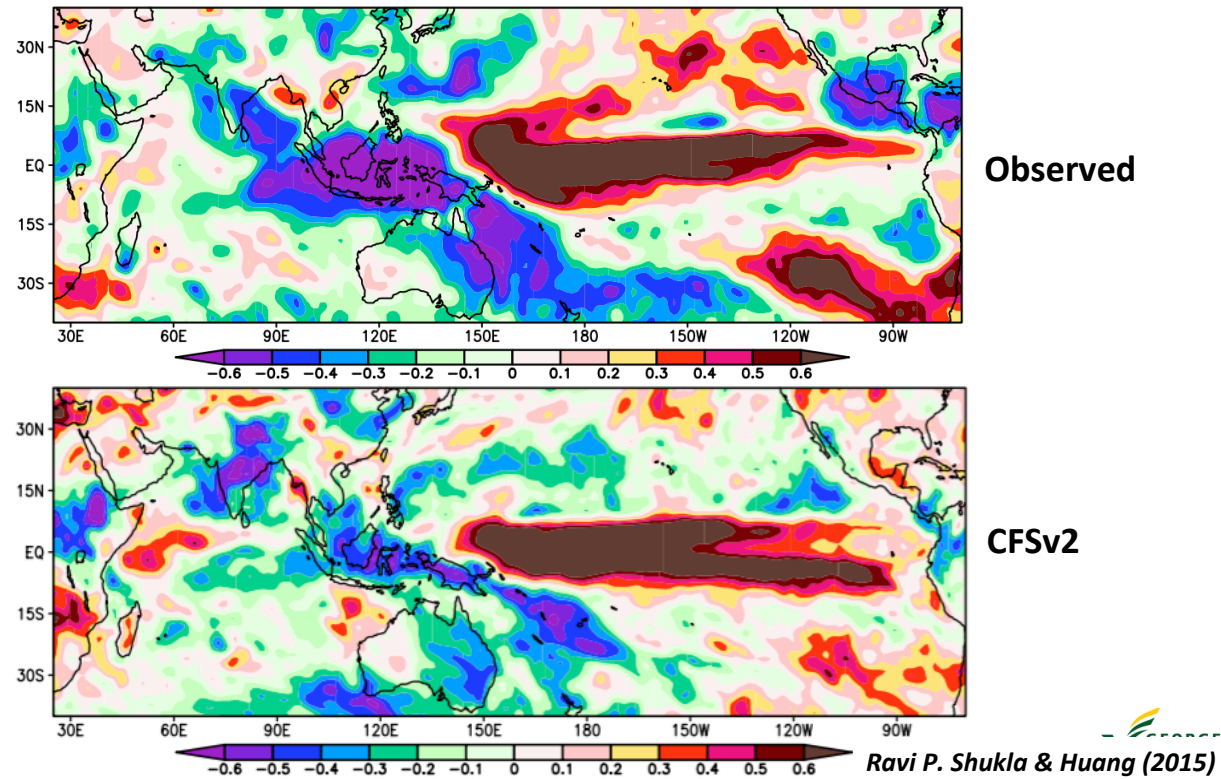


(b) 1997-1999



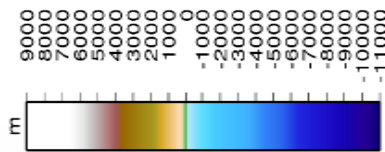
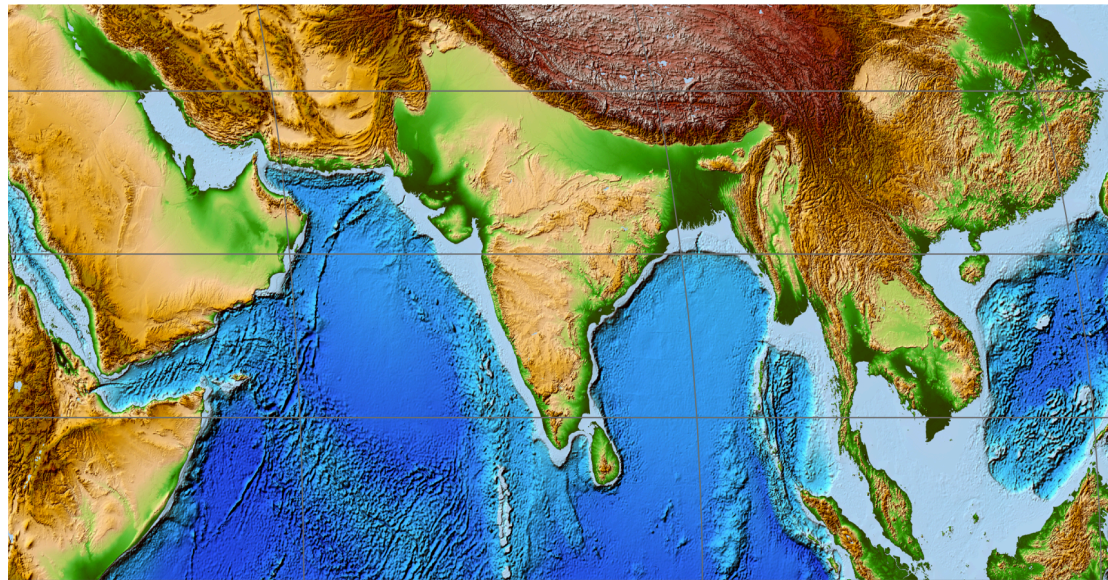


## Correlation Coefficient between Nino 3.4 SSTA and Precipitation for JJAS (1981-2010)





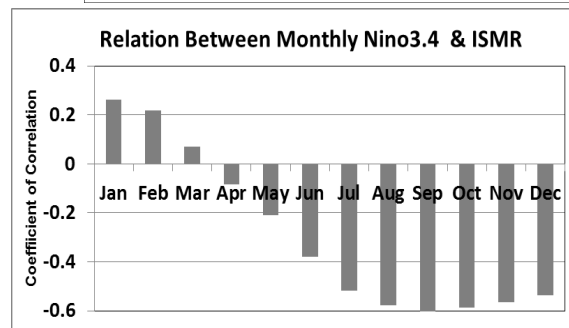
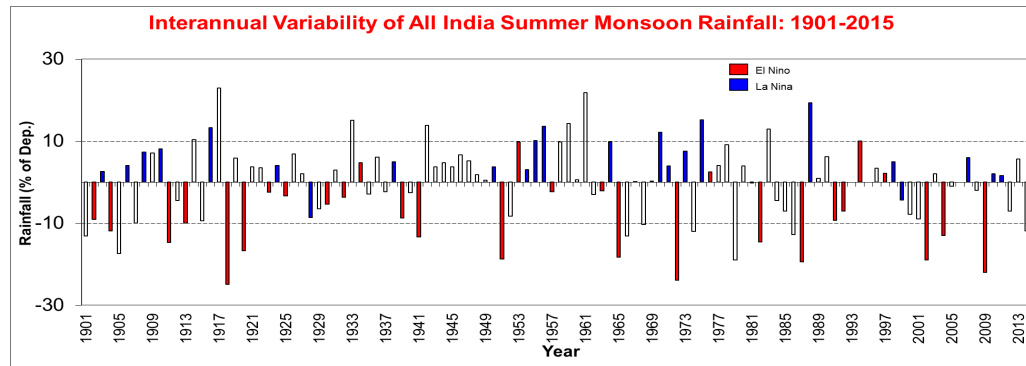
# Orography



# El Nino vs Monsoon

Red Bars: El Nino Years

Blue Bars: La Nina Years



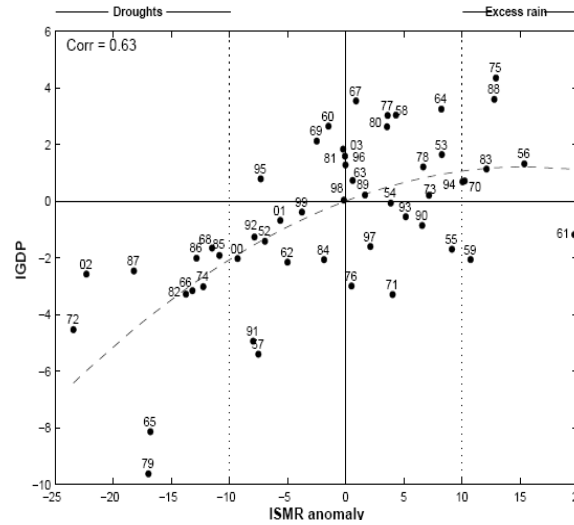
In general, ENSO has inverse relationship with Indian summer monsoon. During the warm phase of the ENSO (El Nino), monsoon is weaker than normal and during the cold phase of the ENSO (La Nina), monsoon is stronger than normal. The intensity of the events also decides the amount of impact.

# Indian GDP and Summer Monsoon Rainfall

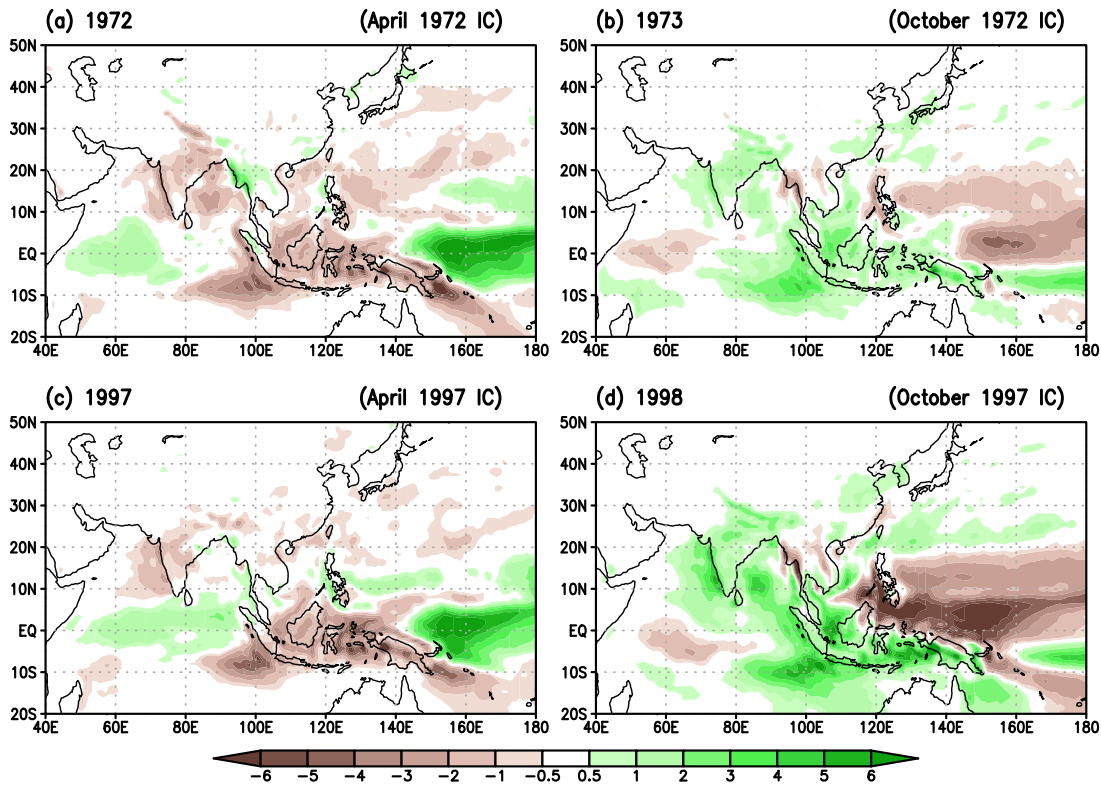
Impact of a severe drought on GDP remains 2 to 5% throughout, despite the substantial decrease in the contribution of agriculture to GDP over the five decades (Gadgil and Gadgil 2006)

**IGDP by sector (2012-13)**  
**agriculture: 13.7%,**  
**industry: 21.5%,**  
**services: 64.8%**

**Labour force by occupation**  
**agriculture: 49%,**  
**industry: 20%,**  
**services: 31% (2012 est.)**



Predicted JJAS mean rainfall anomalies [mm/day]

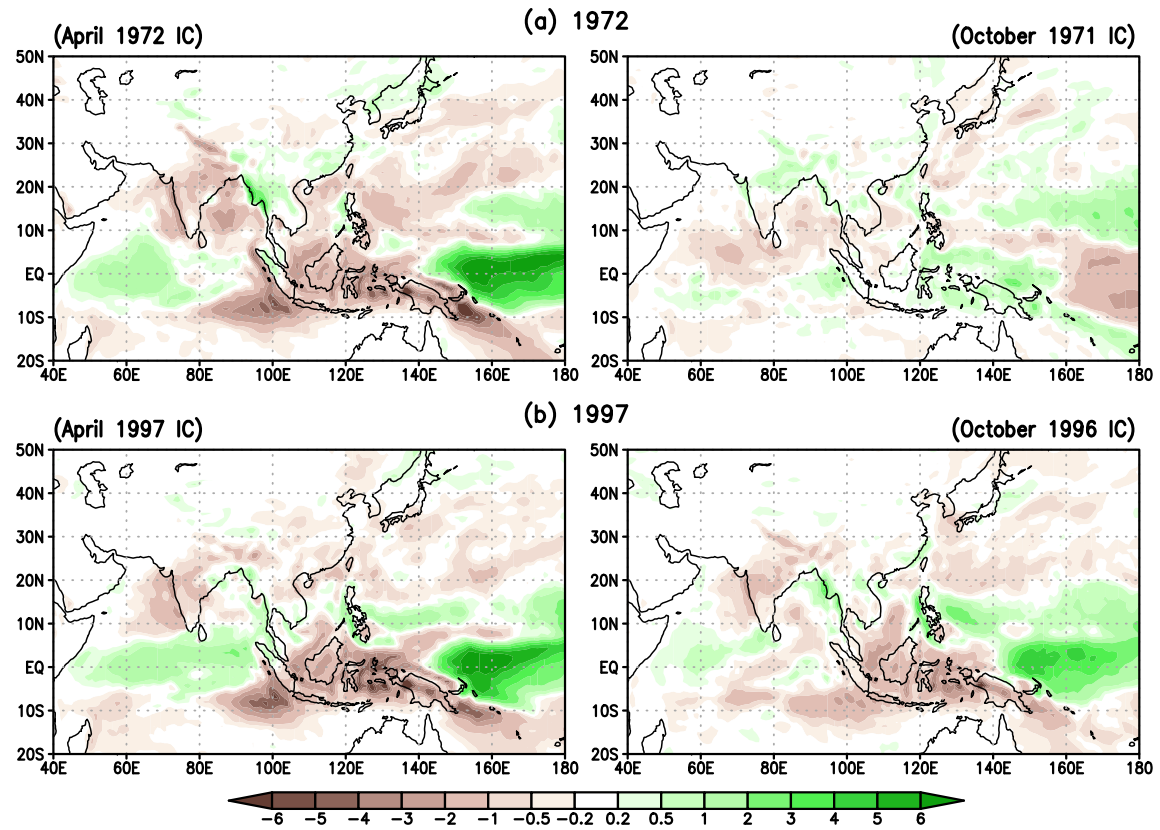


Center  
Atmc

COLA

IRGE  
MASON  
UNIVERSITY

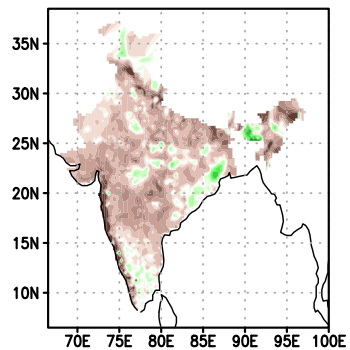
Predicted JJAS mean rainfall anomalies [mm/day]



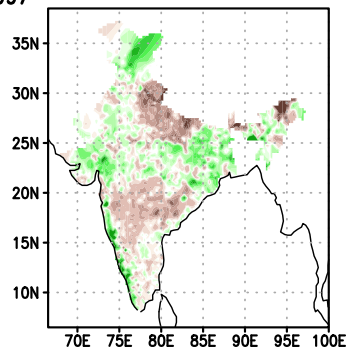
c

Observed JJAS mean rainfall anomalies [mm/day]

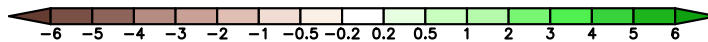
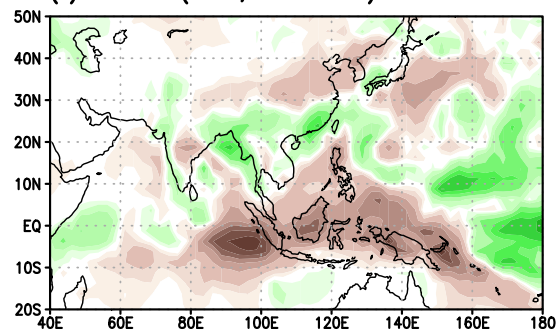
(a) 1972 (IMD, 1958~2010)



(b) 1997



(c) 1997 (GPCP, 1979~2013)



# El Nino vs Monsoon

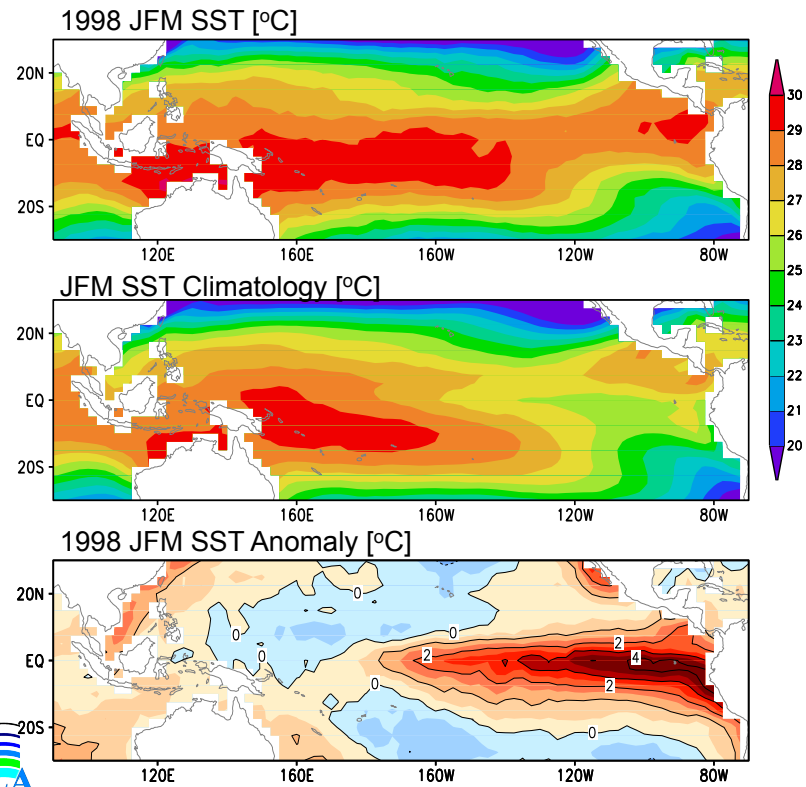
Year	Jun	Jul	Aug	Sep	JJAS	El Nino strength
1951	86.4	81.1	87.9	67.1	81.3	ME
1953	101	112	119	100	110	WE
1957	89.2	101	113	77.9	97.6	SE
1963	88.4	84.7	122	94.2	97.9	ME
1965	66.7	95.2	77.3	79.2	81.8	SE
1969	76.5	107	106	103	100	WE
1972	73.3	68.8	85.9	76.4	76.1	SE
1982	83.2	76.9	109	67.8	85.5	ME
1987	78.4	71.2	96.3	74.9	80.6	SE
1991	109	91.3	95.5	66.2	90.7	ME
1997	106	98.4	109	93.9	102	SE
2002	109	45.8	98.3	87.1	80.8	ME
2004	99.2	80.1	95.7	70	86.2	WE
2009	52.8	95.7	73.5	79.8	78.2	WE
2015	115.9	83.6	78.2	75.8	85.7	SE

- In general, Indian SW monsoon is weaker than normal during the El Nino years.
- No one to one association between EL Nino and ISMR.
- However there is stronger inverse relationship between El Nino and rainfall during later half of the monsoon season (particularly with September rainfall)

- ❖ During 1951-2015, there were 15 El Nino years.
- ❖ 9 El Nino years - deficient (less than 90%) season rainfall
- ❖ 4 El Nino years 90 to 100%
- ❖ 2 El Nino years it was above 100% (which includes 1997 one of the strongest El Nino years of the last century ).
- ❖ No El Nino years was associated with the excess monsoon rainfall

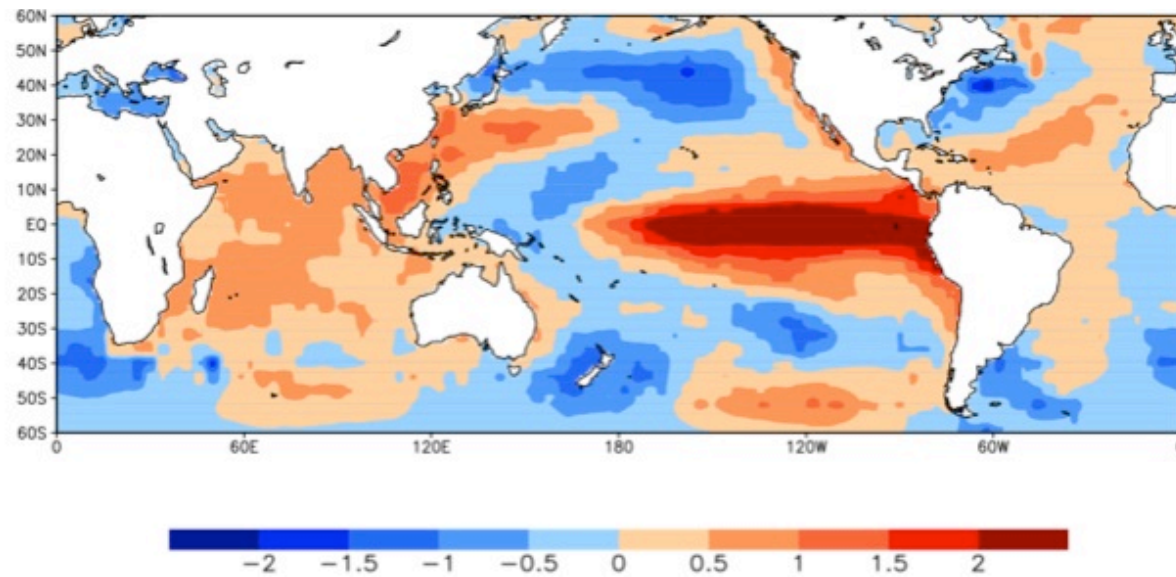


# El Nino/Southern Oscillation



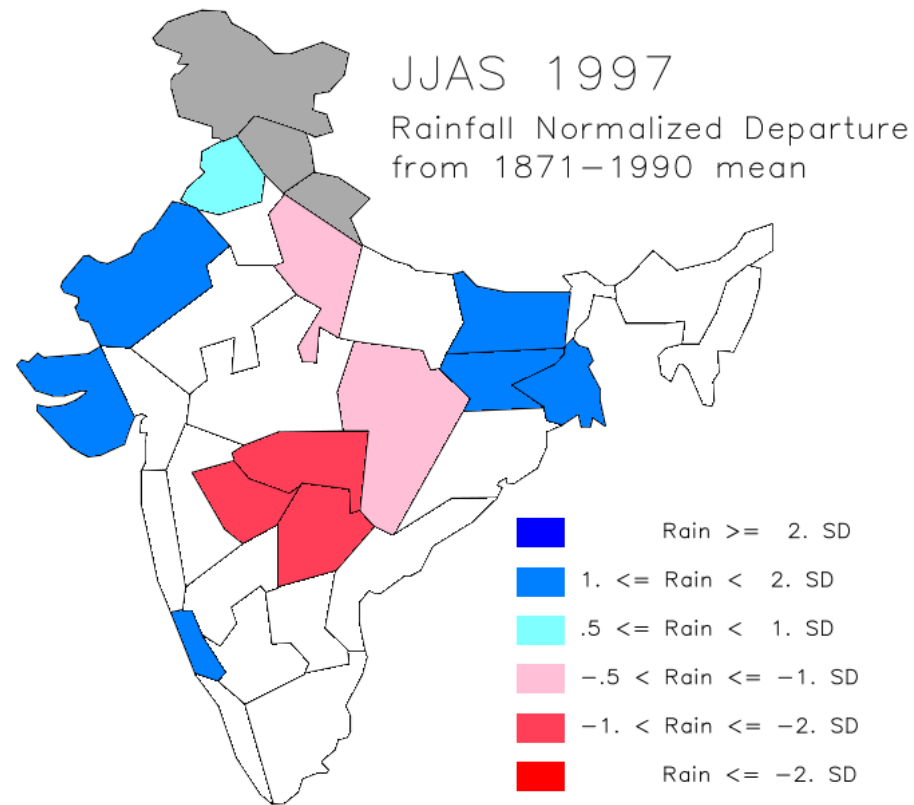


## SST Anomaly (°C) for DJF 1877



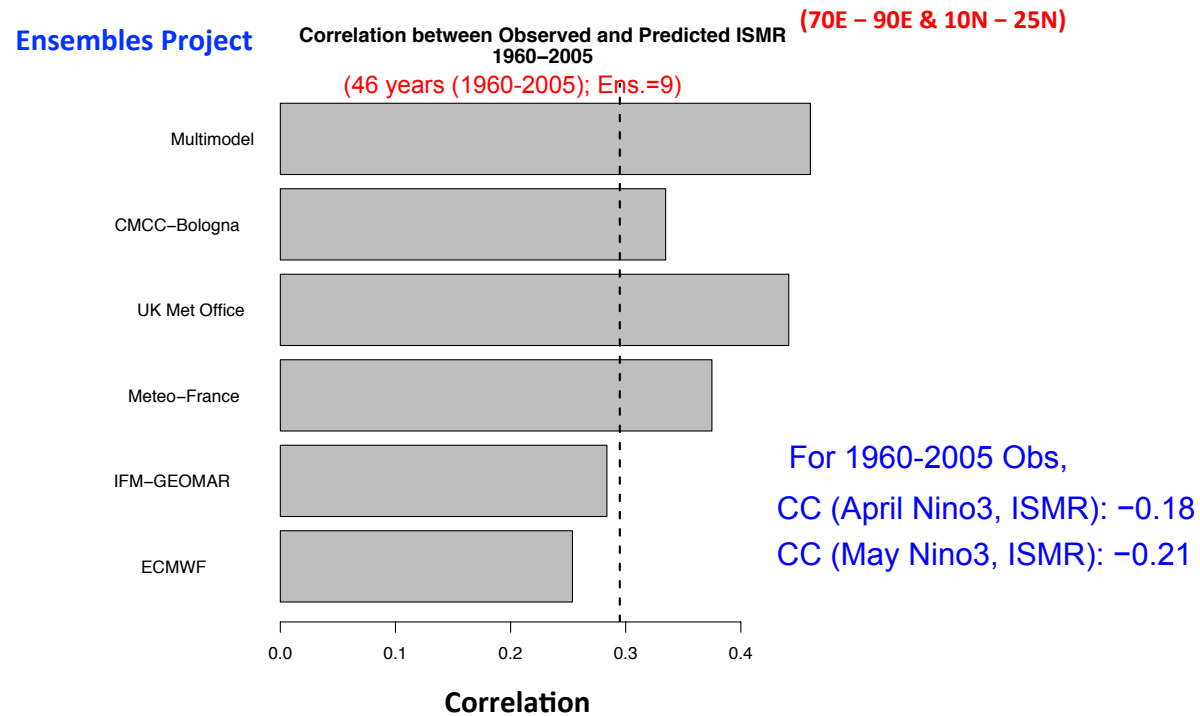
Courtesy of Lakshmi Krishnamurti

# JJAS Rainfall Anomalies Over India



**In Spite of Large Biases in Simulated SST,  
Predictions of SST Anomalies Have Some  
Skill  
In Some Cases**

**Small Skill in Predicted SST is Enough to Give Statistically  
Significant Skill in Predicted Monsoon Rainfall**



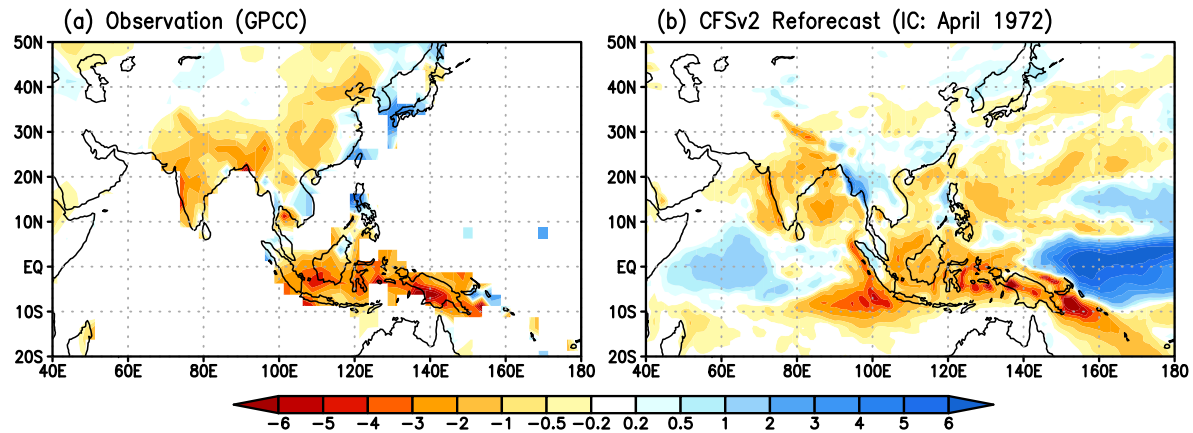
**After 50 years of modeling, and in spite of large systematic errors in SST and precipitation, climate models show a small but statistically significant skill for dynamical prediction of Indian summer monsoon rainfall.**

# Forecast (April 72, IC) and Observed (IMD) Rainfall Anomalies for JJAS 1972 (mm/day)

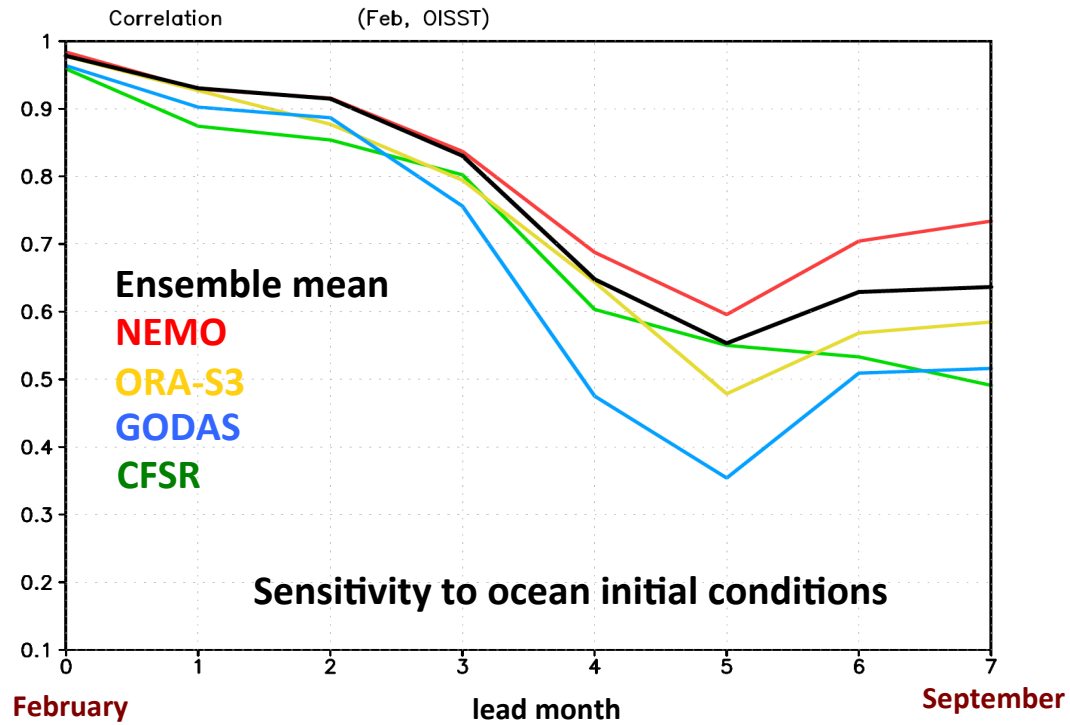
Observed GPCC

Model CFSv2

Anomalies of the Asian summer monsoon rainfall in 1972 [mm/day]



## CFSv2 Prediction skill of Nino3.4 SSTA (1982-2008)



# The Atmospheric Influence of Tropical Diabatic Heating Associated with Developing ENSO on Indian Monsoon

**Youkyoung Jang (Ph D Thesis)**

Department of Atmospheric, Oceanic and Earth Science  
George Mason University  
Spring 2011

## **Committee**

Dr. David M. Straus (Chair)  
Dr. Timothy DelSole  
Dr. Ben P. Kirtman  
Dr. Timothy Sauer  
Dr. J. Shukla



# Method

## Control Runs (20 years)

- non-SOM : climatological SST\*
  - SOM: slab ocean model over the western Pacific and Indian Ocean other basins with climatological SST
- \*change in Walker circulation induced by added heating

## Forced Runs

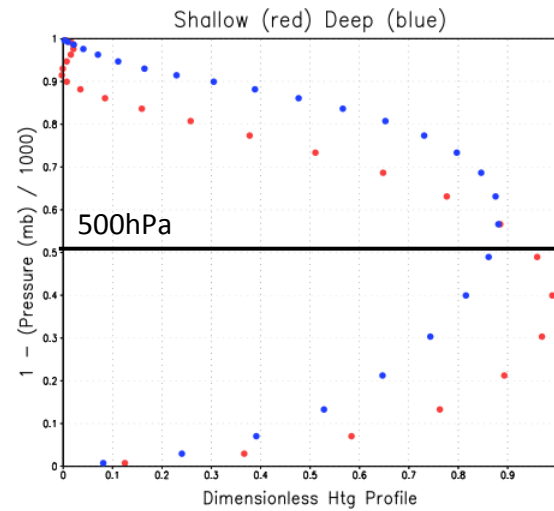
$$Q \text{ (total heating rate)} = Q \text{ (AGCM)} + Q \text{ (Added heating)}$$

- Q (AGCM): feedback from dynamics on heating
- Responses defined as Forced Exp - Control Run
- Forced experiments with SOM and non-SOM
- Focused on Seasonal Mean (MJJA)**

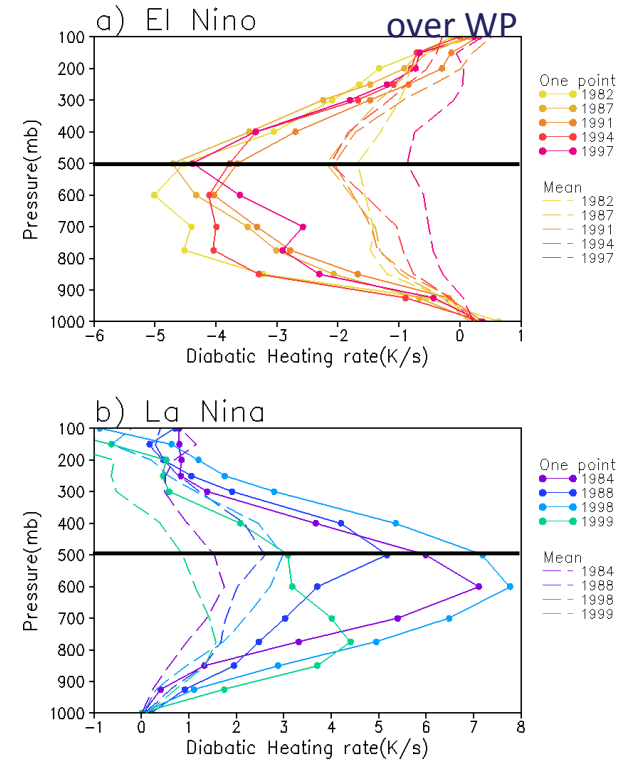


# Vertical structure (K/day)

➤ Model



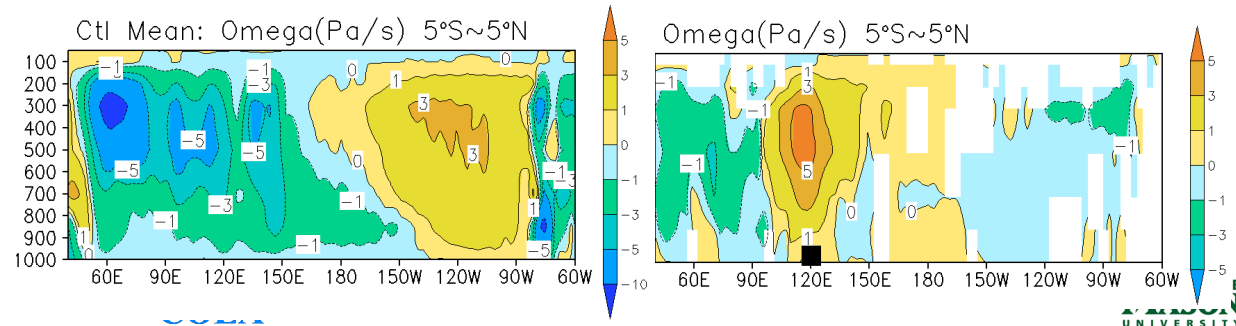
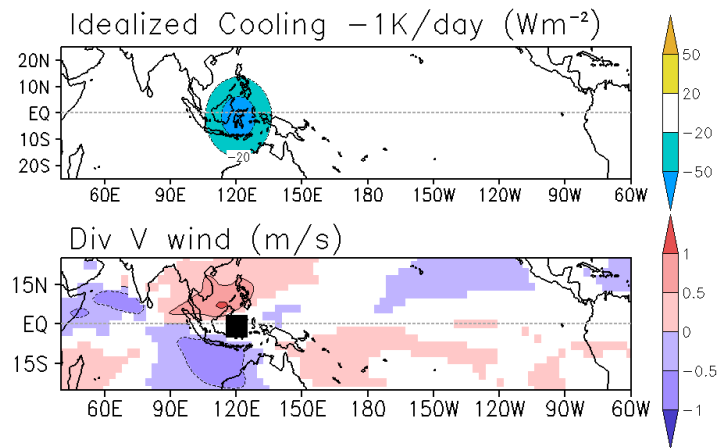
➤ Observation



## Cooling Exp: GCM effect

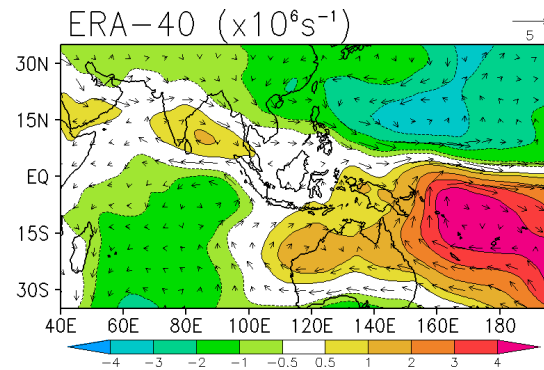
### ➤ Western Pacific Cooling ~ Descending motion

: Similar to  
El Nino



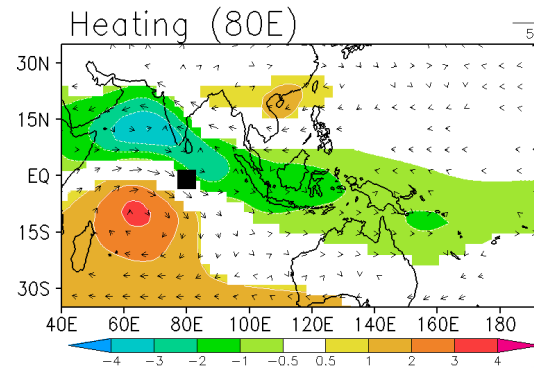
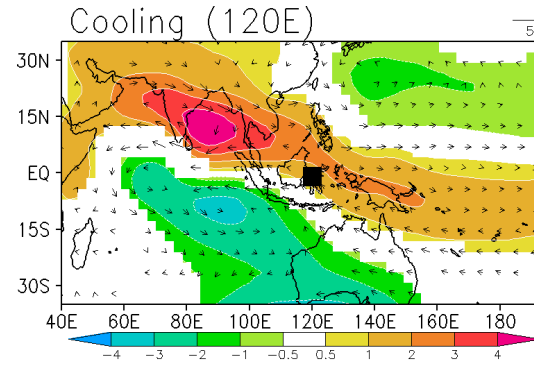
# Idealized Cooling (WP), Heating (IO)

## ➤ Observation



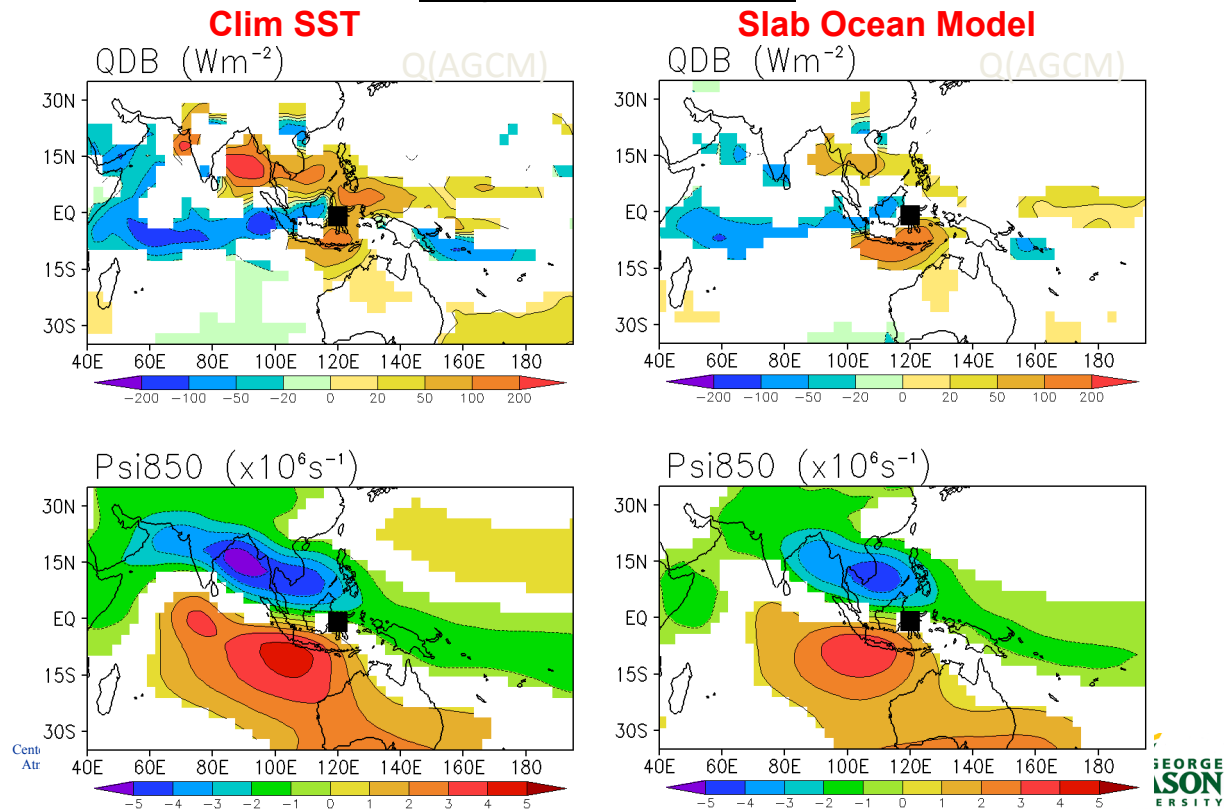
- Streamfunction ( $\times 10^6 \text{s}^{-1}$ ) at 850hPa
- Wind (m/s) at 850hPa

## ➤ Two Idealized forcing Exps



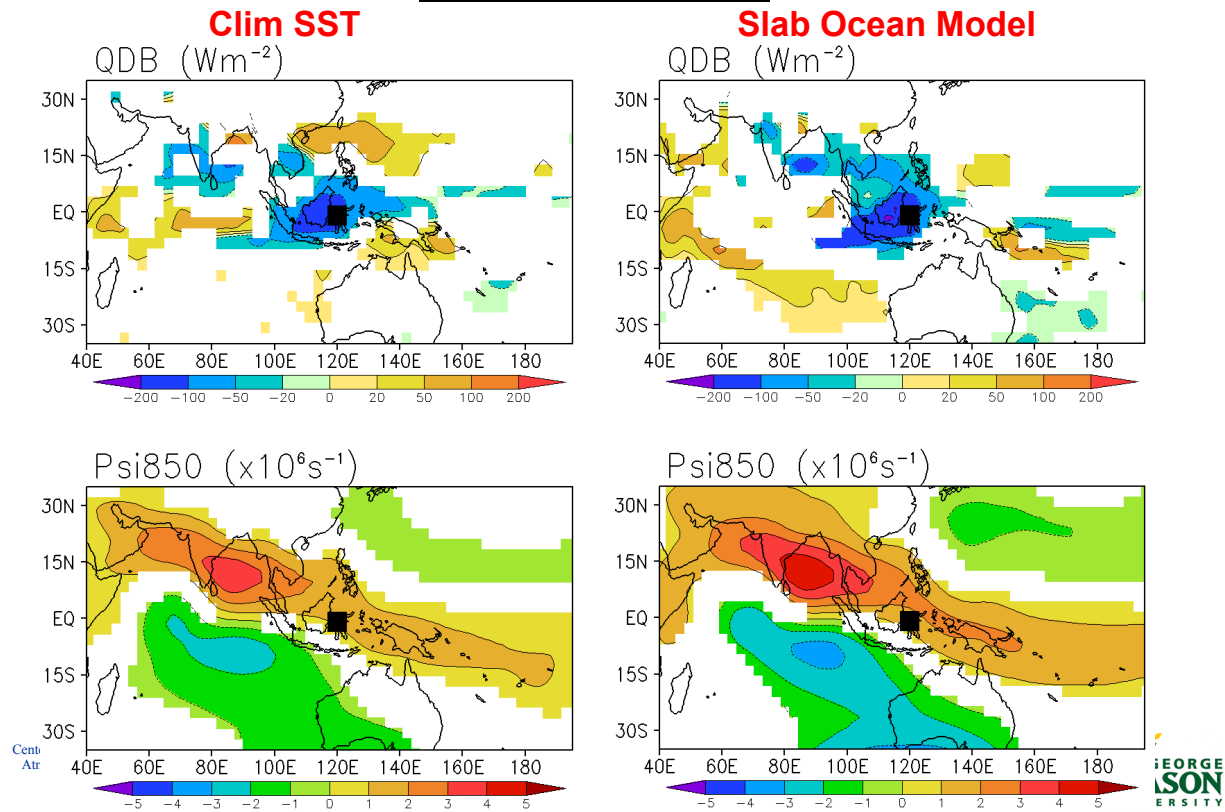
# Air-Sea Interaction: Heating

## Negative Feedback

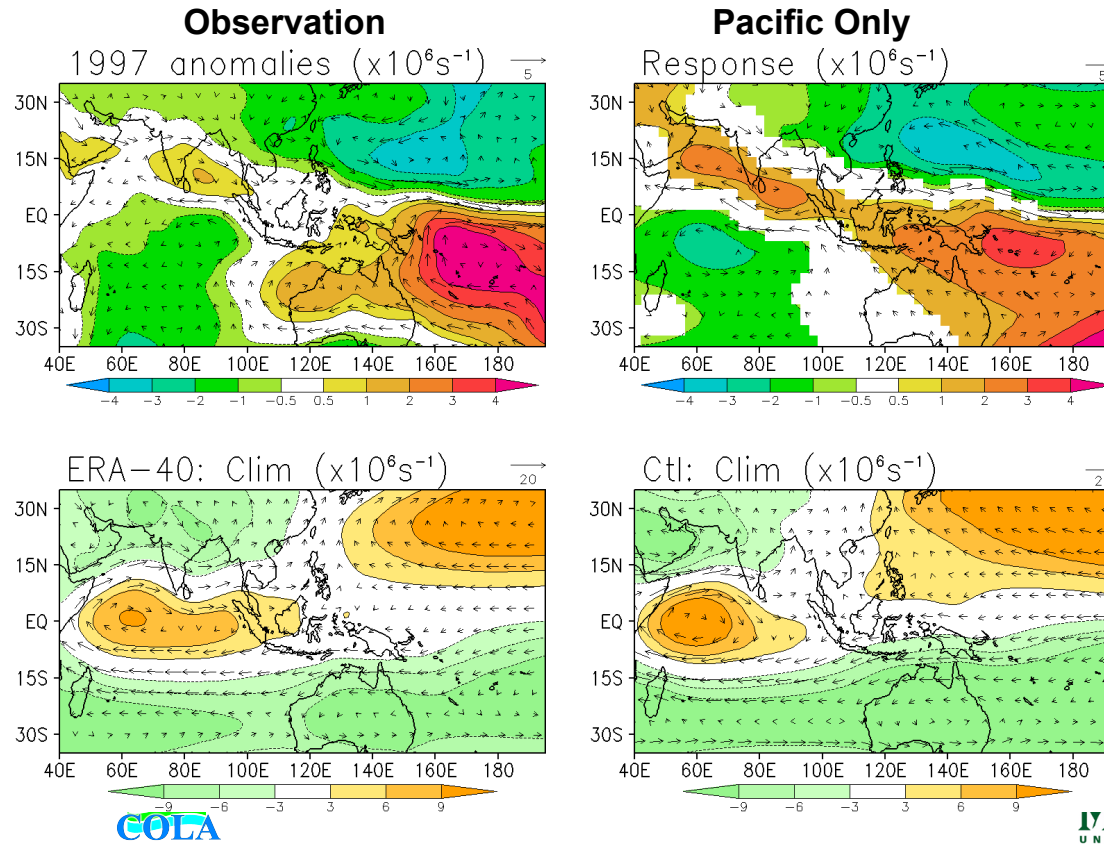


# Air-Sea Interaction: Cooling

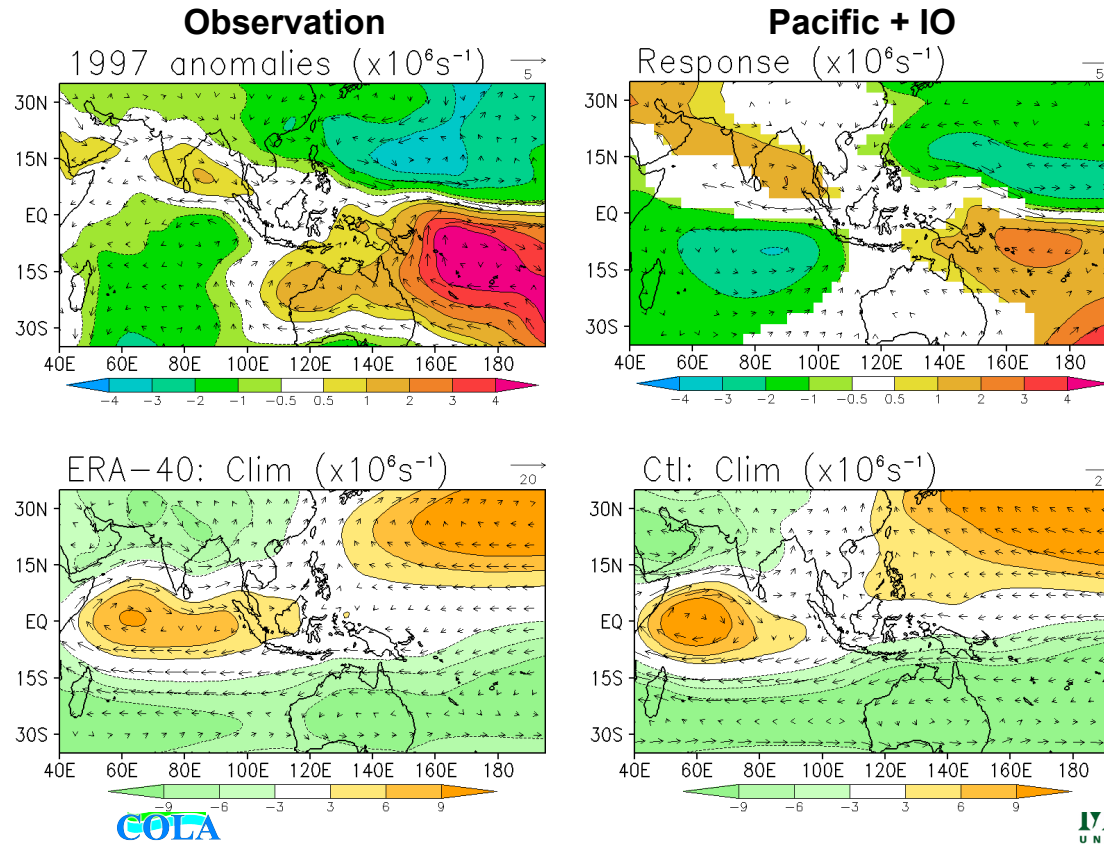
## Positive Feedback



# Steramfunction and Wind



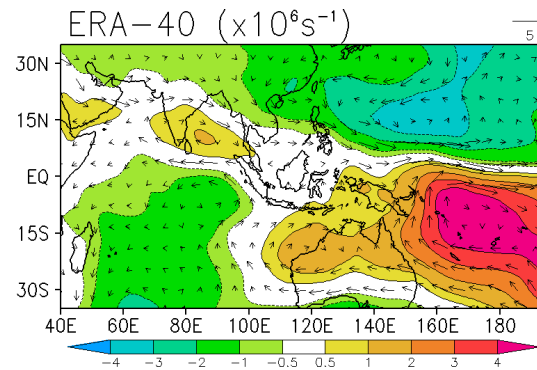
# Steramfunction and Wind



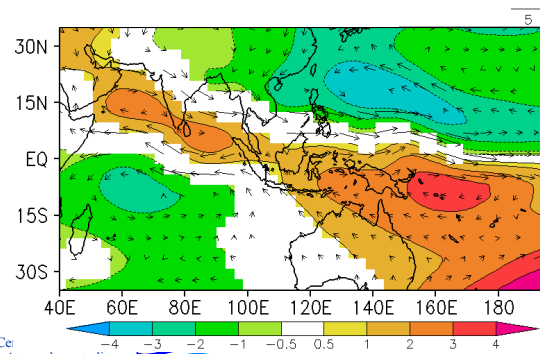
# Pacific Only vs. Pacific + Indian Ocean

- Streamfunction ( $\times 10^6 \text{s}^{-1}$ ) at 850hPa
- Wind (m/s) at 850hPa

## ➤ Observation



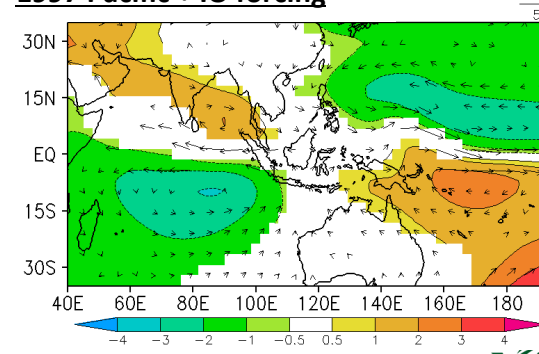
## ➤ 1997 Pacific forcing only



Co: Atmosphere studies

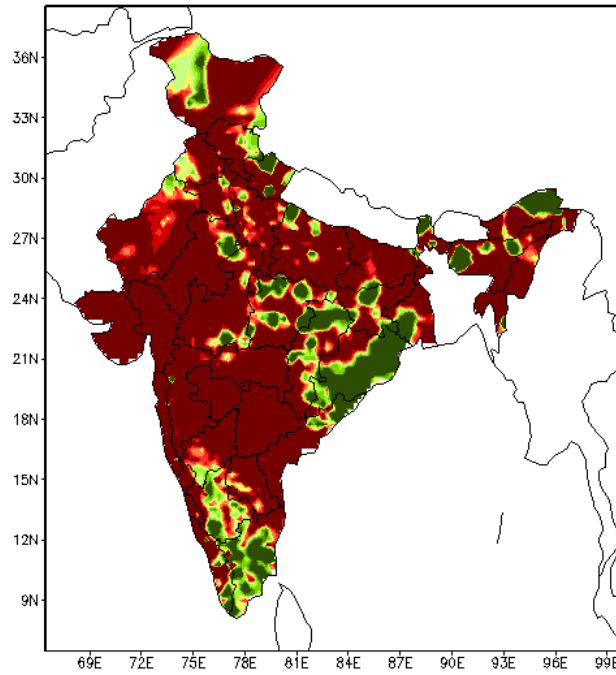


## ➤ 1997 Pacific + IO forcing

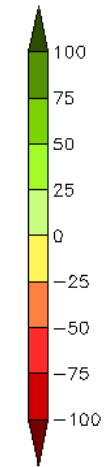




COMPOSITE JJAS RAINFALL ANOMALY(in mm)  
FOR 1972 OVER INDIA

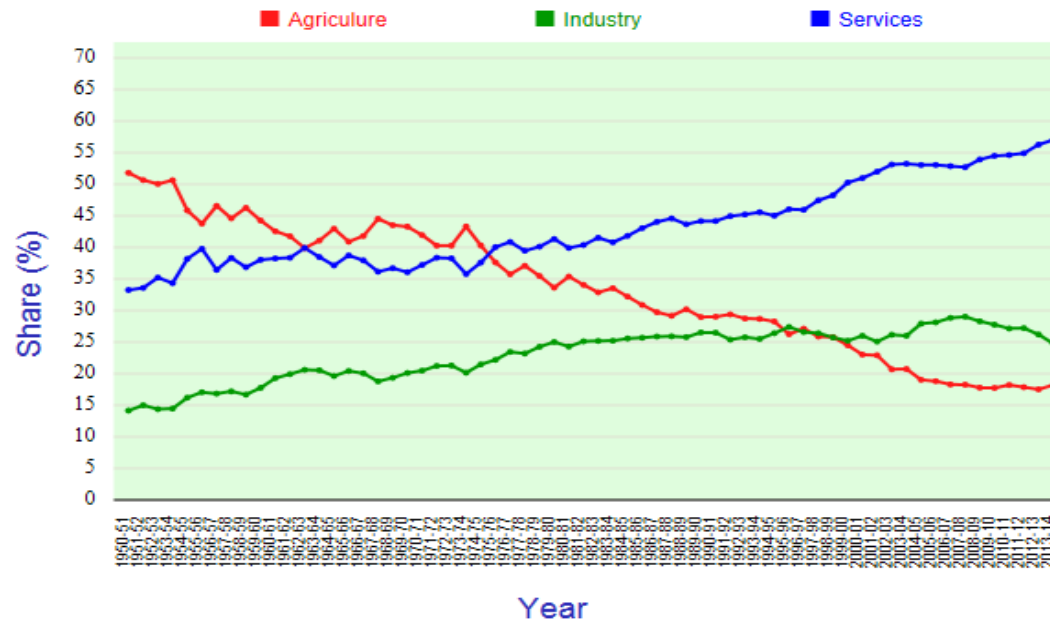


ISMR = -24%  
of LPA

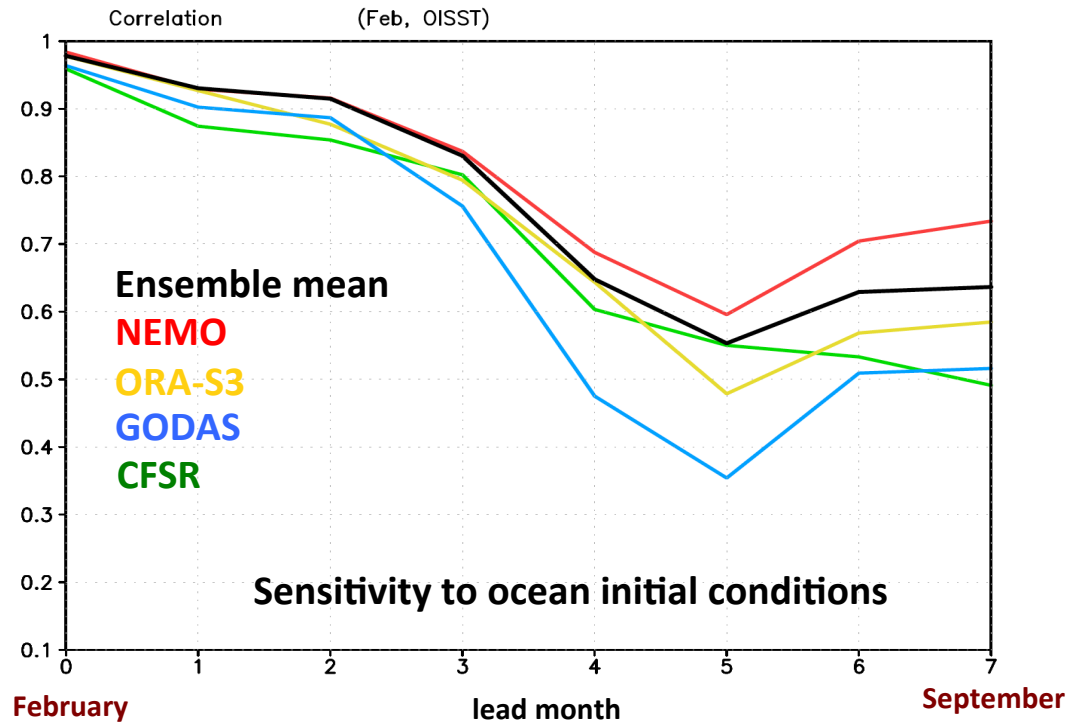


# Indian GDP: Agriculture, Industry, Services

Sectorwise contribution of GDP of India (1950-2014)

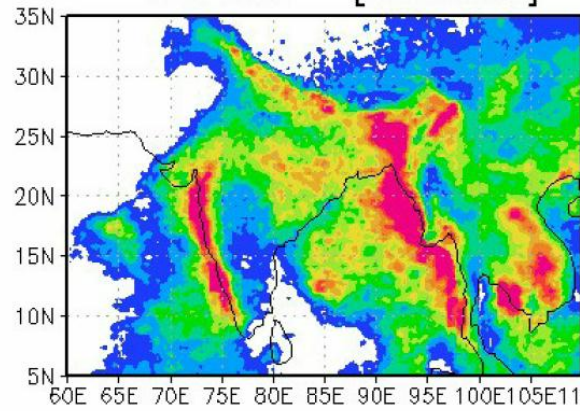


## CFSv2 Prediction skill of Nino3.4 SSTA (1982-2008)

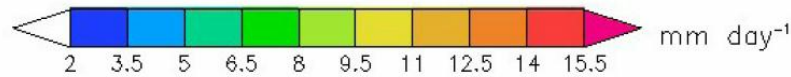
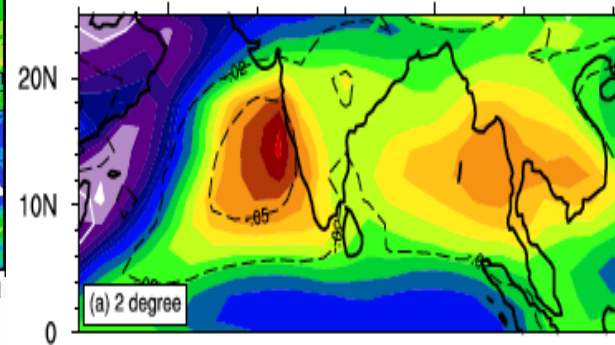


# Monsoon Rainfall in Low Resolution Model

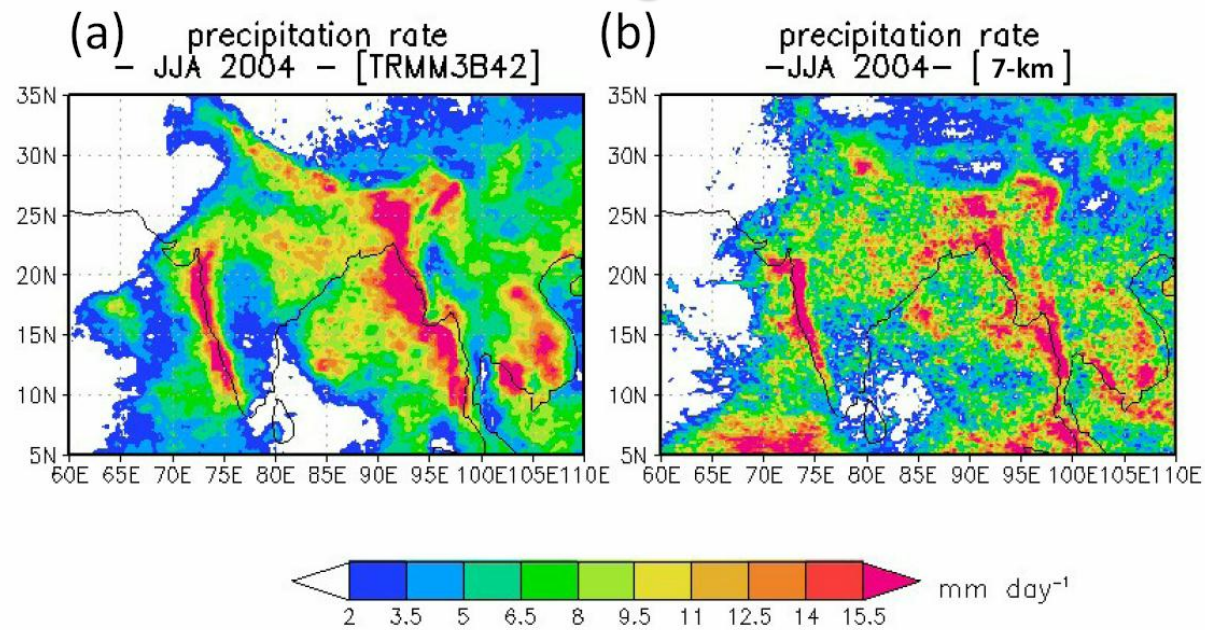
(a) precipitation rate  
- JJA 2004 - [TRMM3B42]



(b) Coupled model (2 degree)  
- Climatology -

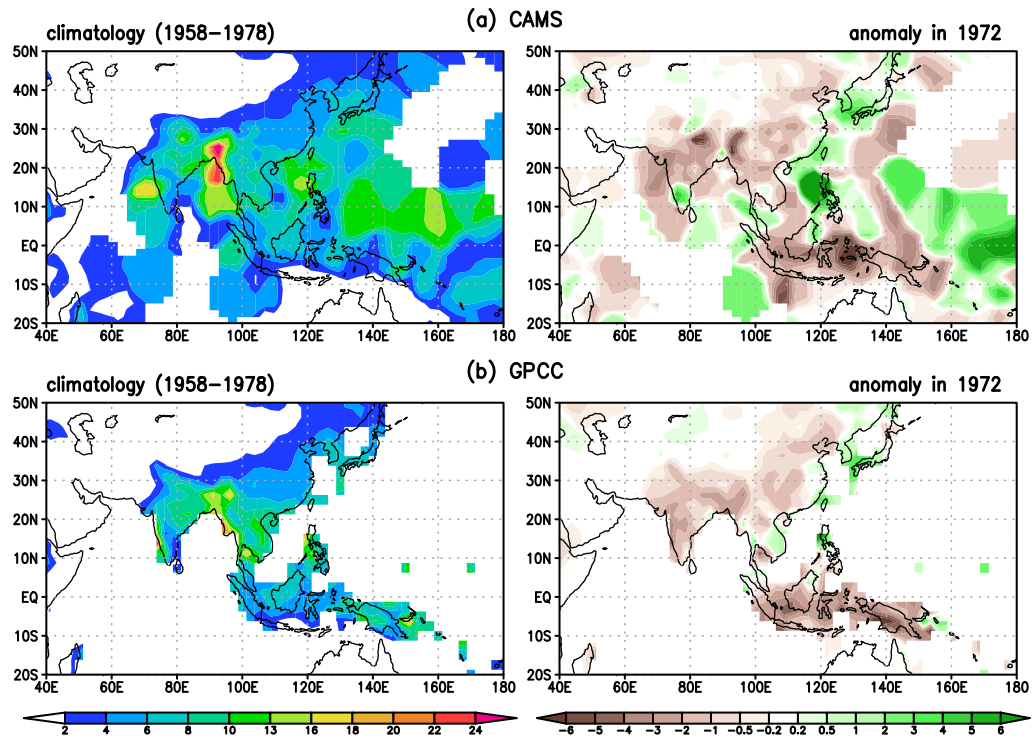


## Monsoon Rainfall in High Resolution Model

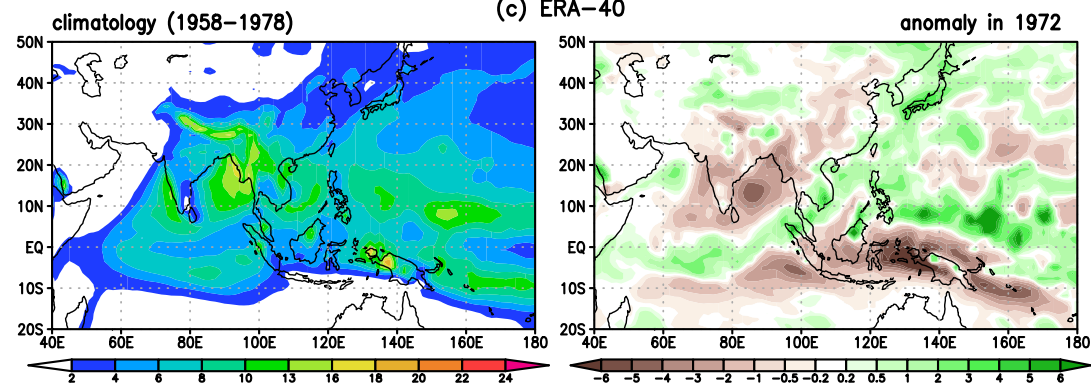


*Oouchi et al. 2009*: (a) Observed and (b) simulated precipitation rate over the Indo-China monsoon region as June-July-August average (in units of mm day<sup>-1</sup>). The observed precipitation is from TRMM\_3B42, and the simulation is for 7km-mesh run.

Observed JJAS mean rainfall [mm/day]



Observed JJAS mean rainfall [mm/day]

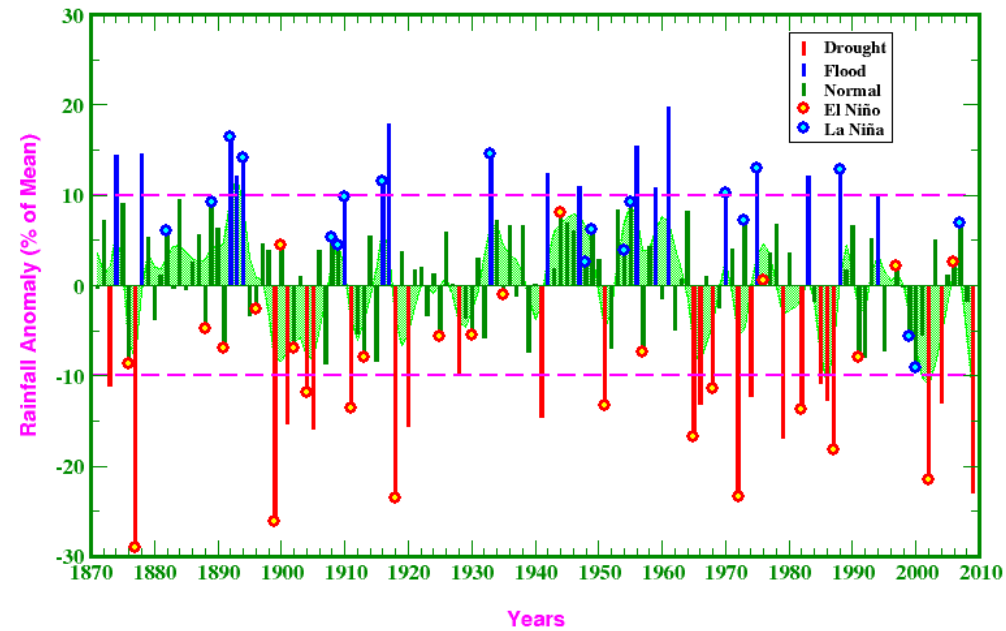


# All-India Summer Monsoon Rainfall (1871-2009)

(based on IITM homogeneous Indian Monsoon Rainfall dataset)

## All-India Summer Monsoon Rainfall, 1871-2009

(Based on IITM Homogeneous Indian Monthly Rainfall Data Set)



This figure shows the time series evolution of AISMR anomalies, expressed as percent departures from its long-term mean.

Center of Ocean-Land-  
Atmosphere studies





## PERSISTENCE OF RAINFALL IN ANOMALOUS MONSOON SEASONS

(a) ALL-INDIA RAINFALL

Heavy Rain Years					Deficient Rain Years						
Year	Total	Jun	Jul	Aug	Sep	Year	Total	Jun	Jul	Aug	Sep
1874	1.46	1.76	0.89	-0.26	0.93	1873	-1.13	-1.38	-0.27	-0.76	-0.14
1878	1.48	-0.90	0.54	2.49	1.09	1877	-2.96	-0.58	-3.21	-2.25	-0.60
1892	1.66	-0.15	1.08	1.63	1.12	1899	-2.66	0.87	-2.35	-2.58	-1.82
1893	1.23	2.14	-0.48	-0.33	1.44	1901	-1.55	-1.33	-1.41	0.40	-1.20
1894	1.42	1.46	1.01	-0.05	0.82	1904	-1.21	0.44	-0.73	-1.21	-1.18
1916	1.17	0.98	-0.44	1.20	0.86	1905	-1.62	-1.99	-0.78	-1.00	0.10
1917	1.81	1.39	-0.75	0.83	2.56	1911	-1.38	0.79	-3.29	-0.85	0.22
1933	1.47	1.06	-0.47	1.74	0.93	1918	-2.40	0.49	-3.56	-0.60	-1.72
1942	1.26	0.28	1.31	0.97	0.26	1920	-1.59	-0.57	0.47	-2.10	-1.29
1947	1.11	-1.11	0.45	1.37	1.71	1928	-1.01	-0.26	0.25	-1.18	-1.03
1956	1.56	1.22	1.83	0.27	0.24	1941	-1.48	0.02	-1.53	-0.88	-0.92
1959	1.09	-0.17	1.27	0.17	1.18	1951	-1.35	-0.23	-0.54	-0.93	-1.30
1961	2.00	0.64	1.14	0.79	1.91	1965	-1.70	-1.45	-0.20	-1.41	-0.74
1970	1.04	1.30	-1.40	1.44	0.96	1966	-1.34	0.06	-1.00	-1.18	-0.86
1975	1.32	0.46	0.43	0.55	1.50	1968	-1.17	-0.74	0.39	-1.27	-0.95
1983	1.23	-0.70	-0.02	1.30	2.11	1972	-2.38	-1.12	-2.46	-0.68	-1.10
1988	1.30	-0.19	1.33	0.85	0.91	1974	-1.24	-1.57	-0.02	-0.40	-0.81
1994	1.02	1.42	1.14	0.57	-0.79	1979	-1.72	-0.55	-1.32	-1.16	-0.83
						1982	-1.40	-0.93	-1.58	0.65	-1.32
						1985	-1.10	-0.63	-0.57	-0.65	-0.62
						1986	-1.30	0.38	-0.98	-0.78	-1.52
						1987	-1.85	-1.30	-1.84	-0.17	-0.88

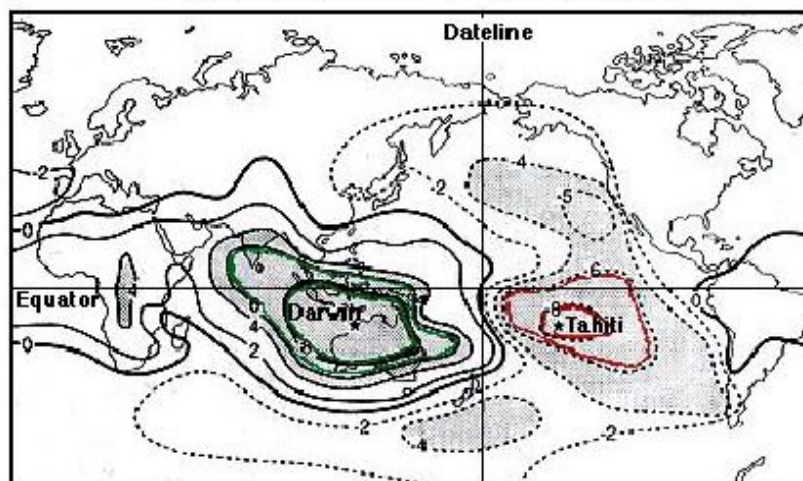
In either heavy or deficient rainfall years (> 1sd), the monthly values tend to be either enhanced or depressed throughout the monsoon season



Sir Gilbert Walker  
1920s

## Discovering the Southern Oscillation

SOI: Tahiti and Darwin as "centers of action",  
mslp correlations between two locations



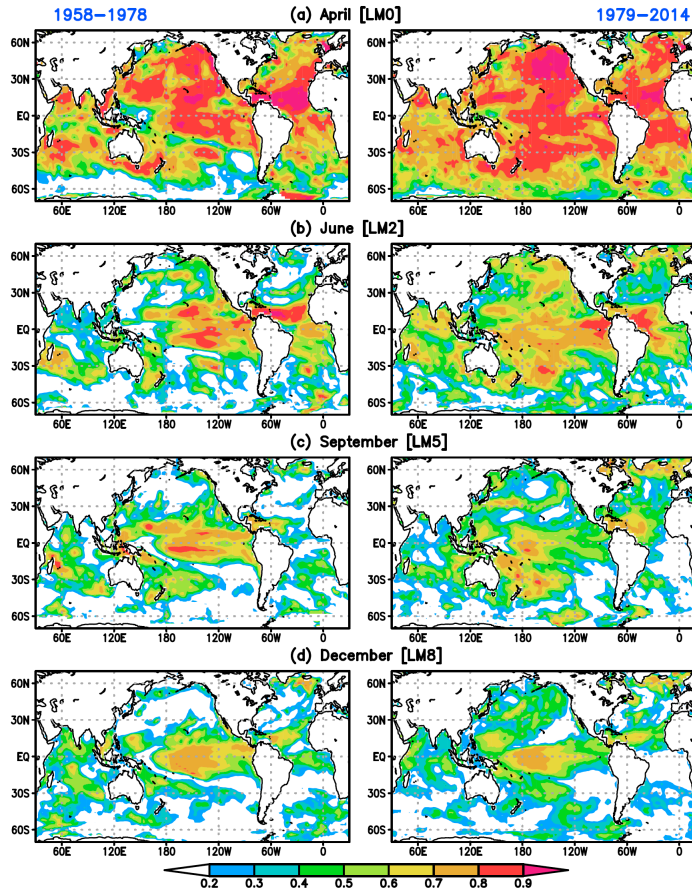
Tahiti and Darwin are at opposite ends of the Southern Oscillation's seesaw, and so the difference in pressure between them is used to measure the Southern Oscillation. The numbers represent a statistical measure called the correlation coefficient. The figure shows that the pressure variation at Tahiti is as closely related to Darwin as are locations near to Darwin, but with the opposite sign (i.e., if the Pressure is high at Darwin, it is low at Tahiti and vice versa). (After Rasmusson, 1984.)

# April IC

1958-1978

1979-2014

Correlation skill of CFSv2 reforecast SST (Apr. IC)



Quick decrease of skill in extra-tropics

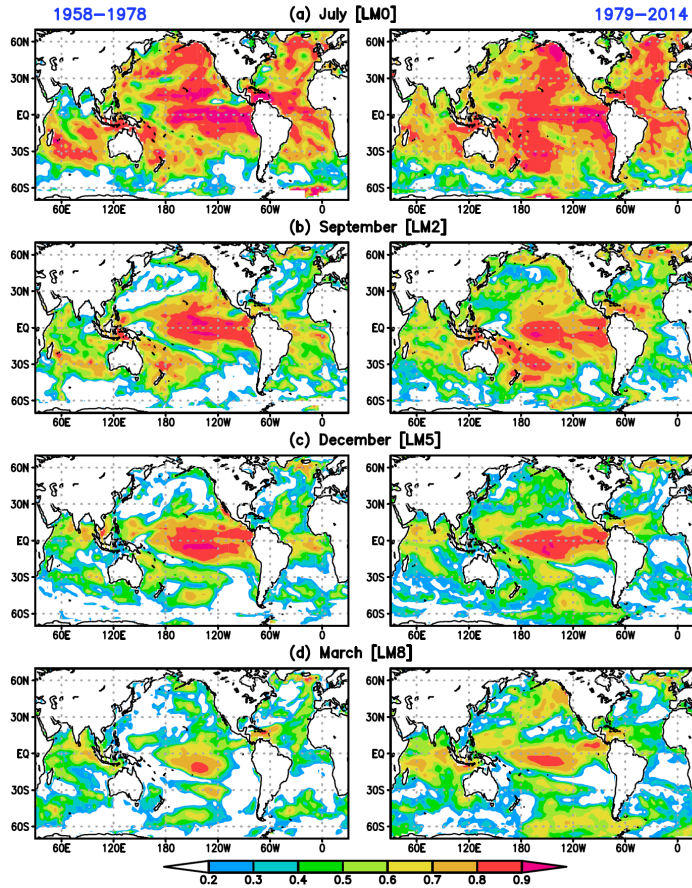
Verified against  
ERSSTv3

# July IC

1958-1978

1979-2014

Correlation skill of CFSv2 reforecast SST (Jul. IC)



Verified against  
ERSSTv3

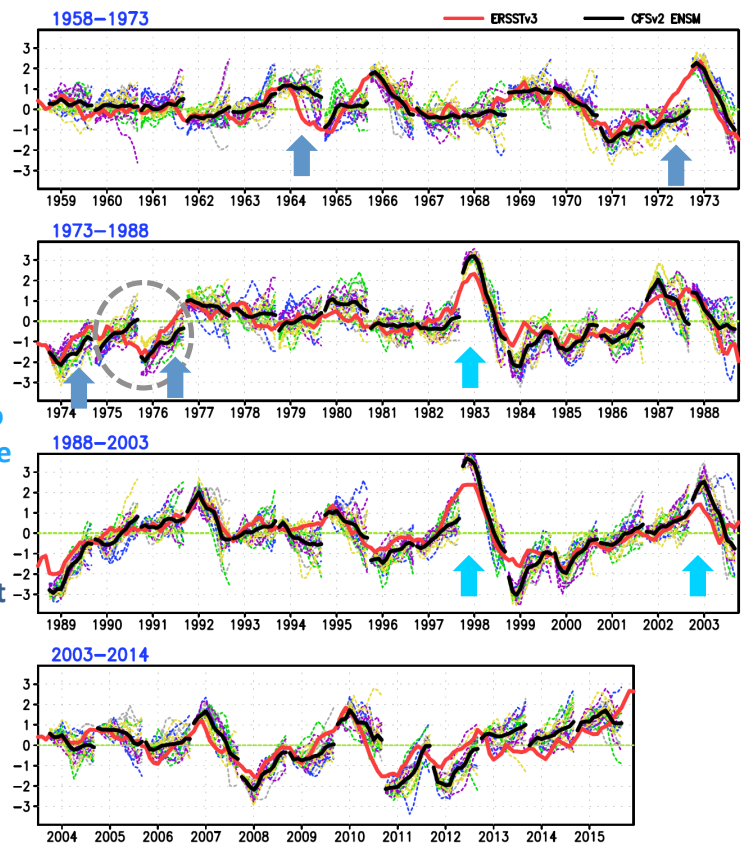
# Oct. IC

larger ensemble spread

Overshoot in El Niño peaks becomes more apparent

Model events persist longer in 1958-1978

57-yr (1958-2014) CFSv2 hindcast monthly Nino3.4 SSTA (Oct. IC)

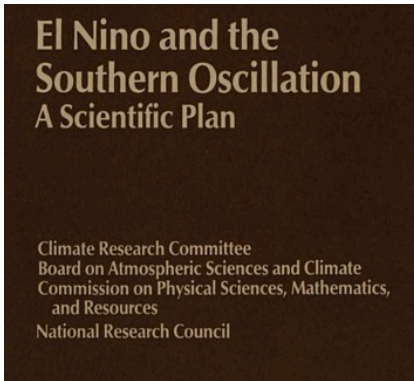


ERSSTv3

CFSv2 ENSM

Missed the cold event in 1975

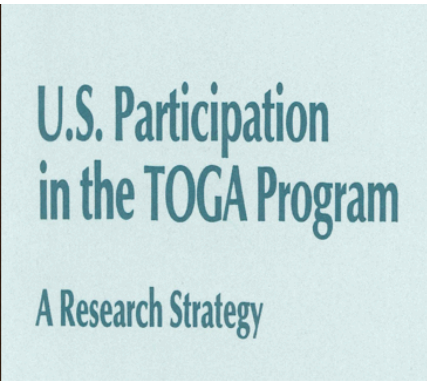




**El Nino and the Southern Oscillation**  
A Scientific Plan

Climate Research Committee  
Board on Atmospheric Sciences and Climate  
Commission on Physical Sciences, Mathematics,  
and Resources  
National Research Council

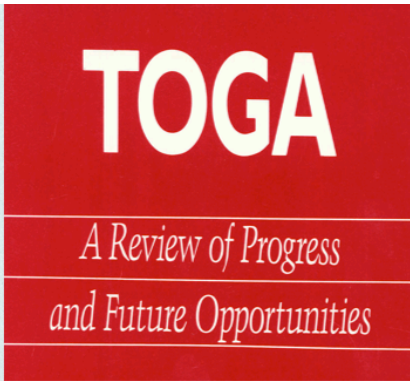
1983



**U.S. Participation  
in the TOGA Program**

*A Research Strategy*

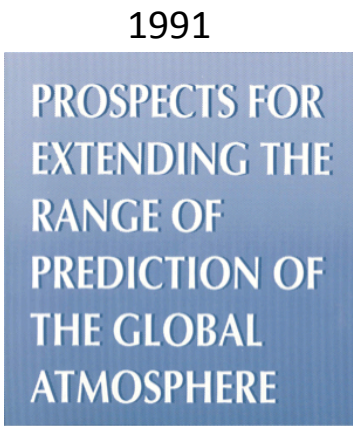
1986



**TOGA**

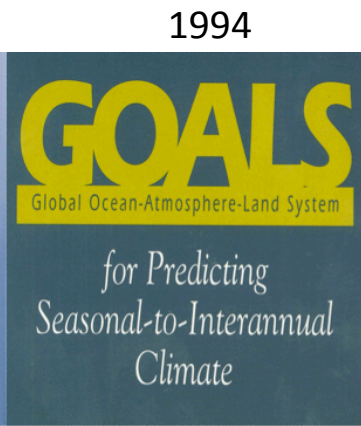
*A Review of Progress  
and Future Opportunities*

1990



**PROSPECTS FOR  
EXTENDING THE  
RANGE OF  
PREDICTION OF  
THE GLOBAL  
ATMOSPHERE**

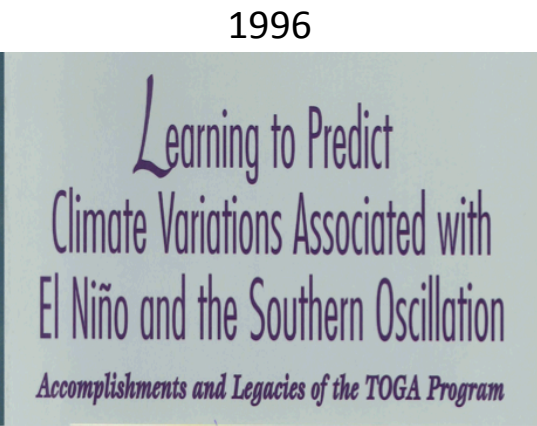
1991



**GOALS**  
Global Ocean-Atmosphere-Land System

*for Predicting  
Seasonal-to-Interannual  
Climate*

1994



*Learning to Predict  
Climate Variations Associated with  
El Niño and the Southern Oscillation*  
*Accomplishments and Legacies of the TOGA Program*

1996

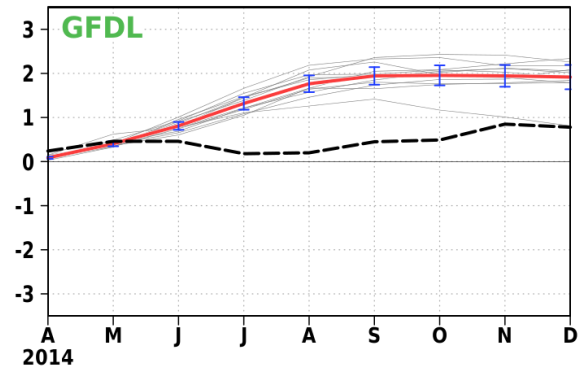
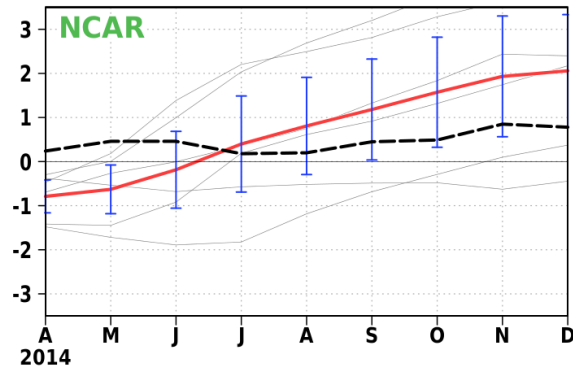
## Statement

In spite of a million fold increase in the computing power, and enhanced ocean observations since **TOGA**, there has not been any significant sustained improvement in the prediction of short-term **regional** climate variability by climate models.

**In Spite of Large Biases in Simulated SST,  
Predictions of SST Anomalies Have Some  
Skill  
In Some Cases**

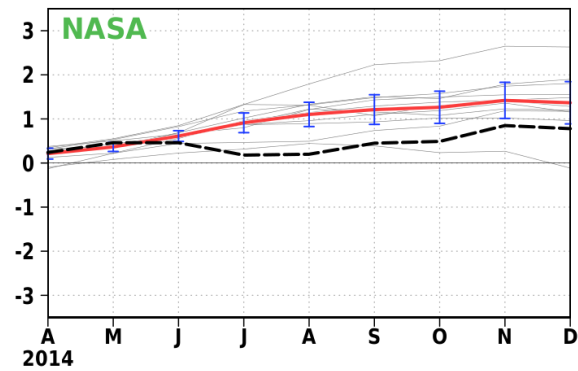
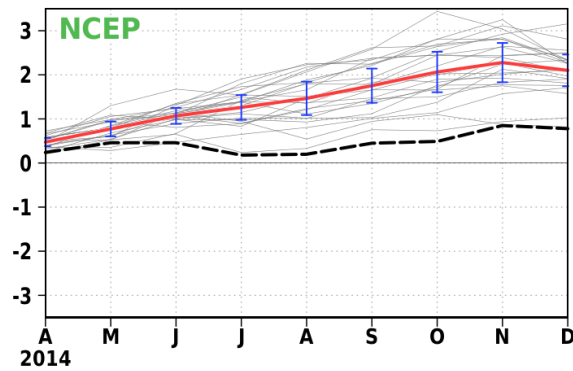


## Forecasts of Nino3.4 from April 2014 IC (Model Bias Removed)

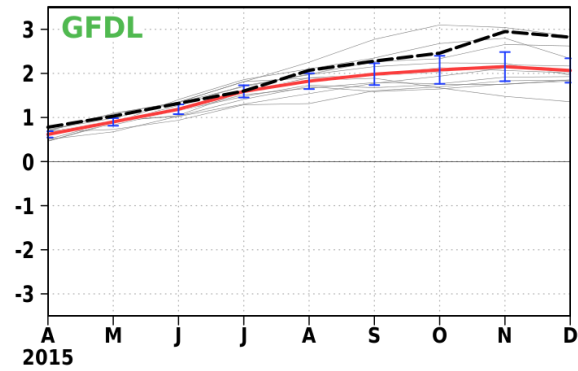
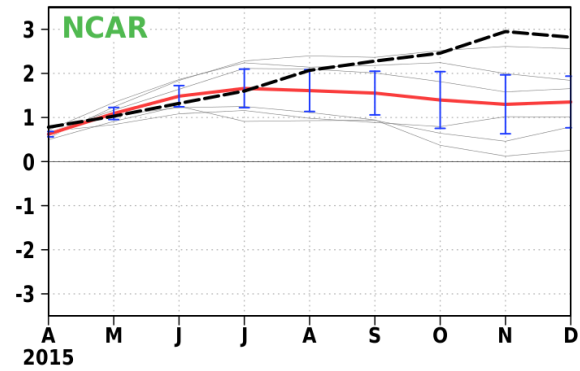


— Model Ensemble Mean

--- Observed Nino3.4 Anomaly

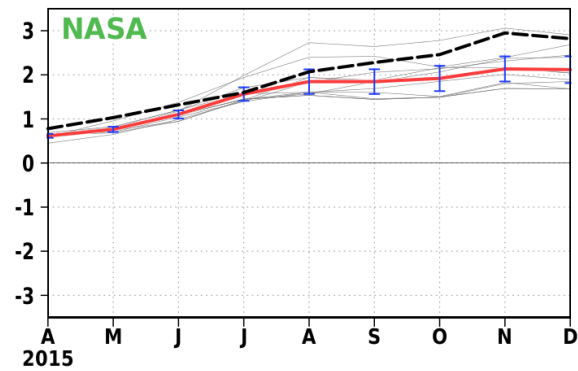
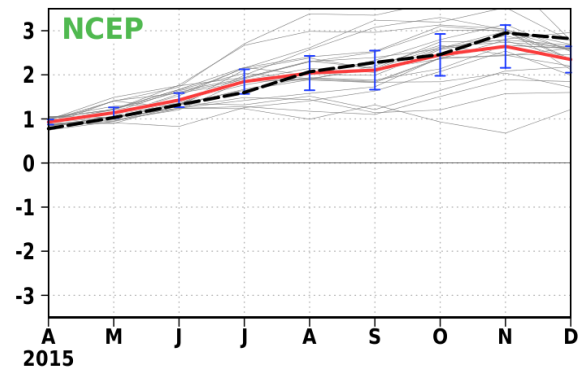


## Forecasts of Nino3.4 from April 2015 IC (Model Bias Removed)

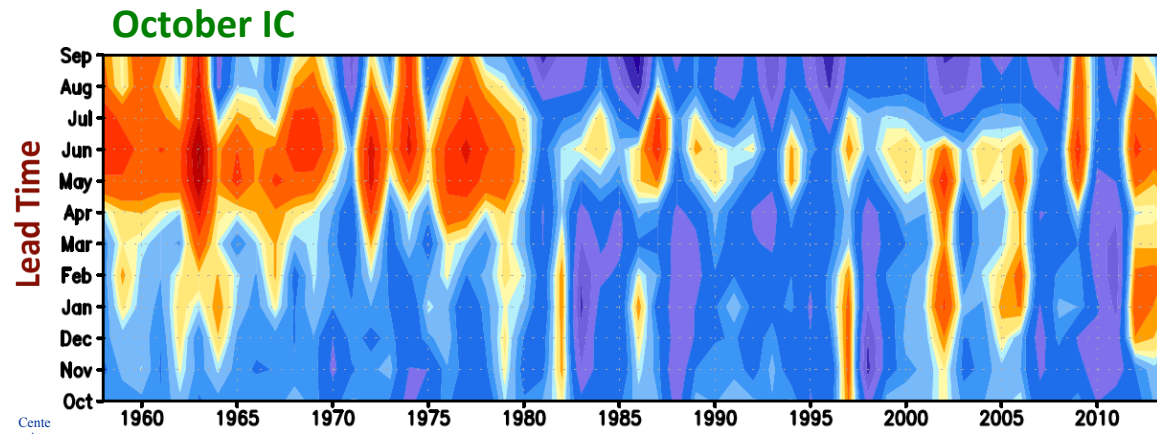
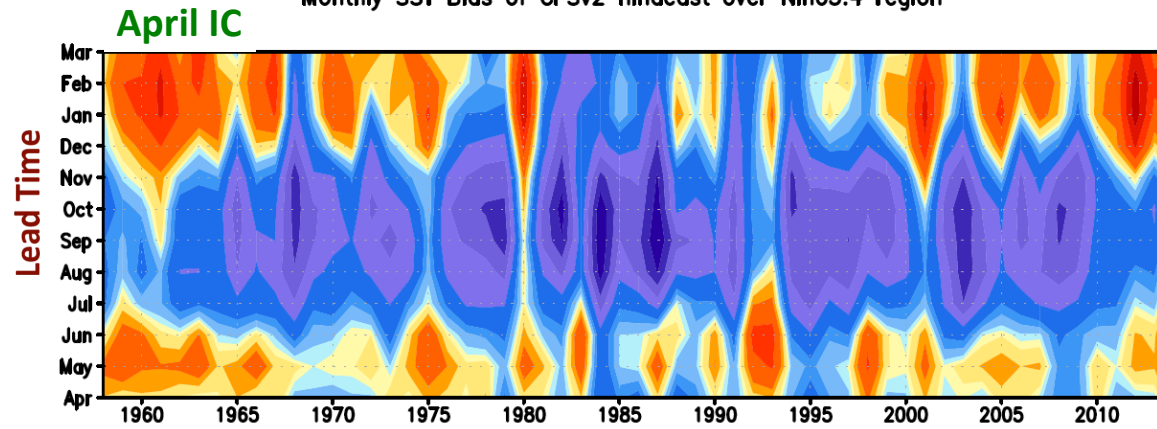


— Model Ensemble Mean

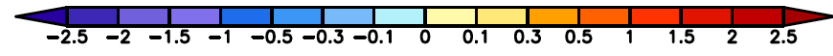
--- Observed Nino3.4 Anomaly



Monthly SST Bias of CFSv2 hindcast over Nino3.4 region



Center  
Atm



ORIG  
ON  
SITY

# Introduction

- **Scientific Basis for Dynamical Seasonal Prediction:**
  - **Atmospheric spectra is red ( $k^{-3}$ )** (Paradox: NWP vs. DSP)
    - Low-frequency planetary waves have the largest variance and largest contribution to time averages, and higher predictability
  - Surface boundary conditions (SST, SW, snow, etc.) produce predictable forced-response: ***Predictability in the Midst of Chaos***
  - In spite of large biases, climate models are realistic enough to predict anomalies (sometimes!) – ENSO forced monsoon rainfall anomalies
  - High predictability but low prediction skill
- **Challenges:**
  - Climate models have **“large”** biases and forced **response is not independent** of model bias
  - Model predictability depends on **model fidelity**
  - Improving model fidelity and enhancing predictive understanding requires **long-term, large, and stable** human and computational **resources**

# Assumptions (Myths?) about Climate Simulation and Prediction

## The Past:

1. Model response to external forcings (CO<sub>2</sub>, SST, etc.) does not depend on the model bias (model bias is subtracted out: forced run minus control run)
2. All models are equally good (model democracy)

## The Present

1. Model predictability depends on model fidelity
2. Towards a hypothetical perfect model
3. Estimate predictability using models of highest fidelity

*Myth: Widely held but false belief (Oxford dictionary)*

## Climate Model Fidelity and Predictability

Relative Entropy: The relative entropy between two distributions,  $p_1(x)$  and  $p_2(x)$ , is defined as

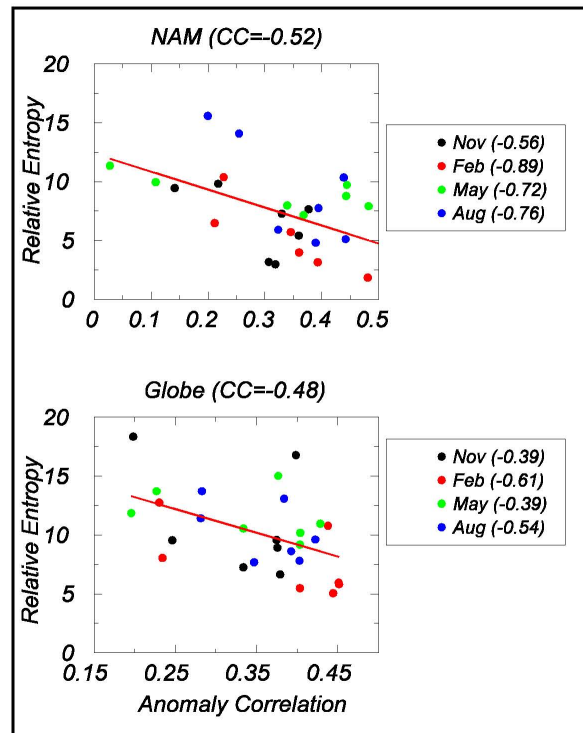
$$R(p_1, p_2) = \int_{\mathbb{R}^M} p_1 \log \left( \frac{p_1}{p_2} \right) dx \quad (1)$$

where the integral is a multiple integral over the range of the  $M$ -dimensional vector  $x$ .

$$R(p_1, p_2) = \frac{1}{2} \log \left( \frac{|\Sigma_2|}{|\Sigma_1|} \right) + \frac{1}{2} \text{Tr} \left\{ \Sigma_1 (\Sigma_2^{-1} - \Sigma_1^{-1}) \right\} + \sum_{k=1}^4 \frac{1}{2} (\mu_1^k - \mu_2^k)^T \Sigma_1^{-1} (\mu_1^k - \mu_2^k) \quad (2)$$

where  $\mu_j^k$  is the mean of  $p_j(x)$  in the  $k$ th season, representing the annual cycle,  $\Sigma_j$  is the covariance matrix of  $p_j(x)$ , assumed independent of season and based on seasonal anomalies. The distribution of observed temperature is appropriately identified with  $p_1$ , and the distribution of model simulated temperature with  $p_2$ .

# Fidelity vs. Skill



## Fidelity vs. Skill DEMETER 1980-2001 Seasonal Forecasts

7 models, 4 initial conditions

Lead Time = 0 months

Fidelity and Skill are related.

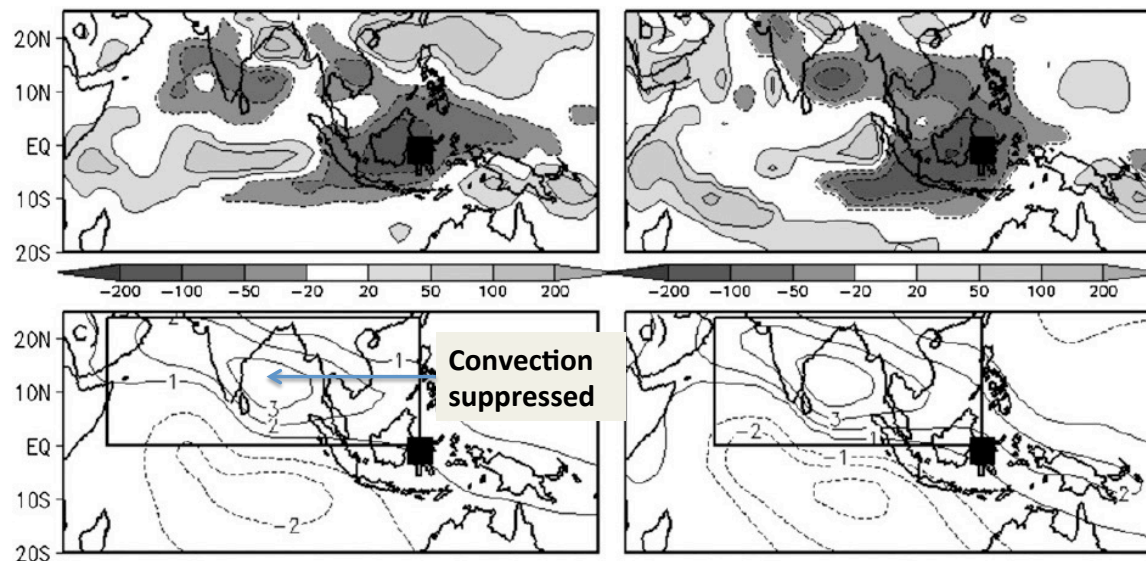
**Models with poor climatology tend to have poor skill.**

**Models with better climatology tend to have better skill.**

Courtesy of Tim DelSole

**AGCM ONLY**

**AGCM + Slab Ocean Model**



**Experiments from Jang and Straus with added cooling at 120°E.**

Top Row: Vertically Integrated Diabatic Heating ( $W/m^2$ )

Bottom Row: 850 hPa Streamfunction (units of  $10^6 m^2/s$ )

Jang, Y. and D. M. Straus, 2013: Tropical Stationary Wave Response to ENSO: Diabatic Heating Influences on the Indian Summer Monsoon. *J. Atmos. Sci.*, 30, 193-222.