

# Unraveling the Drivers of the Drought over São Paulo (Brazil) using HadAM3

Presented by

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Contributors

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# Outline

- Characterization of São Paulo droughts 2013/14 and 2014/15
- Limited analysis of possible causes using HadCM3 simulations
- Limited analysis of future repeatability of the events in a warming climate

# Empty Reservoirs



## Drought-Stricken Southeast Brazil Has Lost 15 Trillion Gallons of Water Per Year Since 2012



By **Mark Leberfinger**, AccuWeather.com Staff Writer  
November 12, 2015; 6:23 PM ET

The ongoing drought in southeast Brazil has cost the region 15 trillion gallons of water per year since 2012, according to the National Aeronautics and Space Administration (NASA).

**WORLD** BRAZIL

## A Megacity Without Water: São Paulo's Drought

**Jon Gerberg** @Jongerberg | Oct. 13, 2015

**Drought and bad management mean São Paulo is running out of water**

World / Brazil

## Drought drives water shortage to critical stage in Sao Paulo, Brazil

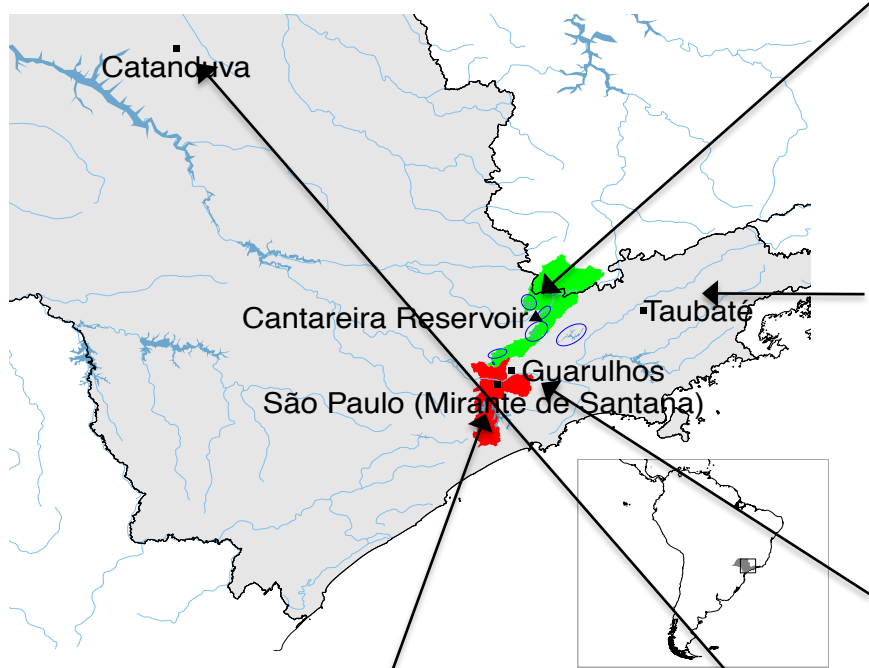
By **Claire Rigby**

AUGUST 19, 2015, 5:49 PM | REPORTING FROM SAO PAULO, BRAZIL

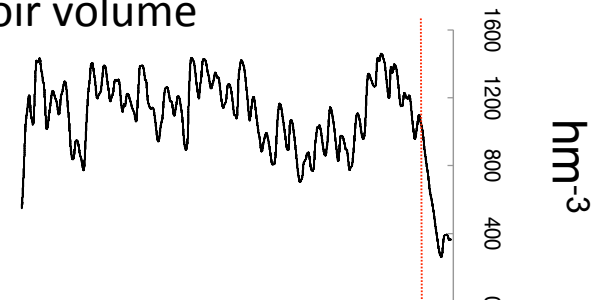
**O**fficials in Sao Paulo state have announced that the water shortage in the city of the same name is now "critical," with multimillion-dollar emergency construction projects so far failing to ease the situation.



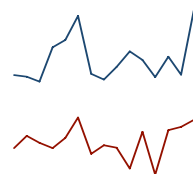
# Precipitation records – Cantareira Catchment



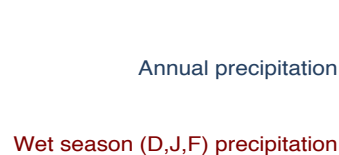
Cantareira reservoir volume



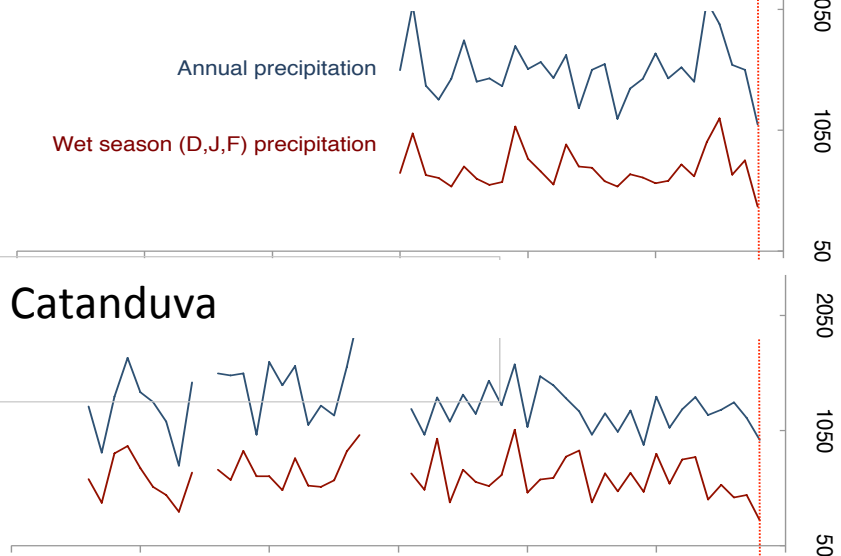
Taubate



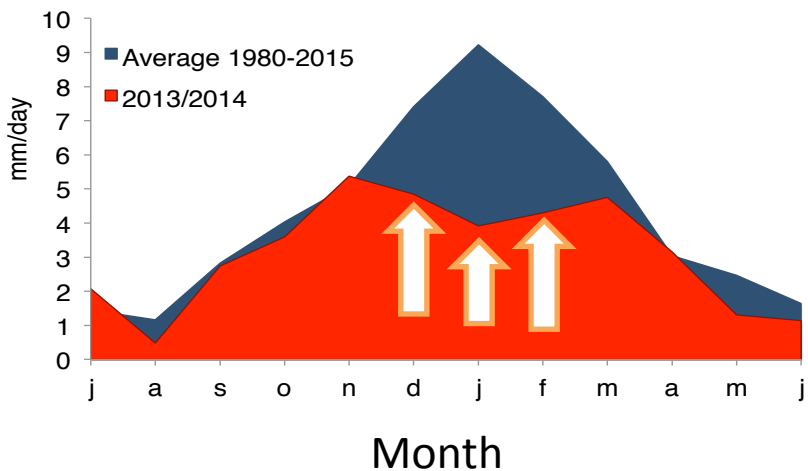
Guarulhus



Catanduva



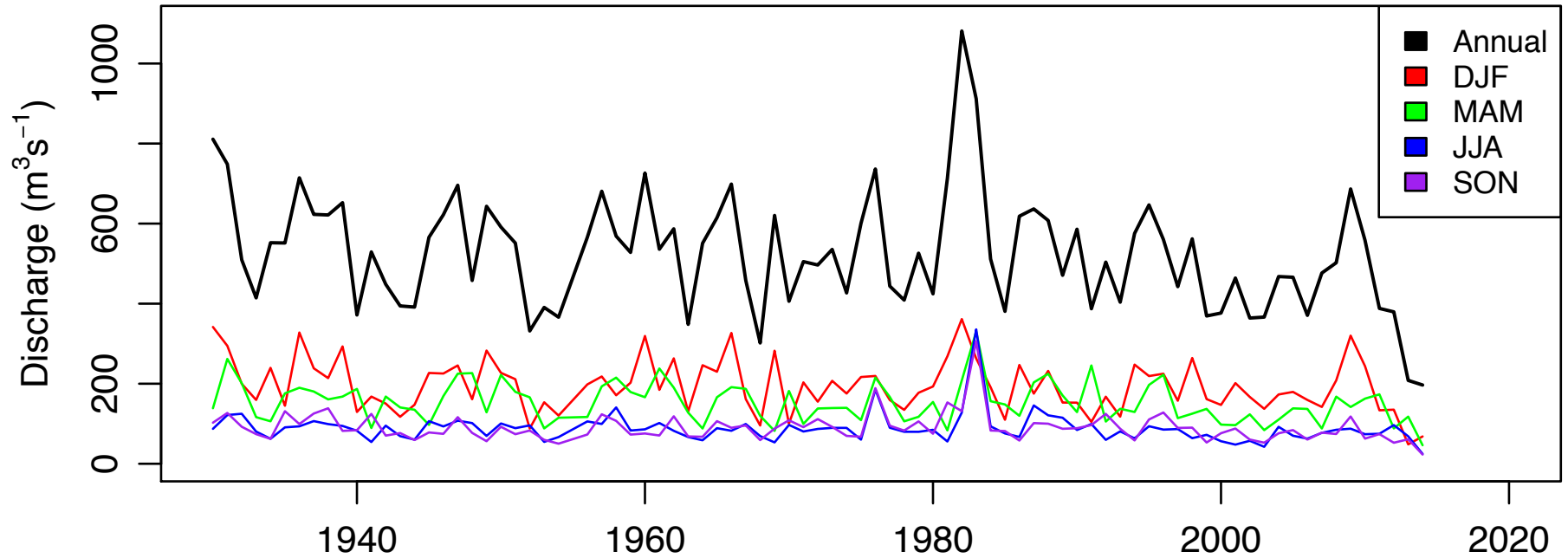
Monthly precipitation over Sao Paulo



hm<sup>3</sup>  
Precipitation (mm/year)

1955 1965 1975 1985 1995 2005 2014

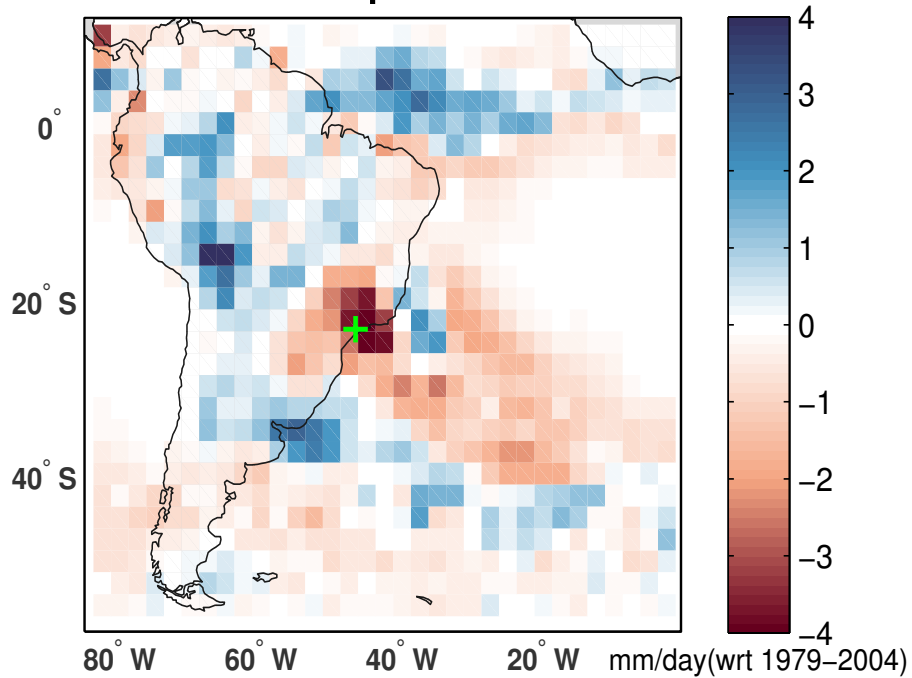
# Discharge of rivers feeding the Cantareira Reservoirs



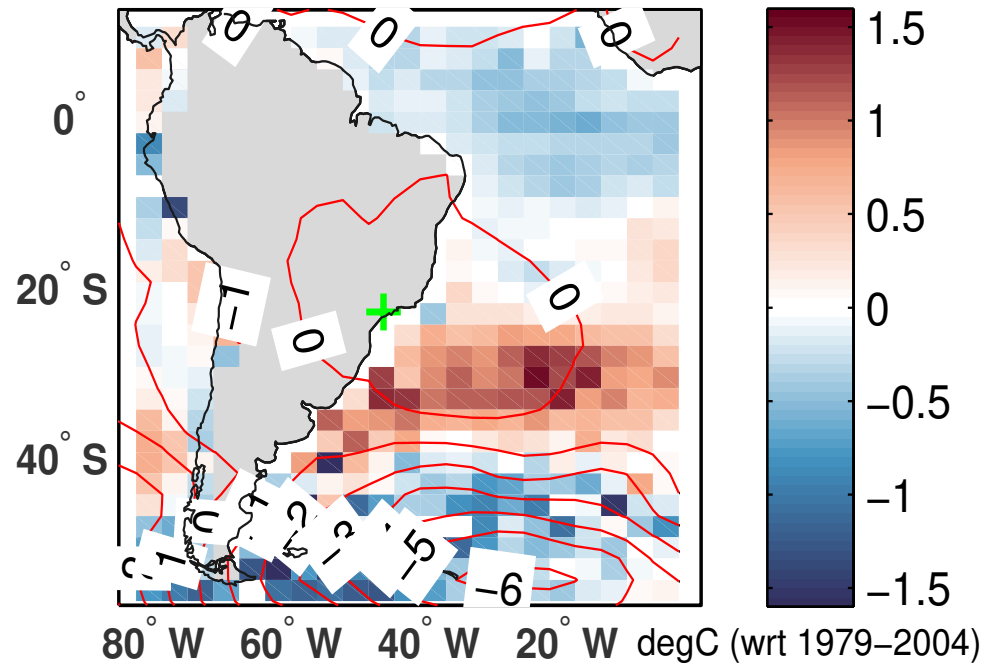
- Inflow has been much lower in 2013/14 and 2014/15 compared to earlier years

# Large scale Climate patterns – DJF 2013/14 anomalies

## GPCP Precipitation



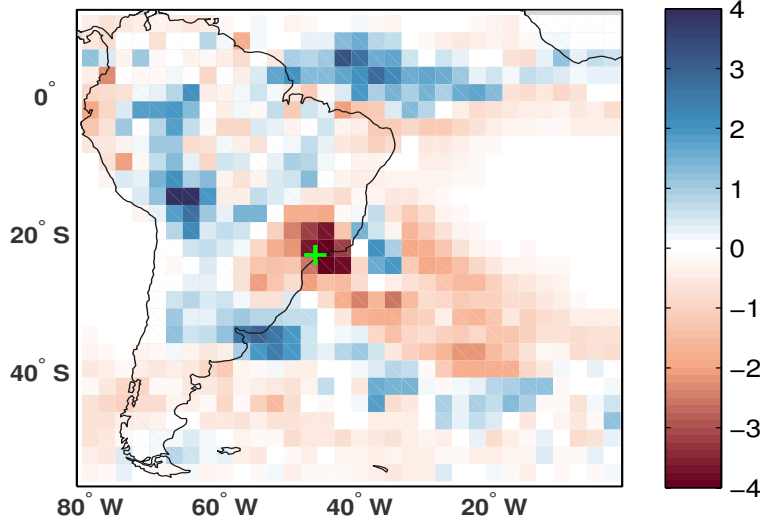
## ERA-Interim SST and SLP



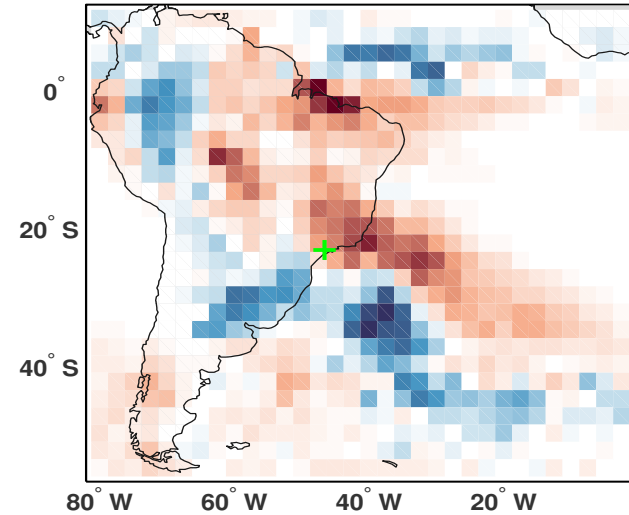
# Comparison 2013/14 and 2014/15

Precipitation Anomaly (mm/day)

2013-14 DJF (GPCP)

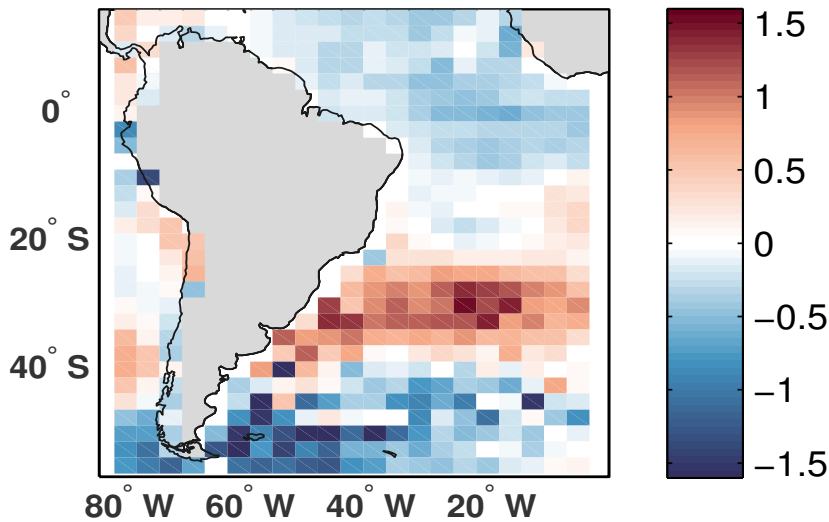


2014-15 DJF (GPCP)

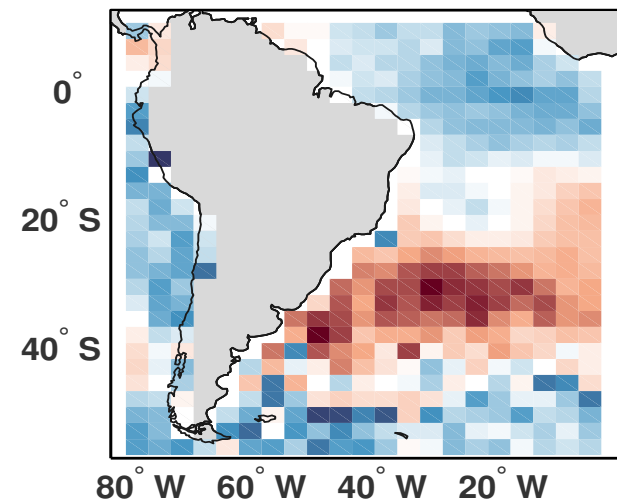


SST Anomaly (deg C)

2013-14 DJF (ERA Interim)



2014-15 DJF (ERA Interim)

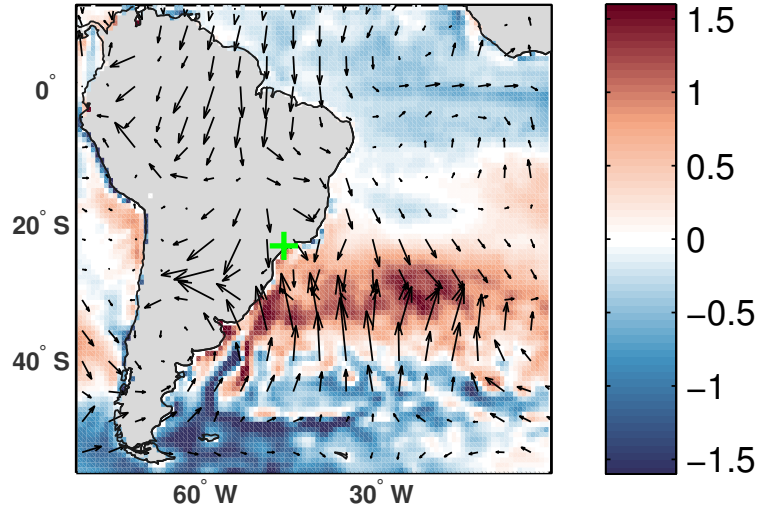


Large scale pattern of anomalies are very similar

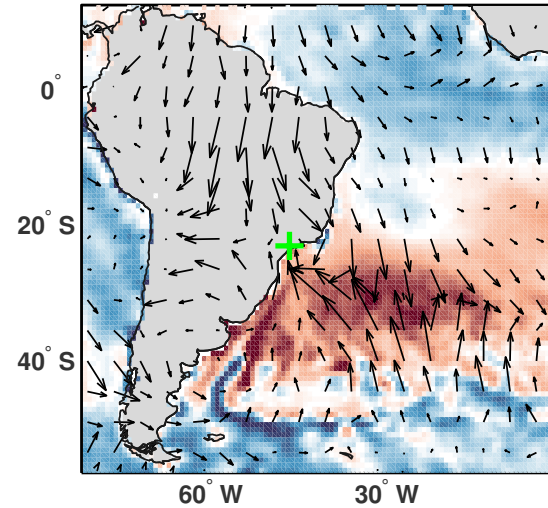
# Water vapour transport anomalies

SST (shaded) and Moisture Flux (vector) Anomaly

2013-14 DJF (ERA-INT)

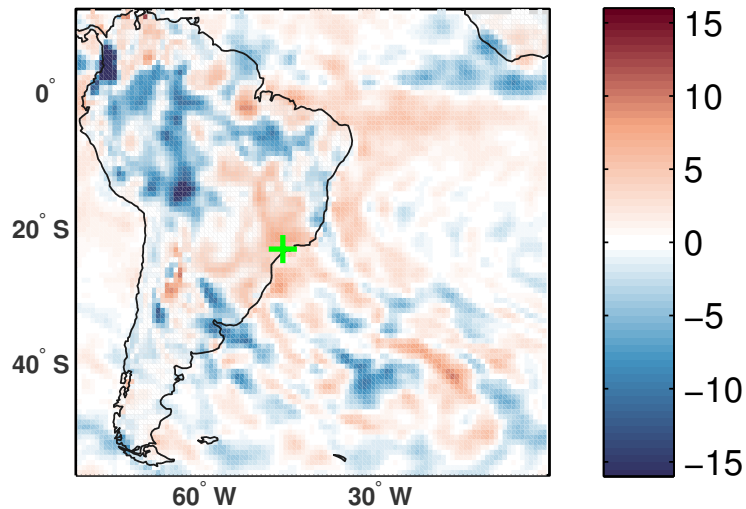


2014-15 DJF (ERA-INT)

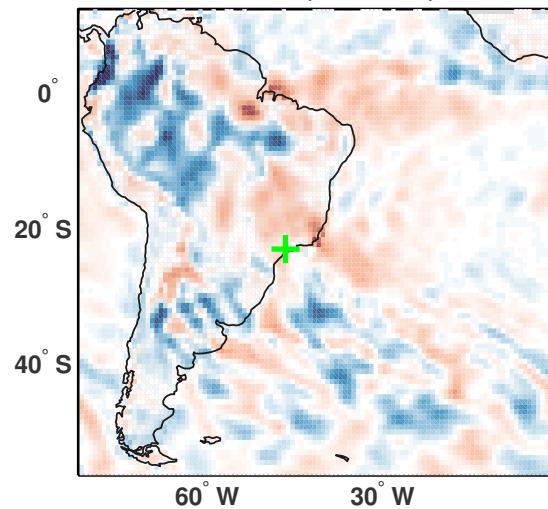


Moisture Flux Divergence

2013-14 DJF (ERA-INT)



2014-15 DJF (ERA-INT)





# What could be the causes ?

- Natural climate variation
- Amazon deforestation
- Global warming

## Should we expect more such events in the future ?

# Limited investigation of effect of deforestation using HadAM3 simulations

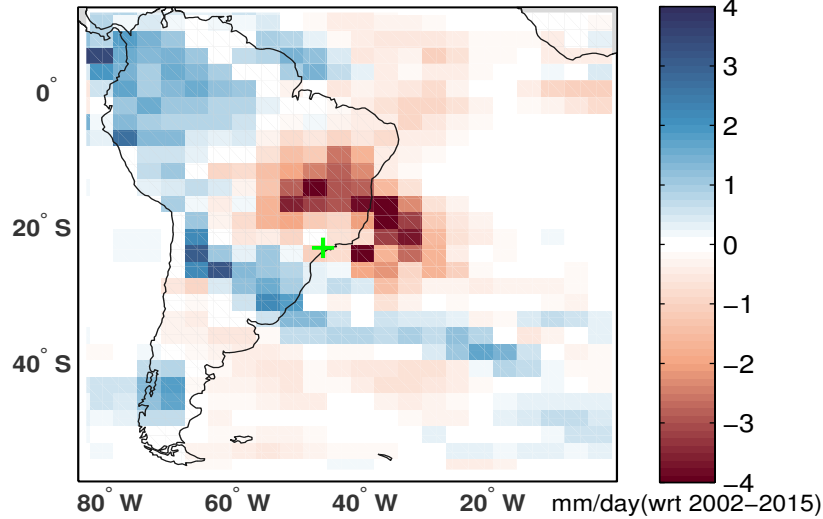
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## HadAM3 (atmospheric component of HadCM3)

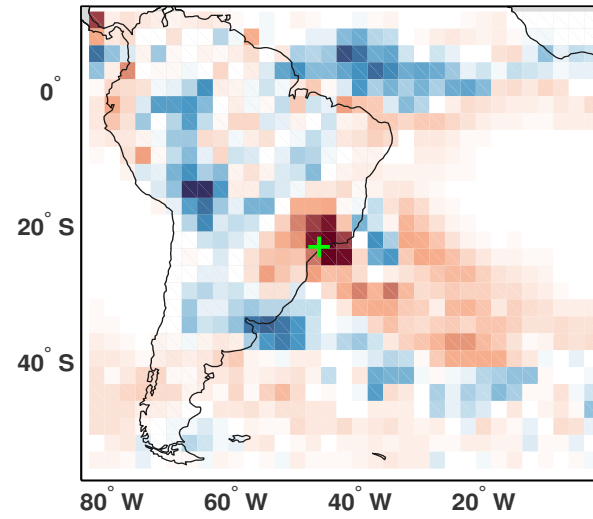
- Simulation period 1861-2014
- Prescribed observed SST's
- No deforestation
- No greenhouse gases added (i.e. constant greenhouse gas radiative forcing)

# Comparison Simulation results and Observations: 2013/14 DJF Precipitation Anomaly

HadAM3

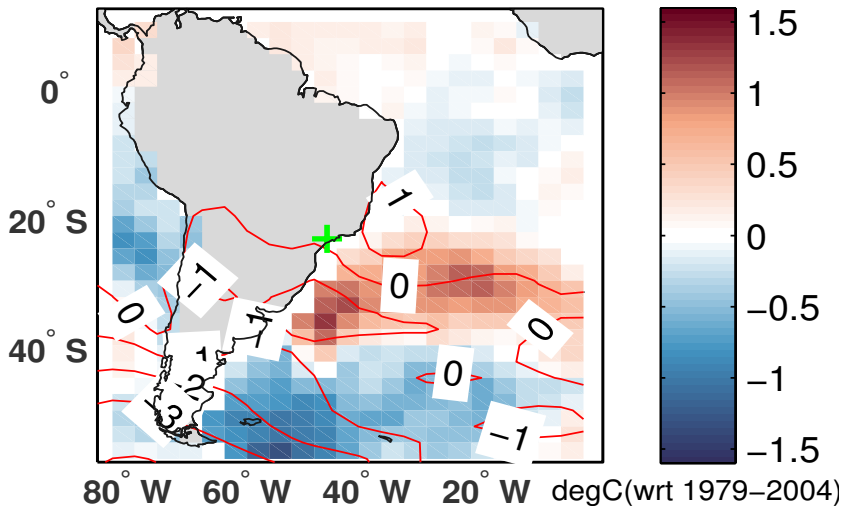


GPCP

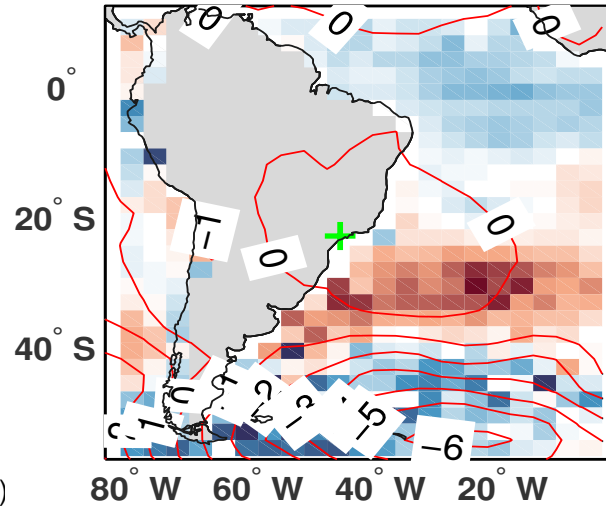


2013/14 DJF SST (shaded) and MSLP(contour) Anomaly

HadAM3



ERA-Interim

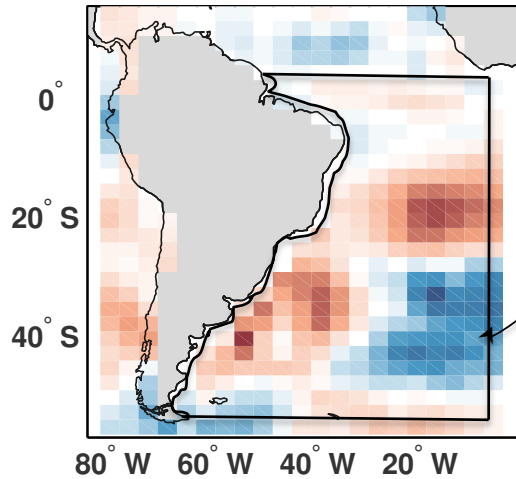


The simulation without Amazon deforestation still leads to deficient rainfall over Sao Paulo region in 2013/14. Thus deforestation may be the reason for such dry event.

# How unique is the climate anomaly?

## Pattern recognition algorithm

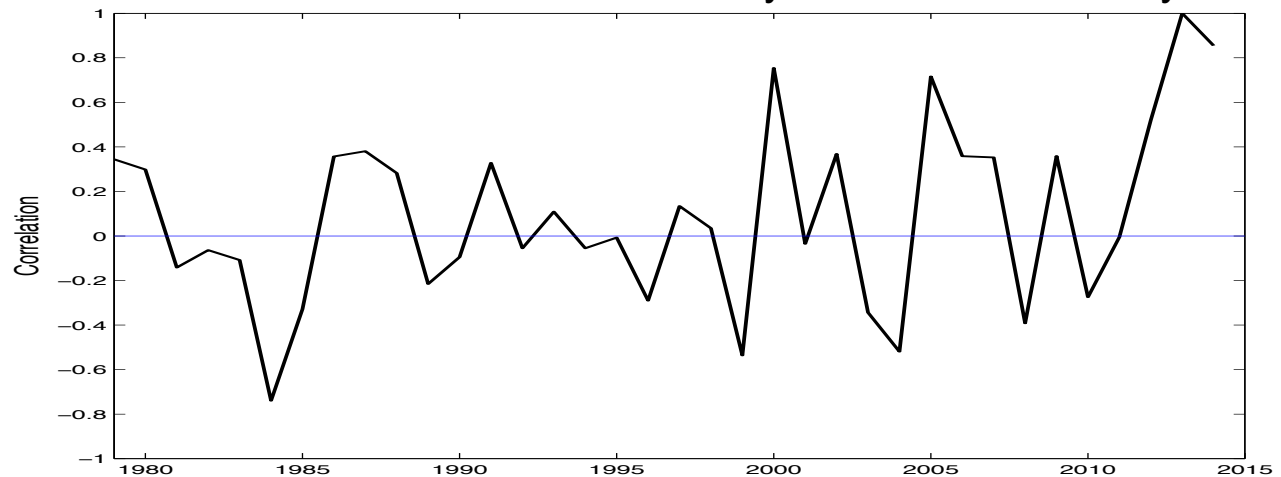
Order SST anomaly in box into a vector



$$\Delta SST_{2013/14}$$

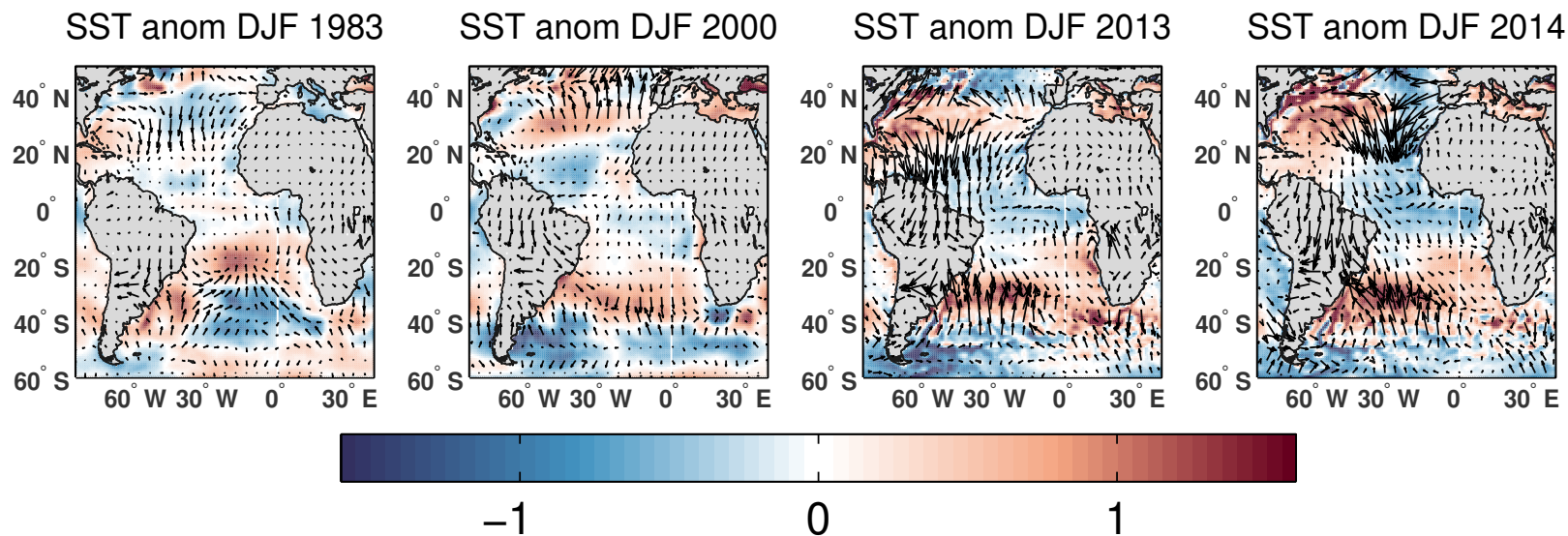
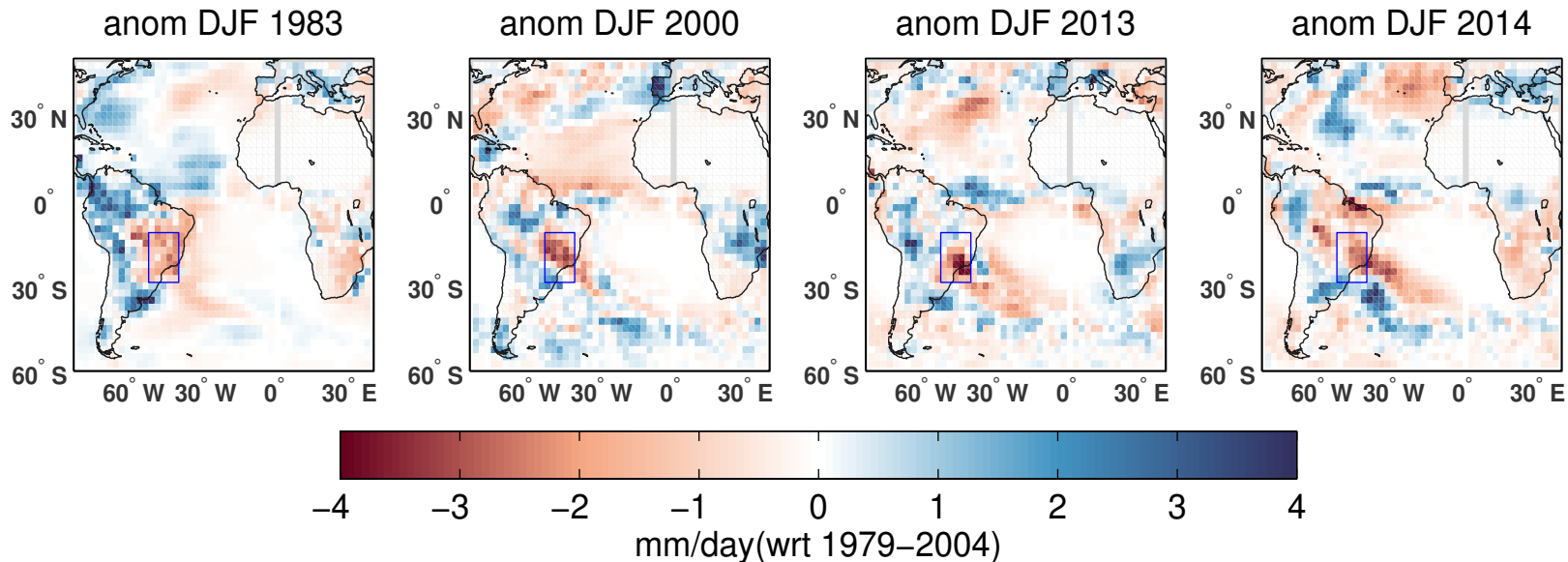
do the same for each other year and calculate correlation coefficient between the two

Pattern Correlation of SST anomaly 2013/14 with other years



# Testing the Pattern Recognition Algorithm

## Highest Correlated Years



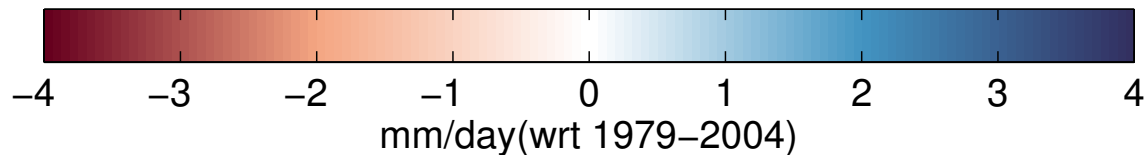
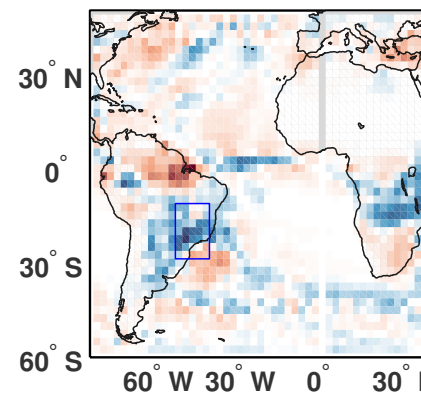
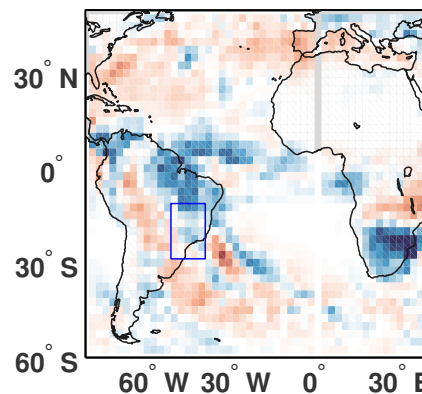
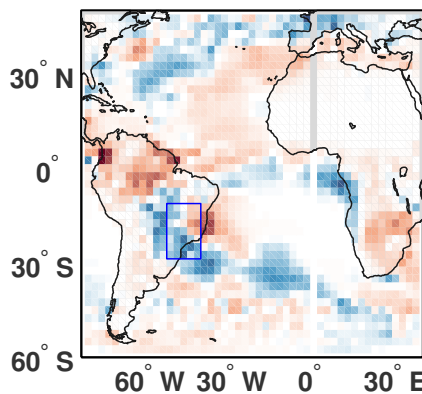
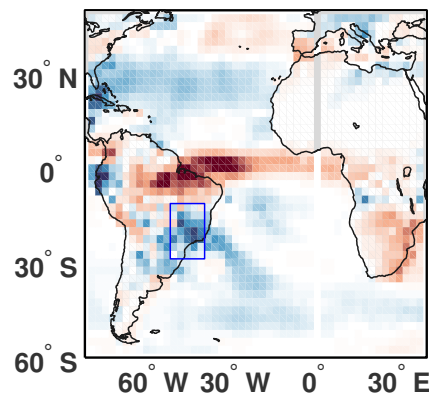
# Least Correlated Years

anom DJF 1982

anom DJF 1994

anom DJF 1999

anom DJF 2006

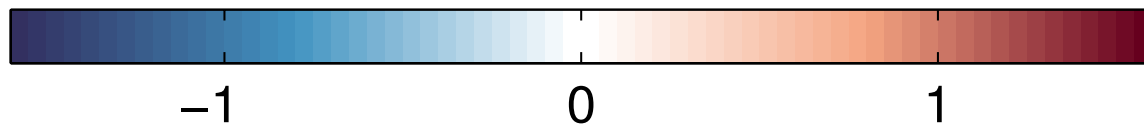
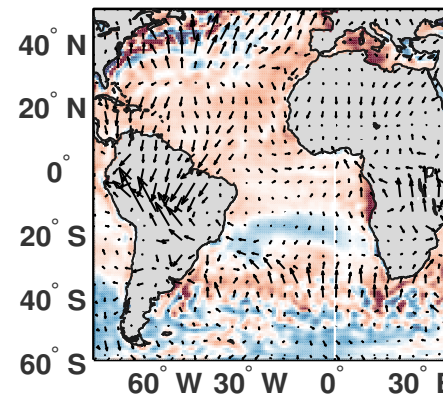
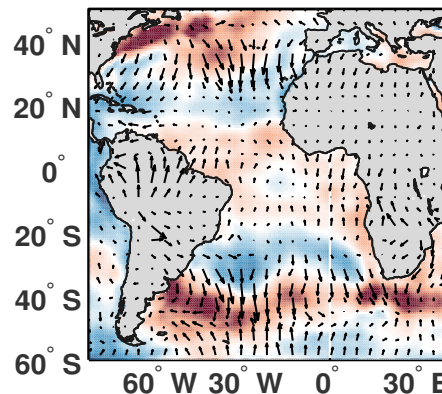
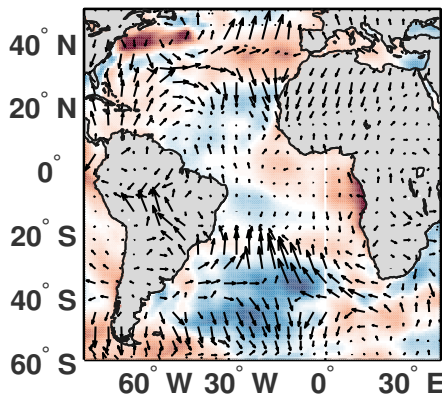
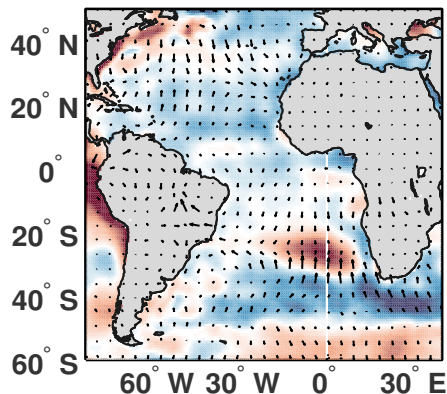


SST anom DJF 1982

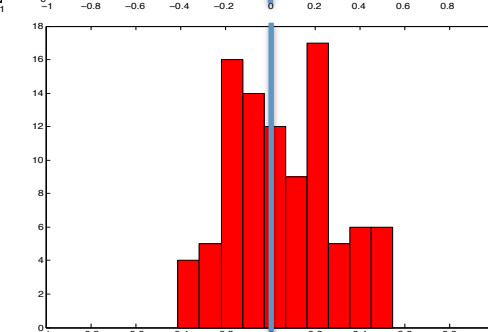
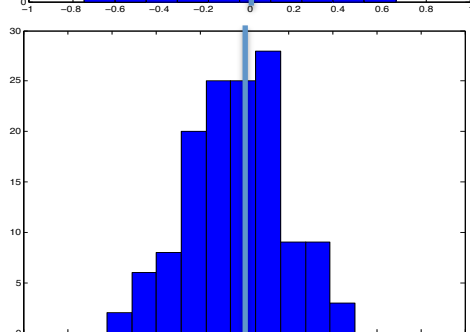
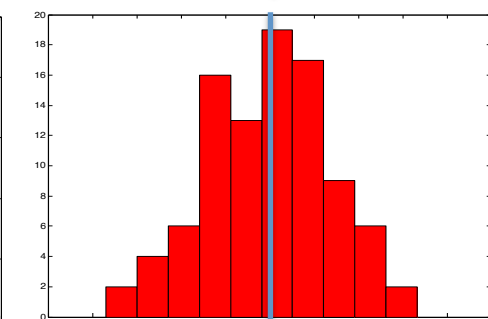
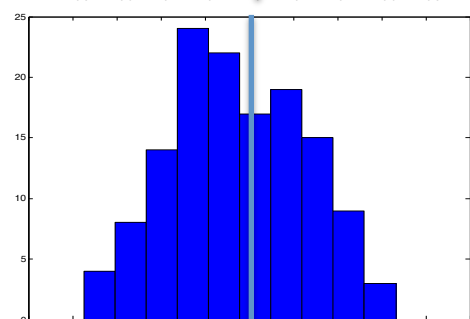
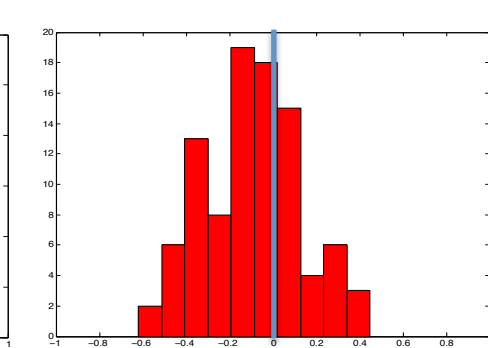
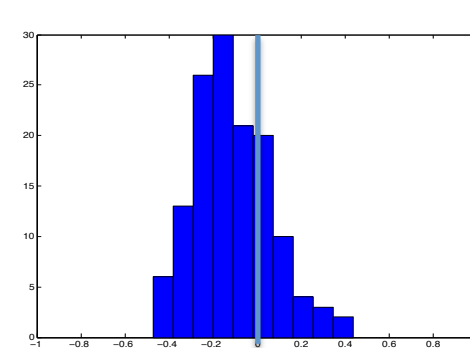
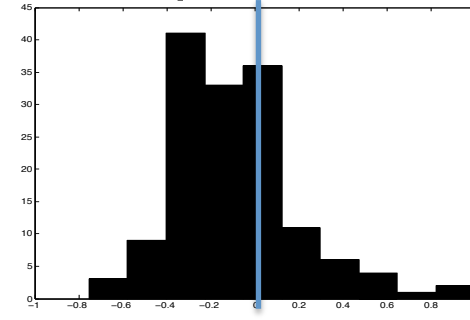
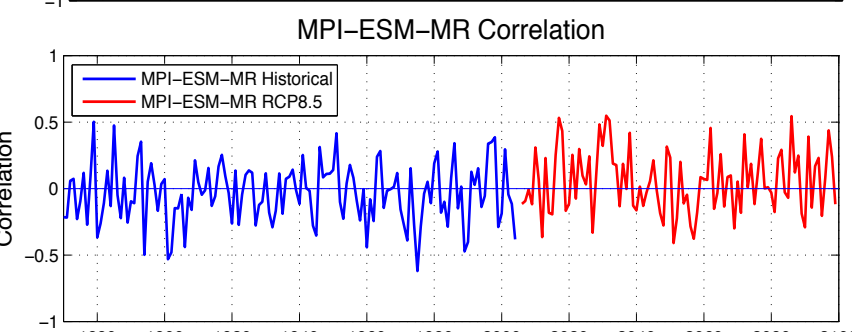
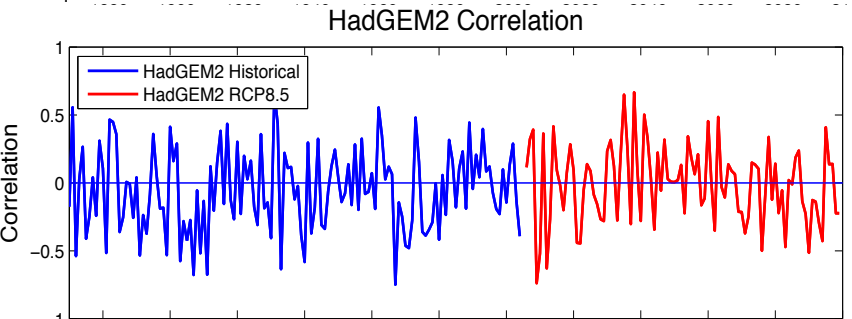
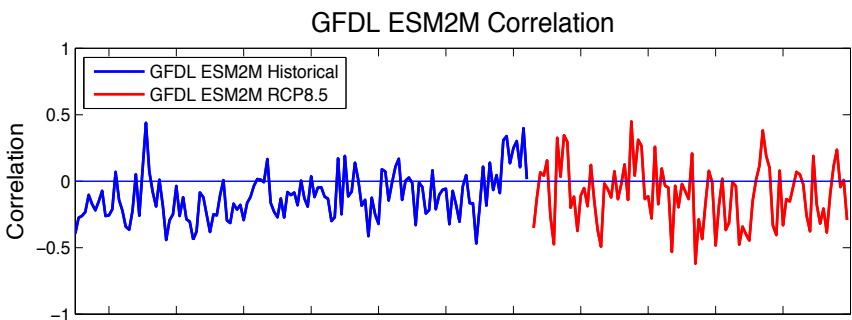
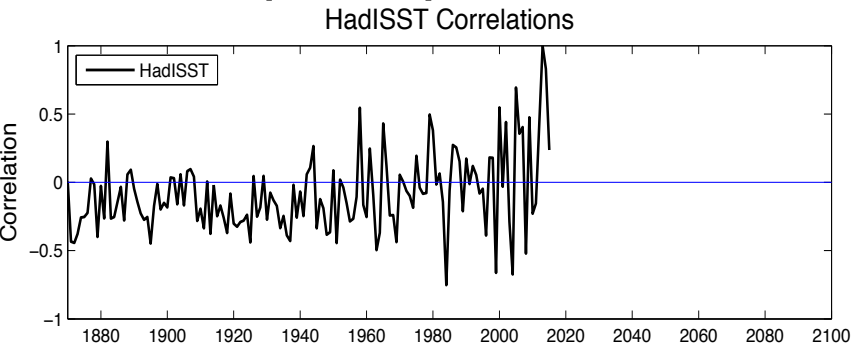
SST anom DJF 1994

SST anom DJF 1999

SST anom DJF 2006



# Frequency of such events in the past and future



Precipitation Frequency

-1 -0.8 -0.6 -0.4 -0.2 0 0.2 0.4 0.6 0.8 1

# Conclusions

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- The wet season 2013/14 and 2014/15 were anomalously dry and unprecedented in the historical record
- Positive SST anomalies and moisture convergence towards south of Sao Paulo causes the shifting of rainfall pattern to the south.
- Our limited analysis using a Climate model forced with observed SST suggests deforestation not the cause
- In the future there will likely be similar meteorological conditions but it seems there will be no increase in frequency



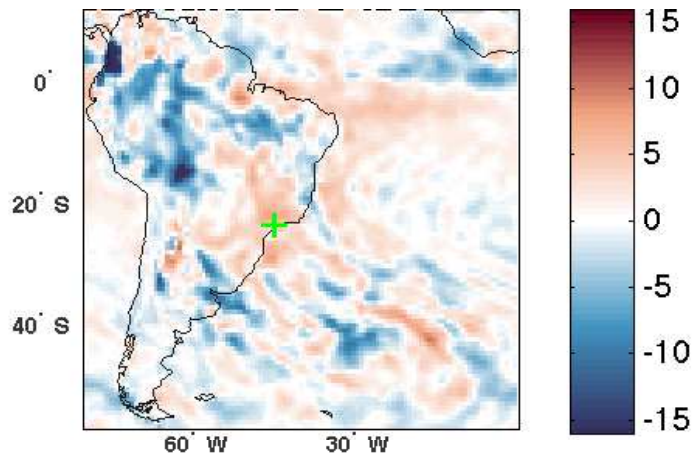
THANK YOU



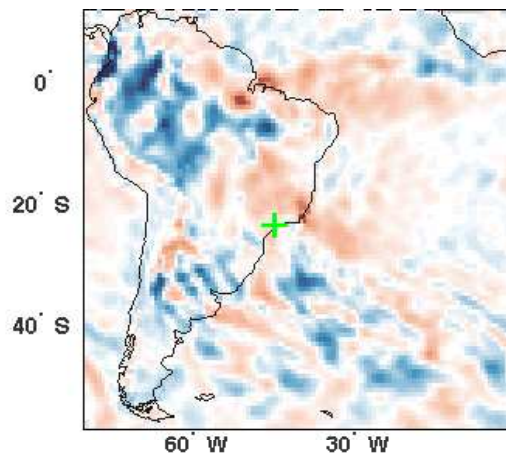
# Moisture Divergence

## Deficit Rainfall Years

2013-14 Divergence

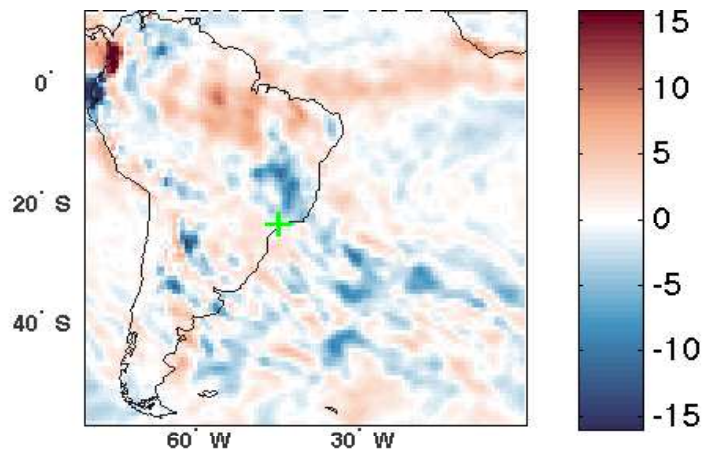


2014-15 Divergence

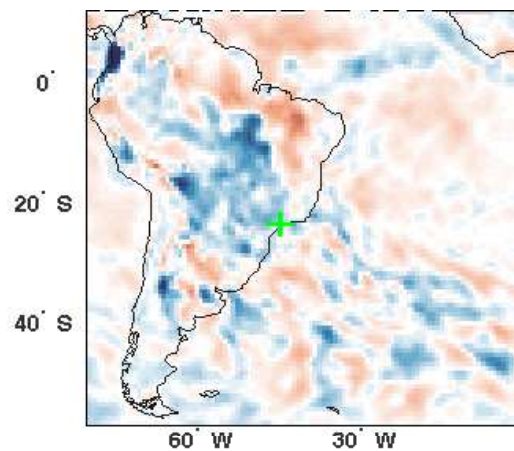


## Excess Rainfall Years

1982-83 Divergence

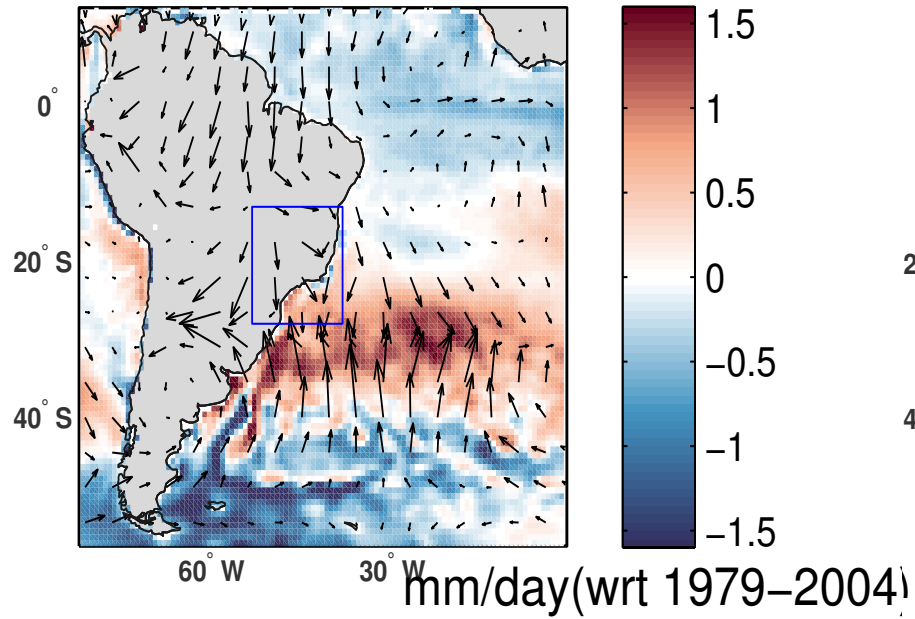


2006-07 Divergence

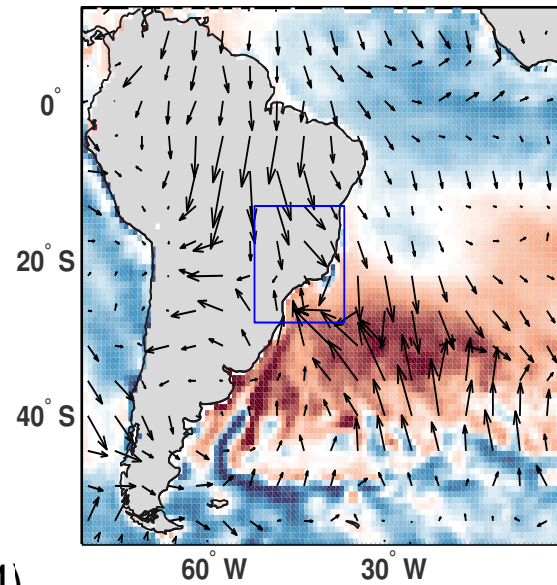


## SST (shaded) and Moisture Flux (vector) Anomaly

2013-14 DJF (ERA-Interim)

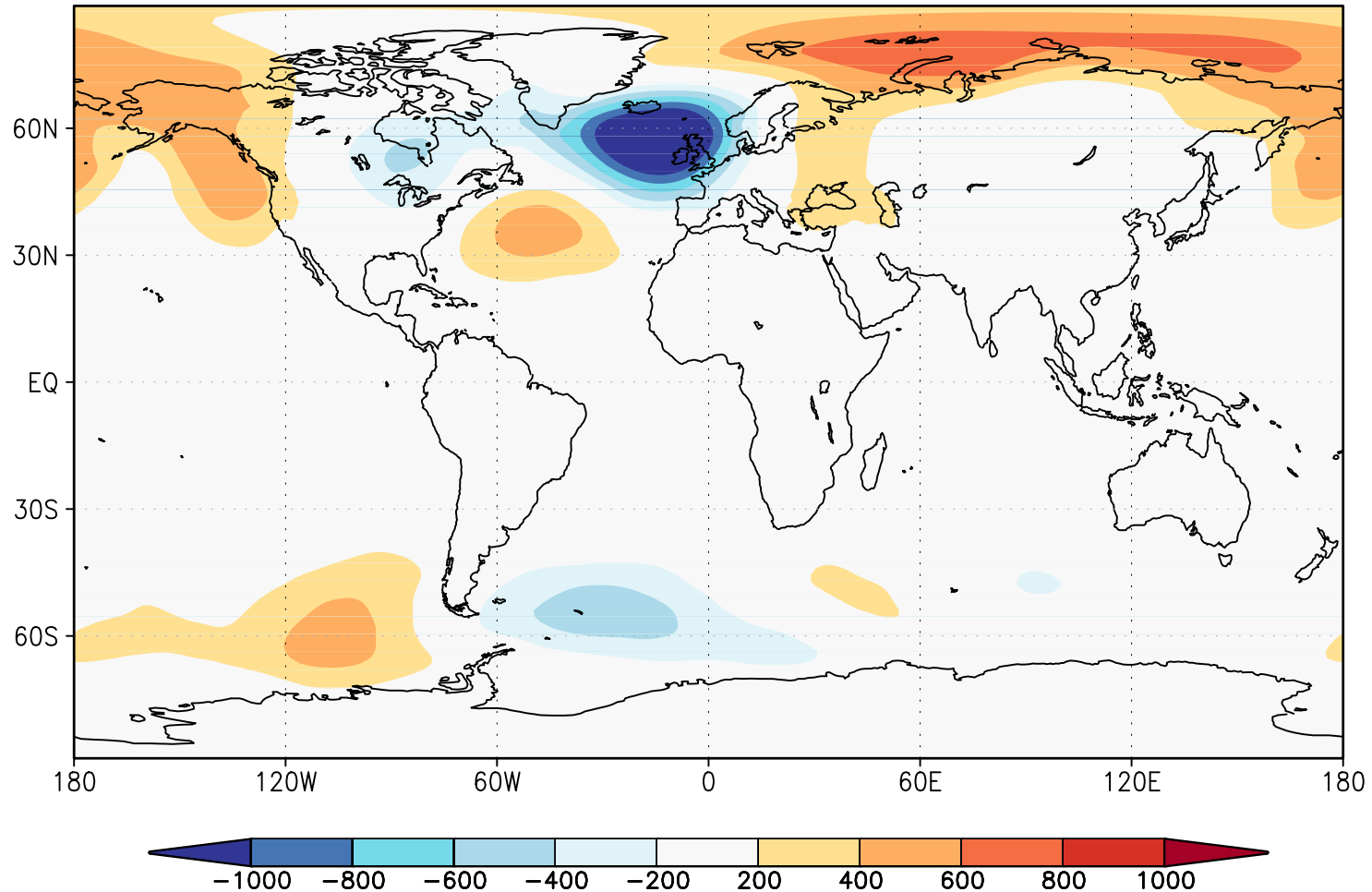


2014-15 DJF (ERA-Interim)

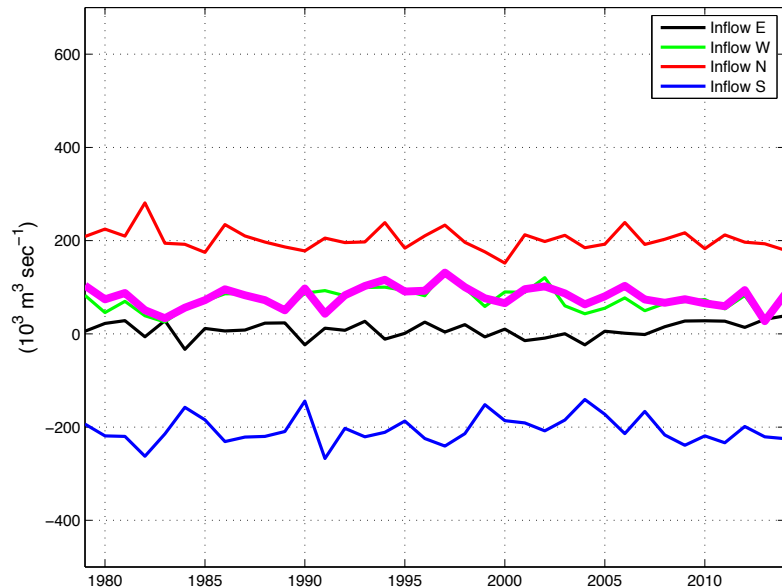


# Geopotential Height anomalies

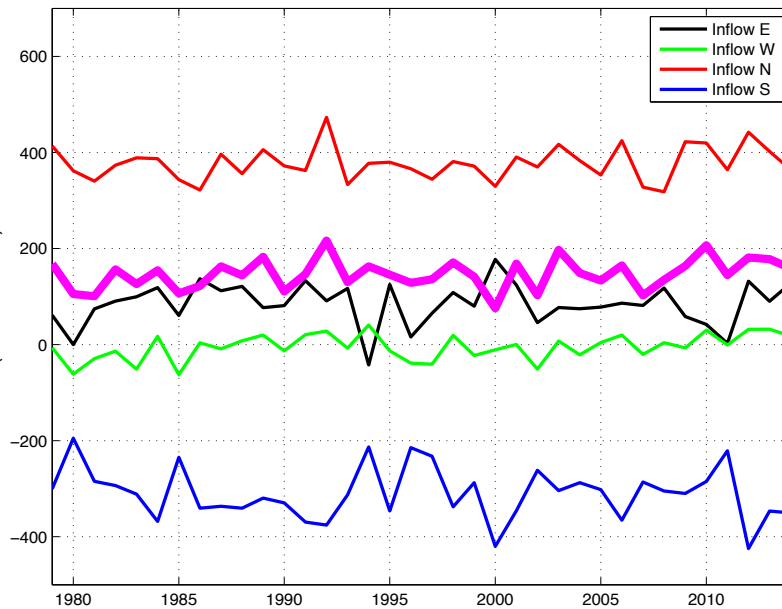
2013/14 DJF Geopotential Anom (w.r.t. 1981-2010) at 850 hPa in ERA Interim



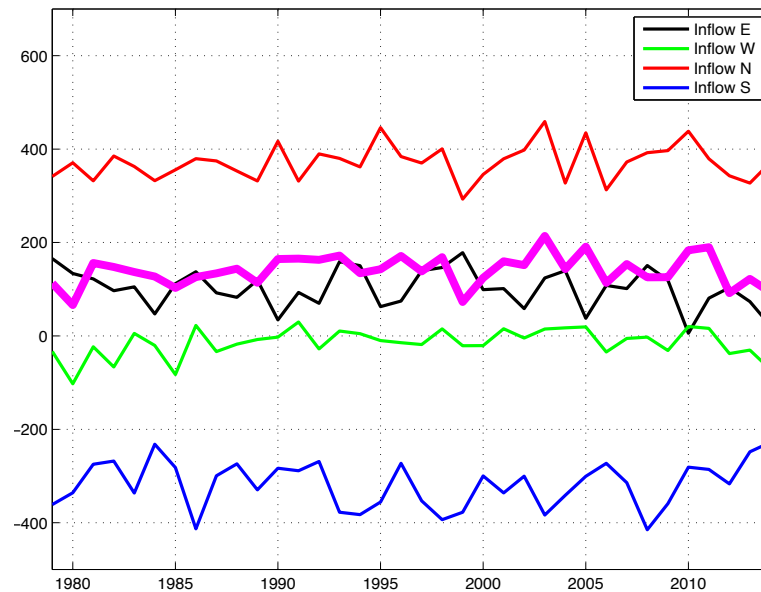
Moisture Transport into Sao Paulo (ERA Interim)



Moisture Transport into Sao Paulo (HadCM3 Control)



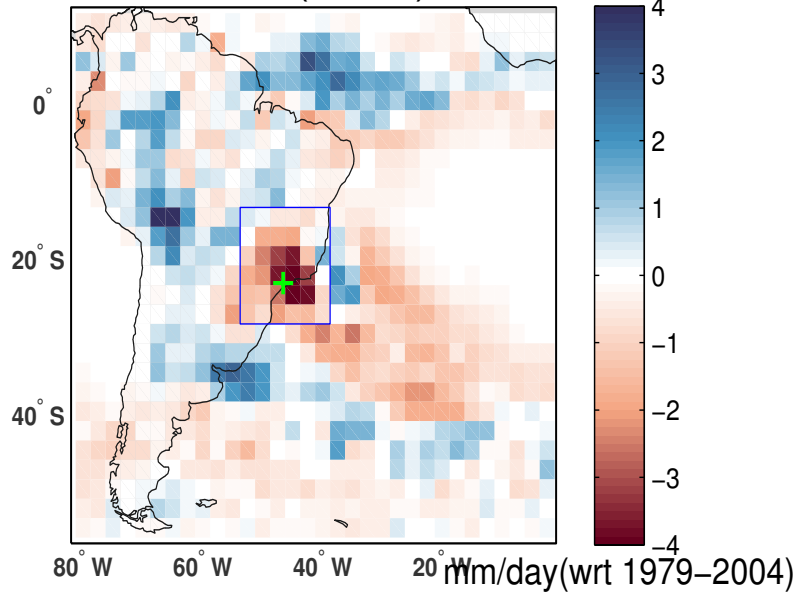
Moisture Transport into Sao Paulo (HadCM3 Deforestation)



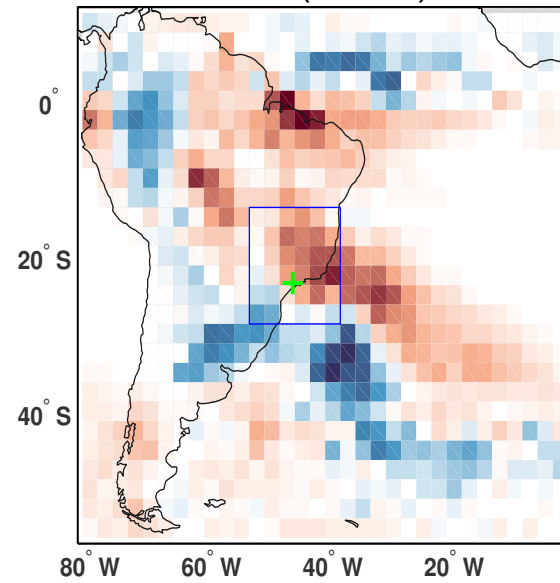


# Precipitation Anomaly

2013-14 DJF (GPCP)

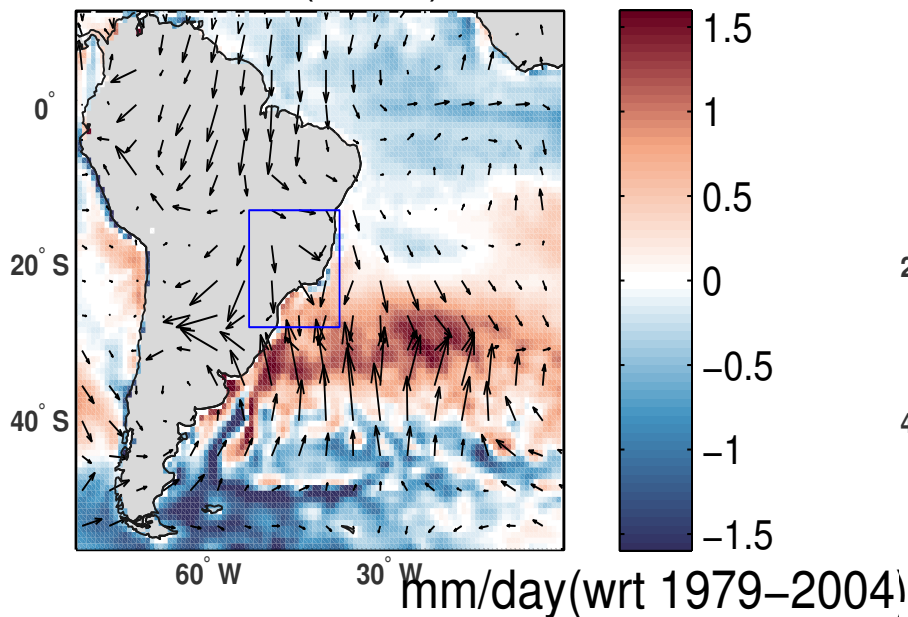


2014-15 DJF (GPCP)

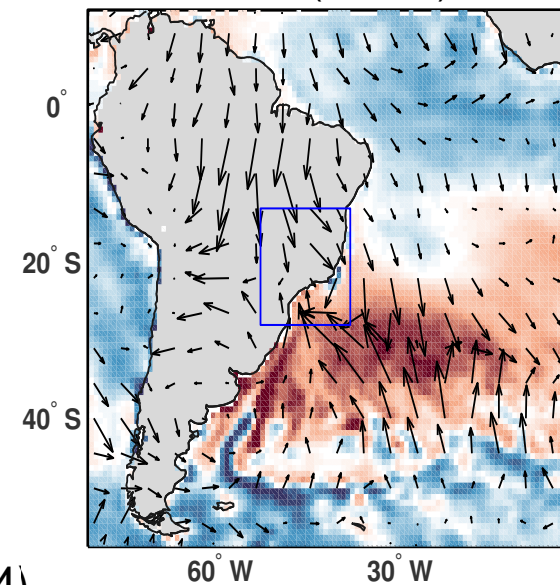


# SST (shaded) and Moisture Flux (vector) Anomaly

2013-14 DJF (ERA-Interim)



2014-15 DJF (ERA-Interim)



# Possible Causes

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## ➤ Climatic

- ✧ rainfall deficit

- ✧ change in moisture transport

## ➤ Non- Climatic

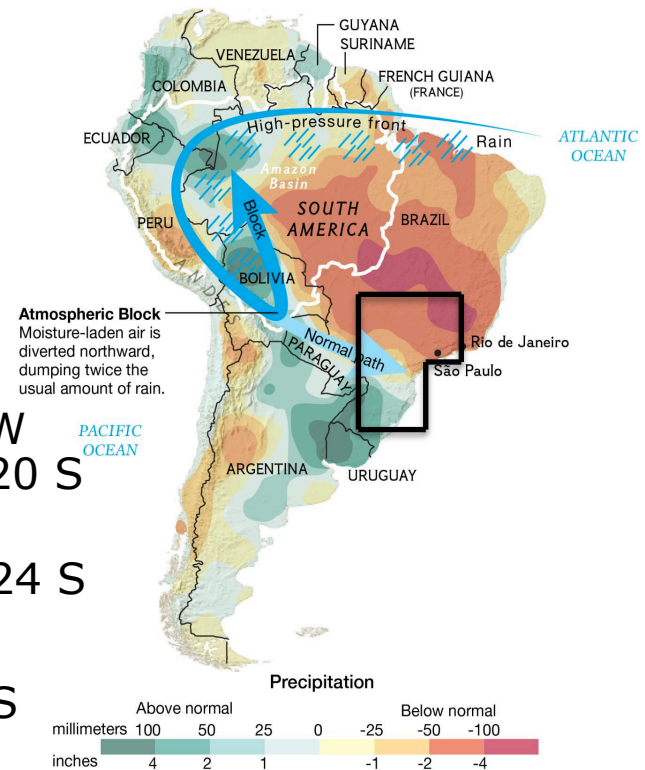
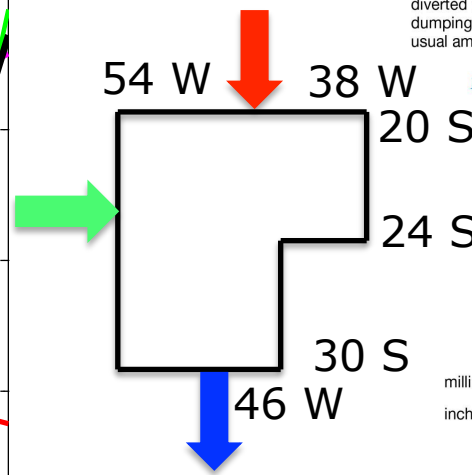
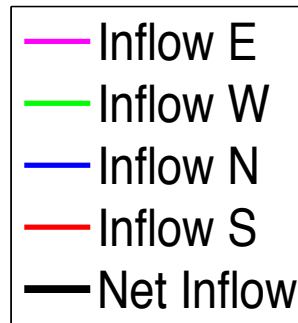
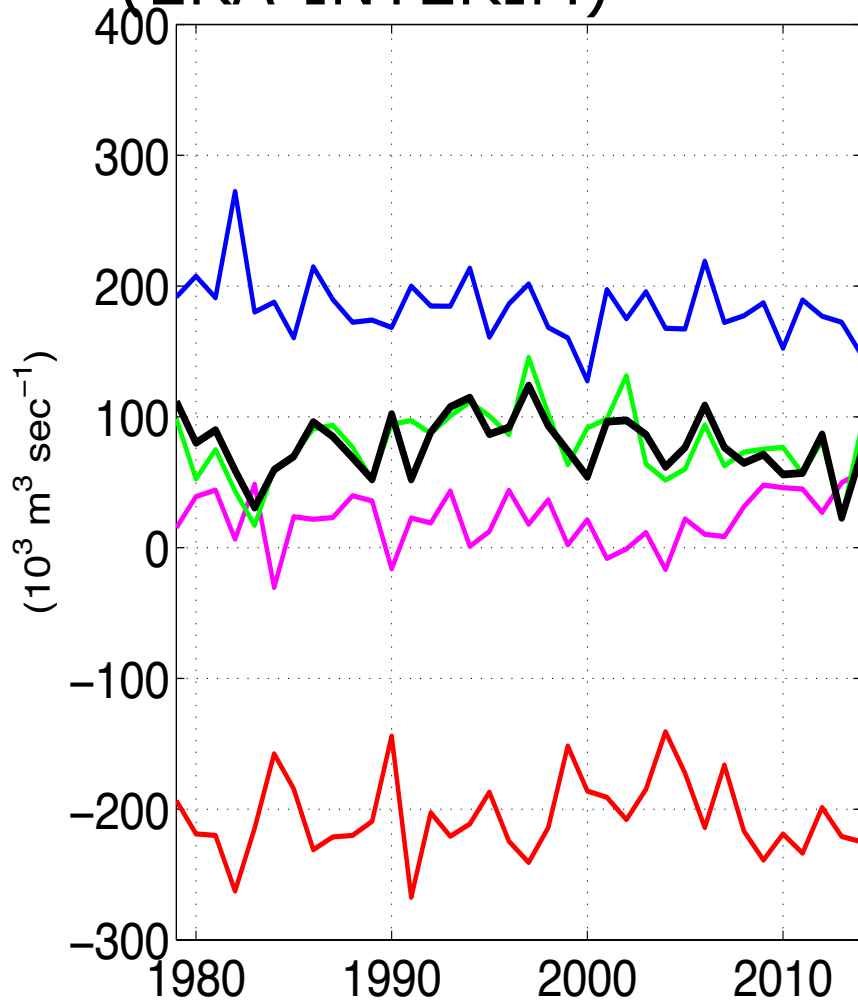
- ✧ deforestation

- ✧ population growth and increasing demand



# Deforestation - Water vapor transports

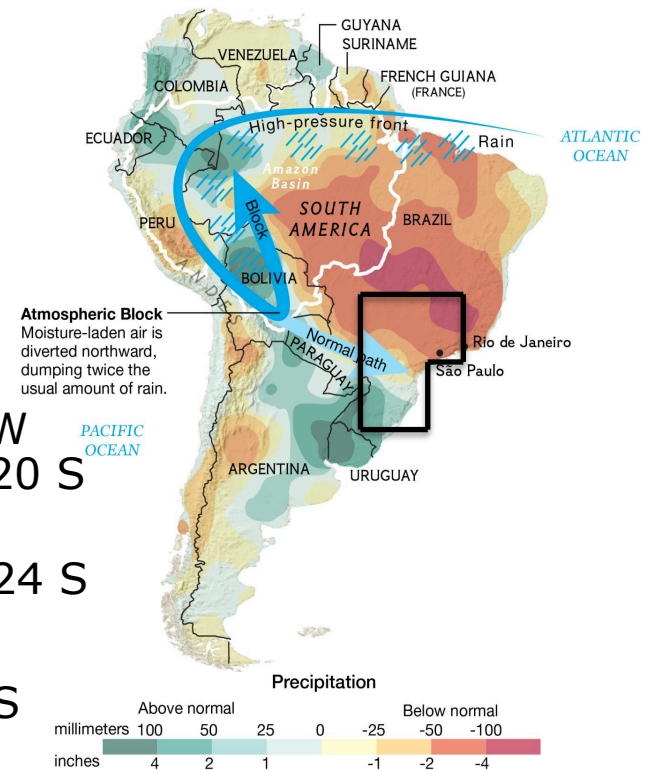
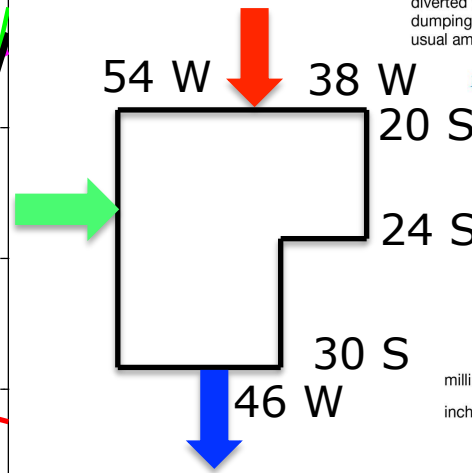
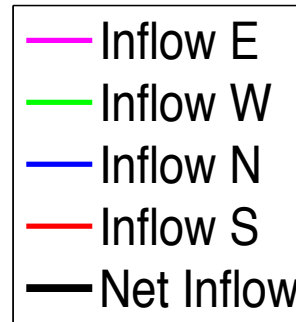
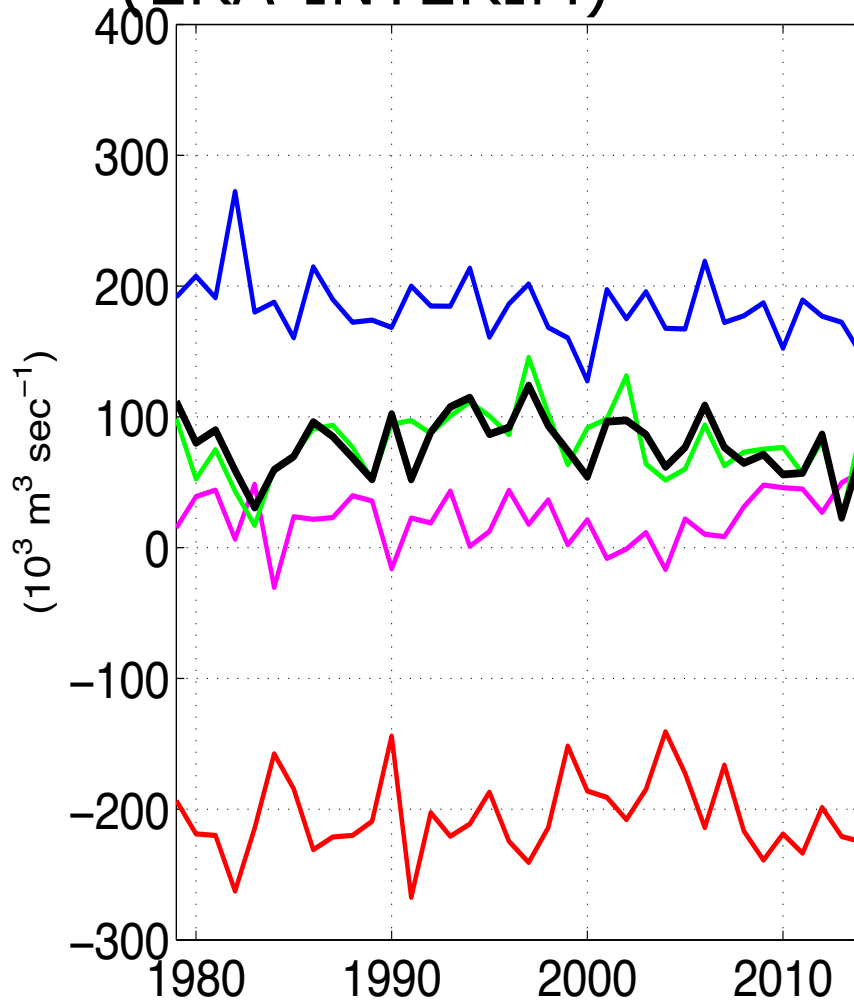
## Water vapor transports (ERA-INTERIM)



Marengo's hypothesis

# Deforestation - Water vapor transports

## Water vapor transports (ERA-INTERIM)



- How unusual is the meteorological situation in 2013/14 ?
- Will such situations occur more often in the future?