

# Results from NCEP-driven RCMs

## ~ Overview ~

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**and**  
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# Simulations Analyzed

**MM5**

Iowa State/  
PNNL

**RegCM3**

UC Santa Cruz  
ICTP

**CRCM**

Quebec,  
Ouranos

**HADRM3**

Hadley Centre

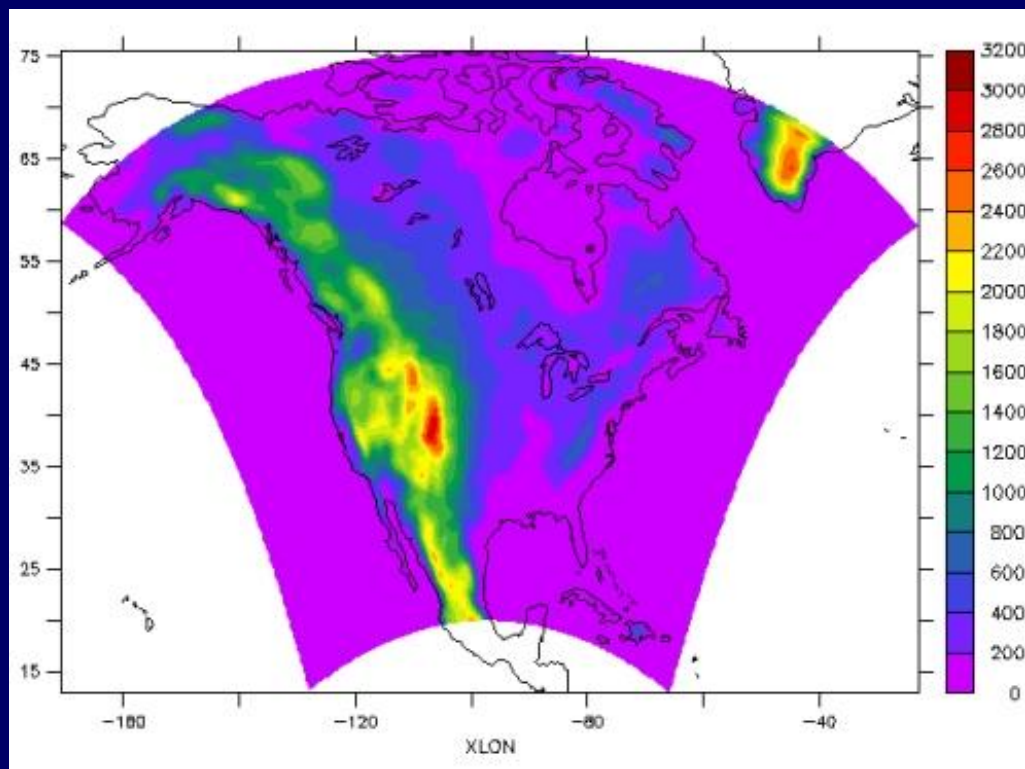
**RSM**

Scripps

**WRF**

NCAR/  
PNNL

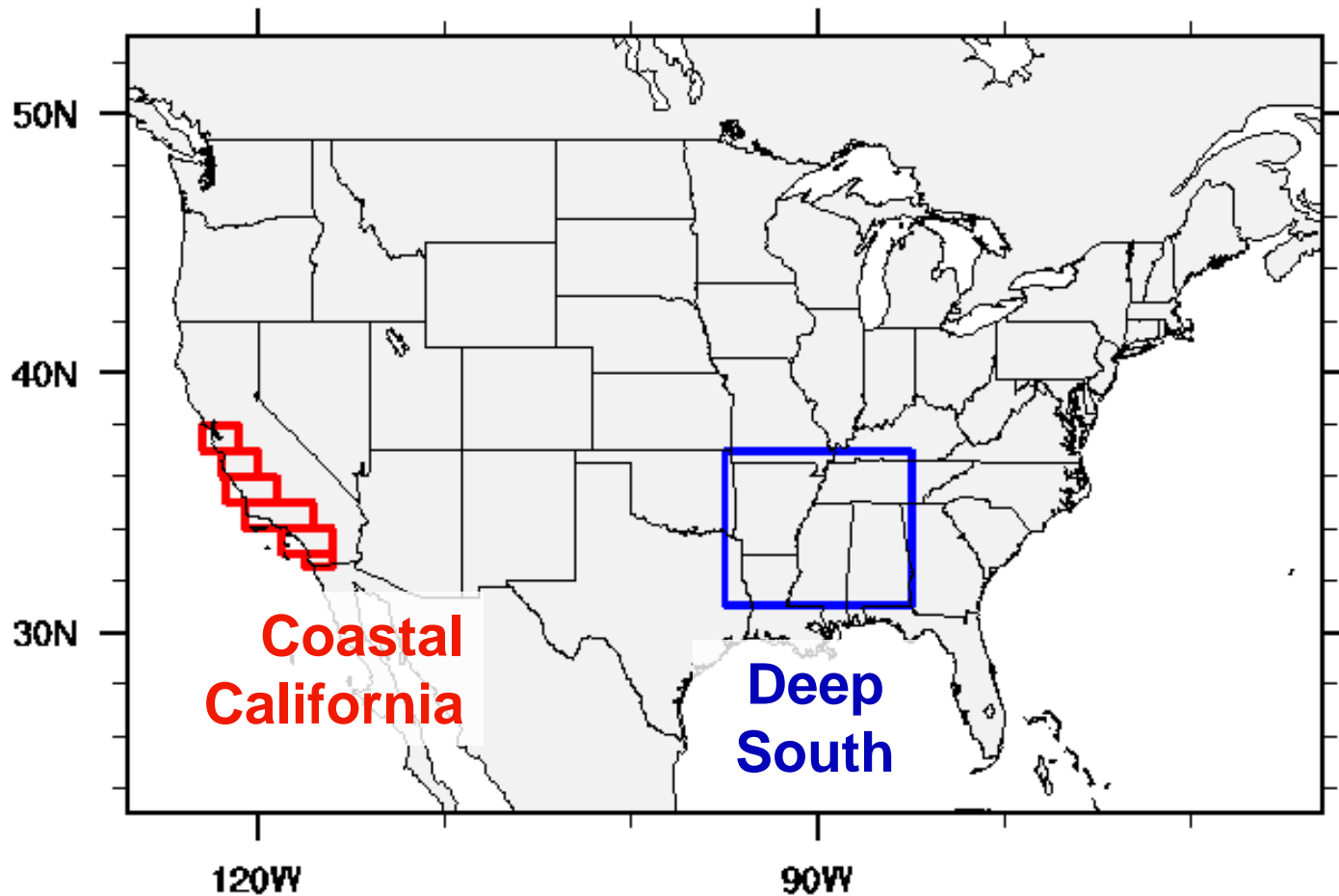
- Domain
  - Most of North America
- Period
  - 1979-2004
- Boundary Conditions
  - NCEP/DOE reanalysis
- Resolution
  - 50 km



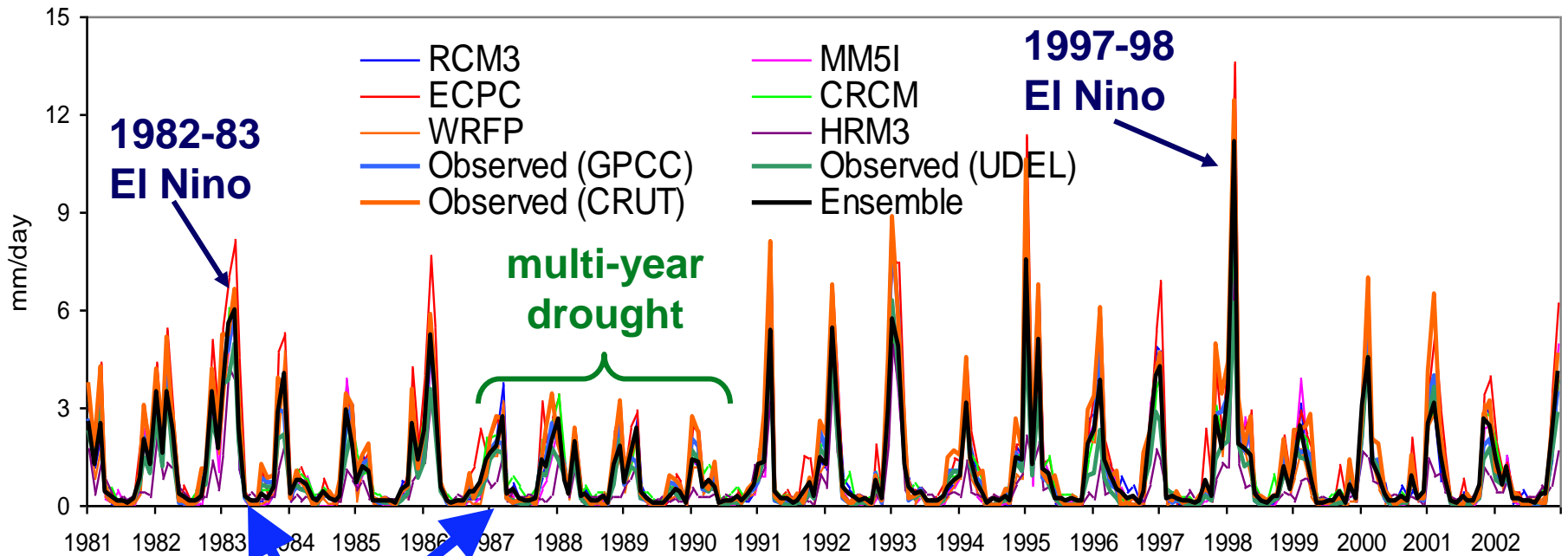
# Part I: Interannual Variability

- Results shown for 1981-2002
- Comparison with 0.5° gridded precipitation analysis from the University of Delaware

# Precipitation analysis for two regions



# Monthly time series of precipitation in coastal California



Substantial annual cycle

small spread, high skill

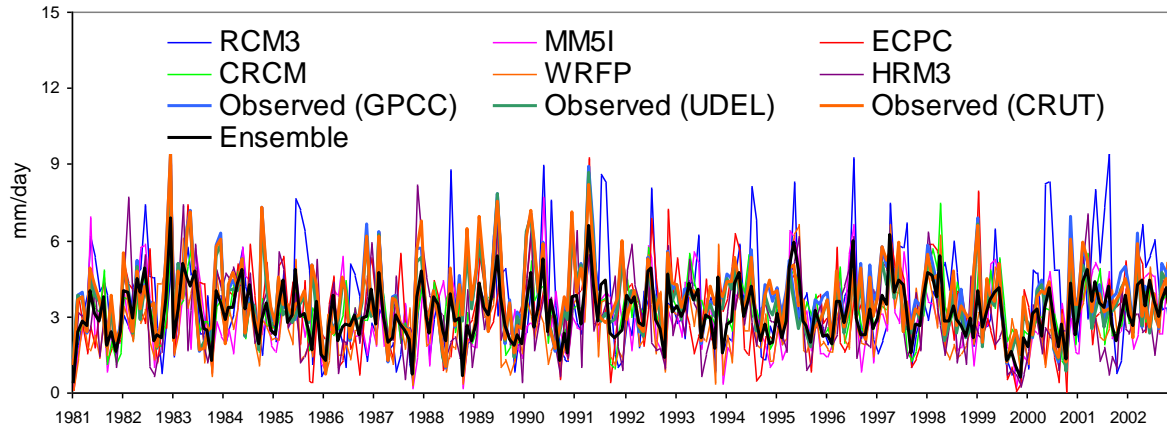
# Correlation with Observed Precipitation - Coastal California

Model	Correlation
HadRM3	0.857
RegCM3	0.916
MM5	0.925
RSM	0.945
CRCM	0.946
WRF	0.918
<b>Ensemble</b>	<b>0.947</b>

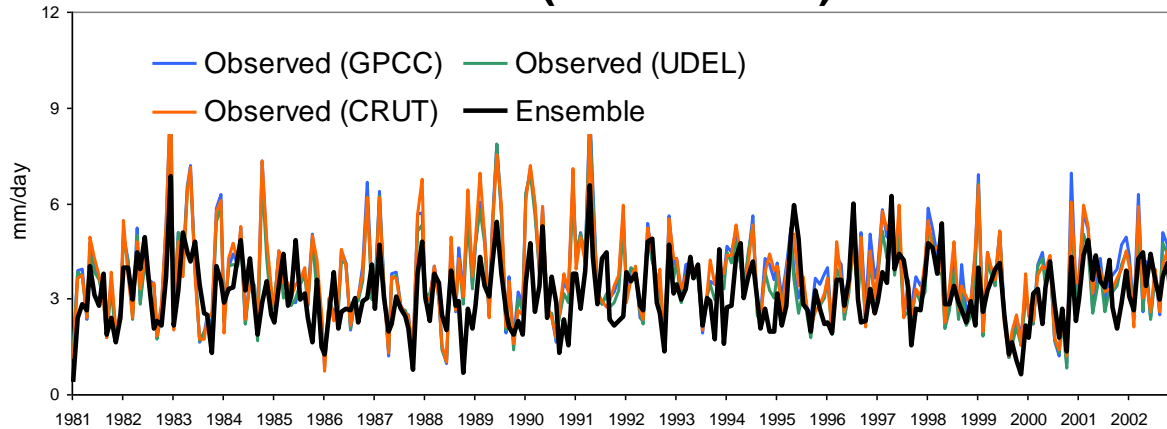
All models have high correlations with observed **monthly time series** of precipitation.

**Ensemble mean** has a higher correlation than any model

# Monthly Time Series - Deep South



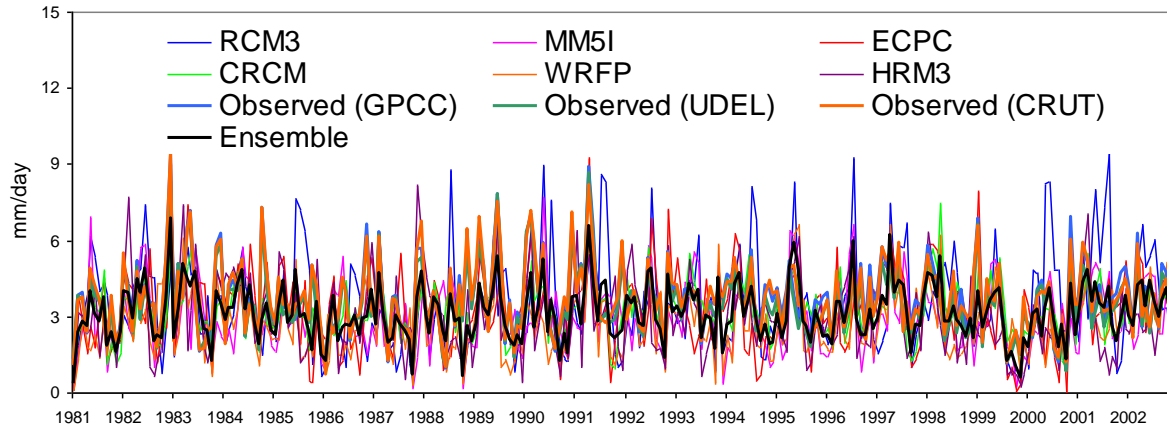
**Ensemble (black curve)**



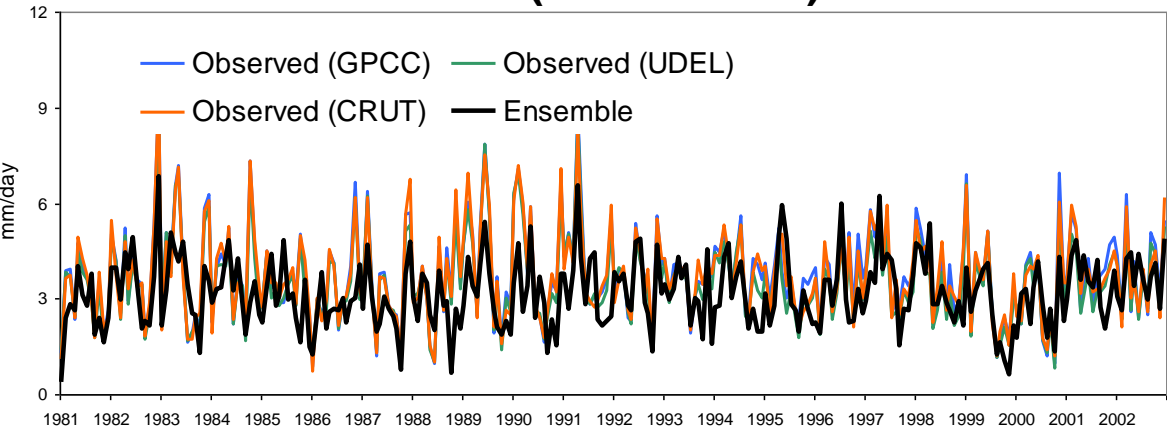
Model	Correlation
HadRM3	0.489
RegCM3	0.231
MM5	0.343
RSM	0.649
CRCM	0.649
WRF	0.513
<b>Ensemble</b>	<b>0.640</b>

**Two models (RSM and CRCM) perform much better. These models inform the domain interior about the large scale.**

# Monthly Time Series - Deep South



**Ensemble (black curve)**



Model	Correlation
HadRM3	0.489
RegCM3	0.231
MM5	0.343
RSM	0.649
CRCM	0.649
WRF	0.513
<b>Ensemble</b>	<b>0.640</b>
<b>RSM+CRCM</b>	<b>0.727</b>

**A “mini ensemble” of RSM and CRCM performs best in this region.**

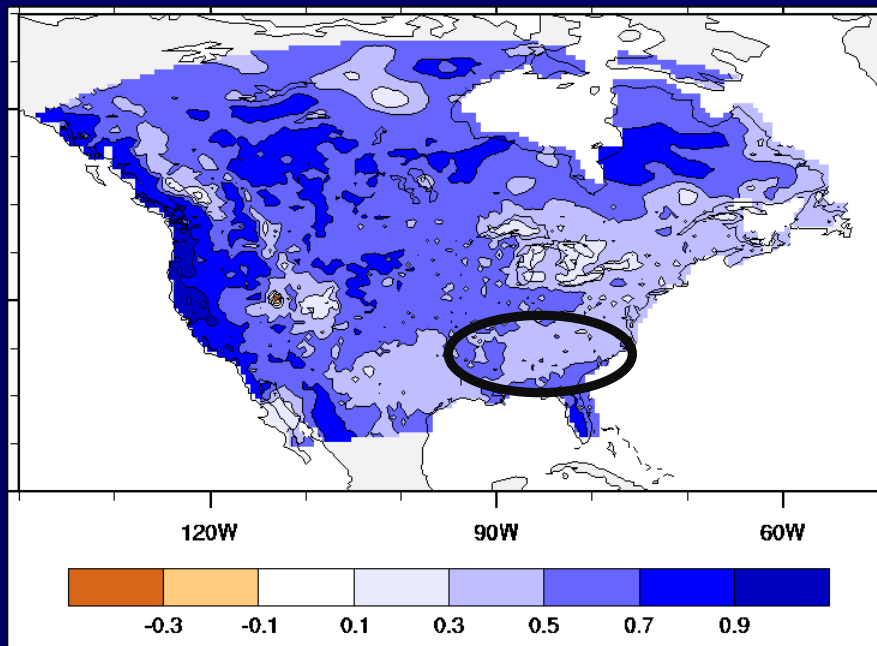


# Correlation of Monthly Time Series

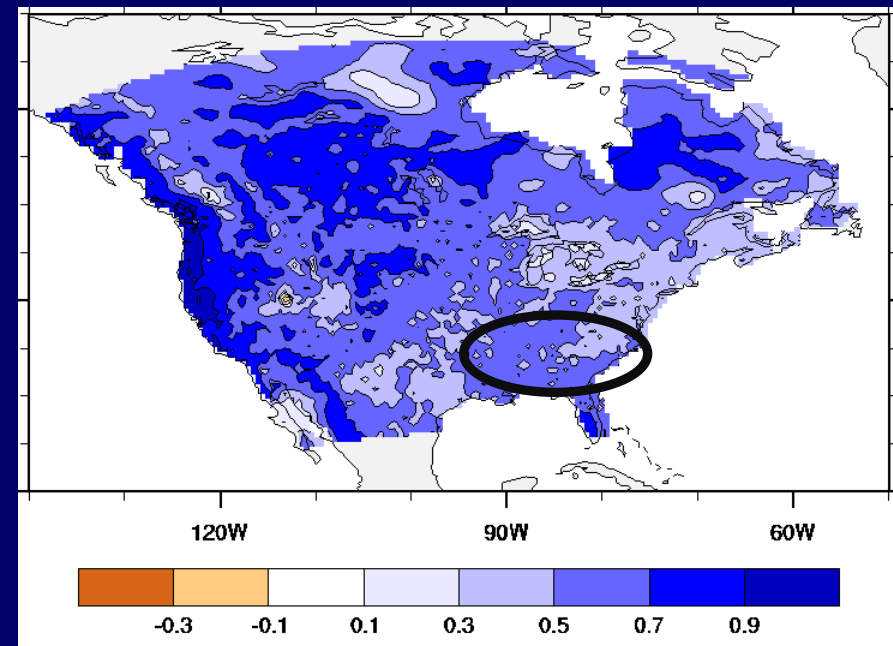
The "mini-ensemble" has better correlation than the full ensemble in the southern and eastern parts of the domain.

Other measures of forecast skill (such as bias) are not necessarily better.

## Full ensemble



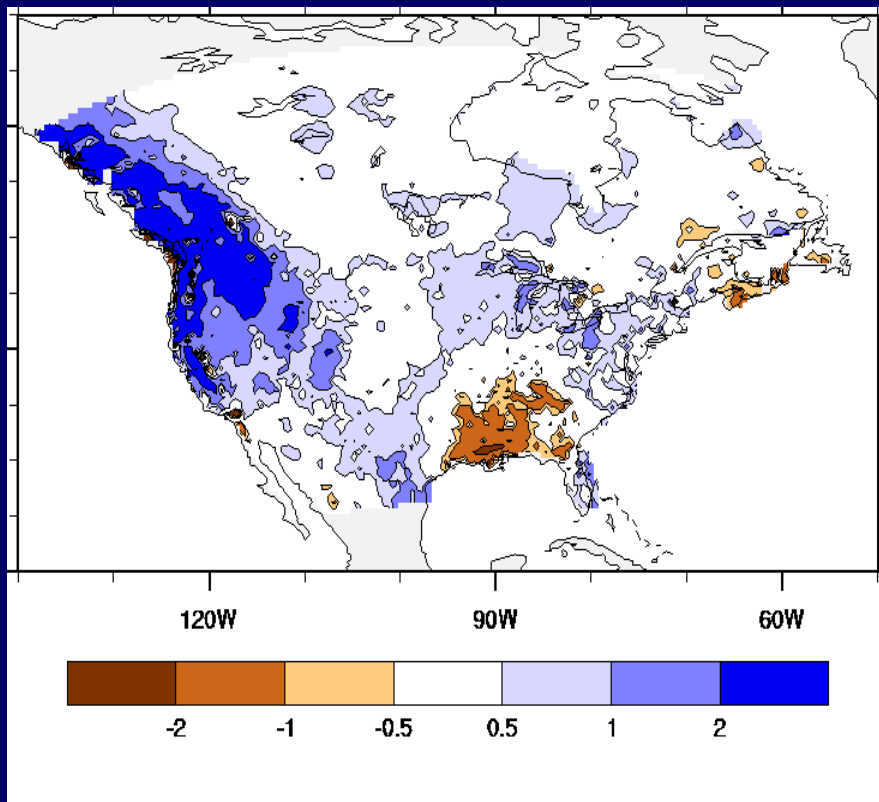
## RSM + Canadian RCM



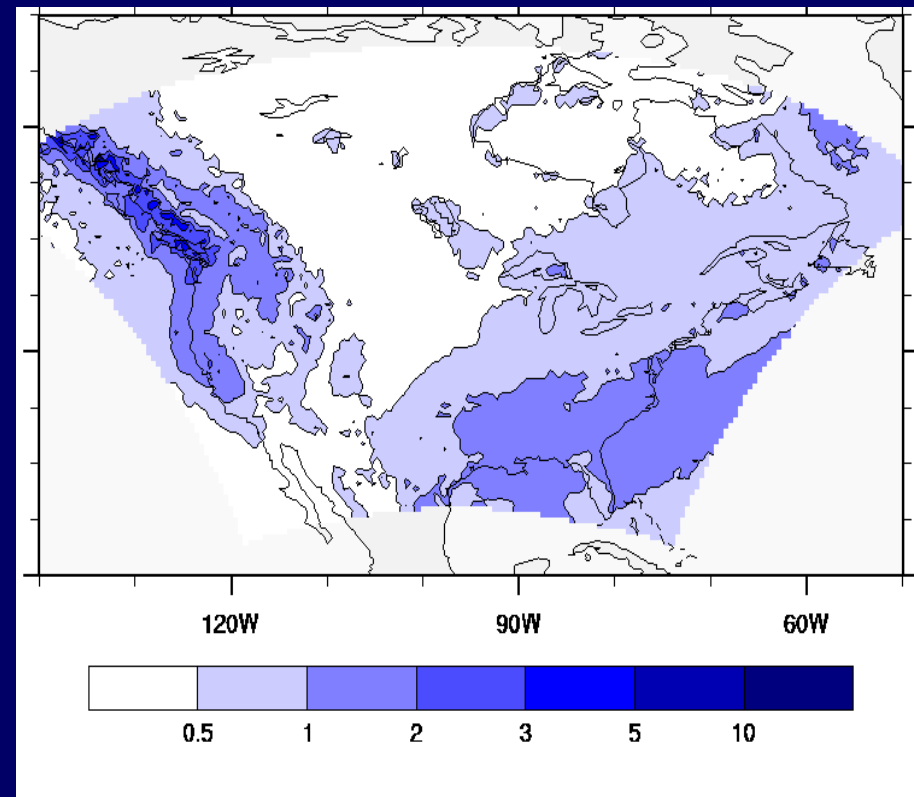
# Ensemble error and spread (January)

There are hints of a spread-skill relation but it is not consistent.

## Bias

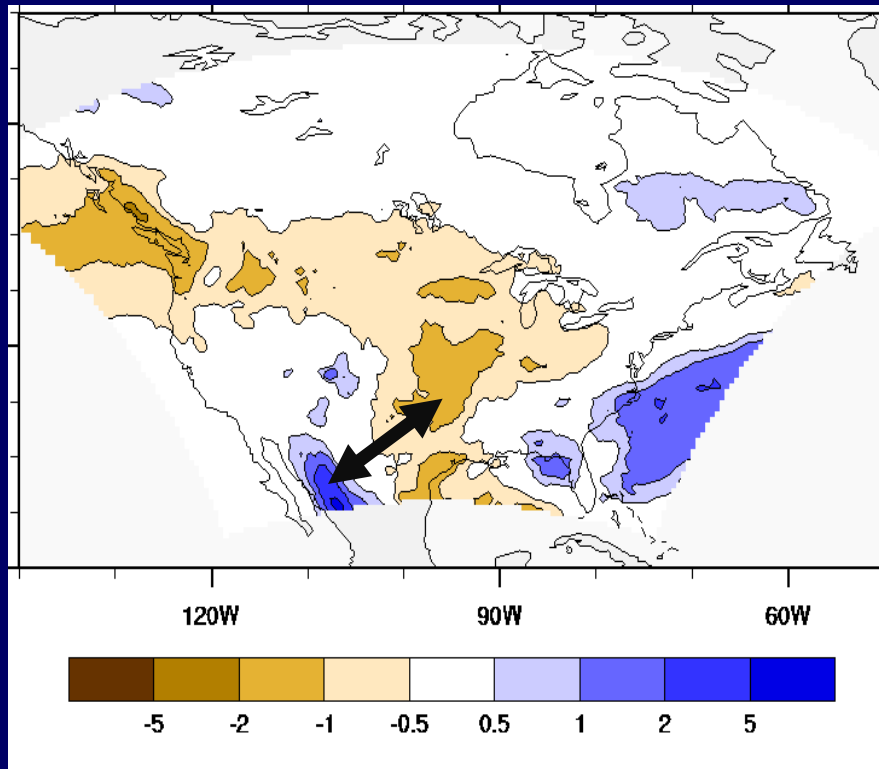


## Ensemble spread

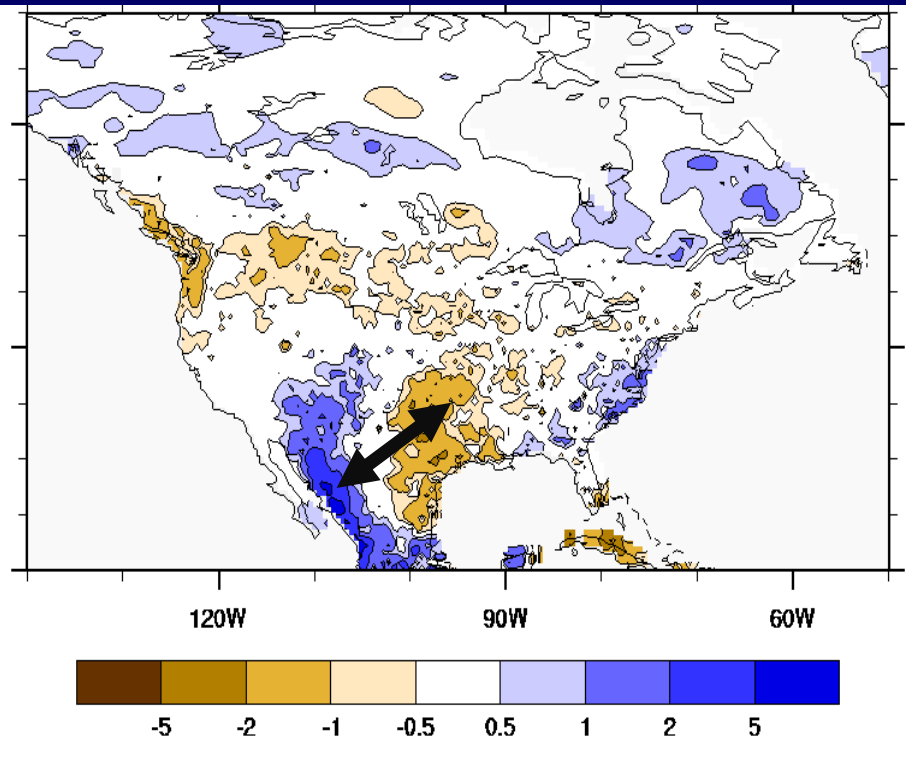


The ensemble reproduces the dipole of June-July precipitation change, but the monsoon does not extend as far north as observed.

ensemble July minus June



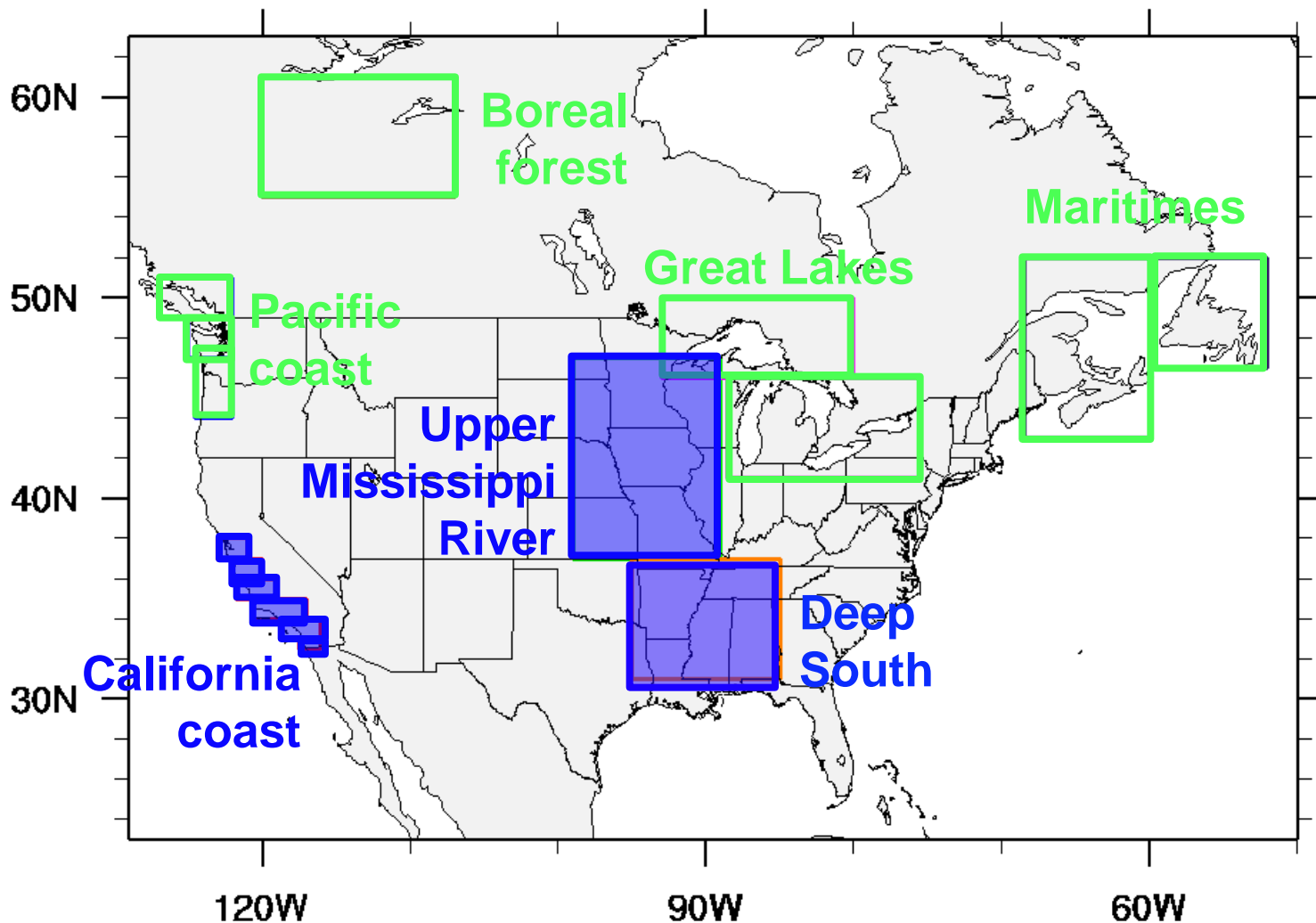
observed July minus June



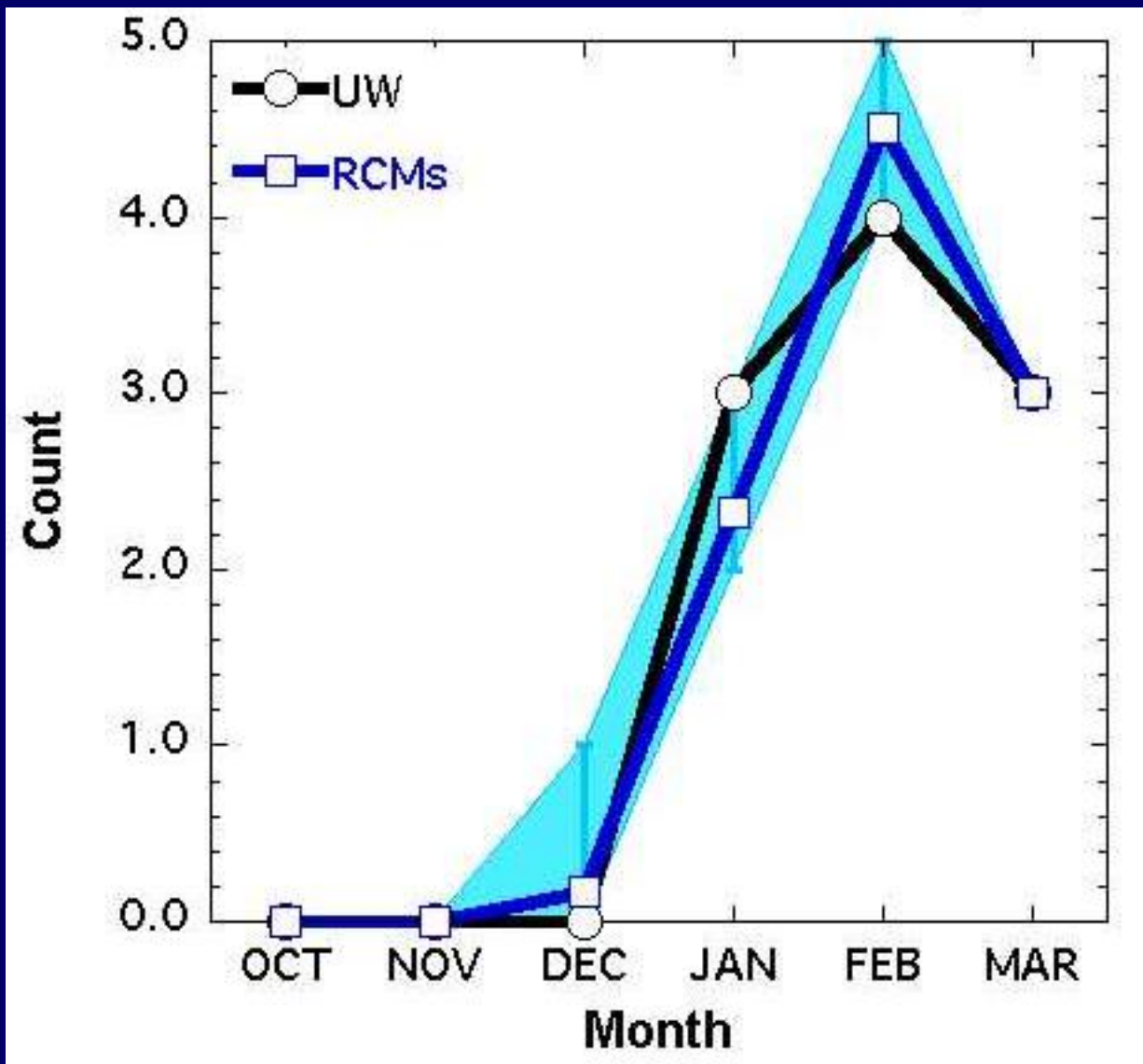
# Part 2: Extreme Monthly Precipitation

- Observations
  - ★ Precip: University of Washington VIC retrospective analysis
  - ★ 500 hPa Heights: North American Regional Reanalysis
- Comparison period: 1982 -1999
  - ★ 1979-1981 omitted - spinup
  - ★ UW data end in mid-2000
- Analysis
  - ★ Cold season (Oct-Mar)
  - ★ 10 wettest months (top 10%)

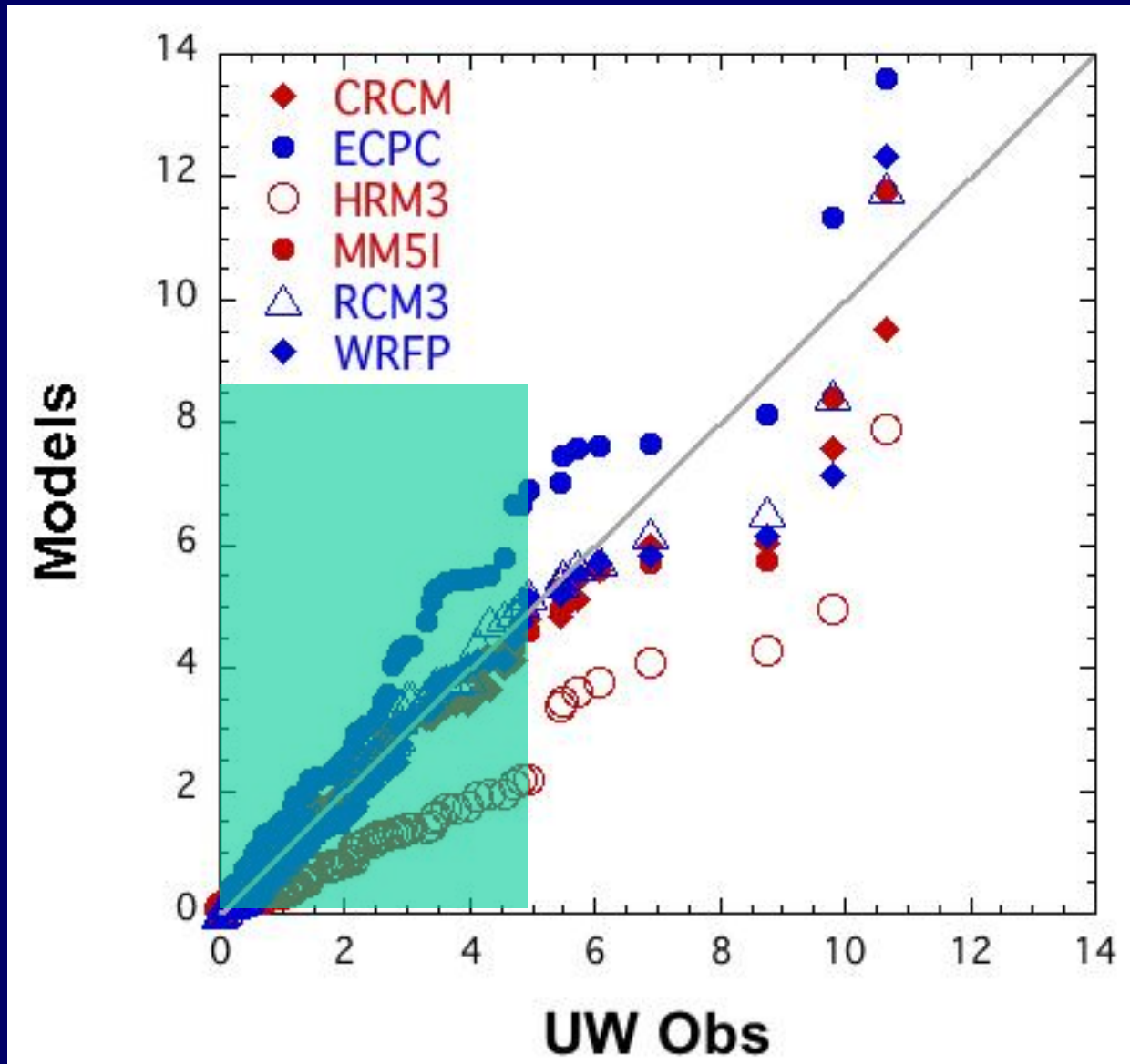
# Regions Analyzed



# Frequency – Coastal CA



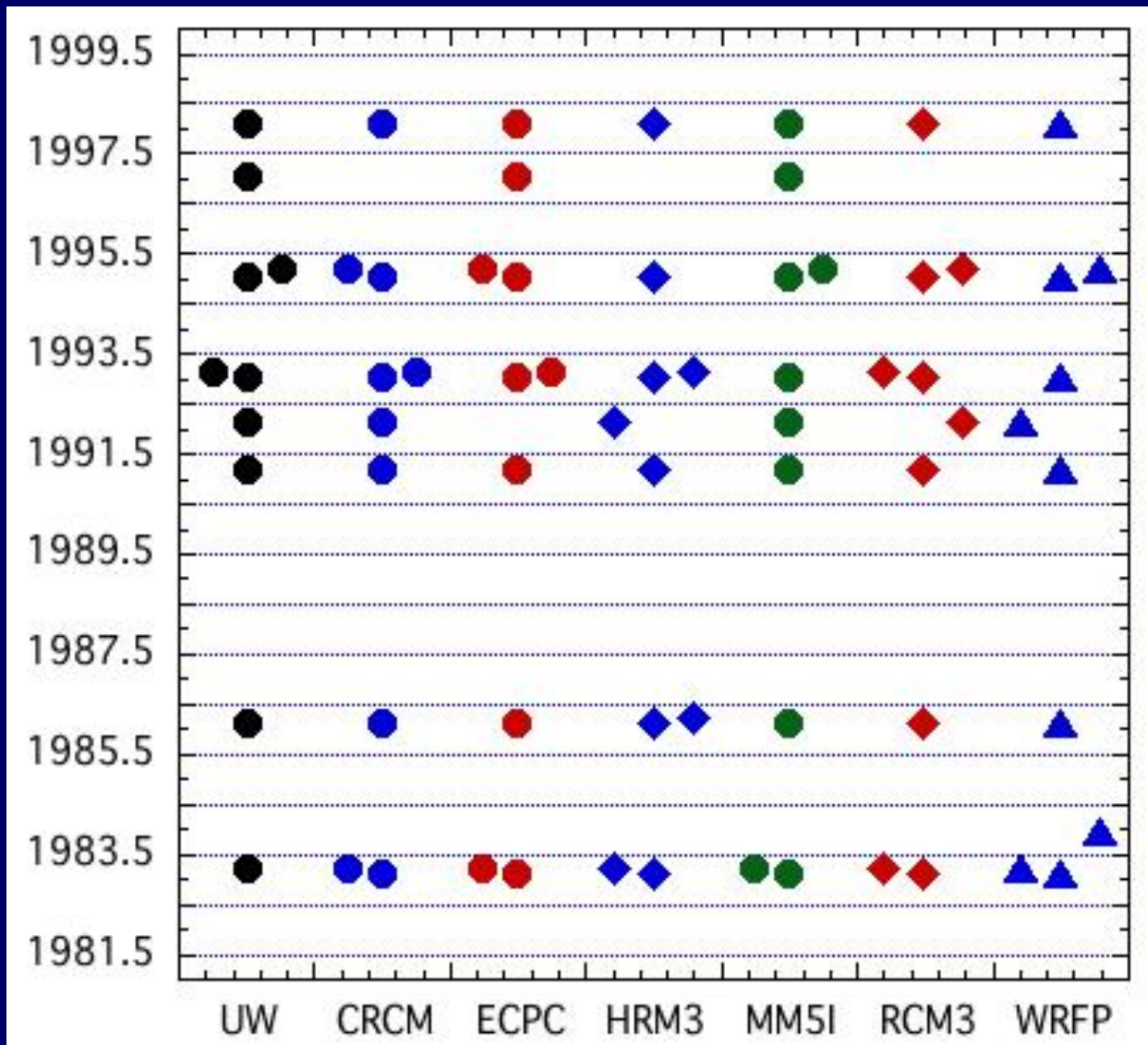
# Ranked Precipitation – Coastal CA



Ensemble  
average of  
top 10 = 9  
% smaller than  
UW



# Interannual Variability – Coastal CA



59 of 60 (98%)  
simulated  
extremes occur  
in cold seasons  
with an  
observed  
extreme.

(random  
chance: 27)

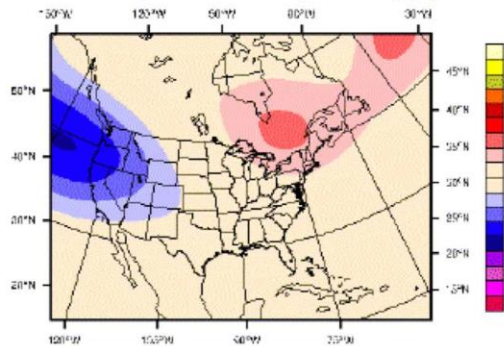


# Composite 500 hPa Height Anomalies

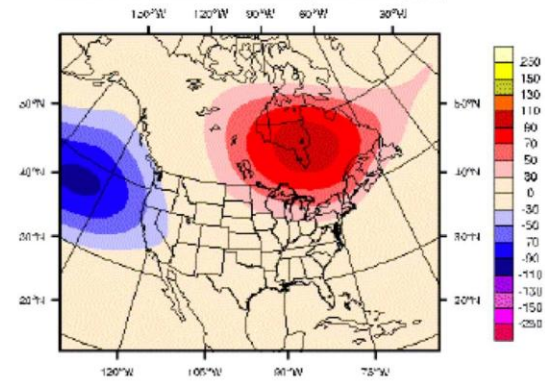
## Top 10 Extremes

### Coastal CA

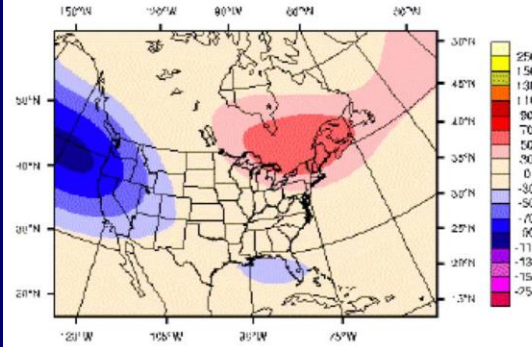
ECPC Composite 500hPa Height Anomaly (m)



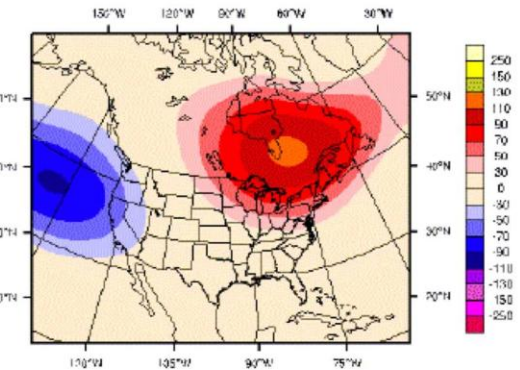
MM5I Composite 500hPa Height Anomaly (m)



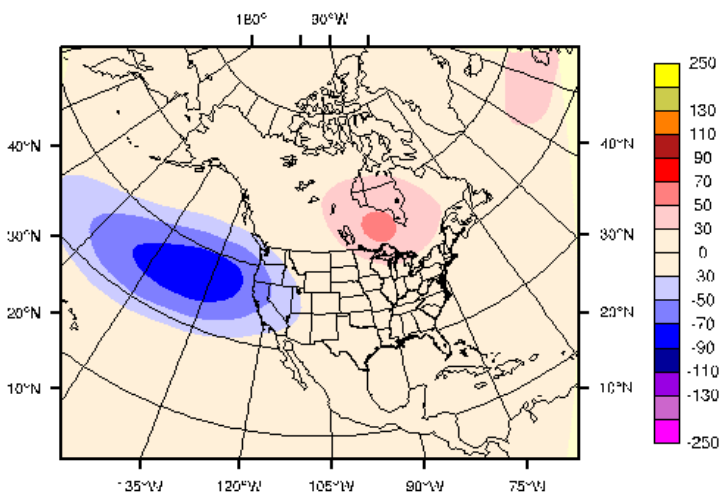
MRCC Composite 500hPa Height Anomaly (m)



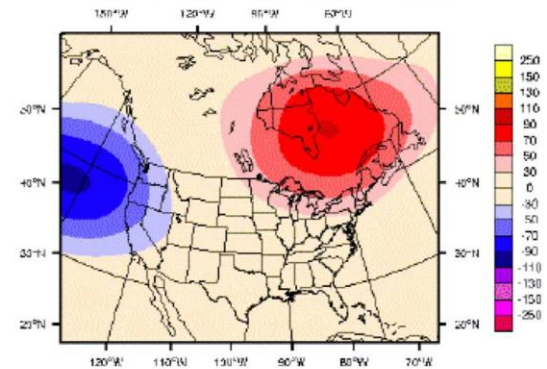
RCM3 Composite 500hPa Height Anomaly (m)



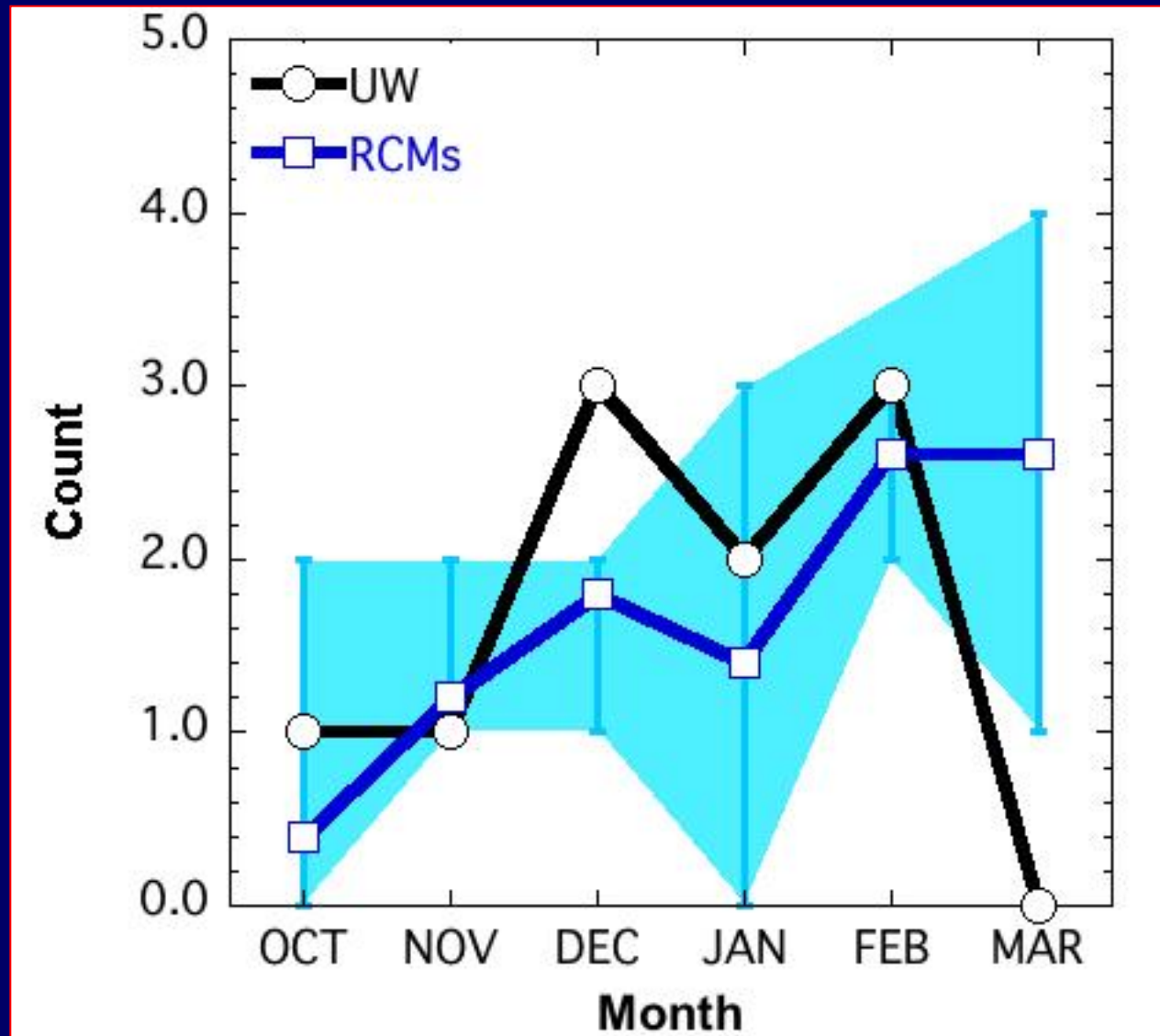
NARR Composite 500hPa Height Anomaly (m)



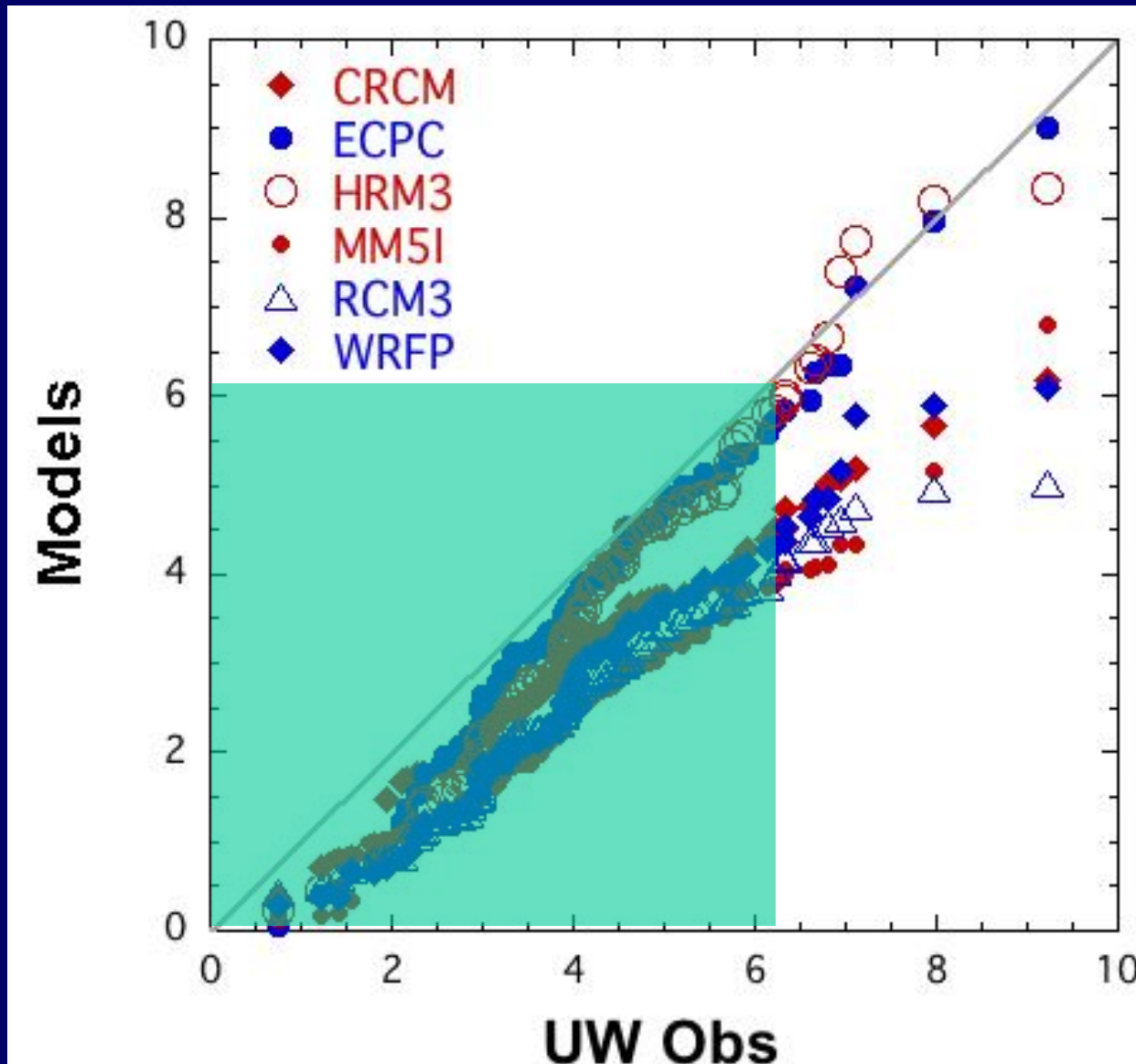
WRFP Composite 500hPa Height Anomaly (m)



# Frequency – Deep South

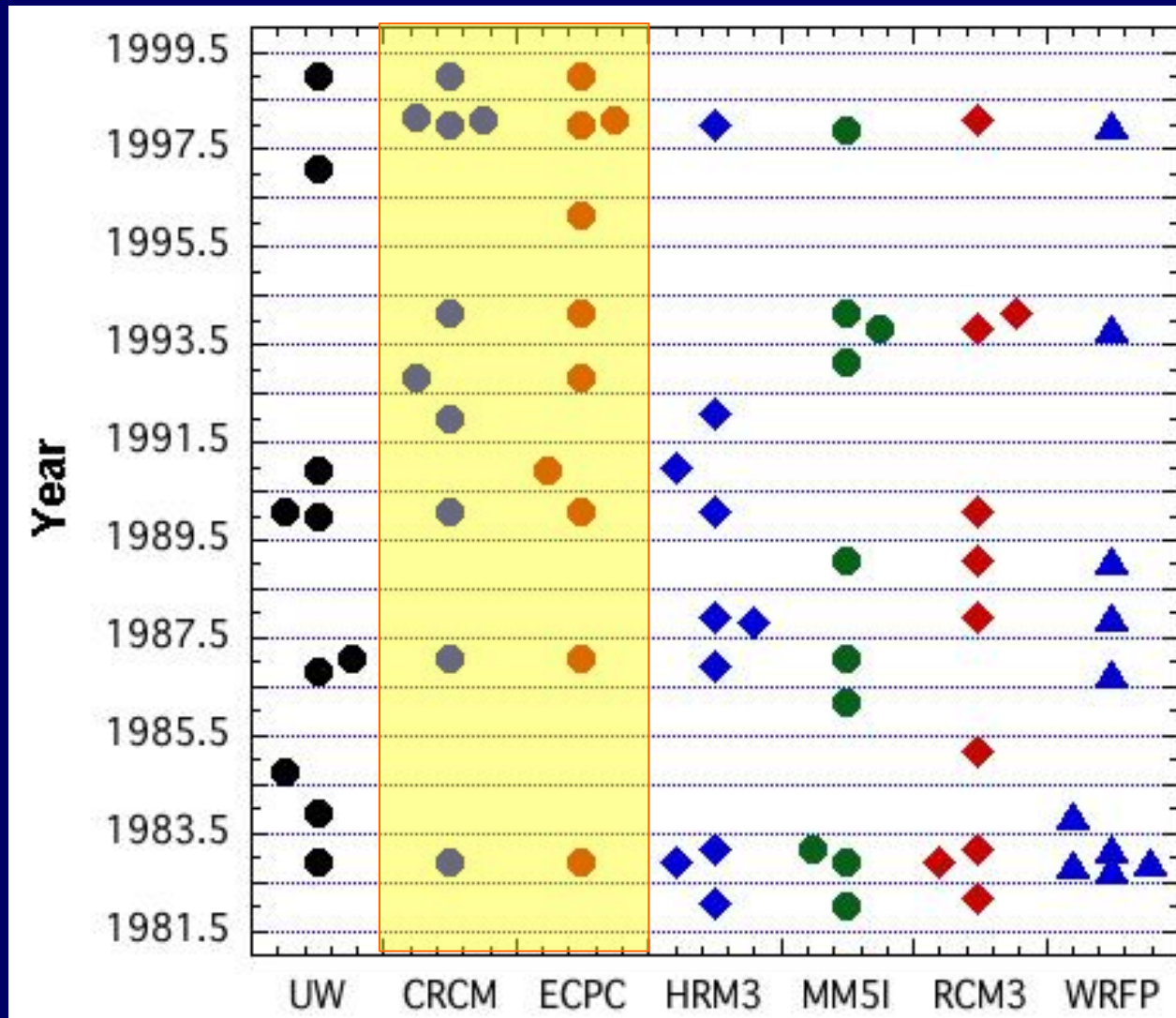


# Ranked Precipitation – Deep South



Ensemble  
average of  
top 10 = 22  
% smaller than  
UW

# Interannual Variability – Deep South

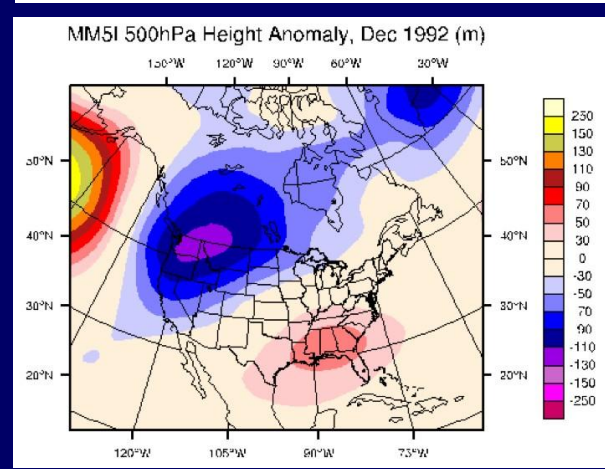
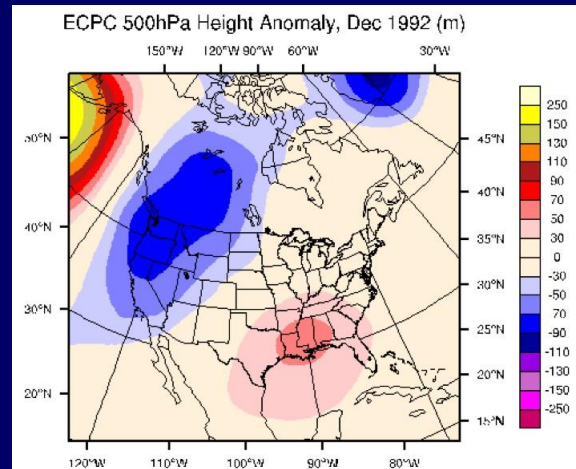
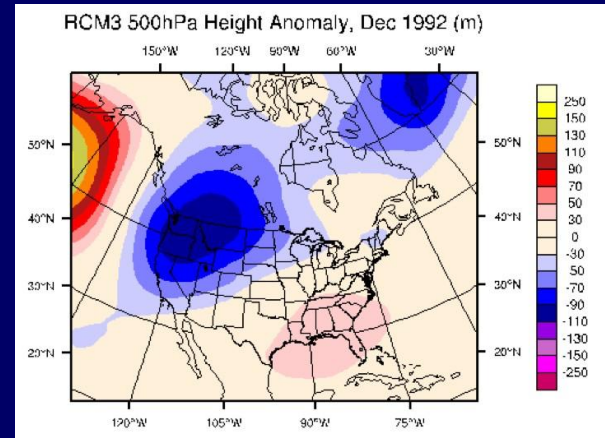
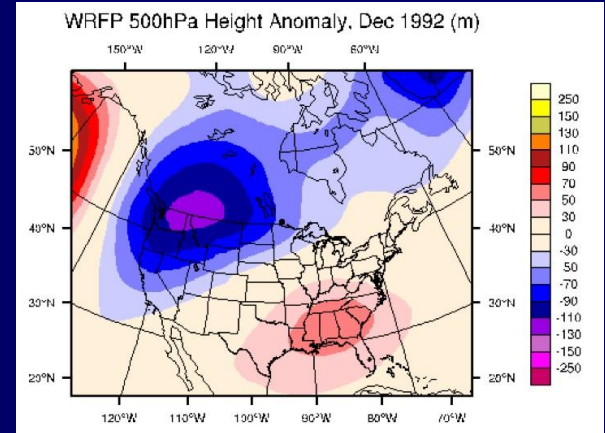
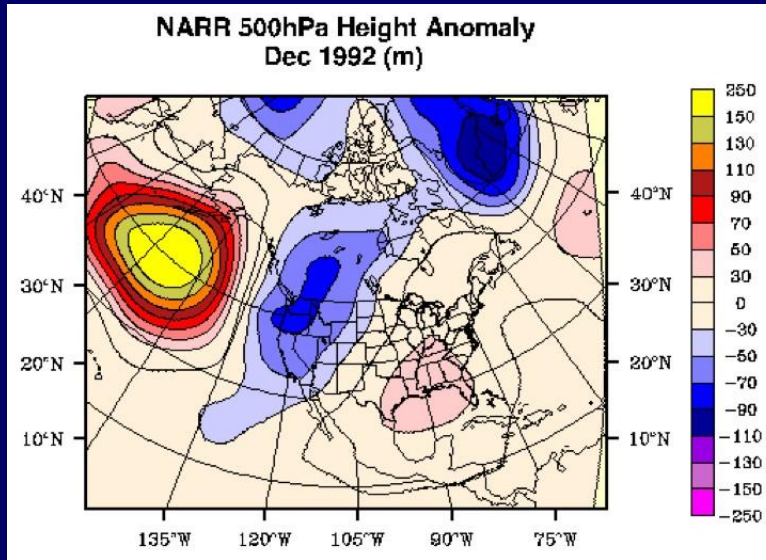


27 of 60 (45%) simulated extremes occur in cold seasons with an observed extreme.

(random chance: 27)



# 500 hPa Height Anomalies – Deep South Extreme



# Summary

## Monthly Precipitation

**Where there is a substantial periodic cycle:**

- **Models simulate well the interannual variability**
- **Models simulate well monthly, regional extremes**

**Where there is no substantial periodic cycle:**

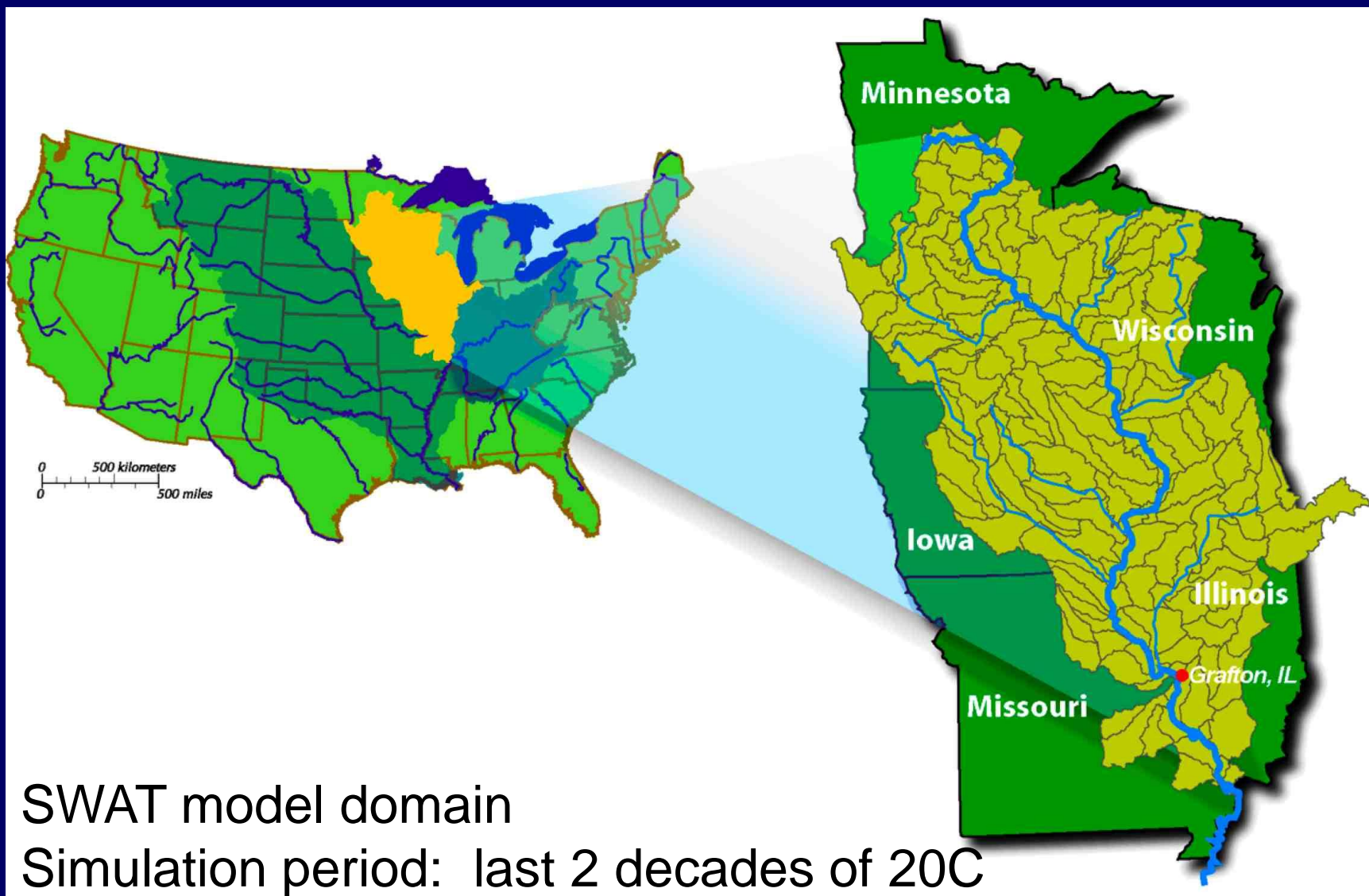
- **Models simulate poorly the interannual var. & extremes**
- **Interior nudging improves interannual variability**
- **Interior nudging does not help extremes**

Thank You!



**([www.narccap.ucar.edu](http://www.narccap.ucar.edu))**

# Hydrologic Analysis (Takle et al.)



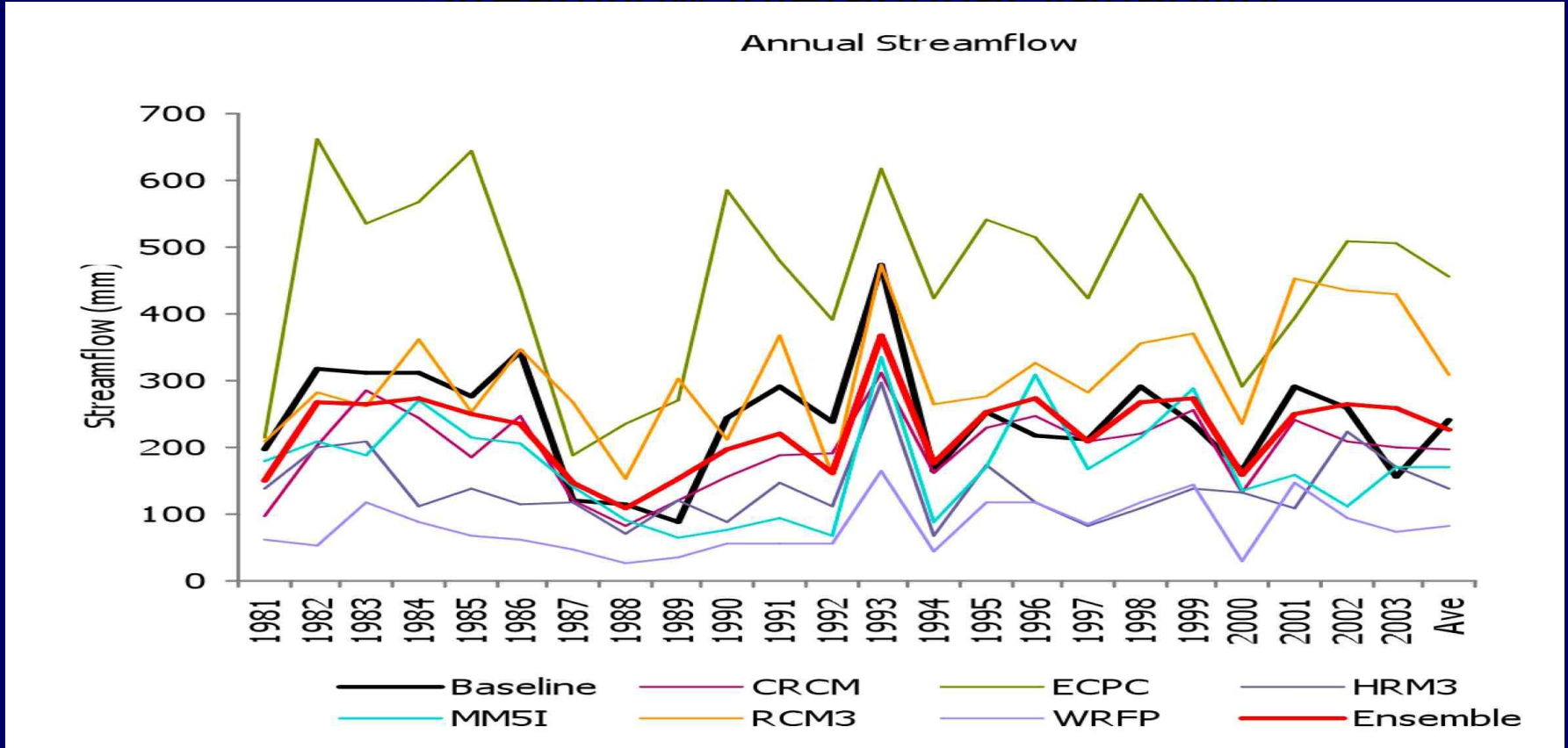
SWAT model domain

Simulation period: last 2 decades of 20C

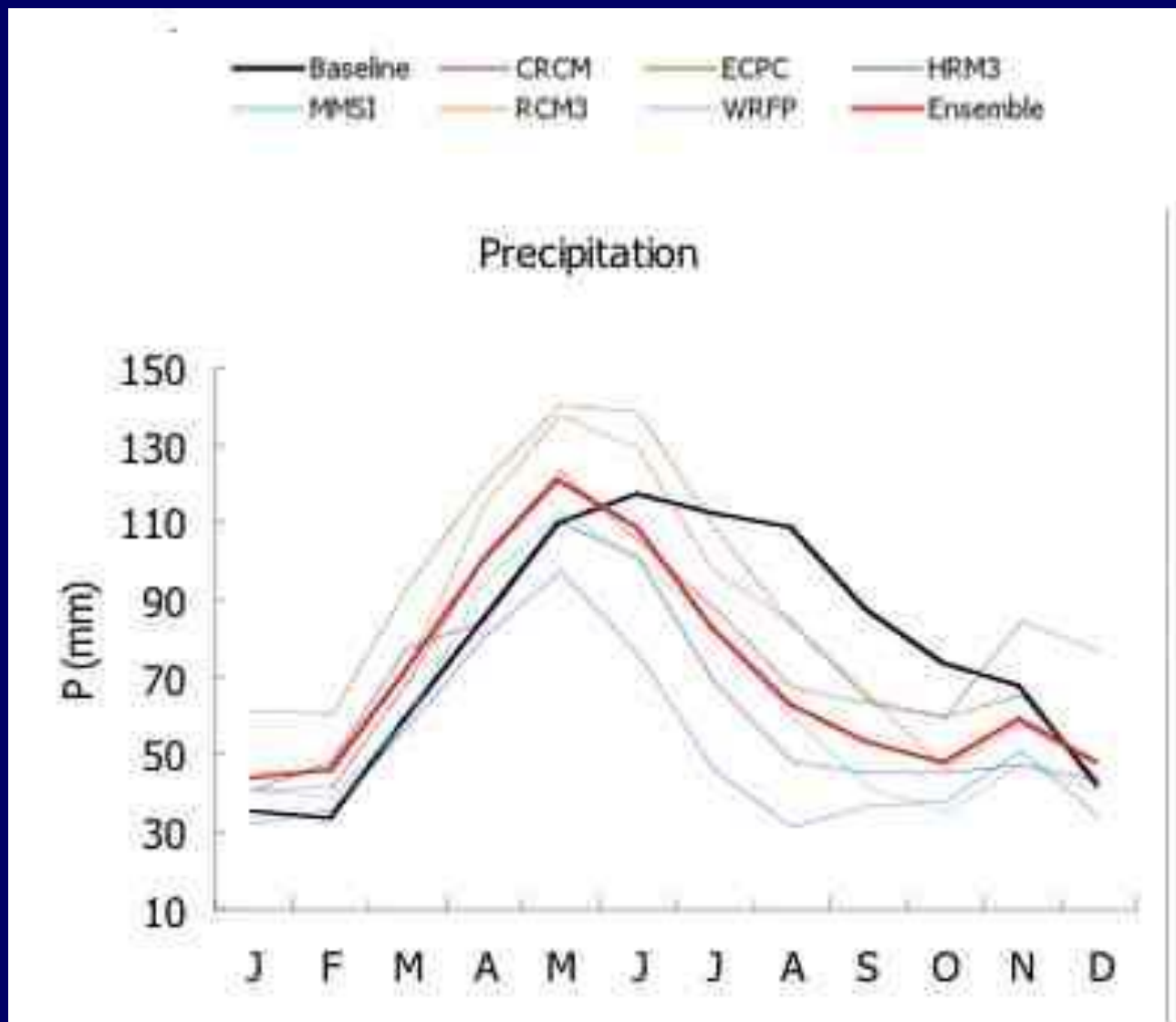


# Hydrologic Analysis (Takle et al.)

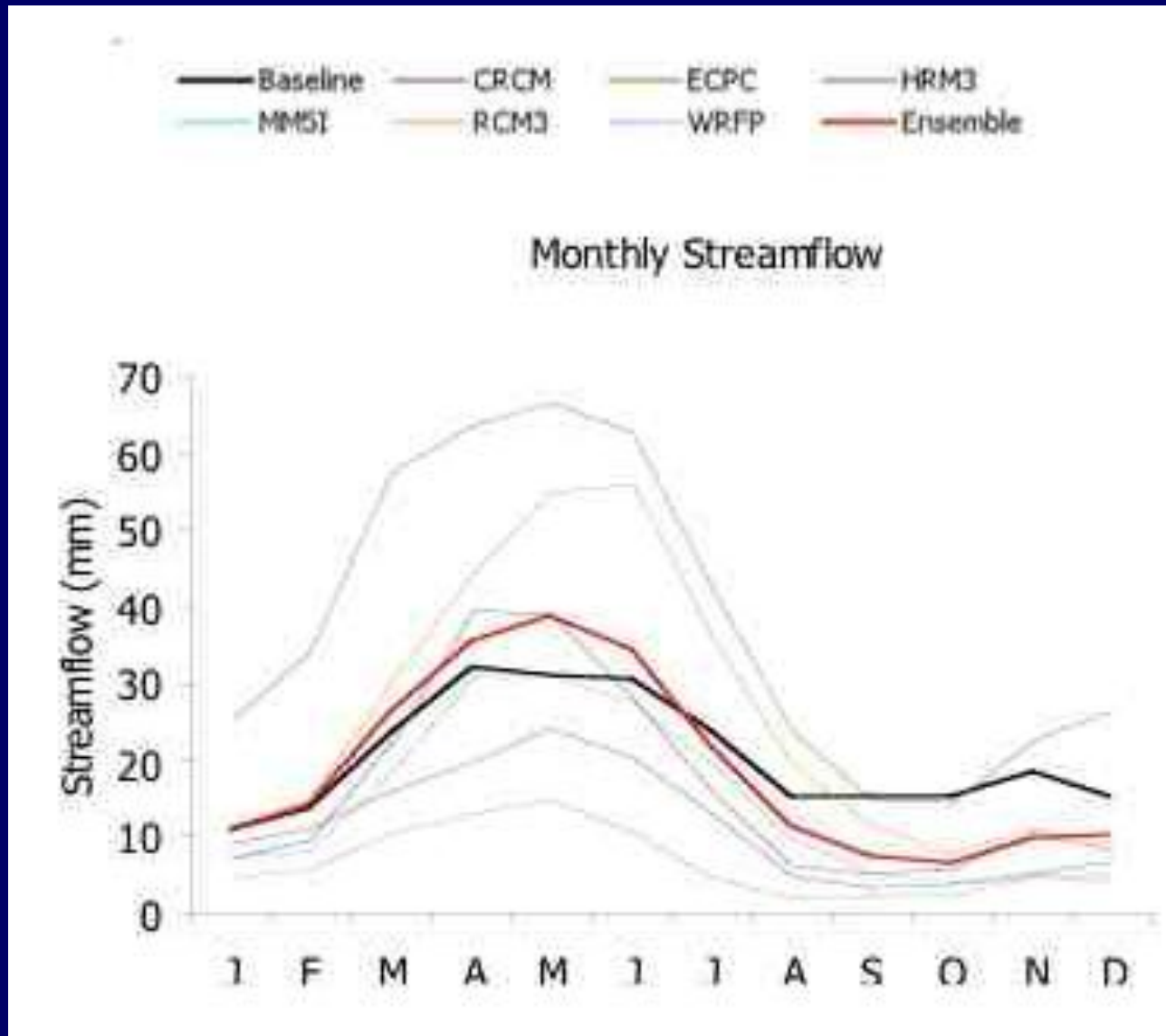
## Streamflow Interannual Variability



# Hydrologic Analysis (Takle et al.)



# Hydrologic Analysis (Takle et al.)



# Summary

## MONTHLY PRECIPITATION

Where there is a substantial periodic cycle:

- Models simulate well the interannual variability
- Models simulate well monthly, regional extremes

Where there is no substantial periodic cycle:

- Models simulate poorly the interannual var. & extremes
- Interior nudging improves interannual variability
- Interior nudging does not help extremes

## UPPER MISSISSIPPI STREAMFLOW

Ensemble replicates well the interannual variability

Annual cycle simulated less well

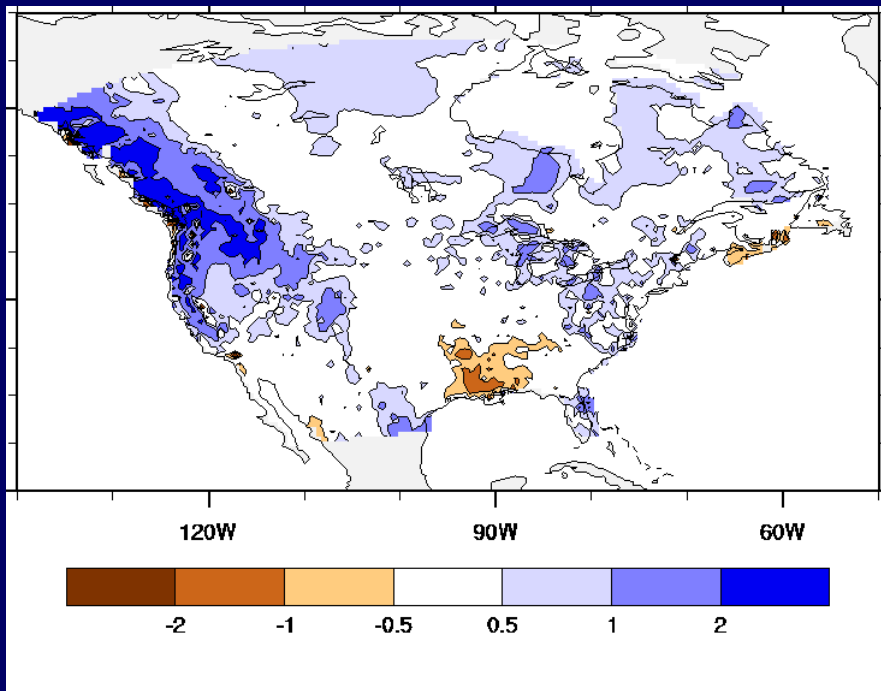
Thank You!



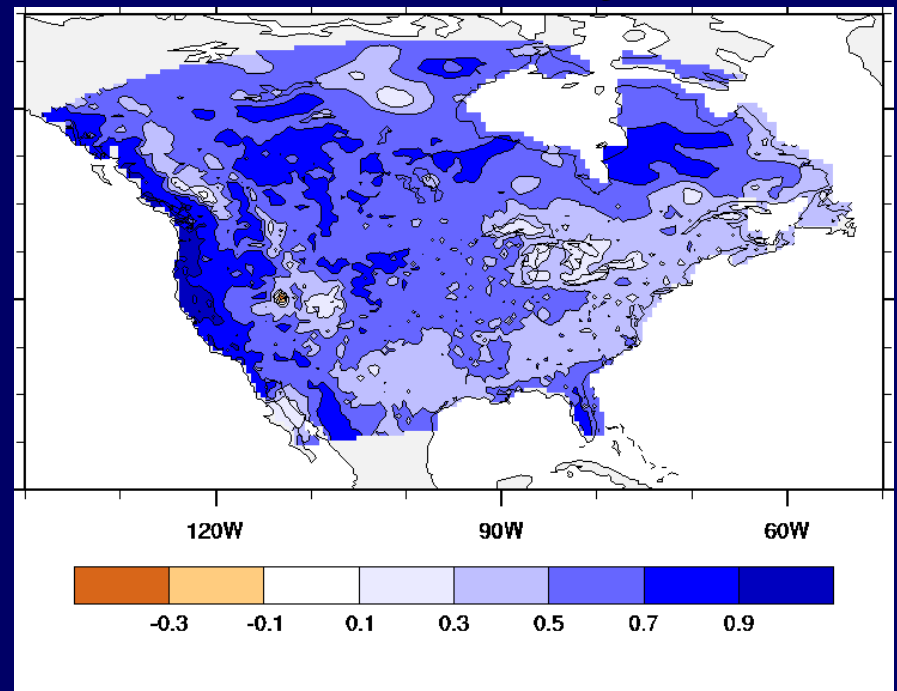
**([www.narccap.ucar.edu](http://www.narccap.ucar.edu))**

# Bias of the ensemble mean and correlation of ensemble monthly time series with observed time series.

## Bias



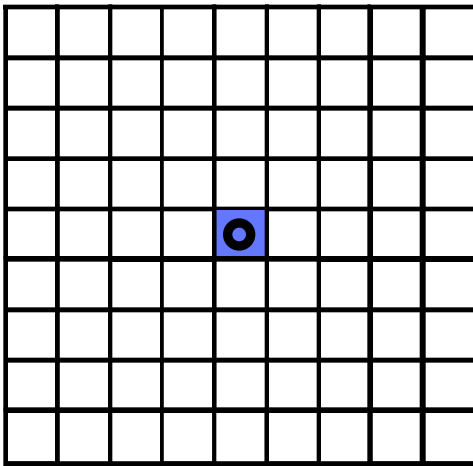
## Correlation of monthly time series



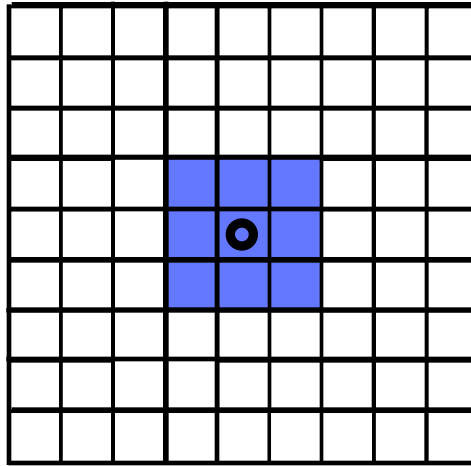
# How does spatial aggregation affect prediction skill?

Average both model and observations onto 3x3 or 5x5 grid square areas.

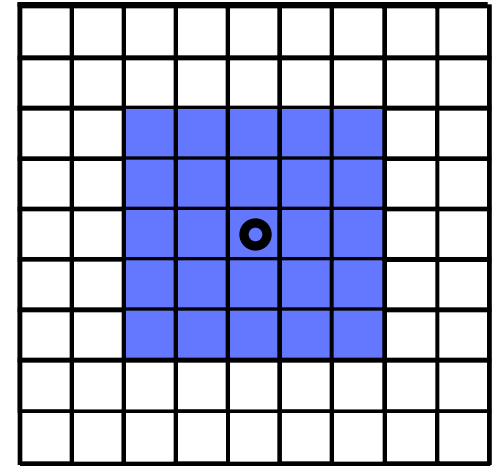
**pointwise**

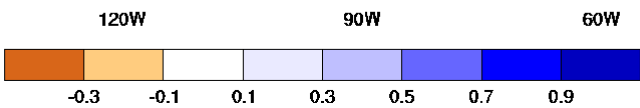
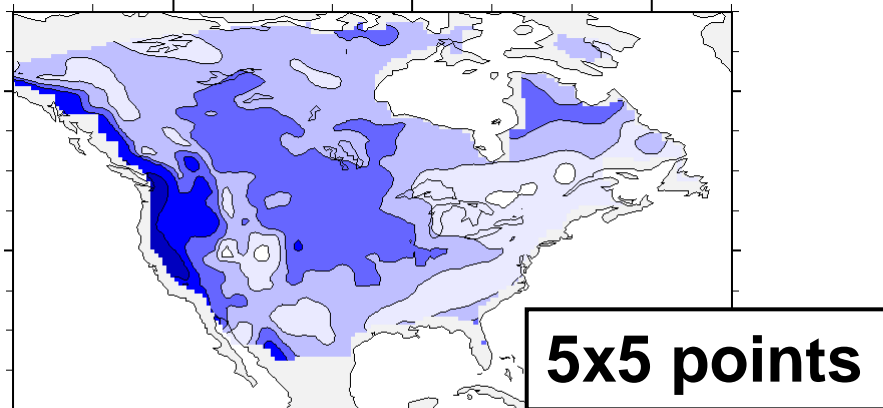
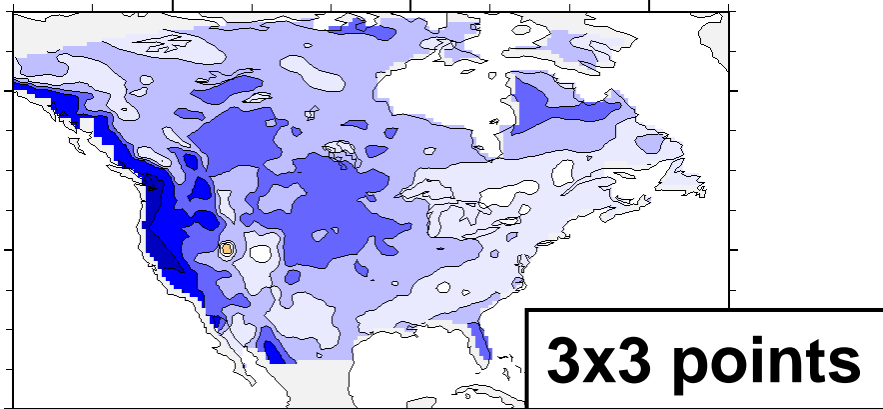
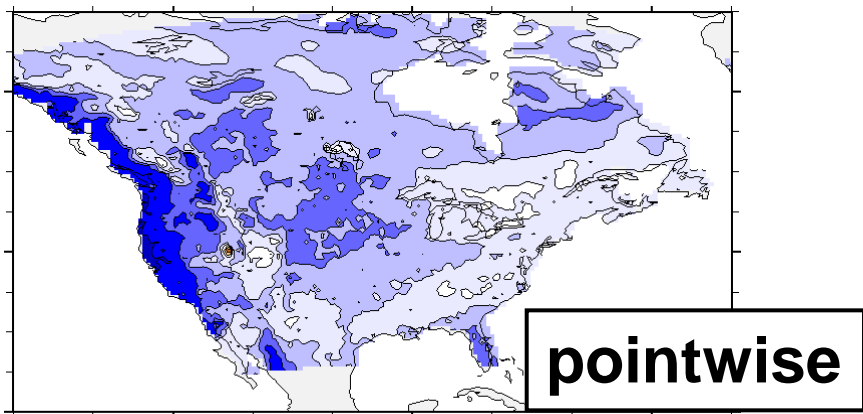


**3x3**



**5x5**

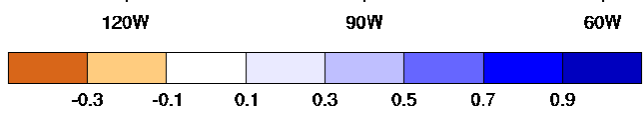
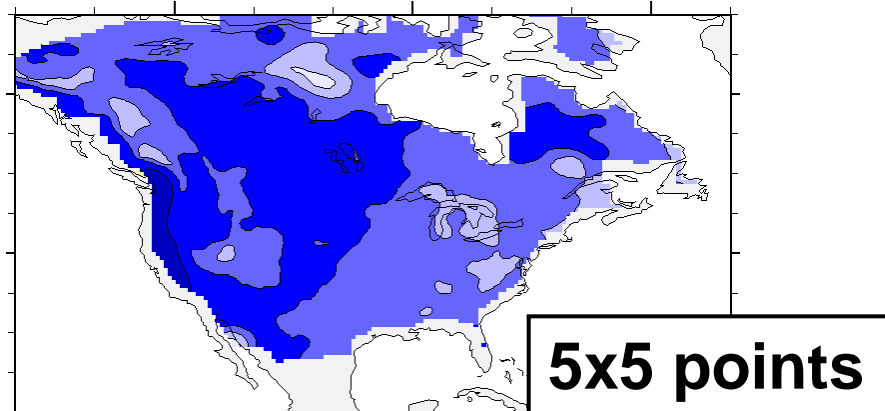
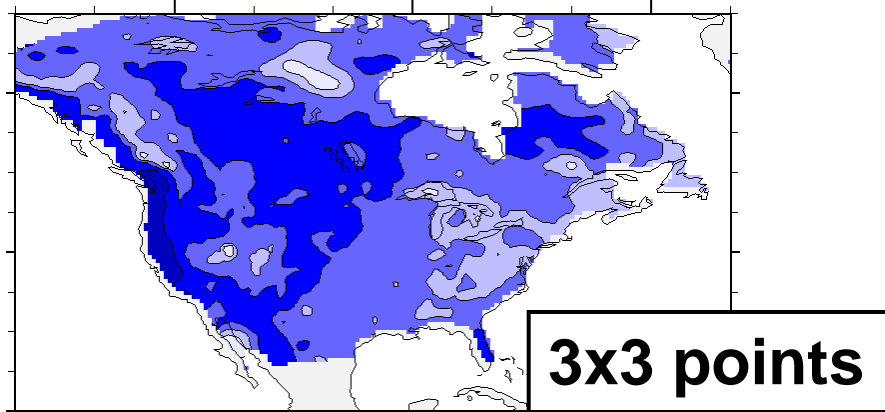
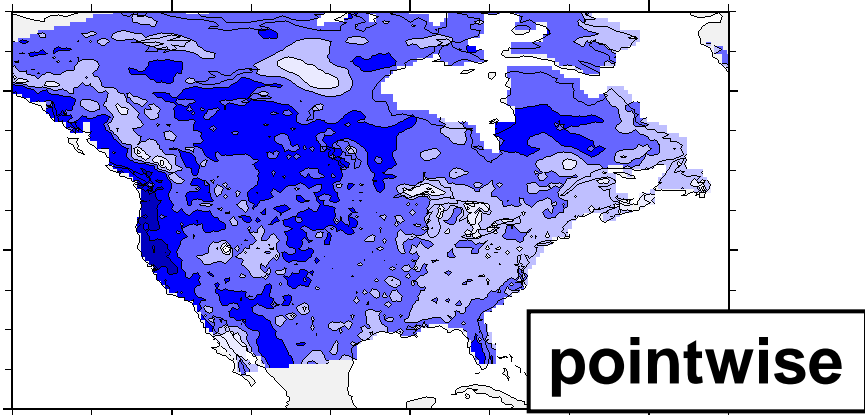




**Spatial aggregation tends to improve correlation, but effect differs across the domain.**

- Differs from model to model (MM5 shown here).
- Aggregation has more effect on individual models than on ensembles.
- Note improvement in central U.S. but not eastern U.S.

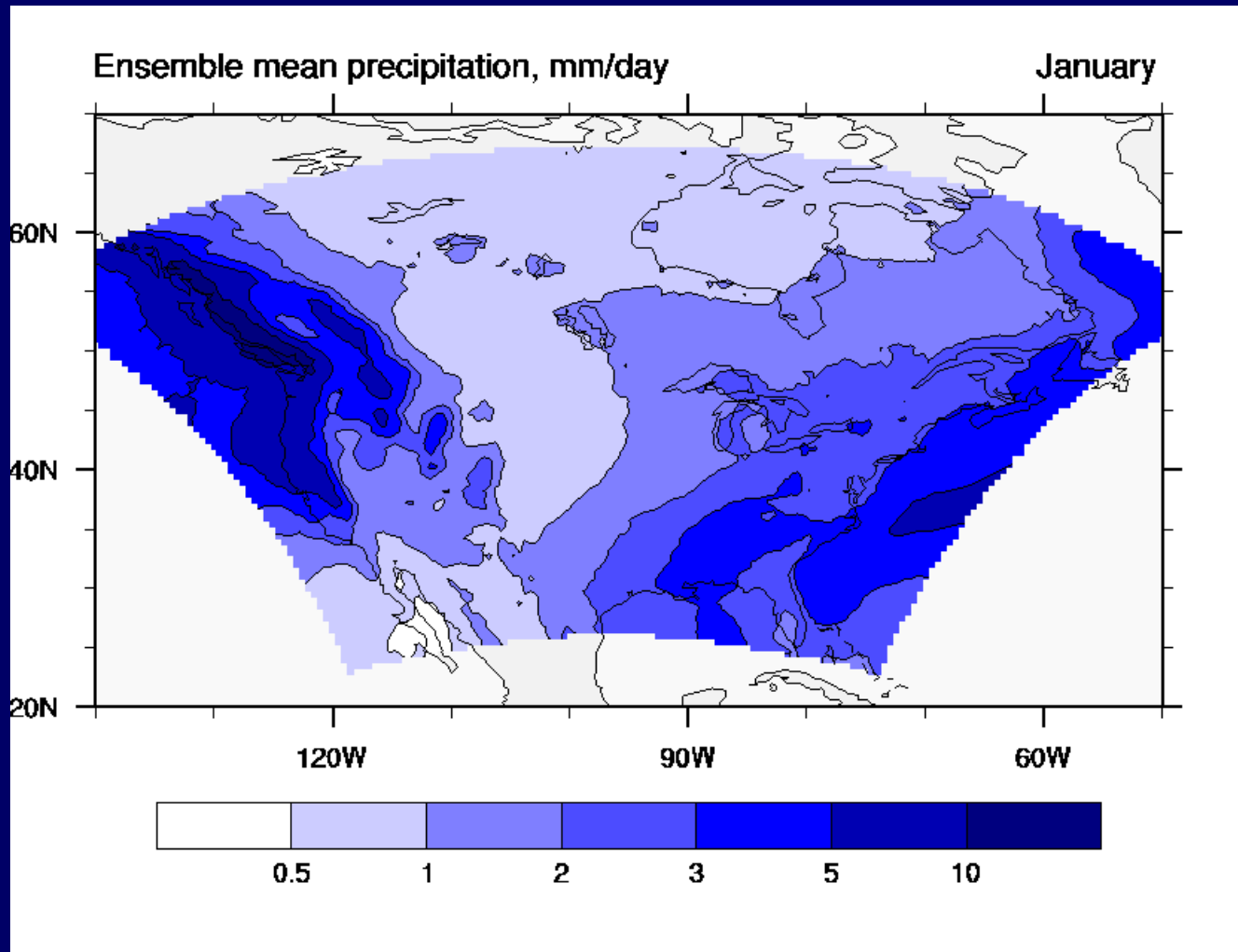




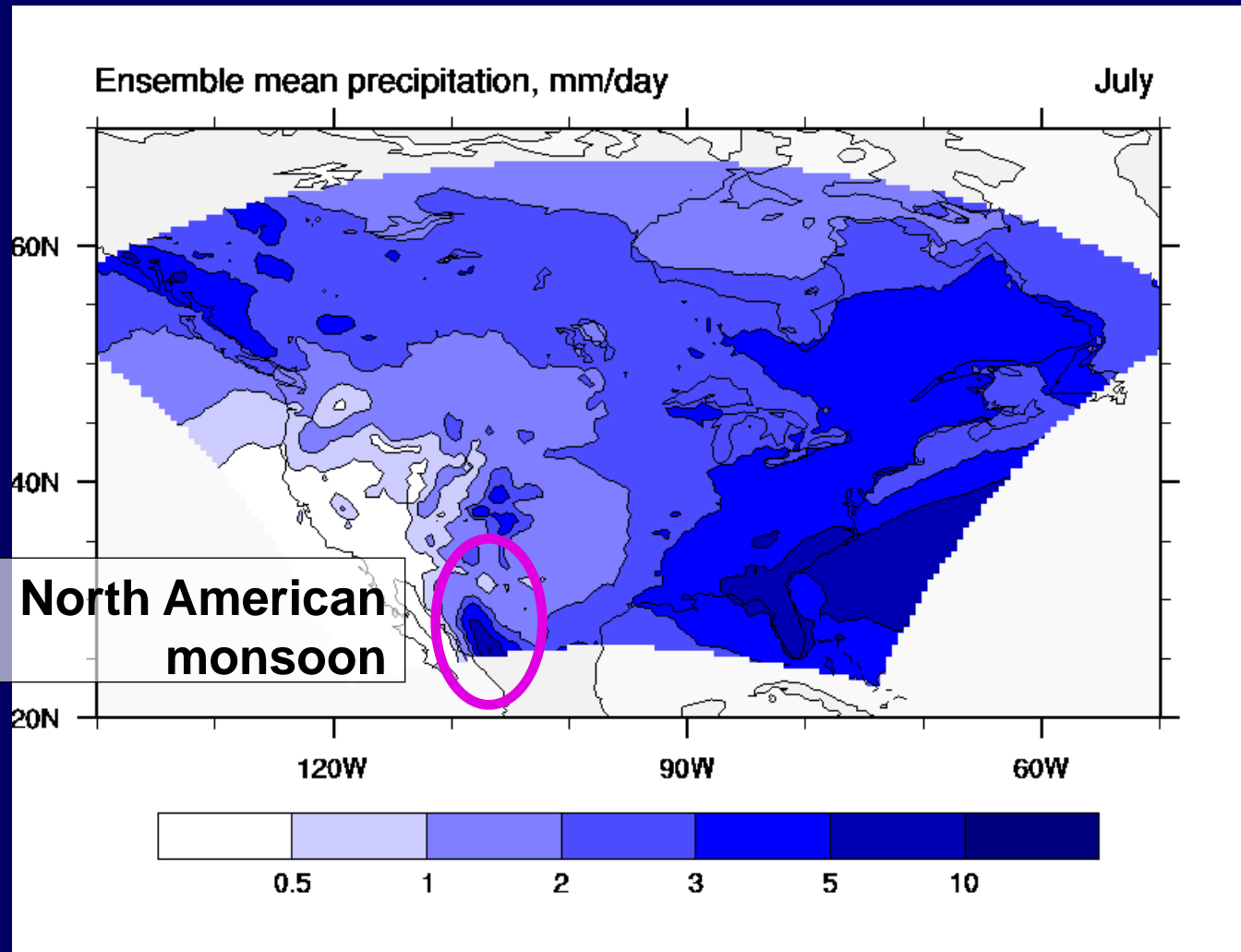
# Aggregation has a greater effect on correlation in a model with spectral nudging.

- Canadian RCM shown here.
- Note improvement in eastern U.S.
- **Hypothesis:** Large scales are better represented in a model with spectral nudging, so smoothing out small-scale irregularities produces more improvement.

# Ensemble mean precipitation: January

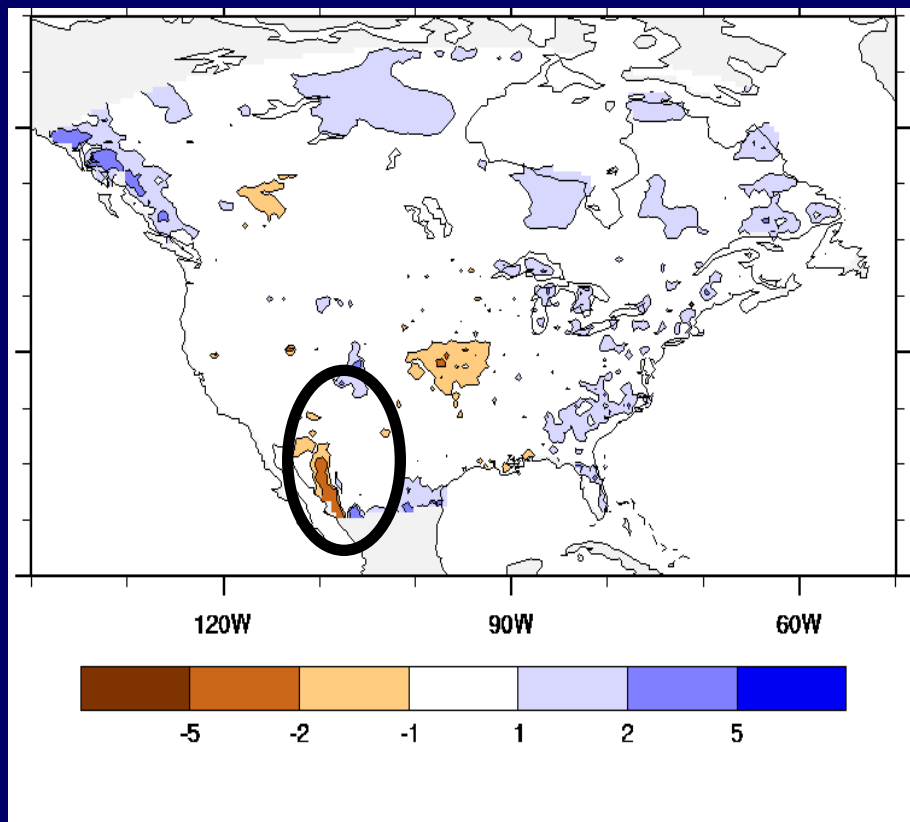


# Process oriented evaluation: the North American monsoon

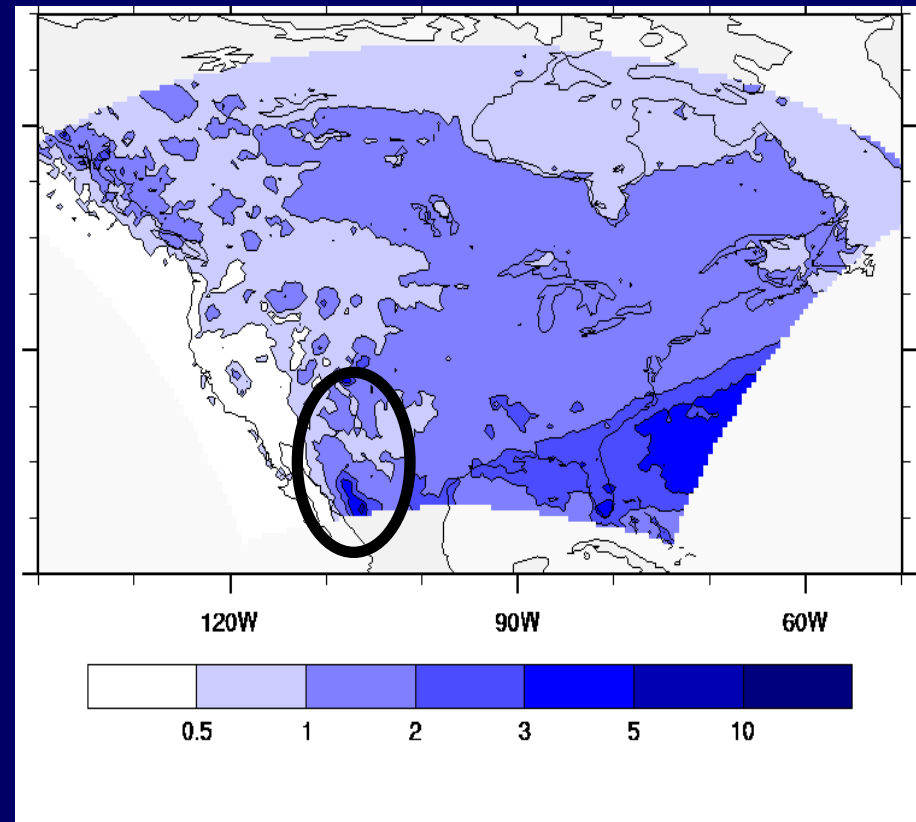


# Ensemble error and spread (July)

## Bias



## Ensemble spread



# Analysis of Extremes

**Societal importance, esp. for climate change**

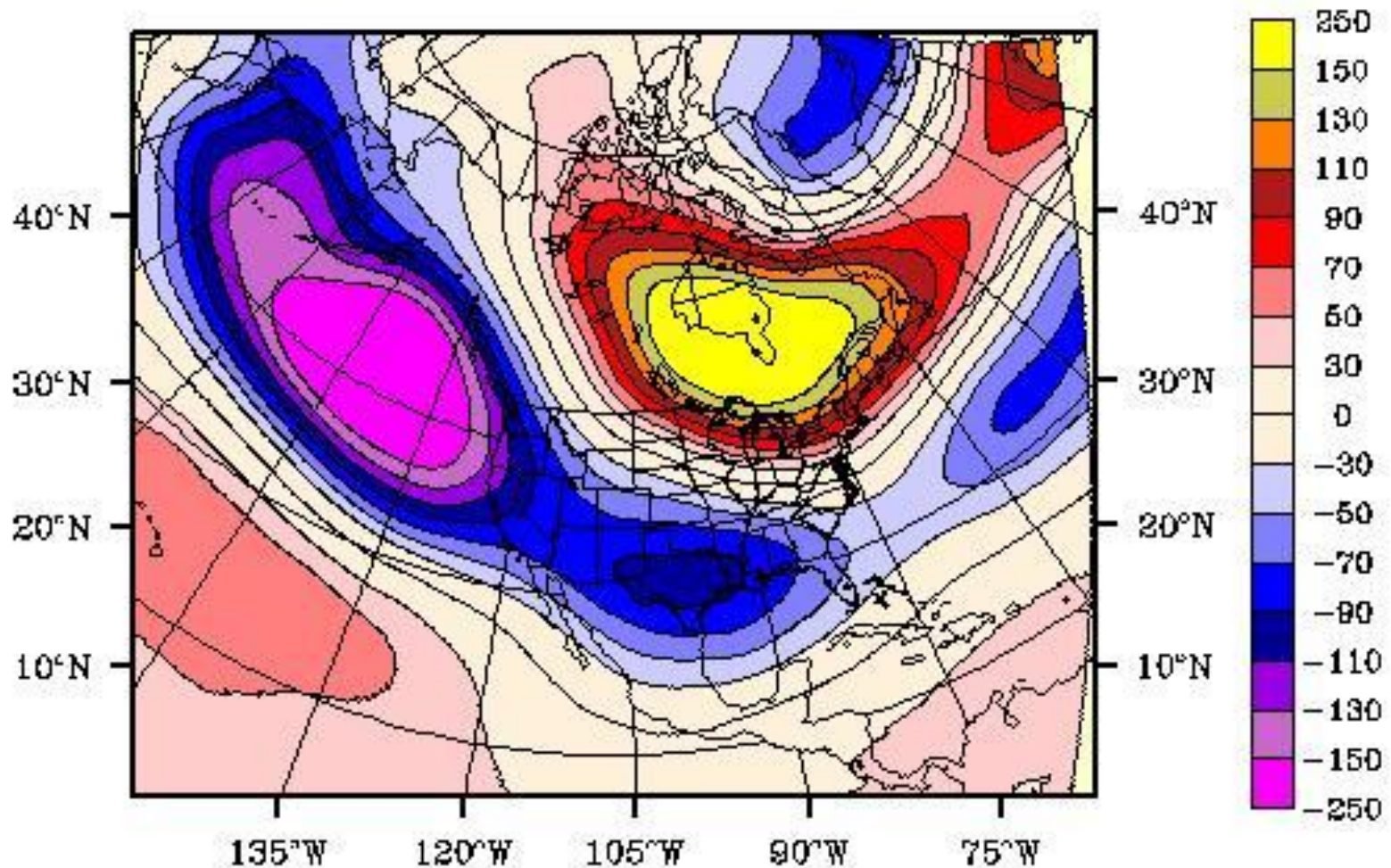
**Key Question: Do climate models behave like observations?**

**Diagnosis of physical mechanisms**

- **Necessary for model vs. obs. comparison**
- **Basis for developing confidence in projections**

# 500 hPa Height Anomalies – Coastal CA Extreme

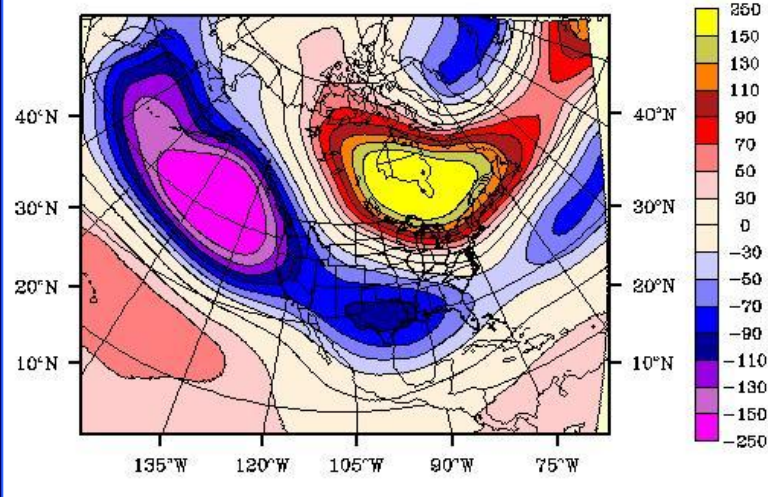
NARR 500hPa Height Anomaly  
Feb 1998 (m)



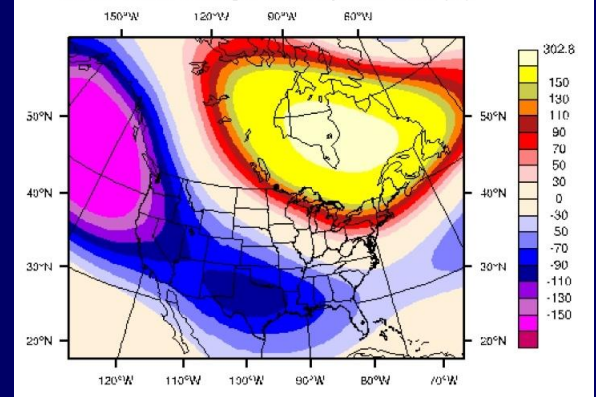


# 500 hPa Height Anomalies – Coastal CA Extreme

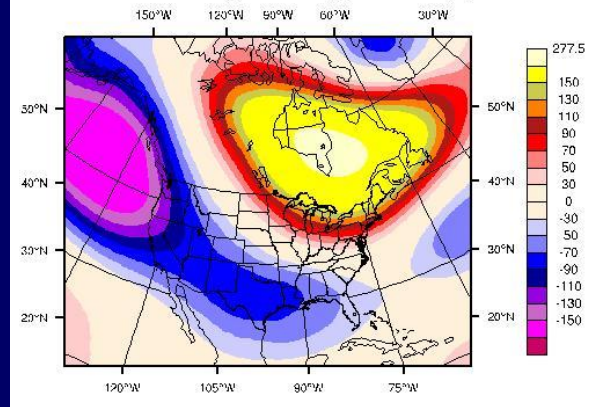
NARR 500hPa Height Anomaly  
Feb 1998 (m)



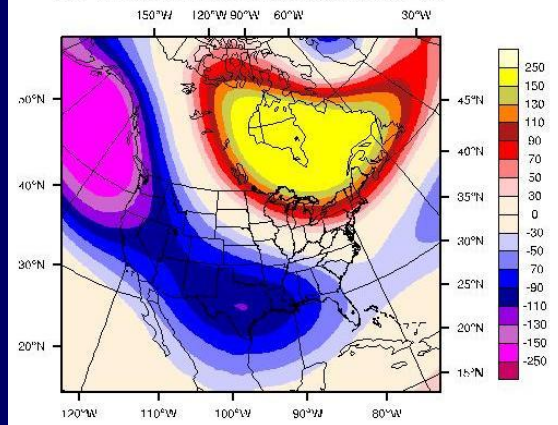
WRF 500hPa Height Anomaly, Feb 1998 (m)



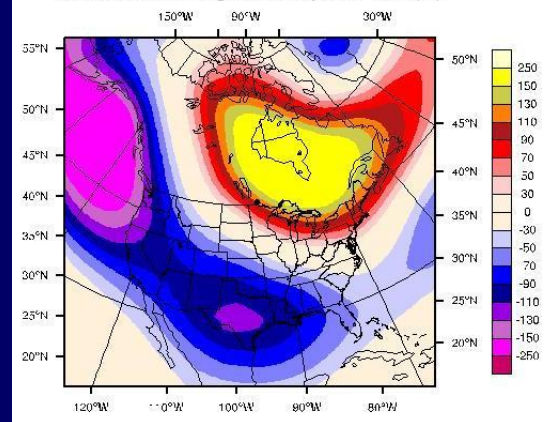
RCM3 500hPa Height Anomaly, Feb 1998 (m)



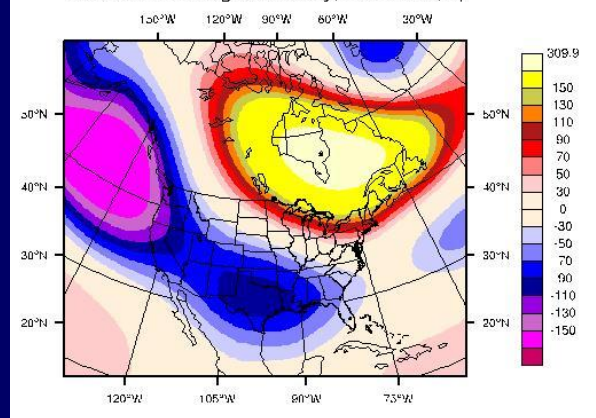
ECPC 500hPa Height Anomaly, Feb 1998 (m)



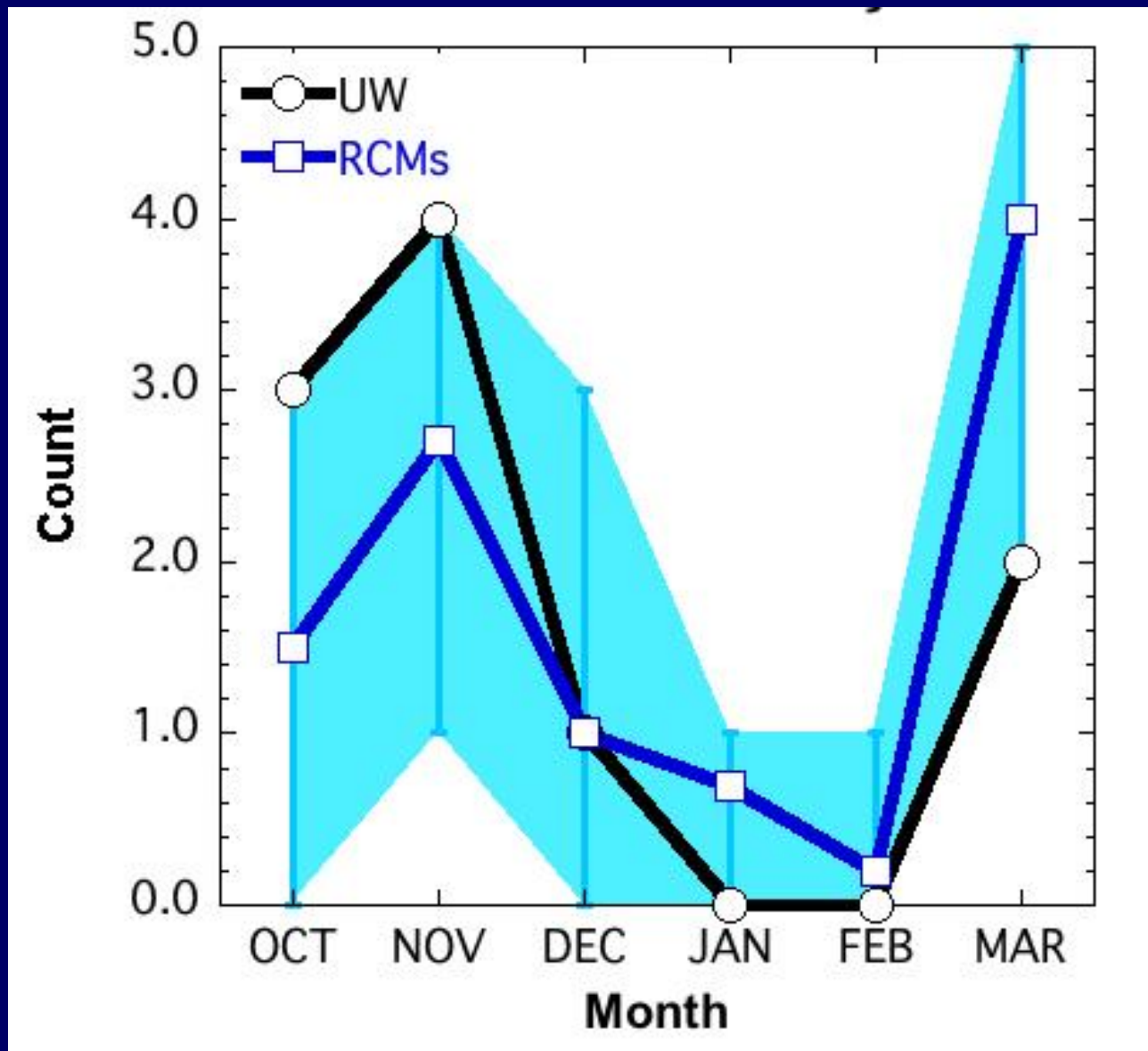
MRCC 500hPa Height Anomaly, Feb 1998 (m)



MM5 500hPa Height Anomaly, Feb 1998 (m)

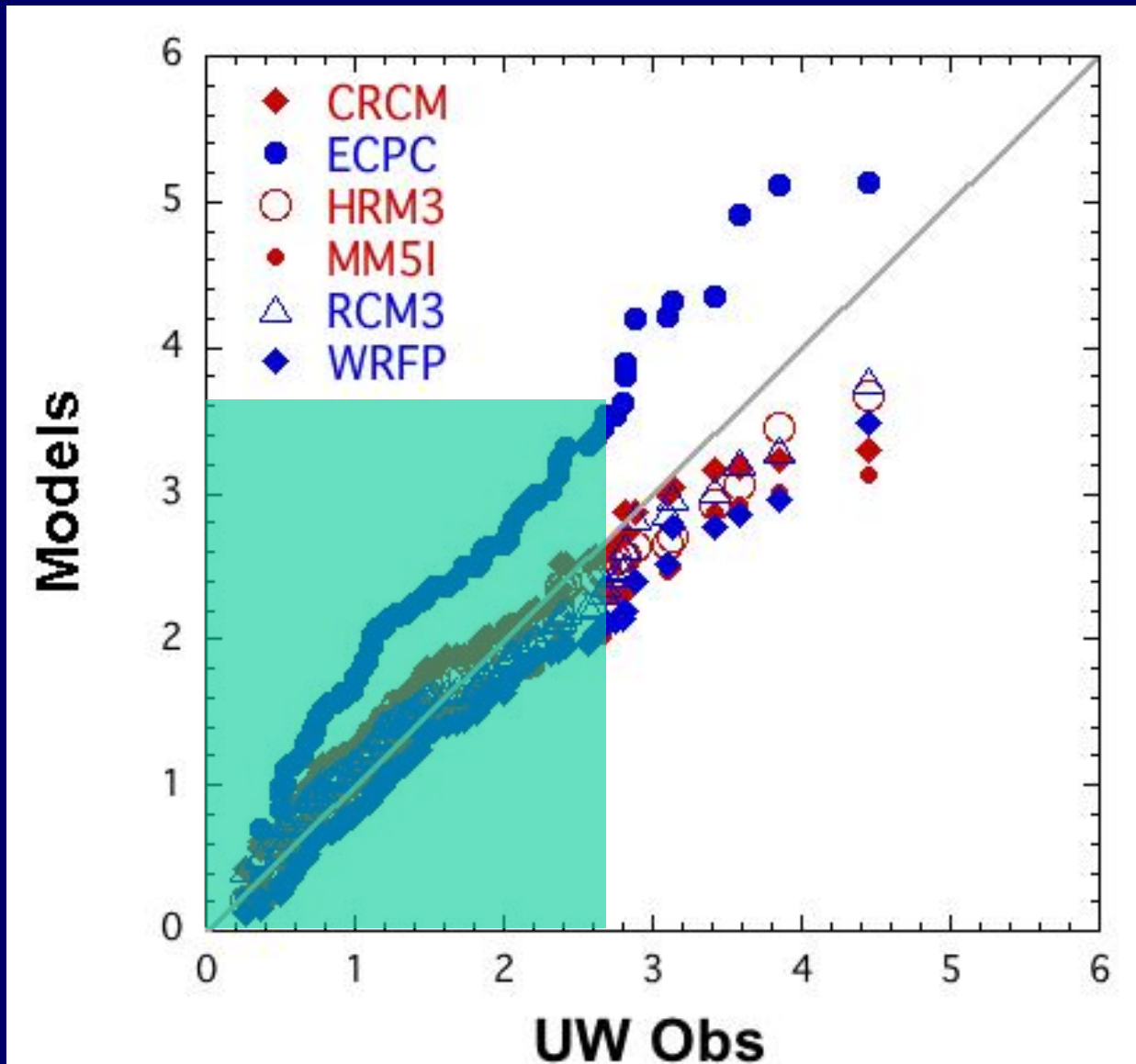


# Frequency – Upper MS



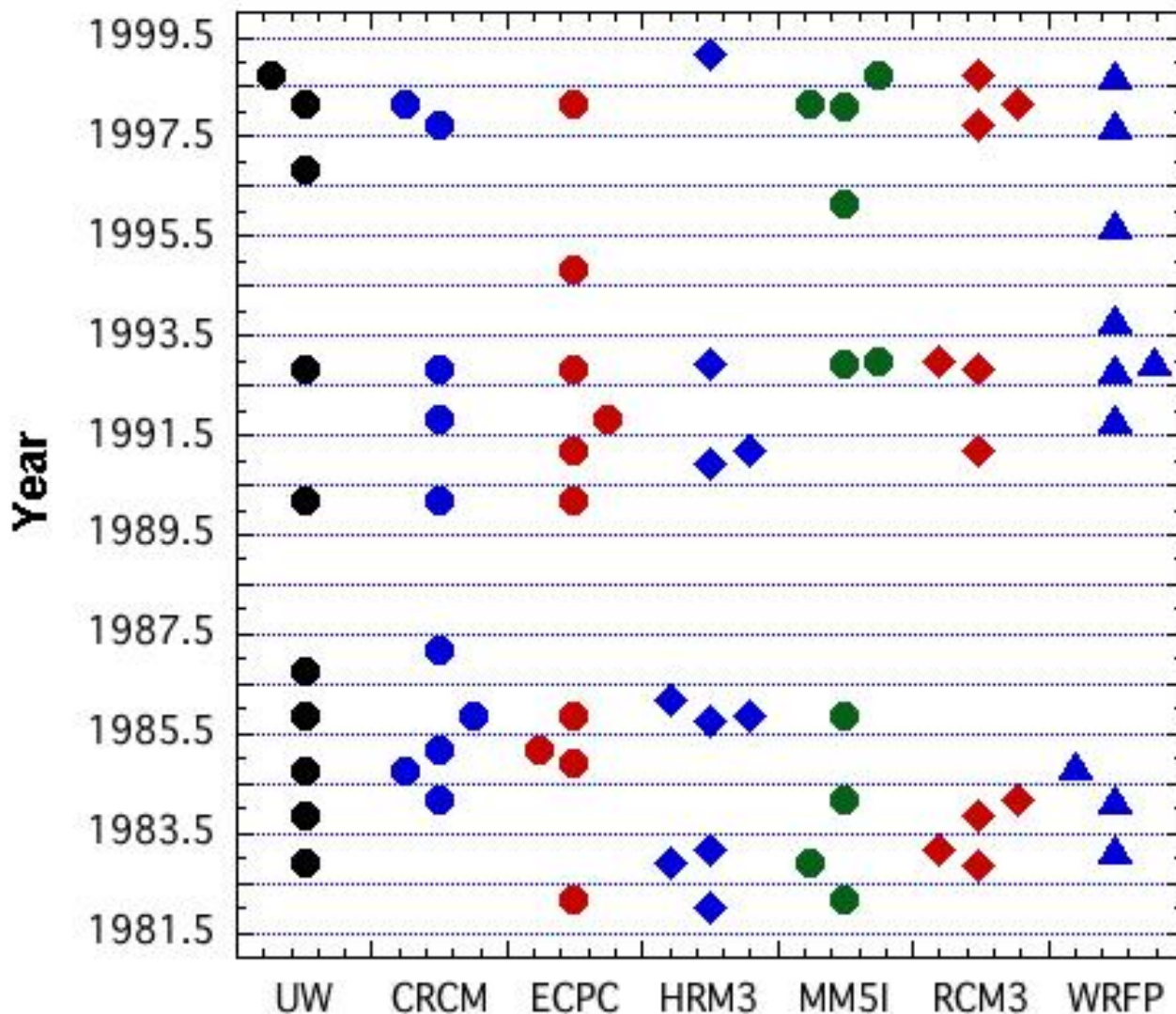


# Ranked Precipitation – Upper MS



Ensemble  
average of  
top 10 = 6  
% smaller than  
UW

# Interannual Variability – Upper MS

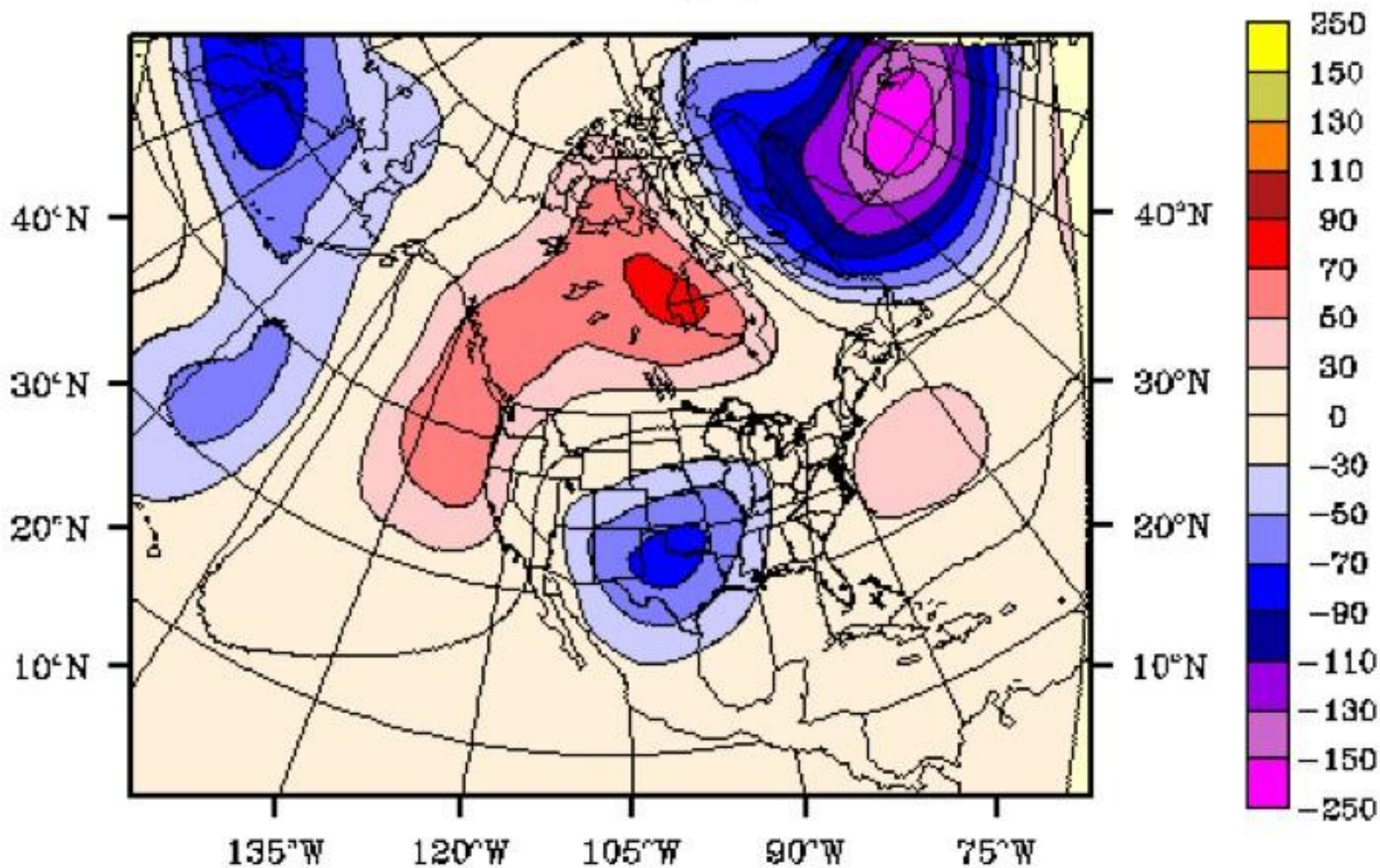


46 of 60 (77%)  
simulated  
extremes occur  
in cold seasons  
with an  
observed  
extreme.

(random  
chance: 33)

# 500 hPa Height Anomalies – Upper MS Extreme

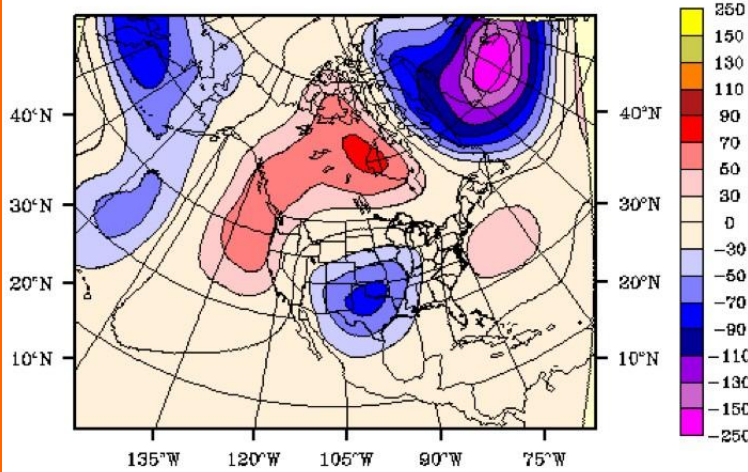
NARR 500hPa Height Anomaly  
Nov 1992 (m)



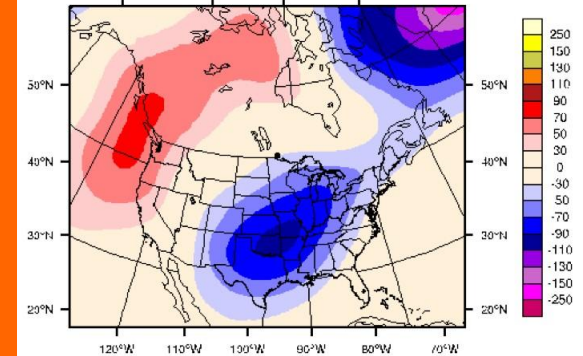


# 500 hPa Height Anomalies – Upper MS Extreme

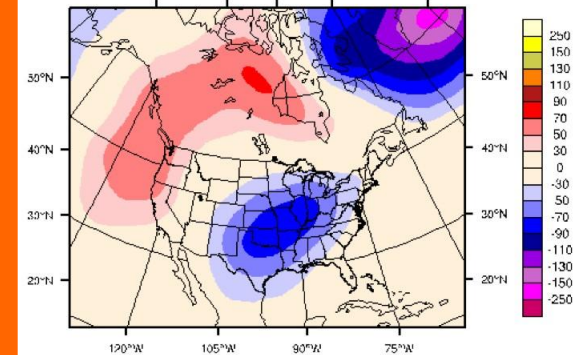
NARR 500hPa Height Anomaly  
Nov 1992 (m)



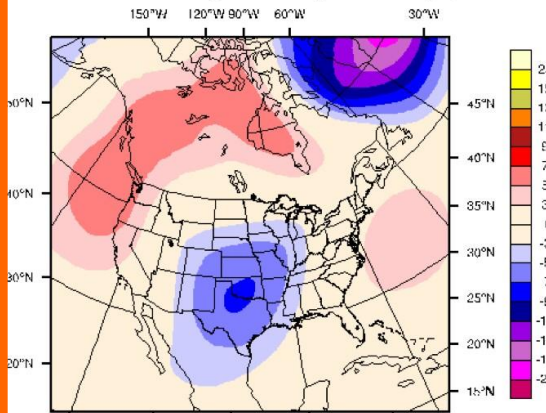
WRFP 500hPa Height Anomaly, Nov 1992 (m)



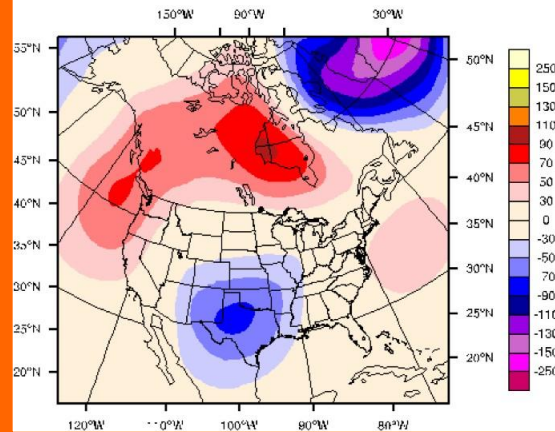
RCM3 500hPa Height Anomaly, Nov 1992 (m)



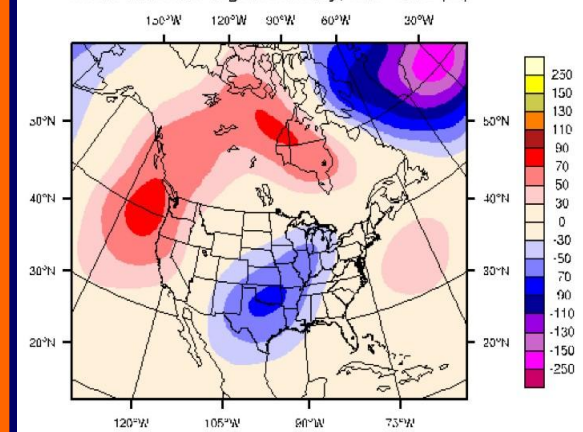
ECPC 500hPa Height Anomaly, Nov 1992 (m)



MRCC 500hPa Height Anomaly, Nov 1992 (m)



MM5I 500hPa Height Anomaly, Nov 1992 (m)

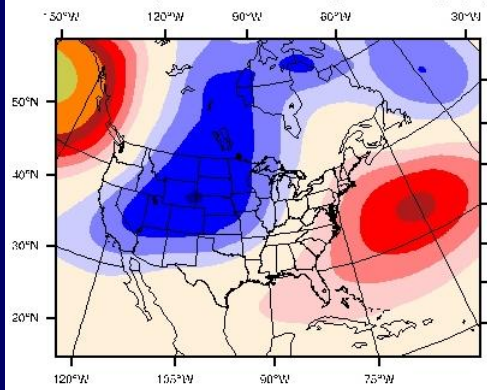


# Composite 500 hPa Height Anomalies

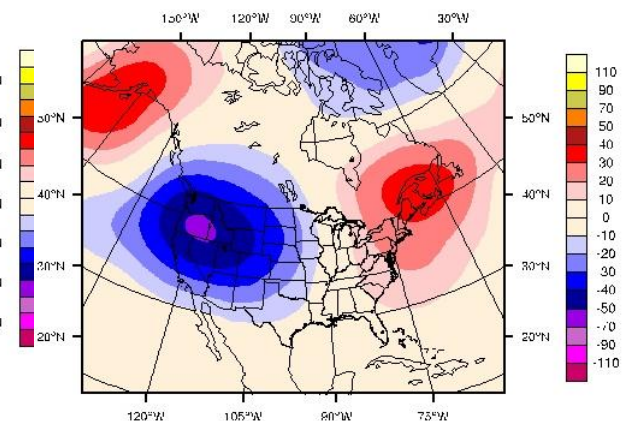
## Top 10 Extremes

## Upper MS

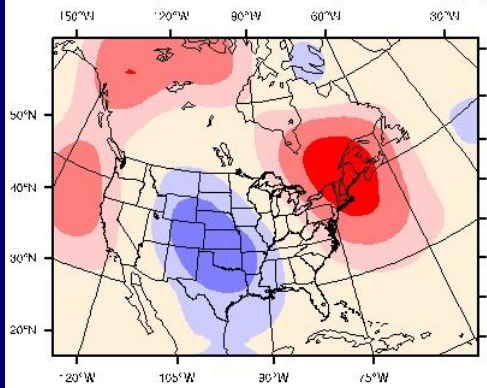
ECPC Composite 500hPa Height Anomaly (m)



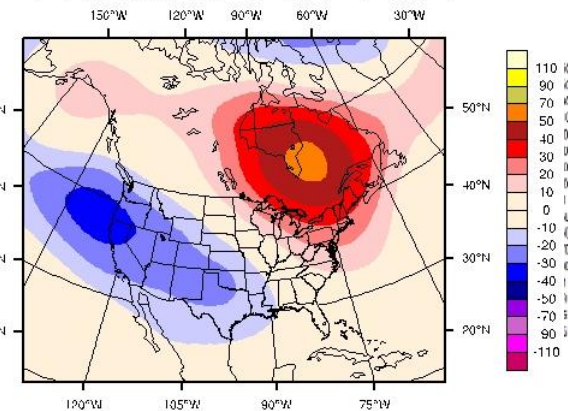
MM5I Composite 500hPa Height Anomaly (m)



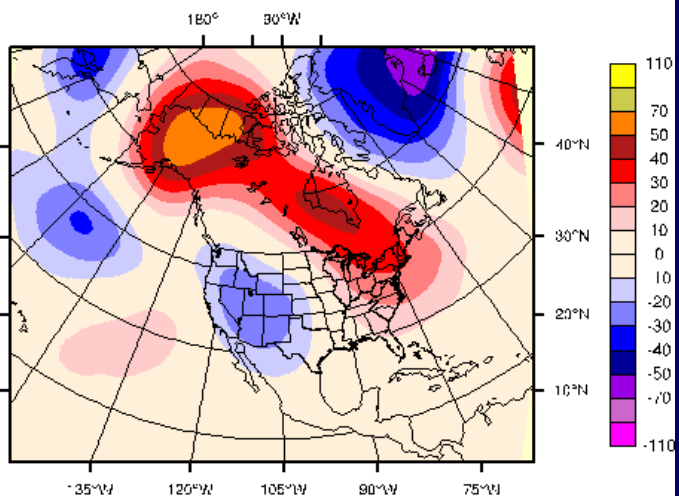
MRCC Composite 500hPa Height Anomaly (m)



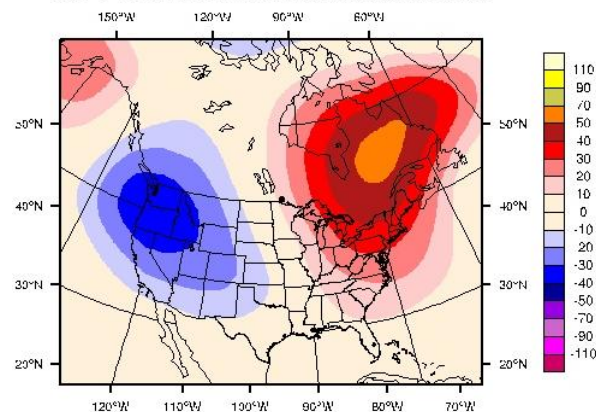
RCM3 Composite 500hPa Height Anomaly (m)



NARR Composite 500hPa Height Anomaly (m)



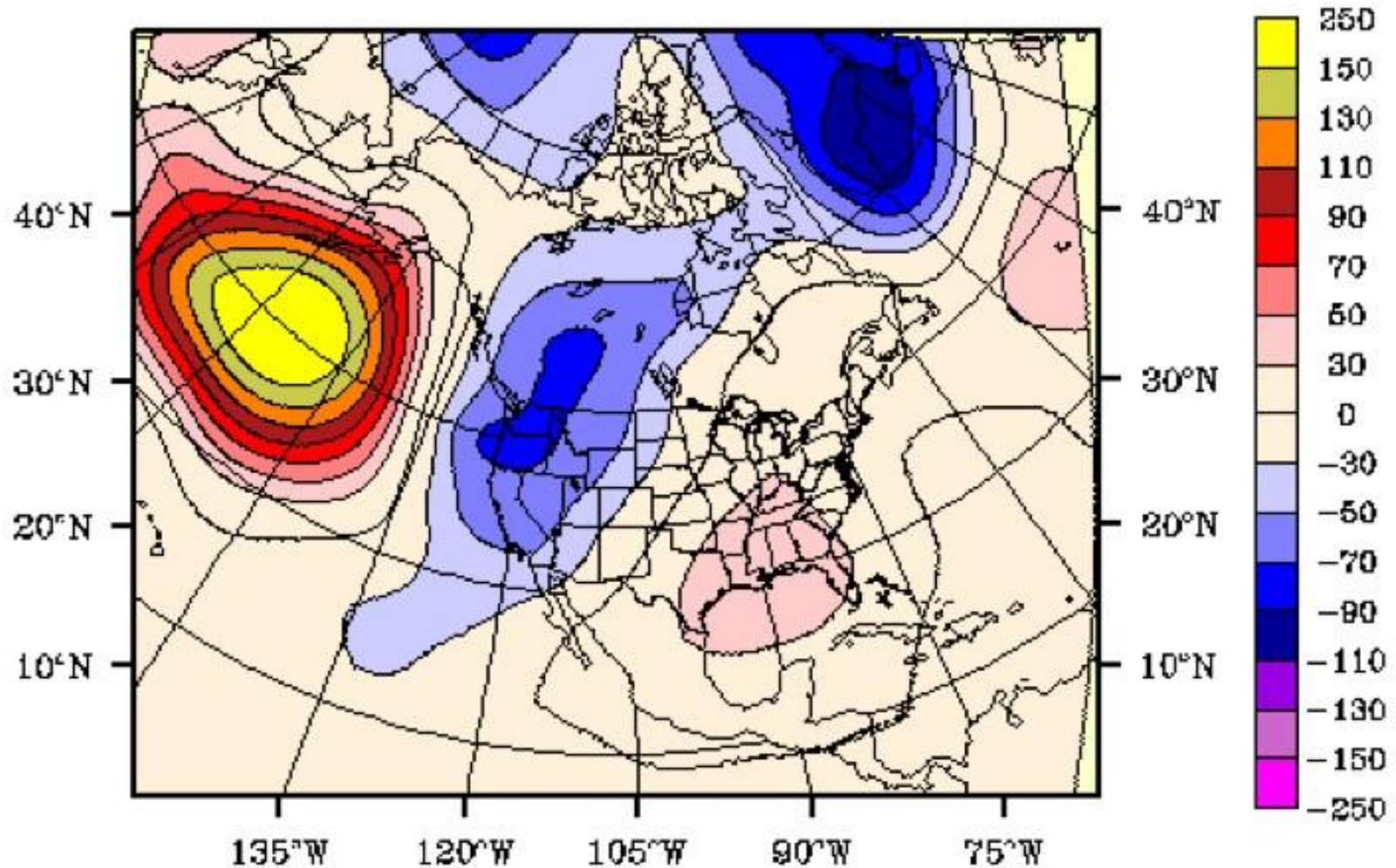
WRFP Composite 500hPa Height Anomaly (m)





# 500 hPa Height Anomalies – Deep South Extreme

NARR 500hPa Height Anomaly  
Dec 1992 (m)



# Correlation: Monthly Observations and Ensemble Mean

