

# Convection Permitting Modeling of North American Climate

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**Sponsored by NCAR Water System Program**

## ***Team members:***

**Roy Rasmussen, Mike Barlage, Fei Chen, Martyn Clark, Aiguo Dai, Jimy Dudhia, David Gochis, Ethan Gutmann, Kyoko Ikeda, Changhai Liu, Andrew Newman, Andreas Prein, Gregory Thompson, David Yates, and University Collaborators**

# Project Team

Project Lead	Roy Rasmussen	RAL/HAP
Experiment Designing and WRF Modeling	Changhai Liu	RAL/HAP
	Jimmy Dudhia	MMM
	Liang Chen, Sopan Kurkute	University of Saskatchewan
Data Analysis and Management	Kyoko Ikeda, Changhai Liu, Andreas Prein, Andrew Newman, Aiguo Dai	RAL/HAP
Microphysics	Greg Thompson	RAL/HAP
LSM modeling	Fei Chen, Mike Barlage	RAL/HAP
Hydrology modeling	David Gochis	RAL/HAP
Snow Physics	Martyn Clark	RAL/HAP
Dynamical Downscaling	Ethan Gutmann	RAL/HAP
Social Impacts	Dave Yates	RAL/HAP

# OUTLINE

## Overview of the Project

- Motivations & Objectives
- Methodology
- Numerical Experiments

## Results of Two Completed Experiments

- 13-year control simulation
- 13-year climate sensitivity simulation

# Science Objectives of the Project

- to evaluate WRF's ability to capture orographic precipitation/snowpack in western US and convective precipitation in eastern US
- to assess future changes of snowfall/snowpack and associated hydrological cycles
- to examine precipitation changes under the CMIP5 projected global warming, including extremes, intensity, frequency, duration and type
- to provide a valuable community dataset for regional climate change and impact studies

# Numerical Approach

- 4-km WRF model with ***1360x1016x51*** cells
- Physics parameterizations
  - Microphysics [Thompson & Eidhammer 2014]
  - Noah-MP LSM [Niu et al 2011]
  - YSU PBL [Hong et al 2006]
  - RRTMG radiation [Iacono et al 2008]
- Spectral nudging: U, V, T, and GH

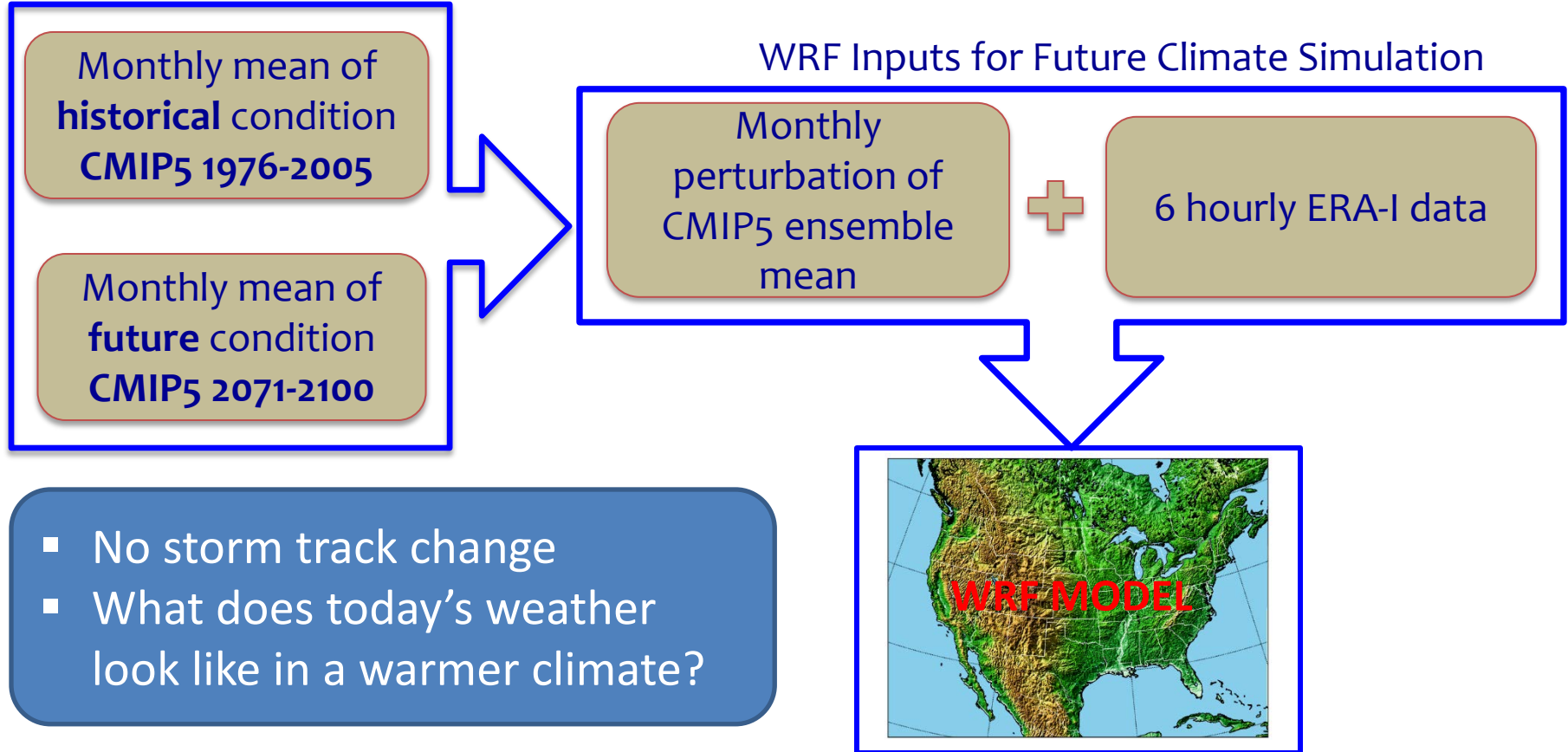


# Two Completed Experiments

- **EXP1:** Retrospective/Control simulation
  - **WRF<sub>input</sub> = ERA-Interim**
  - 13 years: *Oct. 1 2000 – Sep. 30 2013*
- **EXP2:** Pseudo-Global Warming (PGW) simulation
  - **WRF<sub>input</sub> = ERA-Interim +  $\Delta\text{CMIP5}_{\text{RCP8.5}}$**   
 $\Delta\text{CMIP5}_{\text{RCP8.5}} = \text{CMIP5}_{2071-2100} - \text{CMIP5}_{1976-2005}$
  - 13 years: *Oct. 1 2000 – Sep. 30 2013*

# What is PGW approach?

- Compute 19 CMIP5 model ensemble monthly mean
  - Historical period : 1976-2005    Future period (RCP8.5): 2071-2100
- Compute perturbation from two climates
- Add perturbation to ERA-I data



# Ongoing Experiments

- **EXP3:** CESM-based historical period (2000-2009) simulation
- **EXP4:** CESM-based future period (2090-2099) simulation

(Dai et al 2017)

$$\mathbf{WRF}_{\text{input}} = \mathbf{CESM}' + (\overline{\mathbf{CMIP5}} - \overline{\mathbf{CMIP5}_{\text{bias}}})$$
$$(\mathbf{CESM}' = \mathbf{CESM} - \overline{\mathbf{CESM}})$$

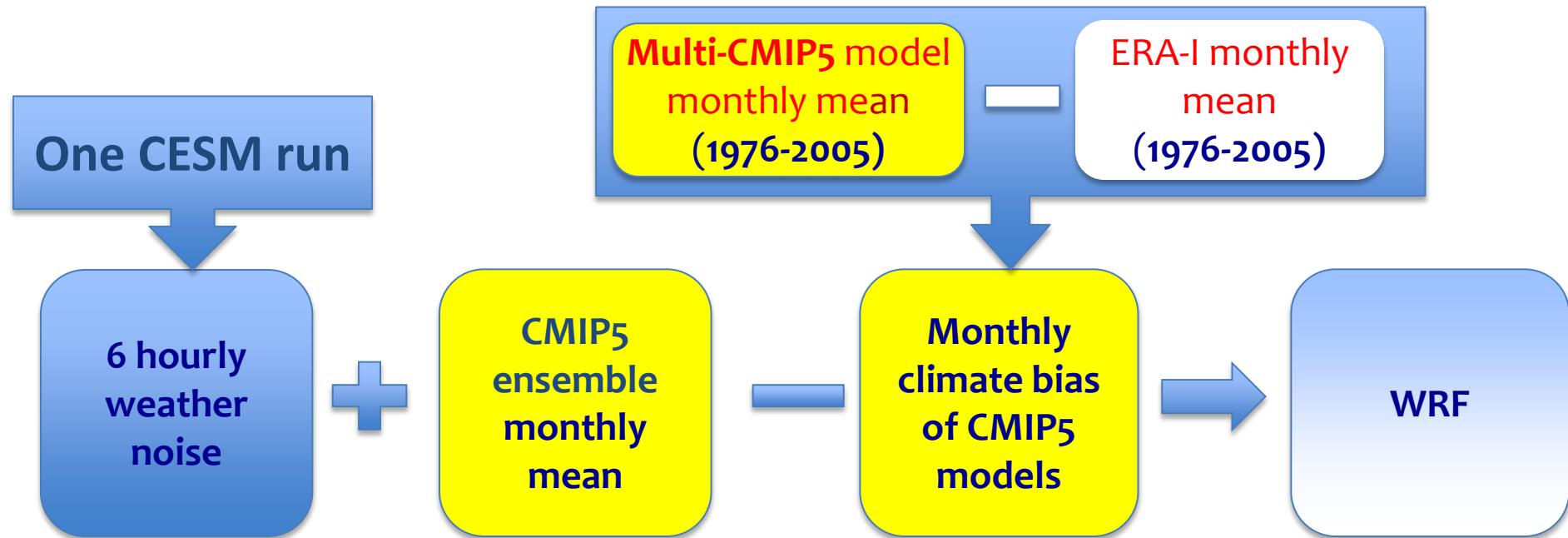
Conventional bias correction (Done et al 2012)

$$\mathbf{WRF}_{\text{input}} = \mathbf{CESM}' + (\overline{\mathbf{CESM}} - \overline{\mathbf{CESM}_{\text{bias}}})$$
$$(\mathbf{CESM}' = \mathbf{CESM} - \overline{\mathbf{CESM}})$$

# Forcing Data Construction

$$\text{WRF}_{\text{input}} = \text{CESM}' + \overline{\text{CMIP5}} - \overline{\text{CMIP5}}_{\text{bias}}$$

(  $\text{CESM}' = \text{CESM} - \overline{\text{CESM}}$  )



- Permit storm track changes
- Minimize influence of unforced natural variations

# Difference between PGW and CESM-based Simulations: Weather Noise

**PGW:**

$$\text{WRF}_{\text{input}} = \text{ERA-I}' + \overline{\text{ERA-I}}_{1976-2005} + (\overline{\text{CMIP5}}_{2071-2100} - \overline{\text{CMIP5}}_{1976-2005})$$

**CESM-based:**

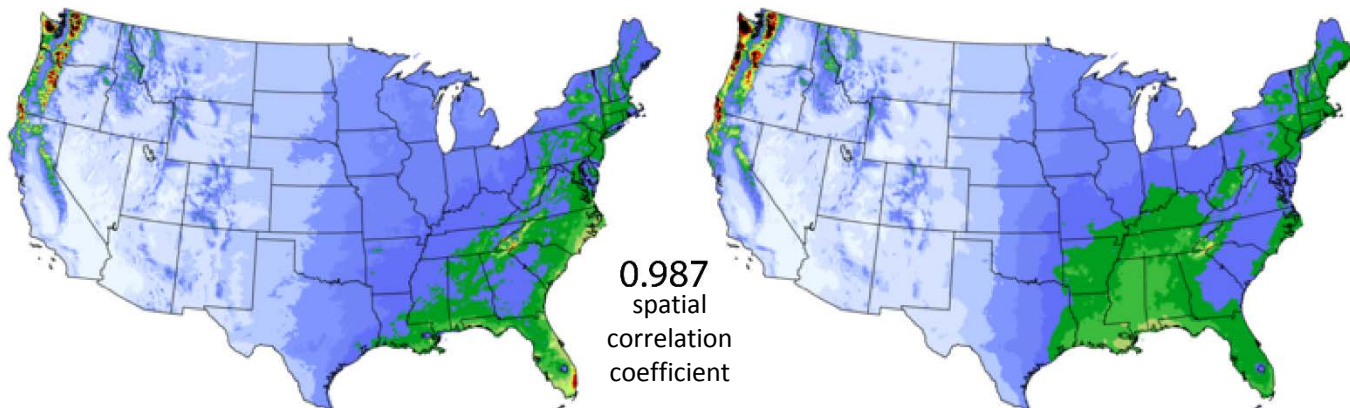
$$\text{WRF}_{\text{input}} = \text{CESM}' + \overline{\text{ERA-I}}_{1976-2005} + (\overline{\text{CMIP5}}_{2071-2100} - \overline{\text{CMIP5}}_{1976-2005})$$

$$\text{CESM}' = \text{CESM} - \overline{\text{CESM}}_{2071-2100}$$

# **Validation of Retrospective Experiment (Liu et al 2016)**

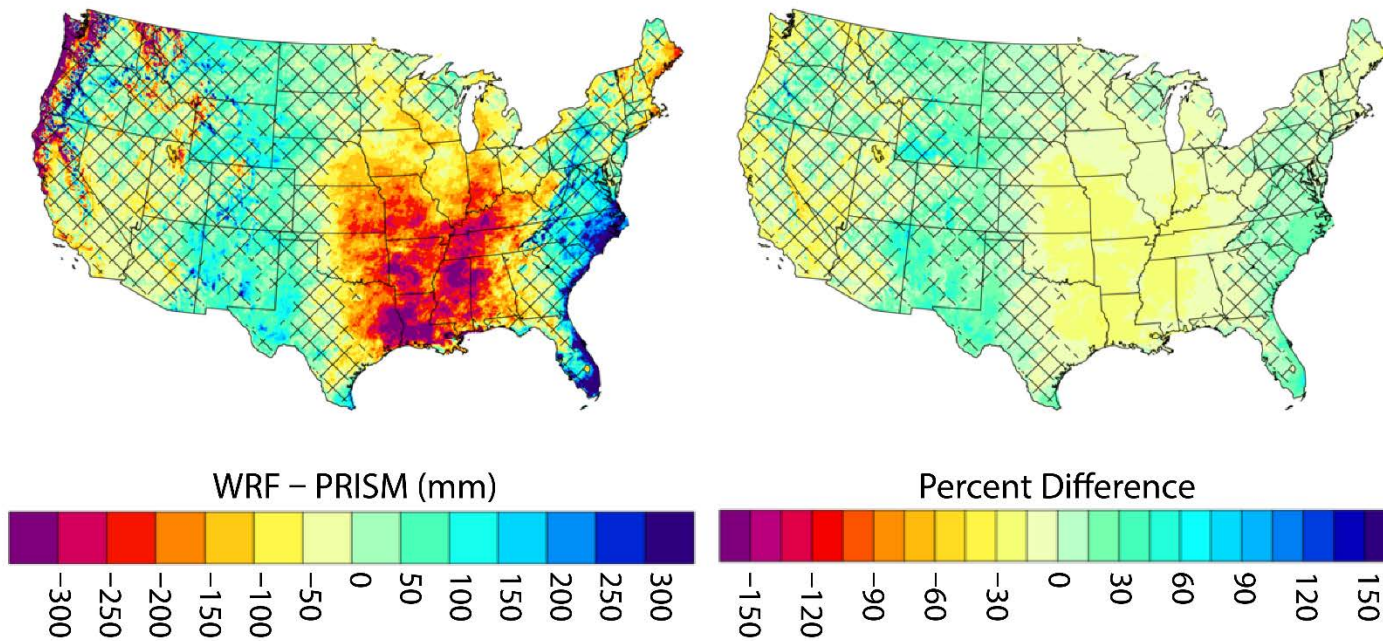
(a) WRF

(b) PRISM



(c) WRF - PRISM

(d) Percent Difference

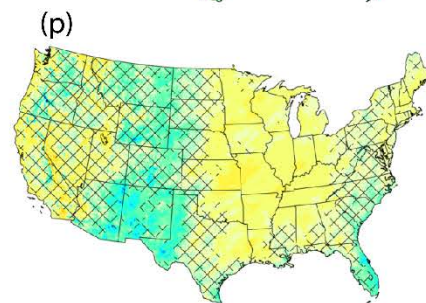
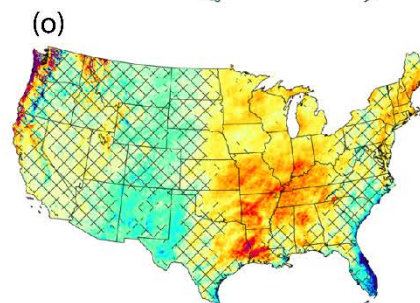
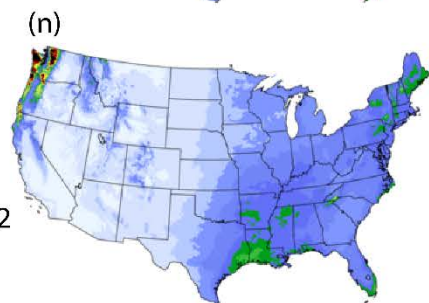
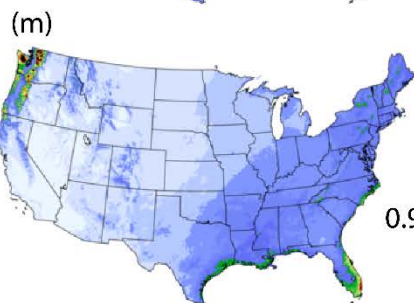
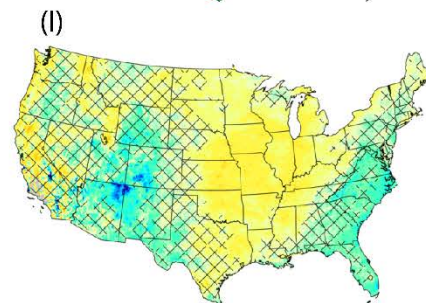
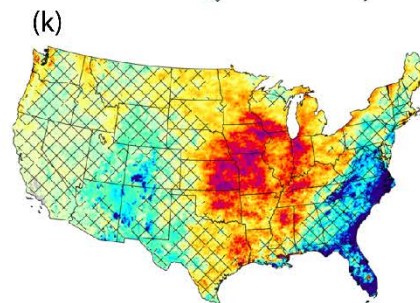
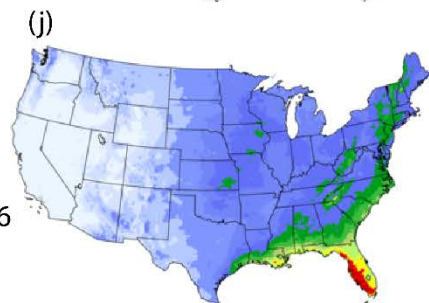
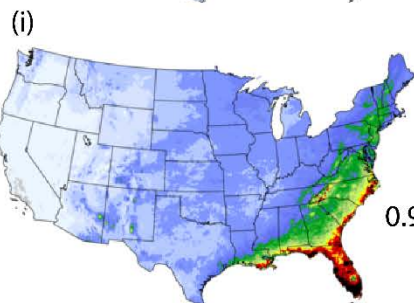
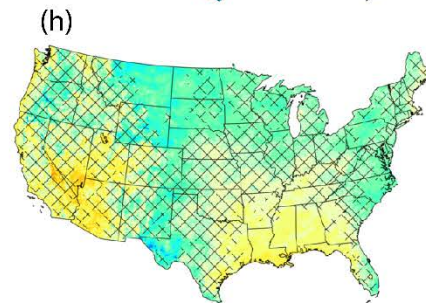
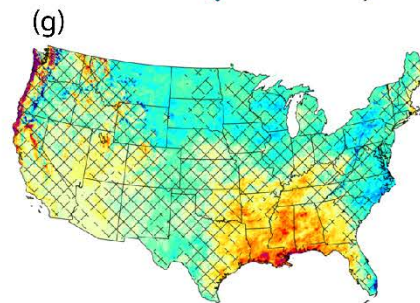
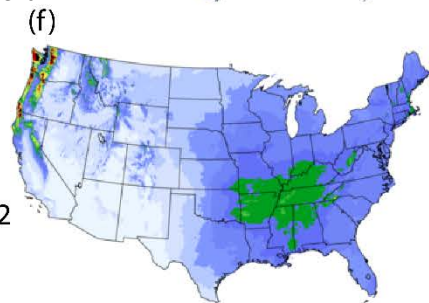
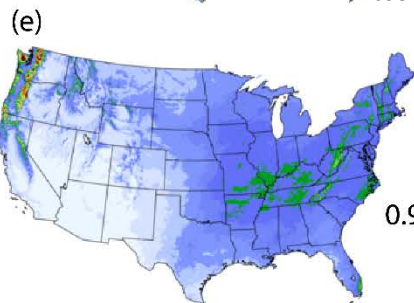
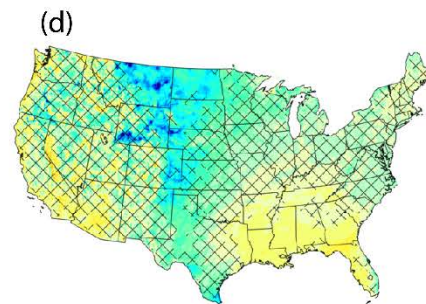
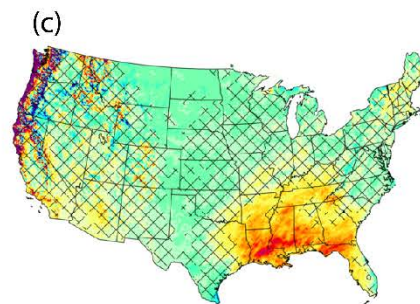
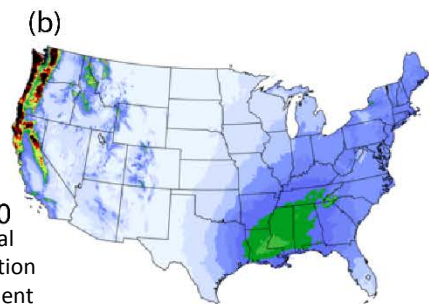
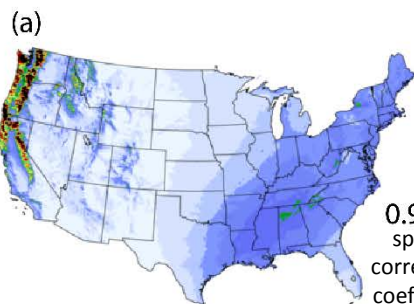


WRF

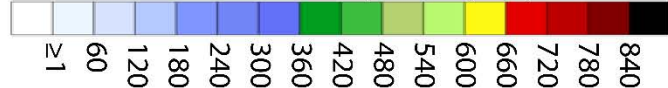
PRISM

WRF - PRISM

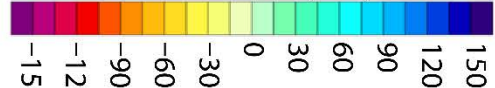
Percent Difference



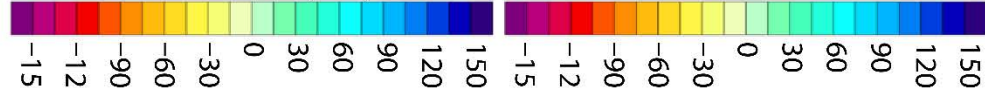
Seasonal Precipitation (mm)



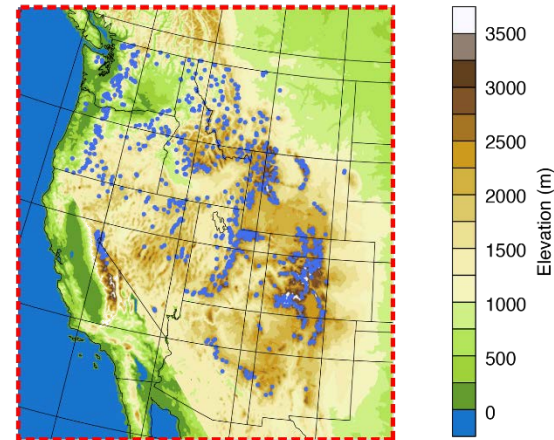
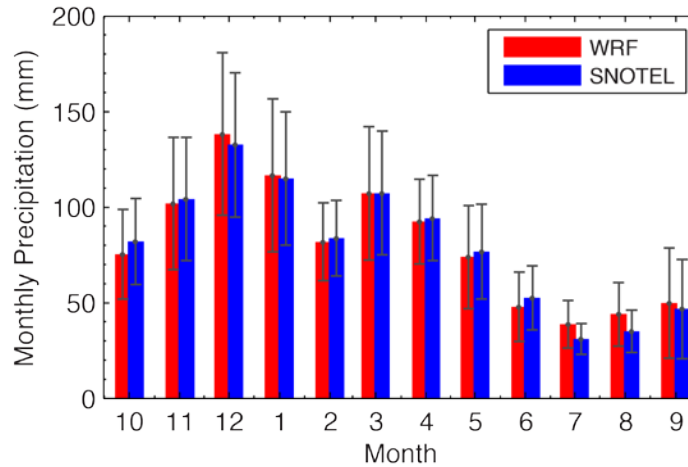
WRF - PRISM (mm)



Percent

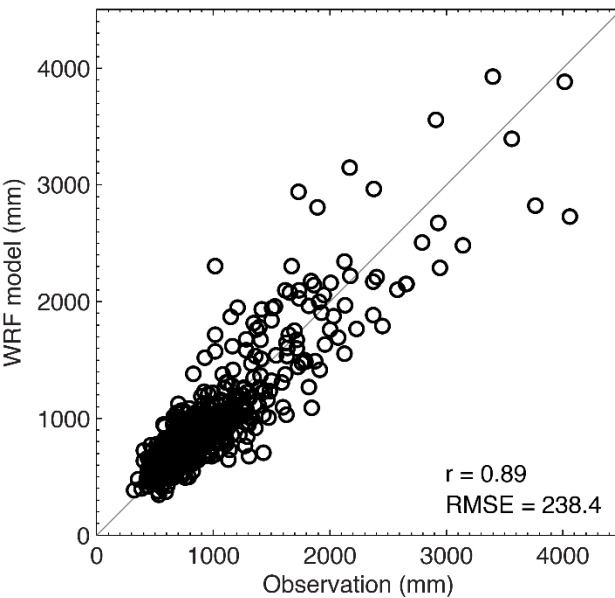


## 13-year Average Monthly Precipitation at SNOTEL sites

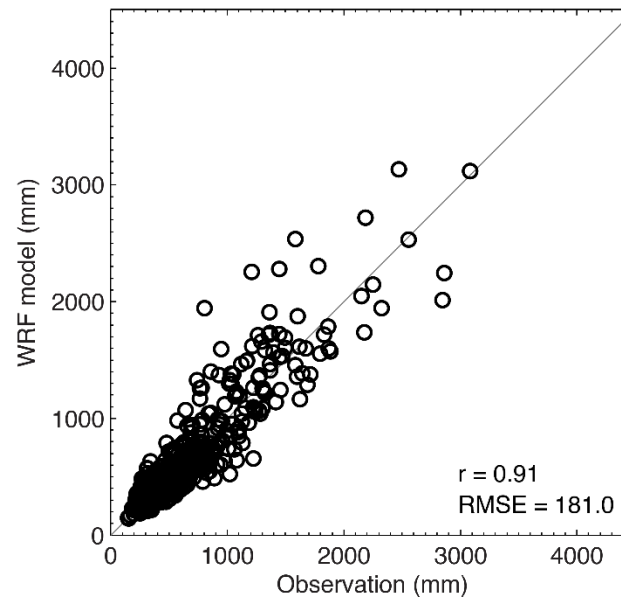


## 13-year Average Annual and Seasonal Precipitation at SNOTEL Sites

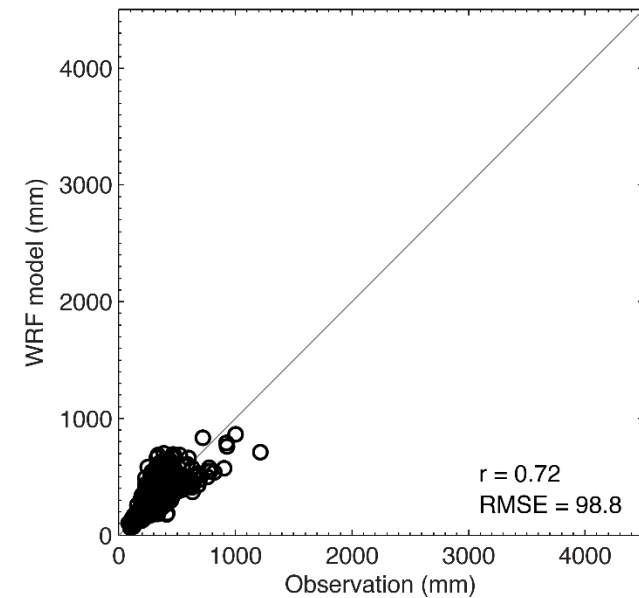
(a) Annual Precipitation



(b) November - April Precipitation



(c) May - October Precipitation



WRF

PRISM

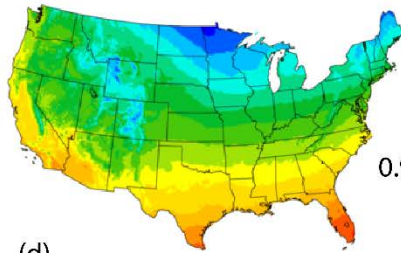
WRF - PRISM

(a)

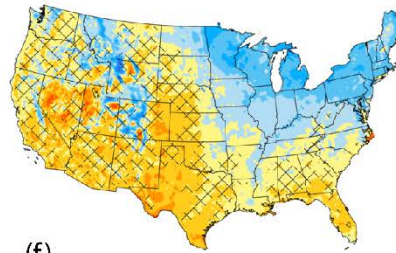
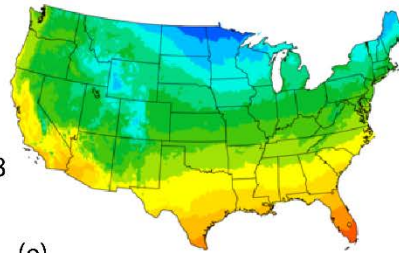
(b)

(c)

DJF



0.988

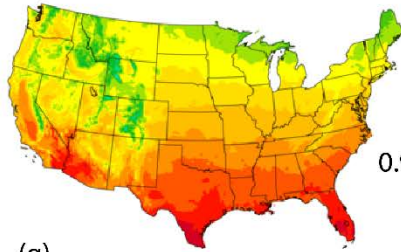


(d)

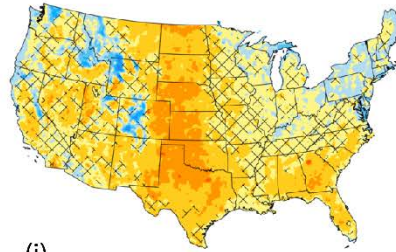
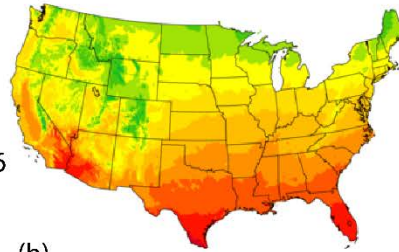
(e)

(f)

MAM



0.986

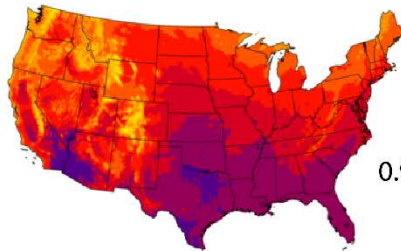


(g)

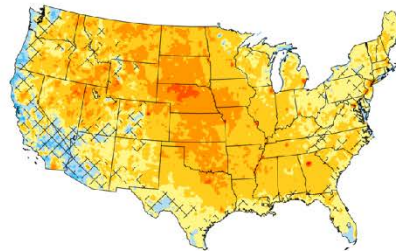
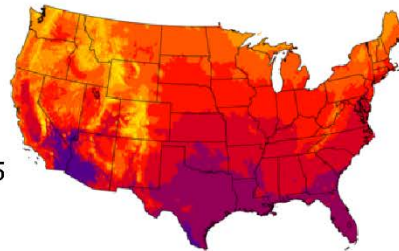
(h)

(i)

JJA



0.975

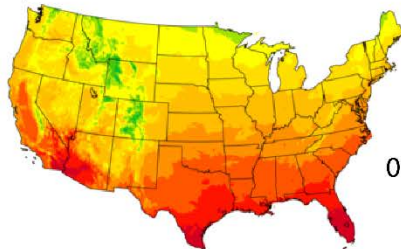


(j)

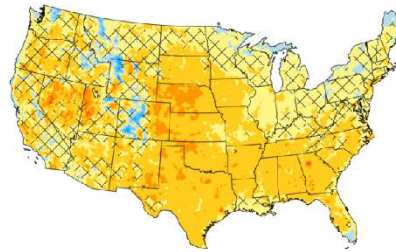
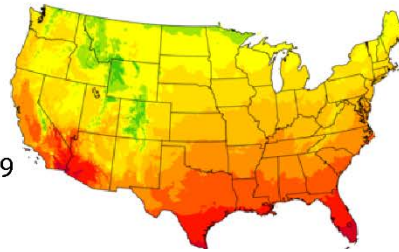
(k)

(l)

SON

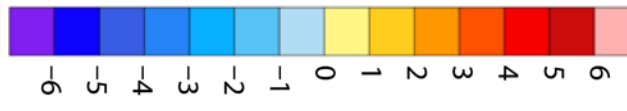


0.989



2-m Temperature (°C)

WRF - PRISM (°C)

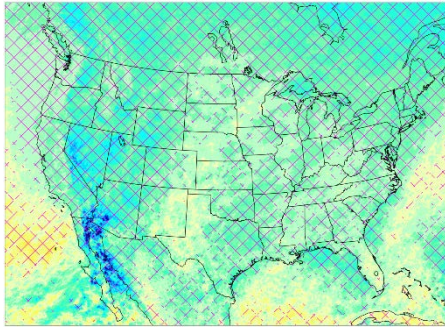


13-year Average  
Seasonal 2-m T:  
Comparison  
between WRF and  
PRISM

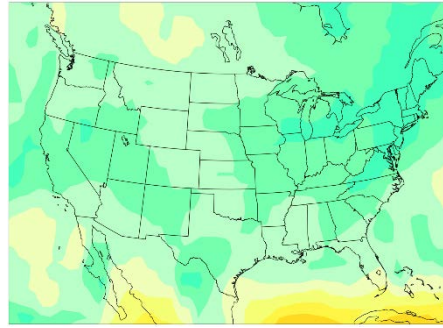
# **Highlights of Pseudo-global Warming Experiment Results**

**(Liu et al 2016; Musselman et al 2017; Rasmussen et al 2017;  
Prein et al 2017)**

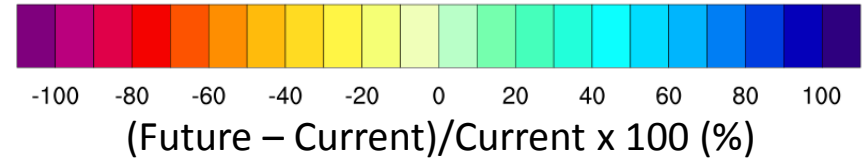
WRF ANN Percent Change



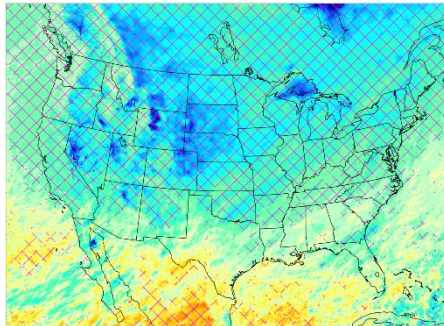
CMIP5 ANN Percent Change



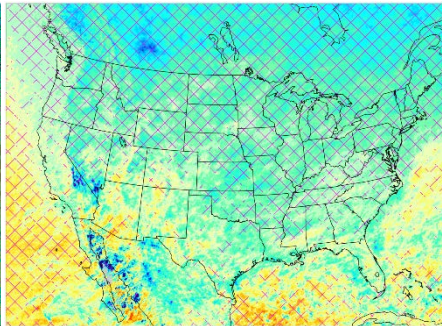
# Annual and Seasonal Precipitation Change from the 19 CMIP5 Model Ensemble and WRF Runs



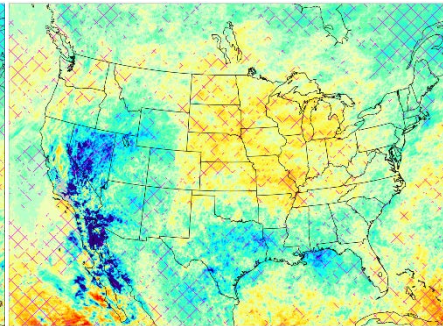
DJF



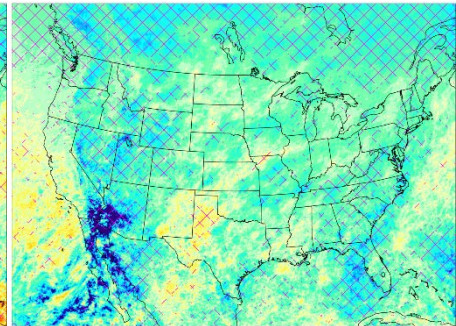
MAM



JJA

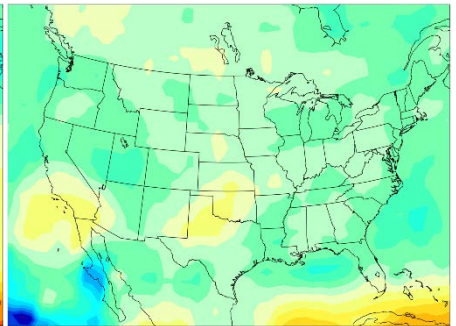
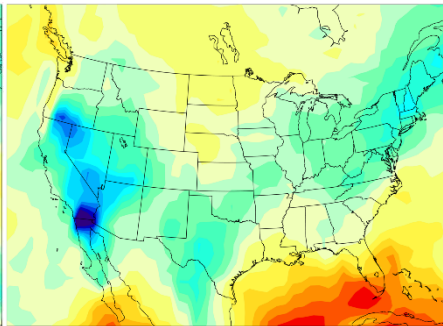
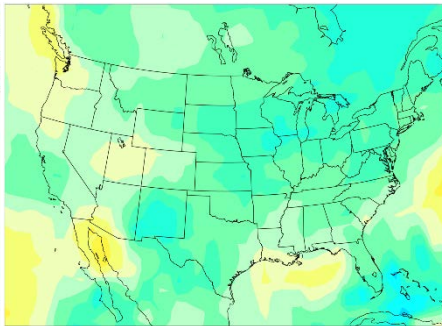
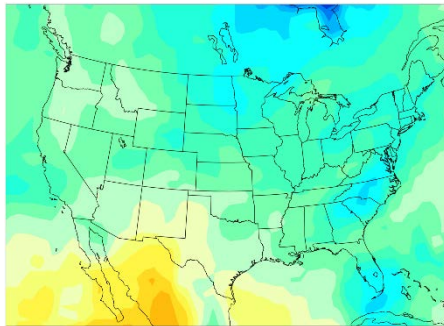


SON



WRF

CMIP5



\* hatched areas in the WRF results represent statistically significant change at the 0.95 confidence level from the t-test.

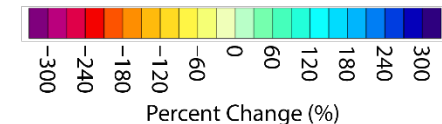
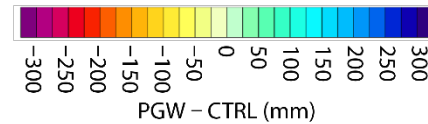
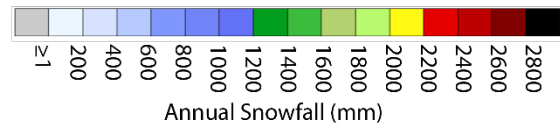
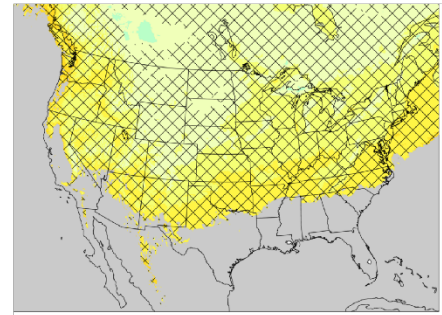
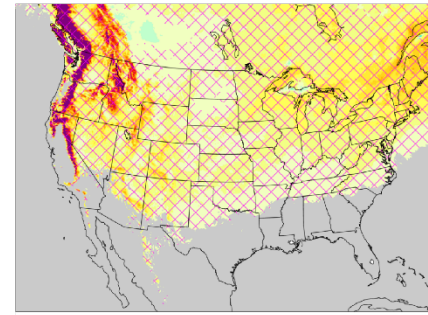
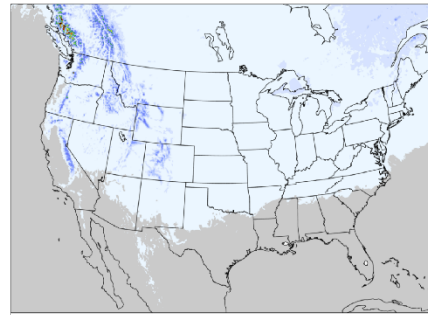
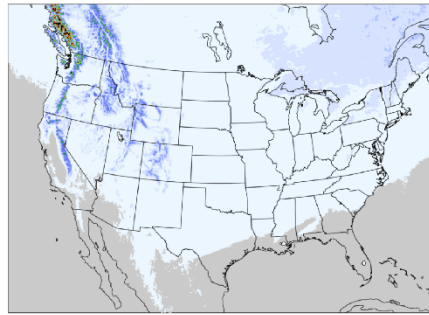
# 13-year average annual snow

(a) CTRL

(b) PGW

(c) PGW – CTRL

(d) Percent Change



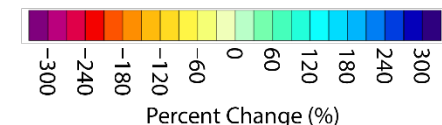
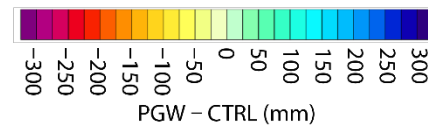
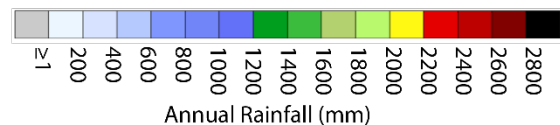
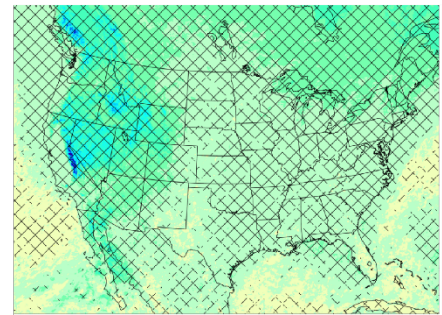
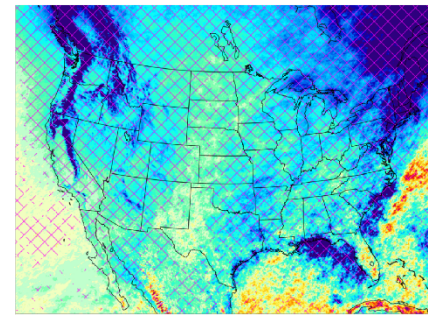
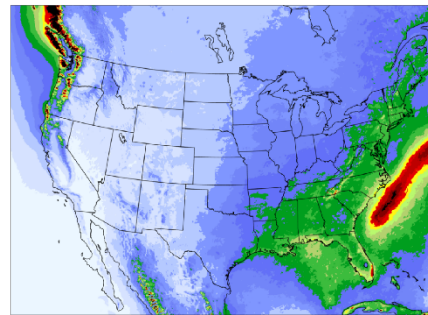
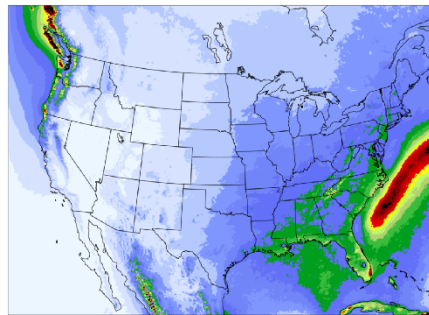
# 13-year average annual rain

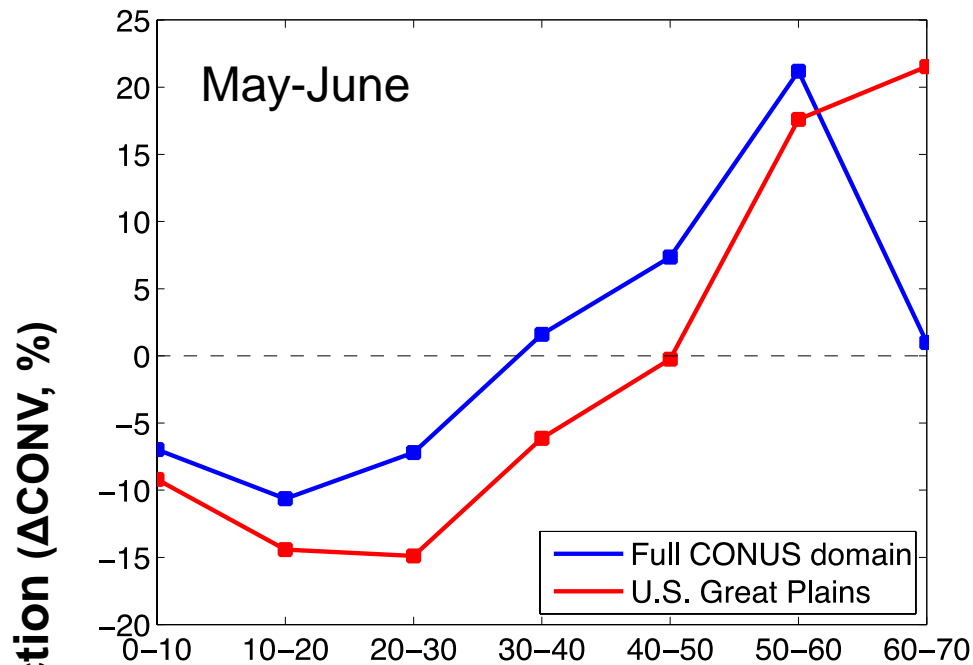
(a) CTRL

(b) PGW

(c) PGW – CTRL

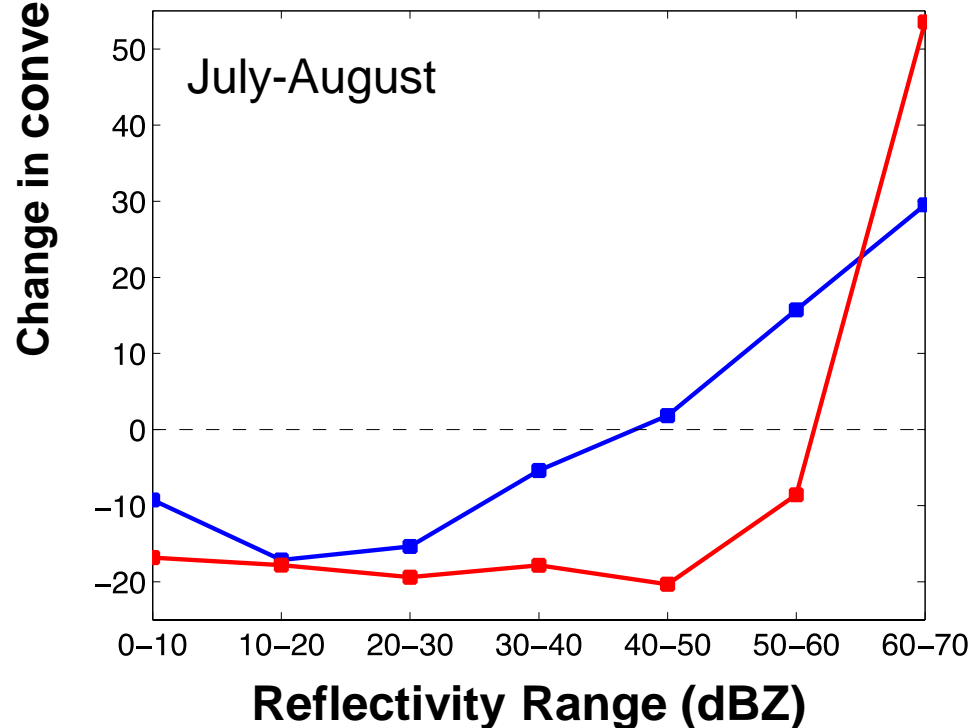
(d) Percent Change





### Changes in Convective Population (PGW-CTRL)

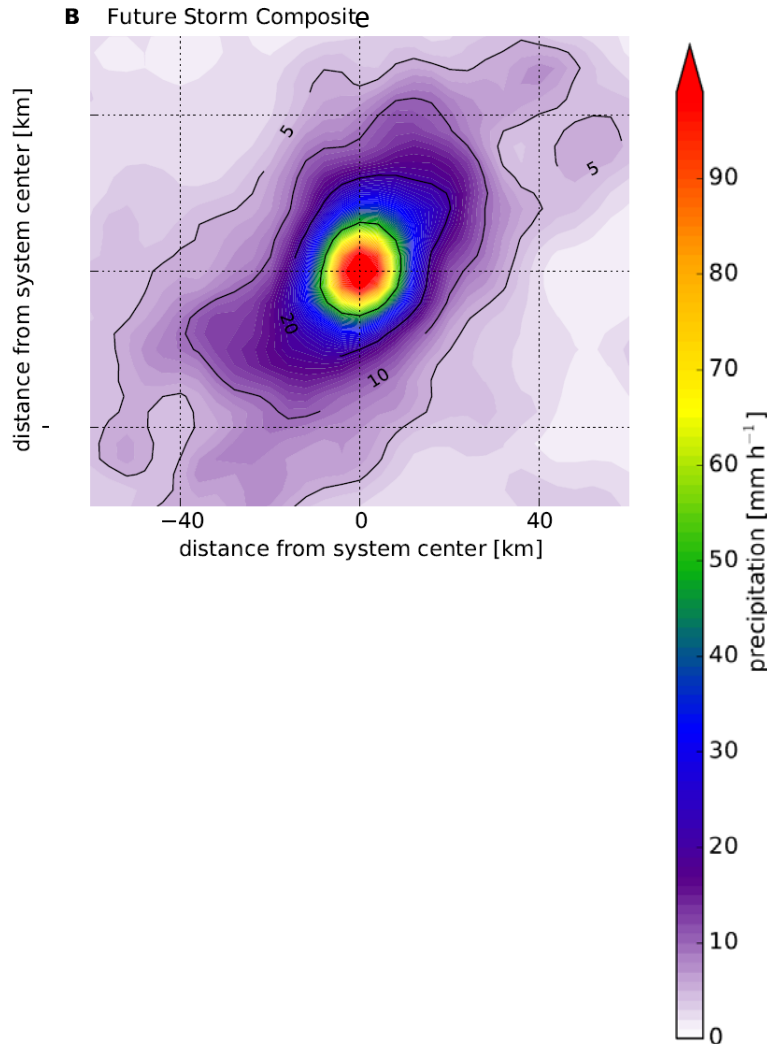
- weak to moderate convection decreases
- strong convection increases



K. Rasmussen et al (2017): Changes in the convective population and thermodynamic environments in convection-permitting regional climate simulations over the United States. *Climate Dynamics* (in revision).

## Storm total precipitation – Mid Atlantic

Prein et al (2017): Increasing rainfall volume from future severe convective storms. *Nature* (in review).



**MCSs are larger and more intense, raising flood potential to unexpected level**

**+8500 m<sup>3</sup>/s  
+60 %**

# Snowpack percentage difference (PGW-CTRL)

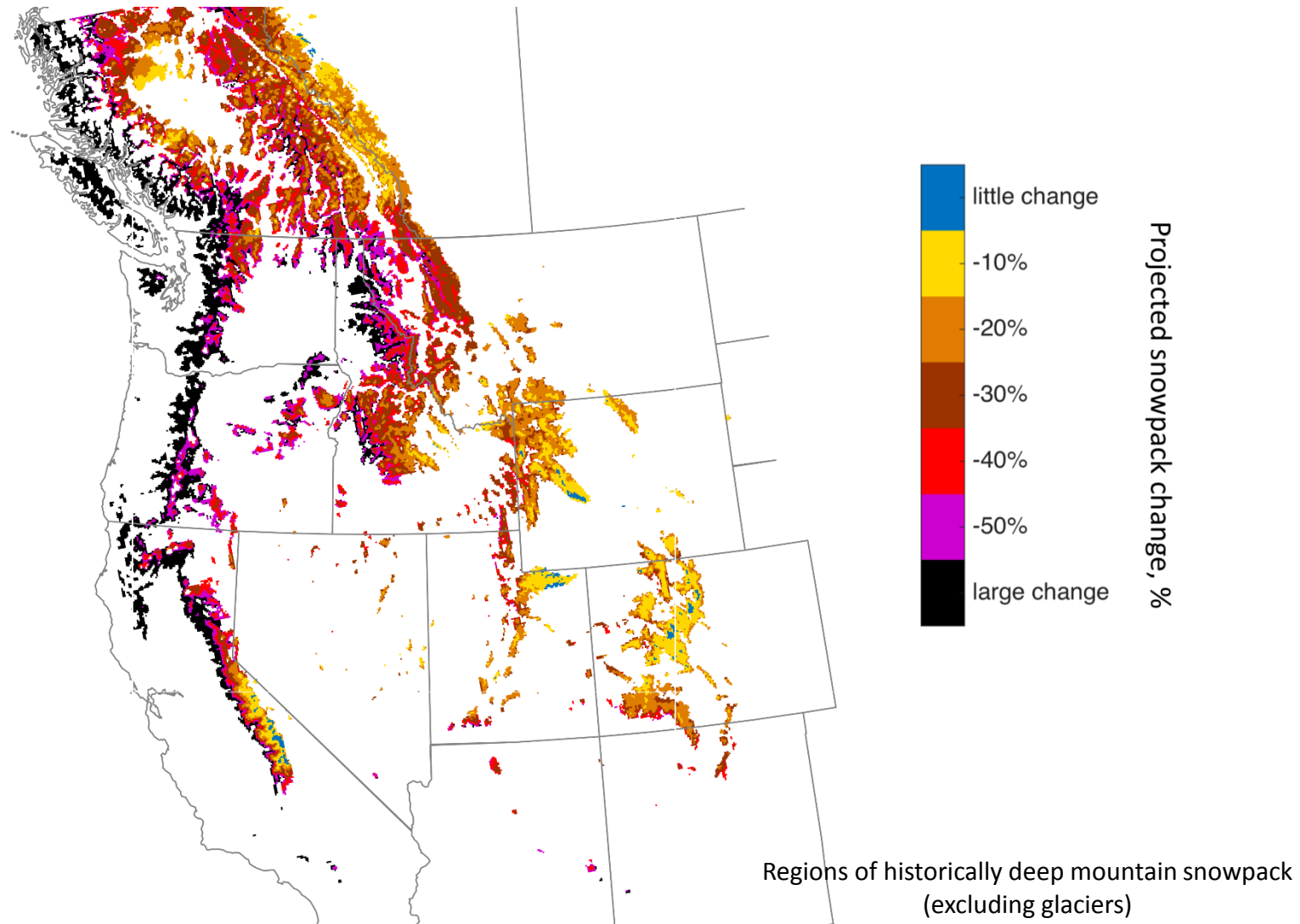
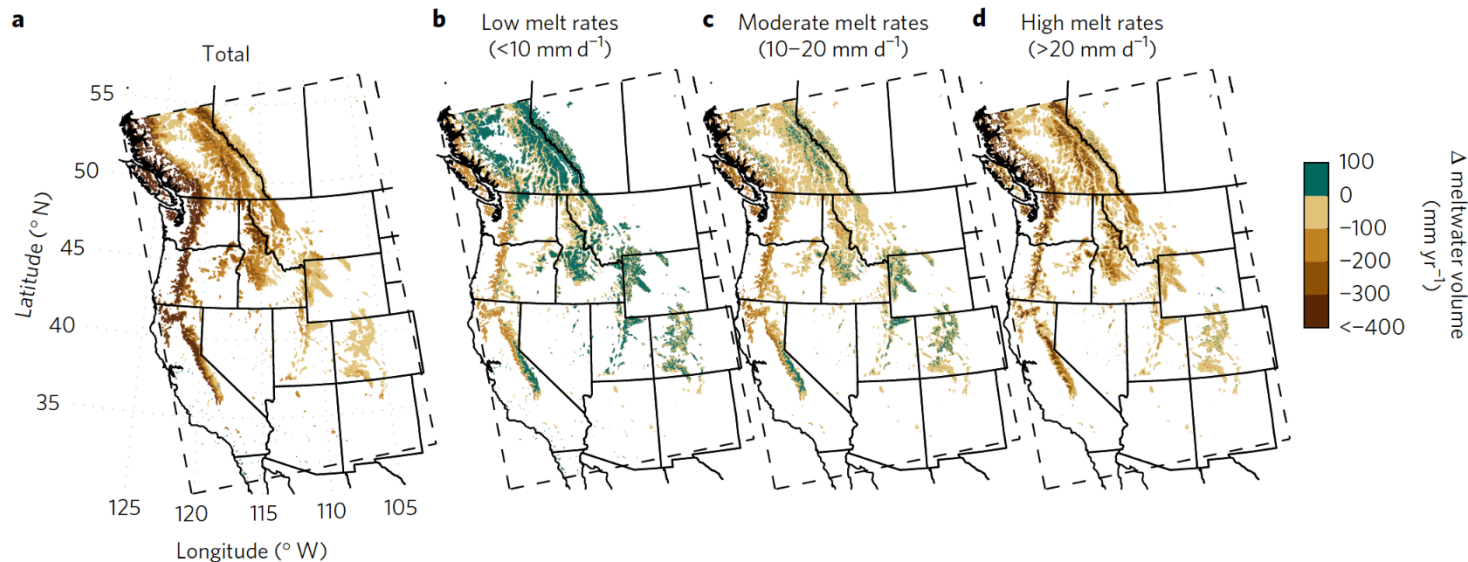


Figure by K.N. Musselman  
(unpublished)

## Snow meltwater difference (PGW-CTRL)



- Widespread reduction of annual snow meltwater
  - Small regional increases in low snowmelt rates
  - Large reduction in high snowmelt rates
- A tendency for slower snowmelt in a warmer world
  - Contraction of the melt season to a time of lower available energy

# Summary (1)

## ■ Retrospective simulation

- Captured seasonal/annual precipitation and temperature well.
- Produced a summer dry/warm bias in central U.S.
- Under-predicted winter-spring precipitation in Deep South.

## ■ Pseudo-global warming simulation

- Seasonal precipitation increases, except for the drier summer in the Midwest.
- Convection and MCSs are more intense, raising future flood risk.
- Snowpack becomes shallower and melts at lower rates.

# Summary (2)

## ■ Ongoing simulations

- A novel approach for constructing WRF forcing data.
- Useful for assessing the impact of storm track changes.

## ■ On going studies

- A number of journal papers are in print/preparation using the retrospective and PGW simulation results.
- Collaborative studies with universities and other research institutions (national and international) are currently being carried out.

## ■ Data management

- Retrospective and PGW simulation data will be available online via NCAR's Research Data Archive website @ <https://rda.ucar.edu/> in June 2017.
- Contact [rasmus@ucar.edu](mailto:rasmus@ucar.edu) or [kyoko@ucar.edu](mailto:kyoko@ucar.edu) for more information.

# Acknowledgments

This work was made possible by NCAR Computational and Information Systems Laboratory's support on Yellowstone and their NCAR Strategic Capability allocation, sponsored by the National Science Foundation.



# Ongoing Experiments

- **EXP3:** CESM-based historical period (2000-2009) simulation

$$\mathbf{WRF}_{\text{input}} = \mathbf{CESM}' + \overline{\mathbf{ERA-I}}_{1976-2005}$$

$$(\mathbf{CCSM}' = \mathbf{CCSM} - \overline{\mathbf{CCSM}}_{1976-2005})$$

- **EXP4:** CESM-based future period (2090-2099) simulation

$$\mathbf{WRF}_{\text{input}} = \mathbf{CESM}' + \overline{\mathbf{ERA-I}}_{1976-2005} +$$
$$(\overline{\mathbf{CMIP5}}_{2071-2100} - \overline{\mathbf{CMIP5}}_{1976-2005})$$

$$(\mathbf{CESM}' = \mathbf{CESM} - \overline{\mathbf{CESM}}_{2071-2100})$$

# Difference between New and Traditional Method: Climate Change Estimate

## Traditional Method:

$$\text{WRF}_{\text{input}} = \text{CESM}' + \overline{\text{ERA-I}}_{1976-2005} + (\overline{\text{CESM}}_{2071-2100} - \overline{\text{CESM}}_{1976-2005})$$

## New Method:

$$\text{WRF}_{\text{input}} = \text{CESM}' + \overline{\text{ERA-I}}_{1976-2005} + (\overline{\text{CMIP5}}_{2071-2100} - \overline{\text{CMIP5}}_{1976-2005})$$

$$\text{CESM}' = \text{CESM} - \overline{\text{CESM}}_{2071-2100}$$

# Model Evaluation at SNOTEL Sites

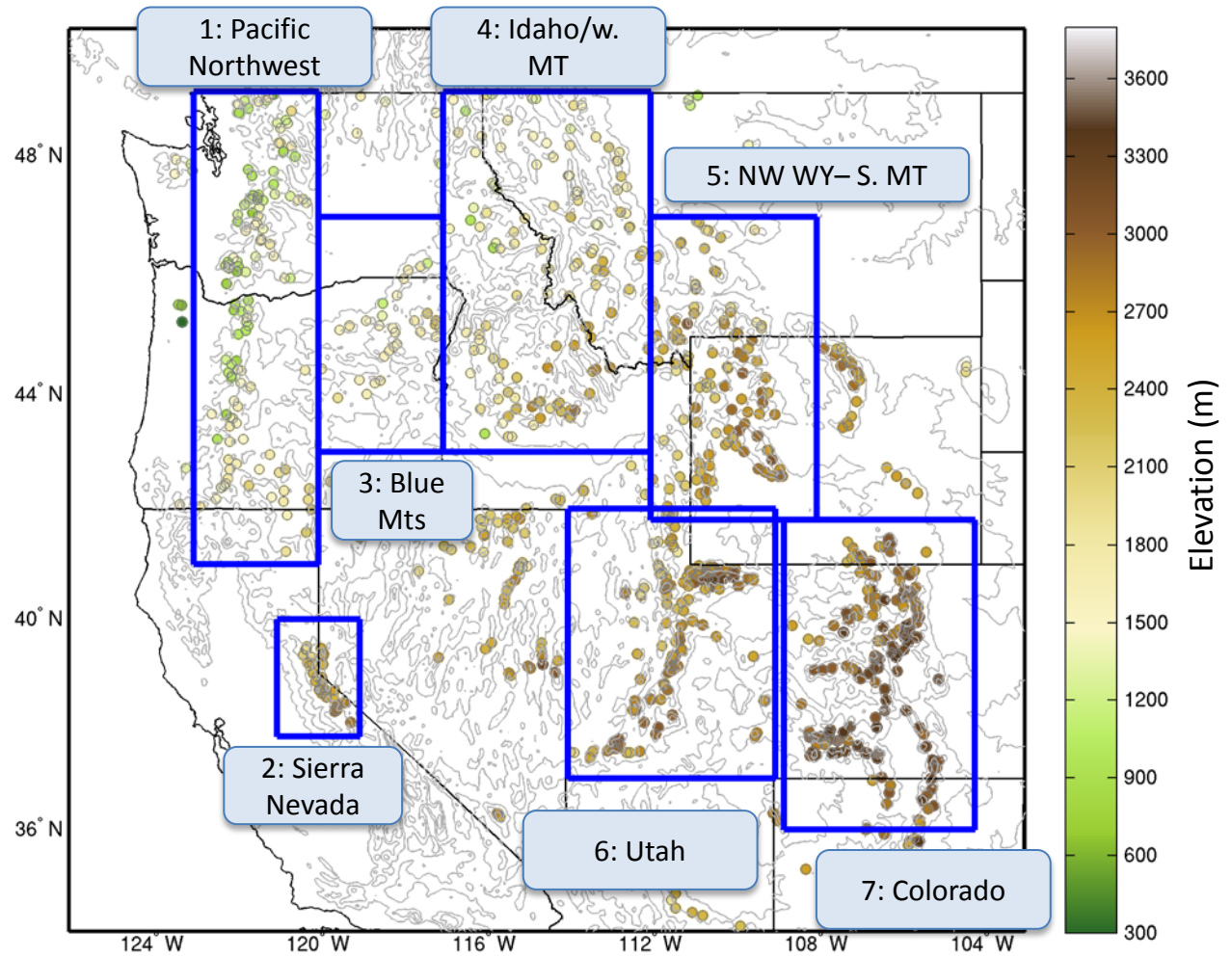
SNOTEL site at  
Brooklyn Lake, WY



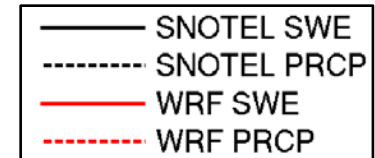
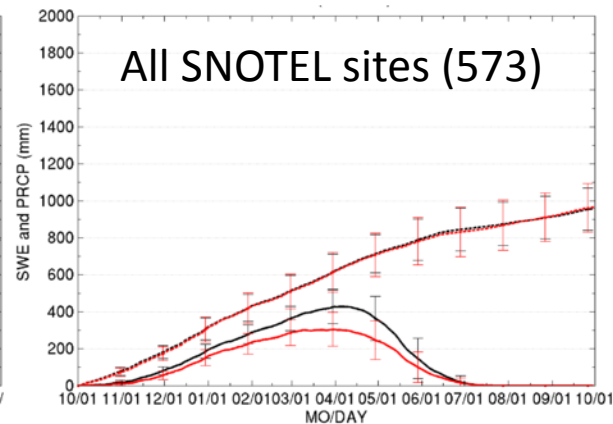
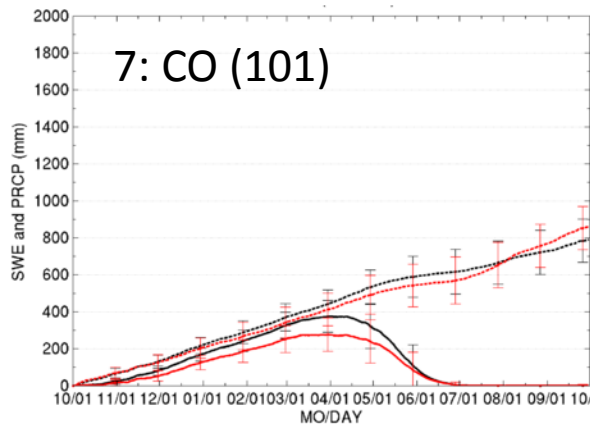
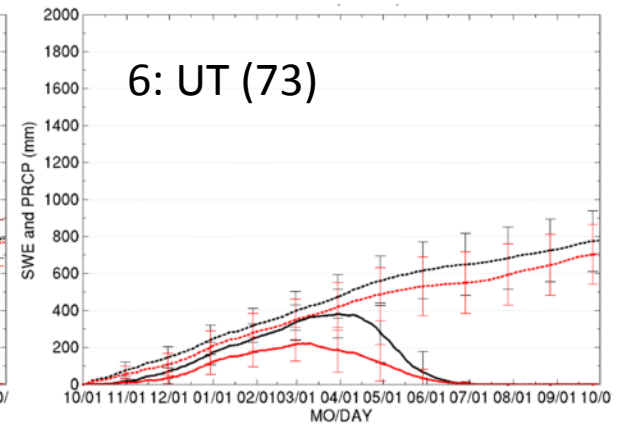
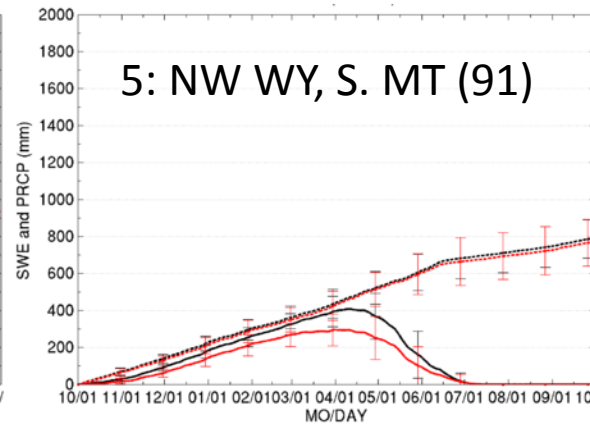
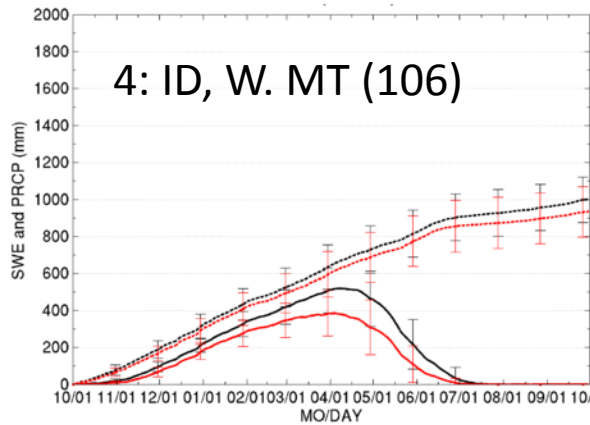
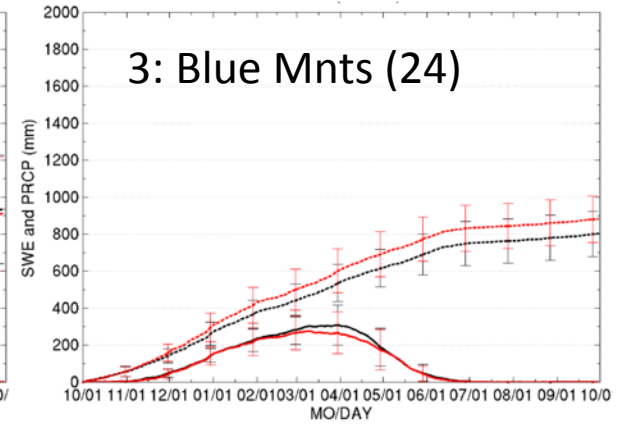
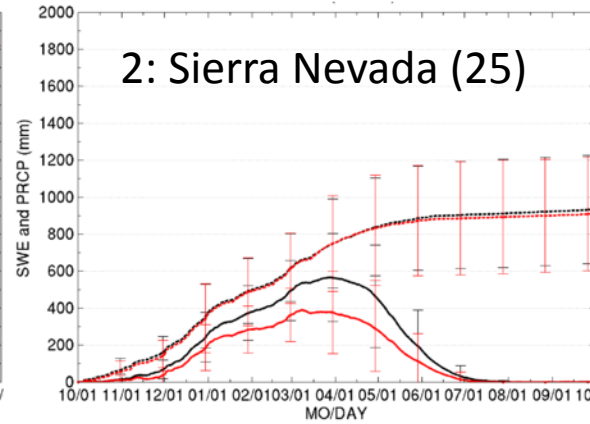
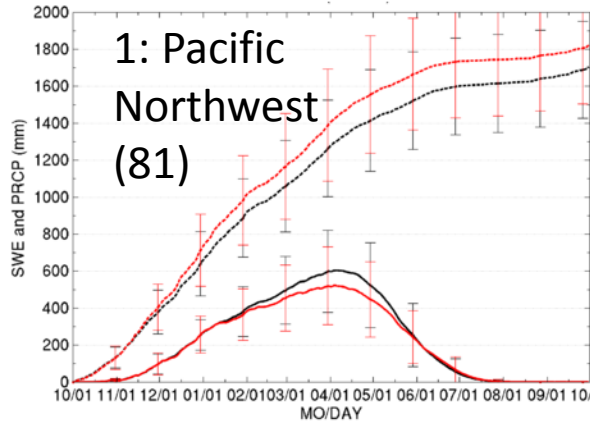
Snow gauge



Snow pillow



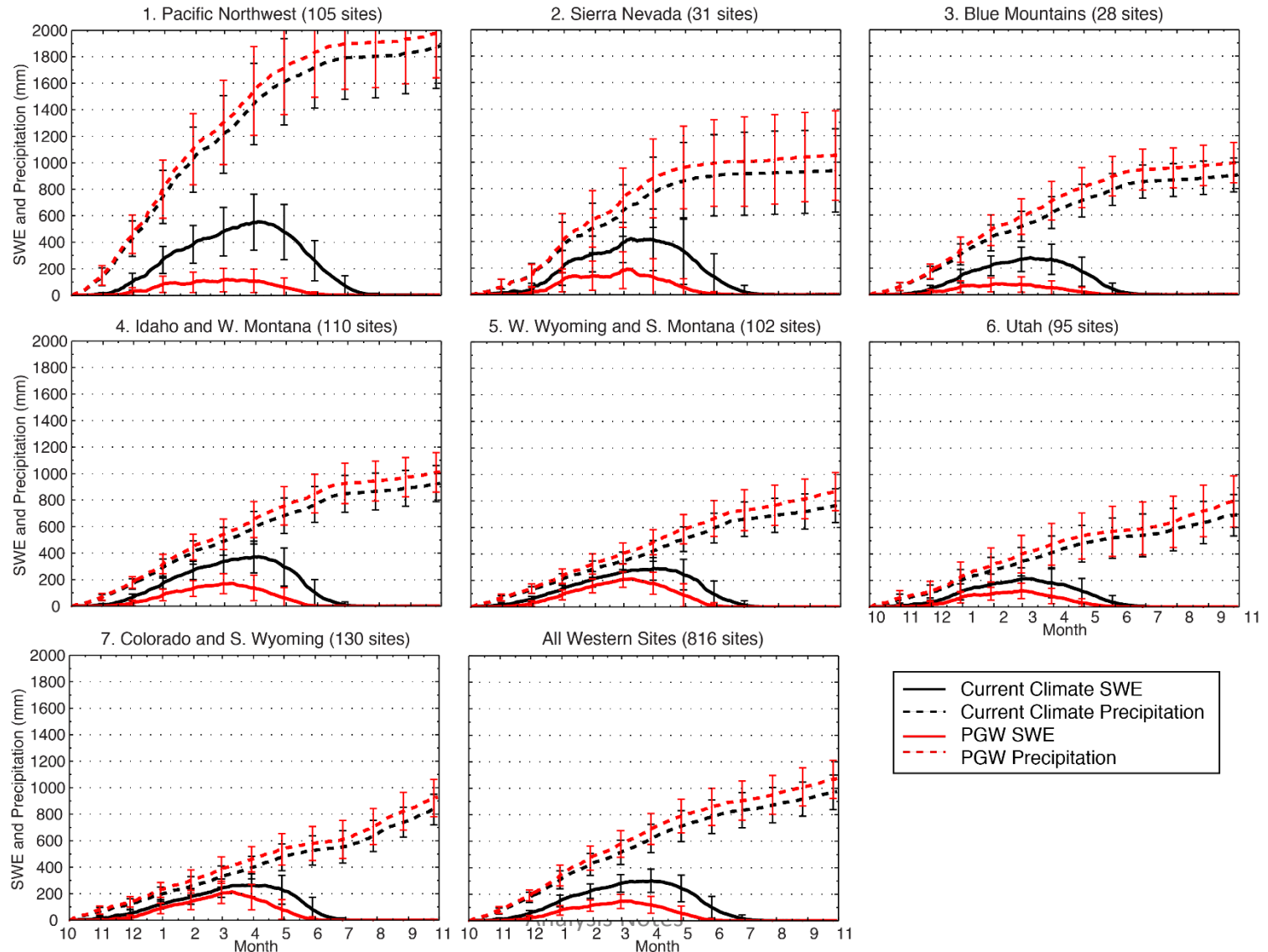
# SNOTEL vs WRF at SNOTEL sites: 13-year climatology



PRCP: -9% – +10%  
SWE : -43% – -11%

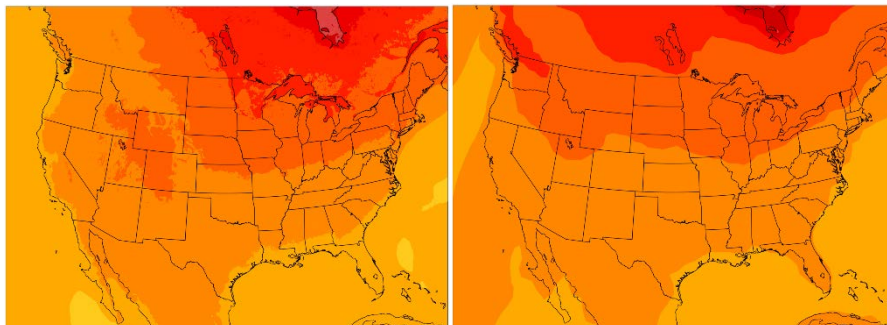
# Precipitation and SWE at SNOTEL sites over sub-regions

### 13-year Climatology of Current Climate and PGW Precipitation and Snow Water Equivalent

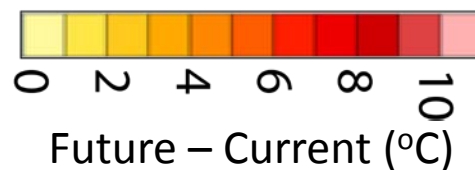


WRF ANN Change

CMIP5 ANN Change



# Average Annual and Seasonal 2-m T Change from 19 CMIP5 Model Ensemble and WRF Runs



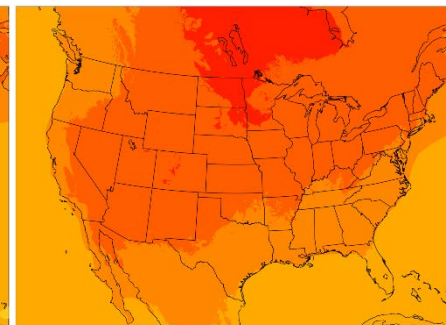
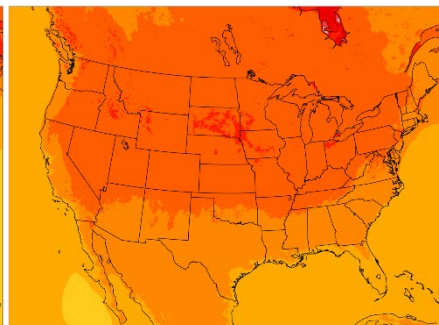
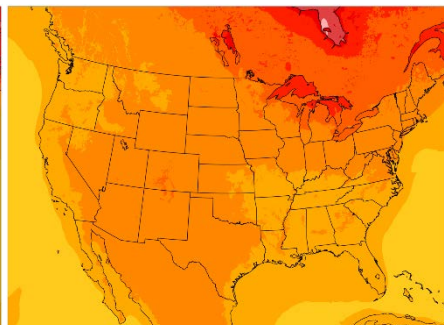
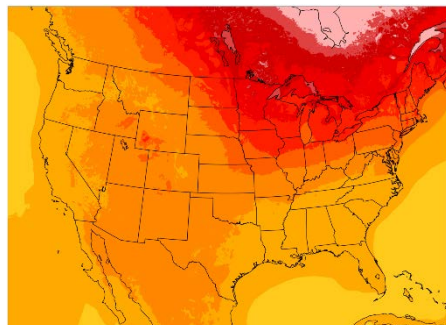
DJF

MAM

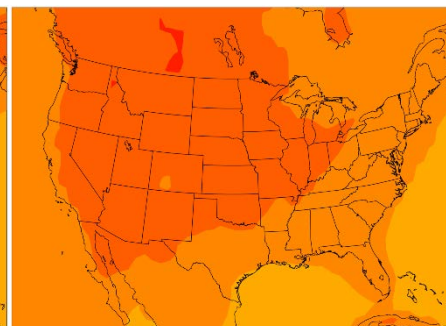
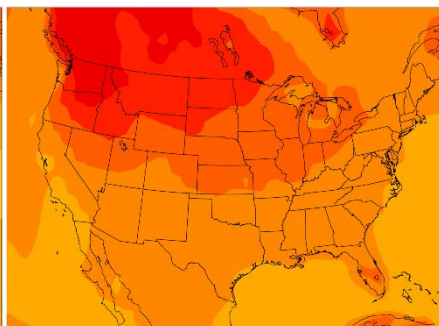
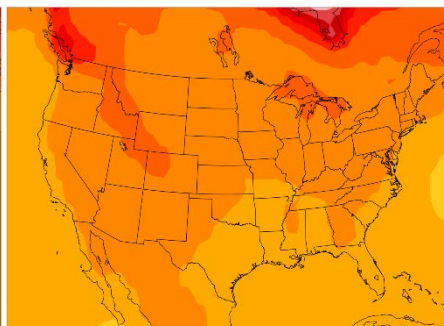
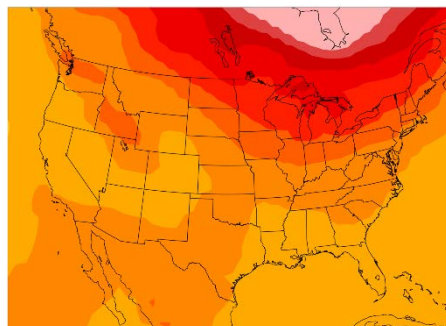
JJA

SON

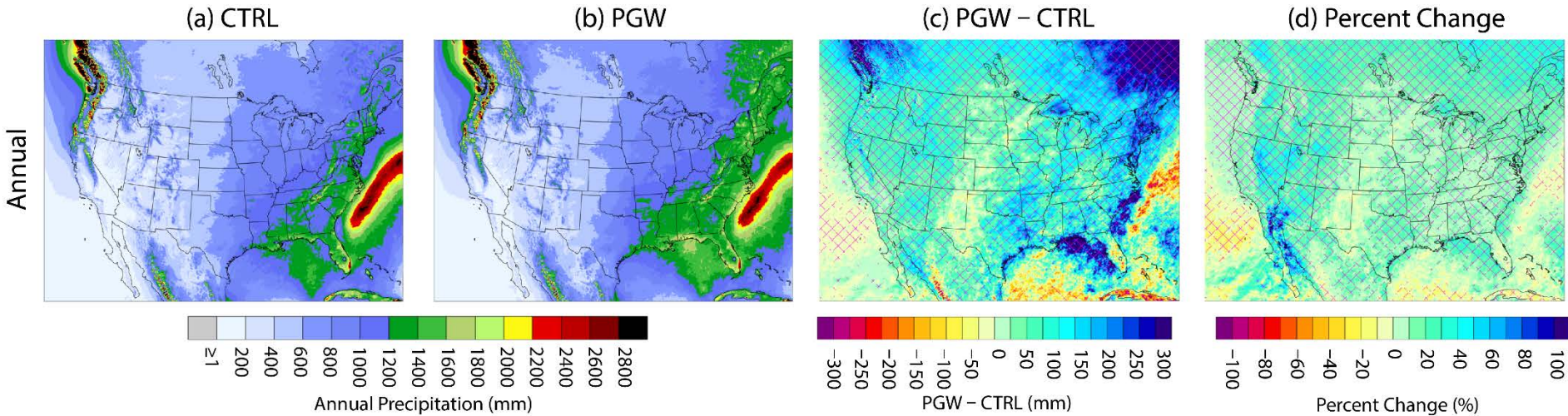
WRF

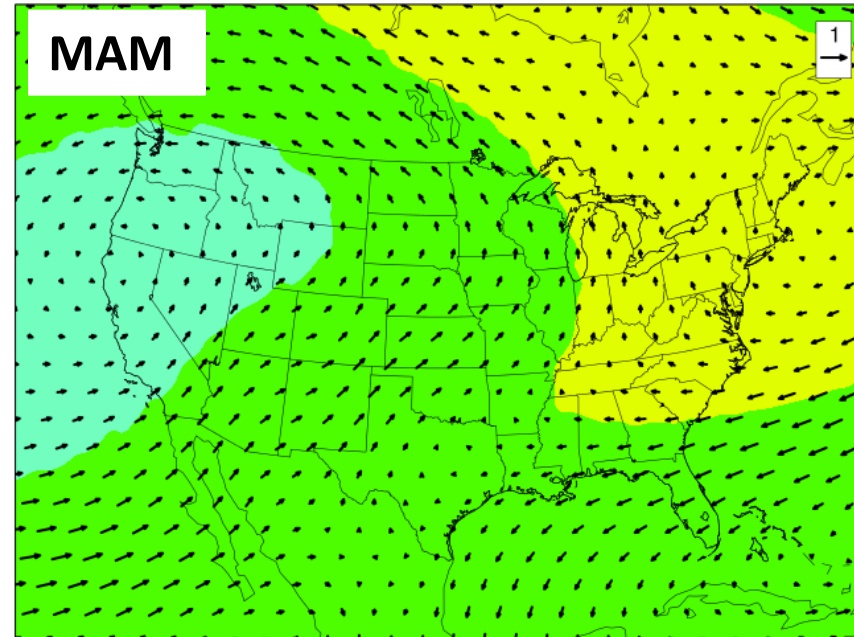
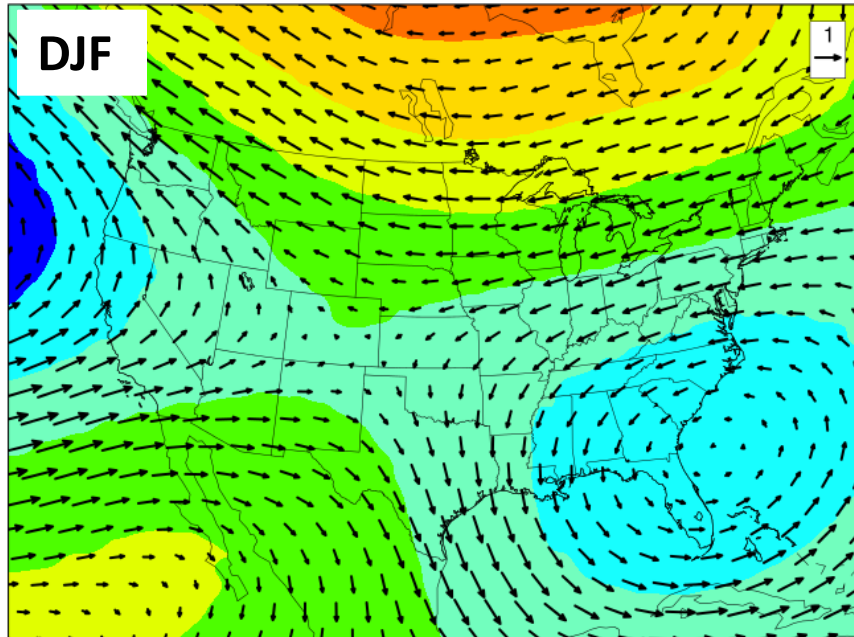


CMIP5

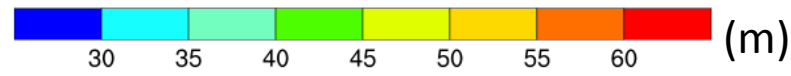
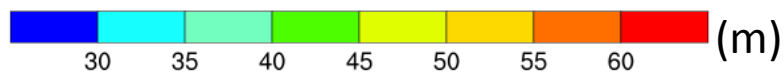
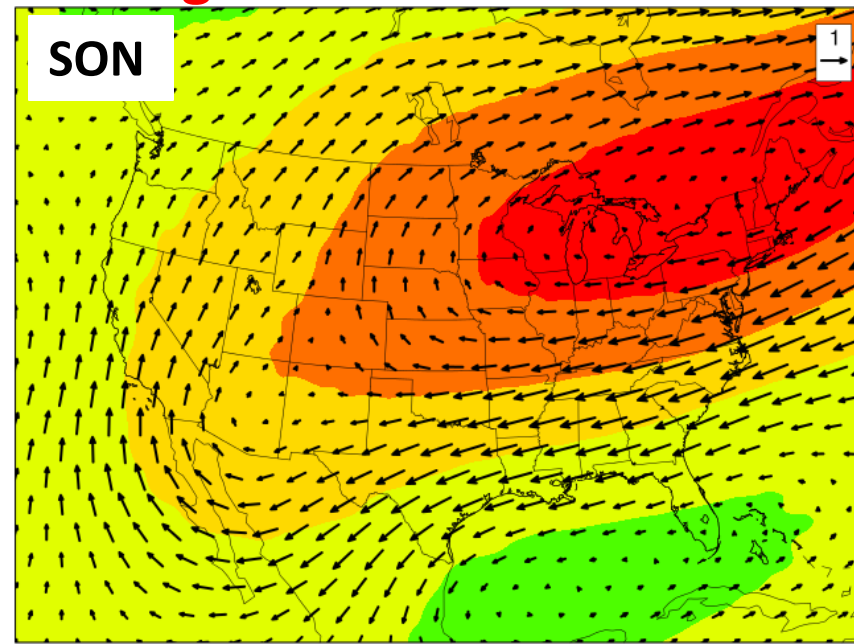
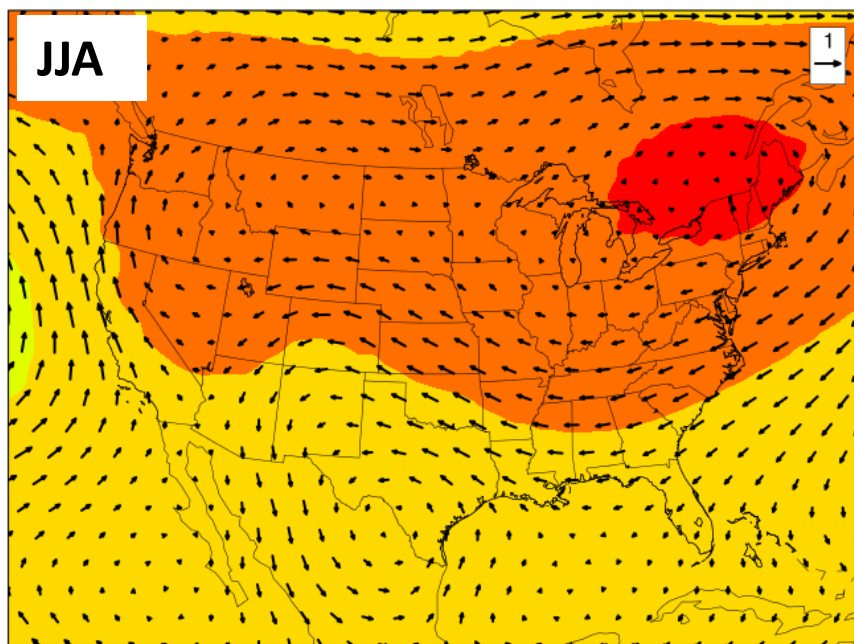


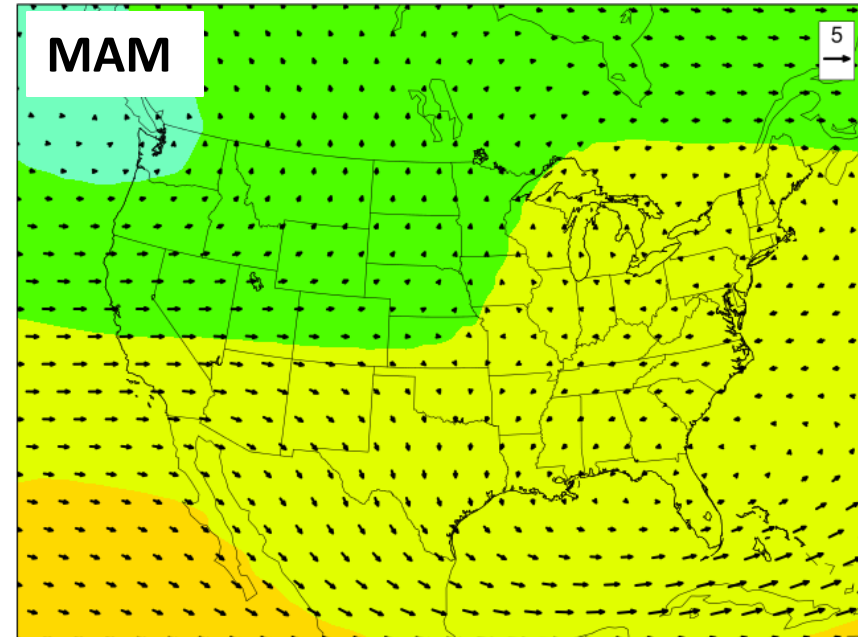
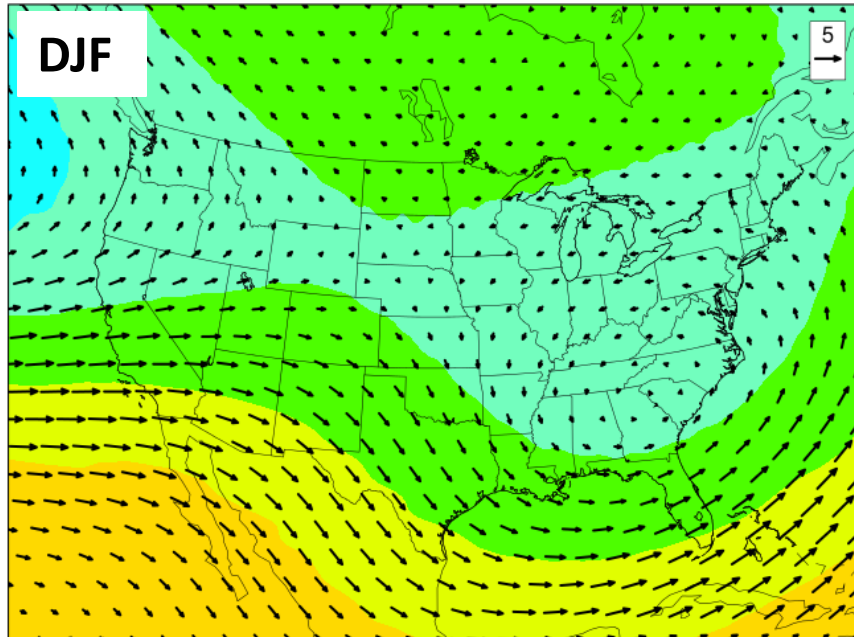
## 13-year Average Annual Precipitation : CTRL vs PGW



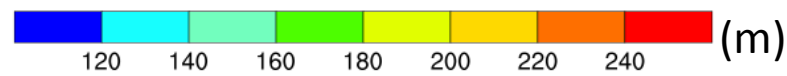
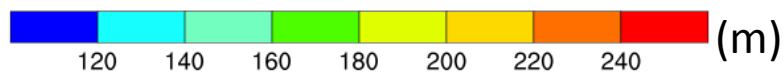
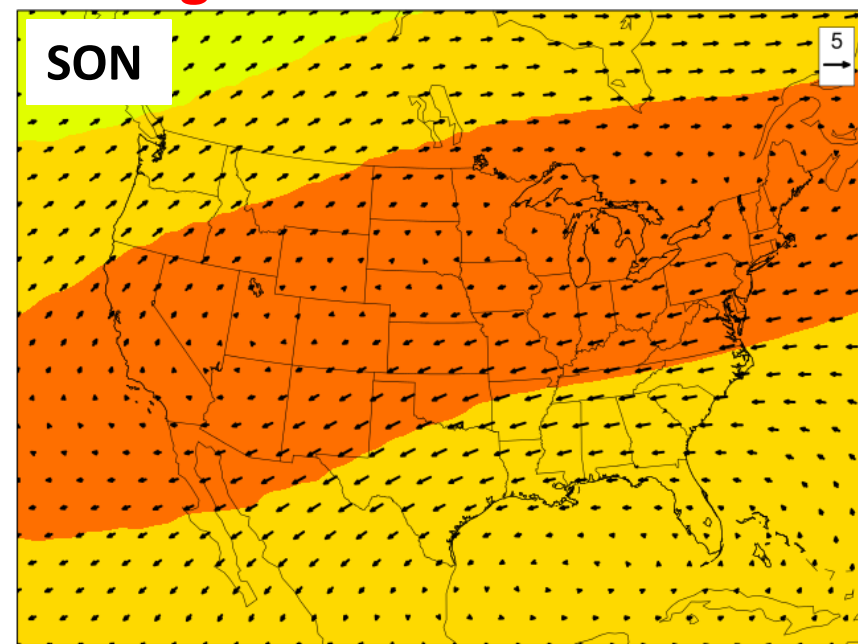
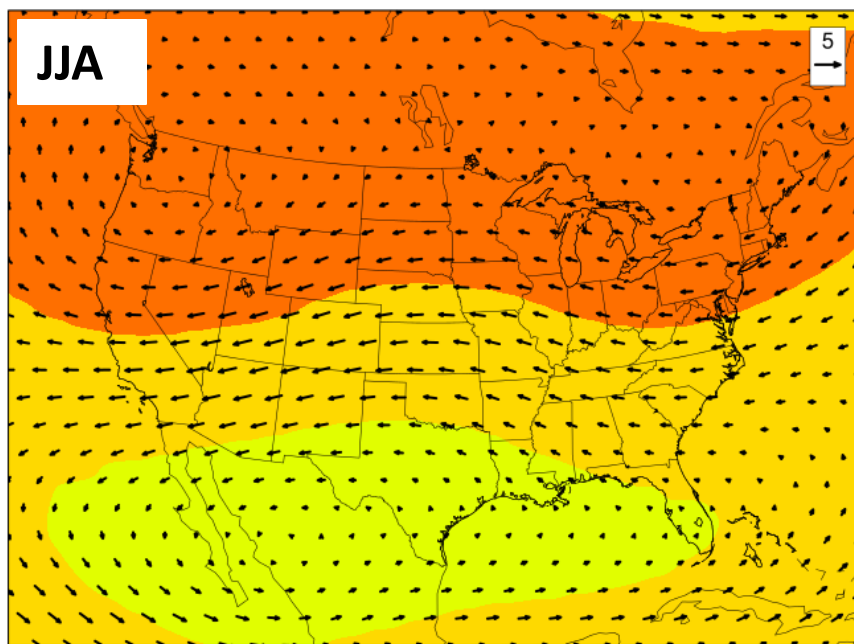


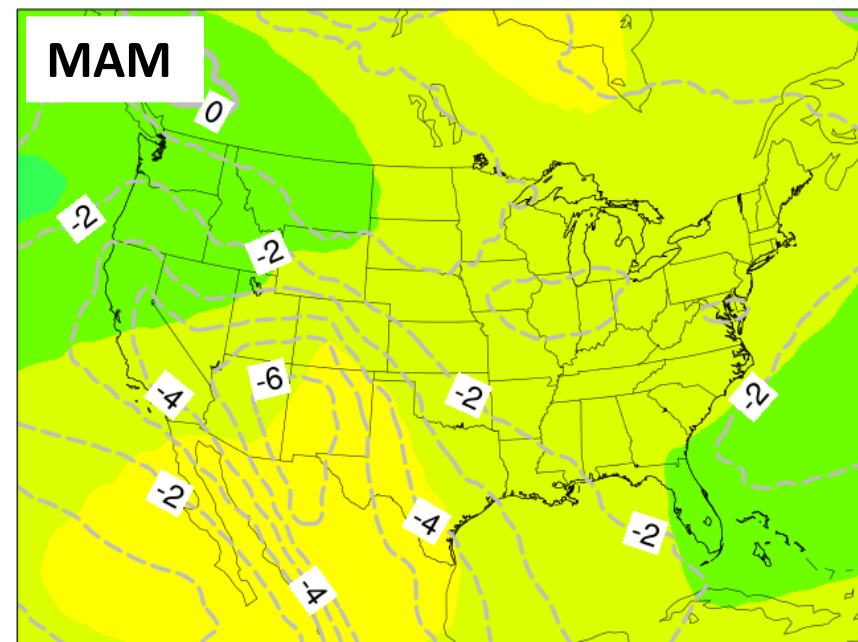
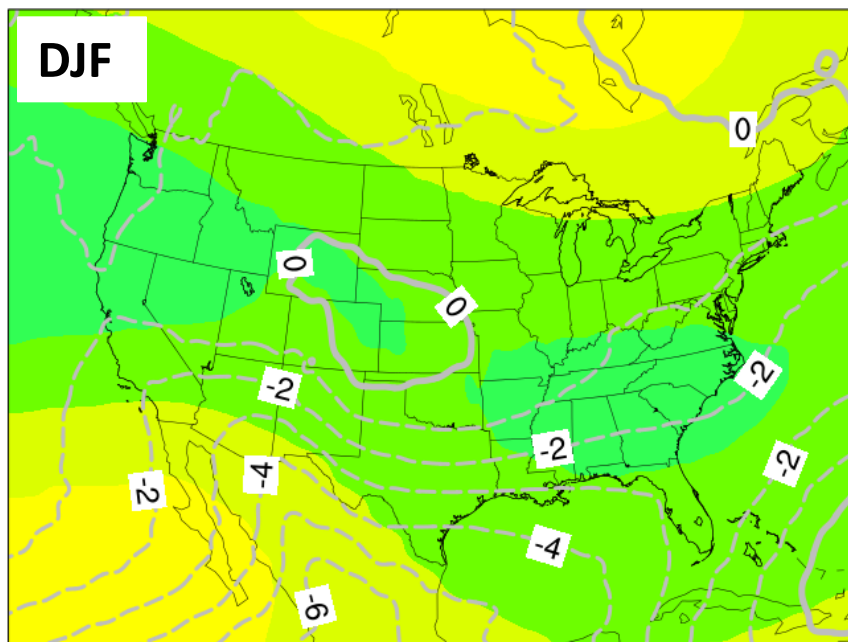
**700-hPa wind & height**



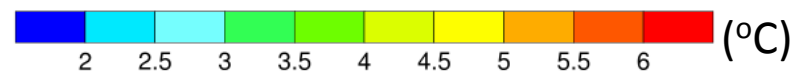
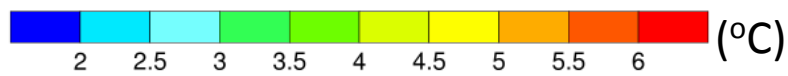
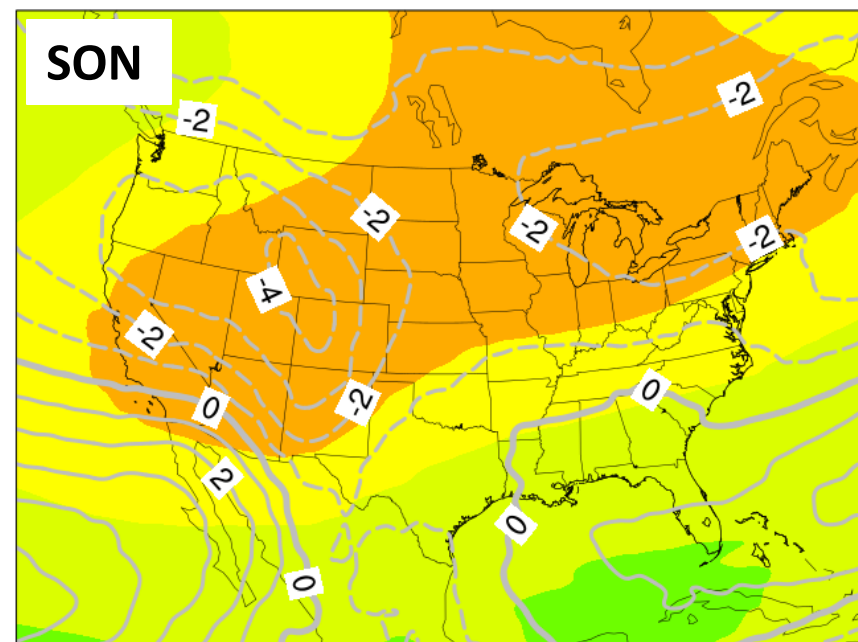
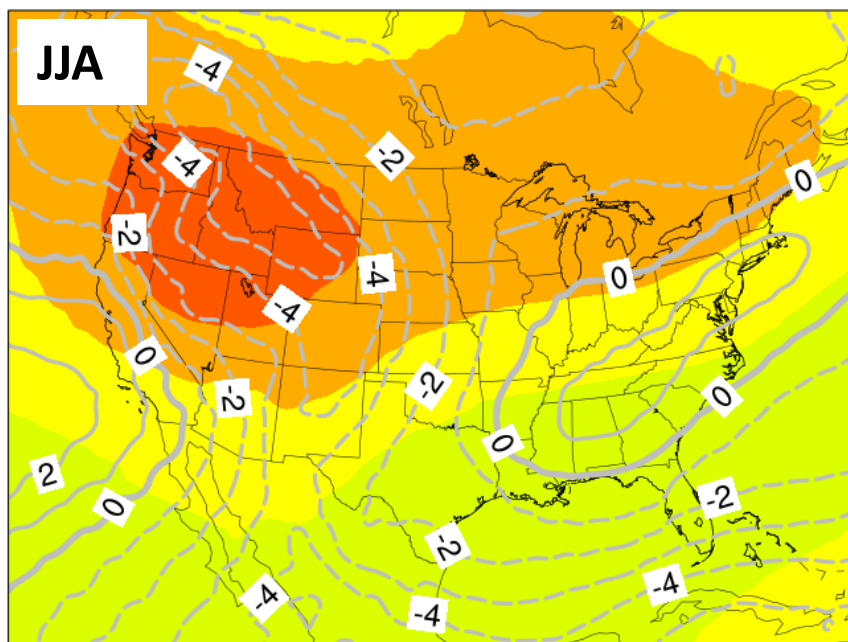


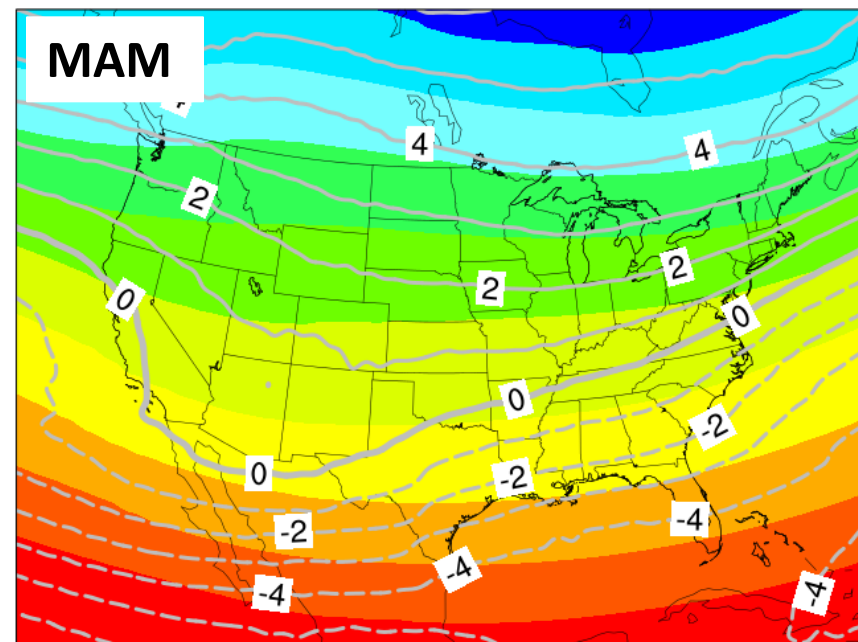
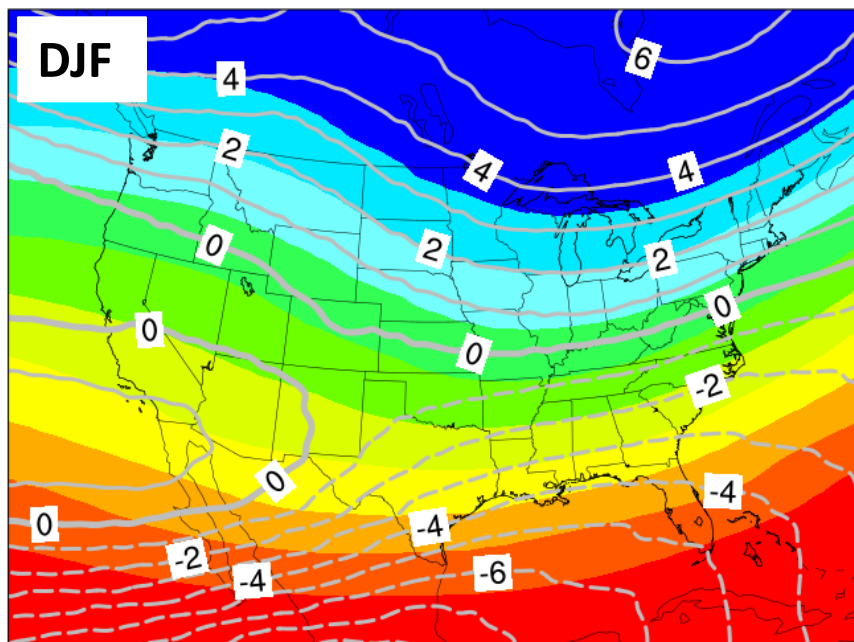
**250-hPa wind & height**





**700-hPa T & RH**





**250-hPa T & RH**

