



**Experimental Program to Stimulate Competitive Research**

# Climate change projections for the Lake Champlain basin

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# Regional climate change

1. Project changes in climate for our study region
  - Delta method applied to GCM simulations
2. Statistically downscale coarse resolution GCM simulations to fine spatial scales needed for hydrological, ecological, and social models:
  - Utilize station data and high resolution topography
3. Dynamical downscaling of GCM simulations using a regional climate model



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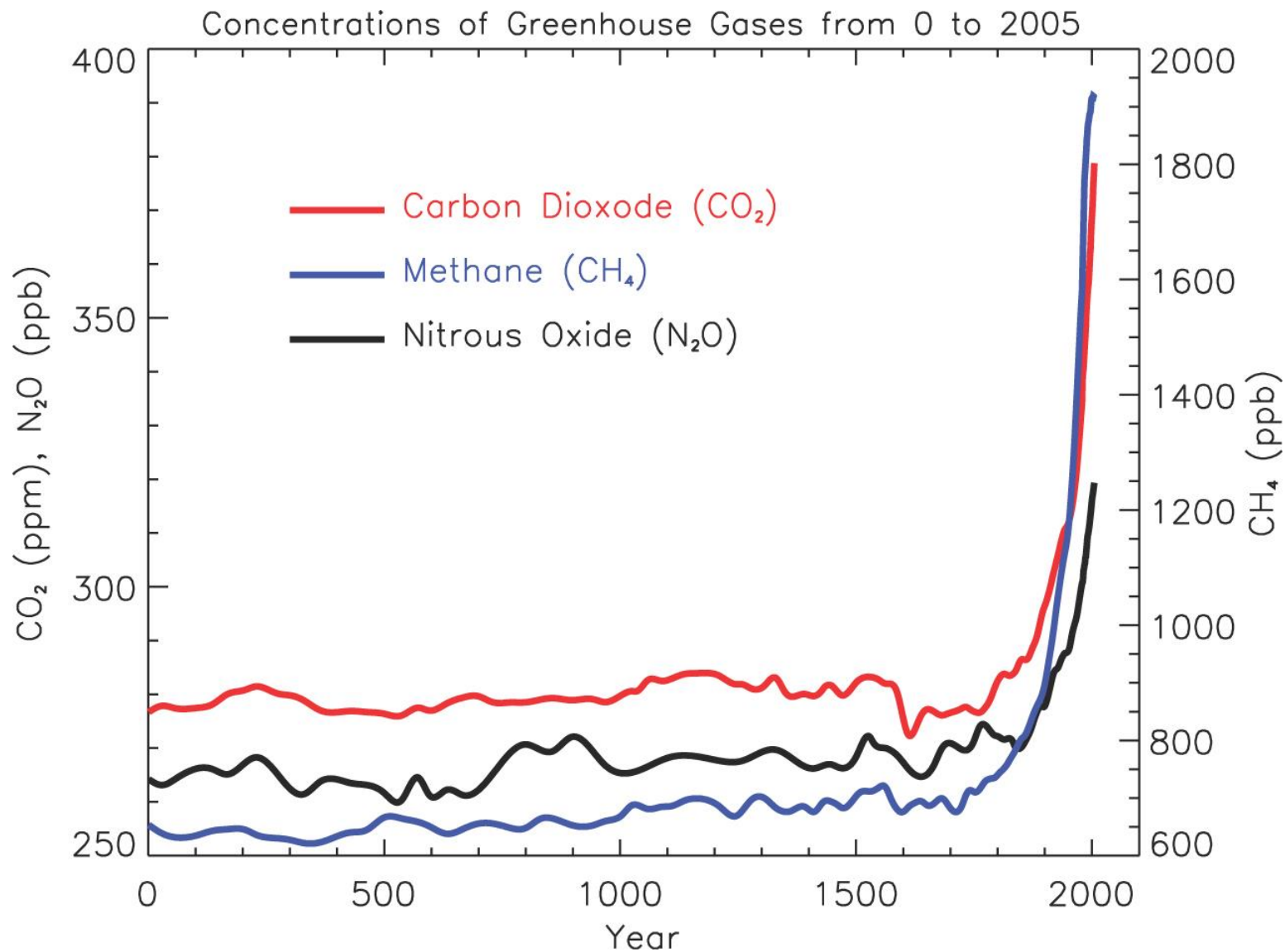
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# Climate Projection Methodologies



**Jonathan M. Winter**  
Associate Research Scientist  
Columbia University Center for  
Climate Systems Research

Source: The Nature Conservancy, weather.com, NASA Earth Observatory



Source: IPCC Fourth Assessment Report



# Heat-Trapping Gas Passes Milestone, Raising Fears



Chris Stewart/Associated Press

The average carbon dioxide reading surpassed 400 parts per million at the research facility atop the Mauna Loa volcano on the island of Hawaii for the 24 hours that ended at 8 p.m. on Thursday.

# Climate Change, Water Resources, Ecosystems, and Society

- How well can we simulate climate using numerical models?
- What is the local response of precipitation and temperature to climate change?
- How will evolving temperature and precipitation impact runoff, soil moisture, forests, agriculture, nutrient loading, infrastructure, society?
- What are the key uncertainties in predicting climate change impacts?



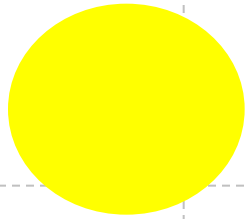
Source: Lake Champlain Basin Program

# Global Climate Models (GCMs)

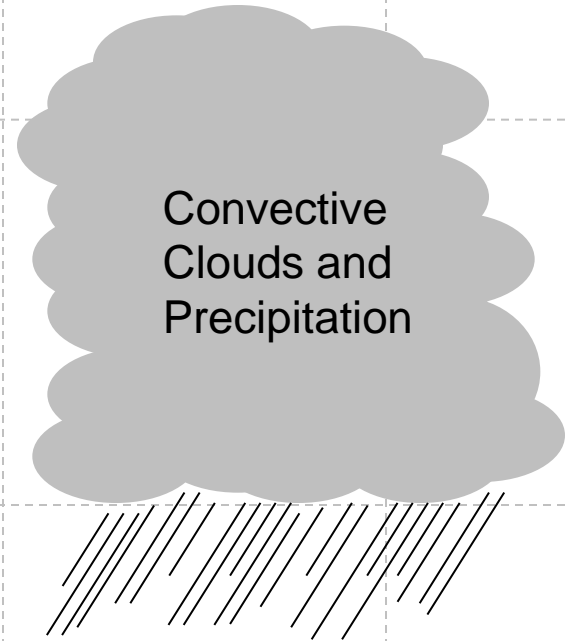
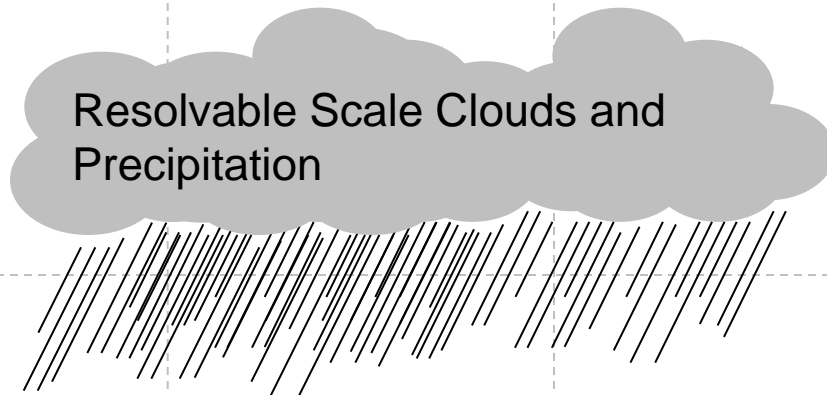
- GCMs solve the primitive equations (conservation of momentum, mass, and energy) to predict fluid flow on a spherical surface
- Can be atmospheric (AGCM), oceanic (OGCM) or coupled atmospheric-oceanic general circulation models (AOGCM)
- AOGCMs are the core of full climate models
- Global spatial coverage
- Contain significant inaccuracies
- Coarse resolution







Atmospheric Radiation



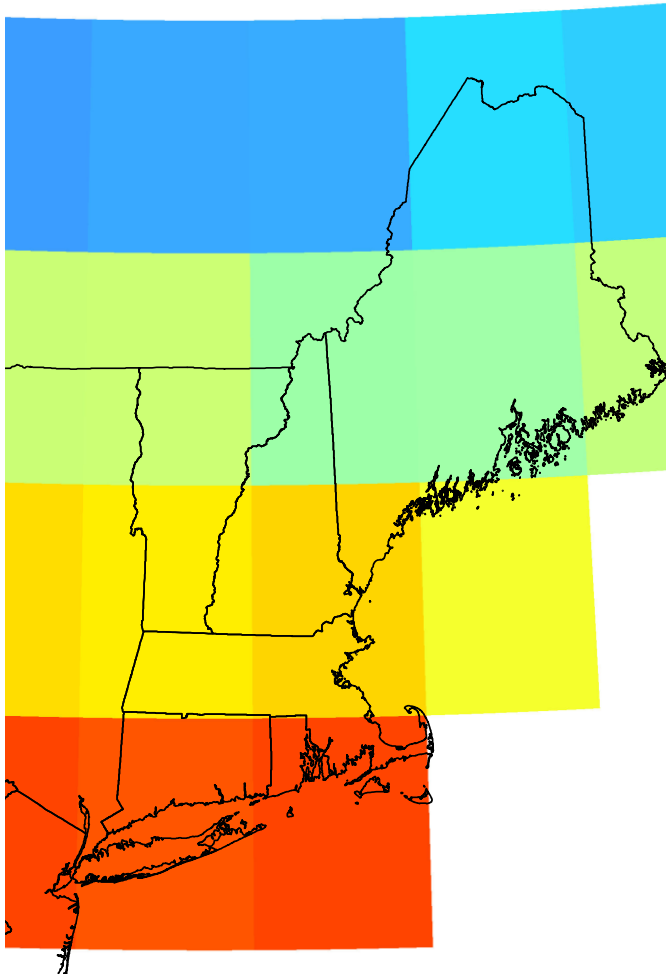
Planetary Boundary Layer

Ocean Model (AOGCM) or Fixed Sea  
Surface Temperatures with Ocean  
Flux Parameterization (AGCM)

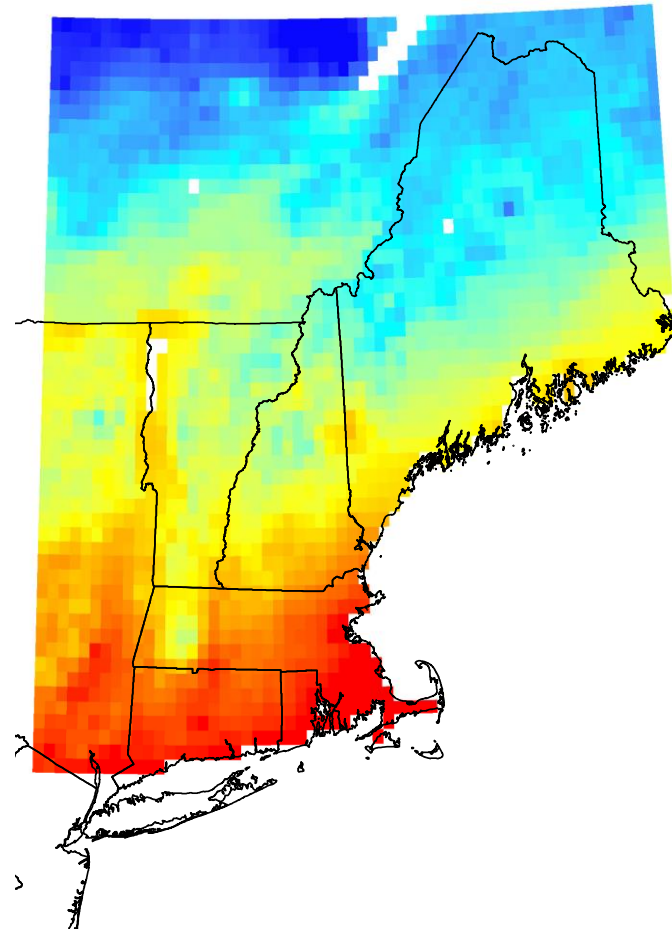
Surface Physics

# Downscaling GCMs

250 km ( $\sim 2.5^\circ$ )



12 km ( $\sim 1/8^\circ$ )



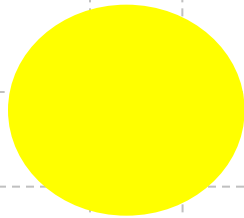
0 125 250 500 Kilometers

# Regional Climate Models (RCMs)

- RCMs are weather forecast models adapted to run at longer temporal scales or GCMs adapted to run at finer spatial scales
- High resolution
- Limited spatial coverage, bounded by a large-scale atmospheric forcing generally provided by a GCM or reanalysis
- Contain significant inaccuracies produced both by the large-scale forcing and the RCM itself

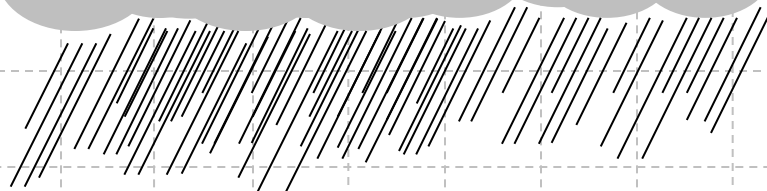


# Boundary Conditions - NCEP-DOE Reanalysis 2, ECHAM5, CCSM3

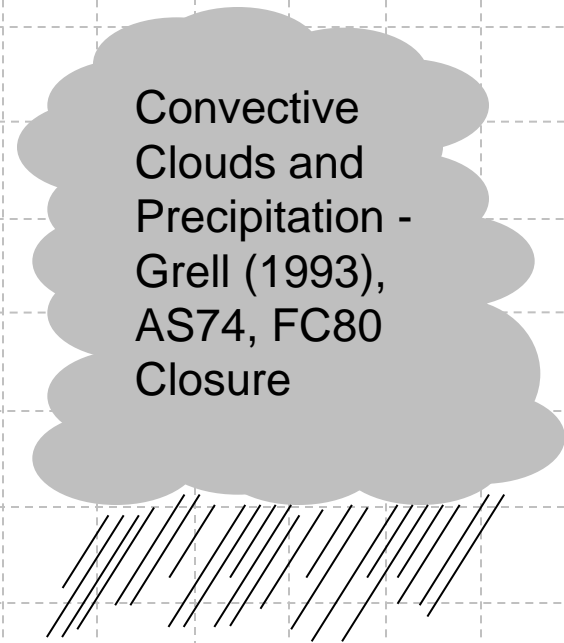


Atmospheric Radiation-  
Kiehl (1996)

Resolvable Scale Clouds and  
Precipitation – SUBEX (Pal, 2000)



Convective  
Clouds and  
Precipitation -  
Grell (1993),  
AS74, FC80  
Closure

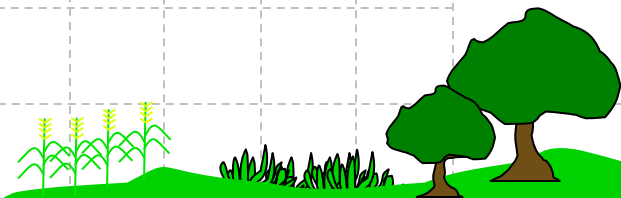


Planetary Boundary  
Layer- Holtslag (1990)

Sea Surface Temperatures - NOAA, EH5OM GCM

Ocean Flux Parameterization -  
Zeng (1998)

Surface Physics -  
IBIS (Foley, 1996; Winter, 2009),  
BATS1e (Dickinson, 1993)



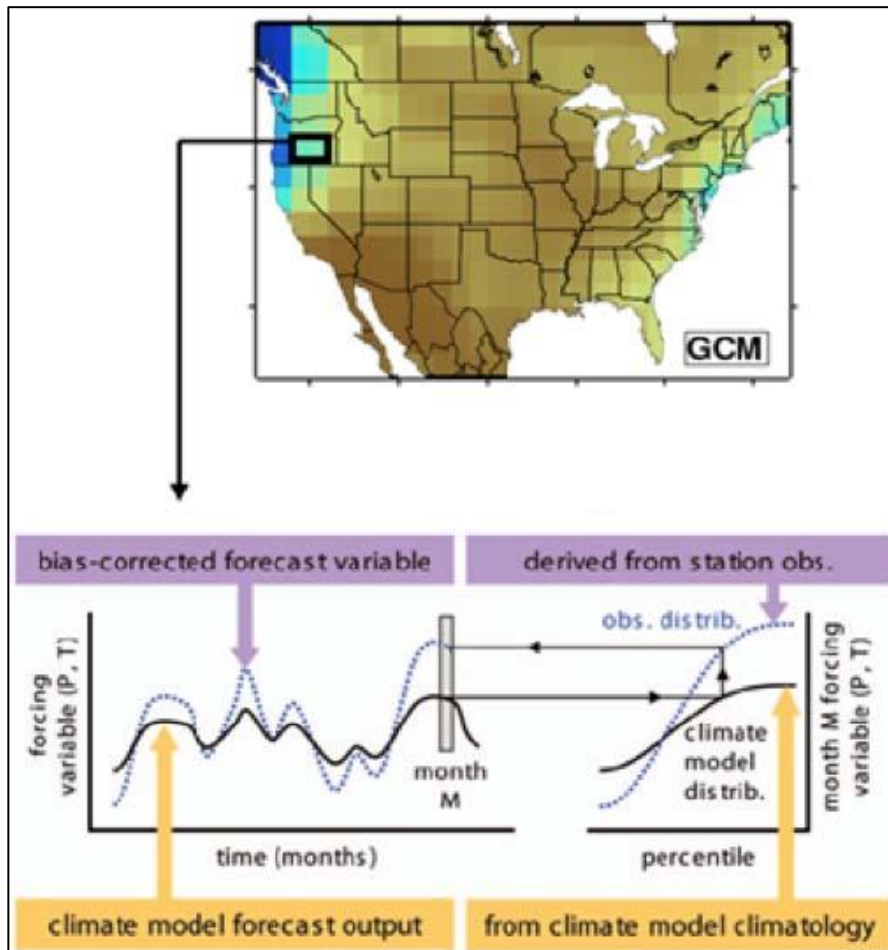


# Statistically Downscaled GCMs

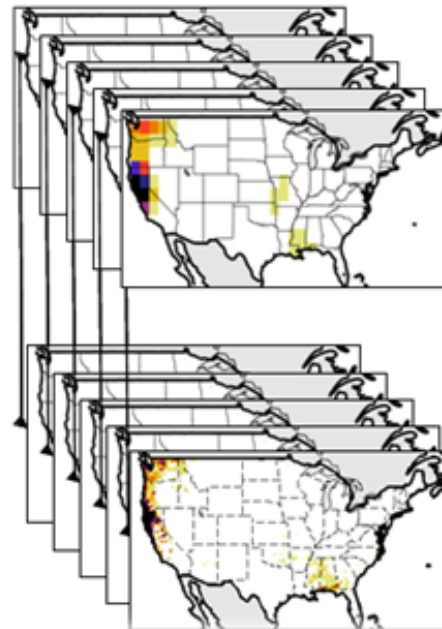
- Bias correct and downscale GCM data based on interpolated station observations
- Multiple methods and target observational datasets
- High resolution
- Removes some inaccuracies of GCMs
- Limited spatial coverage
- Climate projections constrained by observational record or extrapolations of observational record



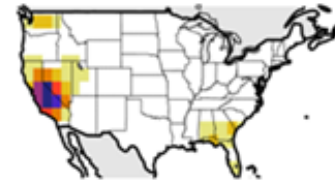
# Bias Correction using Constructed Analogs (BCCA)



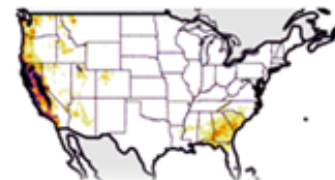
Library of previously  
observed anomaly  
patterns:



Given daily GCM  
anomaly



Coarse resolution  
analogue:





# Projected Climate Change in our Study Region using the Delta Method

Justin Guilbert

PhD Student

Annual EPSCoR Meeting

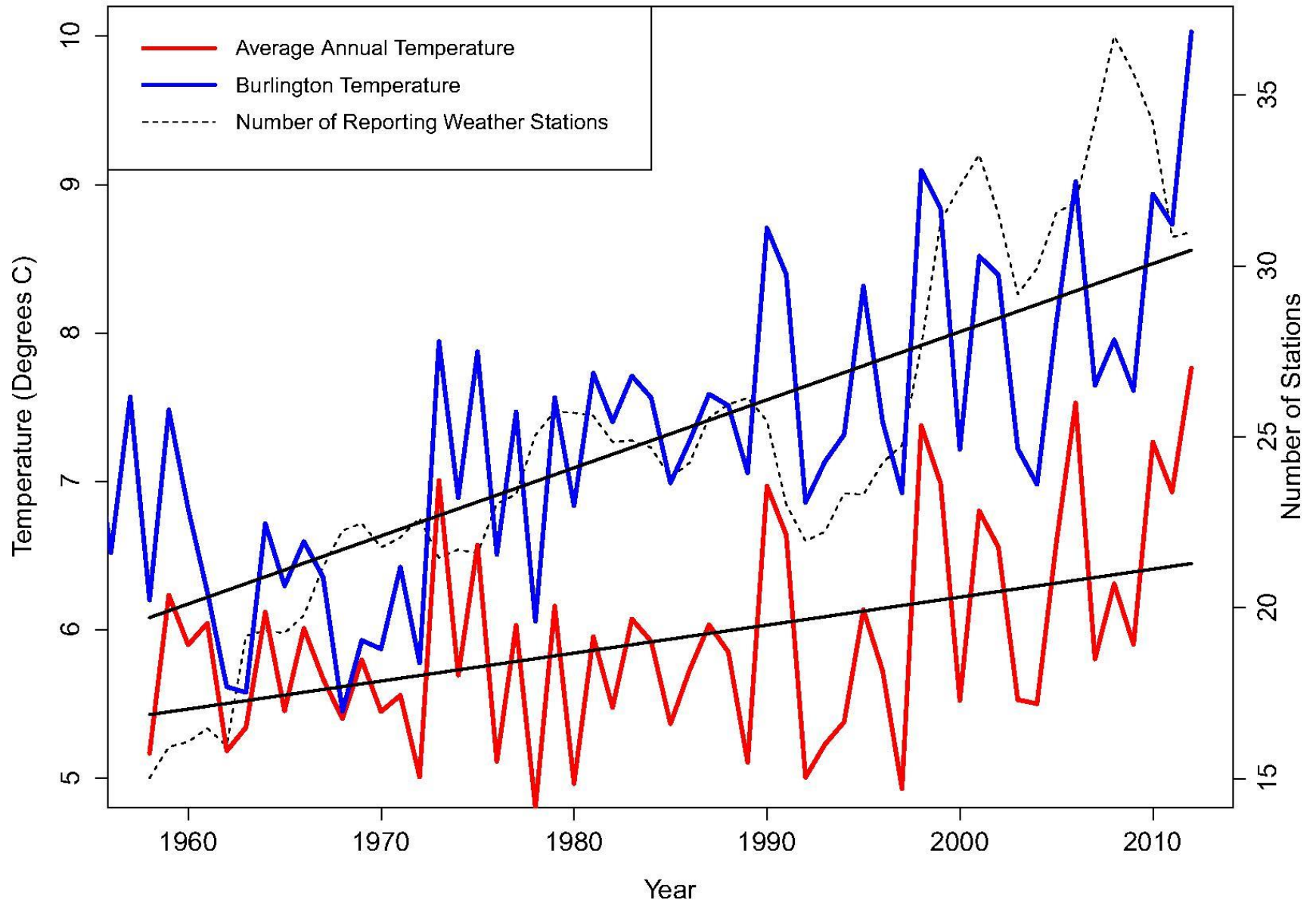


# Goals

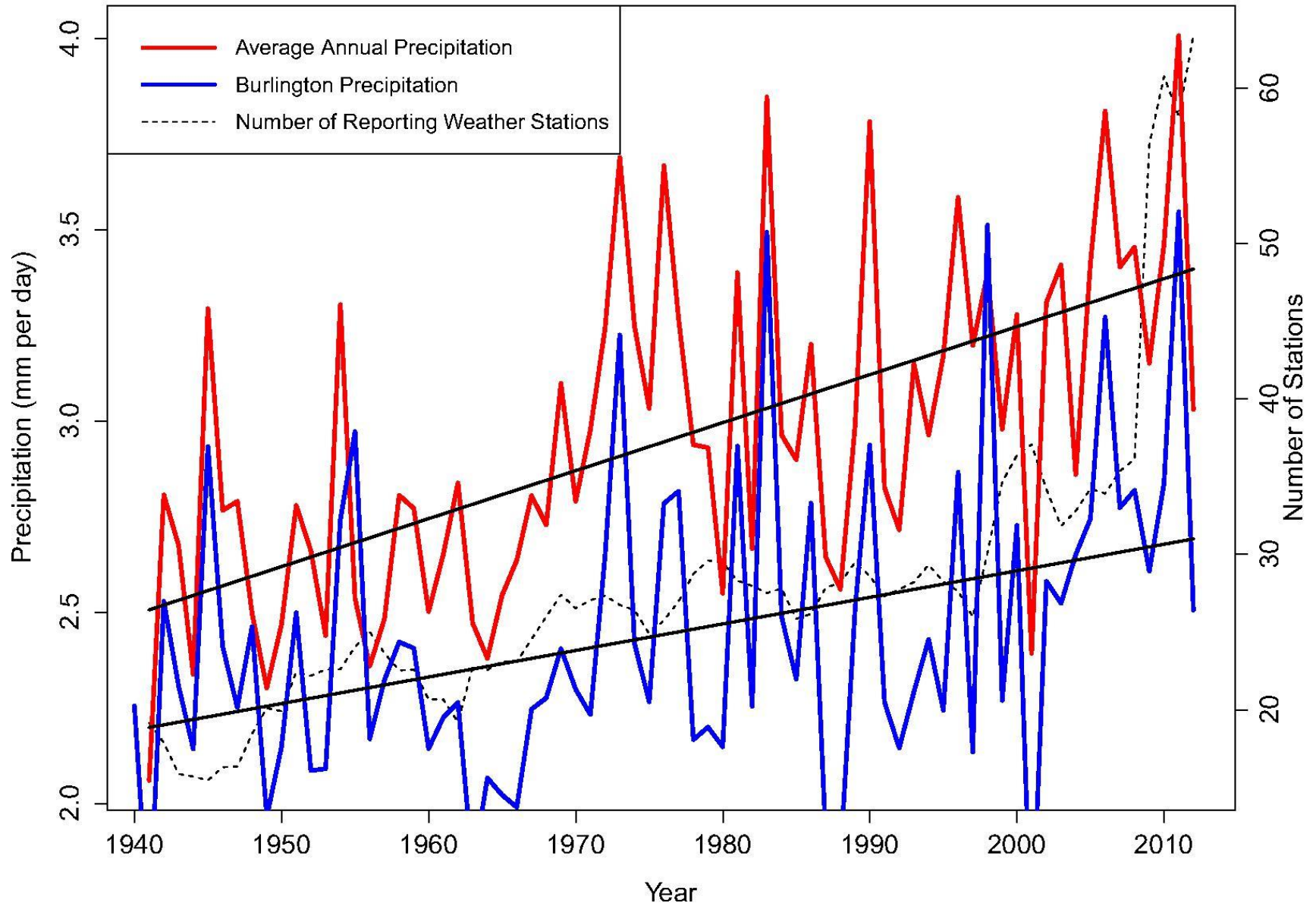
- Using the BCCA 1/8<sup>th</sup> degree product and 1/8<sup>th</sup> degree PRISM(observation based) data:
  - Project of future temperature and precipitation
  - Ranges of uncertainty in projections
  - Develop metrics for snowfall, length of growing season, and moisture balance using climate projections

# Historical Data

## Temperature

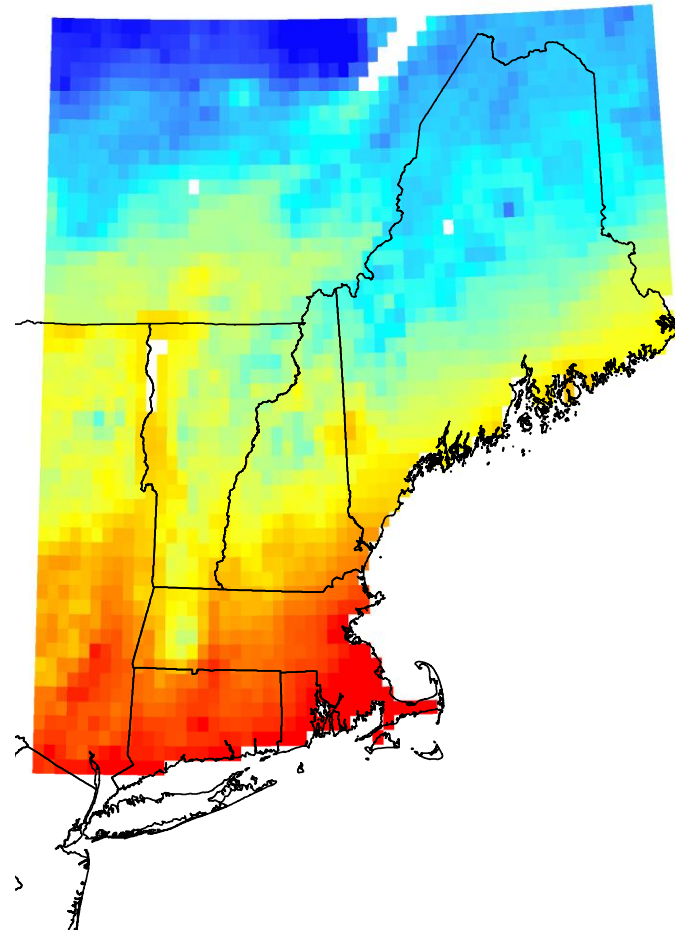
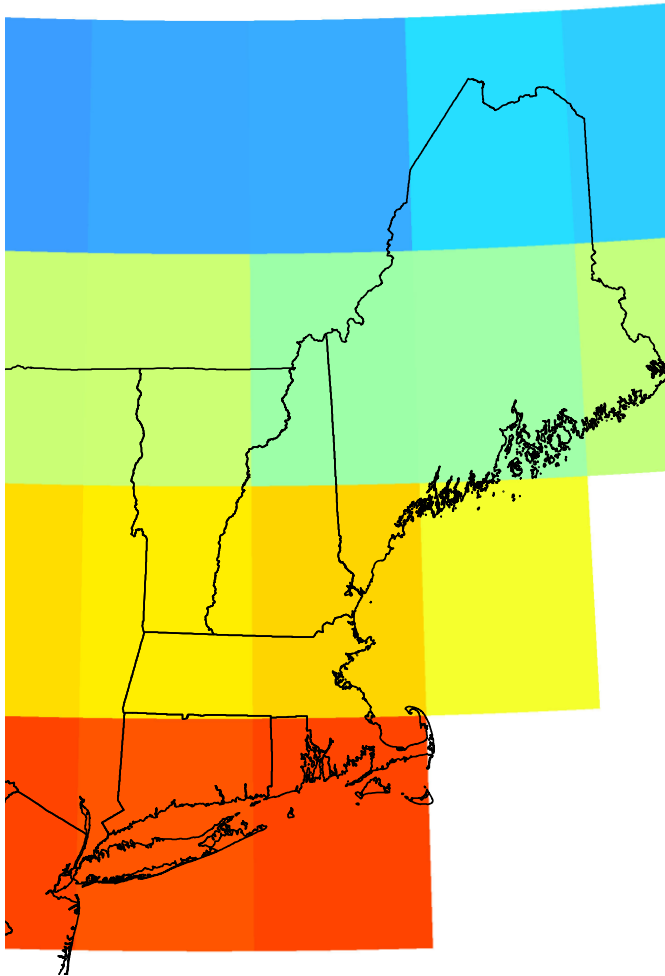


# Historical Data



# 250 km $\rightarrow$ 12 km

## New England Grid Cell Size Comparison



0 125 250 500 Kilometers





# Sources of Uncertainty

## 1. Different Storylines

- A2, A1B, and B1 storylines

## 2. Different GCMs

- cccma\_cgcm3\_1 ~ Canadian Centre for Climate Modelling and Analysis
- ipsl\_cm4 ~ Institut Pierre Simon Laplace, France.
- mri\_cgcm2\_3\_2a ~ Meteorological Research Institute, Japan Meteorological Agency, Japan

# Delta Method Calculations

- Temperature:

$$\textit{Delta} = \textit{BCCA Future Projection} - \textit{BCCA Baseline Simulation}$$

$$\textit{Future Projection} = \textit{PRISM Baseline} + \textit{Delta}$$

- Precipitation:

$$\textit{Delta Factor} = \textit{BCCA Future Projection} / \textit{BCCA Baseline Simulation}$$

$$\textit{Future Projection} = \textit{PRISM Baseline} \times \textit{Delta Factor}$$

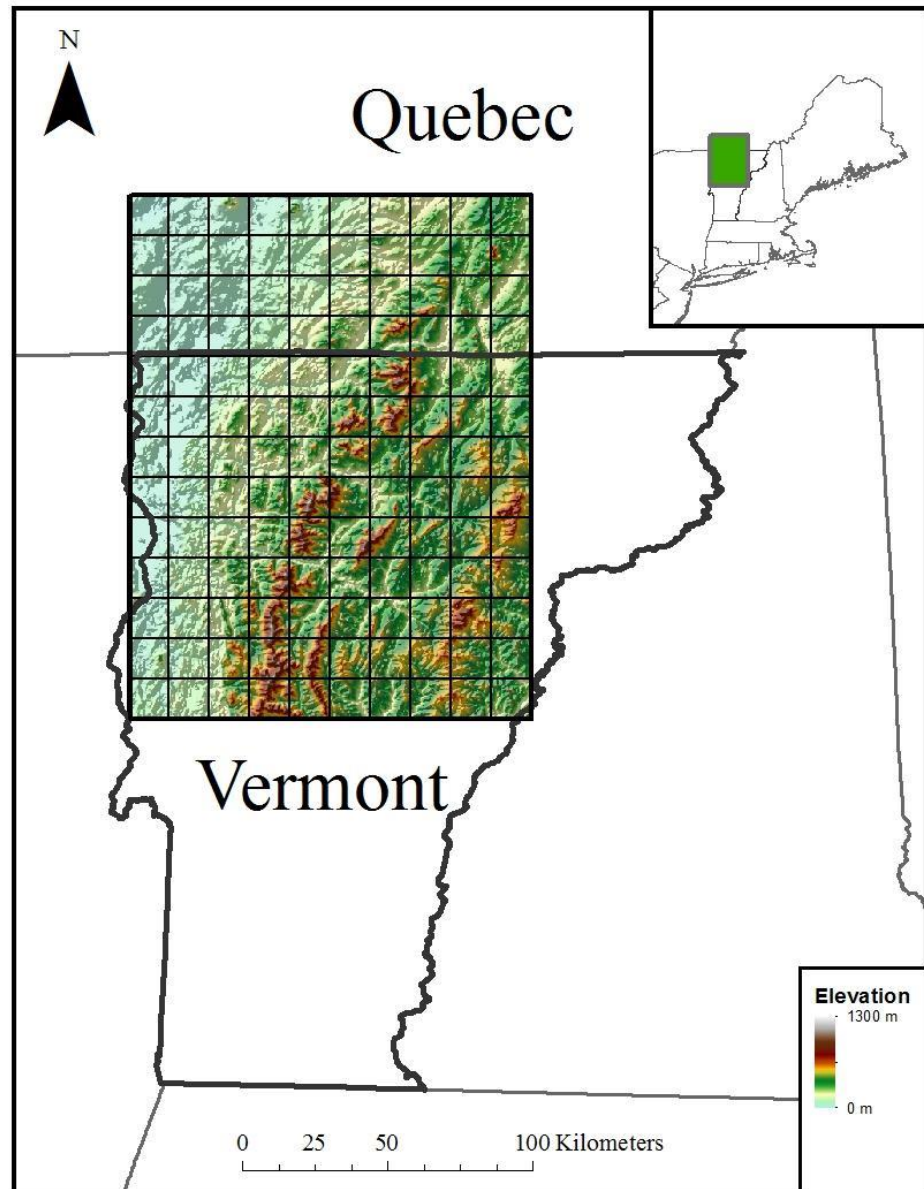
# Why use the Delta Method

- Pros
  - Eliminate the biases associated with using GCM data
  - Straight forward
  - Computationally inexpensive
- Cons
  - Limited by quality of PRISM data
  - Daily and inter-annual variability are held constant

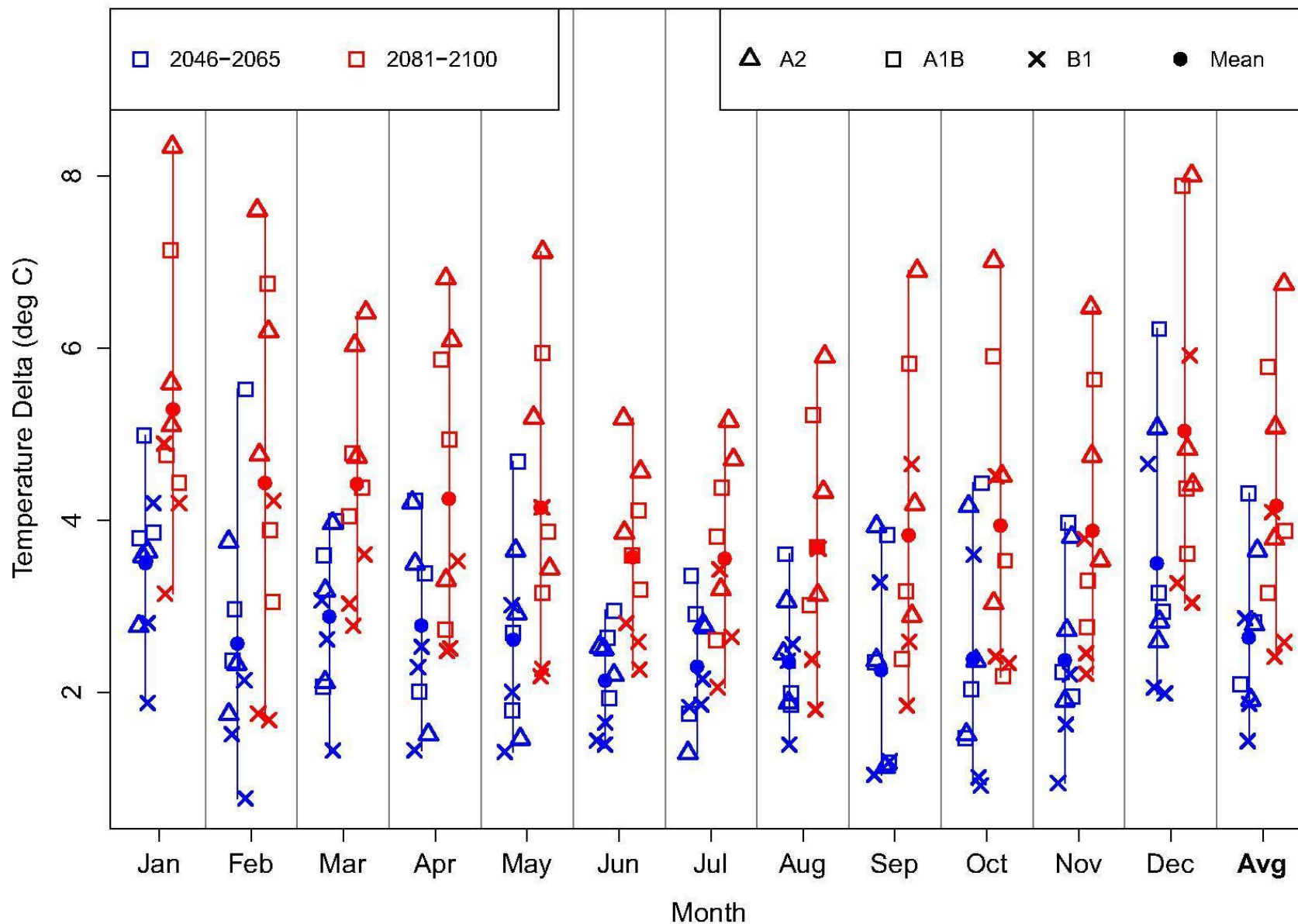
# BCCA Cells

## Study Region:

- 130 cells
- 12 km by 12 km cells
- Encompasses Winooski and Mississquoi watersheds

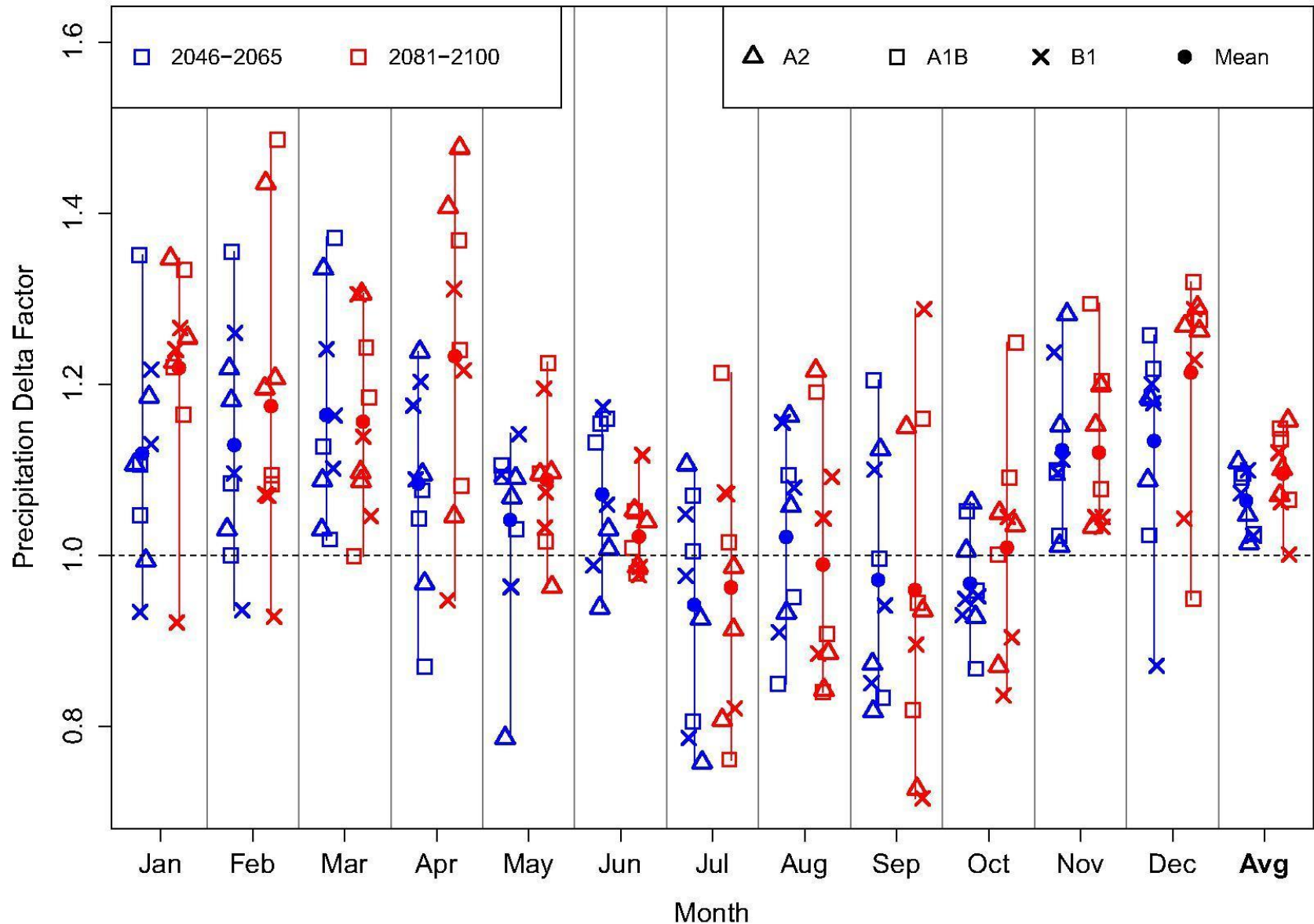


# Temperature Change

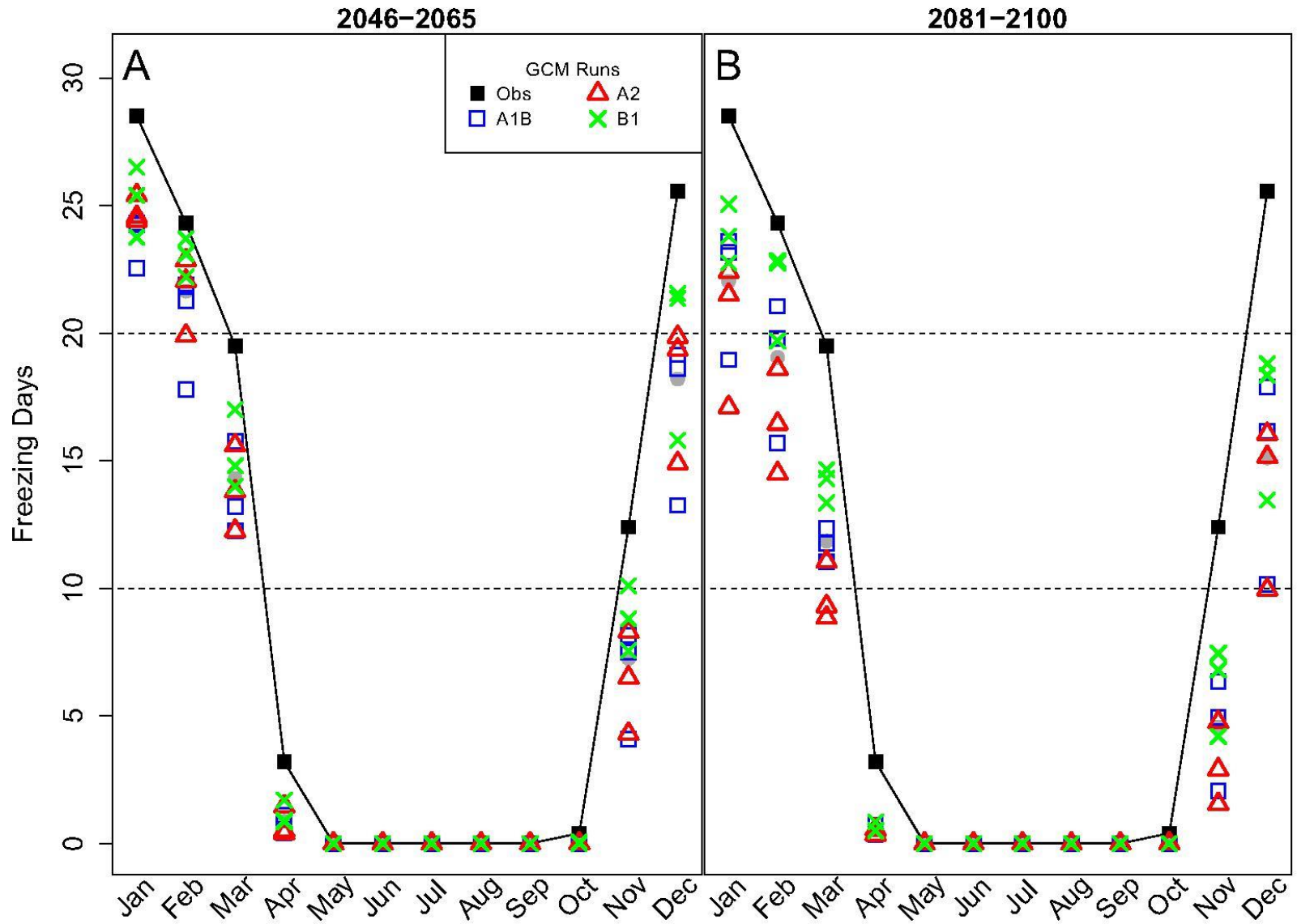




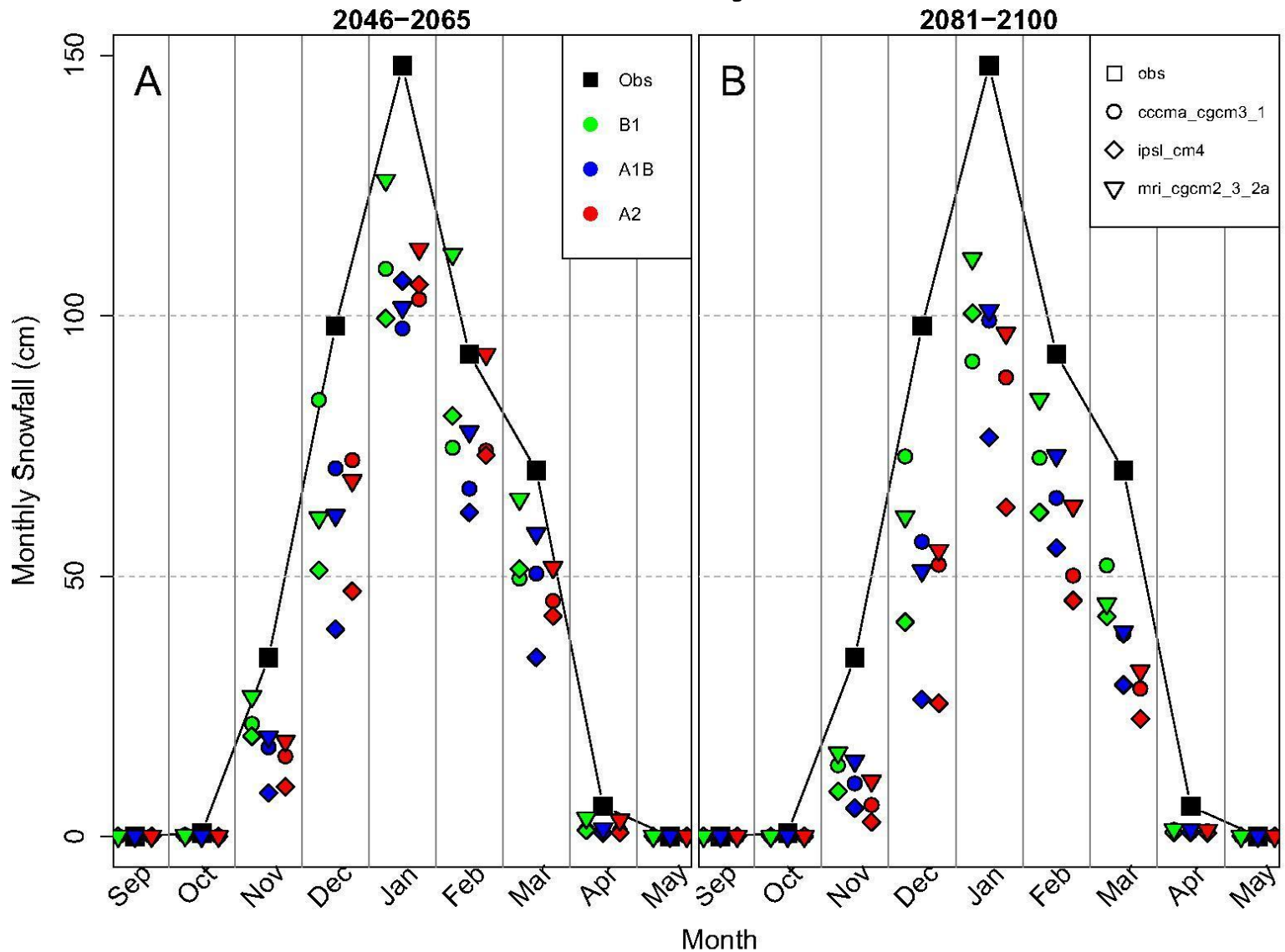
# Precipitation Delta Factors



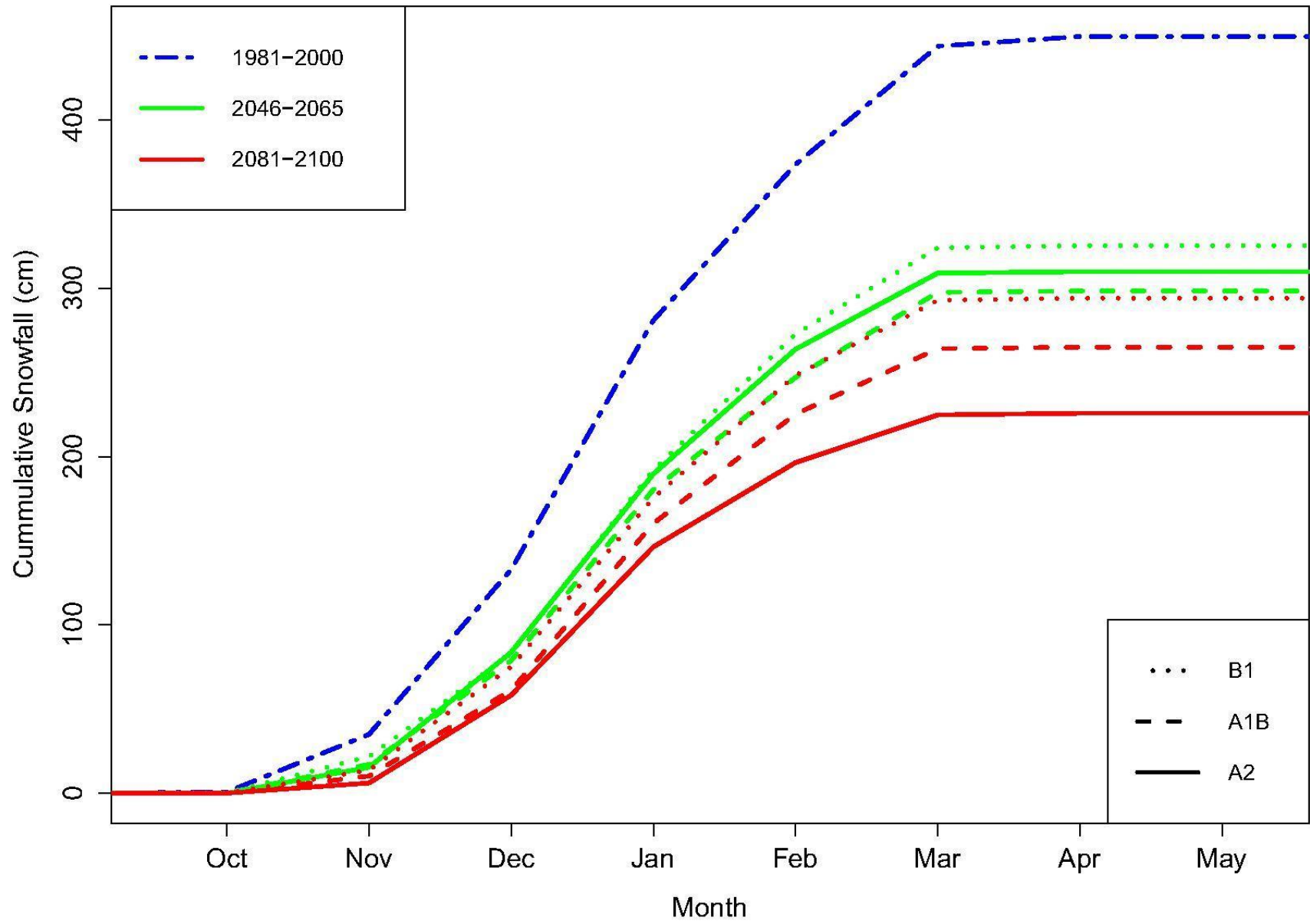
# Days Below Freezing



# Snowfall by Month

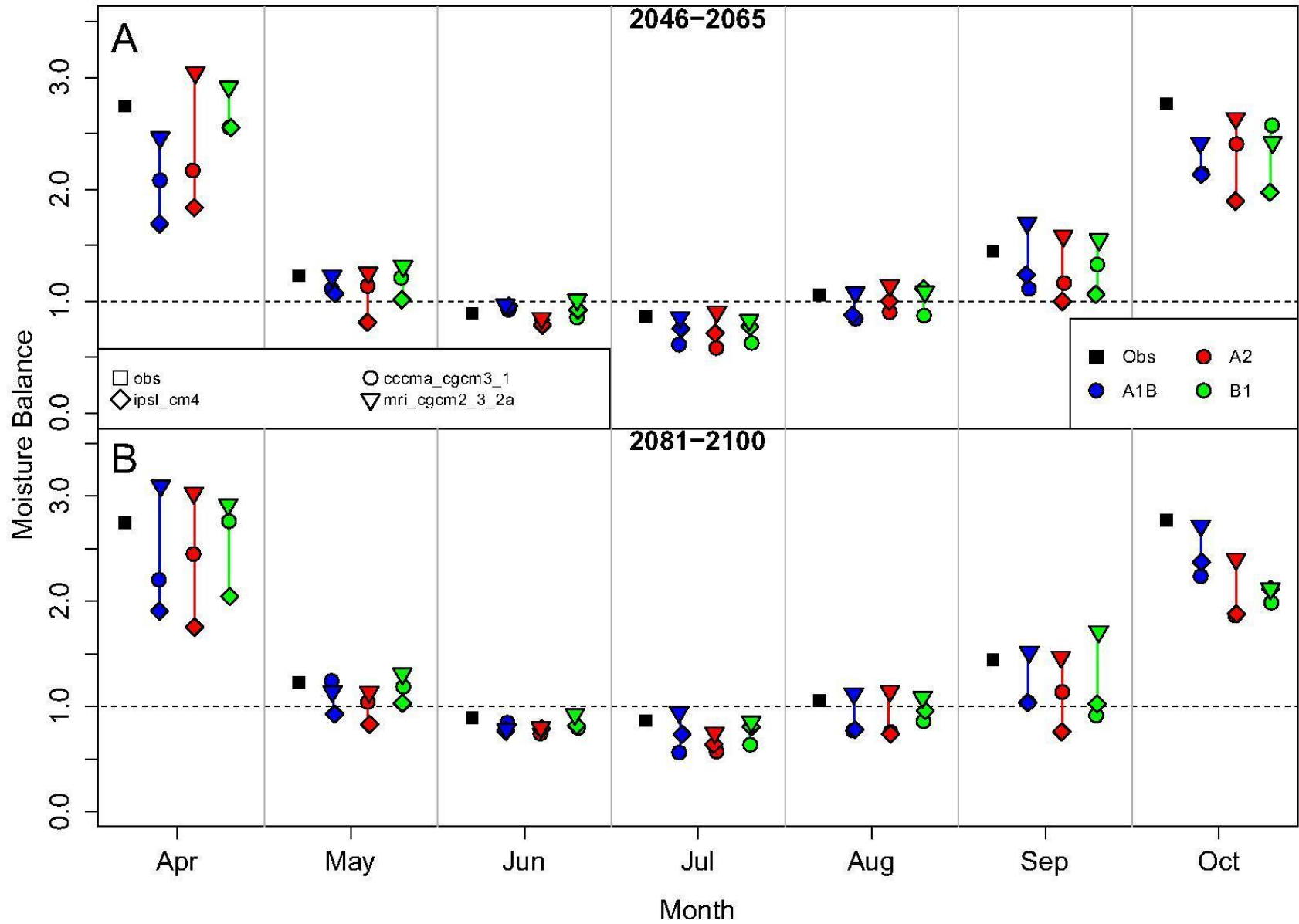


# Cumulative Snowfall



# Moisture Balance

(ratio of precipitation to potential evapotranspiration)







# Downscaling climate simulations to 1 km spatial resolution

Gabriela Bucini  
RACC Postdoctoral associate

EPSCoR annual meeting  
May 16, 2013

# Overview

**Goal:** produce high-resolution climate projections for our study region

**Application:** inputs to regional hydrological, ecological and social models

**Challenge:** impacts models run at finer resolution than global climate models,  
necessitates producing high-resolution climate projections

# Our approach

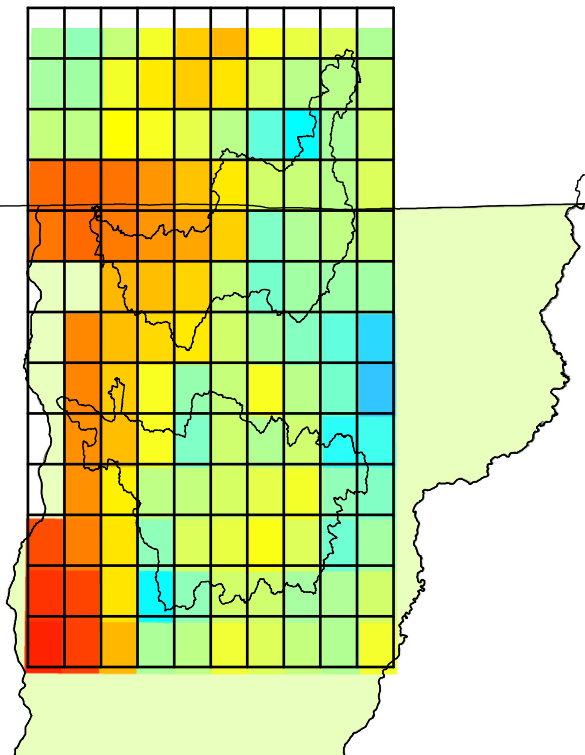
**Approach:** add information by taking advantage of fine-resolution topography

This requires identifying a relationship between climate variables and elevation

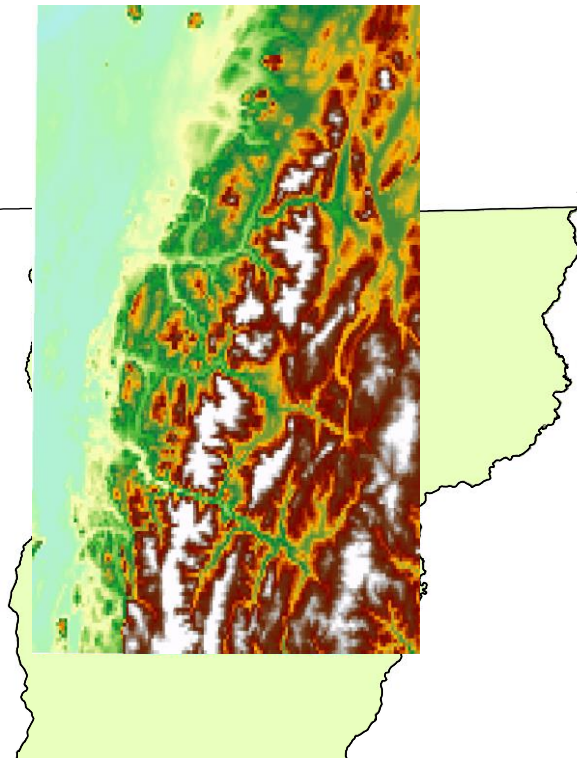
# 12 km to 1 km

## grid cell size comparison

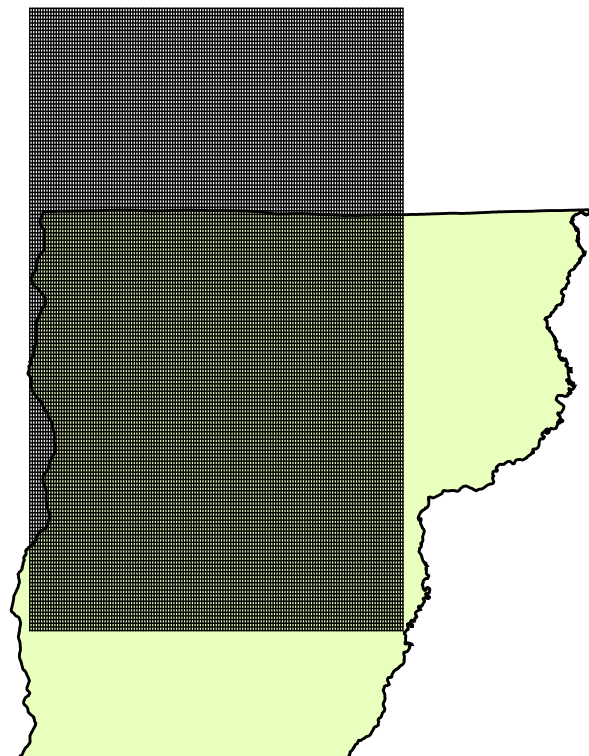
BCCA GRID



1 km DEM



TARGET GRID



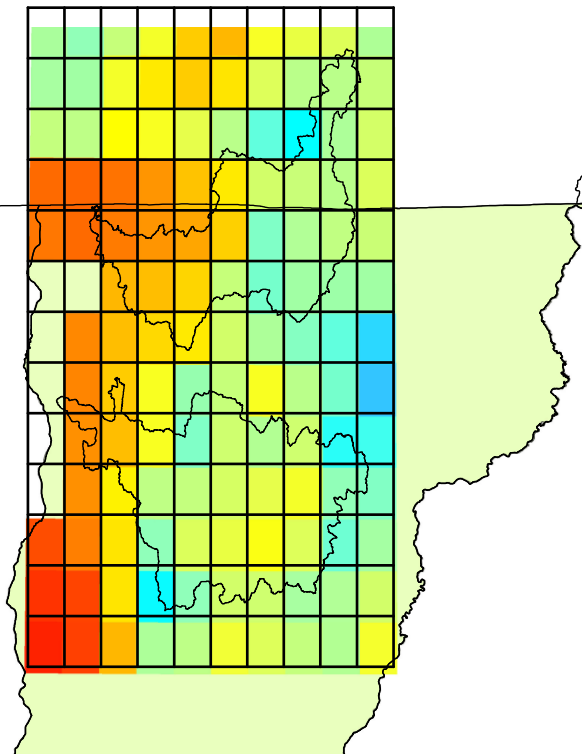
0 25 50 100 Kilometers



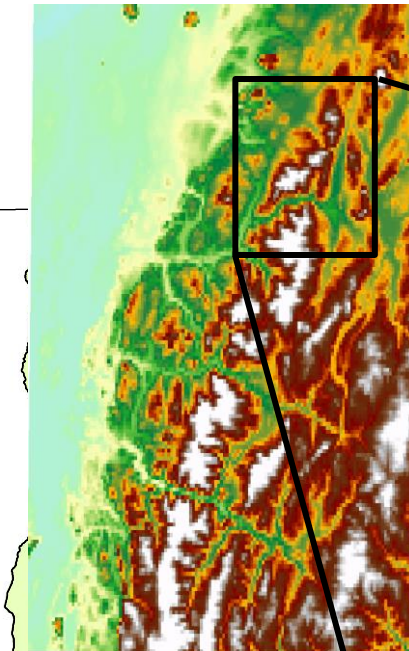
# 12 km to 1 km

## grid cell size comparison

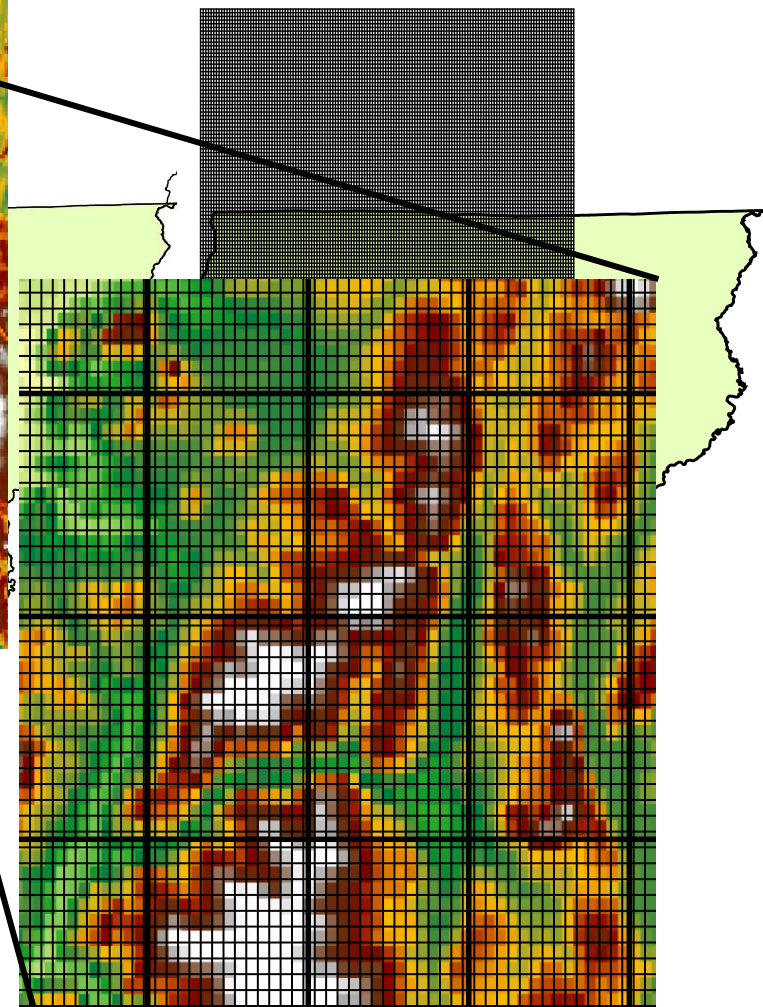
BCCA GRID



1 km DEM



TARGET GRID

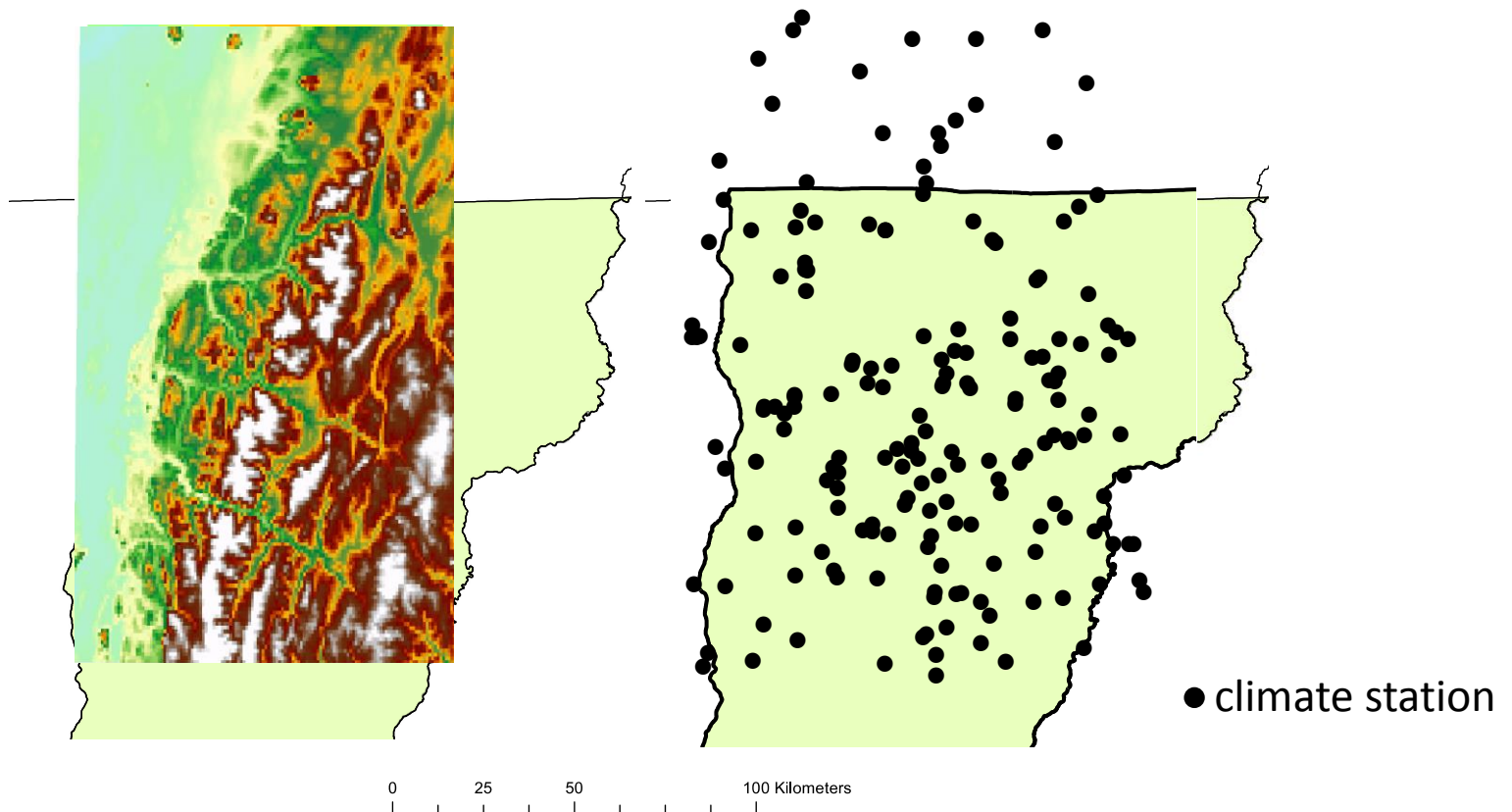


0 25 50 100 Kilometers

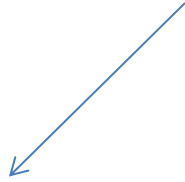
# LAPSE RATES

Precipitation =  $f_p(\text{elevation})$

Temperature =  $f_T(\text{elevation})$

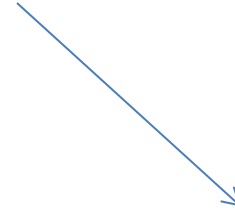


# Lapse rates can...



**be constant**  
within and across  
years

OR



**change**  
within and  
across years

Are lapse rates ( $f_p$  and  $f_T$ ) stationary through time?

IF YES



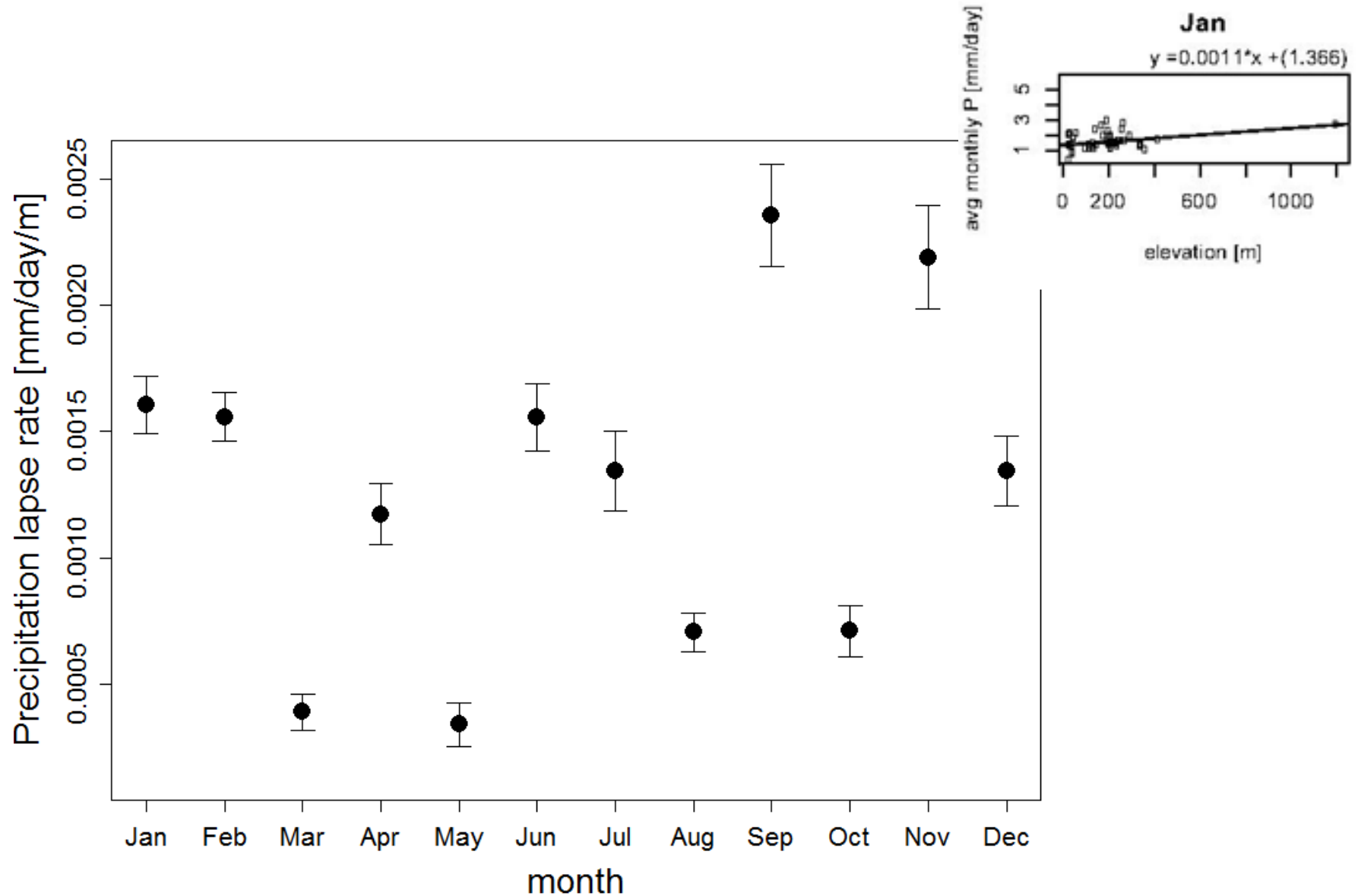
We can apply the observed relationships to future climate

IF NO



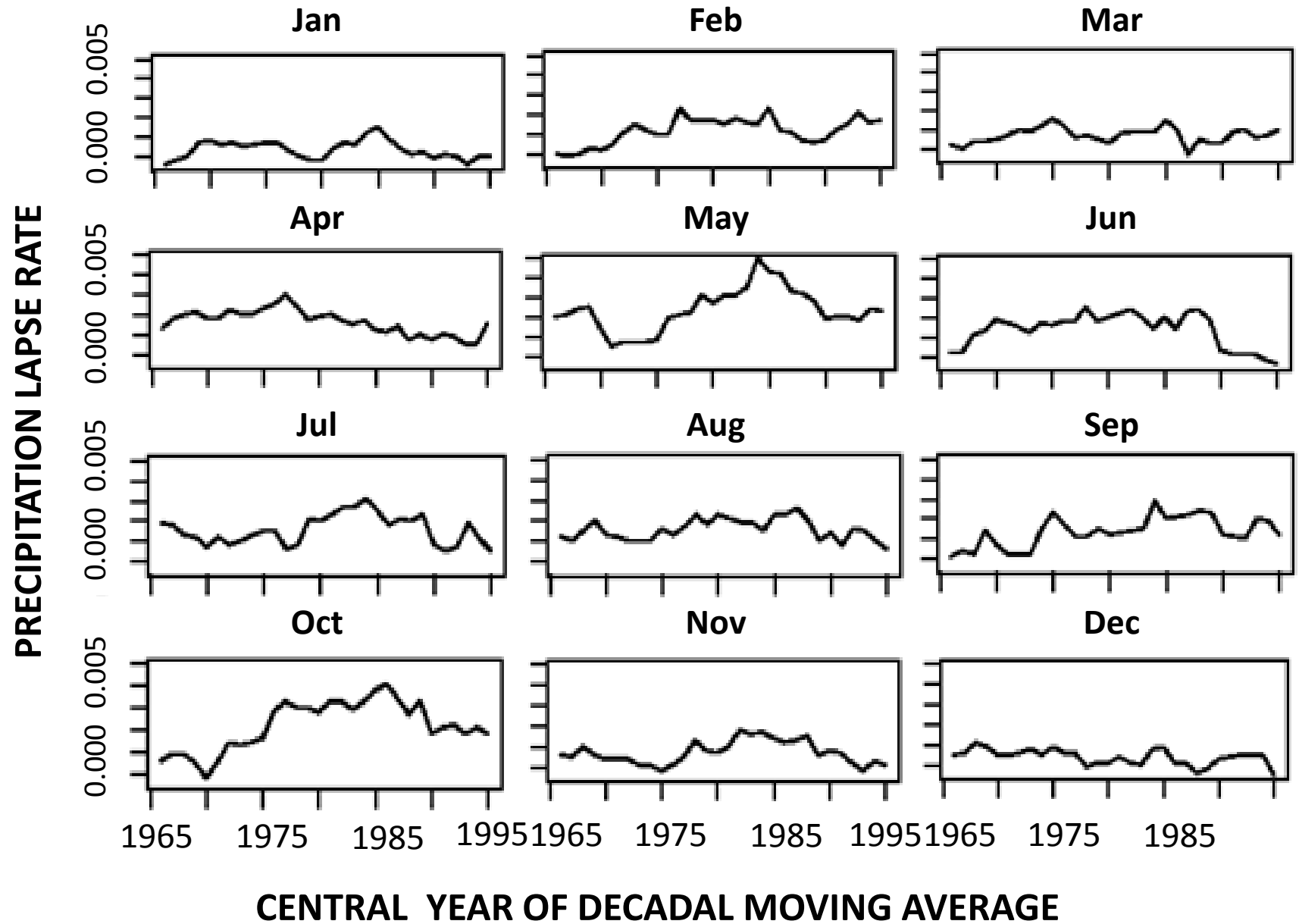
We need to determine how lapse rates change through time

# Lapse rate change across months





# Lapse rates change across decades



Observed lapse rates change with time

How will they change in the future?

We do not have future station measurements so we need to rely on modeled climate data for our predictions.

Do modeled lapse rates behave in the same way as the station lapse rates?

# Are lapse rates calculated from BCCA and station data the same?

IF YES



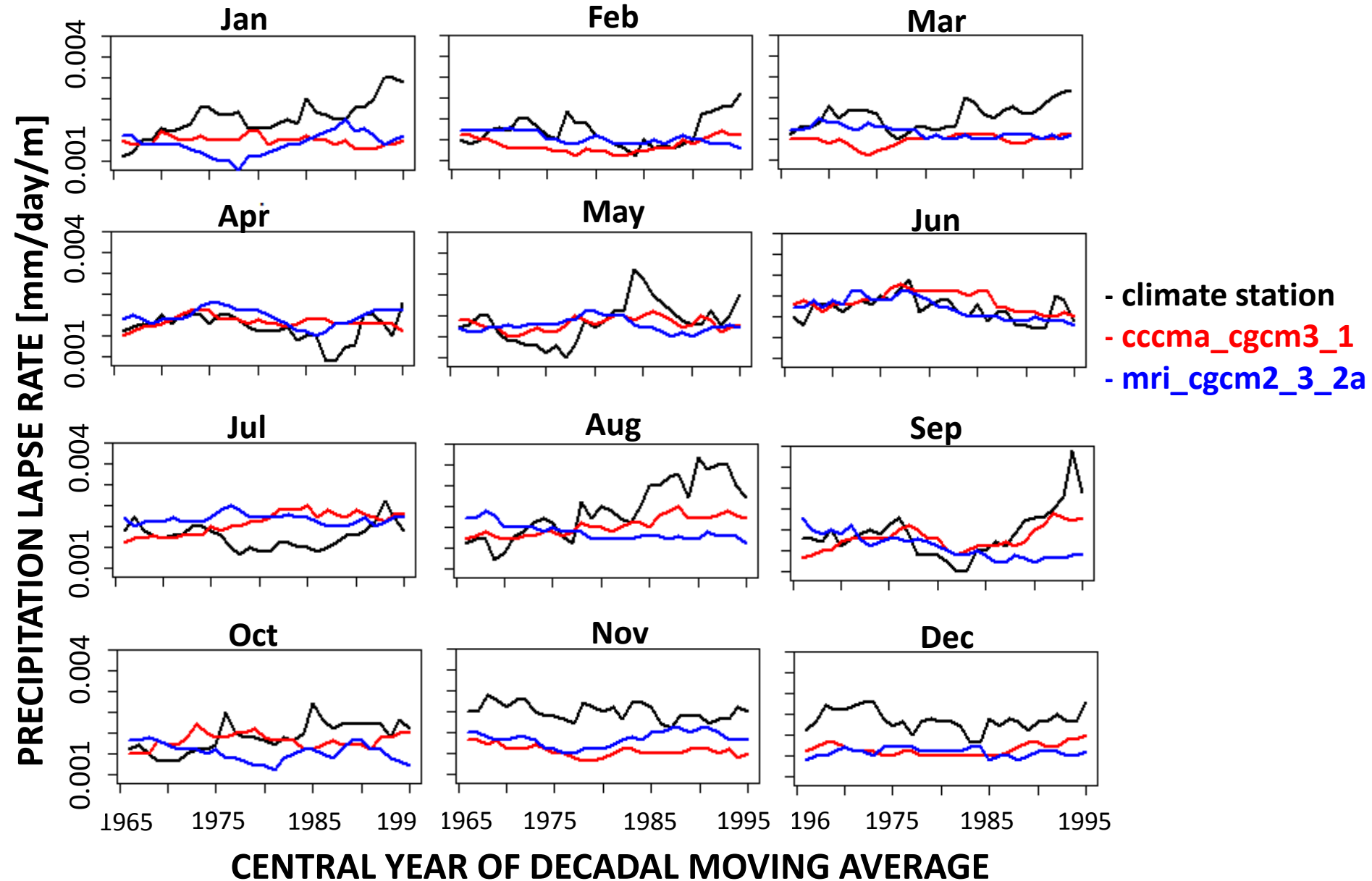
We can apply BCCA lapse rates to future projections

IF NO



We need to determine how station and BCCA lapse rates are related.

# Observed and BCCA lapse rates are dissimilar



# Summary

1. Lapse rates are NON-STATIONARY
  - within a year
  - across years
2. Lapse rates are DISSIMILAR between STATION observations and BCCA

Precipitation =  $f_p(\text{elevation, time, data set})$

Temperature =  $f_T(\text{elevation, time, data set})$

# Future work

1. Construct competing statistical models for lapse rate correction for temperature and precipitation
2. Select best model using station data
3. Apply best model for downscaling BCCA data to 1 km grid



# Thank you

# Future directions

1. Submit manuscript on climate change projections (Delta method): Summer 2013.
2. Complete statistical downscaling of climate change projections: Fall 2013.
  - Submit manuscript: Winter 2013
3. Dynamical downscaling using regional climate models: Begin using NCAR WRF RCM in Fall 2013.

# Questions?

