

# **Comparison of downscaling techniques for stakeholder-driven research in the urban Northeast U.S**

**Radley Horton, Daniel Bader, Adam Greeley, Alex  
C. Ruane, and Cynthia Rosenzweig**

**Columbia University / NASA GISS**

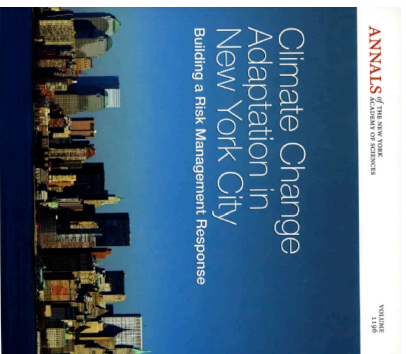
***International Conference on CORDEX  
Trieste, Italy, March 21, 2011***

# Outline

- **Stakeholder context and project examples in the Northeast U.S.**
- **Preliminary analysis of some NARCCAP results in the Northeast U.S., with comparison to other downscaling methods**
- **Application of NARCCAP intra-annual variability to crop models in the Southeast U.S.**
- **Overview of Agricultural Model Intercomparison and Improvement Project (AgMIP)**



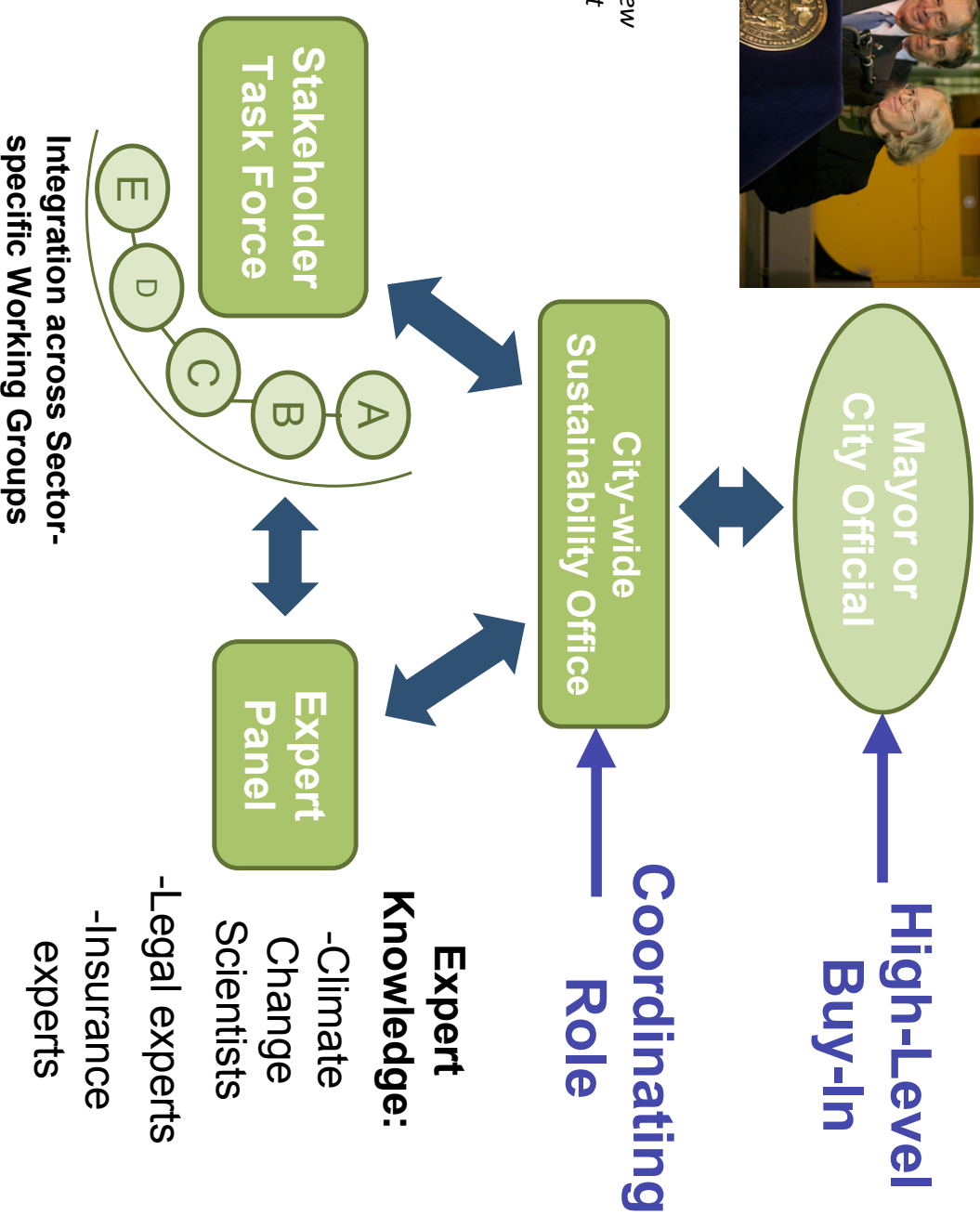
# NYC Stakeholder Engagement Process



New York City Panel on Climate Change  
2010 Report

*NPCC - Climate Change Adaptation in New York City: Building a Risk Management Response*

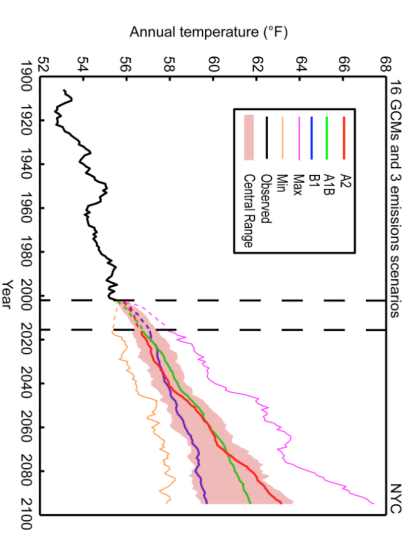
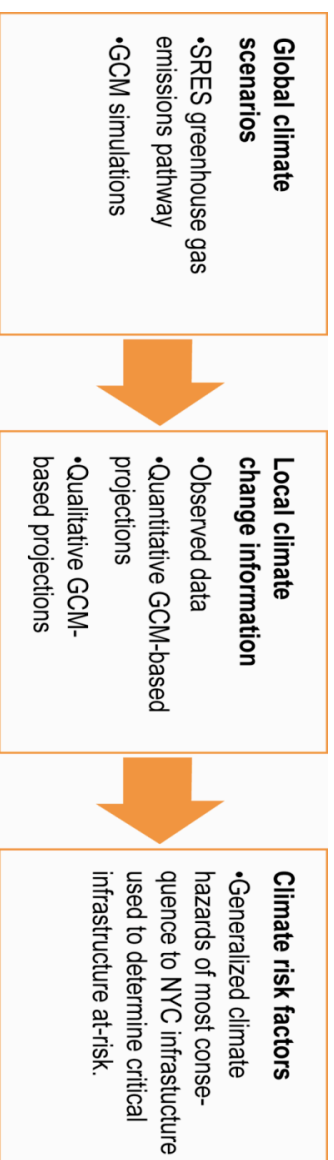
- Stakeholders include:**
- City Agencies
  - Regional Authorities
  - Private Stakeholders



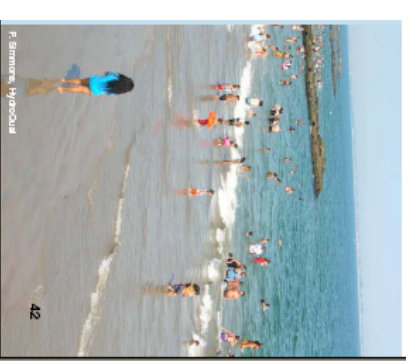
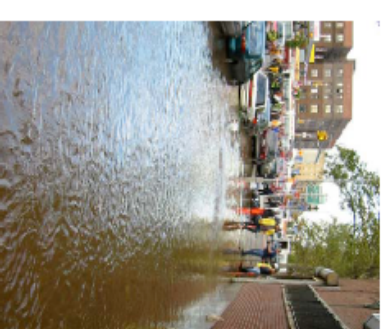
Source: NPCC, 2010

# Climate Hazard Information

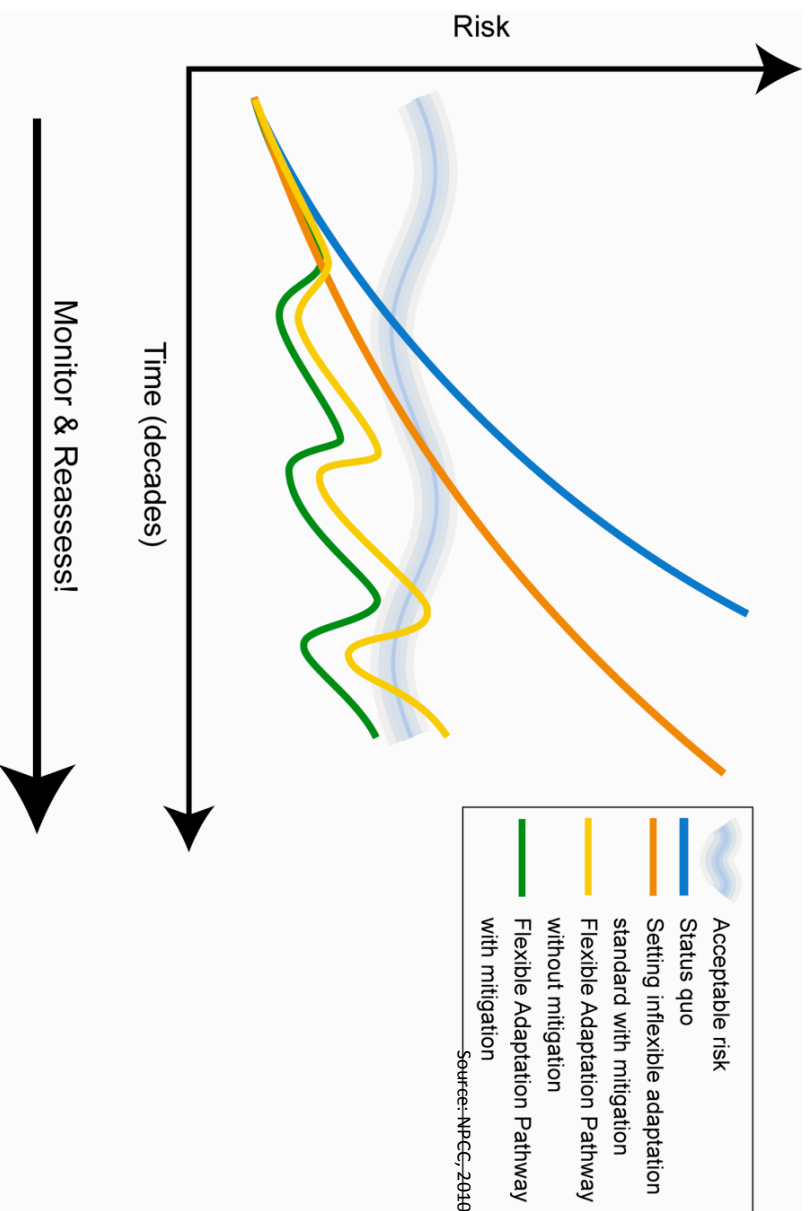
Process used to develop climate risk factors for New York City



- **Projection Range, based on 16 GCMs and 3 SRES scenarios**
- **Time slice experiments based on single GCM gridbox, delta method approach**
- **Key thresholds**
  - Number of days below 32 °F (transportation sector)
  - Number of days above 90 °F (energy and health sectors)
  - **Number of intense precipitation events (e.g., .5 in./day; water sector)**
- **Qualitative projections**



# Flexible Adaptation Pathways



*Key elements to achieve Flexible Adaptation Pathways are a guiding framework, stakeholder engagement, expert knowledge providers, recurring assessment process, Action Plans by decision-makers, and vertically/horizontally integrated projects with ongoing evaluation*

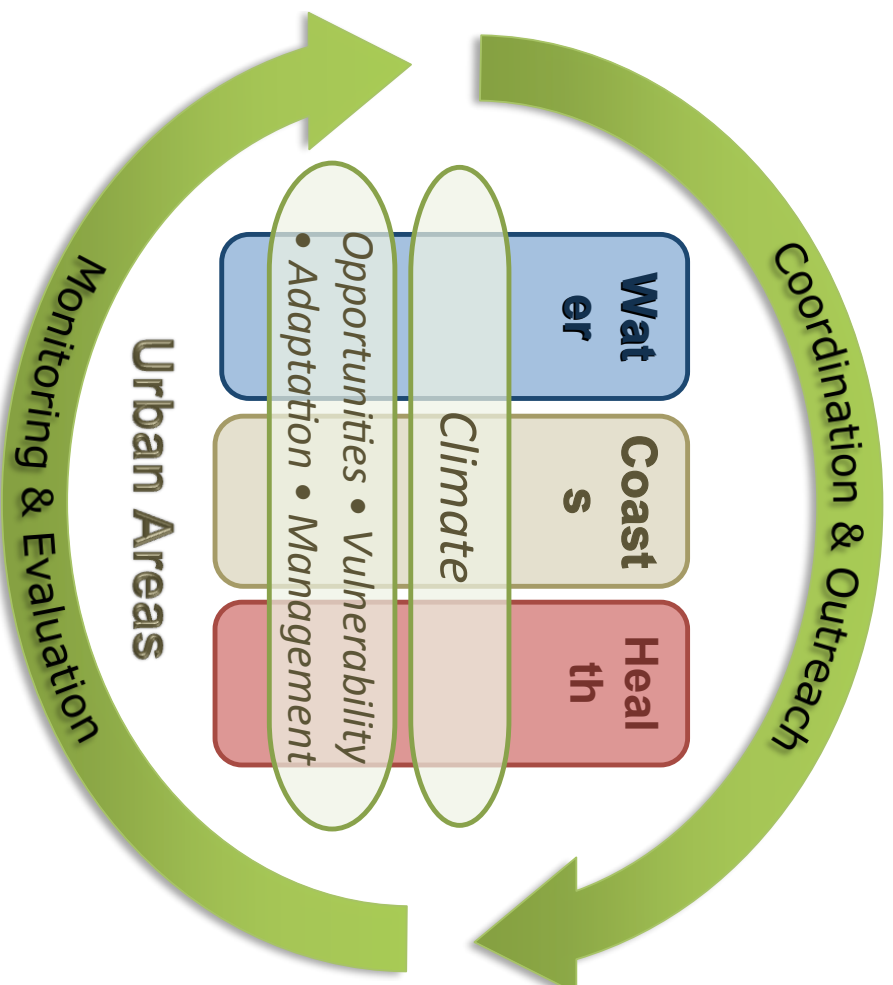
# Consortium for Climate Risk in the Urban Northeast (CCRUN)

A NOAA Regional Integrated Sciences and Assessments (RISA) Project

*Boston*

*New York*

*Philadelphia*



# Downscaling Products and Techniques

- **Single GCM gridbox approach**
  - Delta method applied to station data (NYC Panel on Climate Change)
- **Bias-Corrected and Spatial-Downscaled Projections** [http://gdo-dcp.ucllnl.org/downscaled\\_cmip3\\_projections/](http://gdo-dcp.ucllnl.org/downscaled_cmip3_projections/) (BCSD; Maurer, et al. 2007, based on Wood et al. 2002, 2004, and Maurer 2007)
  - Direct use of monthly time series for impact models
  - For daily projections at station level, we use delta method and random sampling
- **RCM simulations from the North American Regional Climate Change Assessment Program archive (NARCCAP; Mearns et al. 2009, EOS)**
  - Changes in frequency and duration of key extremes
  - Changes in (intra-annual) variability more generally
  - Delta method



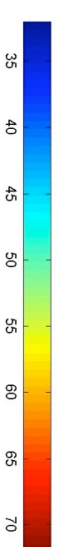
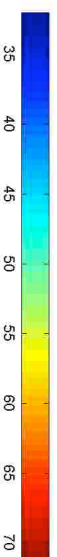
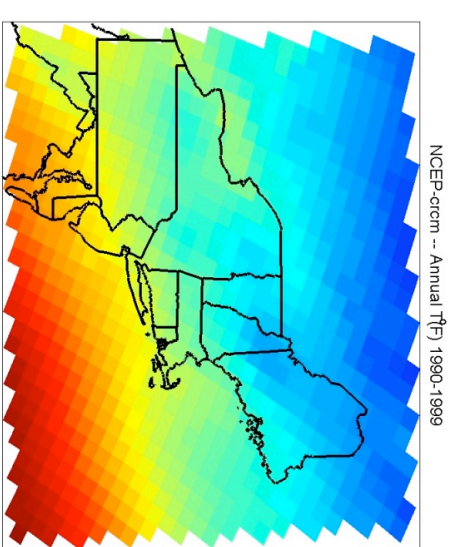
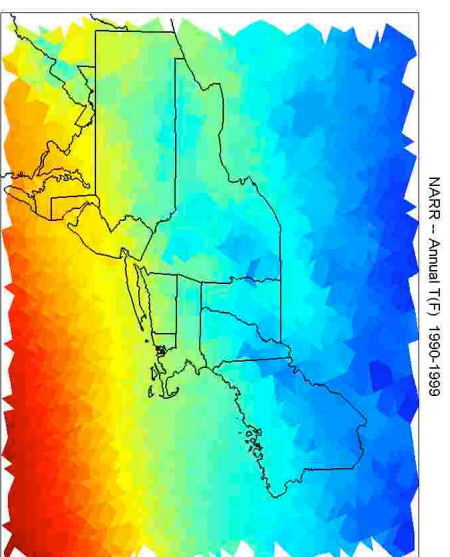
# NARCCAP Simulations

- **RCMs were run at 50km resolution for three experiments:**
  - **NCEP Reanalysis-driven, December 1979-November 2000:**  
*How well do the RCMs simulate 'observations' over the NE, when driven by 'perfect' boundary conditions?\**
  - **GCM hindcast-driven, December 1970-November 2000**  
*How sensitive are the RCM results to 'biases' in the driving GCMS?\**
  - **GCM future-driven, December 2041-November 2070, A2 SRES Scenario**  
*How does the forcing associated with greenhouse gases and other radiatively important agents manifest itself at more local scales?\**

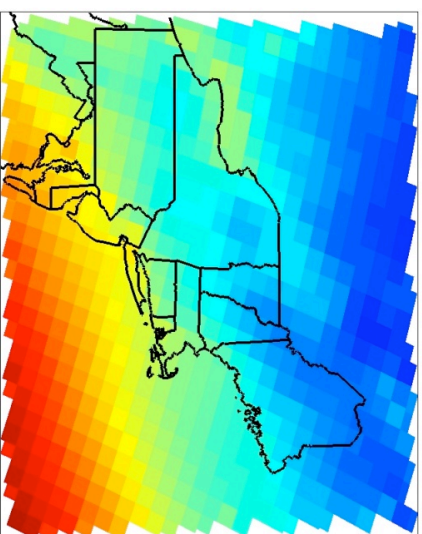
*\*Several caveats here...*

# Annual Temperature (°F), 1990-1999

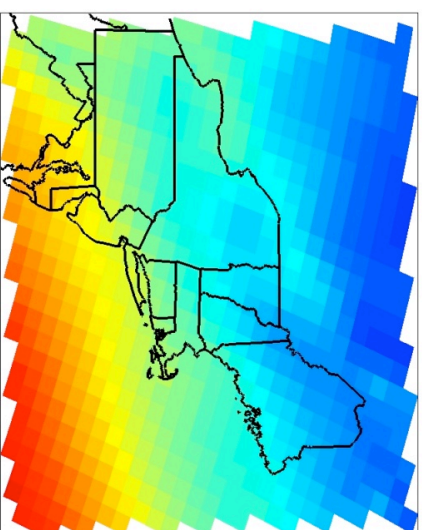
*How well do the RCMs  
simulate 'observed' mean  
temperature over the NE,  
when driven by 'perfect'  
boundary conditions?*



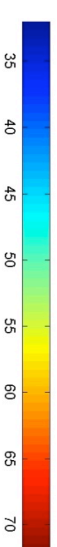
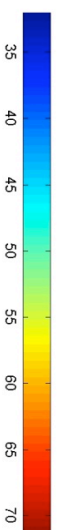
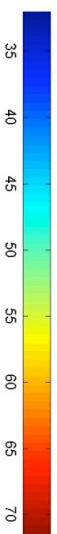
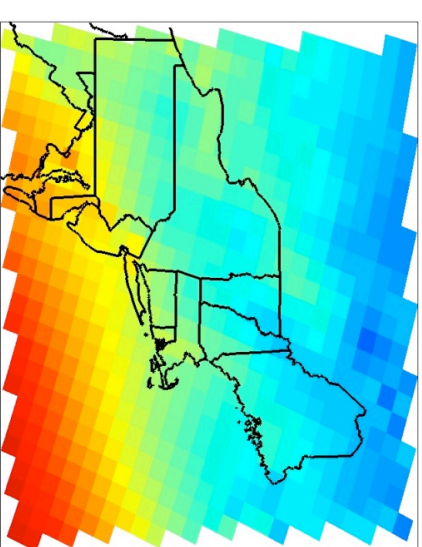
NCEP-mmsi -- Annual T(°F) 1990-1999



NCEP-rcm3 -- Annual T(°F) 1990-1999



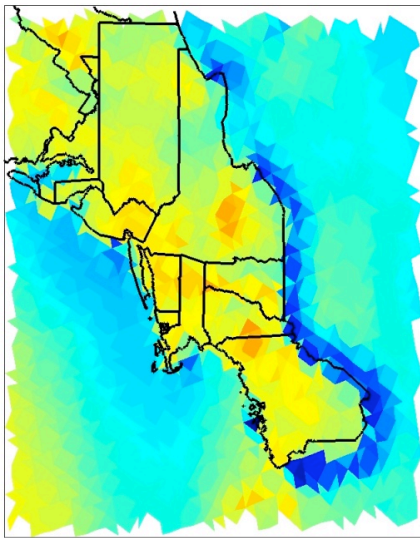
NCEP-wrfg -- Annual T(°F) 1990-1999



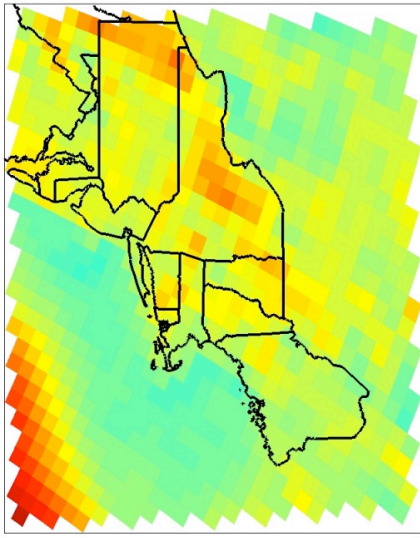
# Annual Precipitation (in./day), 1990-1999

*How well do the RCMs simulate 'observed' mean precipitation over the NE, when driven by 'perfect' boundary conditions?*

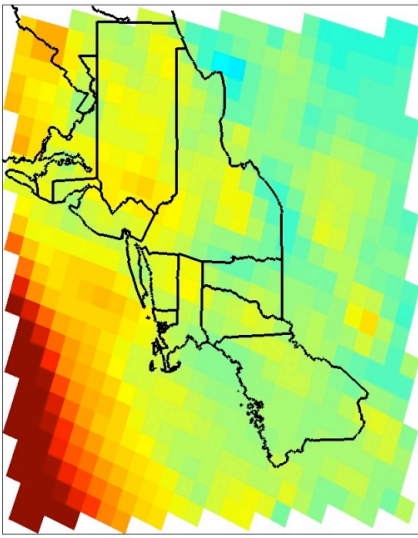
NARR -- Annual P(inches/day) 1990-1999



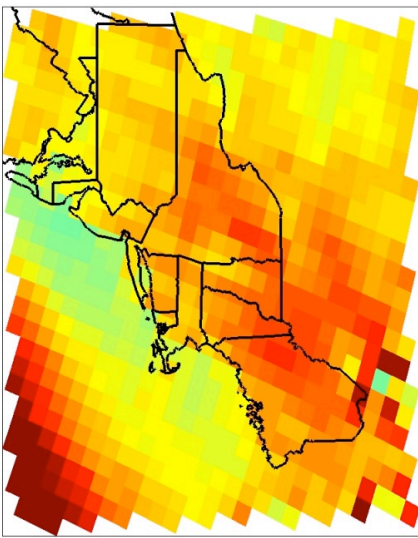
NCEPcrfm -- Annual P(inches/day) 1990-1999



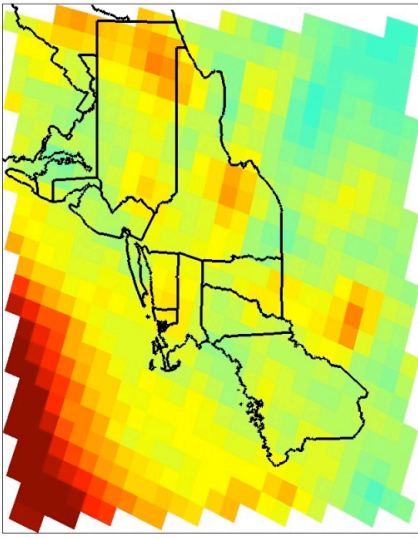
NCEPmm5i -- Annual P(inches/day) 1990-1999



NCEPrcm3 -- Annual P(inches/day) 1990-1999



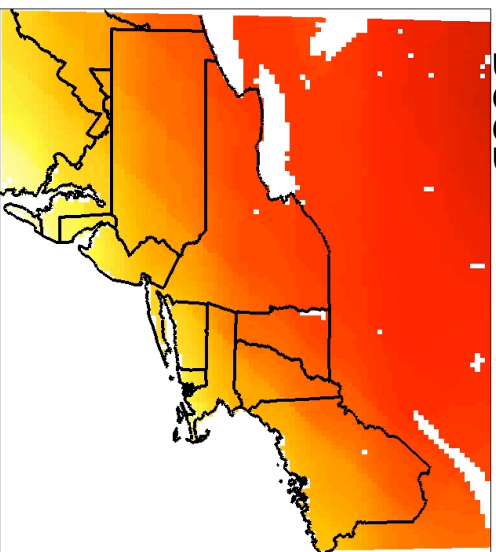
NCEPwrfg -- Annual P(inches/day) 1990-1999



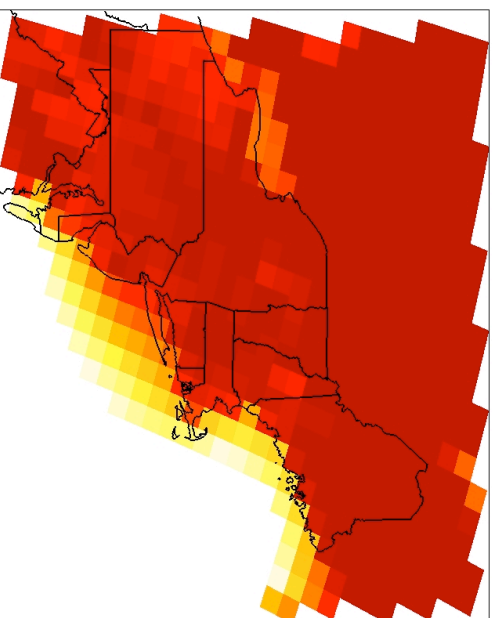


# Projections--Mean Annual Changes

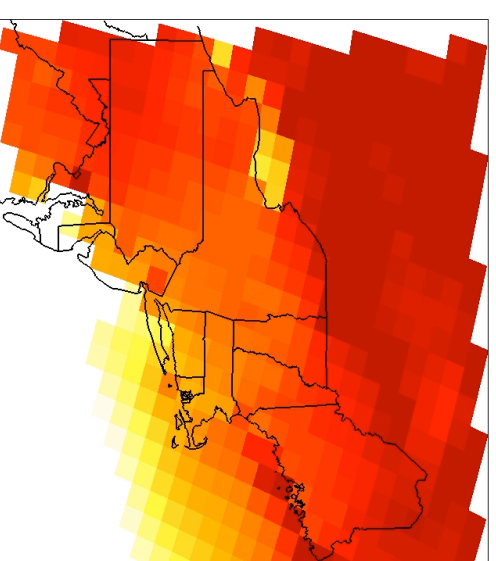
BCSD



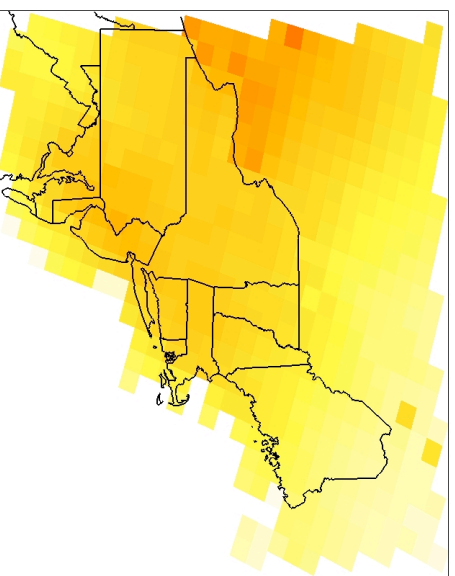
HADCM3-rm3 -- Annual dt (F)



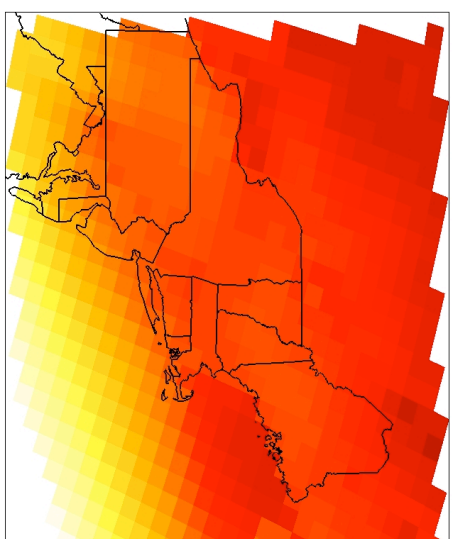
CCSM-wrfg -- Annual dt (F)



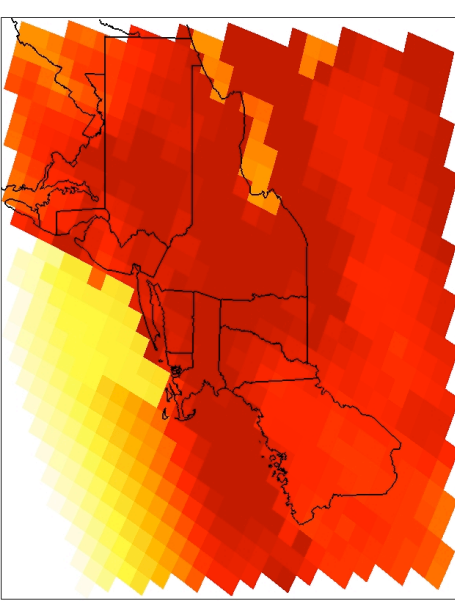
GFDL-cm3 -- Annual dt (F)



CGCM3-cm3 -- Annual dt (F)

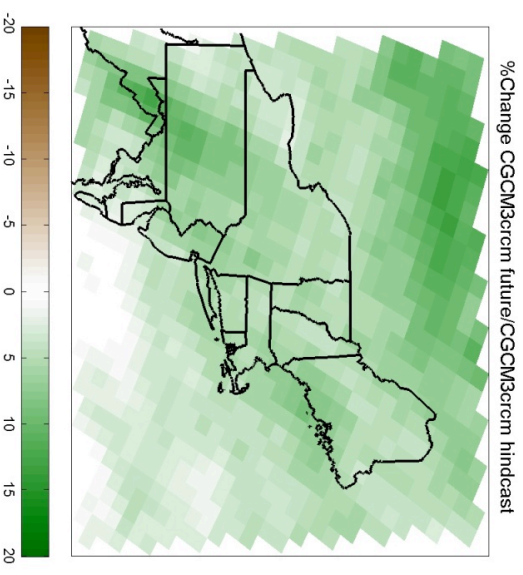
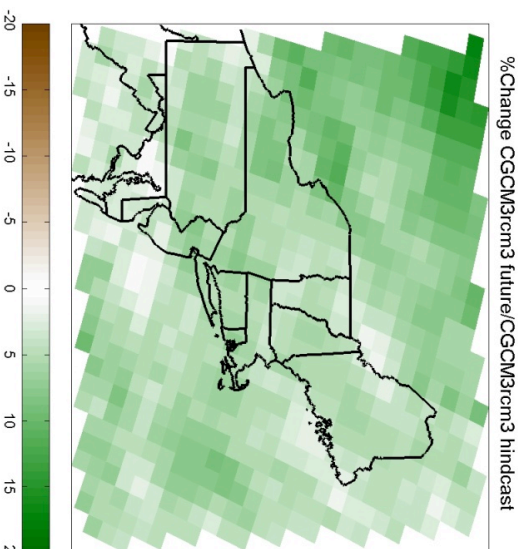
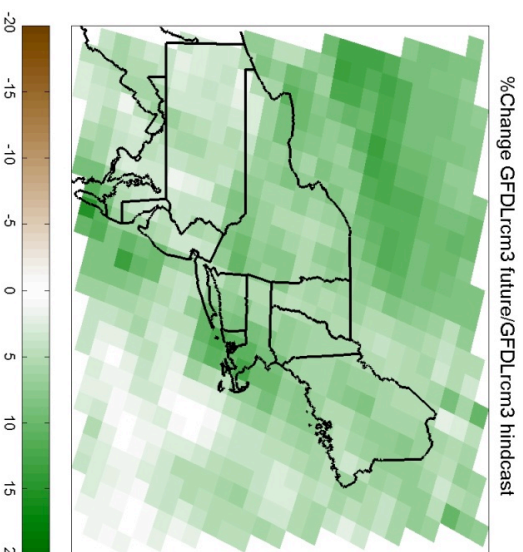
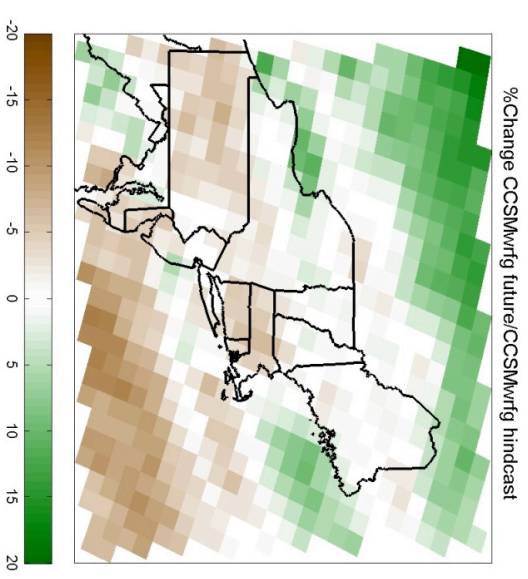
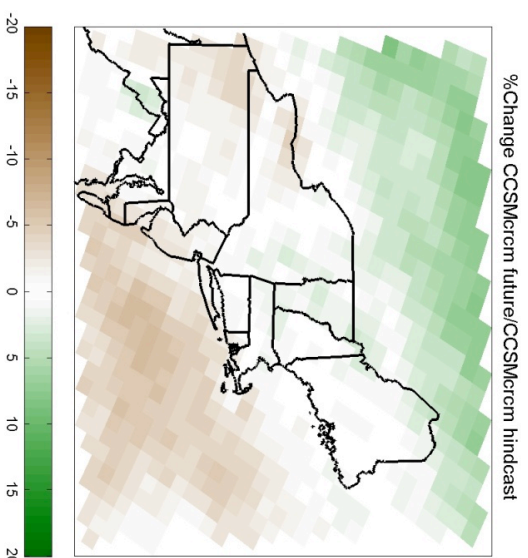
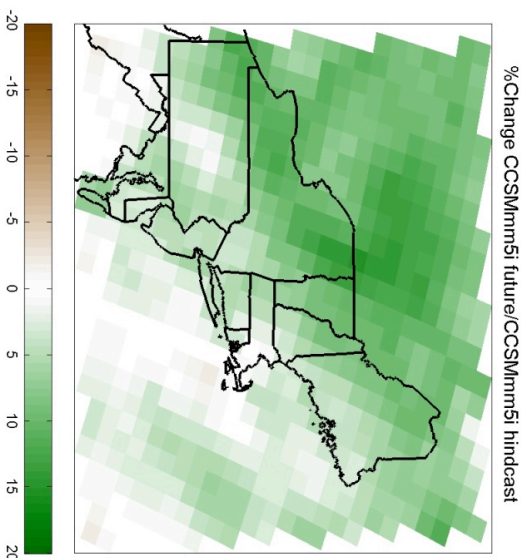


CGCM3-crcm -- Annual dt (F)



SRES A2 2050s minus 1980s annual temperature (°F)

# Projections--Mean Annual Changes



SRES A2 2050s divided by 1980s annual precipitation (%)

# Projections--Mean Changes

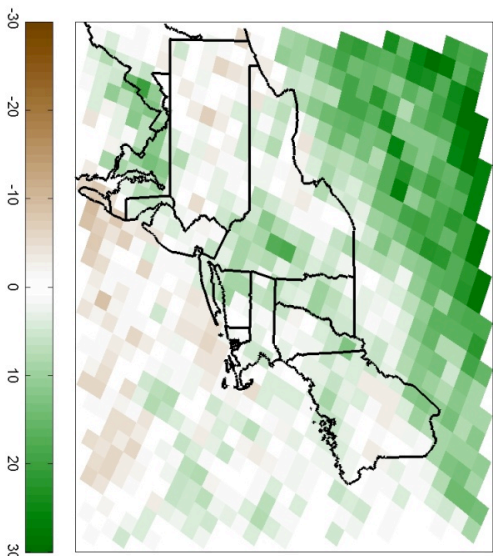
NYC Gridbox (# of simulations)	Mean Annual Temperature Change (°F)	Mean Annual Precipitation Change (%)
GCM (16)	2.5 to 6.1 (4.1)	-9 to 10 (5)
BCSD (16)	2.9 to 5.7 (4.2)	-6 to 23 (5)
NARCCAP (4)	4.3 to 5.9 (4.6)	0 to 14 (5)

SRES A2-driven 2050s divided by 1980s GCM hindcast-driven

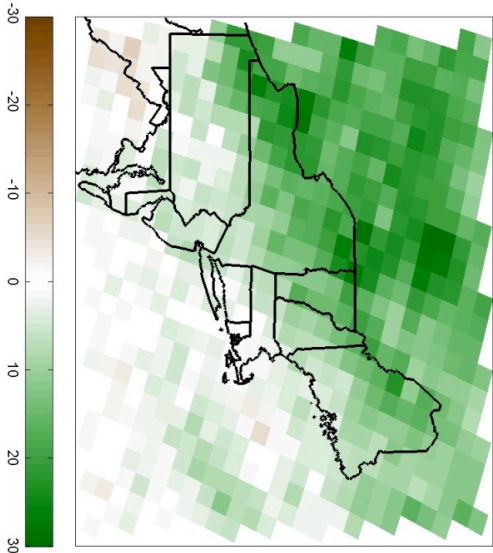


# Projections--% Change in # days with >.5 in prcp

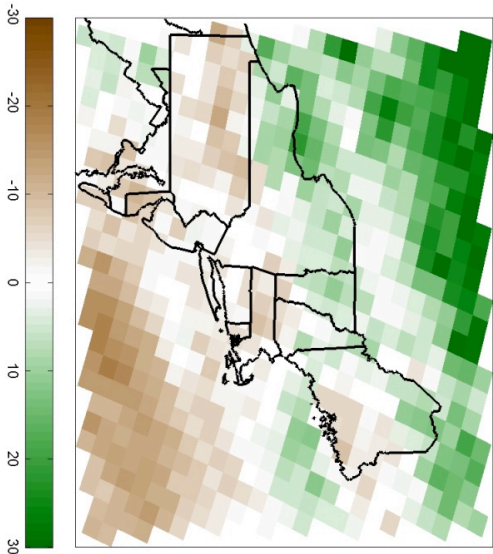
%Change CCSMrcm3-NCEPrcm3 (>0.5")



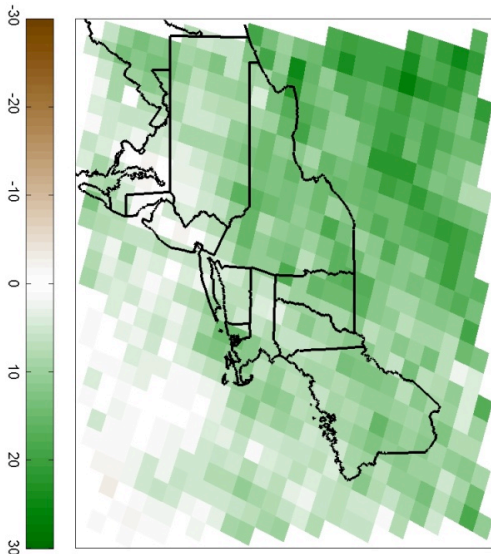
%Change CCSMmr5i-NCEPmr5i (>0.5")



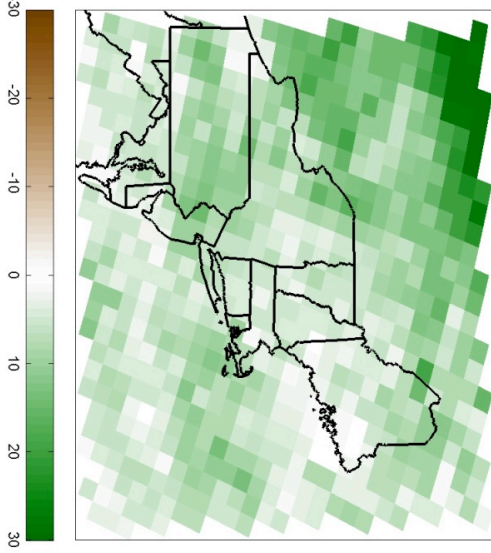
%Change CCSMwrfg-NCEPwrfg (>0.5")



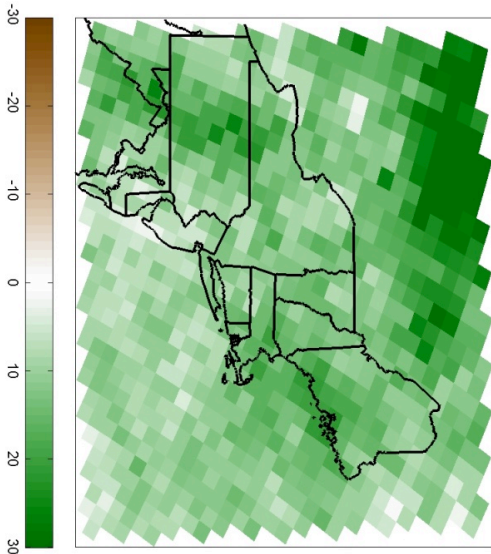
%Change GFDLrcm3-NCEPrcm3 (>0.5")



%Change CGCM3rcm3-NCEPrcm3 (>0.5")



%Change CGCM3rcrm-NCEPrcrm (>0.5")



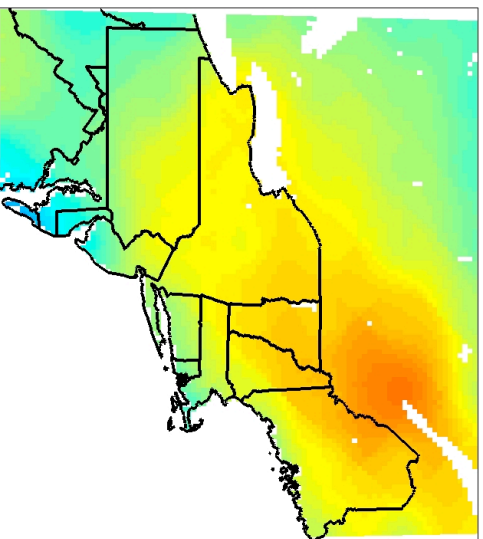
SRES A2-driven 2050s divided by 1980s GCM hindcast-driven

# Projections--Extreme Temperatures

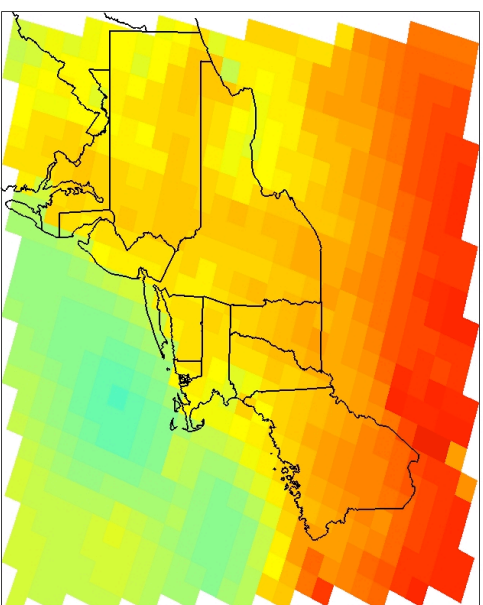
New York City	Number of days per year over 90 °F	Number of days per year at or below 32 °F
GCM (Delta Method)	14: 28 to 58	72: 31 to 53
BCSD (Hybrid Technique)	14: 24 to 51	72: 45 to 64
NARCCAP (Actual Values)	0 to 3:0 to15	52 to 88:28 to 65

# Projections--Interannual Variability

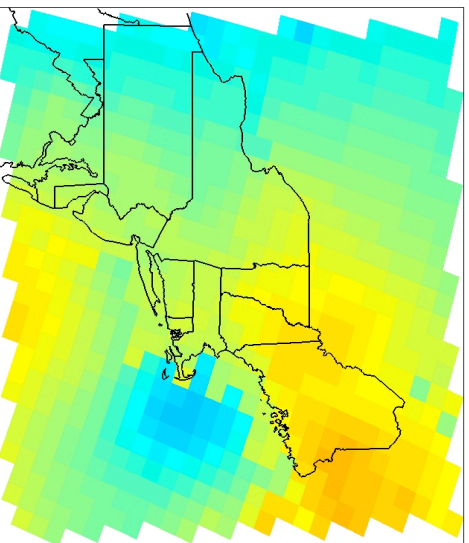
BCSD



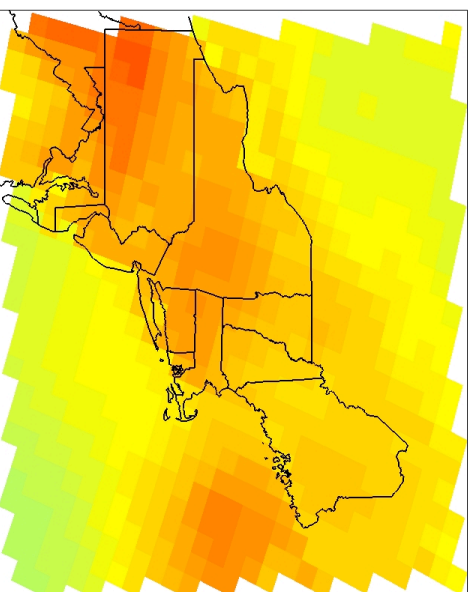
HADCM3-hm3 -- Annual StdT (F) 2050s-1980s



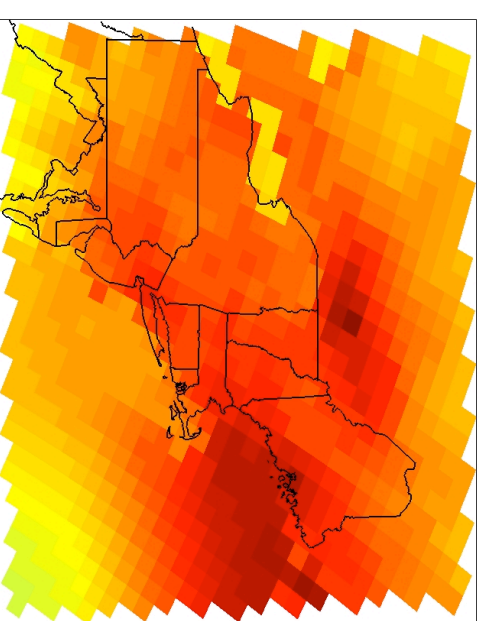
GFDL-rcm3 -- Annual StdT (F) 2050s-1980s



CGCM3-rcm3 -- Annual StdT (F) 2050s-1980s



CGCM3-drcm -- Annual StdT (F) 2050s-1980s

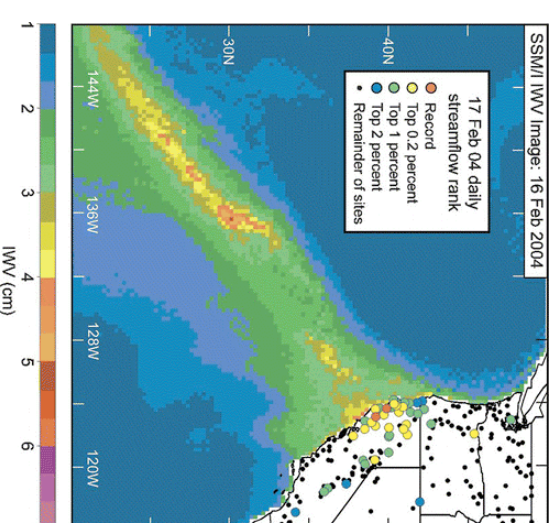


SRES A2 2050s divided by 1980s, standard deviation of annual temperature (°F)

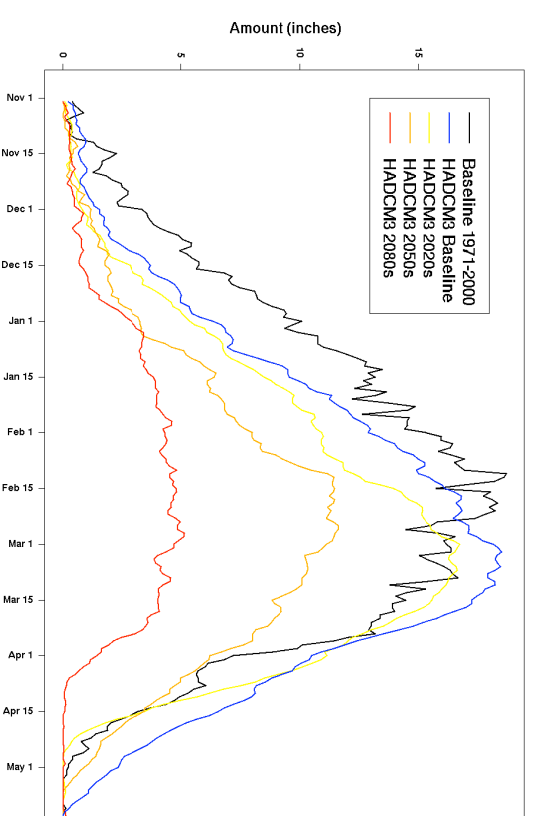


# Conclusions and Future Work

- **Conclusions**
  - The range of results associated with downscaling technique is often smaller than other sources of uncertainty that influence decisions, such as:
    - Global climate sensitivity
    - Emergent patterns not captured by global climate models
    - Interannual to decadal variability
    - Climate impacts
    - Socio-economic changes
- **Next Steps**
  - Analyze pre-conditions for extreme precipitation events in GCMs and RCMs
  - Explore standardized statistically downscaled daily products (CMIP3 and CMIP5) such as BCSO, Bias Corrected Constructed Analogues (BCCA; Maurer and Hidalgo, 2008)
  - Develop localized downscaling tailored to sector-specific stakeholder needs
  - Statistical Downscaling Model (e.g., SDSM; Wilby et al. 2002)
  - Stochastic approaches, weather generators

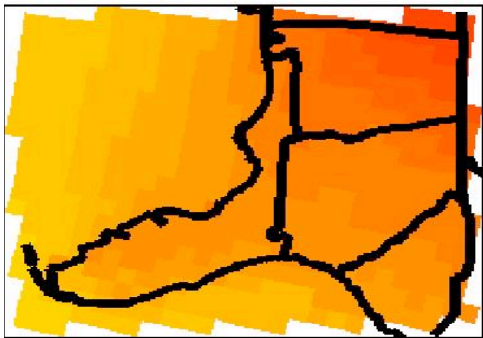


Neiman et al. 2008, *Jour. of Hydromet.*

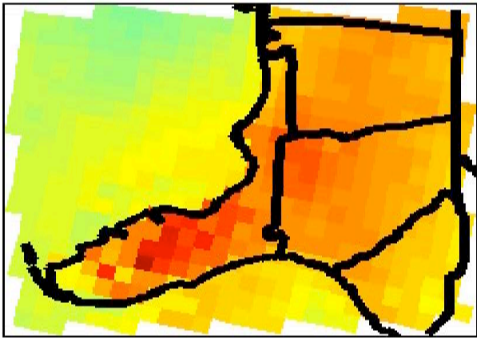


Snow depth at Wanakena, NY based on SDSM downscaling. (Tryhorn and Degaetano in NYState CliMAID Report, to be released in 2011)

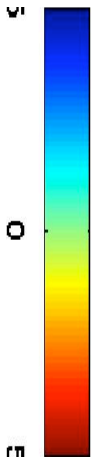
**GFDL/RCM3 Growing Season Changes, A2 2050s relative to 1980s**



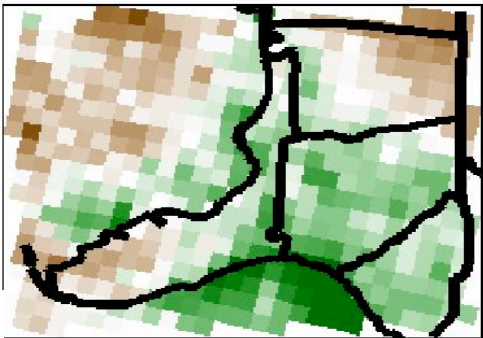
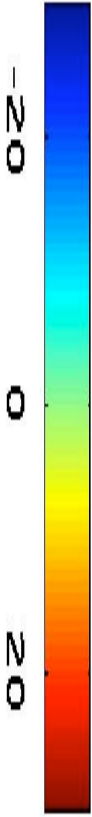
Mean T  
Change (C°)



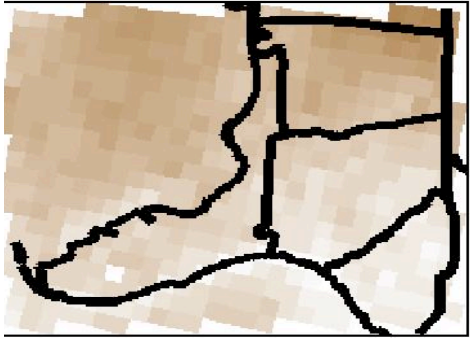
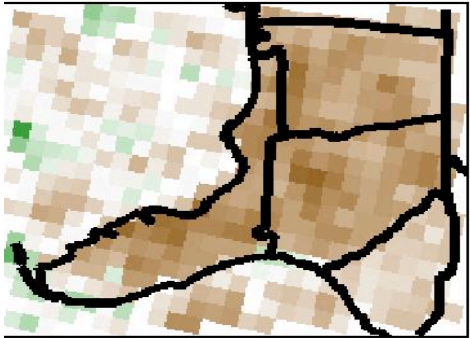
% Change in  
SD of Daily  
Temperature



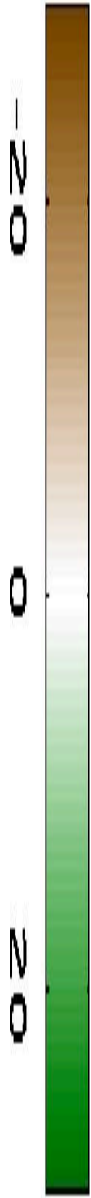
Mean P Change (%)



% Change in  
Alpha  
parameter of  
Daily P



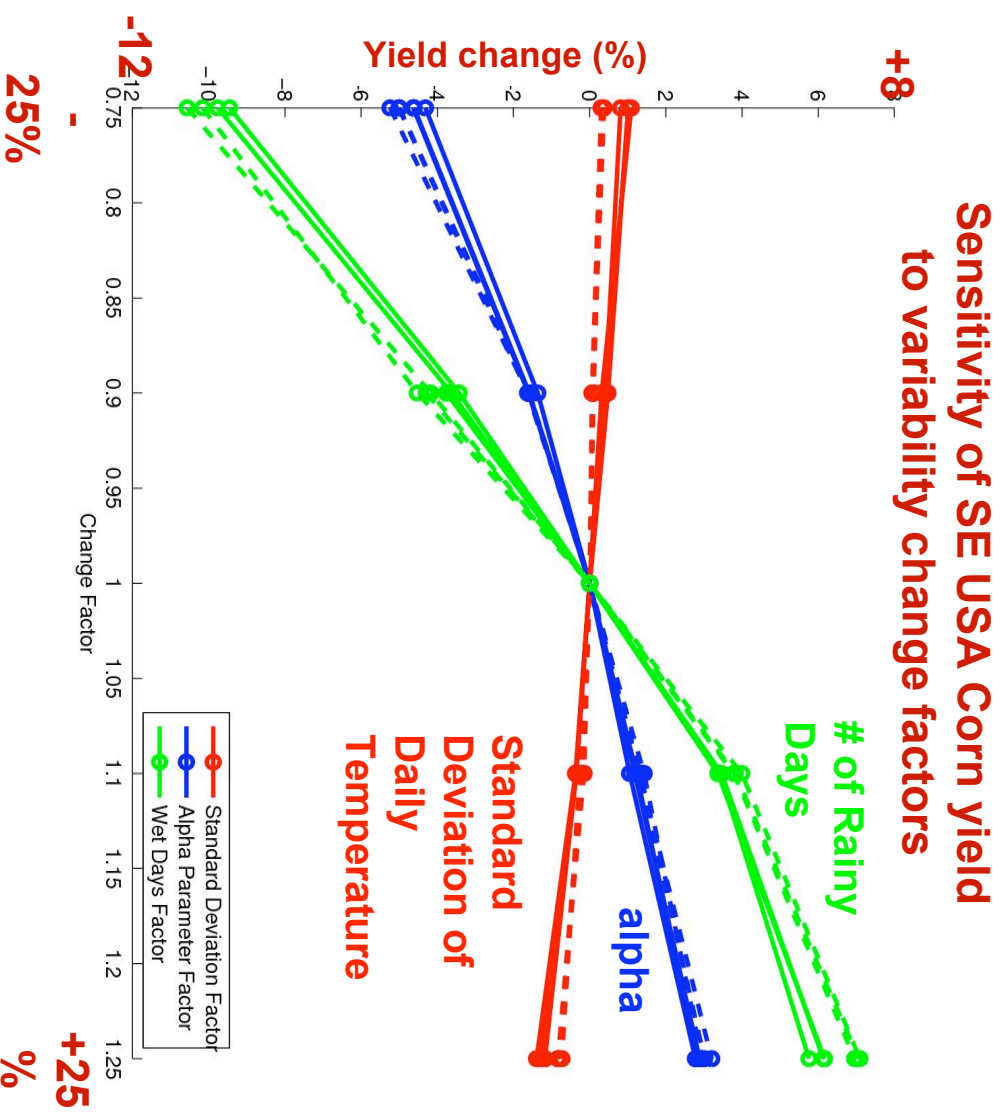
% Change  
in number  
of rainy  
days



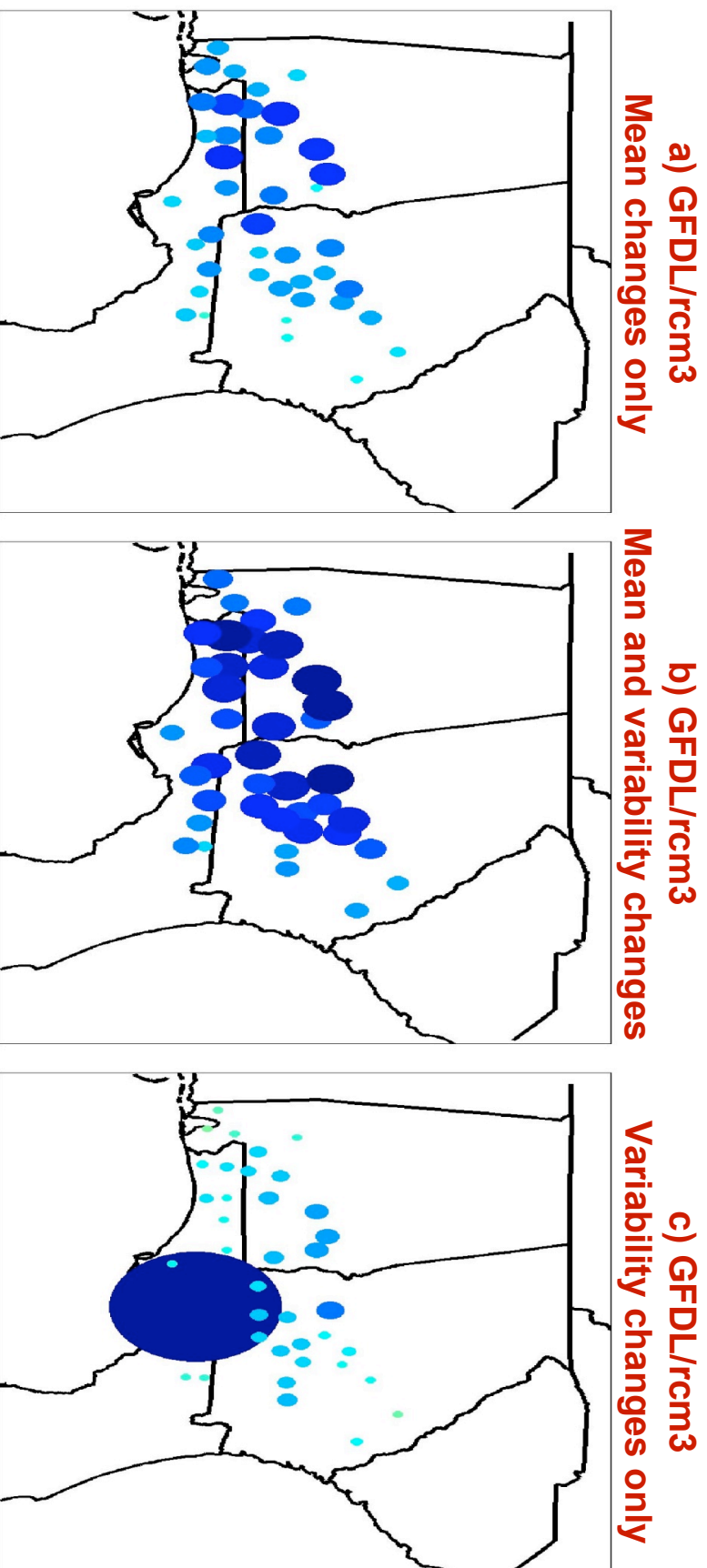


# Corn Sensitivity to Climate Variability Changes

- Use stretched distribution approach to impose particular statistical qualities on observed series
- Solid lines include interactions between changes in mean and variability
- Note that as alpha parameter decreases, rainfall is more extreme



# Role of NARCCAP Mean and Variability Changes



**Impact of variability changes is comparable in magnitude to that of mean changes**

- Non-linear, particularly with respect to CO<sub>2</sub> effects during drought

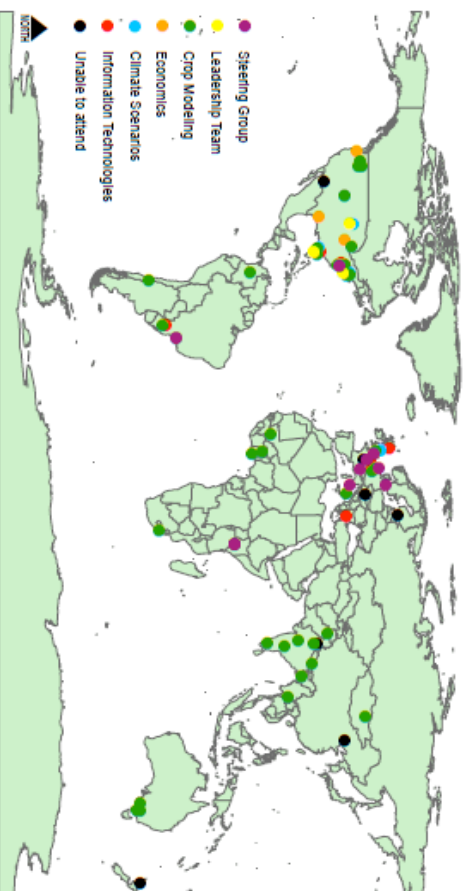
# The Agricultural Model Intercomparison and Improvement Project

*Cynthia Rosenzweig, NASA Goddard Institute for Space Studies*

*Jim Jones, University of Florida*

*Jerry Hatfield, USDA Agricultural Research Service*

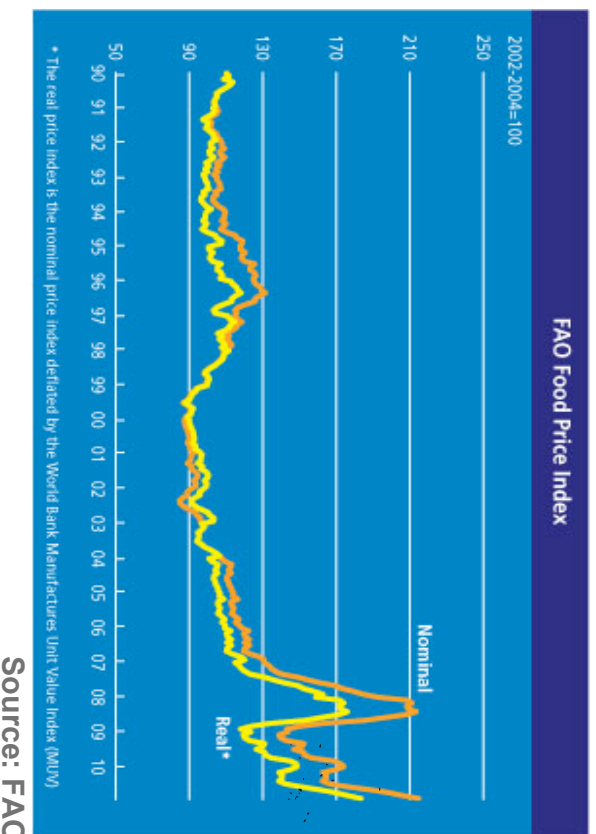
*Alex Ruane, NASA Goddard Institute for Space Studies*



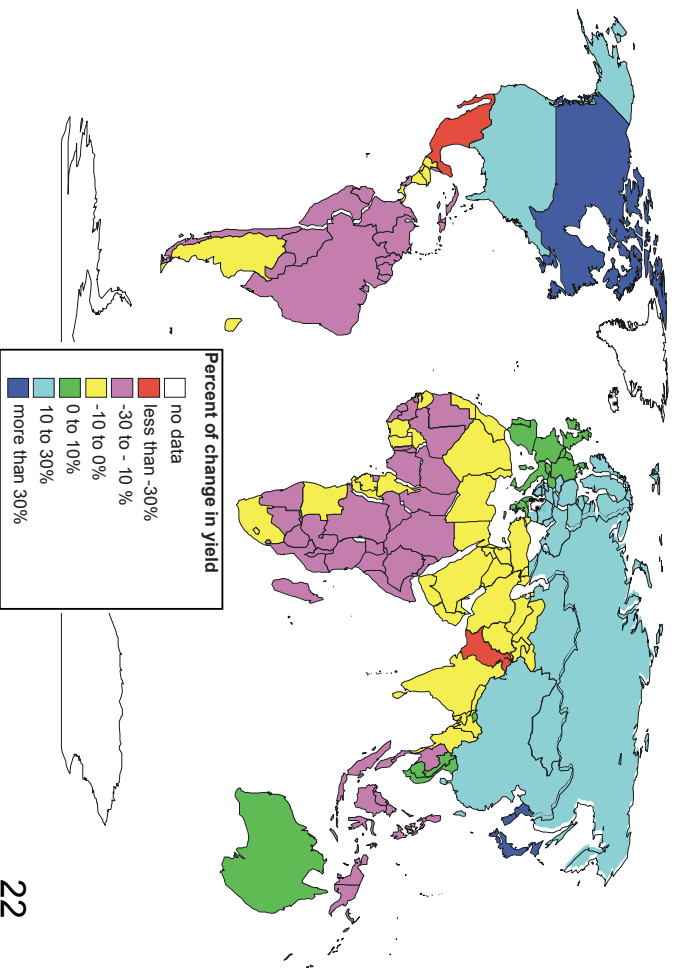
(<http://www.agmip.org>)  
*Thanks to DFID, USDA and CCAFS for funding*

# Why AgMIP?

- **Food security and climate change**
  - How will climate affect agriculture in developing regions?
  - Many studies assume declining food prices
  - Recent food crises and extreme events question this assumption
- **Capacity building**
  - Developing country agricultural regions and crops still understudied
  - Local researcher capacity needed to lead future assessments and adaptive planning



Source: FAO



Based upon Rosenzweig and Parry, 1994

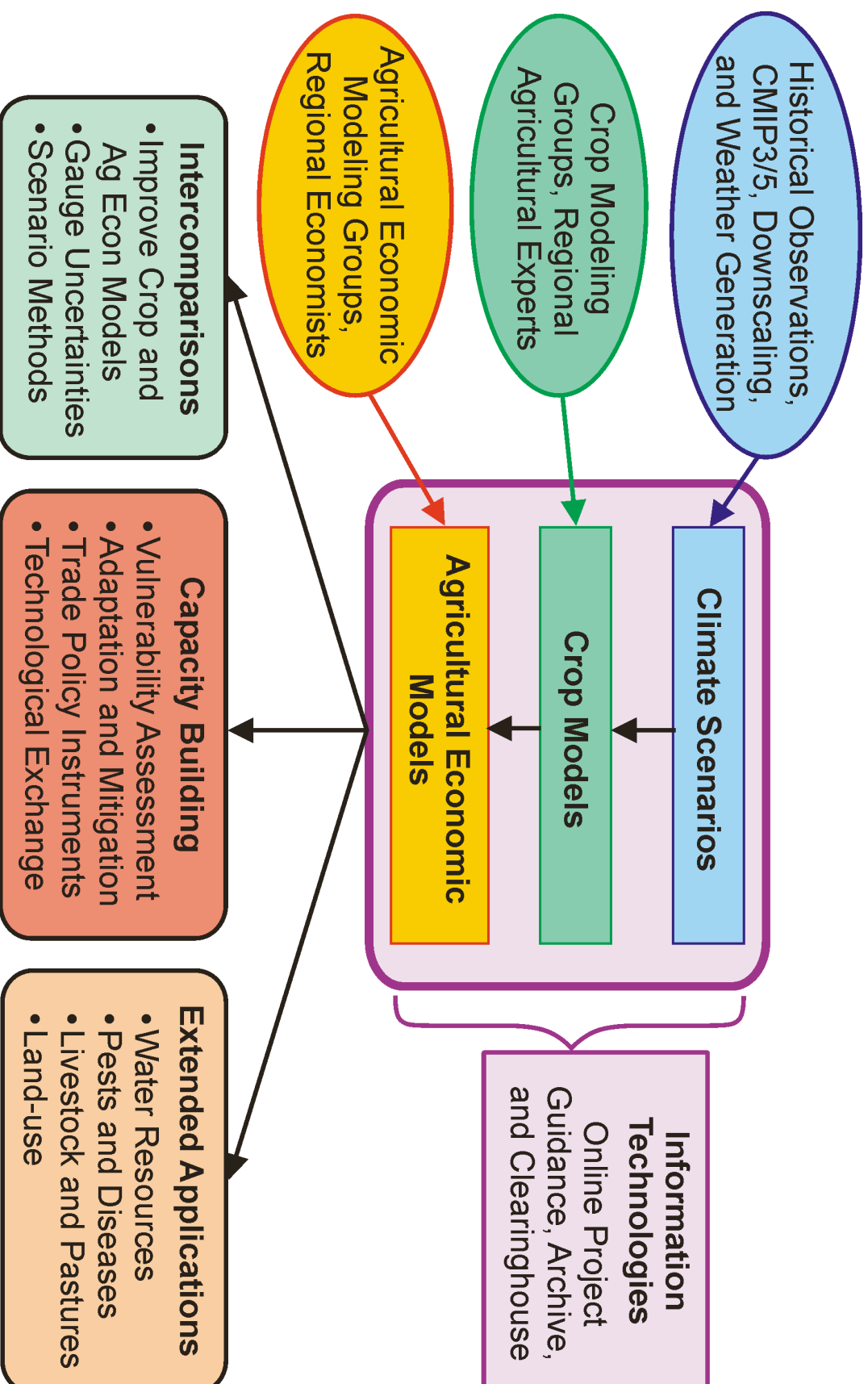


# AgMIP Objectives

- Improve scientific and adaptive capacity of major agricultural regions in developing and developed world
- Collaborate with regional experts in agronomy, economics, and climate to build strong basis for applied simulations addressing key regional questions
- Develop framework to identify and prioritize regional adaptation strategies
- Incorporate crop and agricultural trade model improvements in coordinated assessment of future climate conditions
- Include multiple models, scenarios, locations, crops and participants
- Understand roles of land use and mitigation
- Link to key on-going efforts
  - CGIAR/ESSP, CCAFS, Global Futures, MOSAICC, others
  - IPCC AR5



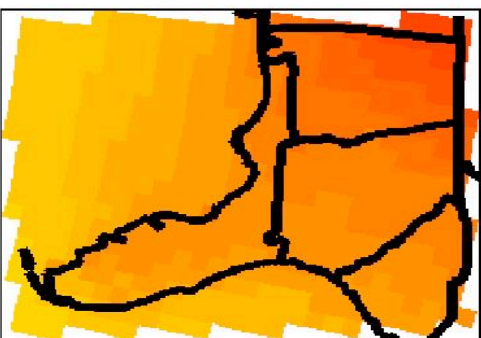
# AgMIP Elements and Linkages



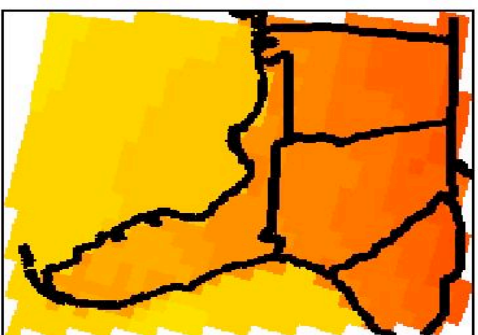


# NARCCAP mean growing season changes

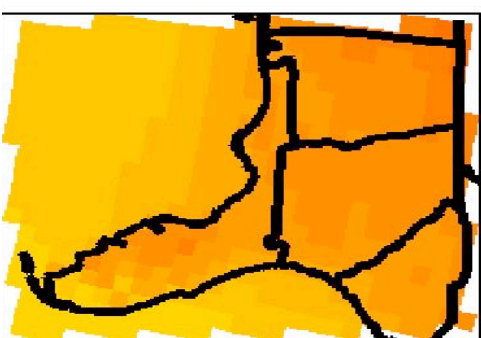
T (°C)



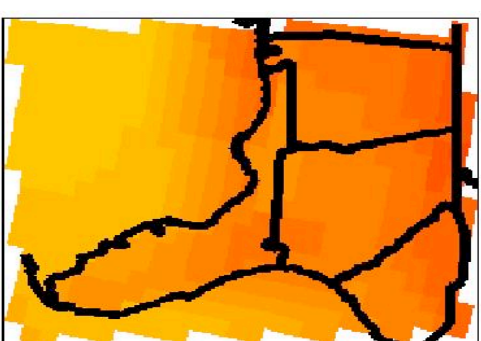
GFDL/rcm3



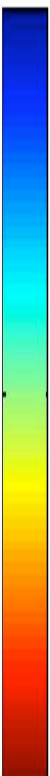
CGCM3/crcm



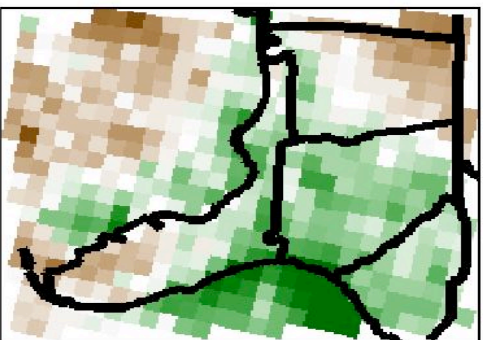
CGCM3/rcm3



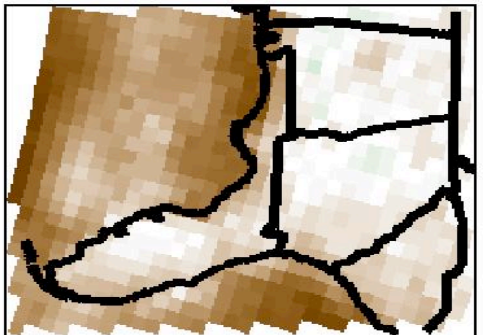
HadCM3/hrm3



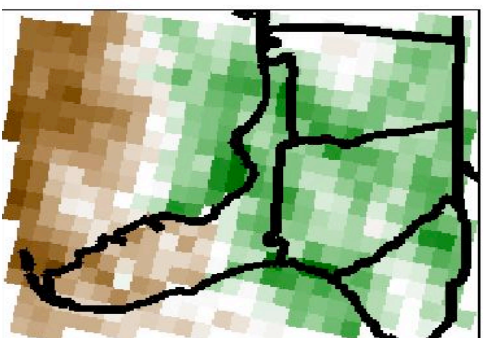
P (%)



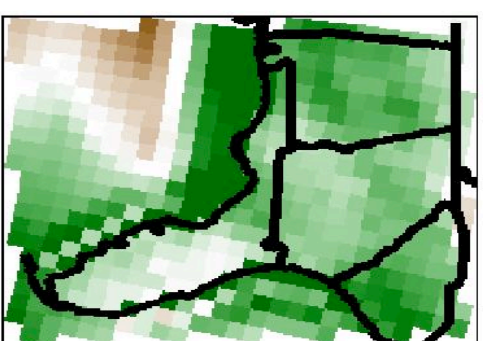
GFDL/rcm3



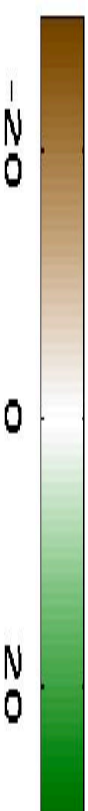
CGCM3/crcm



CGCM3/rcm3



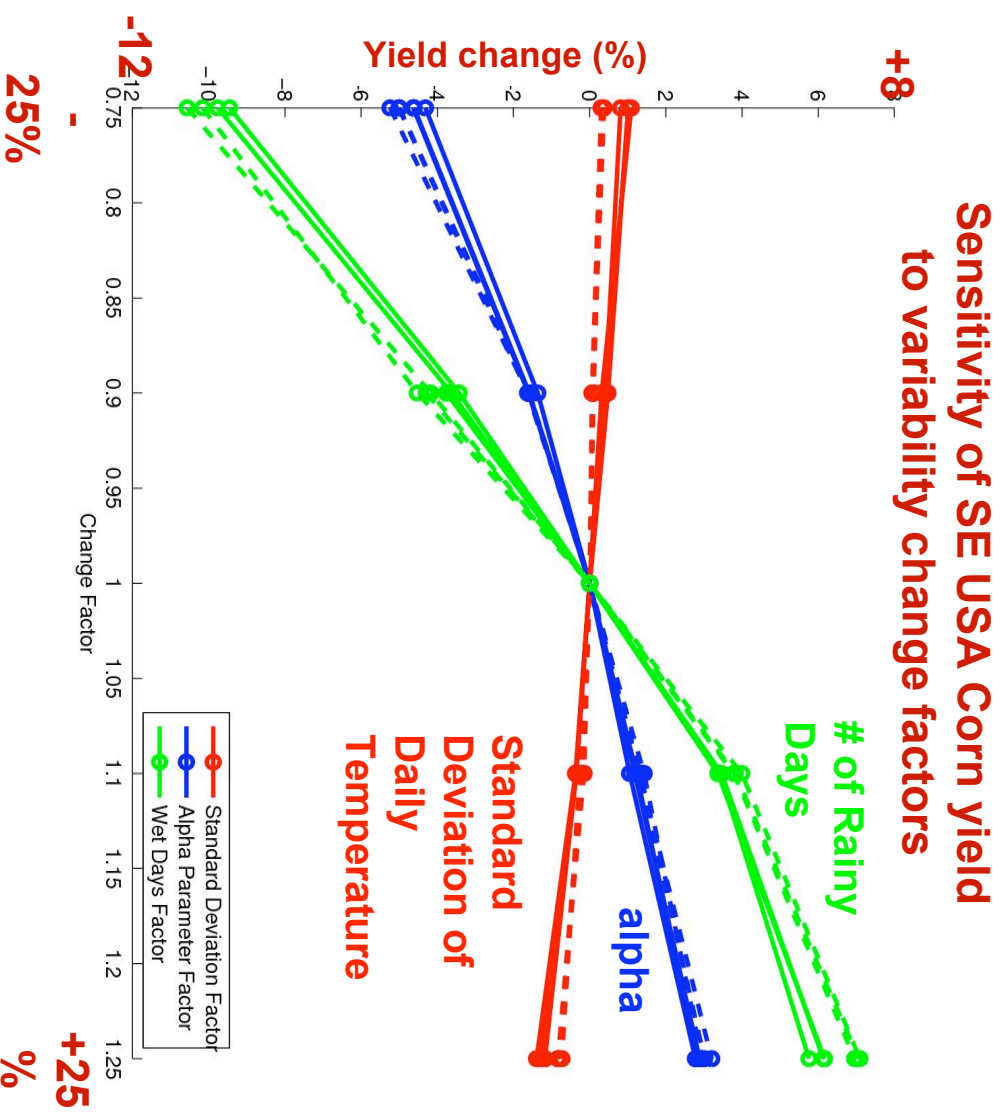
HadCM3/hrm3



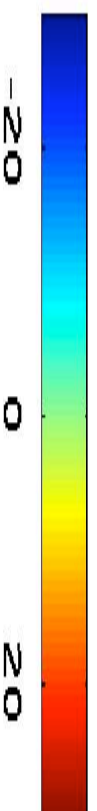
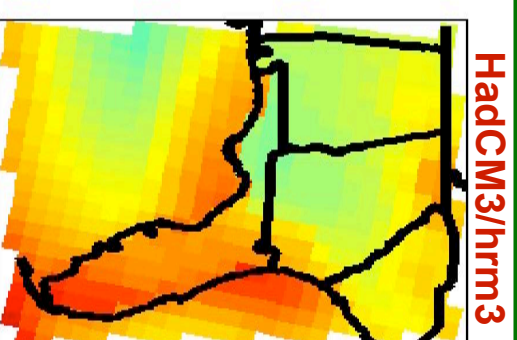
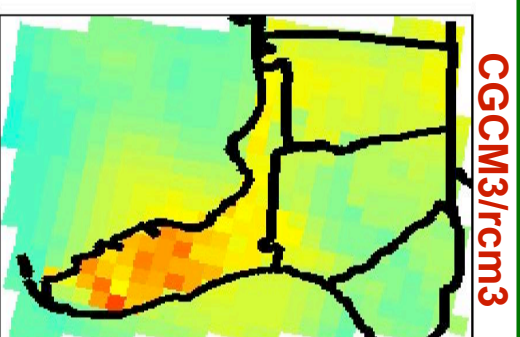
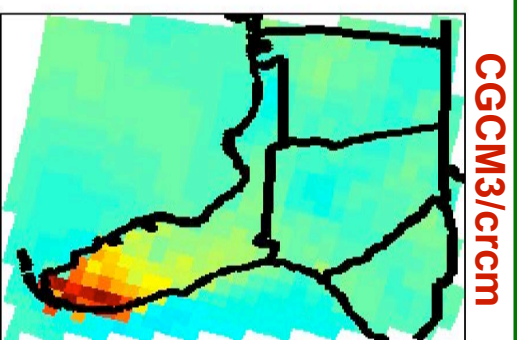
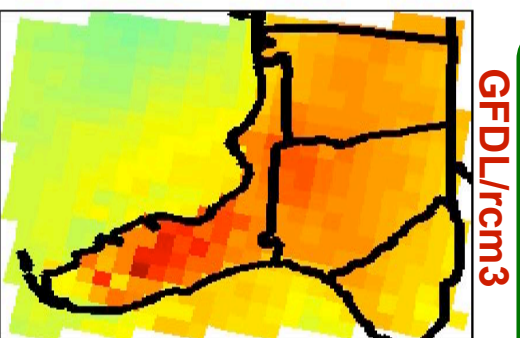


# Corn Sensitivity to Climate Variability Changes

- Use stretched distribution approach to impose particular statistical qualities on observed series
- Solid lines include interactions between changes in mean and variability
- Note that as alpha parameter decreases, rainfall is more extreme.



# NARCCAP % changes in standard deviation of growing season daily temperature



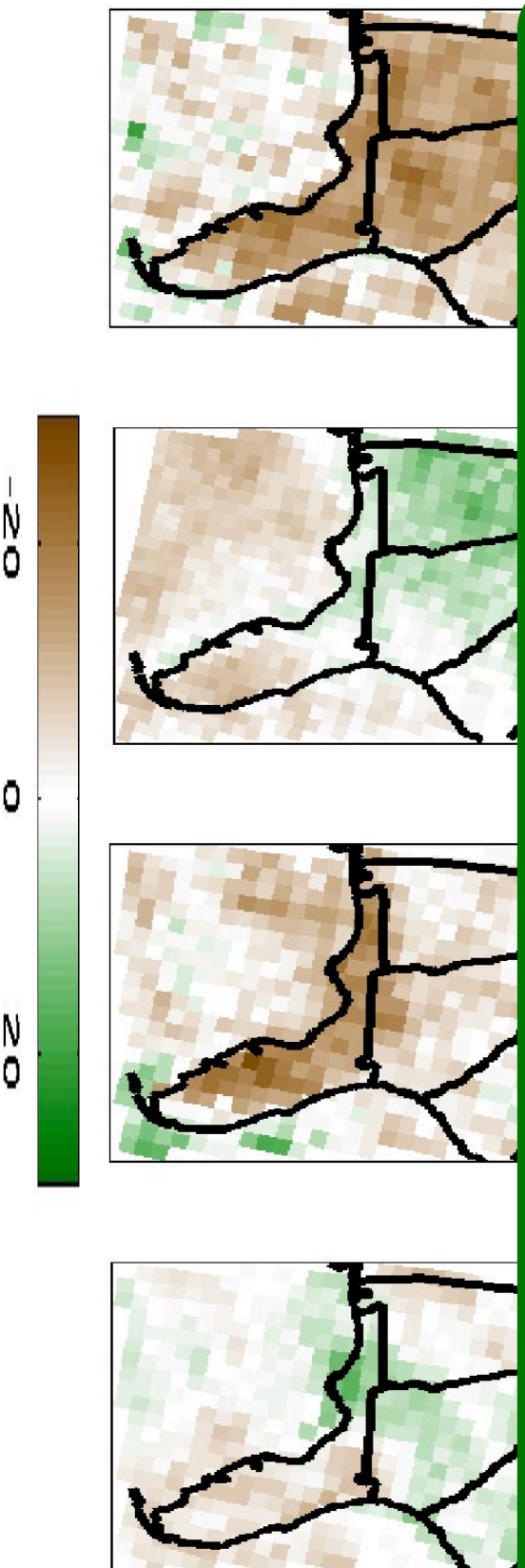
Except for CGCM3/crcm, standard deviation of temperature generally increasing

# NARCCAP % changes in growing season rainfall distribution's alpha parameter (lower = more

GFDL/rcm3

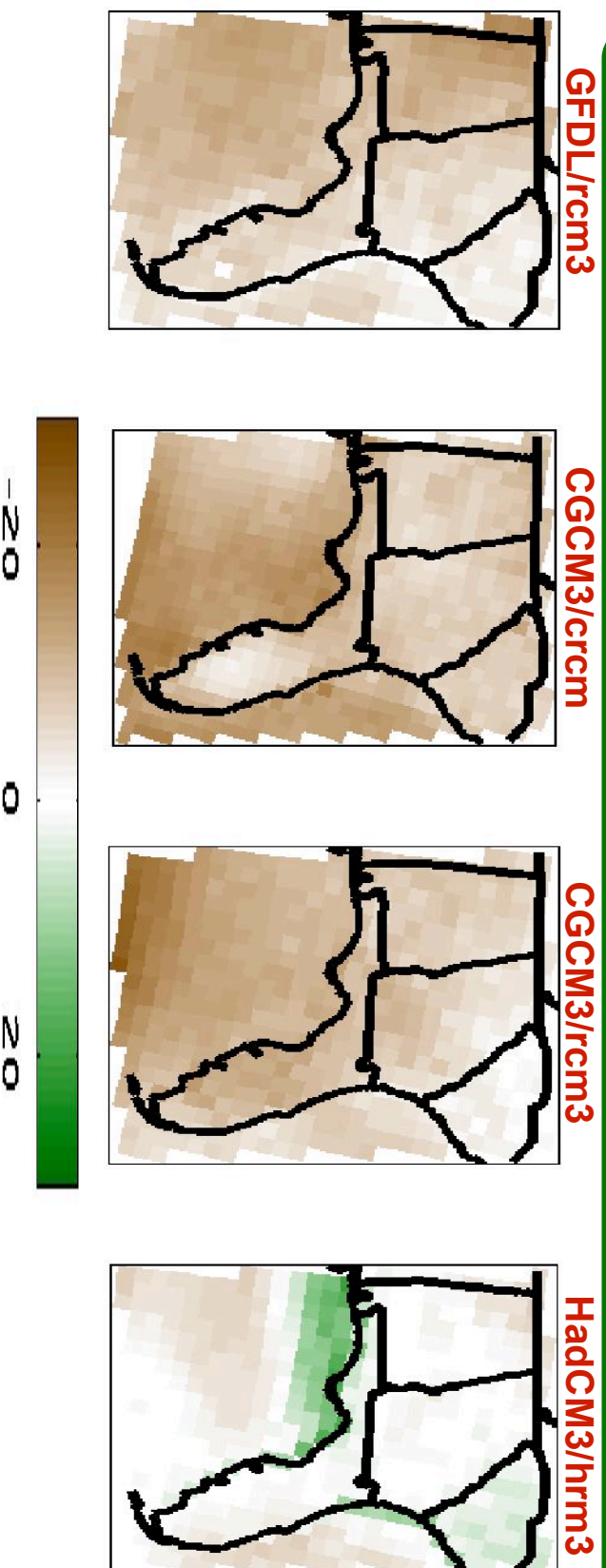
CGCM3/crcm @ extremes CGCM3/rcm3

HadCM3/hrm3



RCM3 simulations producing more extreme distribution of rainfall

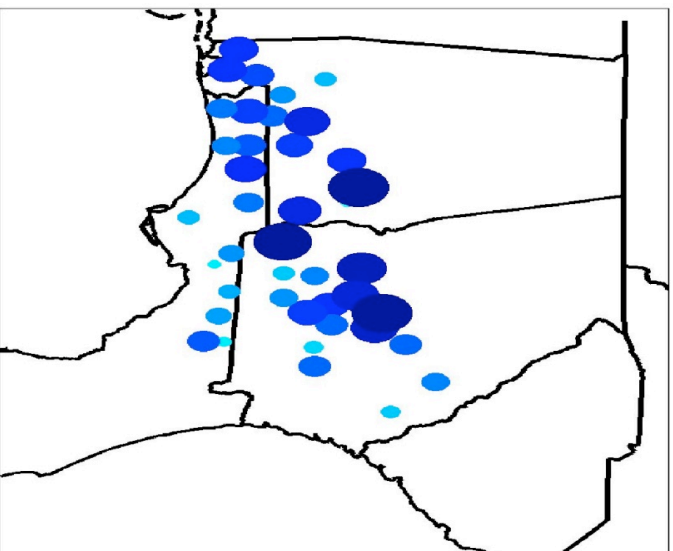
# NARCCAP % changes in number of rainy days in growing season



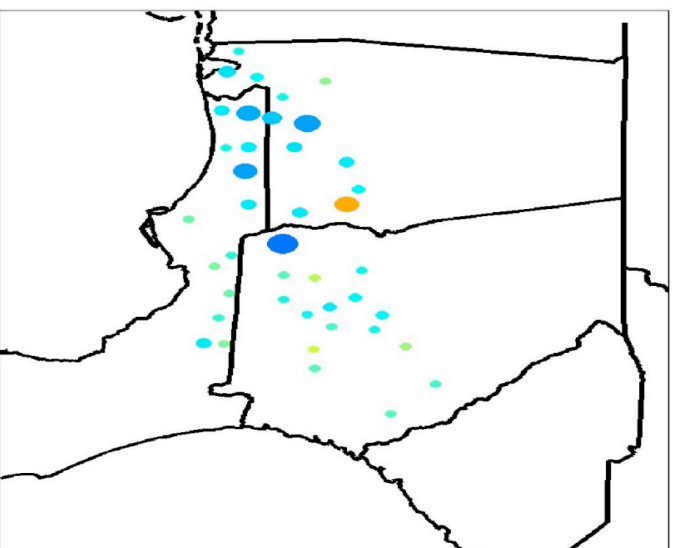
Decrease in number of wet days projected for almost all land areas in all models

# GCM Ensemble Projections

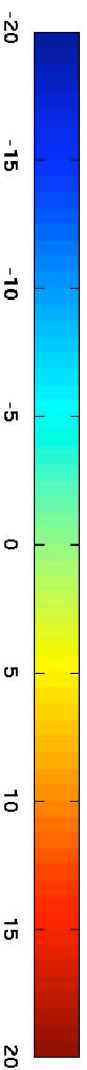
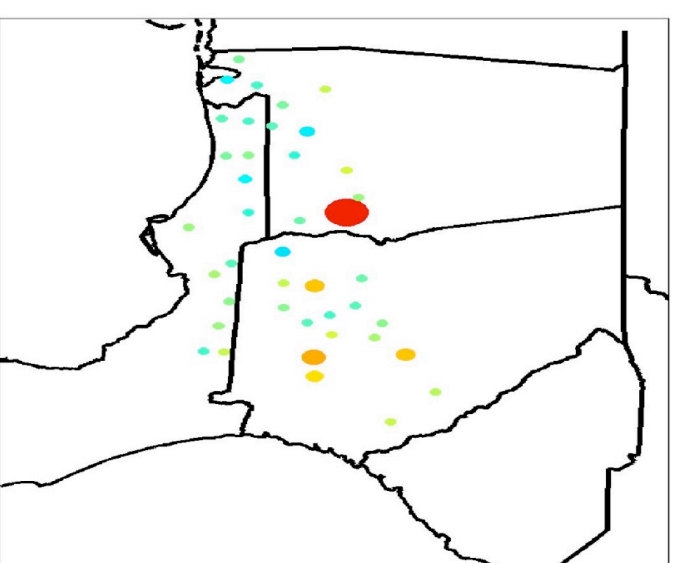
25<sup>th</sup> percentile of %  
change in corn yield



Median % change in  
corn yield (A2 2050s)



75<sup>th</sup> percentile of %  
change in corn yield



**No variability changes**

- Imposes mean changes entirely on intensity of storms, not frequency



# Projections of GCM Ensemble with NARCCAP

25<sup>th</sup> percentile of %

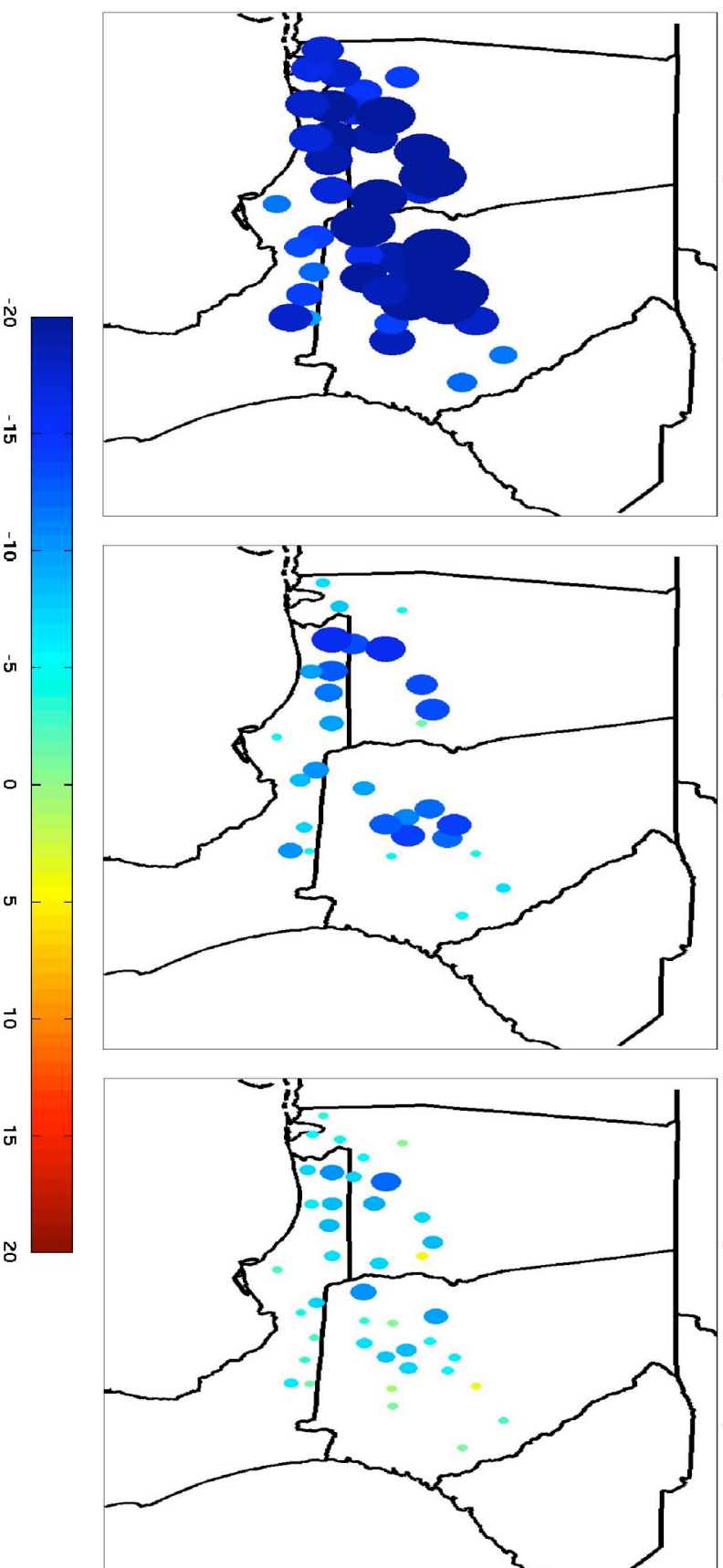
variability  
Median % change in

75<sup>th</sup> percentile of %

change in corn yield

corn yield (A2 2050s)

change in corn yield



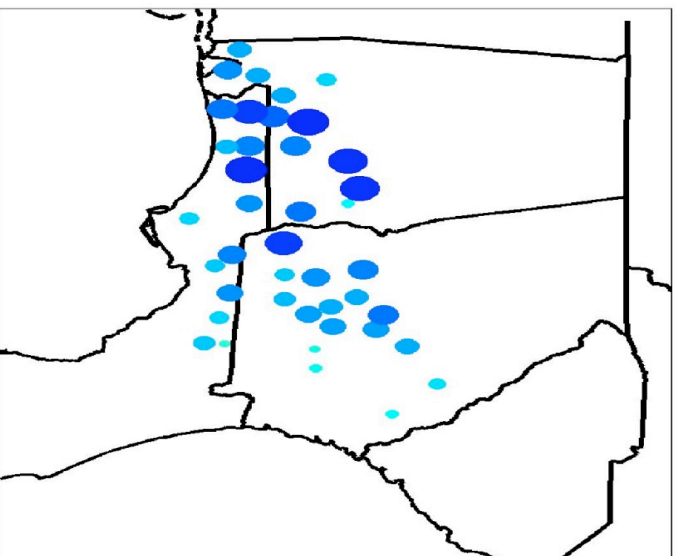
**Results from 16 GCM ensemble, with GCM mean changes and variability changes imposed from 4 NARCCAP runs (64 ensemble members)**

- Including higher-frequency variability from NARCCAP results in a more pessimistic projection of future corn yields across Southeast.

# Role of NARCCAP Mean and Variability

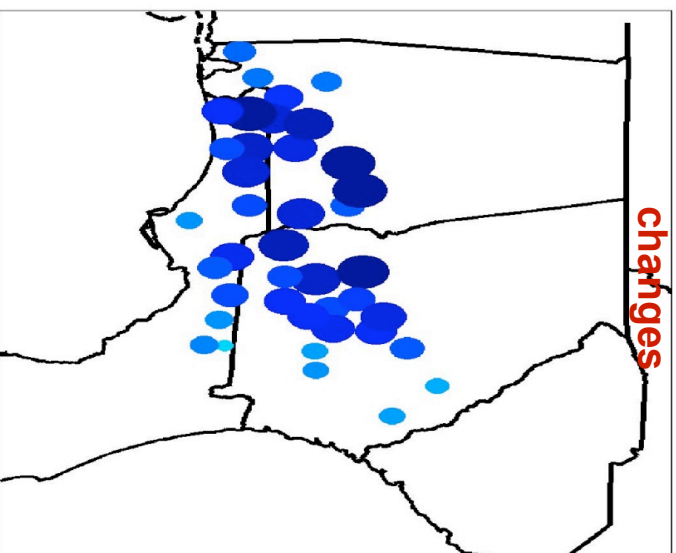
a) GFDL/rcm3

Mean changes only



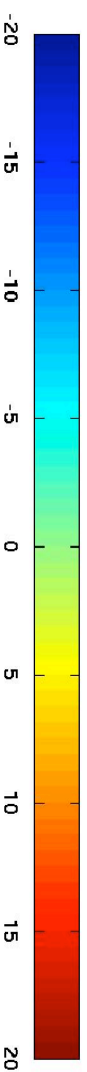
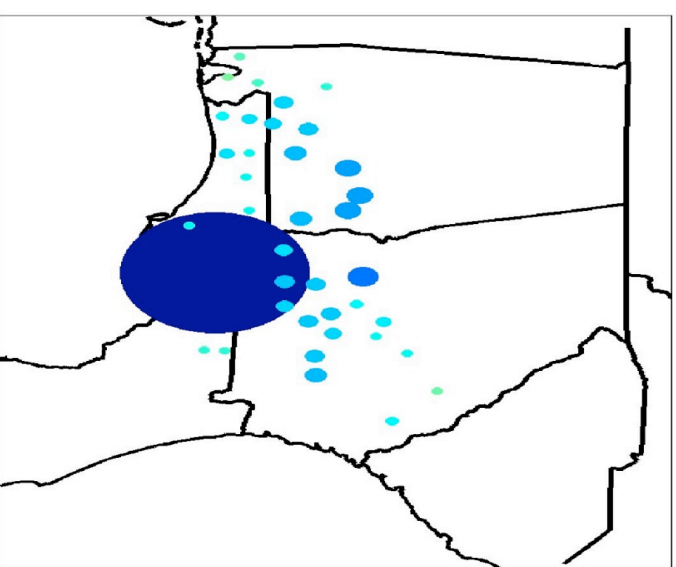
b) GFDL/rcm3

Mean and variability



c) GFDL/rcm3

Variability changes only



Impact of variability changes is comparable in magnitude to that of mean changes

- Non-linear, particularly with respect to CO<sub>2</sub> effects during drought