

# Very high-resolution numerical modeling for climate extremes in Midwest U.S.

**Ashish Sharma<sup>1</sup>, Joe Fernando<sup>1</sup>, Jessica Hellmann<sup>1</sup>,  
Ed Bensman<sup>1</sup>, Alan Hamlet<sup>1</sup> and Rao Kothamarthi<sup>2</sup>**

<sup>1</sup>*University of Notre Dame, Notre Dame, IN*

<sup>2</sup>*Argonne National Laboratory, Chicago, IL*



## Why Midwest US?

- Region is home to roughly 70 million people and thousands of native plant and animal species.
- World's most productive agricultural landscapes
- One of the world's largest freshwater ecosystems and several large urban centers
- Presence of the Great Lakes and its location in the middle of the North American continent contribute to large seasonal swing in air temperature and precipitation, including lake effect snow

### Why very-high resolution?

- Decision-makers and stakeholders require high-resolution climatological data for planning and enhance preparedness against the social and ecological effects of extreme events.
- Does improving model resolution lead to higher fidelity in climate simulations?

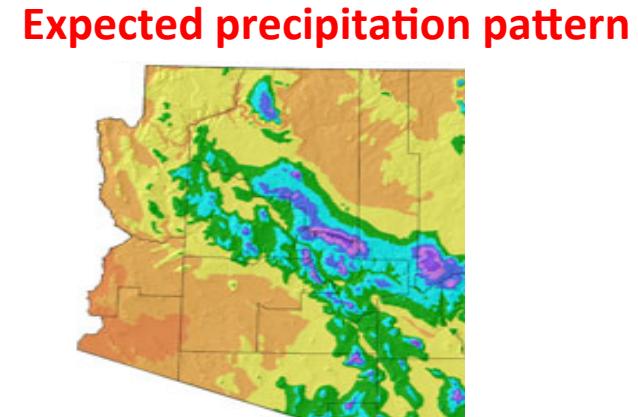
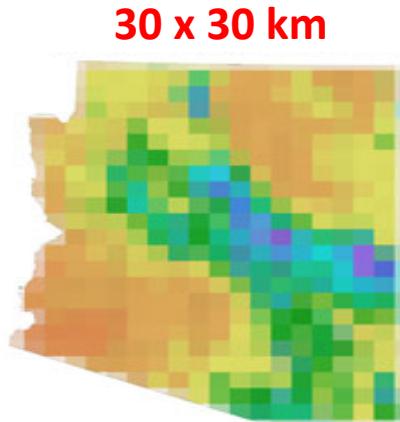
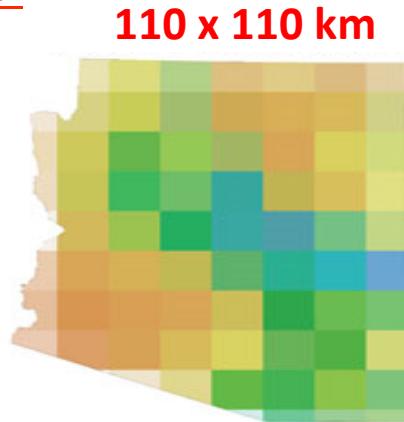
## Why Blue Water?

- Numerical simulations are long-term (1981-2010), decadal, very-high resolution; we go up to 1 km resolution for sensitivity analysis
- For resolving convective storms below 10 km resolution
- Study long-term impacts of different landuse on Midwest climate
- Studying climatic extremes in Midwest region
- Study the influence of soil moisture initialization using High Resolution Land Data Assimilation System (HRLDAS)
- Assess the impact of subgrid scale land cover variability
- Study spatial pattern and seasonality of extreme precipitation and temperature by looking at climate data at multiple resolutions
- WRF code is highly parallelized, computationally intensive and scales well on the Blue Waters architecture
- Requires huge data storage and efficient data handling

# Climate downscaling

A technique to use fine spatial scale regional (mesoscale) model, e.g. WRF to produce detailed regional and atmospheric data with boundary condition constrained by large-scale regional/global climate model output.

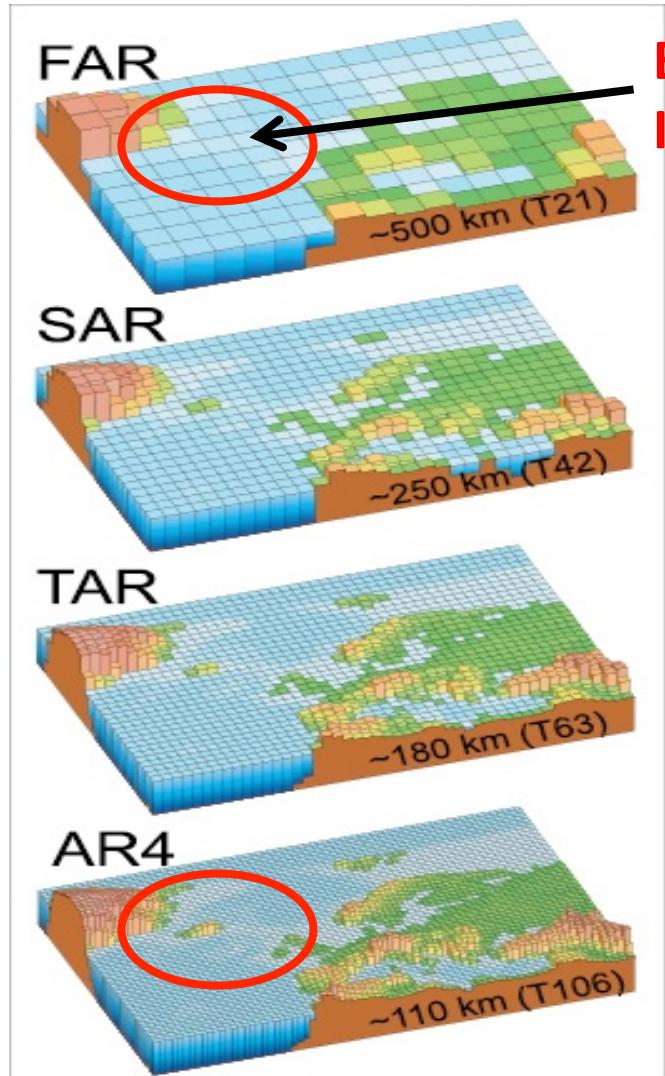
Example:



*Source: PRISM*



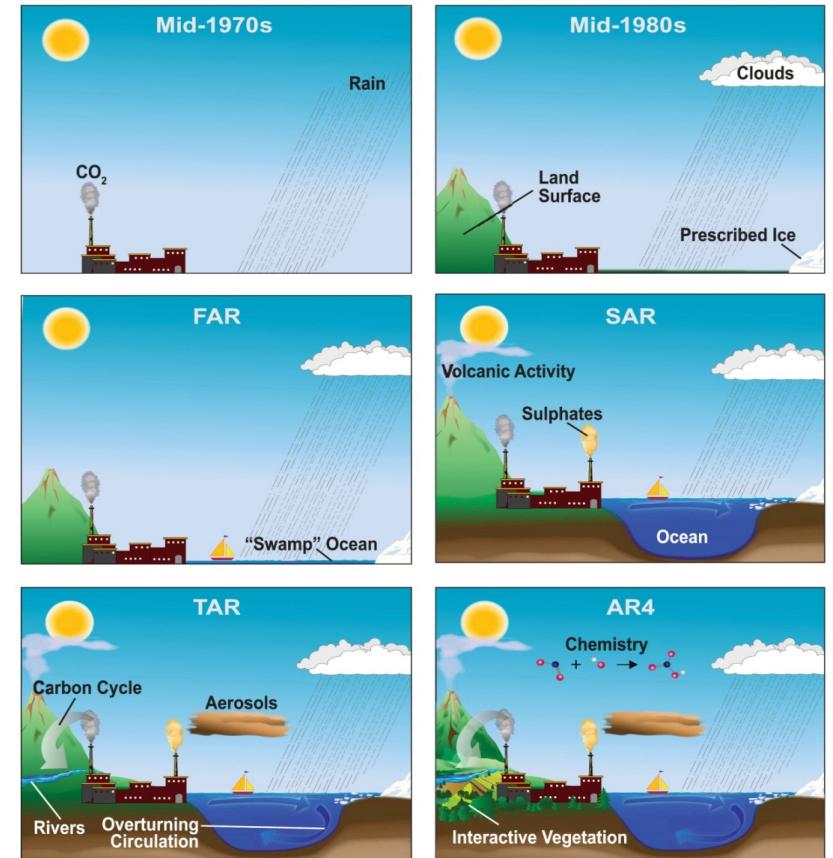
# General Circulation Models (GCMs)



IPCC 2007

England and  
Iceland ???

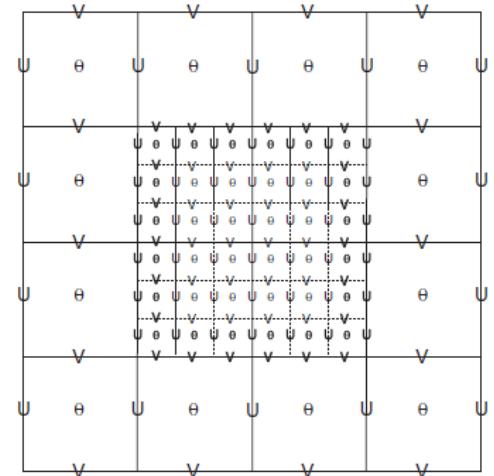
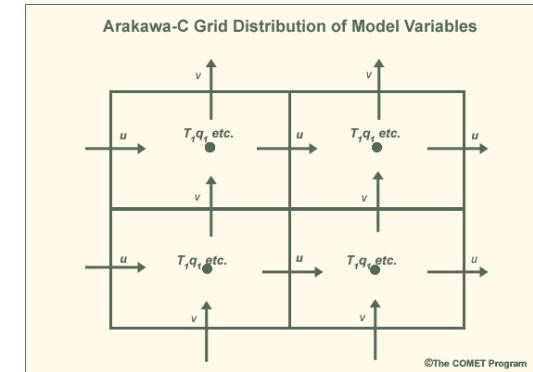
Model complexity in each phase



- Long term projection
- Low resolution model produces bias
- GCM:  $O(500 \text{ km})$  to  $O(100 \text{ km})$

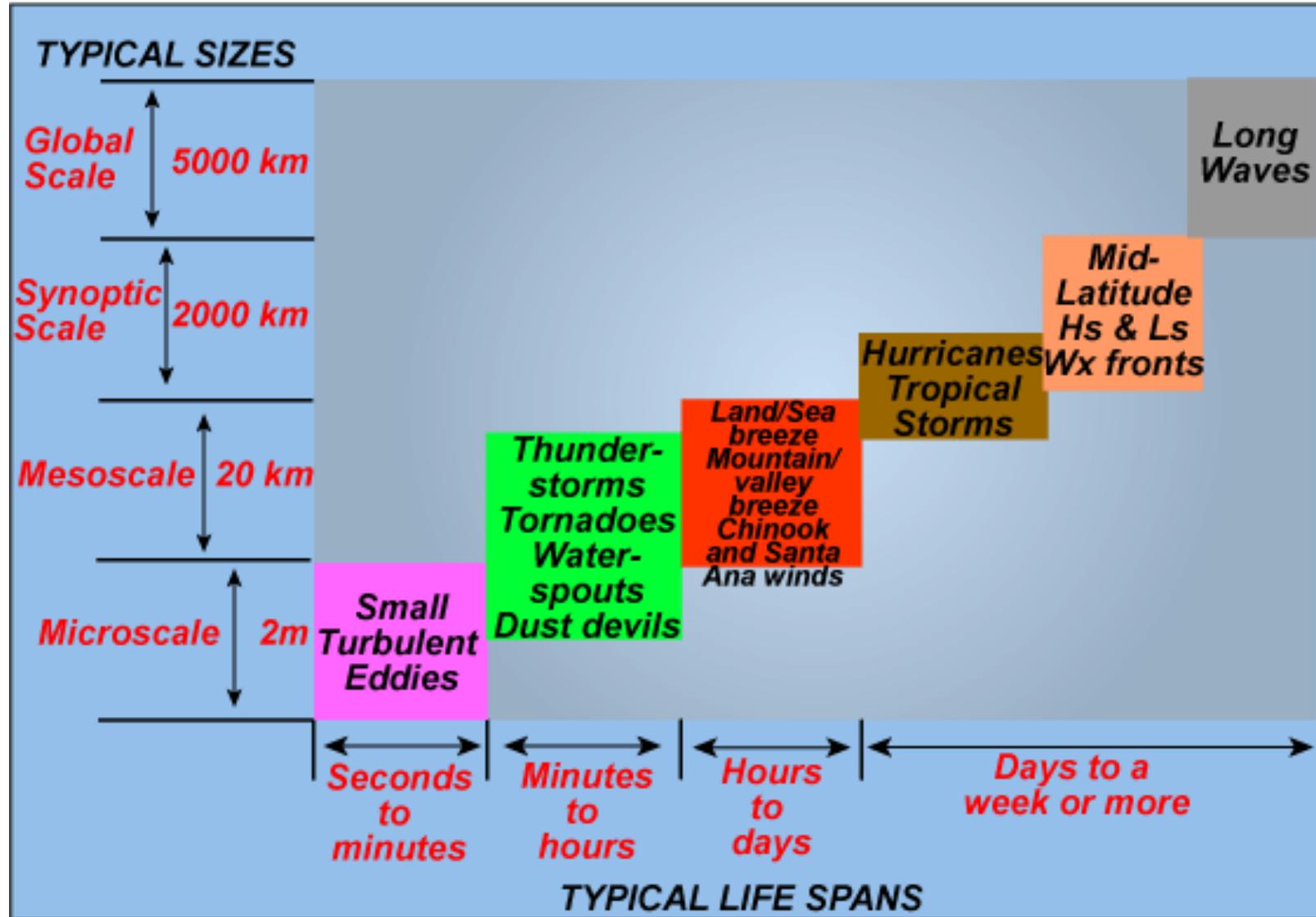
# Weather Research & Forecasting (WRF) Model

- **Equations:** Fully compressible, non-hydrostatic
- **Vertical coordinate:** Terrain-following pressure vertical coordinate
- **Horizontal grid:** Arakawa C-grid
- **Time integration:** Time split integration using 3rd order RK scheme
- **Spatial discretization:** 2<sup>nd</sup>-6<sup>th</sup> order advection options
- **Initial conditions:** 3D for real data
- **Earth rotation:** Full Coriolis term included
- **Prognostic variables:** Velocities  $u$ ,  $v$ ,  $w$ ; potential temperature, geopotential (optional: TKE, water vapor mixing ratio, rain/snow mixing ratios) etc.
- **Mapping to sphere:** Four projections available
  - Polar; Lamber; Mercator; Lat-lon
- **Nesting:** Multiple level and integer ratio



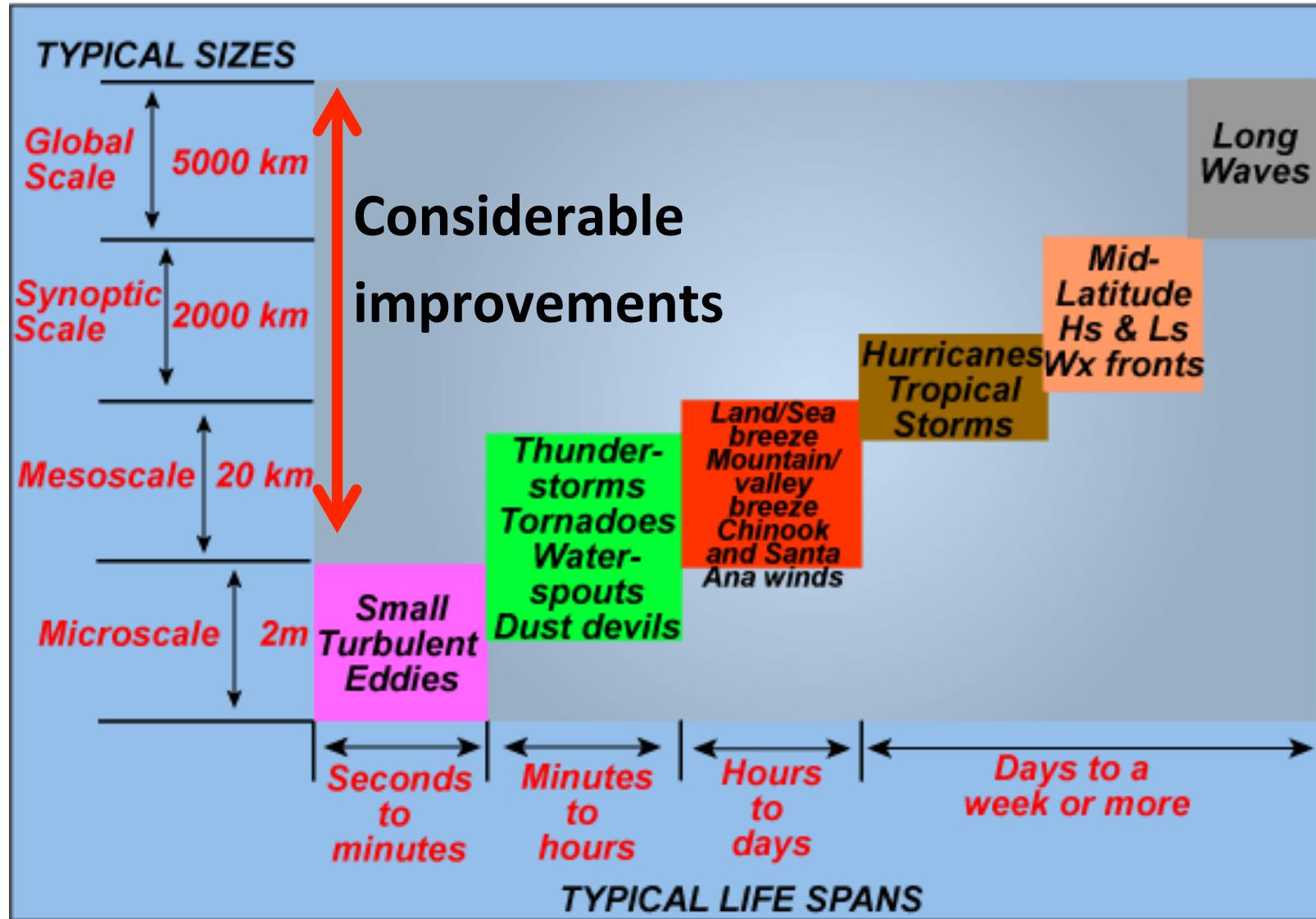


# Scales in Atmosphere

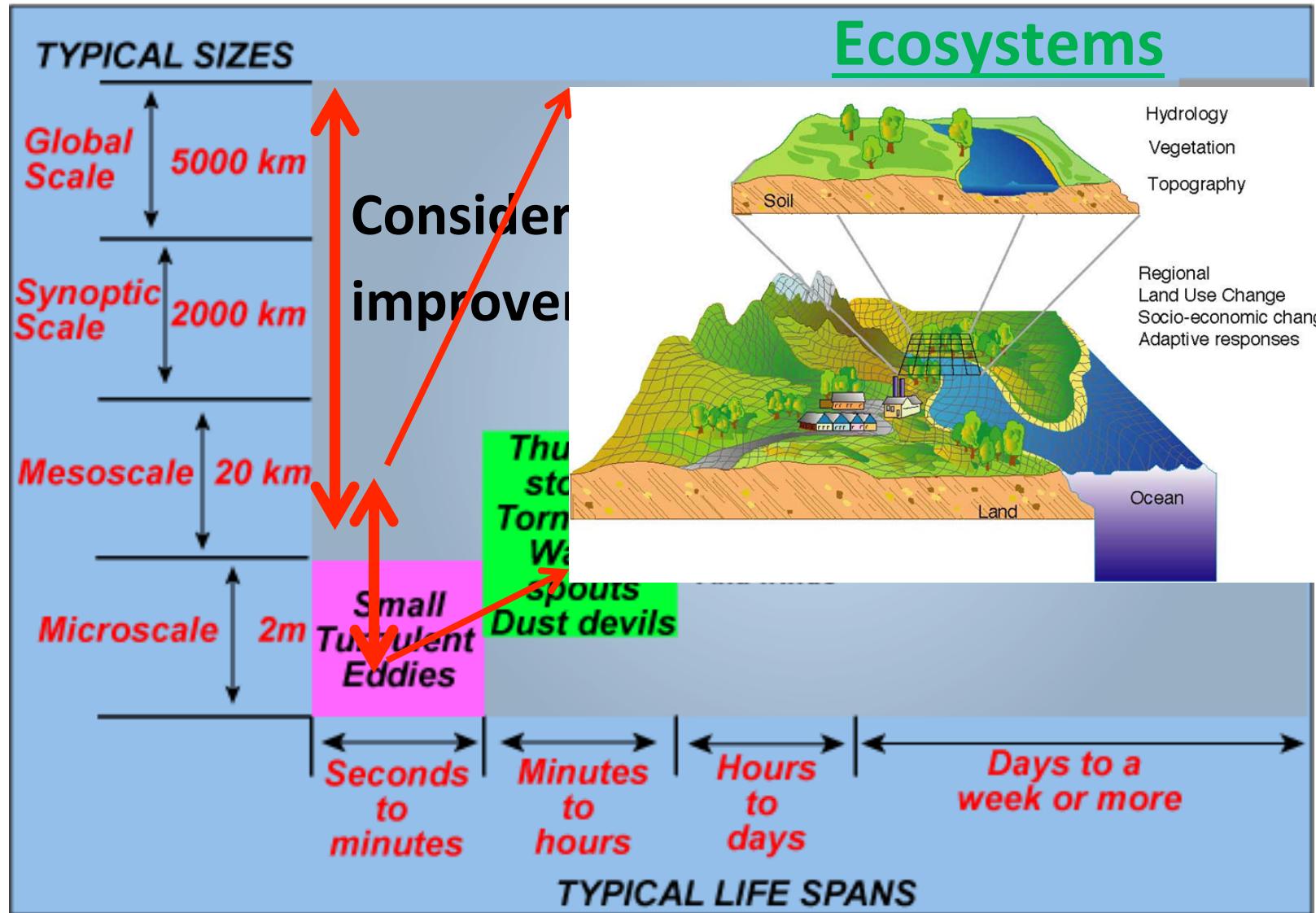




# Scales in Atmosphere



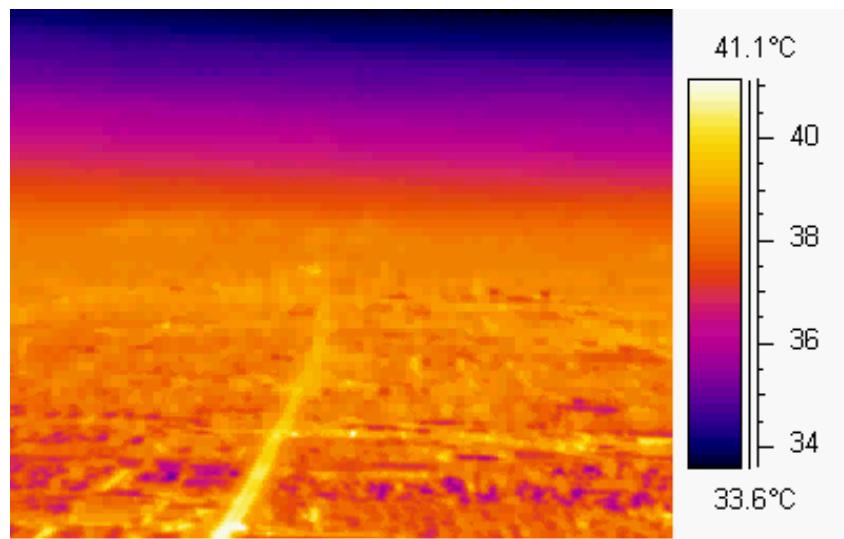
# Scales in Atmosphere



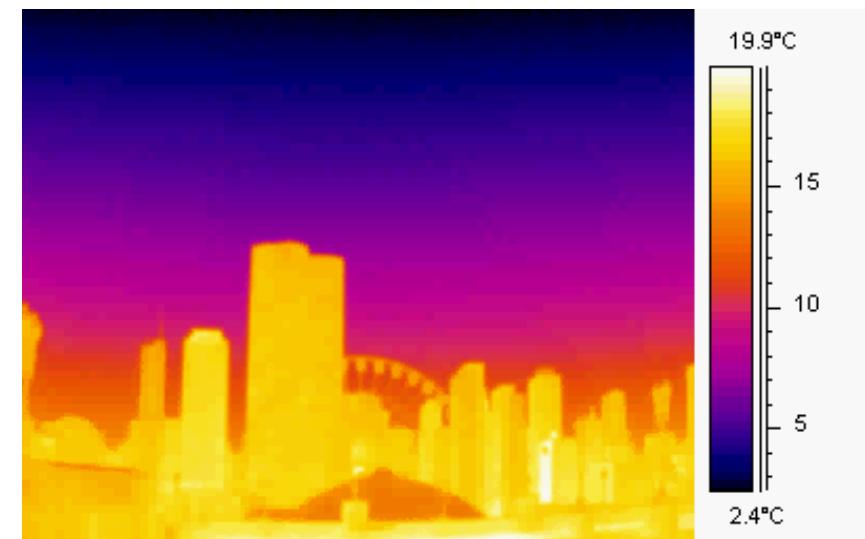
## Example: urban heat island

# Heat island – Infra Red Imaging

Phoenix



Chicago

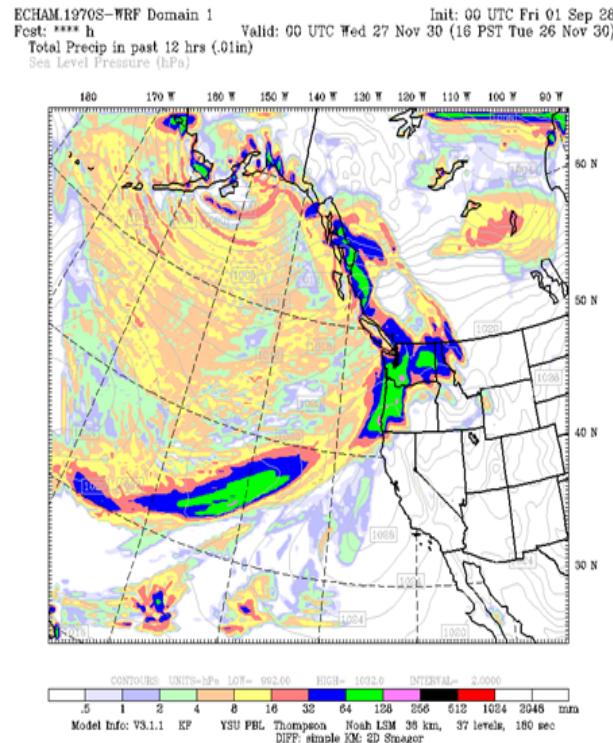


April 2008

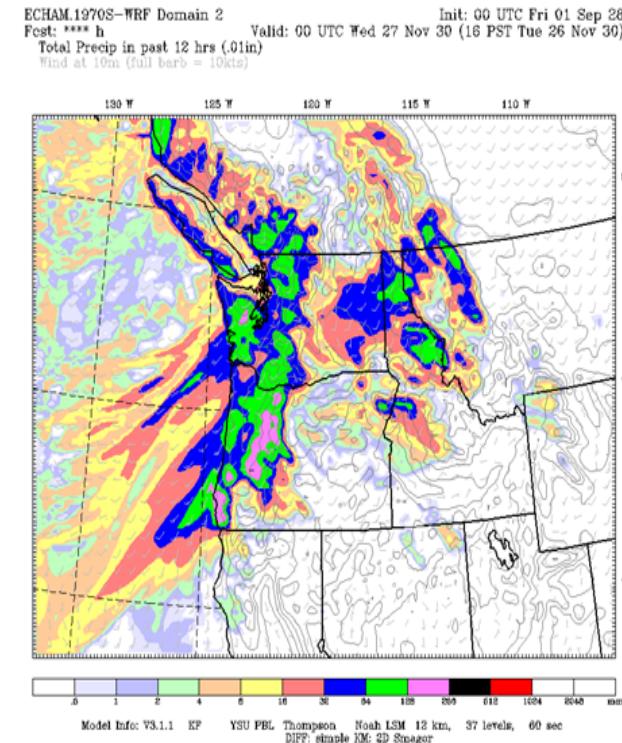
September 2011

# Example: Extreme precipitation

## 36-km simulations

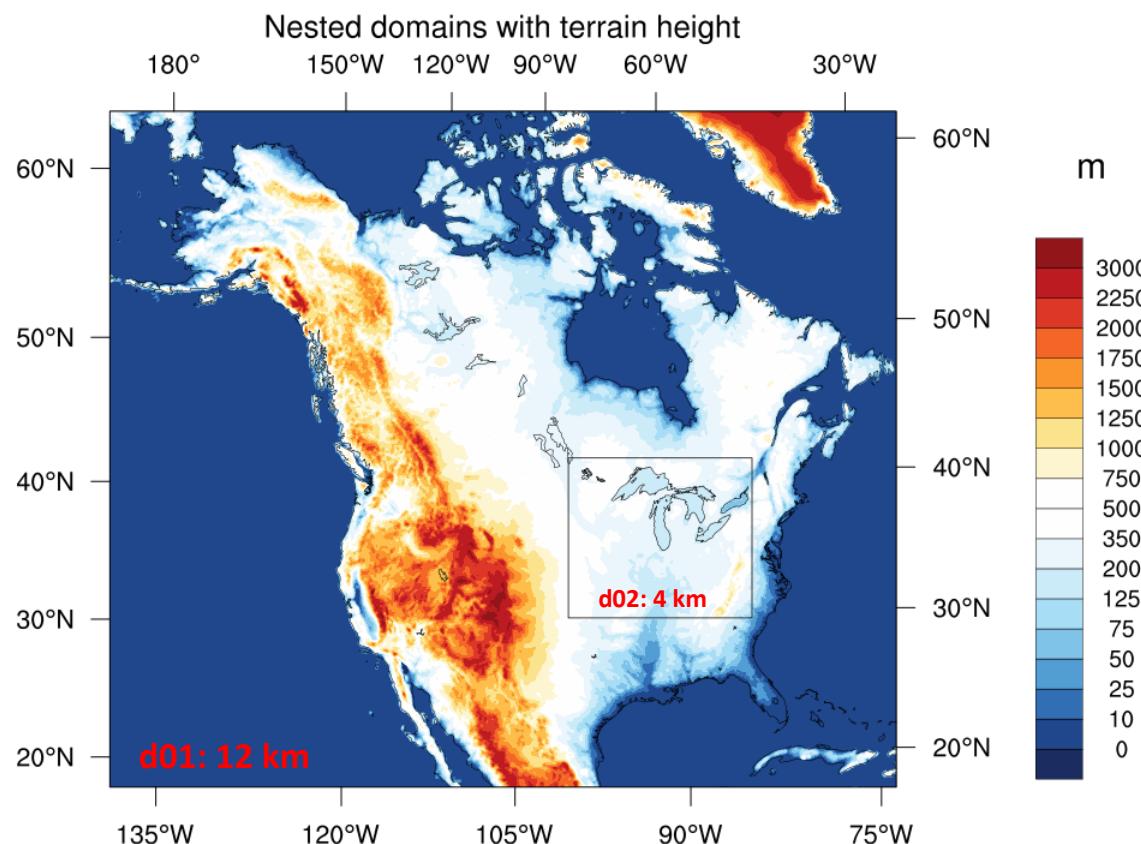


## 12-km simulations



12-hour precipitation totals for a projected atmospheric river event on Nov 27, 2030 over the Cascades Pacific North West (PNW). (Hamlet et al 2014)

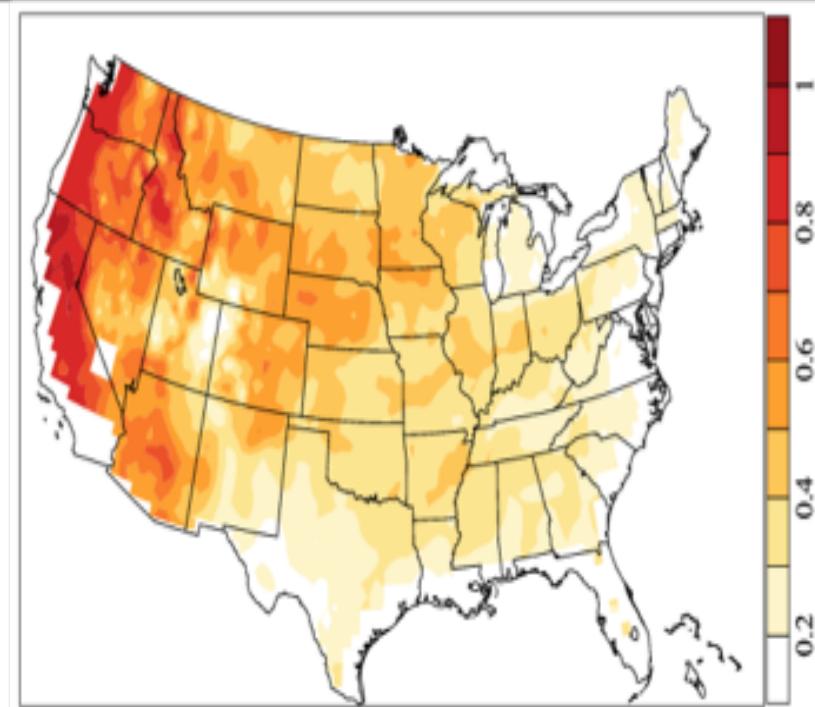
# Domain setup



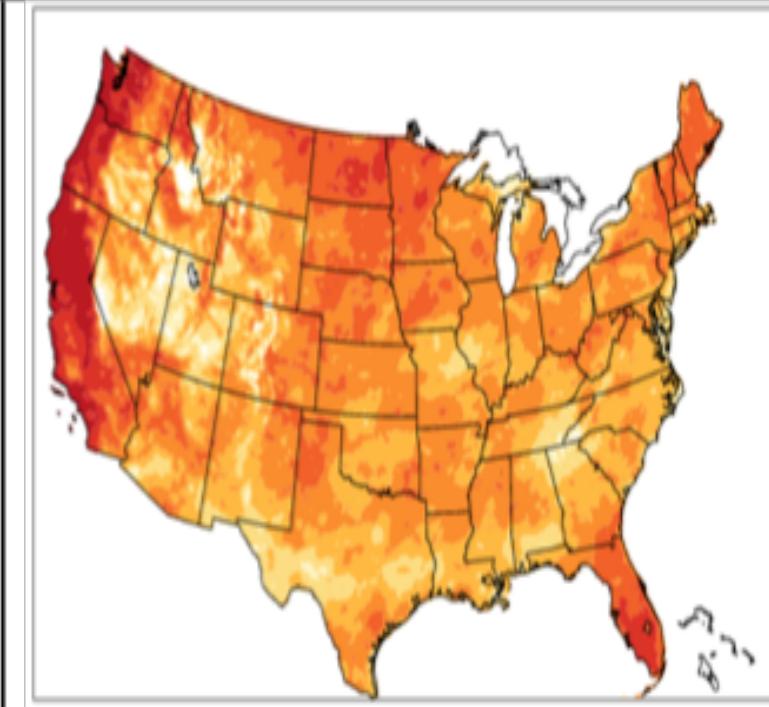
- Advanced Research WRF dynamic core, version 3.3.1
- Initial and boundary conditions: NCEP-DOE AMIP II reanalysis data (NCEP-R2)
- SST: 6-hourly and  $0.5^\circ \times 0.5^\circ$  Climate Forecast System Reanalysis data (CFSR)
- Nesting in step of 3
- 1991-2000: yearly initialization



(a) PRISM vs. NARCCAP (50 km)



(b) PRISM vs. NRCM (12 km)

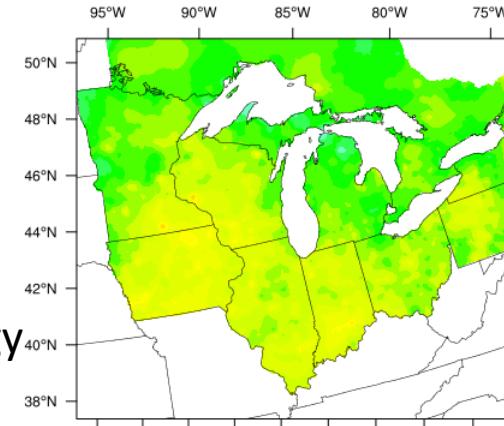


# Gridded observations

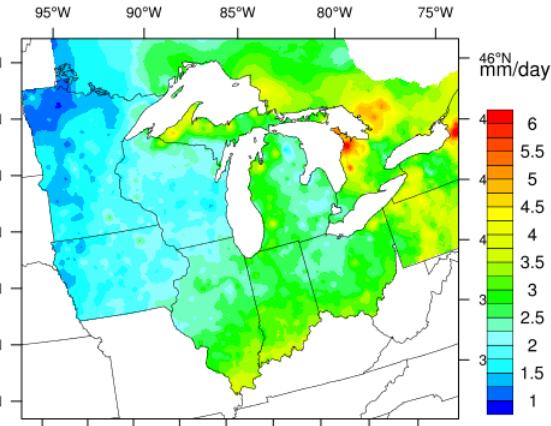
- With bias corrected precipitation for using surface winds (Hamlet et al)

Gridded observations: Seasonal climatology & interannual variability

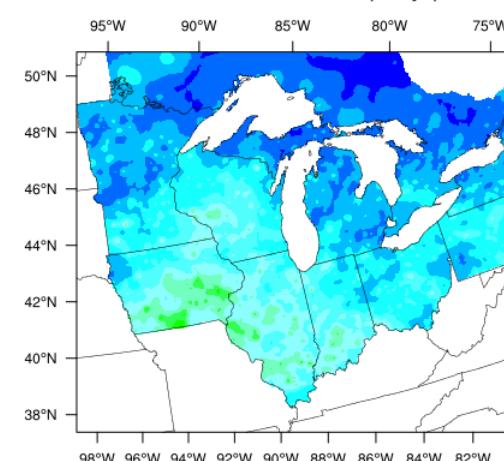
Observations: Climatology April-Sept: Warm



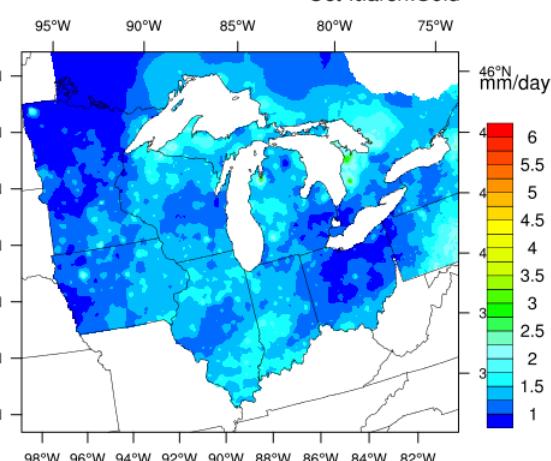
Observations: Climatology March: Cold season



Observations: Interannual variability April-Sept: Warm



Observations: Interannual variability March: Cold

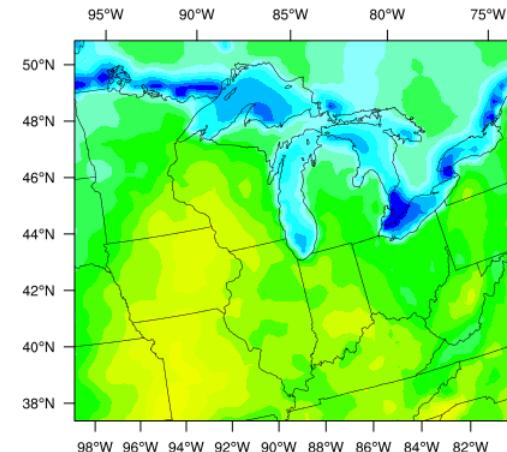


GHCN (Global  
Historical Climatology  
Network)-Daily

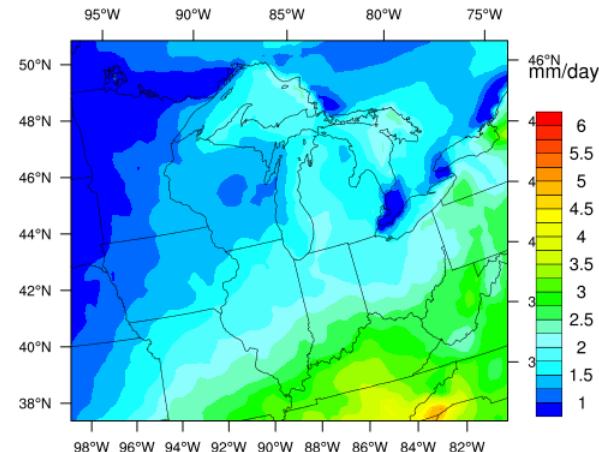
# NARR datasets

## NARR Seasonal climatology & interannual variability

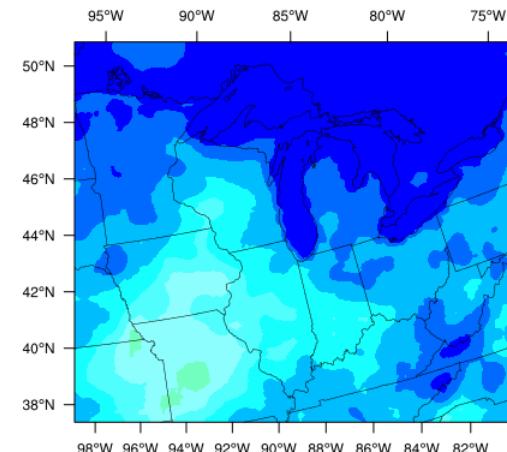
NARR: Climatology April-Sept: Warm season



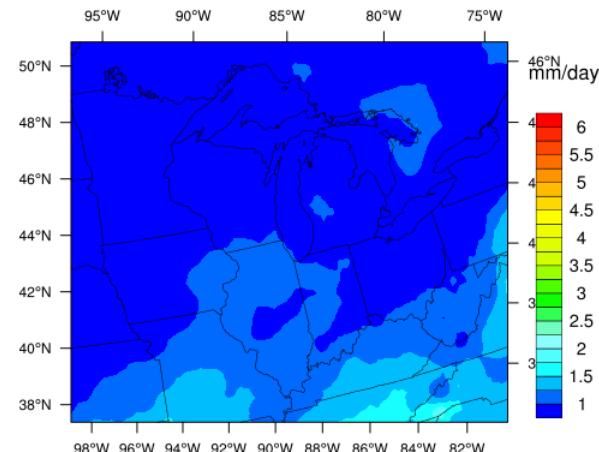
NARR: Climatology Oct-March: Cold season



NARR: Interannual variability April-Sept: Warm

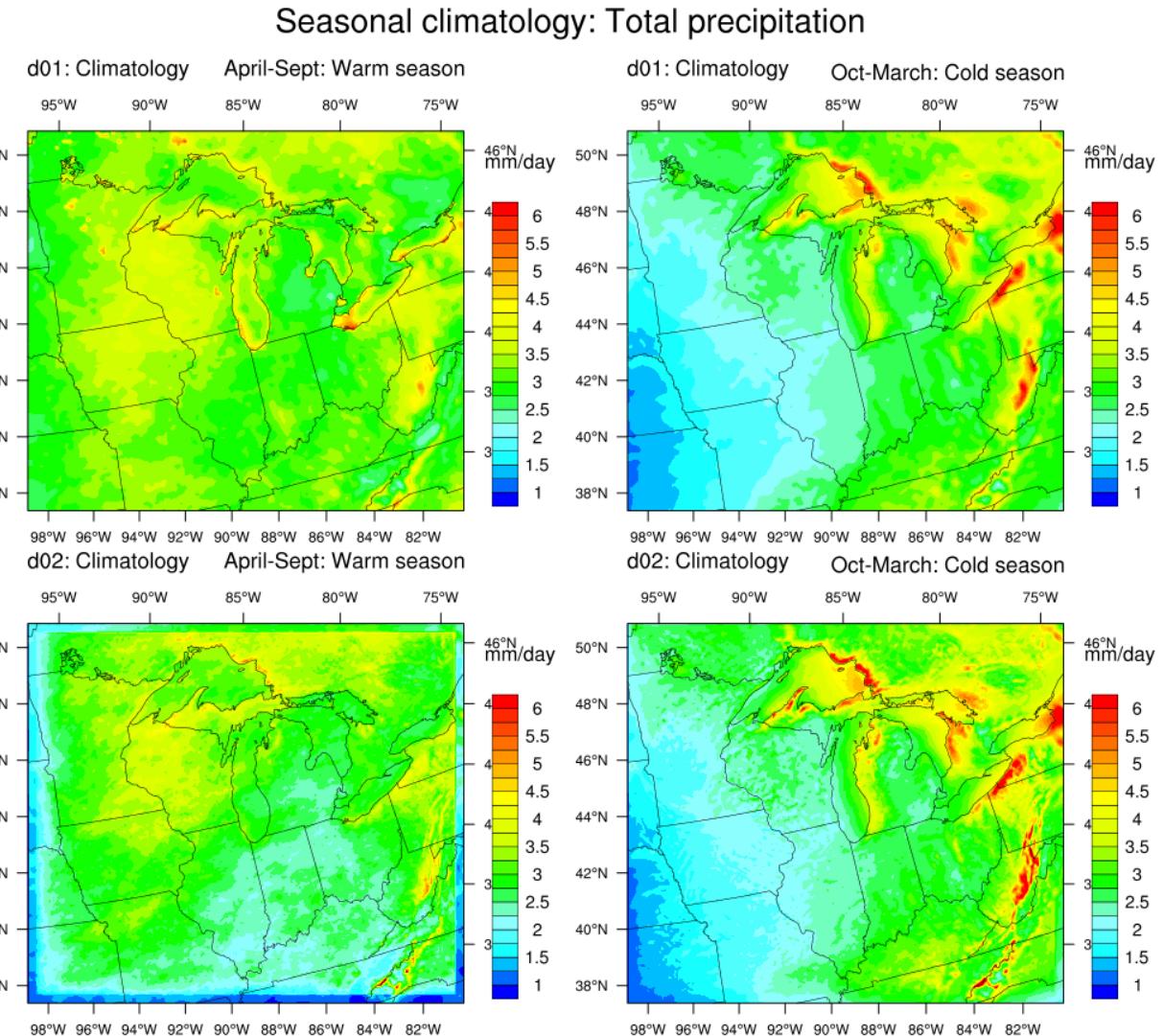


NARR: Interannual variability Oct-March: Cold



# WRF simulations

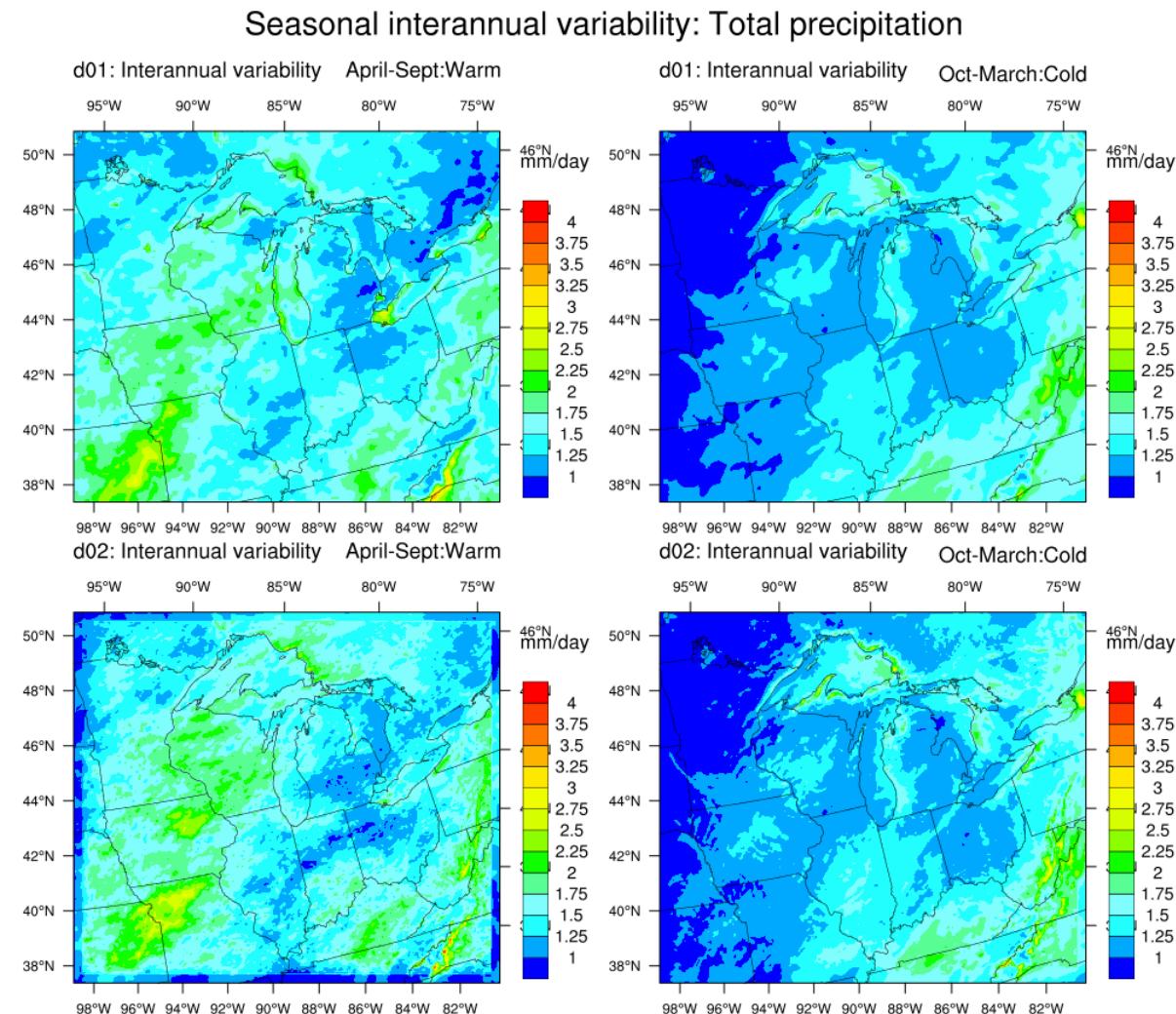
12 km



4 km

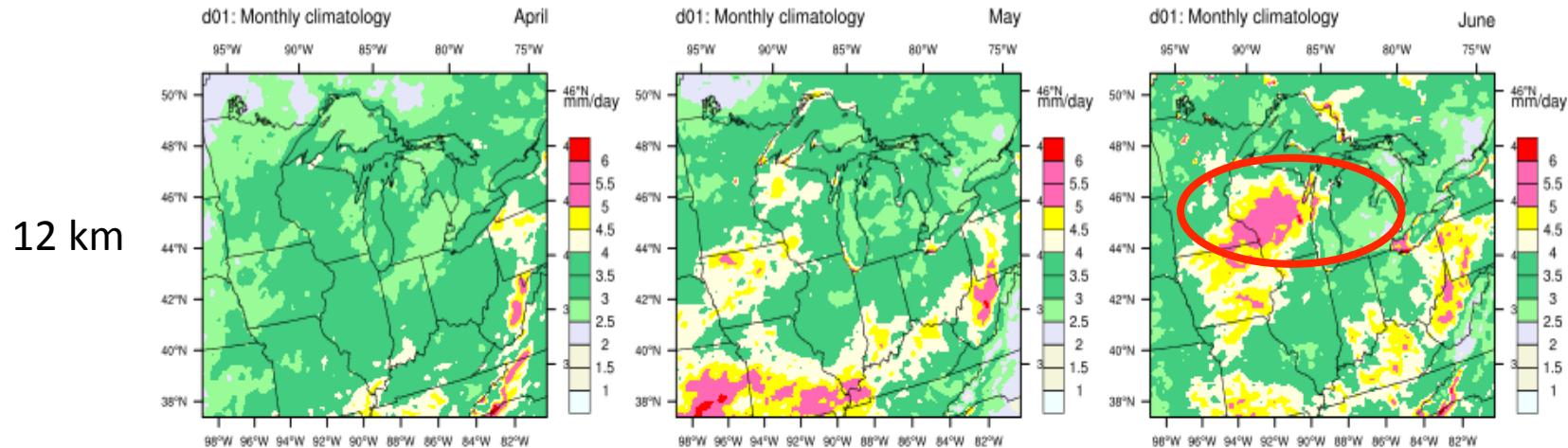
# WRF simulations

12 km

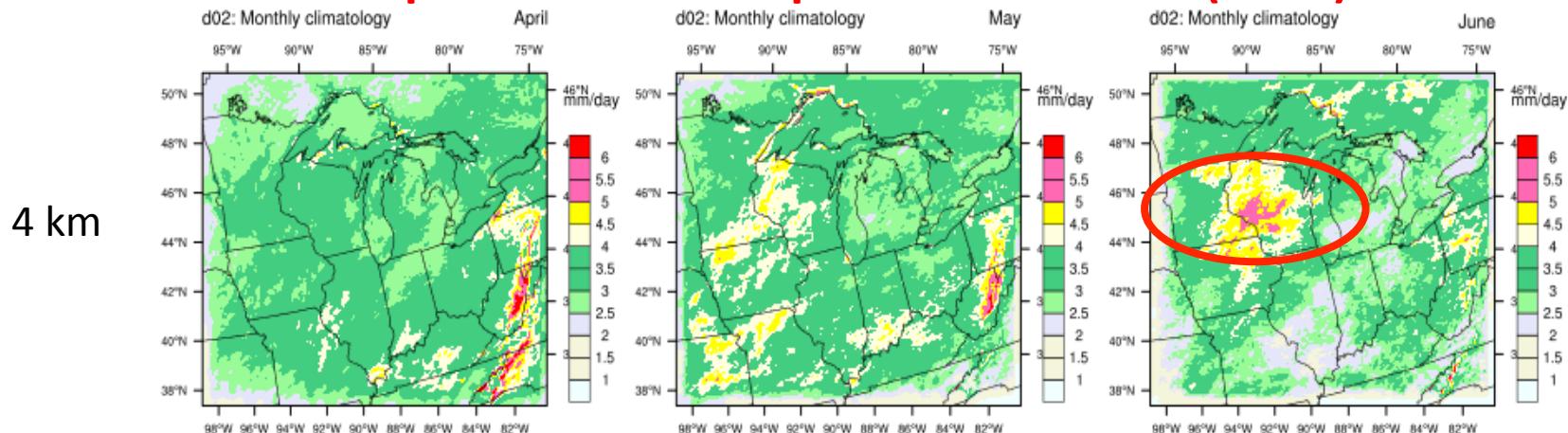


# WRF simulations: Convective precipitation

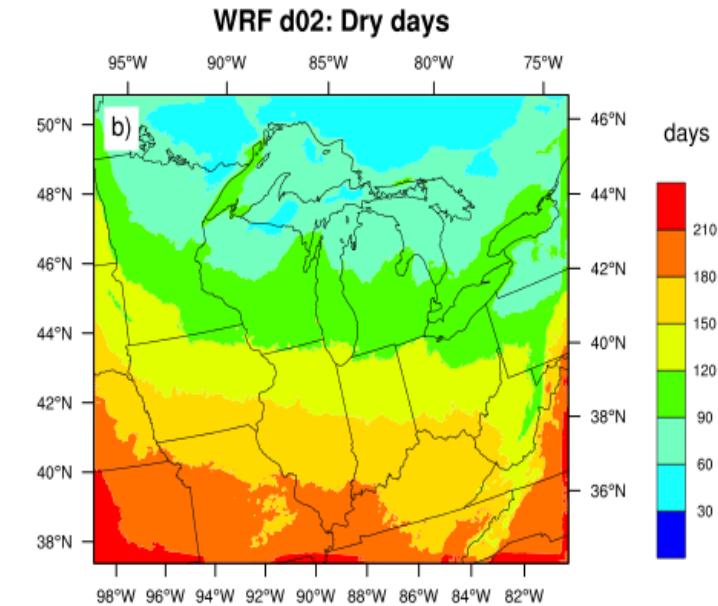
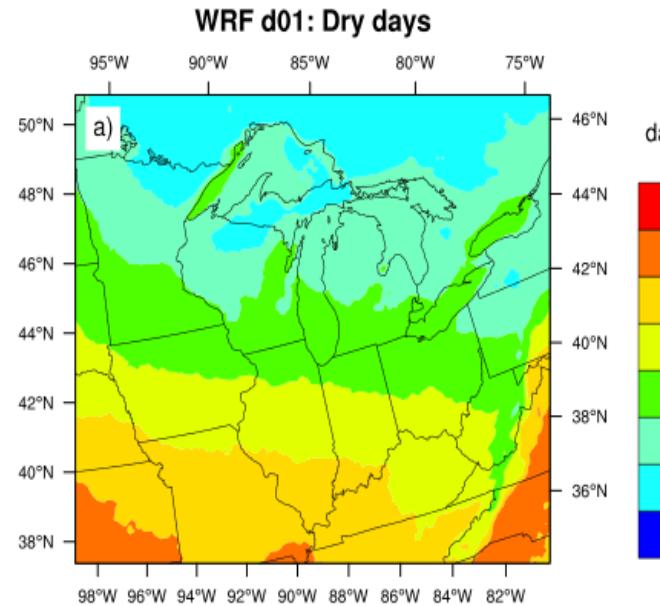
## d01: With explicit convective parameterization (12 km)



## d02: Without explicit convective parameterization (4 km)



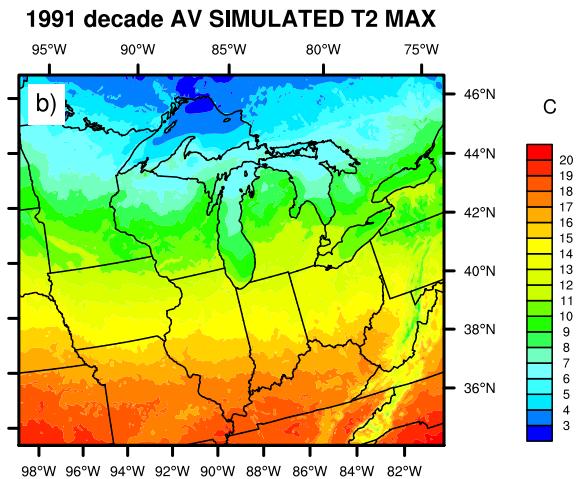
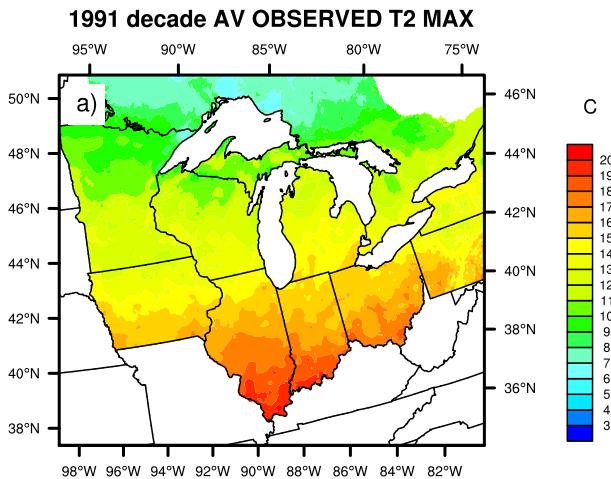
# WRF simulations: Dry days



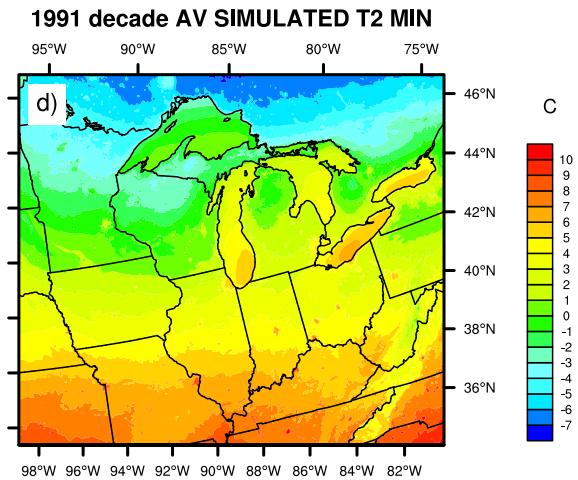
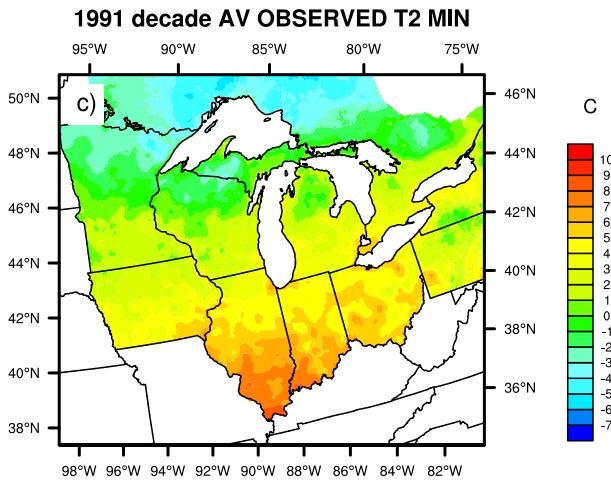
Artificial convective precipitation leads to less dry days in 12 km.

# WRF simulations: Surface temperature

12 km



4 km



# Domain setup

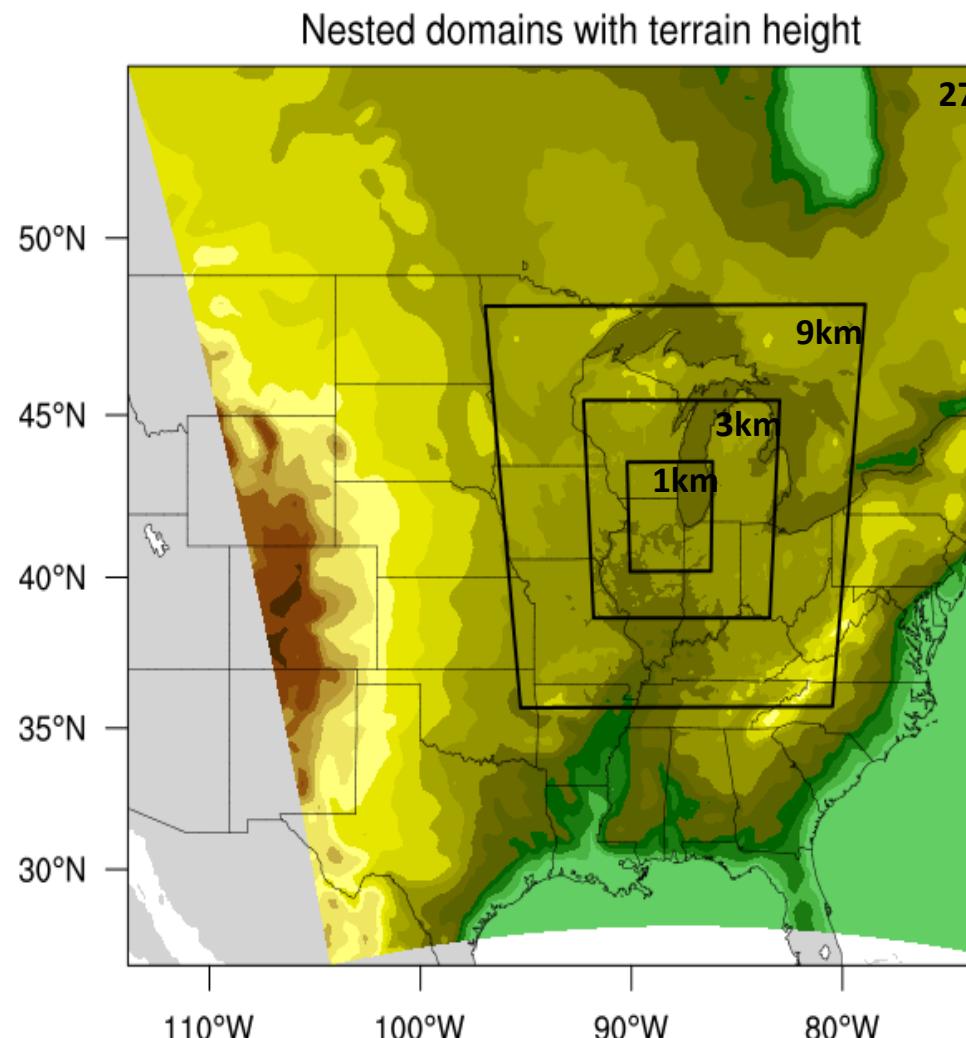
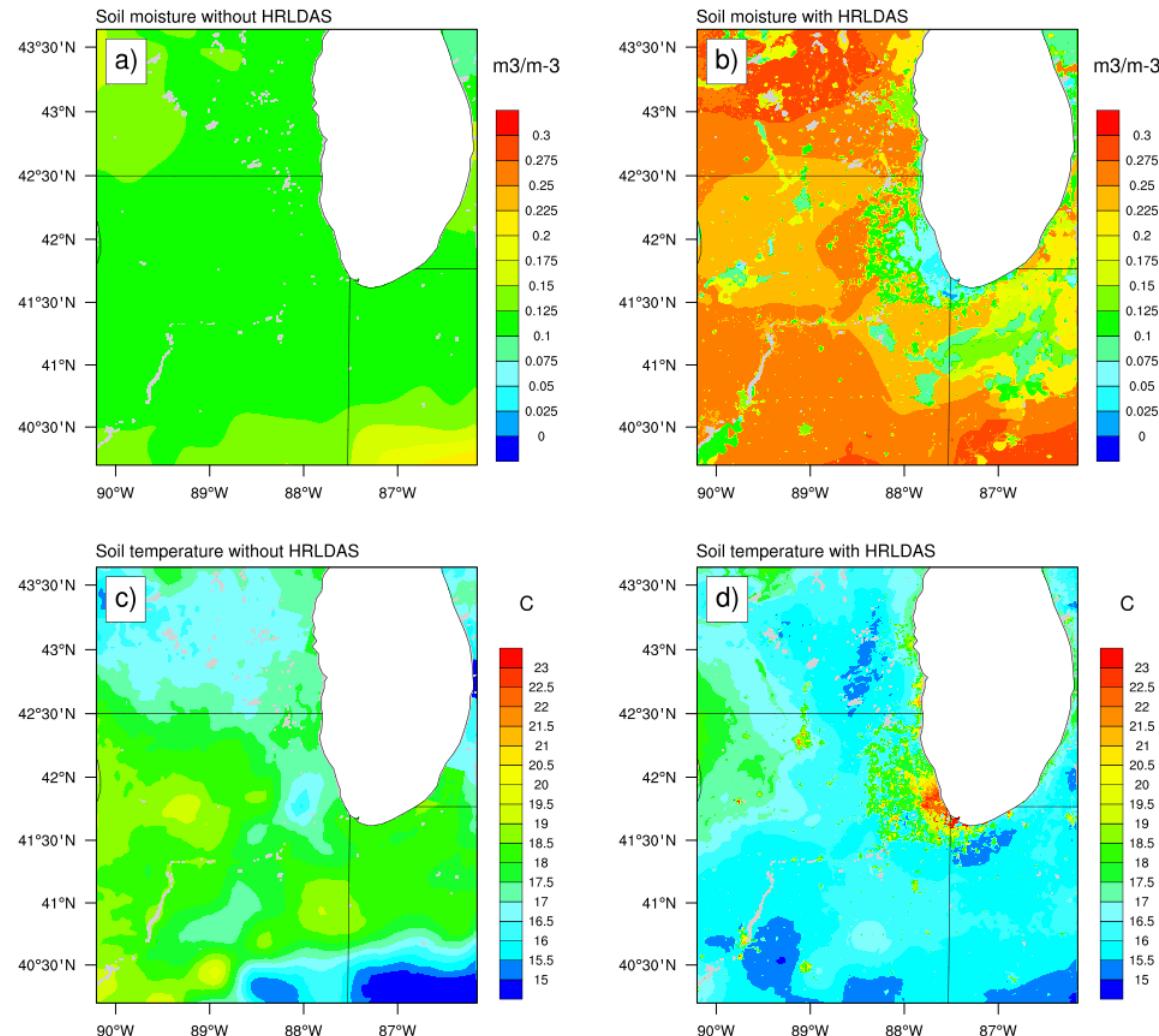


Fig. WRF nested domains with terrain height.

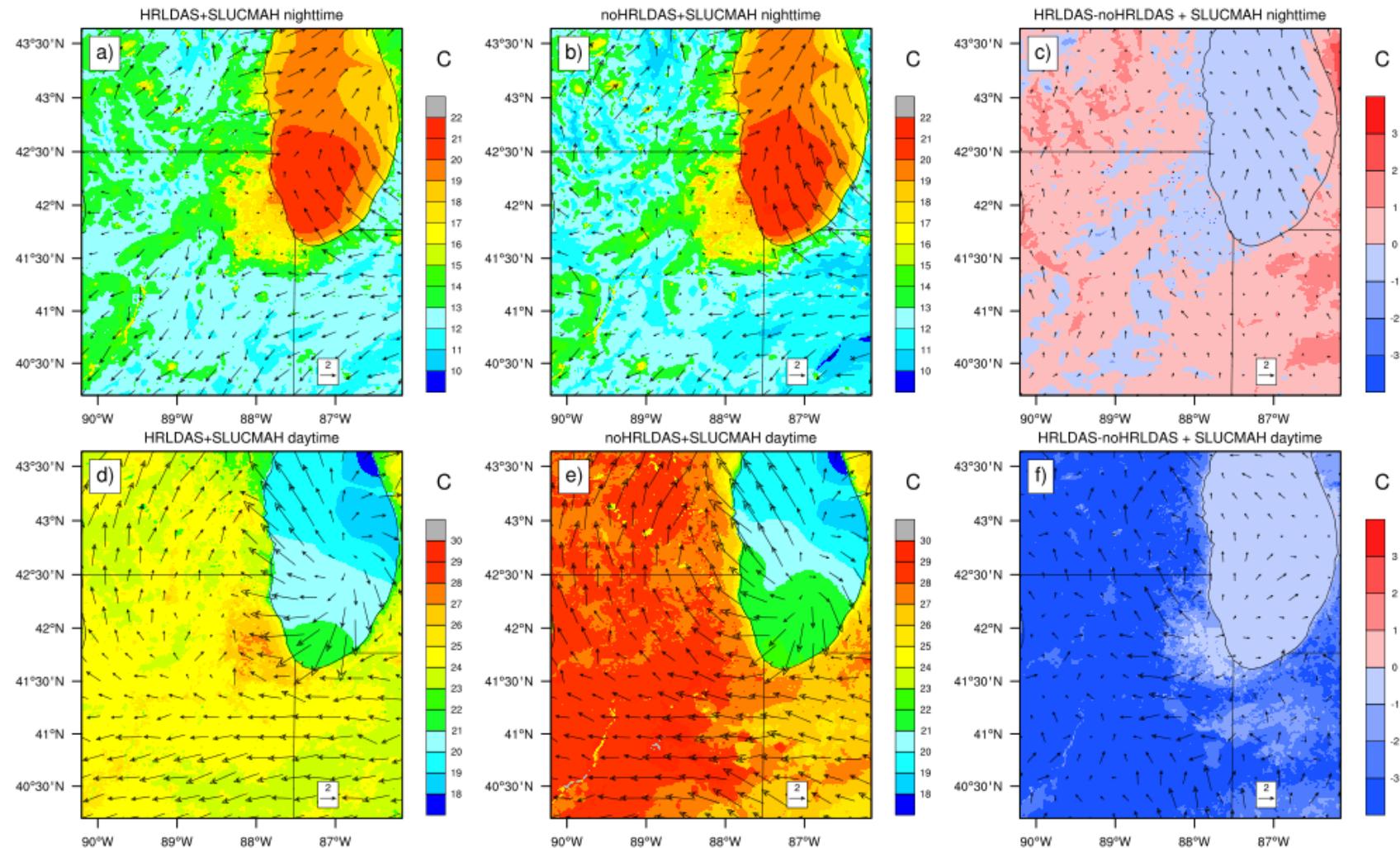
- 3-hourly NARR 32x32 km forcing data.
- Simulation period (3 days): 16-18 August 2013
- Analyze hourly output
- Spin up: 12 hrs
- Nesting: in steps of 3

# HRLDAS for RCM run

- 1 km resolution: Ultra-high resolution



# Sensitivity of HRLDAS



## Subgrid scale land cover variability

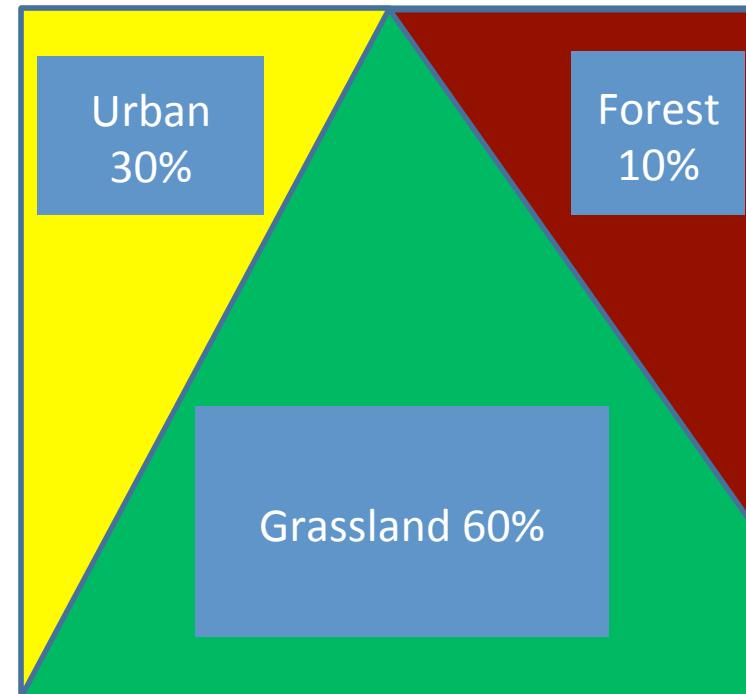
Real World: multiple “tiles” within a “grid cell”

Modelling World: dominant vs mosaic

WRF-Noah

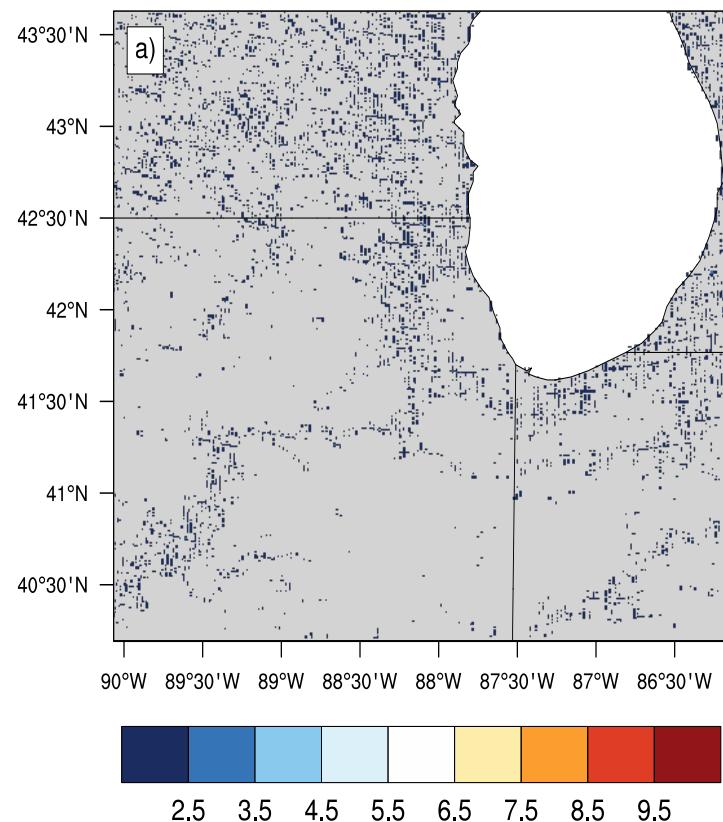


WRF-Noah-  
mosaic (N=3)

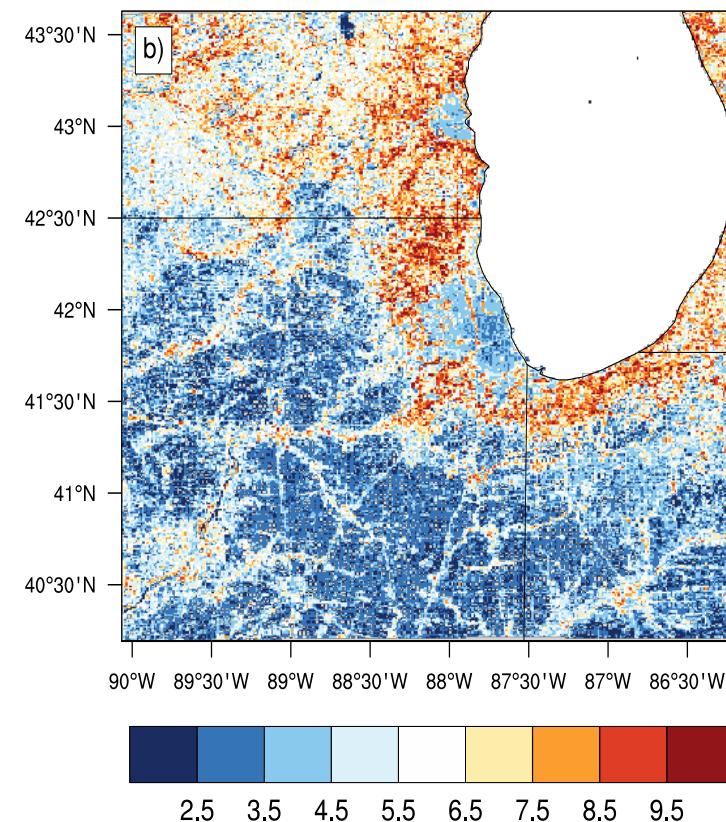


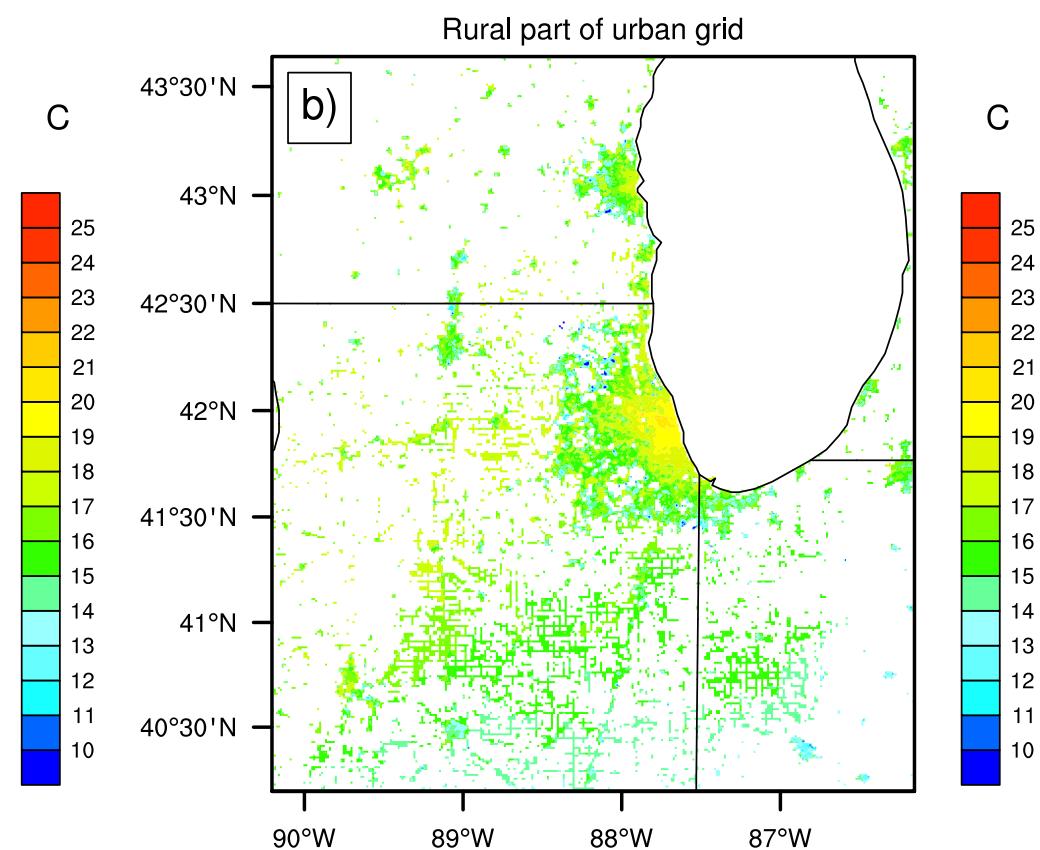
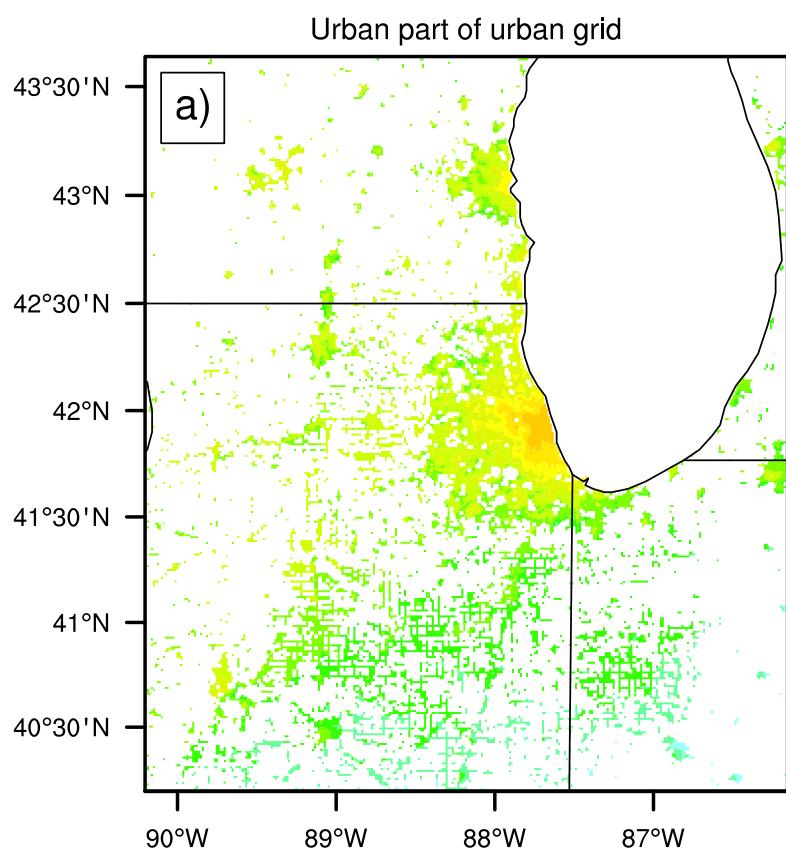
# Subgrid scale land cover variability

**modis\_30s**

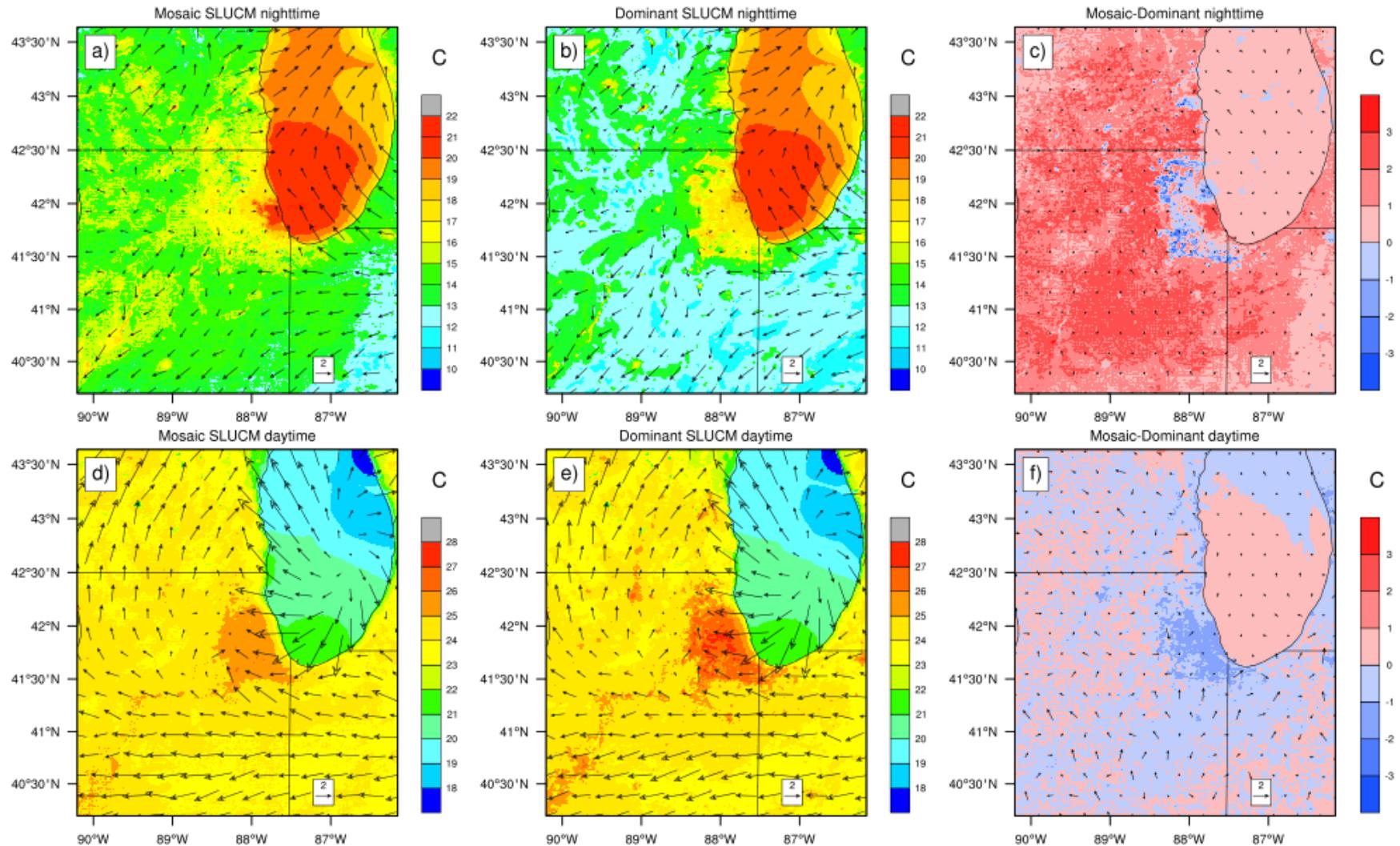


**NLCD data**





# Mosaic/Dominant



## Conclusions and future work

### Conclusions:

- Extreme events are not only likely to be dictated by changes in large-scale climate dynamics but also by climate system modifiers at very fine/local scales
- Observational gridded datasets can show us the pattern, but may mute/amplify hydrometeorological intensities.
- High resolution NARR datasets are poor for snow.
- Soil moisture initialization using HRLDAS removes uncertainty of poor surface initial conditions.
- Mosaic approach includes surface heterogeneity in land surface and thus shows better estimates of surface characteristics.

### Future work

- One article in JAMC press and another in review; one in preparation (to be submitted late summer)
- Perform future climate simulations: 2045-2055 (RCP4.5/8.5), and 2085-2095 (RCP4.5/8.5).



# Thank you

**Thanks to:**

- The Great Lakes Consortium for Petascale Computation (GLCPC) for the award;
- Mark Straka and the NCSA team