



# Impact of Land use and Land cover Change on Regional Climate over the Contiguous United States using Variable-Resolution CESM2

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- (4) Penn State University



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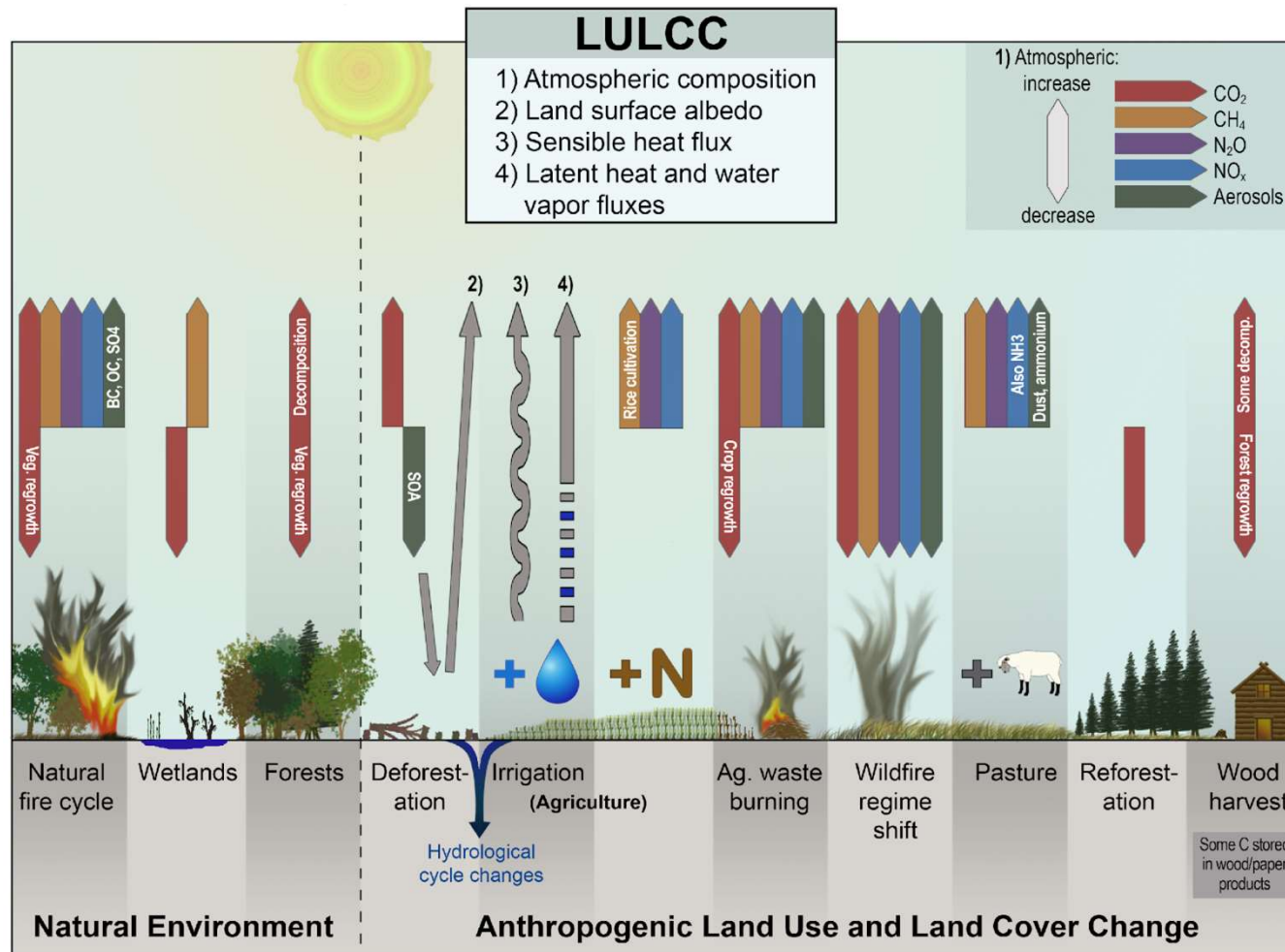


21 June 2019

Biogeochemistry Science Friday Webinar



# It is essential to better represent the influence of LULCC on Earth system processes

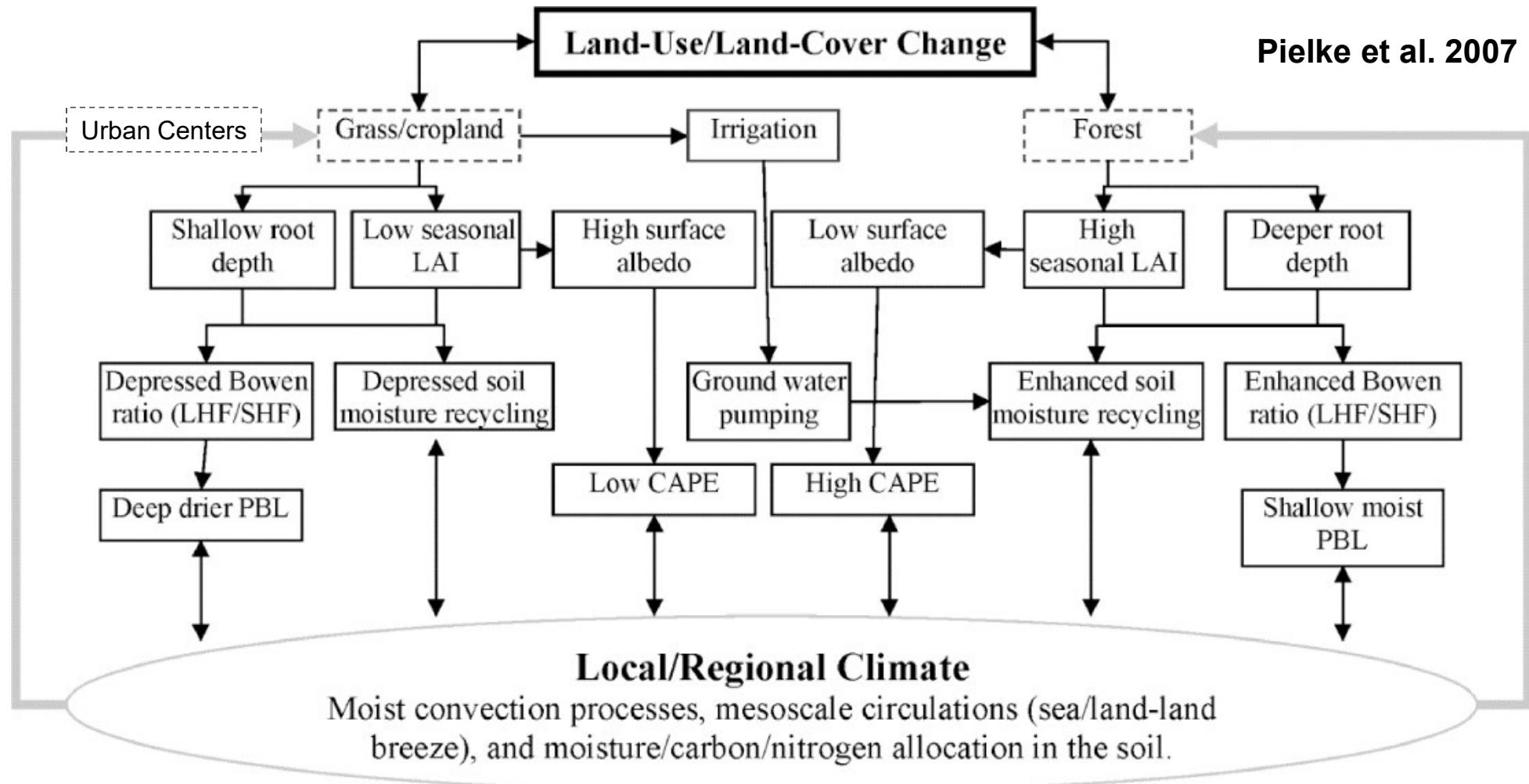


Hibbard et al., 2017, CSSR, 4<sup>th</sup> NCA

- LULCC interacts with local, regional, and global Earth system processes. The resulting ecosystem responses are a mix of biogeophysical and biogeochemical feedbacks to climate change;
- Combined LULCC effects account for 40% ± 16% of the human-caused global radiative forcing from 1850 to present day (**high confidence**)
  - Direct biogeophysical radiative impact of LULCC on global radiative forcing is small relative to other forcings.
  - LULCC is a highly regionalized phenomenon with regional-scale climate impacts that can vary in the sign of the change.



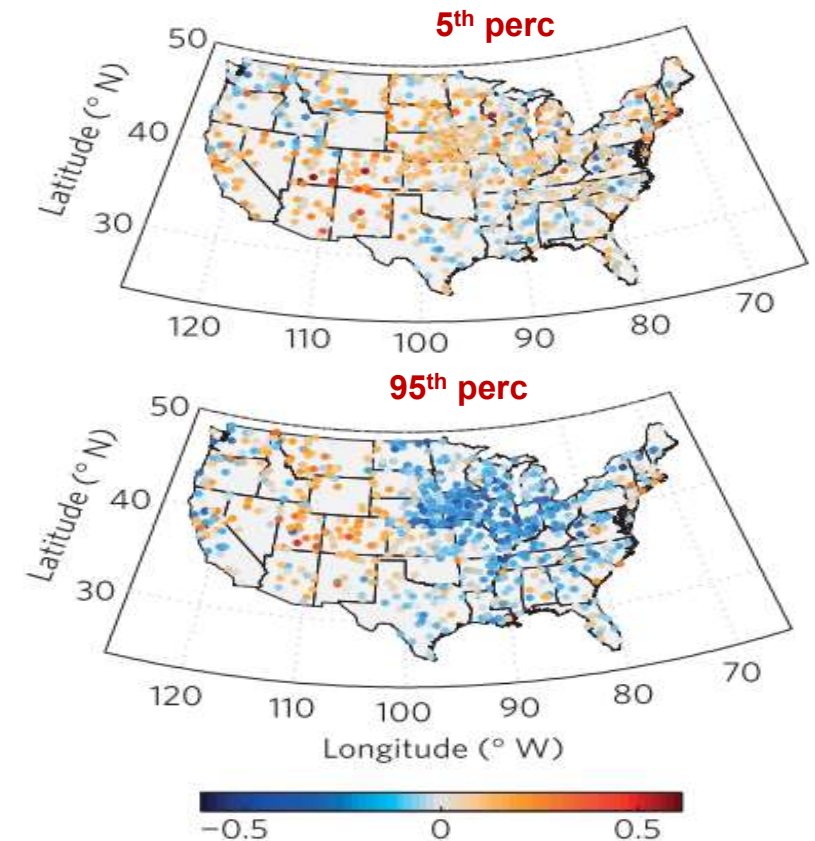
# Biophysical Processes associated LULCC are local to regional scaled in nature



**These processes are typically better resolved in regional models**

## Why do we focus on effects of LULCC over CONUS?

- ❑ Most weather forecast and climate models show a common **warm-and-dry bias**, accompanied by the **underestimation of evapotranspiration** and **overestimation of surface net radiation**, over the central U.S. during boreal summer;
- ❑ Observational studies suggest that **agricultural intensification** led to a warming hole over the Midwest;
- ❑ The central U.S. has been identified as a **land-atmosphere coupling hotspot**;
- ❑ We **hypothesize** that the warm-and-dry bias can be reduced by improving simulations of mesoscale convection, better captured in models at higher resolutions and realistic land use representations.



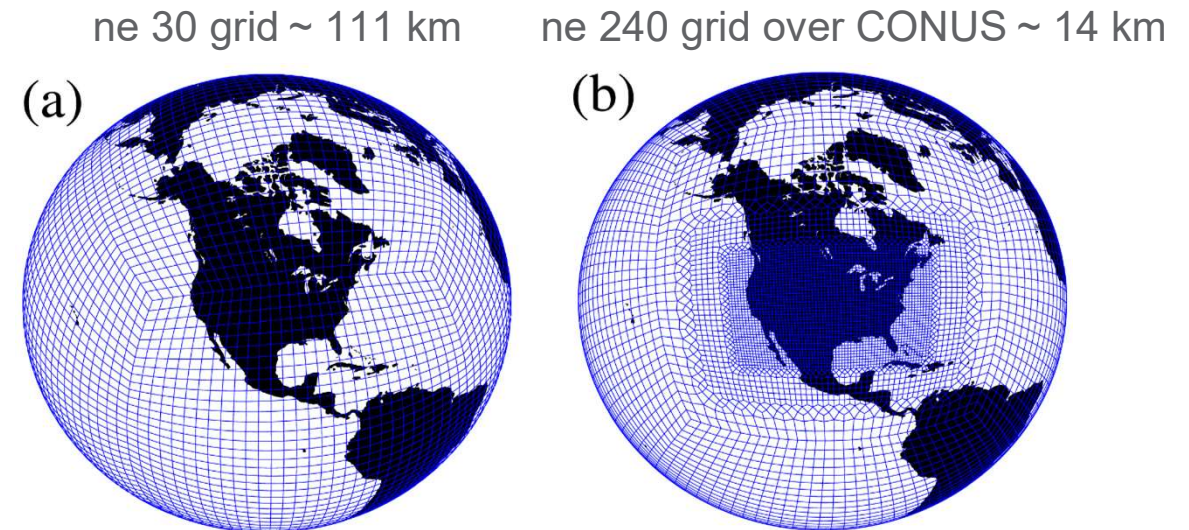
95th percentile Tx trend (°C decade<sup>-1</sup>)

**1901-2014 Trends in Tmax**  
(Excluding Dust Bowl (30's) and Aerosol  
Induced cooling period (1970-90's))  
(Mueller et al, 2015)



## Variable resolution configurations of Global Models

- A new alternative that can be used to study LULCC impacts at finer resolutions, feasible to perform decadal global simulations at 10-30km resolutions in targeted regions;



Source: Lauritzen et al., 2018 (JAMES)

- Reproduce the global climatology of the uniform low resolution simulations (Zarzycki et al., 2015), without the need for retuning the global model (Gettelman et al., 2018);
- Capture high frequency, high resolution statistics over region of grid refinement (Gettelman et al., 2018);

# VR Community Earth System Model 2 (CESM2)

- CESM2-SE with regional refinement to one eighth degree over the CONUS
- Land-atmosphere simulations with CAM6-SE and CLM5.0 (BGC and crop modules on)
  - **Compset:** FHIST using CAM6\_CLM5\_BGC-Crop
- Historical AMIP type simulations with prescribed SST, atmospheric chemistry and solar variations of 1980-2010
- Two LULC maps: Preindustrial (1850) vs. Present day (2000)
- **Scale Experiments:**

**Table 1. 2000 vs. 1850 LULCC experiments**

	Grid combinations	
	Atmosphere	Land
ne30 – ne30	1° (~111 km)	1° (~111 km)
ne 30 – ne 240	1° (~111 km)	0.125° (~14 km)
ne 240 – ne 240	0.125° (~14 km)	0.125° (~14 km)

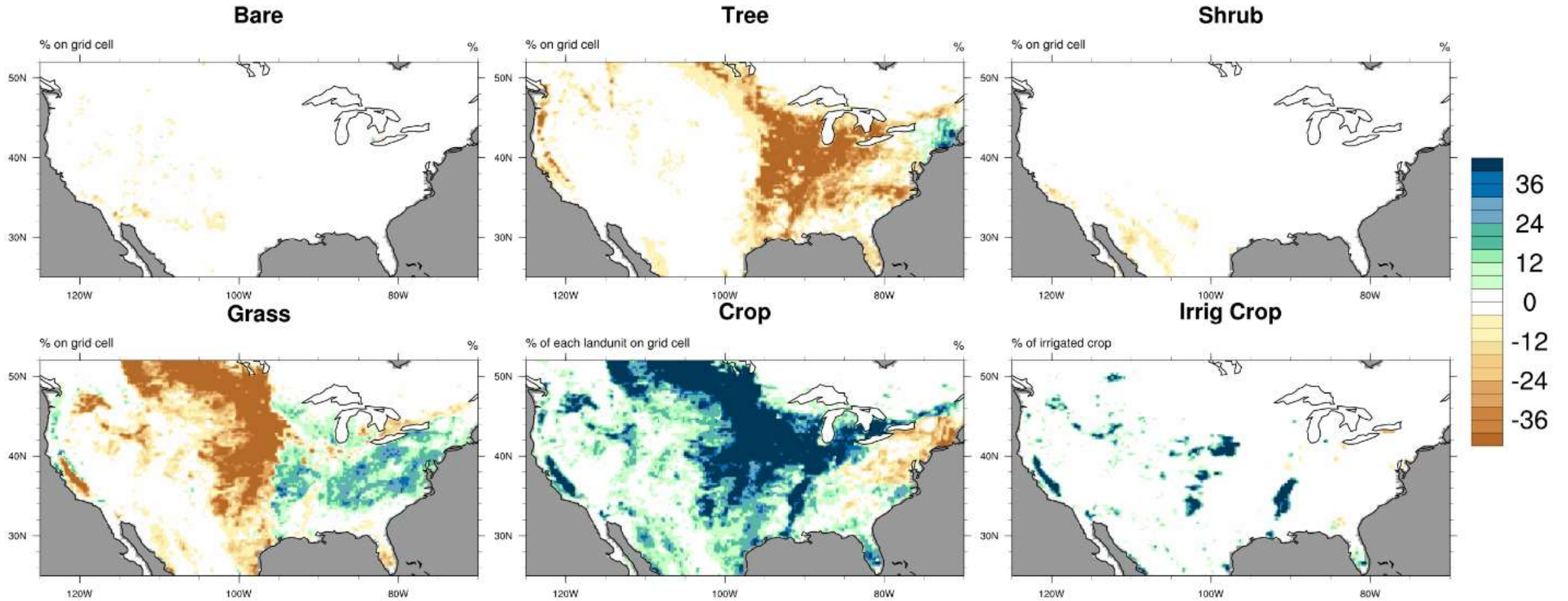
**27 years each  
1984-2010**





Pacific Northwest  
NATIONAL LABORATORY

# Land use change: Present-day vs. Preindustrial



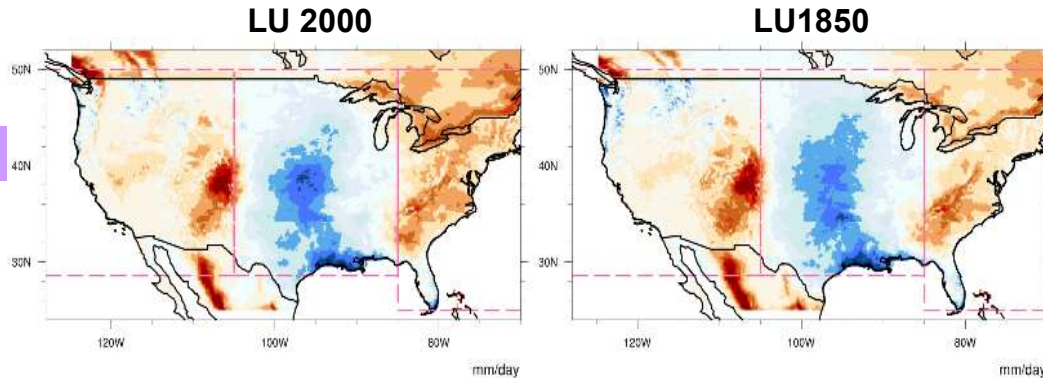
## Science questions

- ❑ Can simulations of regional climate over the CONUS be improved using high-resolution simulations?
- ❑ What is the response of regional climate to LULCC in high resolution simulations compared to more conventional resolution ESM simulations?
- ❑ What is the effect of **LULCC** on warm-season temperature and precipitation over the CONUS?
  - land cover change
  - Irrigation
  - Agricultural management (planting, fertilizing, harvest)
  - Plant physiology and phenology

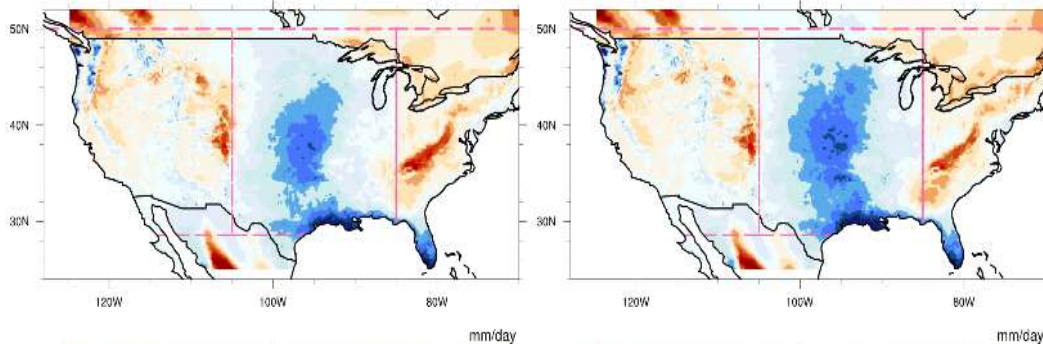


# Skill in simulating warm-season precipitation: comparison to NLDAS, April to August

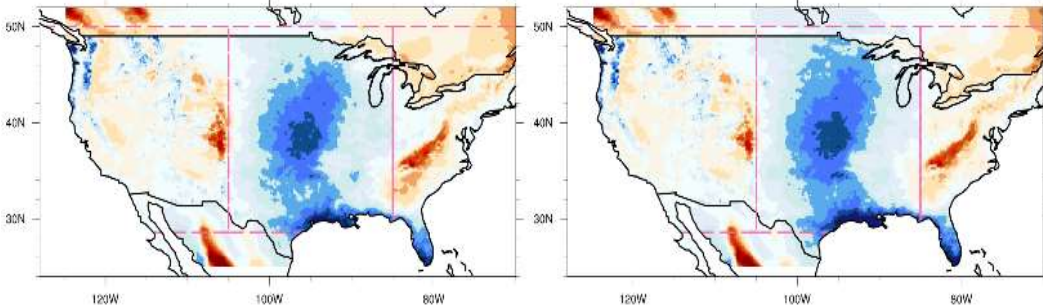
ne240-ne240



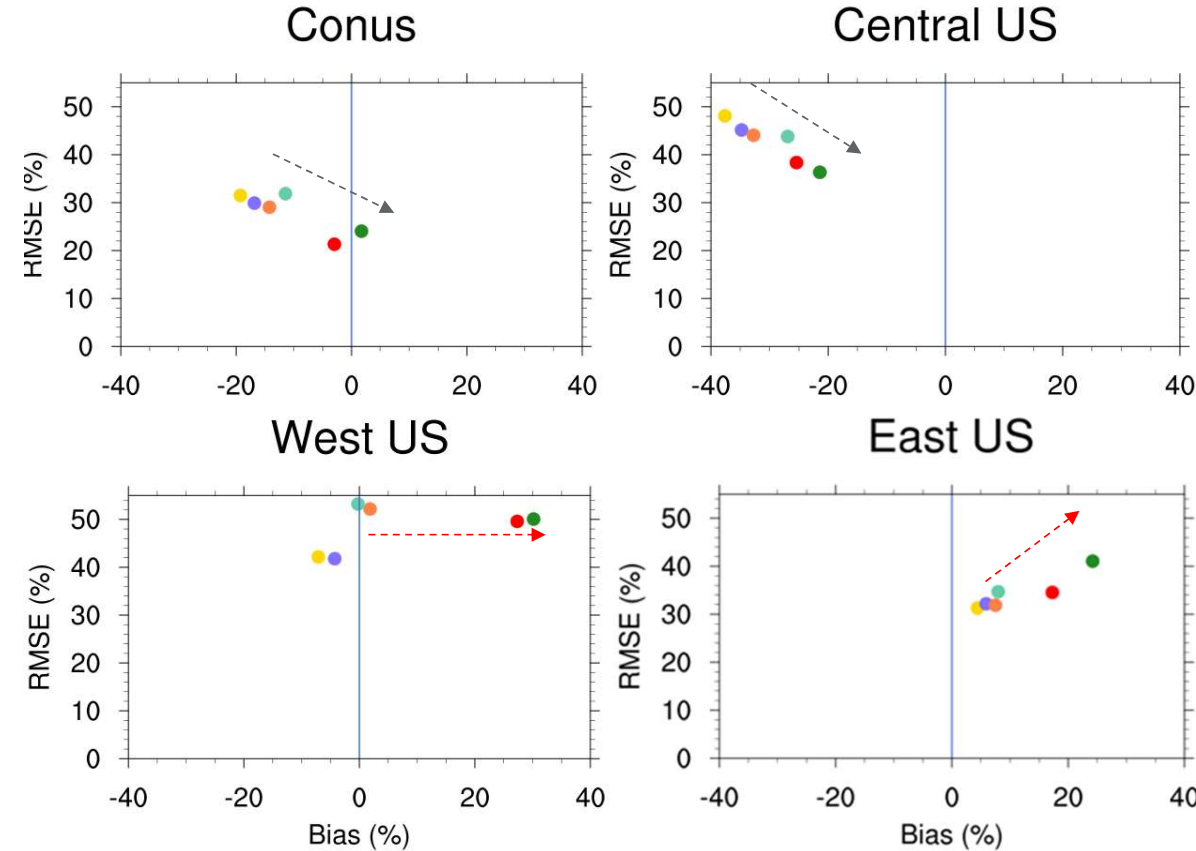
ne30-ne240



ne30-ne30



**CONUS and Central US:** Precipitation improves with resolution  
(At the same res, more accurate LU shows lower errors)  
**Western and Eastern US :** Deteriorates



- LU2000:ne240-ne240
- LU1850:ne240-ne240
- LU2000:ne30-ne240
- LU1850:ne30-ne240
- LU2000:ne30-ne30
- LU1850:ne30-ne30

----->  
Improved error statistics

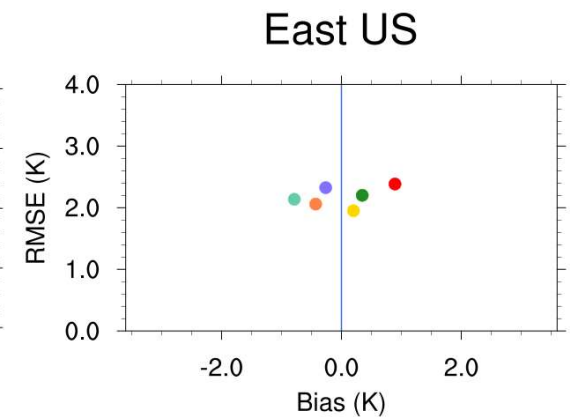
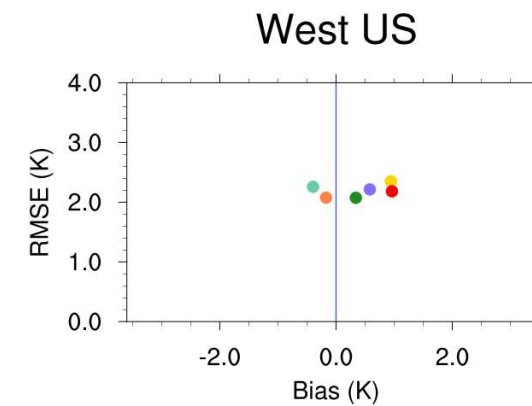
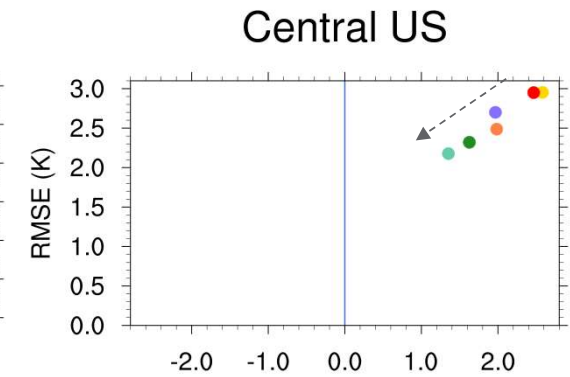
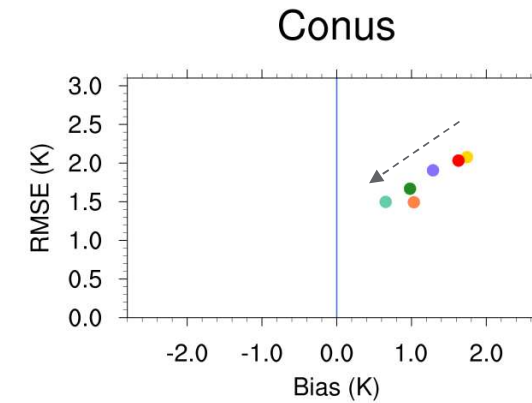
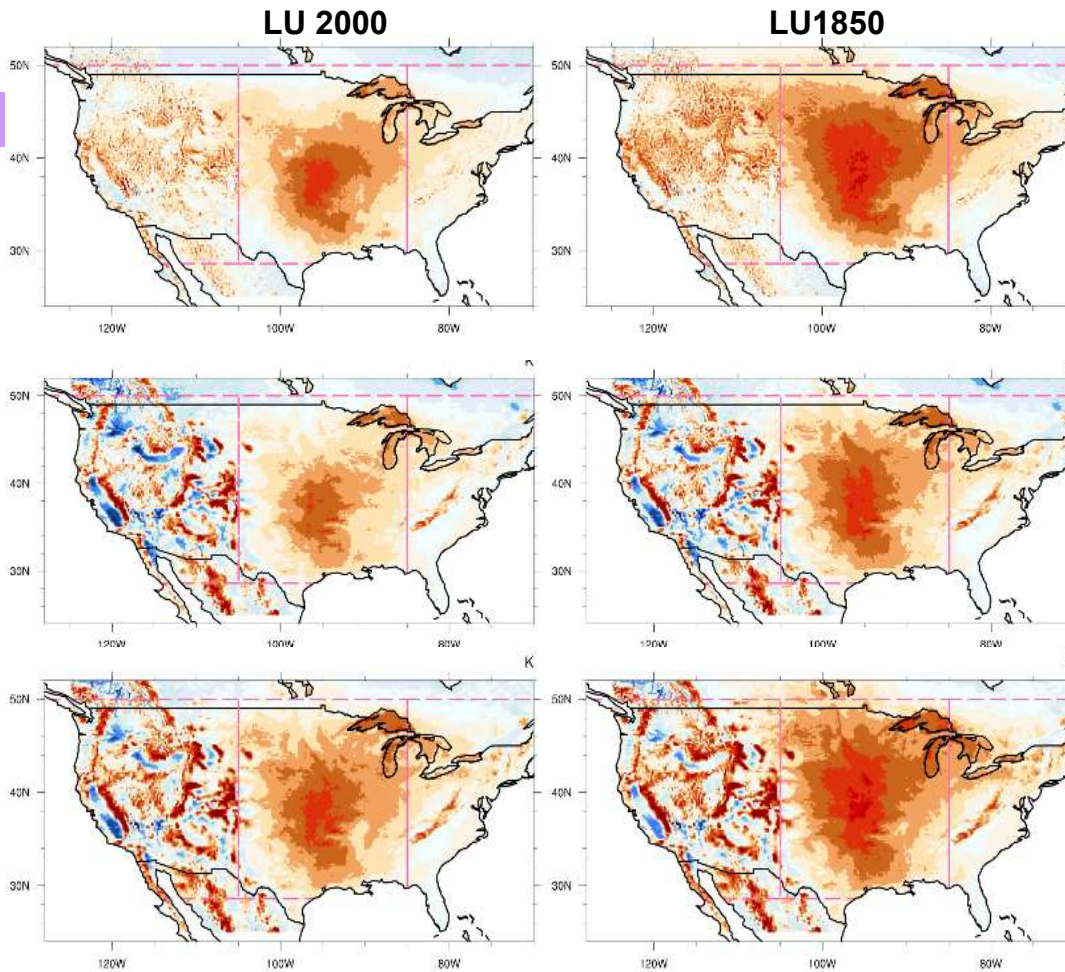
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Worsened error statistics

# Skill in simulating warm-season daily maximum T-2m: comparison to NLDAS, April to August

ne240-ne240

ne30-ne240

ne30-ne30



- LU2000:ne240-ne240
- LU1850:ne240-ne240
- LU2000:ne30-ne240
- LU1850:ne30-ne240
- LU2000:ne30-ne30
- LU1850:ne30-ne30

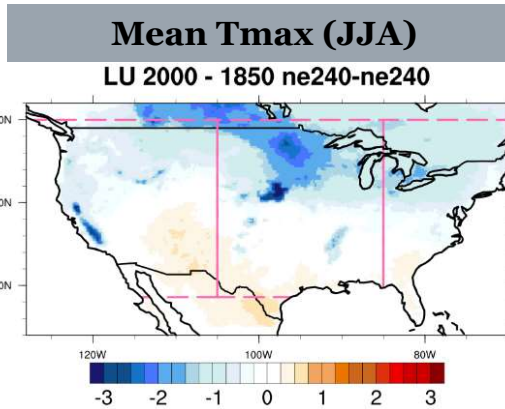
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Improved error statistics

- Land-use is the dominant factor influencing temperature skill: simulations using a more accurate LU shows lower error stats

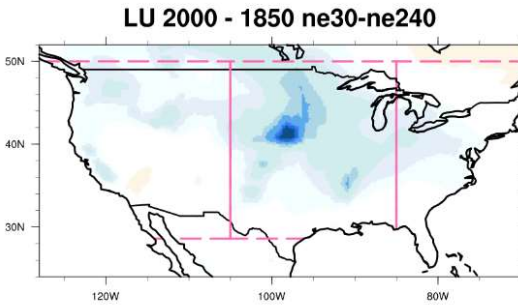


# LULCC Effect on Summer daily max T-2m

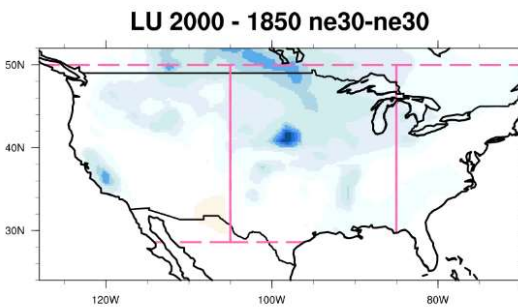
ne240-ne240



ne30-ne240

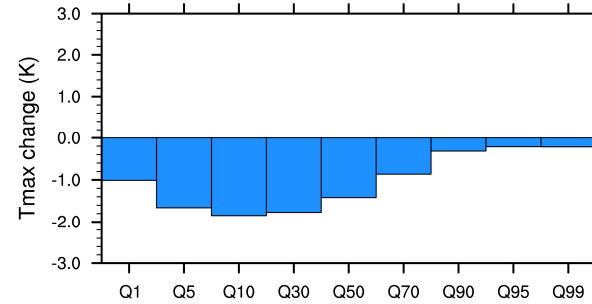


ne30-ne30

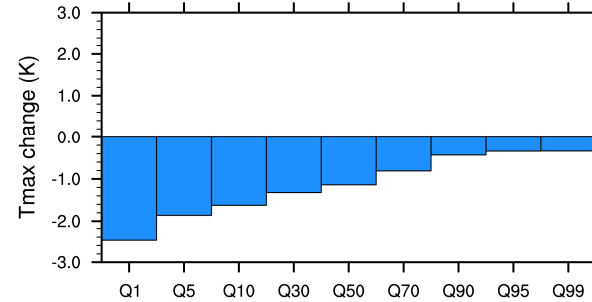


## Quantile of Tmax

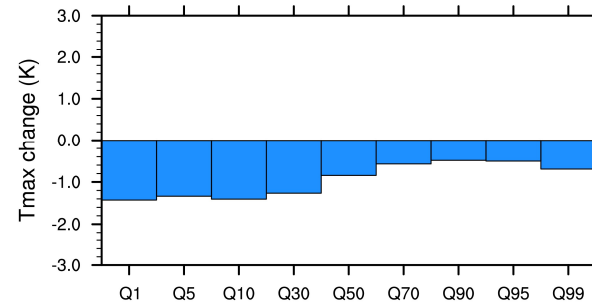
ne240 - ne240



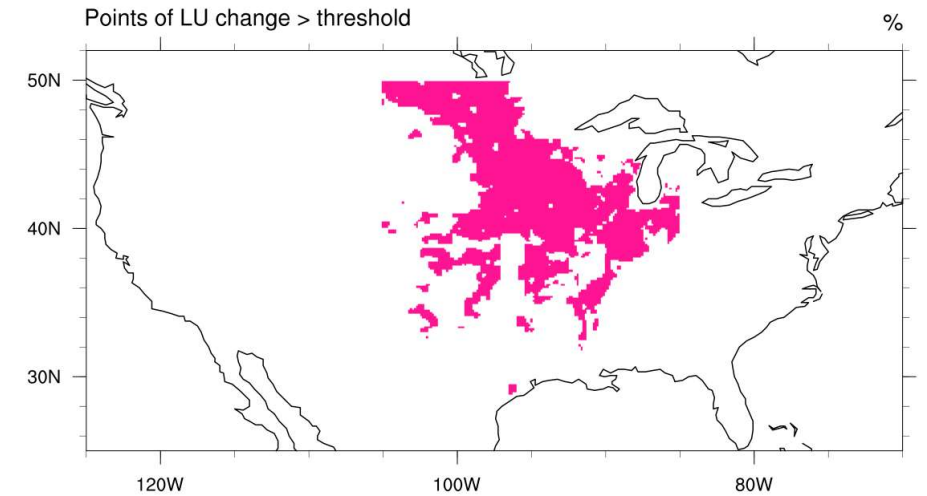
ne30 - ne240



ne30 - ne30



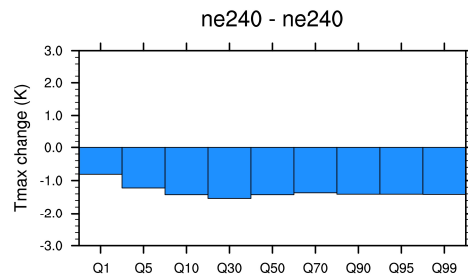
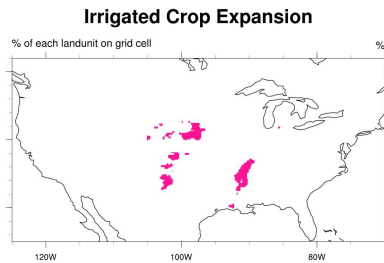
## LU Change > 50%



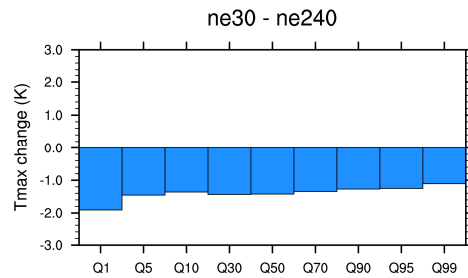
- Cooling in T-2m max primarily over areas of crop expansion over the Midwest;
- Larger cooling effect are at the lower quantiles of max T-2m – up to the 50th percentile.

# Effects of different LU transitions on Summer daily max T-2m

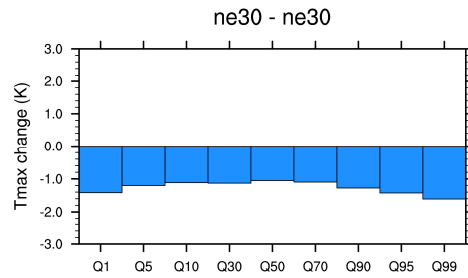
Irrigated cropland (at least 30% of grid cell irrigated)



ne240-  
ne240



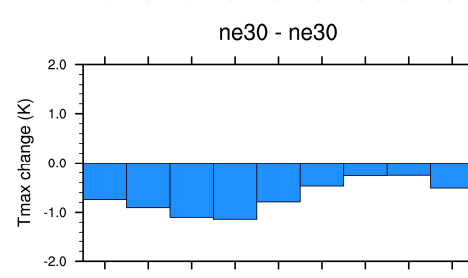
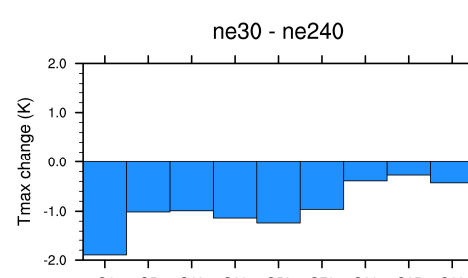
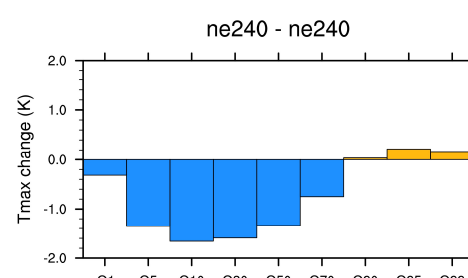
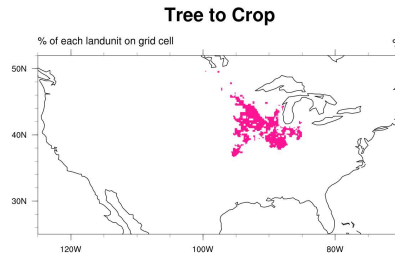
ne 30-  
ne240



ne 30-  
ne30

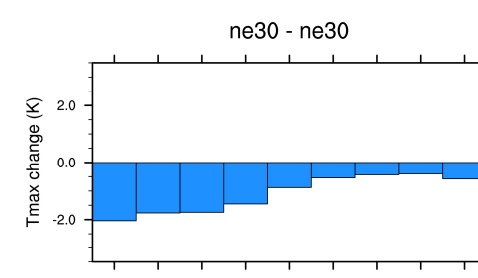
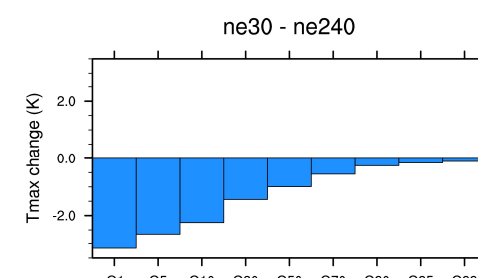
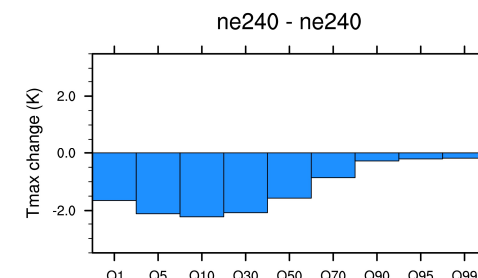
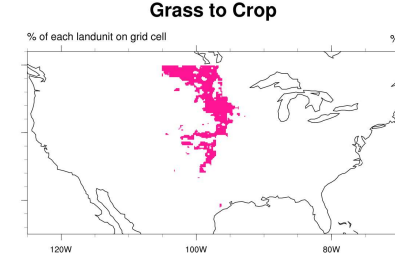
Sustained cooling

Conversion of tree to crop > 50% of grid cell



High Res – warming at higher Q

Conversion of grass to crop > 50% of grid cell



Higher cooling at lower quantiles upto 50<sup>th</sup> perc



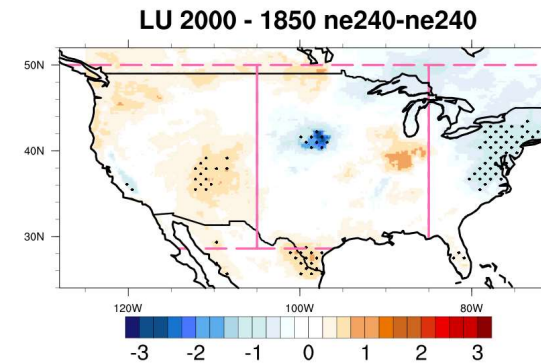
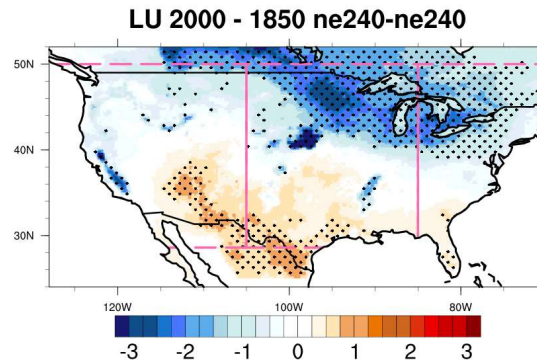
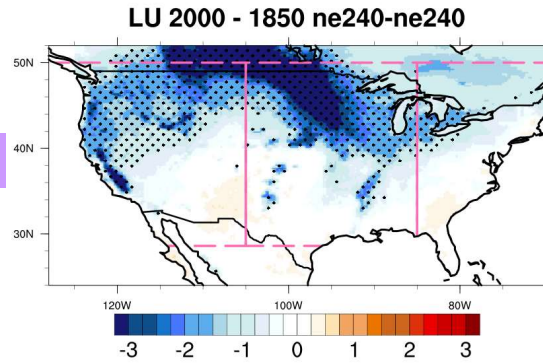
# LULCC Effect on Daily Max T-2m by Month

Jun

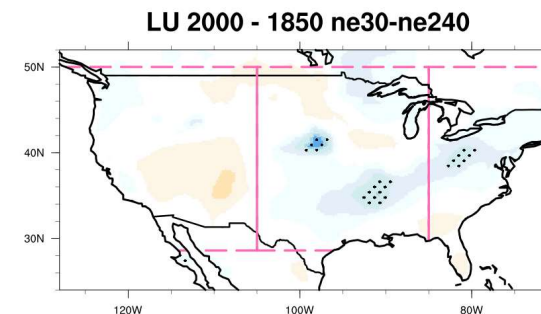
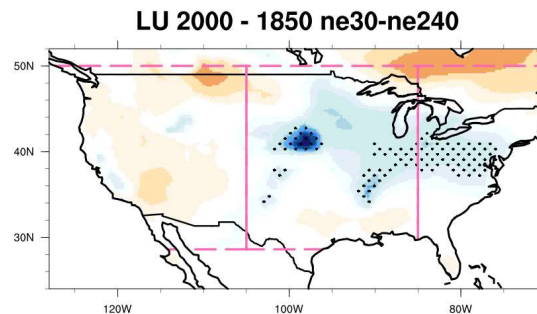
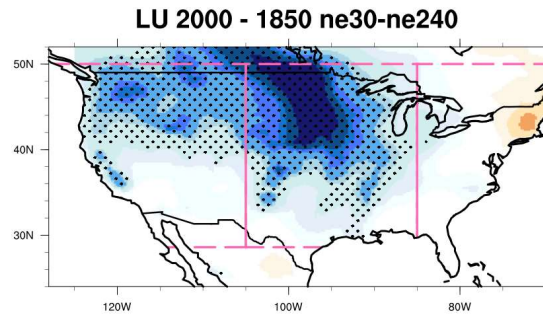
Jul

Aug

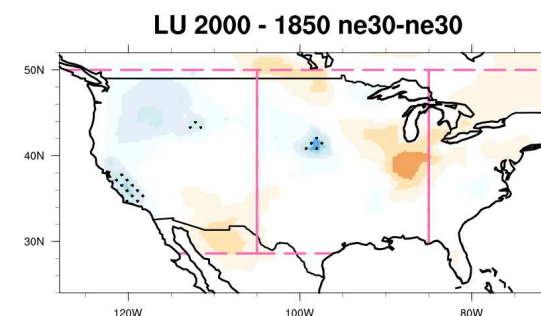
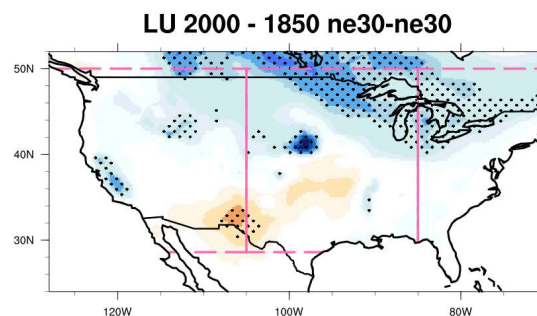
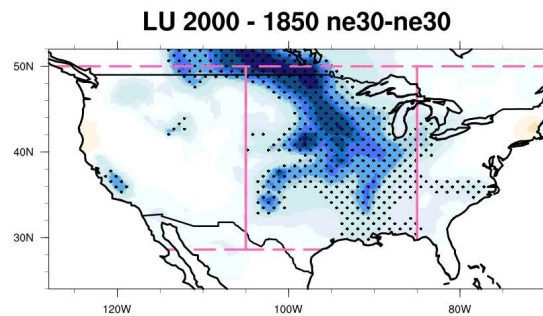
ne240-ne240



ne30-ne240



ne30-ne30



- Maximum cooling in June
- Stronger cooling at high res

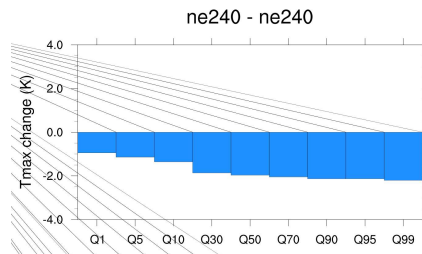
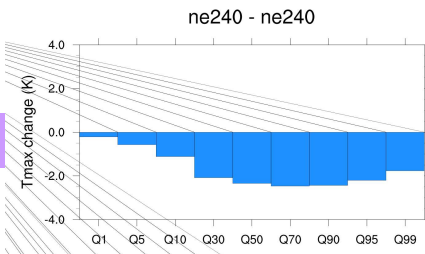
# Variation in the Cooling Effect at Different Quantiles

## Jun: Cooling at higher quantiles

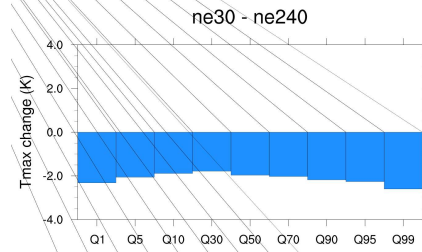
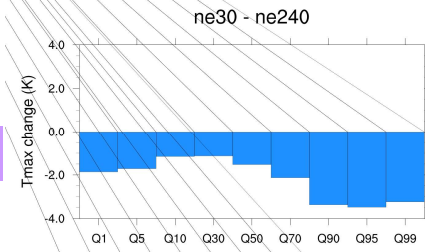
### Tree → Crop Grids

### Irrigated Crop

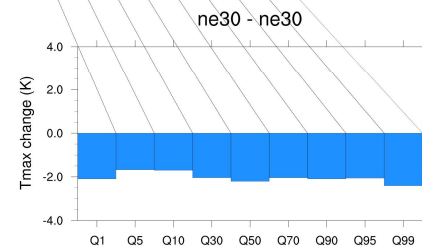
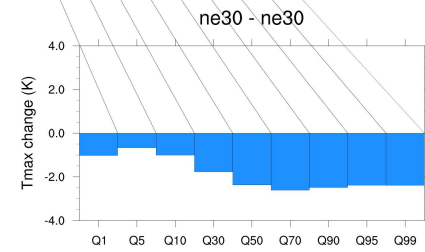
ne240-ne240



ne30-ne240



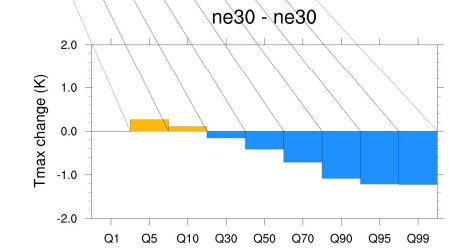
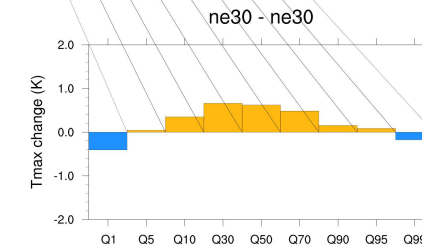
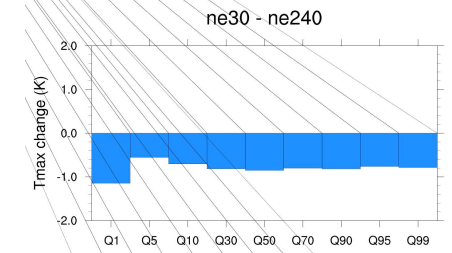
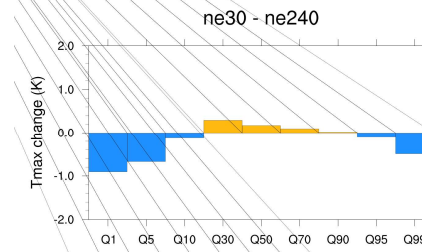
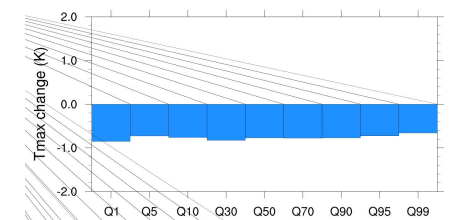
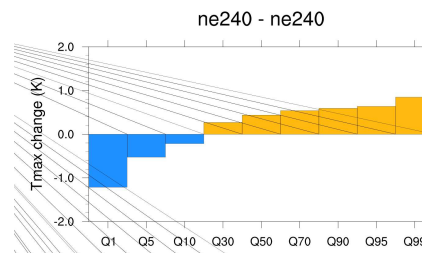
ne30-ne30



## Aug: Warming over Tree-→Crop, Cooling over Irrig

### Tree → Crop Grids

### Irrigated Crop





# Temperature Decomposition

- Land Surface Energy Balance – Partitioning of incoming energy into surface energy fluxes, influencing  $T_s$
- Decomposition of the budget: To understand the contributions of the multiple influences on the Surface Temperature

$$R_n = SW_{in} - LW_{out} + LW_{in} = LH + SH + G$$

$$R_n = (1 - alb)SW_{down} - const * T_s^4 + LW_{down} = LH + SH + G$$

$$\Delta T_s = \frac{1}{const * T_s^3} \left[ \underbrace{[-SW_{in}\Delta(alb)]}_{\text{Albedo term}} + \underbrace{[(1 - alb)\Delta SW_{in}]}_{\text{SW term}} + \underbrace{[\Delta LW_{in}]}_{\text{LW term}} + \underbrace{[-\Delta LH]}_{\text{LH term}} + \underbrace{[-\Delta SH]}_{\text{SH term}} + \underbrace{\Delta R}_{\text{Residual}} \right]$$

## Potential LU change influences:

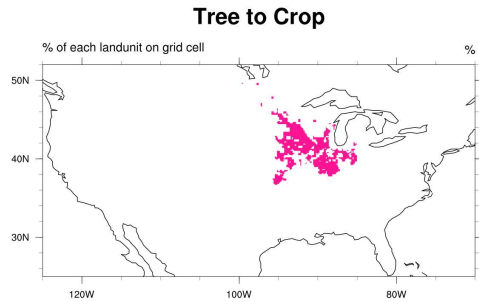
- Change in Surface Albedo
- Change in cloud cover influencing SW & LW rad
- Change in Surface energy partitioning
- Residual (eg: Subsurface energy storage)

- In literature, the method has been applied on monthly data to understand the monthly mean T changes
- Here we apply it on **Composite mean of days > Q90**  
(to understand changes during extreme temperature days)

### References:

- Juang et al. (2007, GRL)  
Luyssaert et al. (2014, Nat. Clim. Ch.)  
Thierry et al. (2017, JGR)

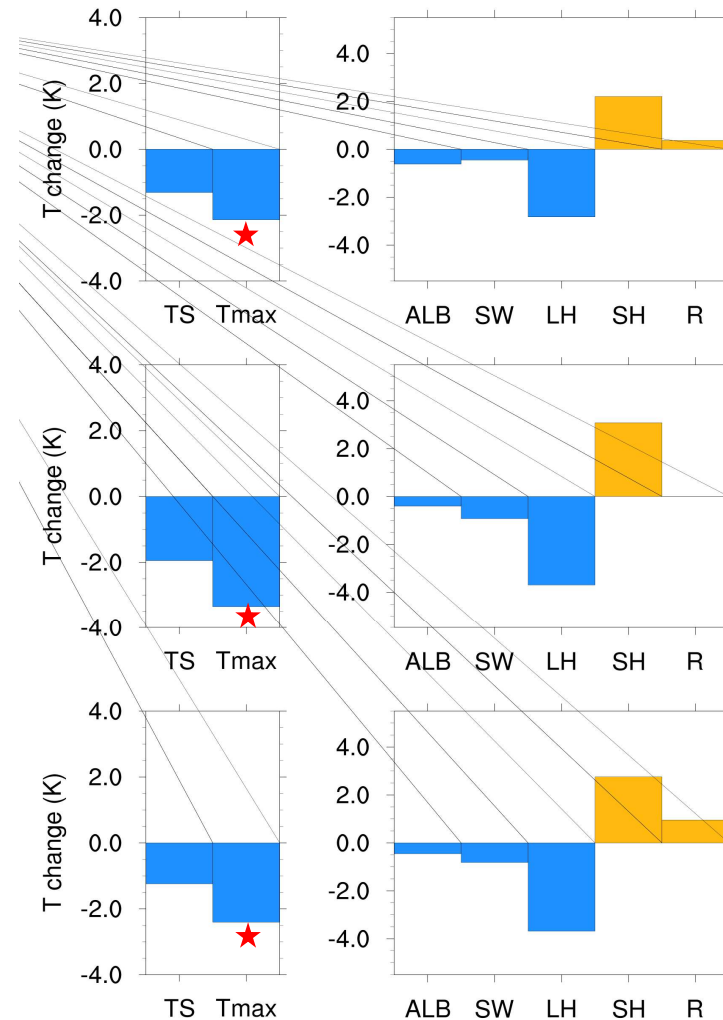
# Temperature Decomposition: Composite of Days with $T_{max} > 90^{th}$ over cell with Tree to Crop Transitions



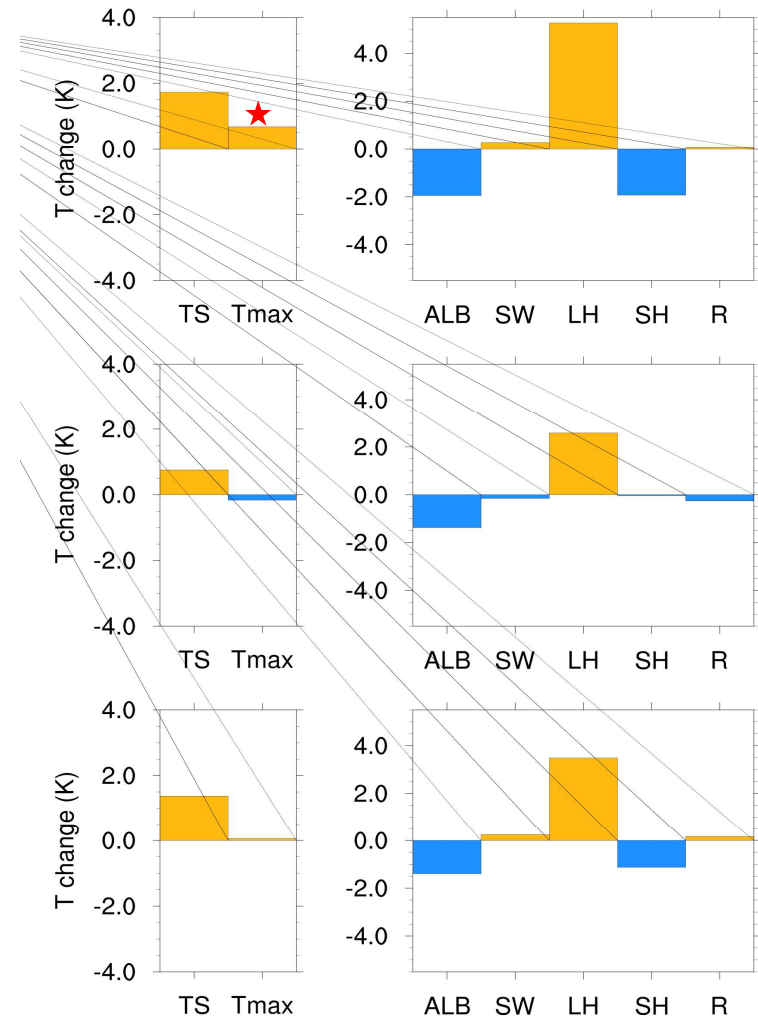
- TS:** Surface Temp
- Tmax:** Tmax
- ALB:** Albedo Term
- SW:** SW Term
- LH:** Latent Heat Term
- SH:** Sensible Heat Term
- R:** Residual (Includes LW term as well)

- Change in **LH-SH partitioning** is the dominant forcing influencing surface temperature
- **Change of sign in LH** forcing from June to Aug result in warming

## June day > Q90: Tree → Crop



## August day > Q90: Tree → Crop



ne240-  
ne240

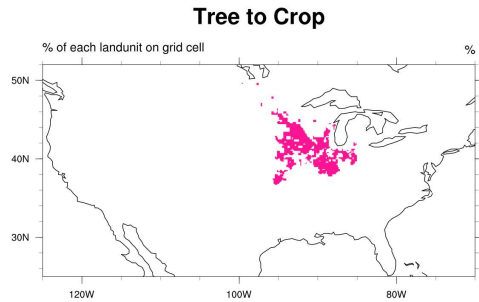
ne 30-  
ne240

ne 30-  
ne30

★ At least 75% of the grids show changes significant at 95%

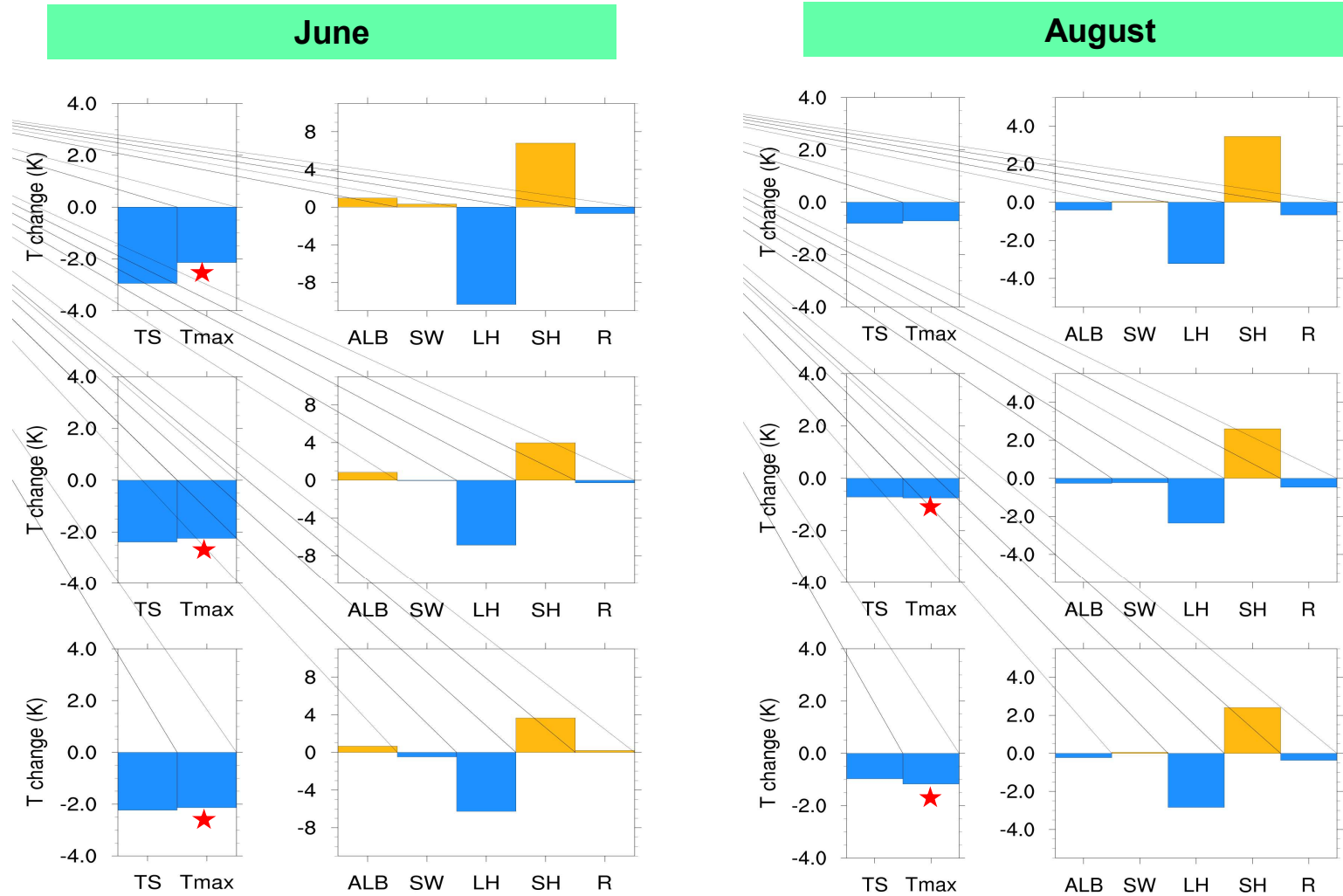


# Temperature Decomposition: Composite of Days with $T_{max} > 90^{th}$ over cell with Irrigated Crop Expansions



- TS:** Surface Temp
- Tmax:** Tmax
- ALB:** Albedo Term
- SW:** SW Term
- LH:** Latent Heat Term
- SH:** Sensible Heat Term
- R:** Residual (Includes LW term as well)

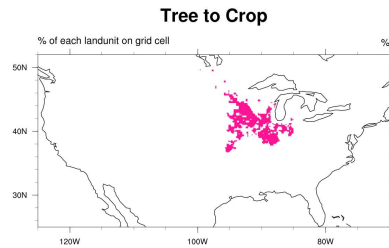
- Sign of changes in **LH-SH partitioning** remain the same – and it is the dominant forcing on surface temperature
- **Lower magnitude in Aug** compared to June



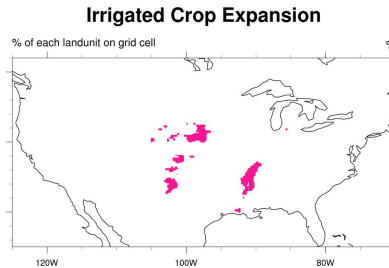
★ At least 75% of the grids show changes significant at 95%

# Mechanism of LH flux changes: Composite of days with $T_{max} > 90$ th percentile

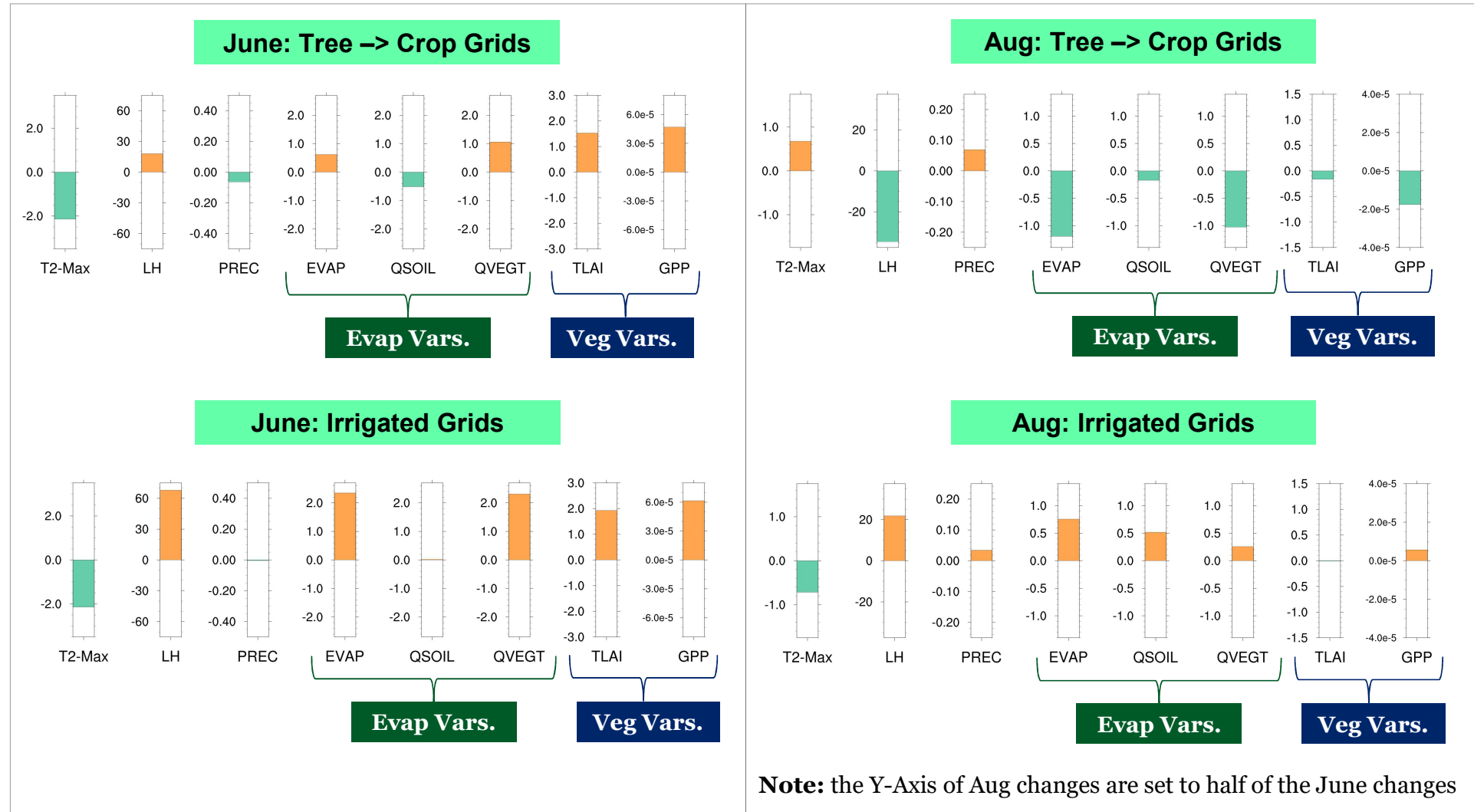
ne240-  
ne240



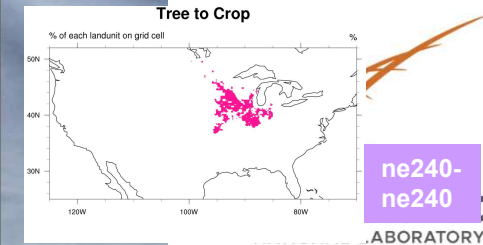
ne240-  
ne240



- T2-Max:**  $T_{max}$  (K)
- LH:** Latent Heat Flux ( $W/m^2$ )
- PREC:** Precipitation (mm/day)
- EVAP:** Total Evaporation (mm/day)
- QSOIL:** Soil Evaporation (mm/day)
- QVEGT:** Vegetation Transpiration (mm/day)
- TLAI:** Leaf Area Index ( $m^2/m^2$ )
- GPP:** Gross Primary Productivity ( $gC/m^2/s$ )





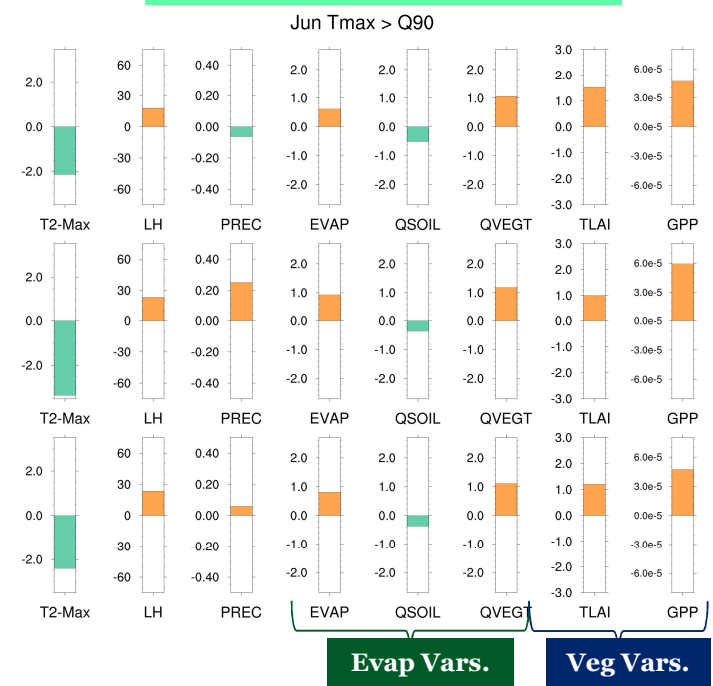


ne240-ne240

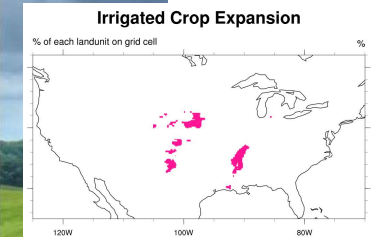
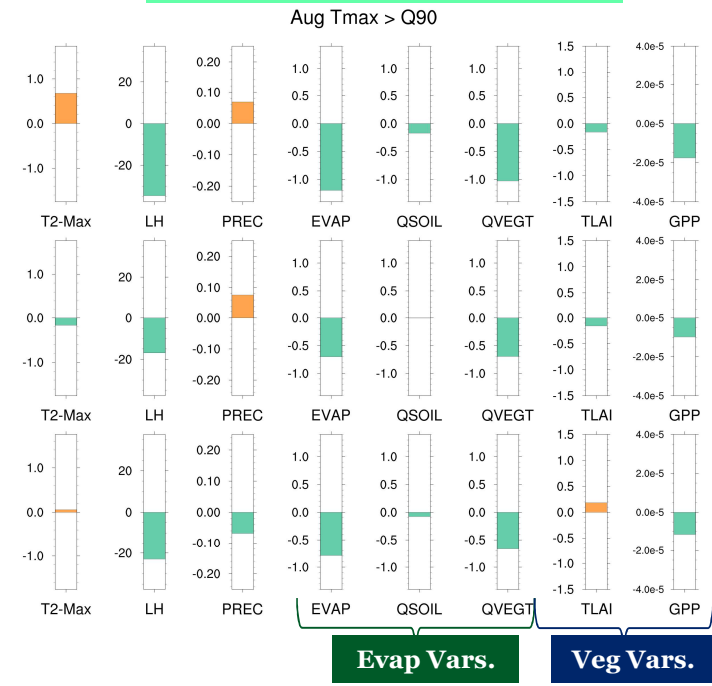
ne 30-ne240

ne 30-ne30

### June: Tree → Crop Grids



### Aug: Tree → Crop Grids

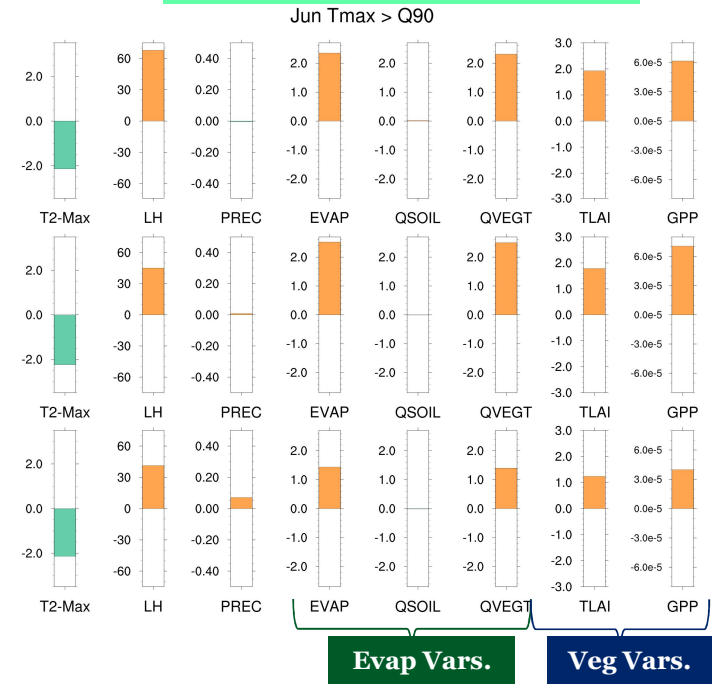


ne240-ne240

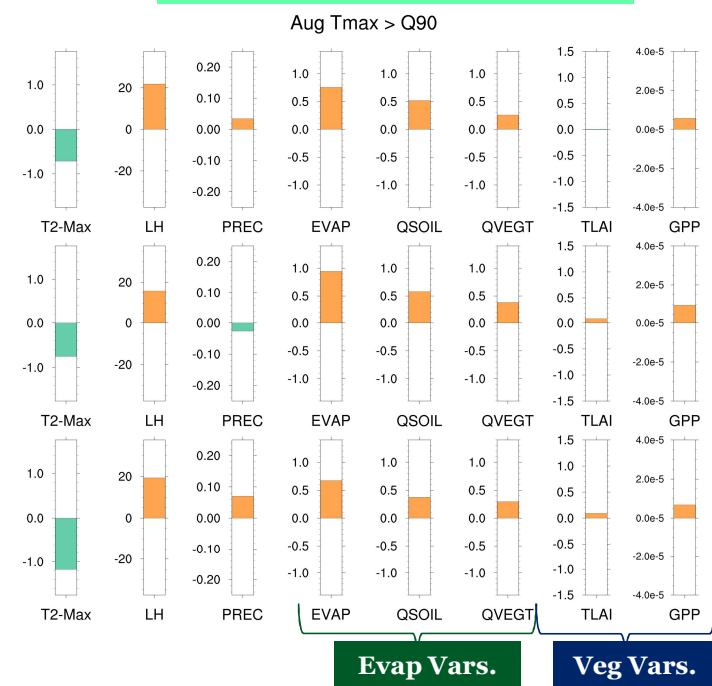
ne 30-ne240

ne 30-ne30

### June: Irrigated Grids



### Aug: Irrigated Grids



## Mechanism of LH flux changes: Effect of resolution

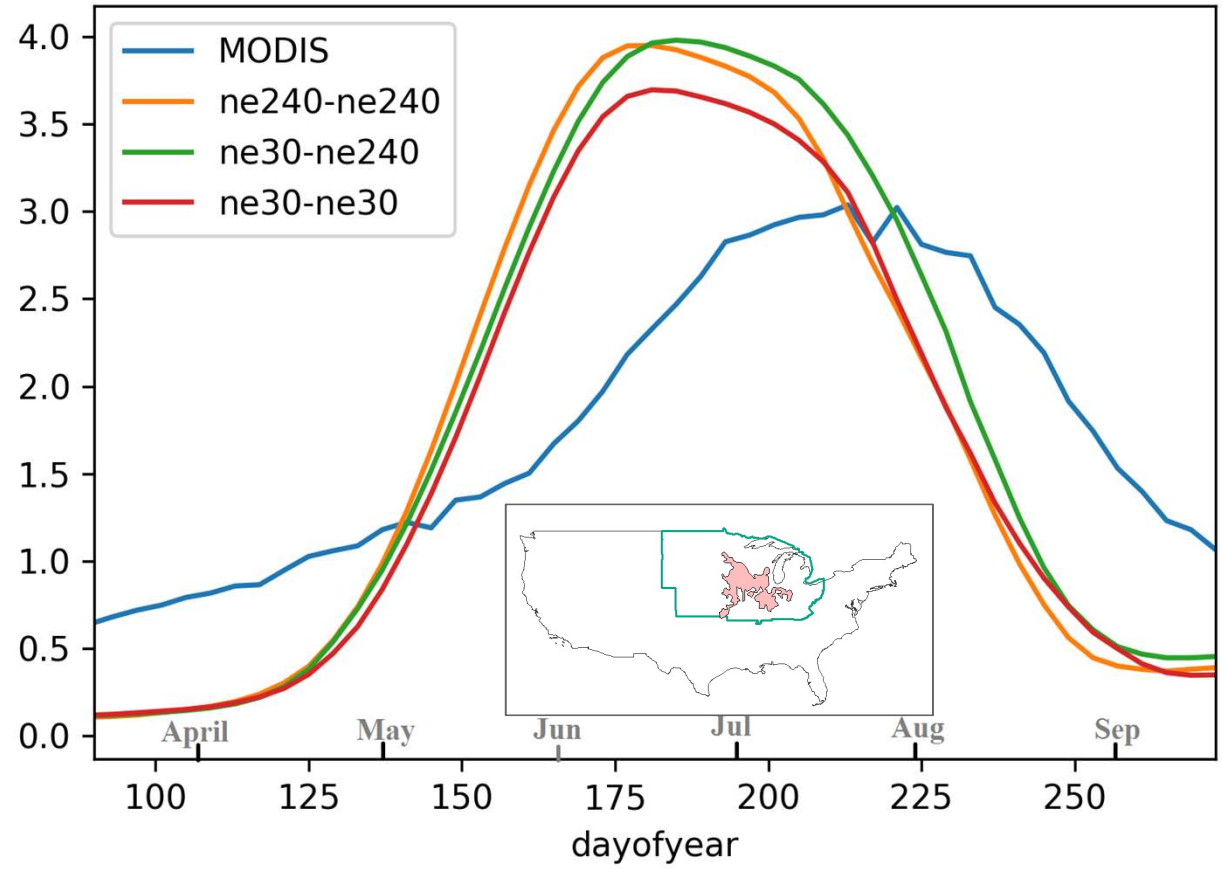
- Broadly, **same conclusions** can be drawn from the ne30-ne240 and ne30-ne30 experiments
- **Aug Tree to Crop – Changes are of lower magnitude** in the coarse atm simulations – resulting in insignificant T-changes

- T2-Max:** Tmax (K)
- LH:** Latent Heat Flux (W/m<sup>2</sup>)
- PREC:** Precipitation (mm/day)
- EVAP:** Total Evaporation (mm/day)
- QSOIL:** Soil Evaporation (mm/day)
- QVEGT:** Vegetation Transpiration (mm/day)
- TLAI:** Leaf Area Index (m<sup>2</sup>/m<sup>2</sup>)
- GPP:** Gross Primary Productivity (gC/m<sup>2</sup>/s)

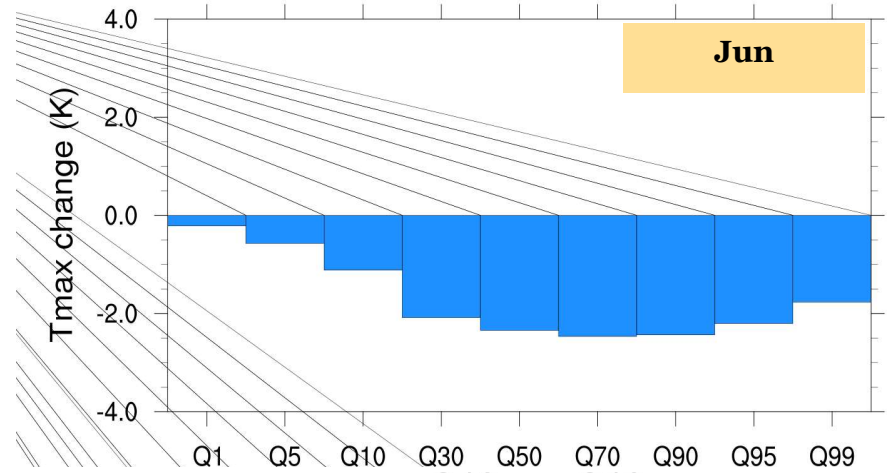


# Shift in Crop Phenology compared to Observations

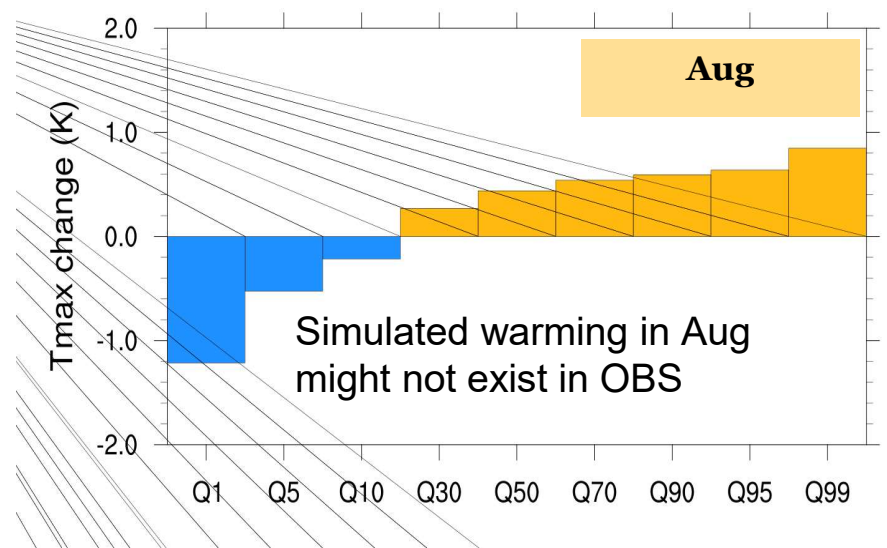
LAI- Tree to Crop Grids



ne240 - ne240



ne240 - ne240



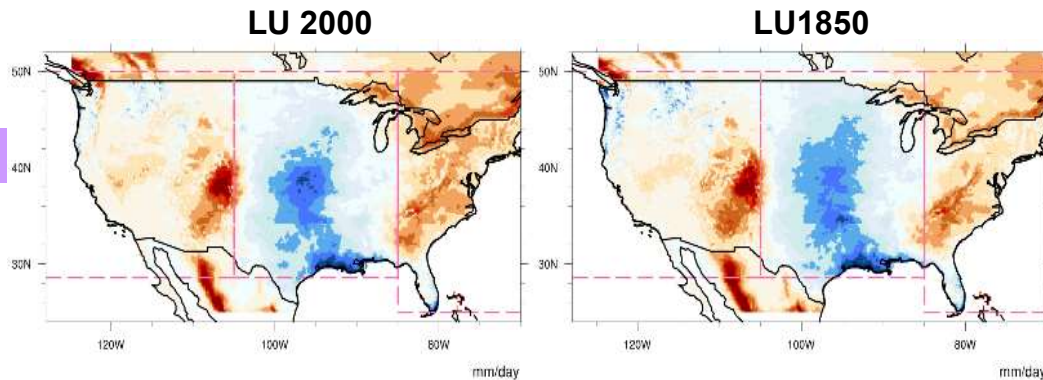


## Summary of LULCC effect on temperature

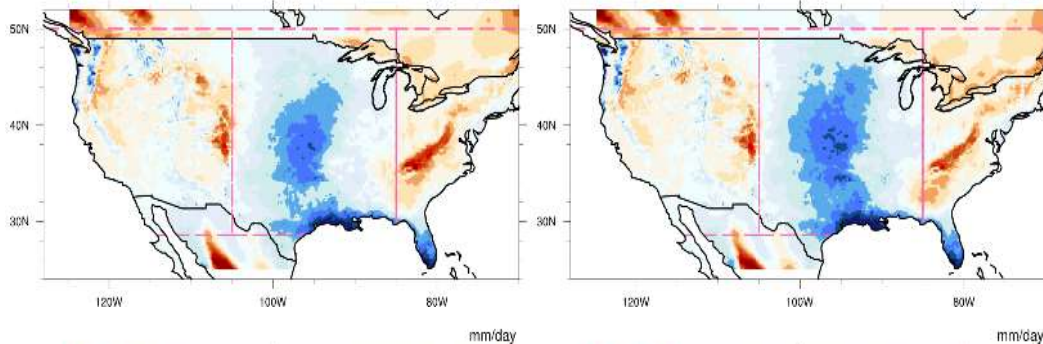
- ❑ Cooling over the Central US is clearly caused by land use change:
  - Irrigated grids : show persistent cooling at all quantiles of Tmax, throughout the summer
  - Areas of tree to crop transitions show cooling at higher quantiles during the peak growing season in the model. With drop in LAI and productivity of crops (harvest) towards the end of model growing season, this changes to a significant warming (at high-res).
- ❑ Increasing land model resolution is key to reduce temperature bias over the central U.S.;
- ❑ Surface temperature decomposition shows that the change in SH-LH partitioning is the dominant influence on surface T change.
- ❑ The LH changes are dominated by vegetation transpiration, and hence the effect on Tmax extremes is strongly tied to agricultural intensification.

# Skill in simulating warm-season precipitation: comparison to NLDAS, April to August

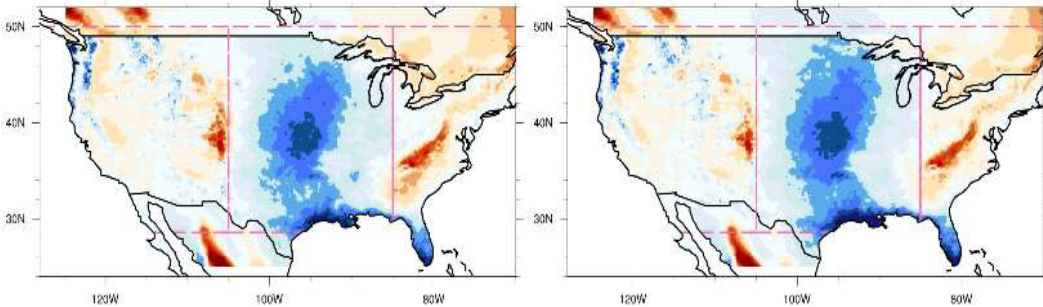
ne240-ne240



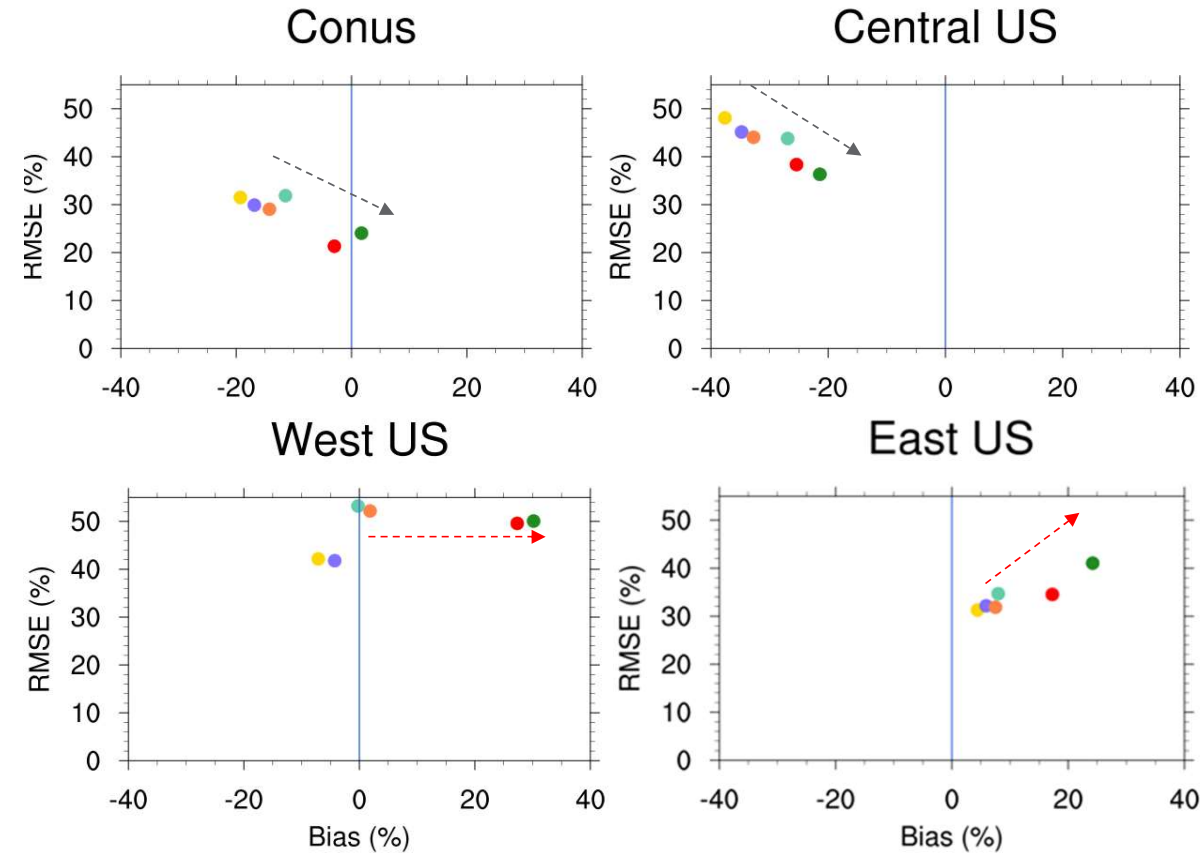
ne30-ne240



ne30-ne30



**CONUS and Central US:** Precipitation improves with resolution  
(At the same res, more accurate LU shows lower errors)  
**Western and Eastern US :** Deteriorates



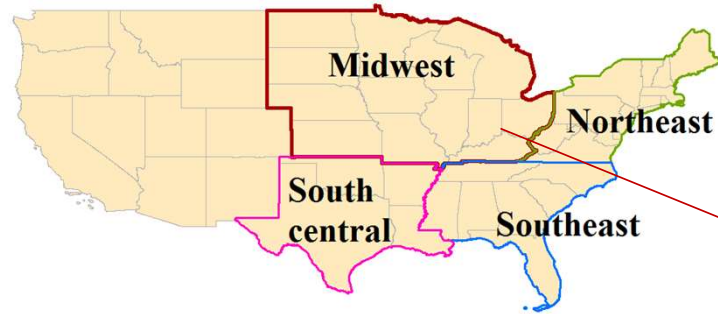
- LU2000:ne240-ne240
- LU1850:ne240-ne240
- LU2000:ne30-ne240
- LU1850:ne30-ne240
- LU2000:ne30-ne30
- LU1850:ne30-ne30

----->  
Improved error statistics

----->  
Worsened error statistics



# Skill in simulating warm-season precipitation: comparison to NLDAS, April to August



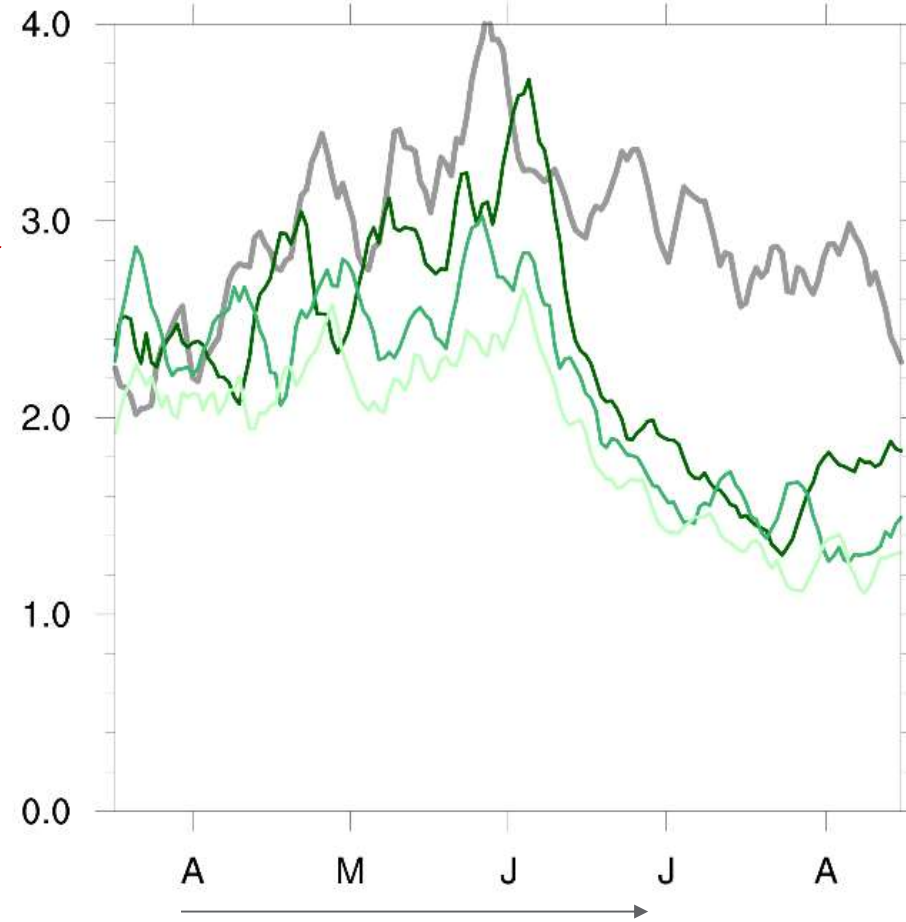
## Region average rainfall - Midwest

— OBS

— LU2000:ne30-ne30

— LU2000:ne30-ne240

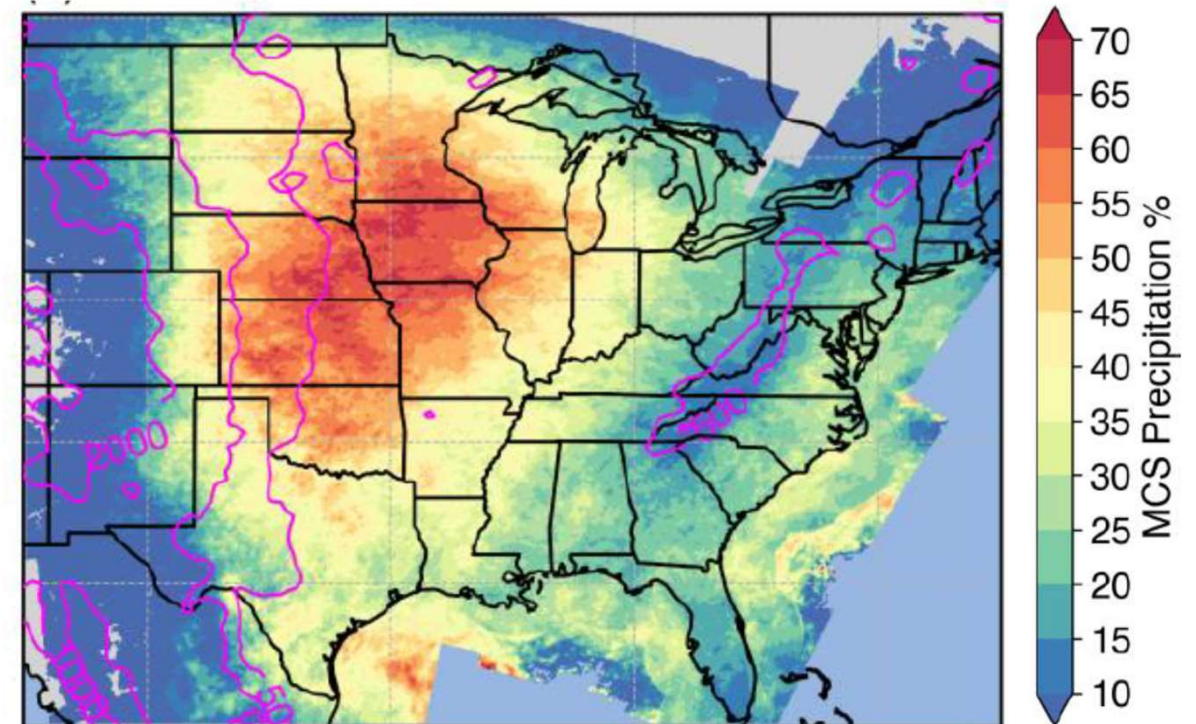
— LU2000:ne240-ne240



*Apr to Aug*

# Tracking Mesoscale Convective System (MCS)–Like Features

- ❑ MCSs account for over 50% of warm season precipitation in the central U.S., which can only be captured in high-res models;
- ❑ Underestimated convective clouds could result in excessive downward shortwave radiation and hence enhanced heating of the surface layers.
- ❑ Lack of prolonged and intense convective precipitation from MCSs could lead to drier soils and hence overestimated Bowen ratios, further enhancing the excess heating of the surface.
- ❑ The FLEXTRKR algorithm developed by Feng et al. 2016 is used to track MCSs.



Spatial distribution of the fraction of summer MCS precipitation (2004–2016) (Feng et al., 2016)



# LULCC-induced total and MCS precipitation changes LU2000 vs. 1850 for the period of 1999-2010

April

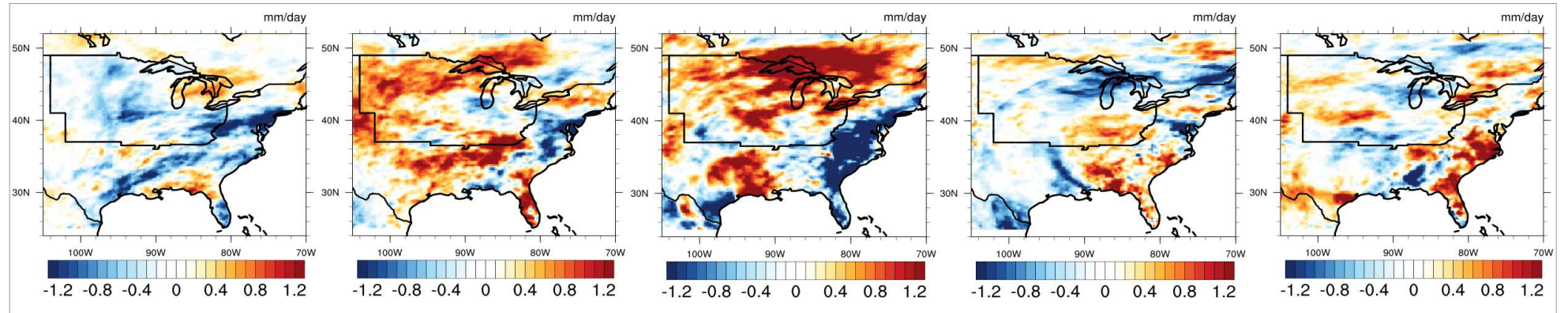
May

June

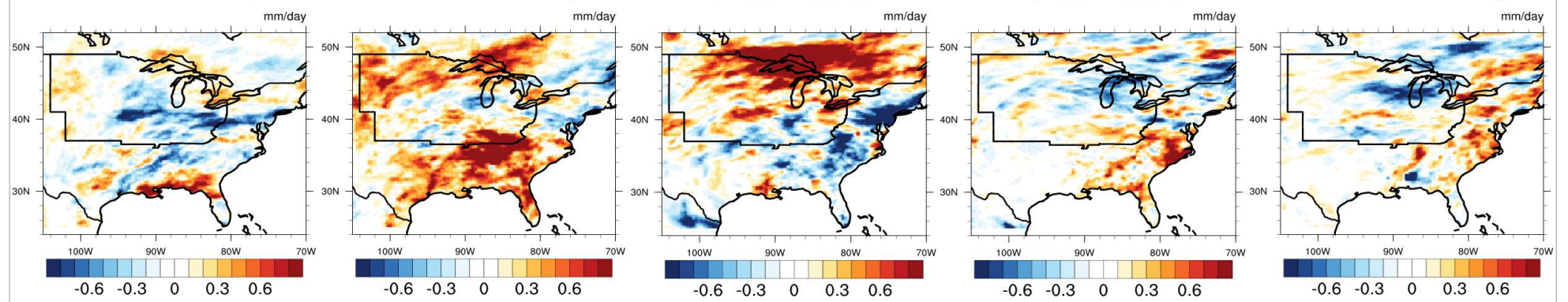
July

Aug

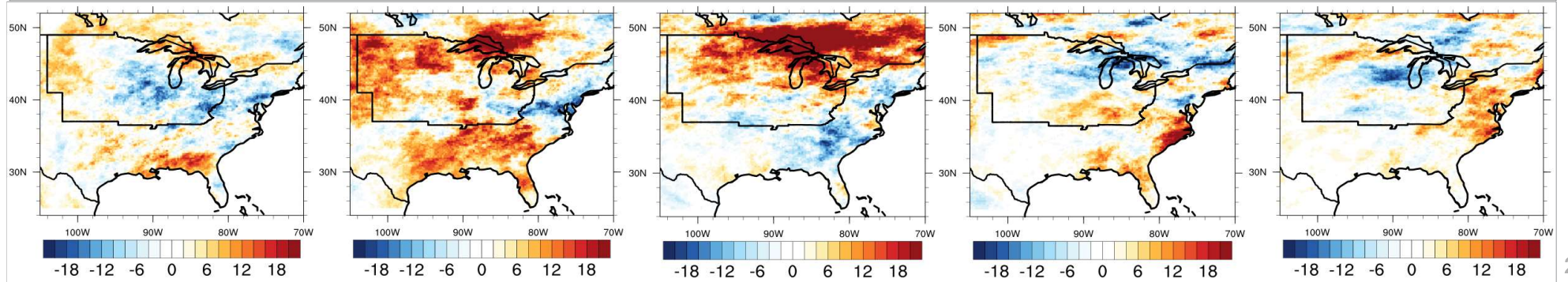
$\Delta P$  (mm)



$\Delta$  MCS P (mm)

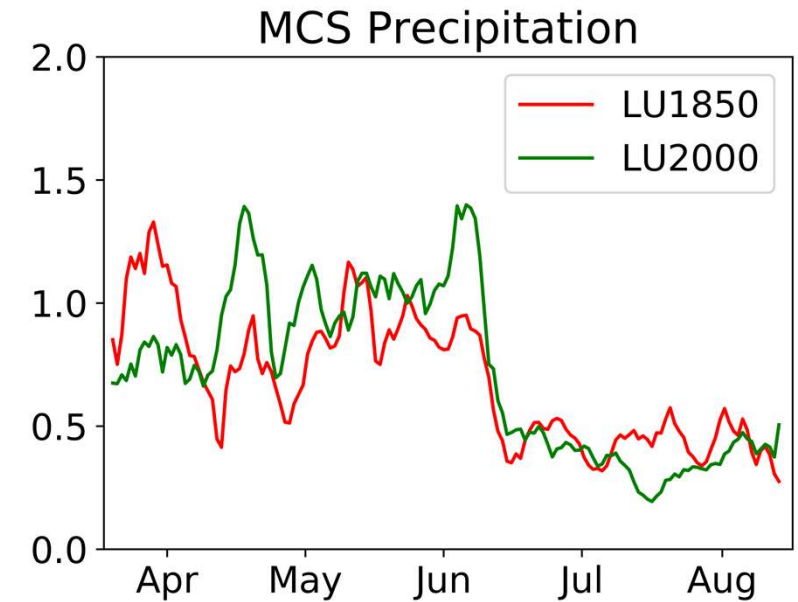
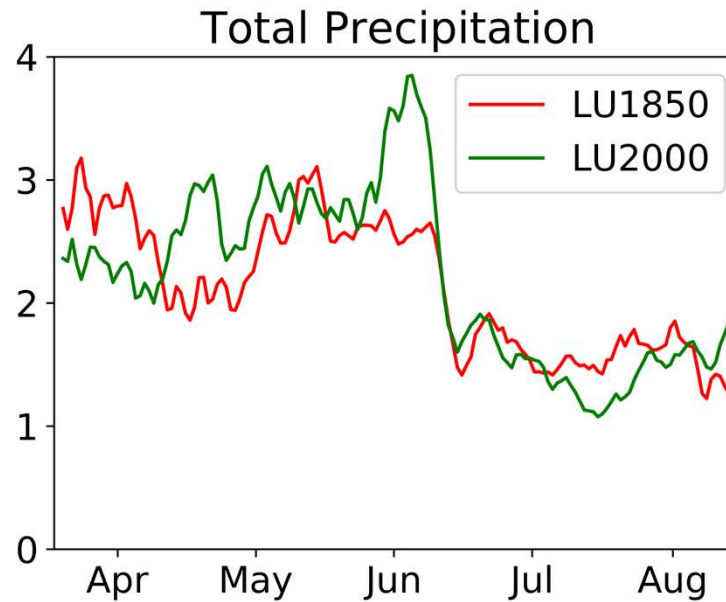


$\Delta$  MCS Frequency  
(Average #/cell)



# Midwest: Changes in Total and MCS Precipitation (1999-2010)

- ❑ MCSs are the main contributor of total precipitation changes in May;
- ❑ Their contribution in June is lower but still significant.



### Statistically Sig Changes (@ 95%)

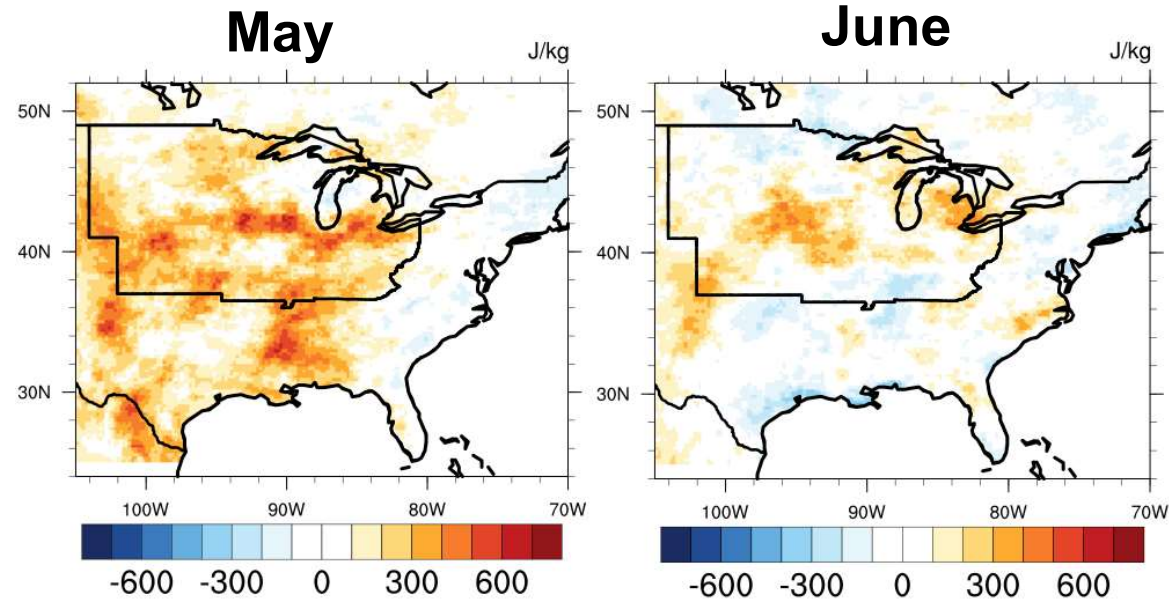
Month	Total P LU2000 – 1850	MCS P LU2000-1850	% of Total P change from MCSs
May	+0.28 mm/day*	+0.21 mm/day	76%
Jun	+0.44 mm/day	+0.19 mm/day	43%

\* Statistically sig @ 90%, other Total P and MCS P numbers sig @ 95%

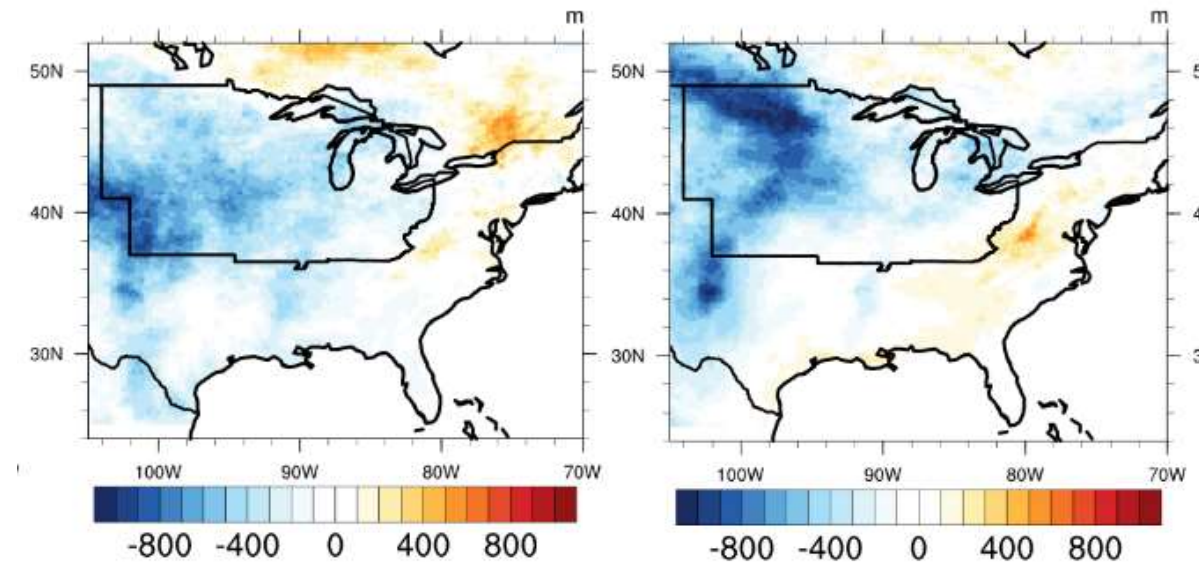


# Difference in CAPE and LCL at local time 6pm LU2000 vs. 1850 for the period of 1999-2010

$\Delta$  CAPE

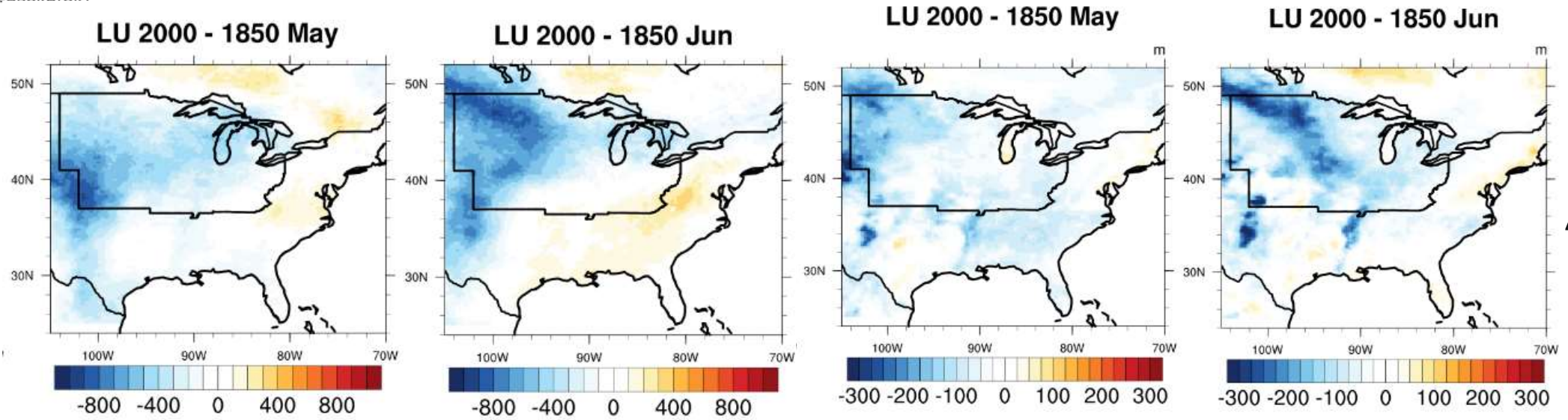


$\Delta$  LCL



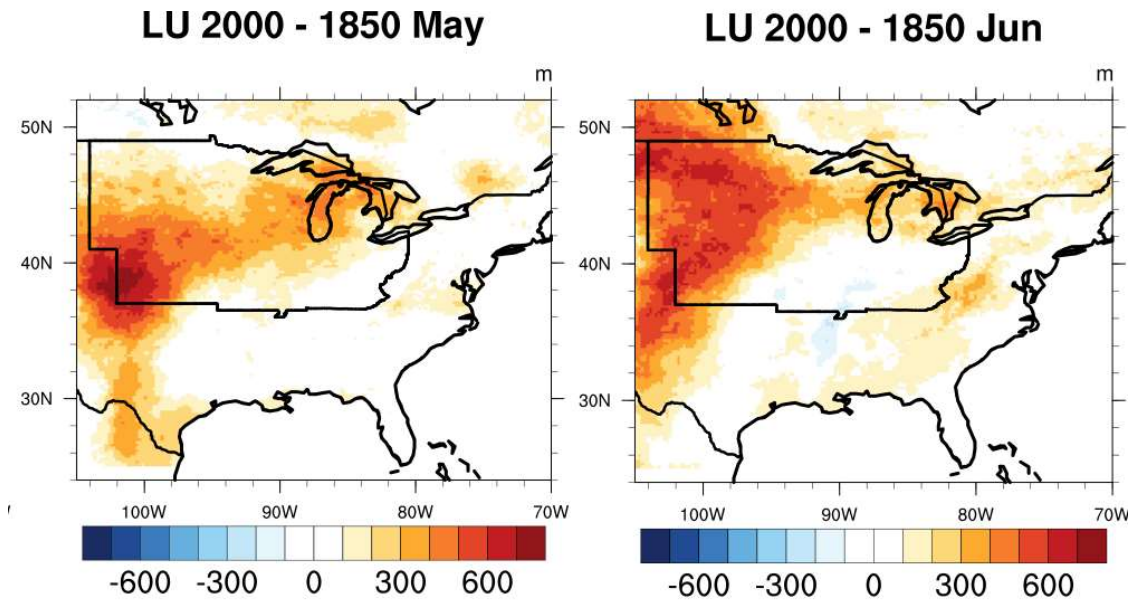
# The reduction in LCL is larger than in PBL allowing more parcels to cross LCL

$\Delta LCL$



$\Delta PBL$

$|\Delta LCL| - |\Delta PBL|$



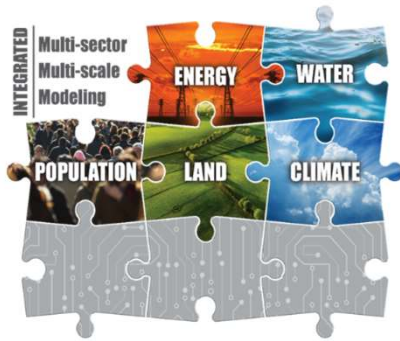


## Conclusion

- ❑ Skills in simulating mean **temperature and precipitation over the CONUS** increases with resolution and more accurate land use
- ❑ **Land use, through both land cover and land management (irrigation and fertilization) changes, is the dominant factor** influencing temperature skill in central US;
- ❑ **Resolution is the dominant factor** influencing precipitation skill;
- ❑ When computational resource is a constrain, a **higher land resolution still enhances skill in simulating regional mean climate;**
- ❑ **High-res land-atm simulations** show consistently better **spatial patterns of temperature;**
- ❑ The ability of high-res models in simulating **LULCC-induced surface energy budget changes, land-atmosphere coupling, and mesoscale convection systems** is the major contributor to improved precipitation and temperature simulations over the central U.S.



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**Thank You**