

# Introduction to dynamic irrigation models in Noah-MP

Fei Chen

Research Applications Laboratory, NCAR

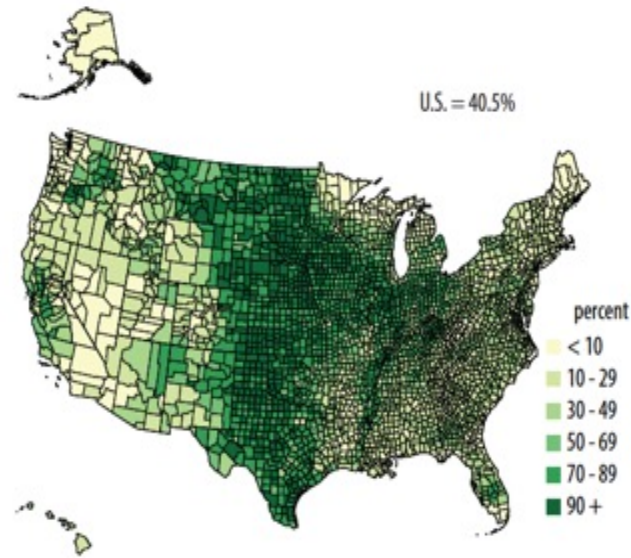
Contributors: Michael Barlage, Valayamkunnath, David Gochis, Roy Rasmussen (NCAR); Xing Liu and Dev Niyogi (Purdue U), Zhe Zhang and Yanping Li (U Saskatchewan), Xiaoyu Xu (Nanjing University of Information Science and Technology), Tongren Xu (Beijing Normal University)

5 November 2021, GLASS/GHP Irrigation Initiative meeting

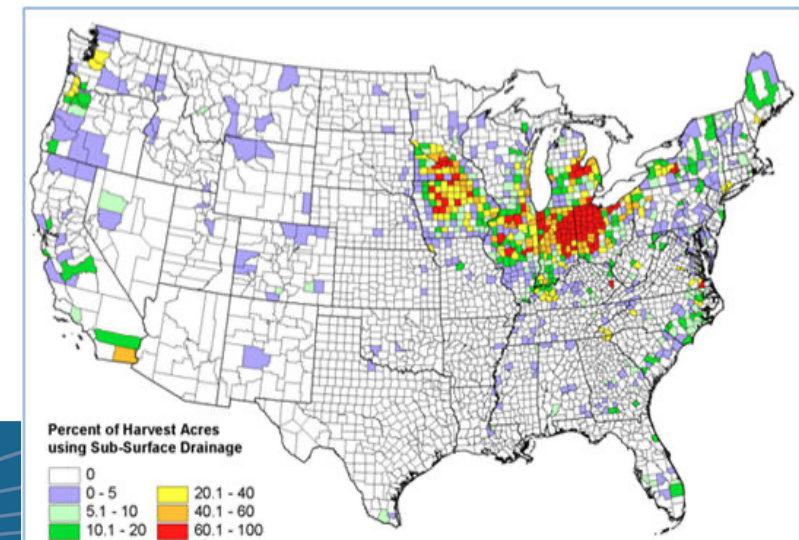
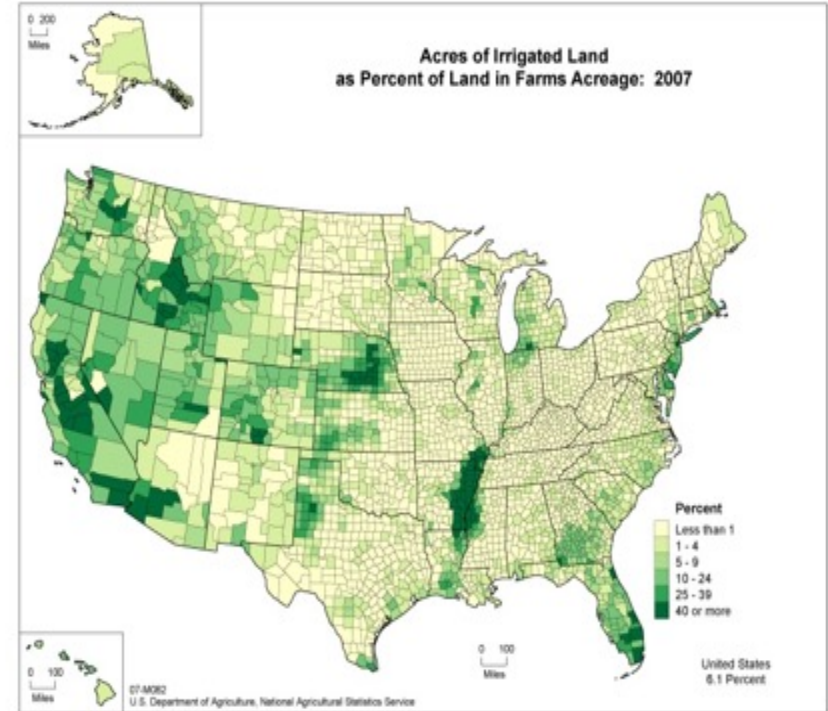
# Agriculture Lands and Management in the U.S.

- 90% of some regions in Great Plains are agricultural lands.
- Irrigation in most Ag regions ~40% of total freshwater withdrawals.
- Extensive use of subsurface tile drainage in Upper Mississippi River Basin (UMRB).
- These ag processes modify surface and energy budgets and influence weather and climate

U.S. Farmland as Percent of Land Area, by County, 2012

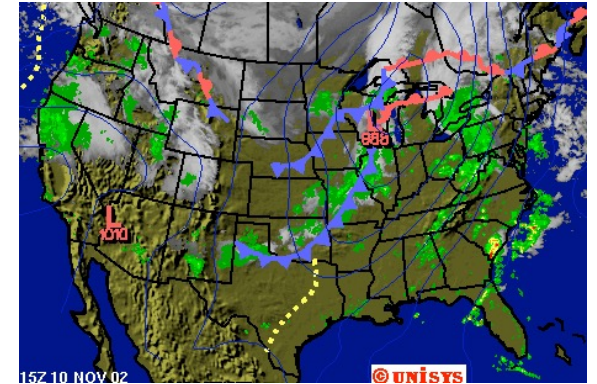


Source: USDA NASS, 2012 Census of Agriculture.

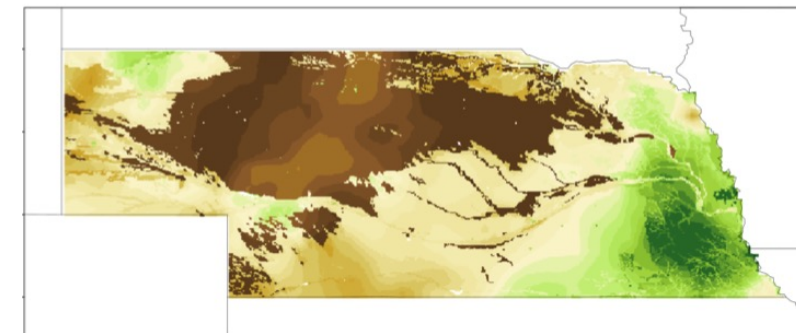


# Agriculture Modeling Related Projects (NCAR/RAL/HAP)

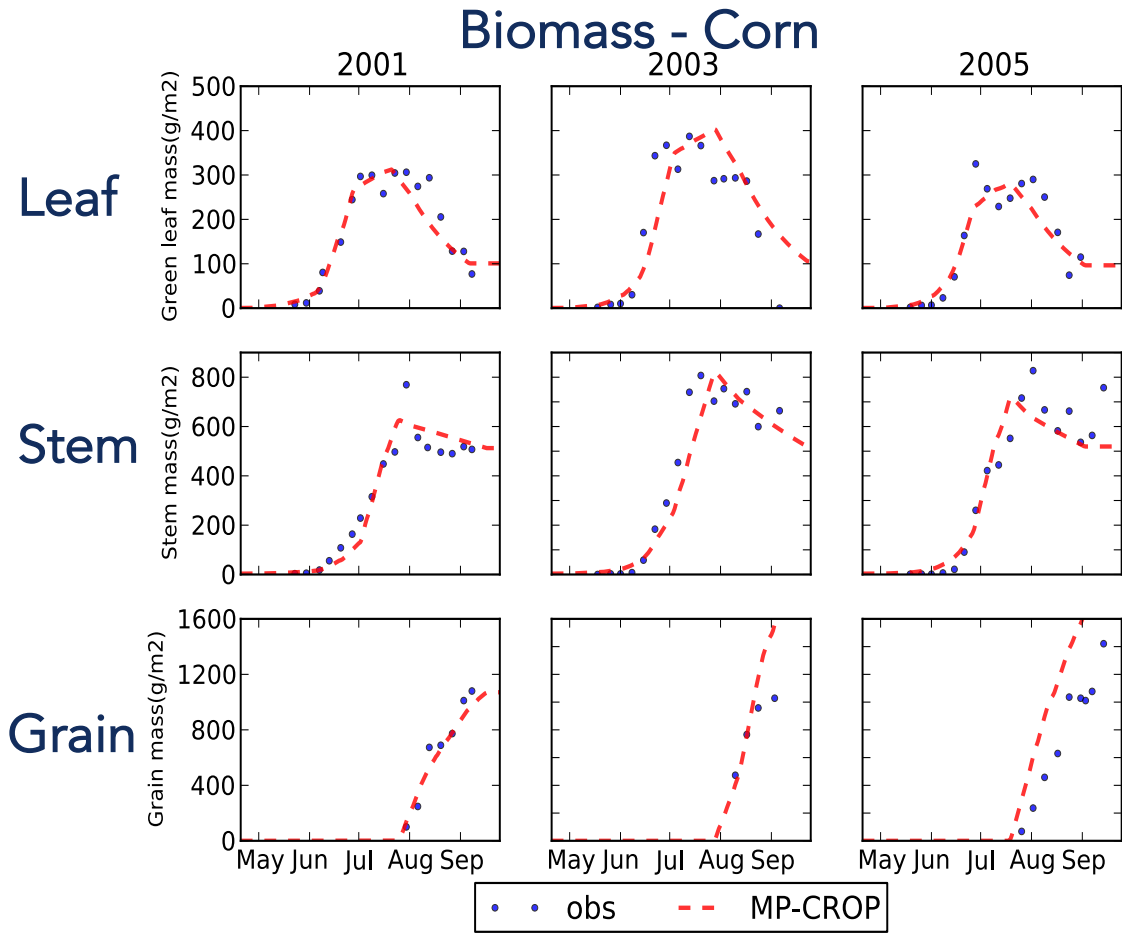
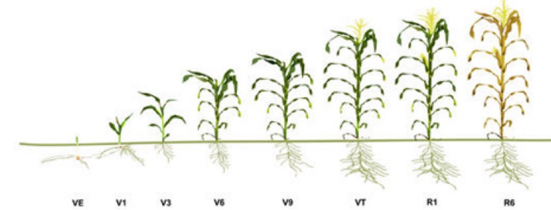
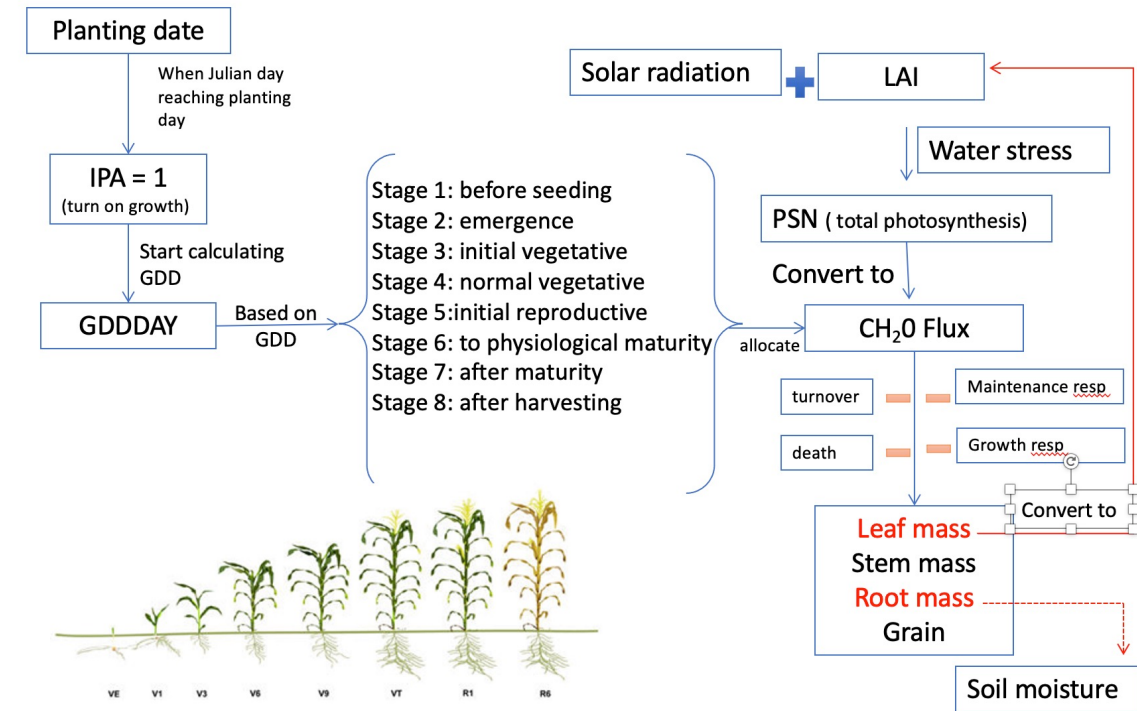
- **NSF/USDA EaSM (collaboration with ASU):** couple urban and agriculture models to the Weather Research and Forecasting (WRF) model coupled to Noah-MP.
- **NSF INFEWS (collaboration with GMU):** develop field-scale irrigation forecast to save 10% irrigation water in Nebraska.
- **NOAA JTTI (collaboration with ISU):** improve representation of crop/irrigation/tile-drainage processes in the operational National Water Model using the Noah-MP.
- **NCAR Water System:** crop-atmosphere interactions in WRF 4-km regional climate simulations over CONUS.
- **Understand the crop-water-atmosphere nexus from continental scales to field scales**
- **Develop modeling tools to predict crop yield and irrigation demand for Ag decision systems**



Soil Moisture [volumetric]



# Noah-MP-Crop Model Framework



Field scale evaluations using AmeriFlux data from 1) Bondville, IL (2001, 2003, 2005), corn, rainfed; and 2) Mead, NE (2002, 2004, 2006), soybean, rainfed.

## Journal of Geophysical Research: Atmospheres

### RESEARCH ARTICLE

10.1002/2016JD025597

#### Key Points:

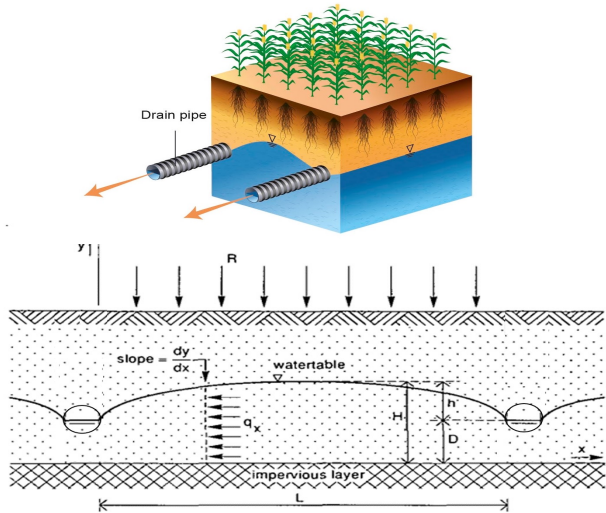
- 1.Noah-MP-Crop is able to capture the

### Noah-MP-Crop: Introducing dynamic crop growth in the Noah-MP land surface model

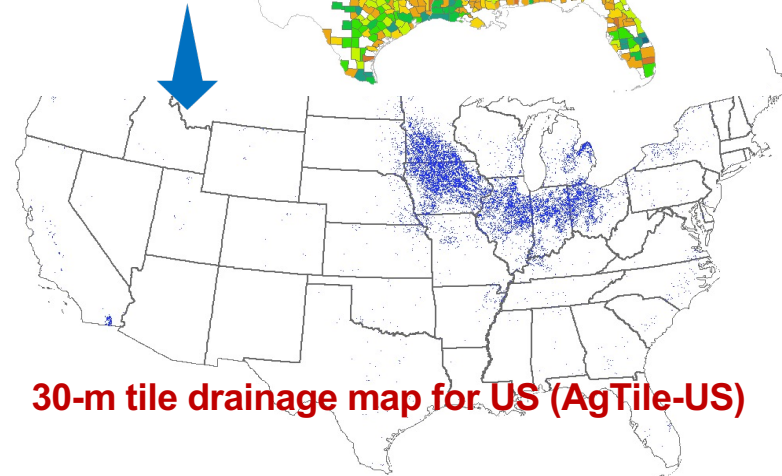
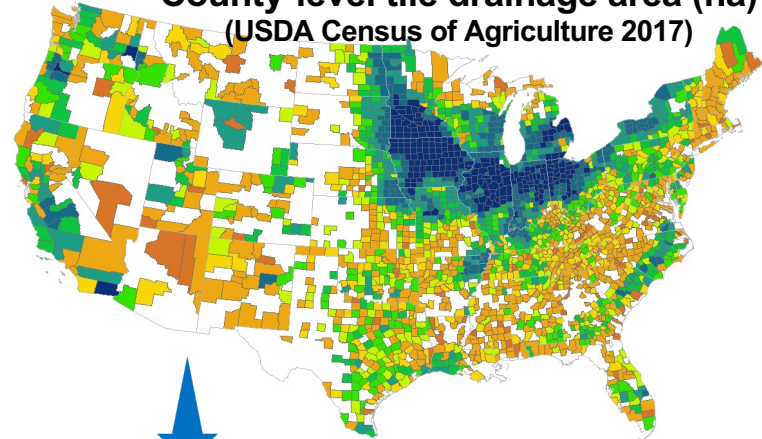
Xing Liu<sup>1</sup>, Fei Chen<sup>2</sup>, Michael Barlage<sup>2</sup>, Guangsheng Zhou<sup>3</sup>, and Dev Niyogi<sup>1</sup>

# Develop a tile drainage parameterization and high-resolution mapping of tile drained croplands for National Water Model

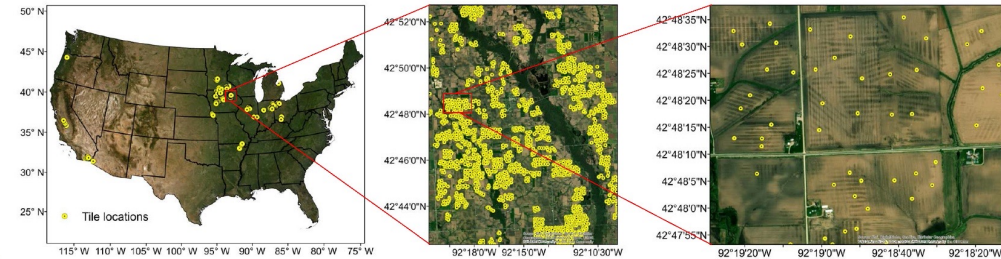
Implemented the Hooghoudt equation-based tile-drainage parameterization.



County-level tile drainage area (ha)  
(USDA Census of Agriculture 2017)



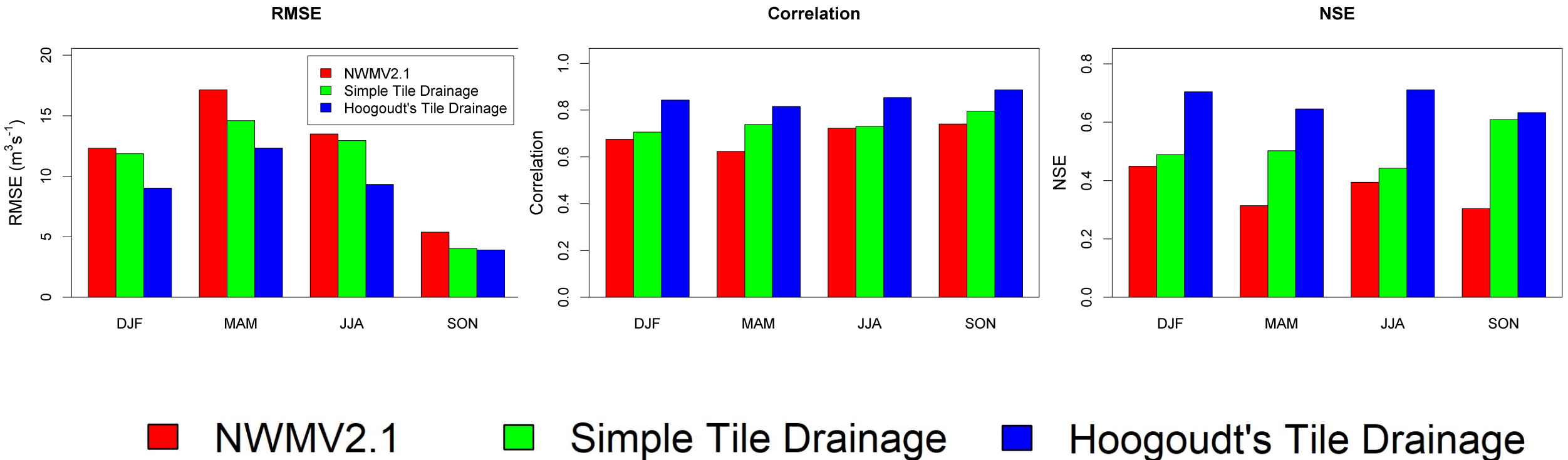
30-m tile drainage map for US (AgTile-US)



30-m AgTile-US data: Valayamkunnath et al. 2020: Scientific Report.

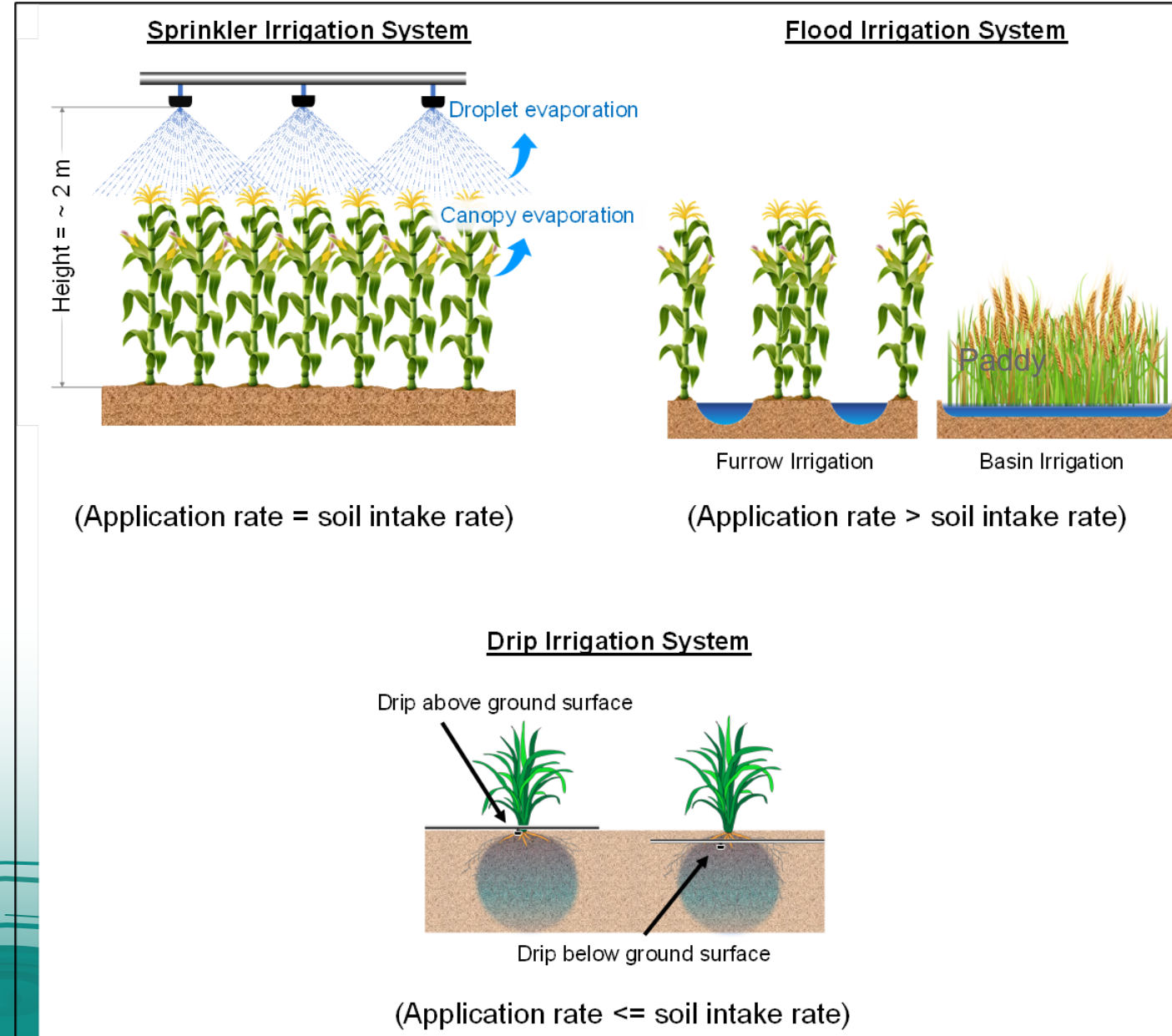
Impact of tile-drainage modeling on surface water cycle: Valayamkunnath et al. 2021: WRR, in review

# The new tile-drainage improved National Water Model streamflow prediction (Valayamkunnath et al. 2021)



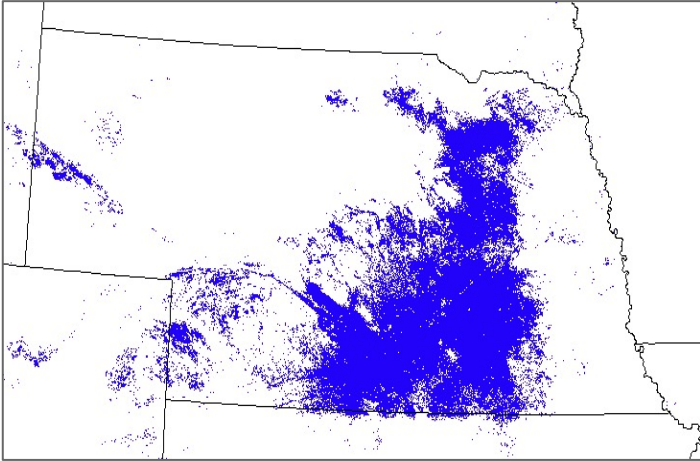
# Development of Dynamic Irrigation Schemes for Noah-MP

- Implemented a new dynamic irrigation scheme in Noah-MP and the National Water Model
  - Consider three methods of irrigation
  - Consider sprinkler evaporation
  - Use irrigation area data and Leaf Area Index to constrain models
  - Trigger function = Management allowable deficit (MAD)



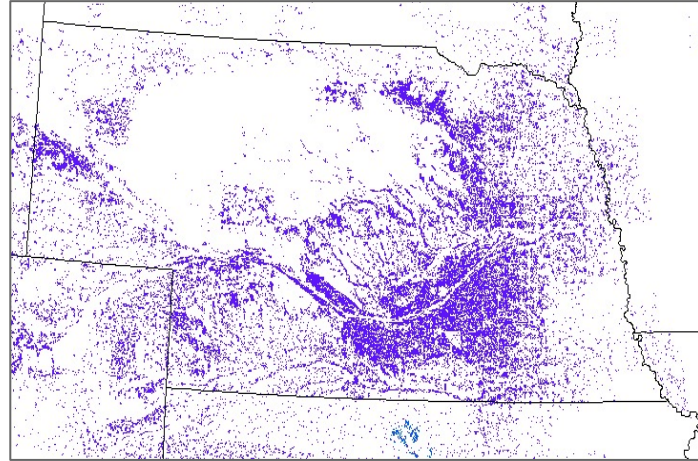
# Data used to constrain irrigation models

500-m MODIS Global  
(Salmon et al., 2015)



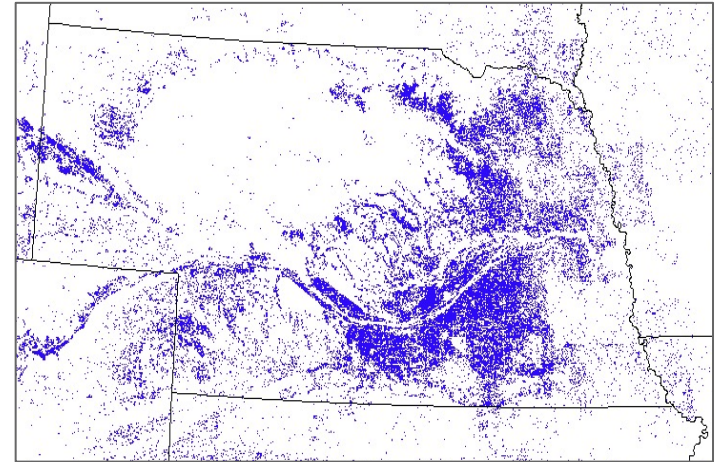
- Overestimated irrigated area compared to MirAD-US

250-m MirAD-US (USGS)



USGS irrigation census based data

Global 30-second Global: [Meier et al., \(2018\)](#)



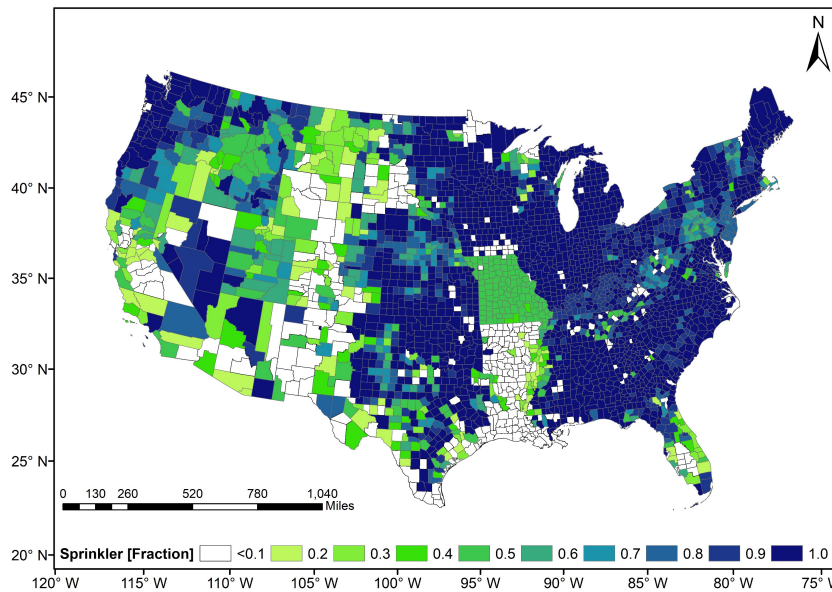
Well-Captured the MirAD-US irrigated area pattern compared to MODIS Global



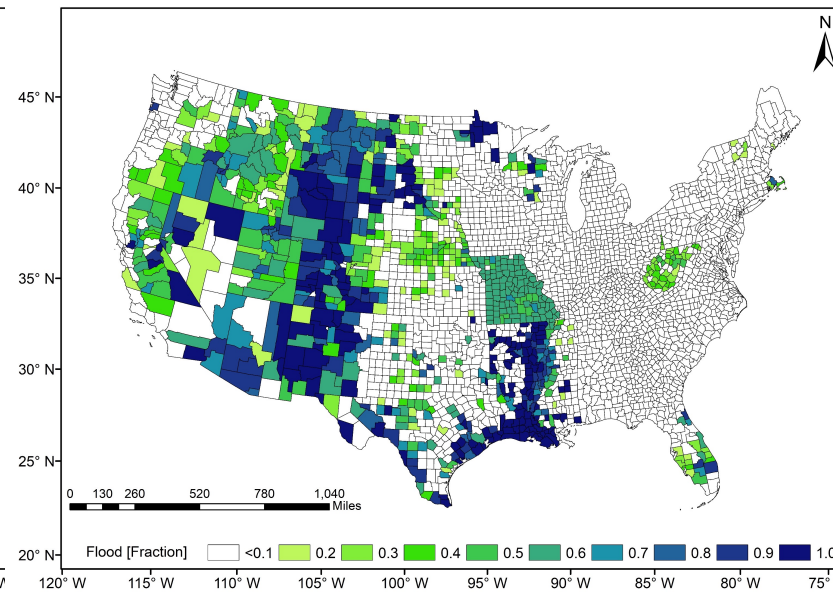
# Data used to constrain irrigation models

- 30-meter USDA/GMU crop frequency data
- 250-m MlRAD-US (USGS) for US and Meier's 30-second for globe
- U.S. state-level planting and harvest data,  $\frac{1}{8}^\circ$  climate spatially-varying GDD for crop growth

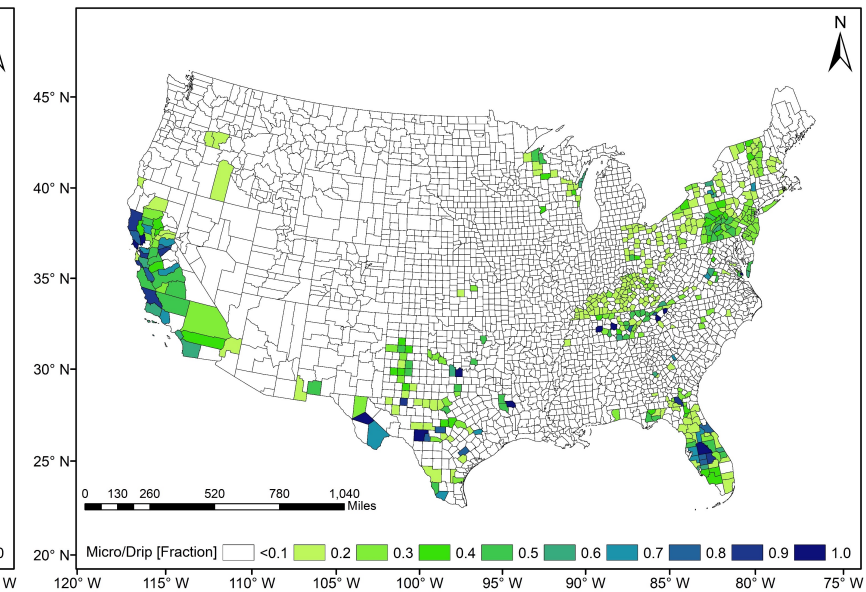
Sprinkler irrigation fraction [-]



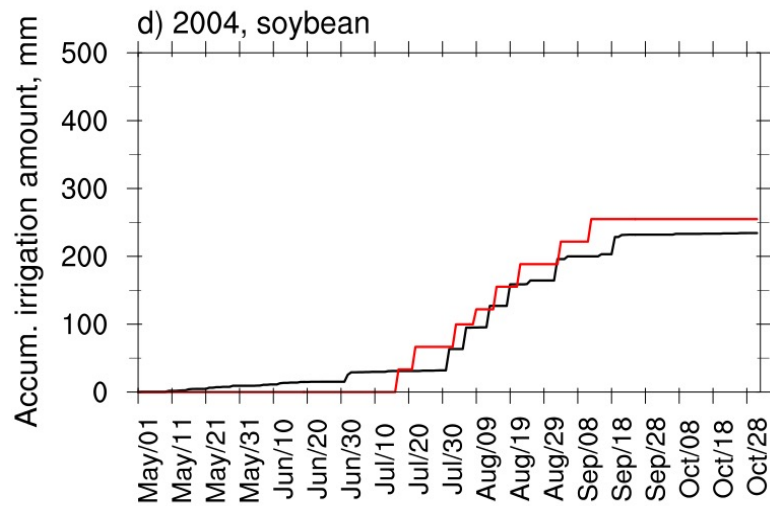
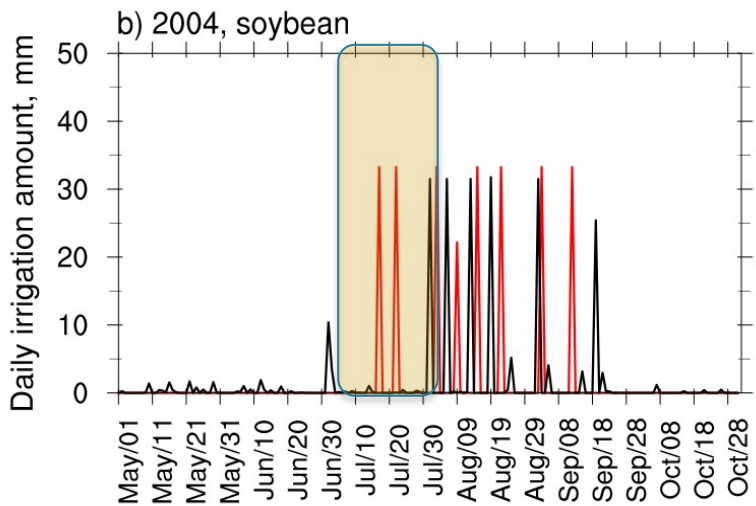
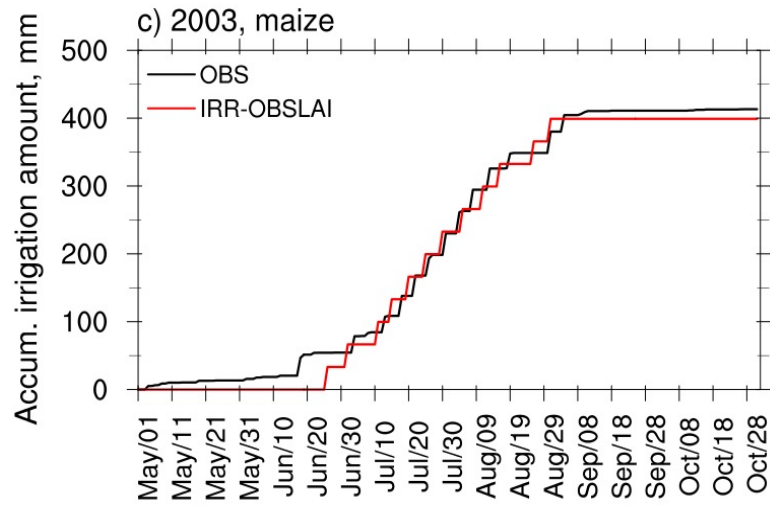
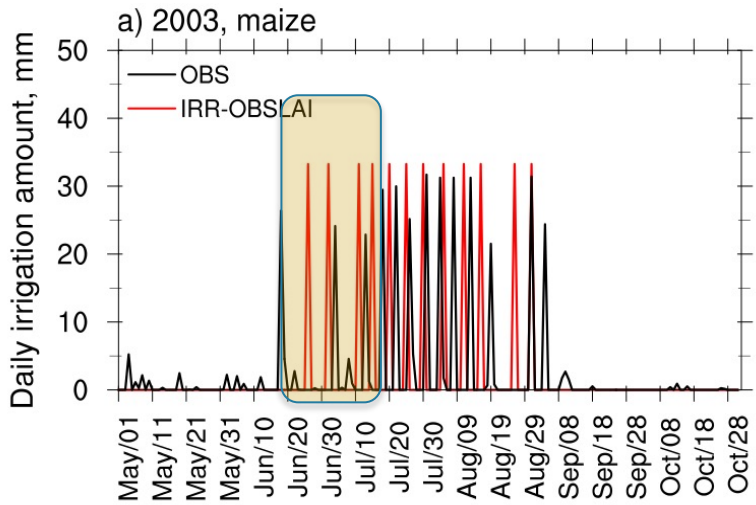
Flood irrigation fraction [-]



Micro irrigation fraction [-]



Data Source: USGS County-level water use 2015



# Challenge in modeling irrigation

**JAMES** | Journal of Advances in Modeling Earth Systems

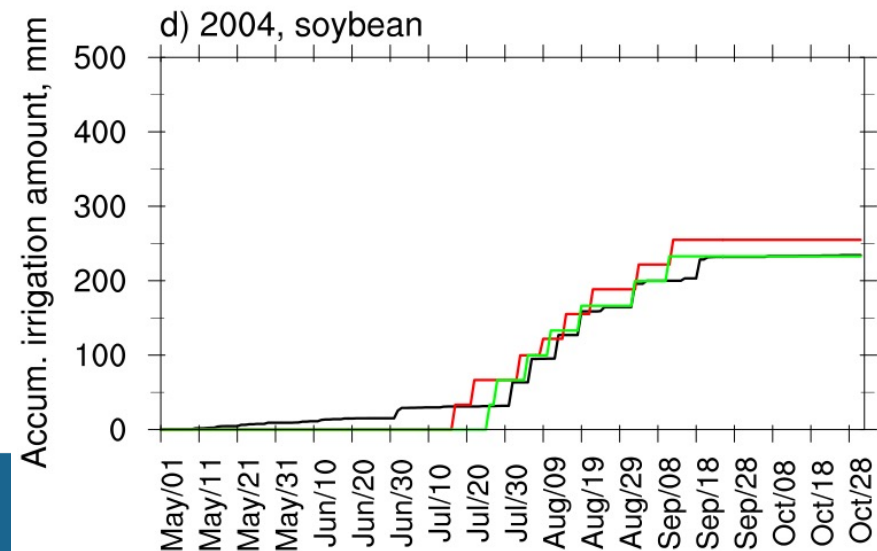
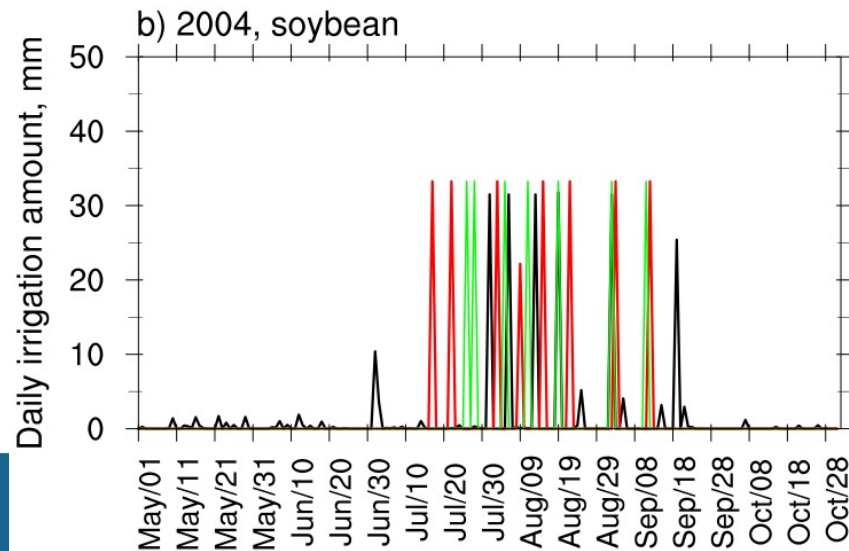
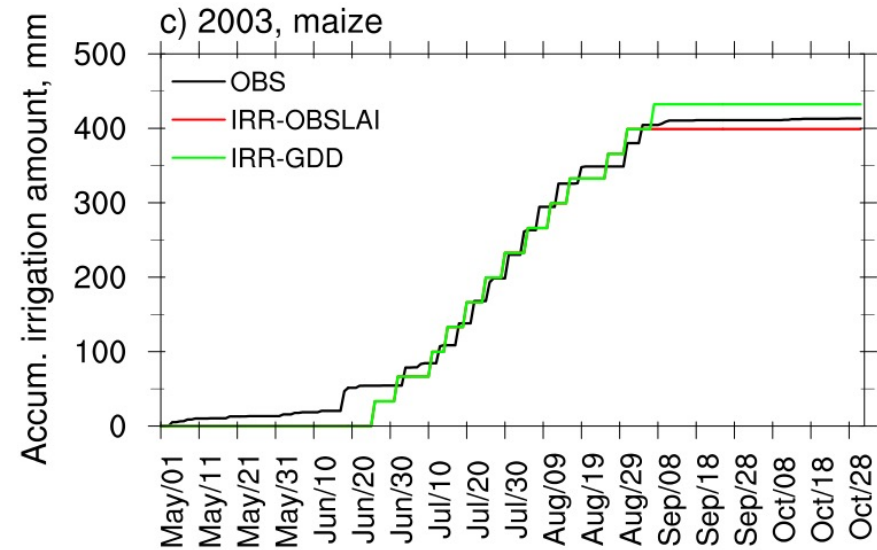
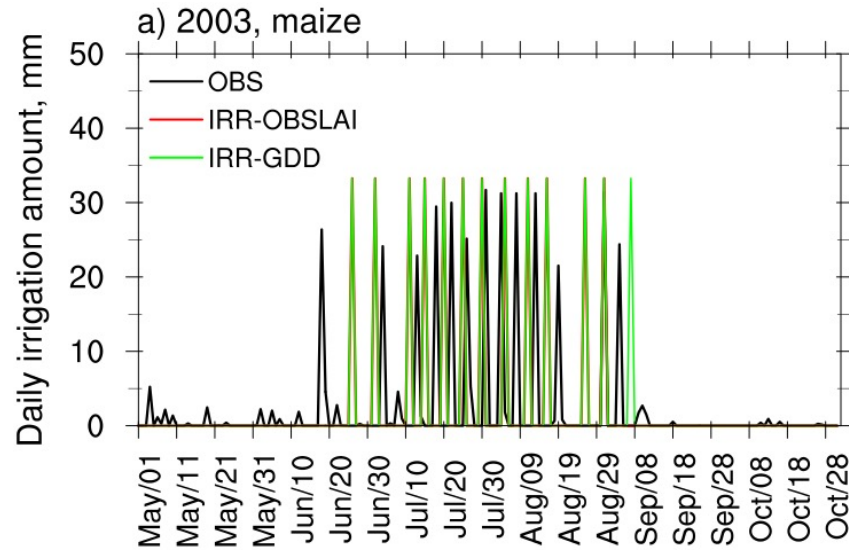
RESEARCH ARTICLE  
10.1029/2018MS001595

## Lessons Learned From Modeling Irrigation From Field to Regional Scales

Xiaoyu Xu<sup>1,2</sup> , Fei Chen<sup>3</sup> , Michael Barlage<sup>3</sup> , David Gochis<sup>3</sup> , Shiguang Miao<sup>2</sup> , and Shuanghe Shen<sup>1</sup>

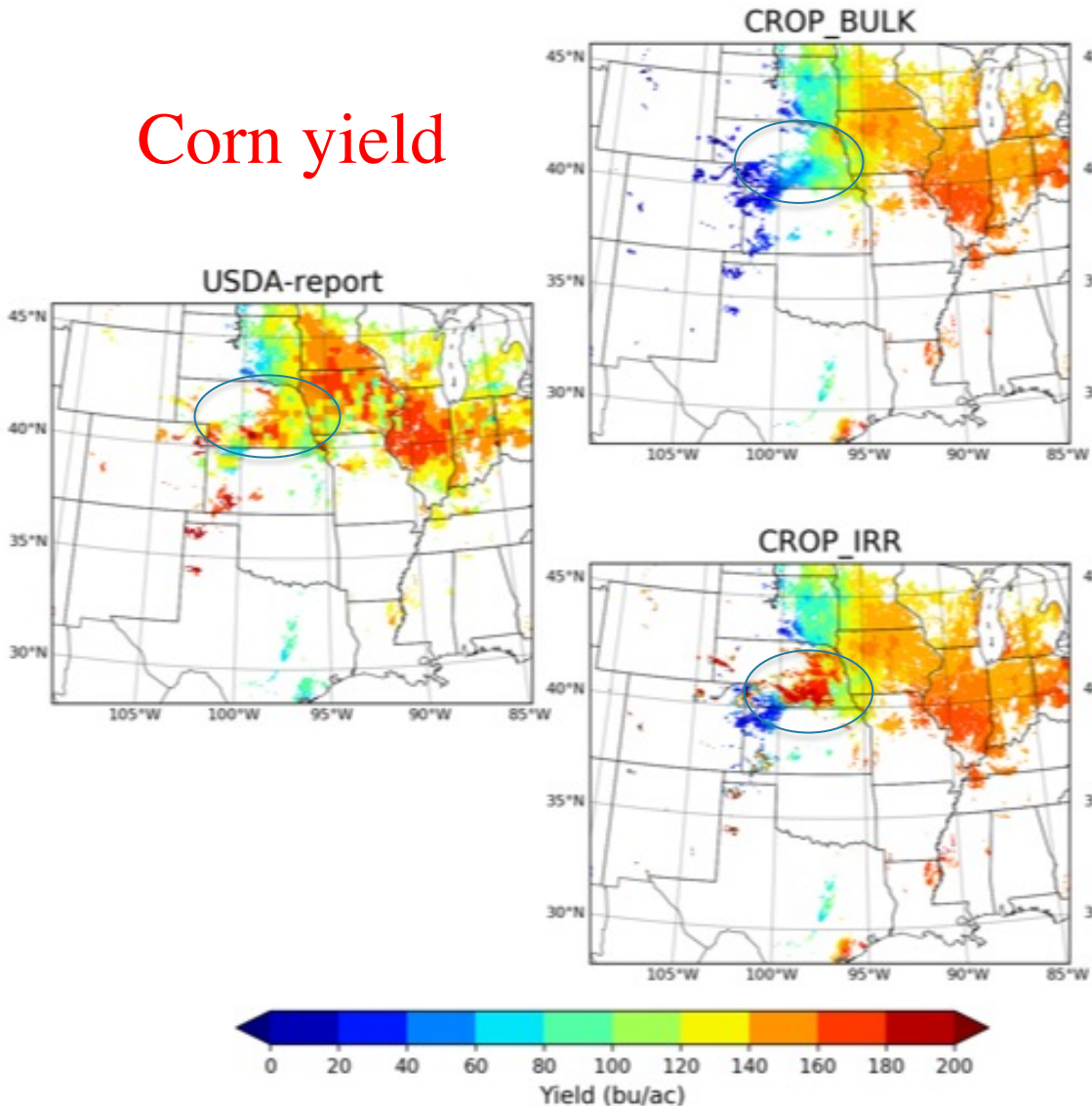
**Key Points:**  
• A dynamic irrigation scheme was incorporated into Noah-MP, using soil moisture availability and crop

# Enhance irrigation scheme by including GDD (growing degree days): Activate irrigation: $GDD > 280$ for corn, $GDD > 560$ for soybean



# Joint simulation of crop growth and irrigation for central U.S.

Corn yield



Well simulated corn yield in rainfed region

Simulation without irrigation underpredicted yield in irrigated region (Nebraska)







**JAMES** | Journal of Advances in Modeling Earth Systems

RESEARCH ARTICLE  
10.1029/2020MS002159

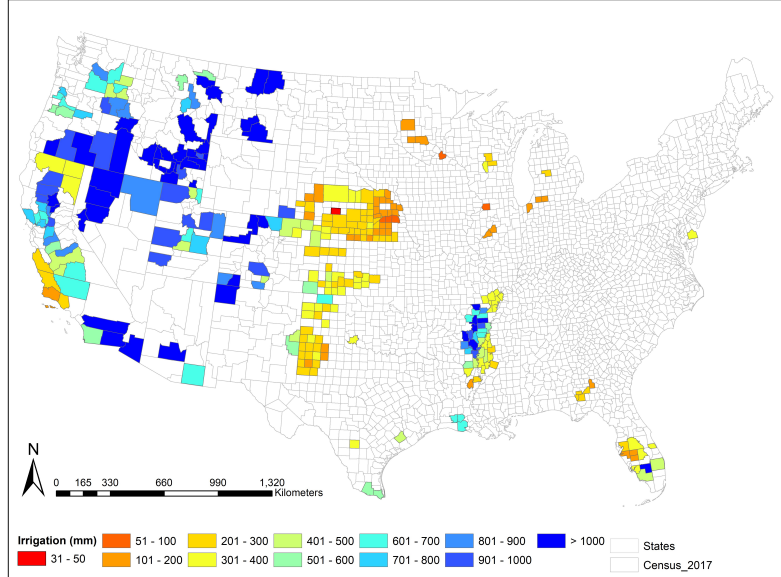
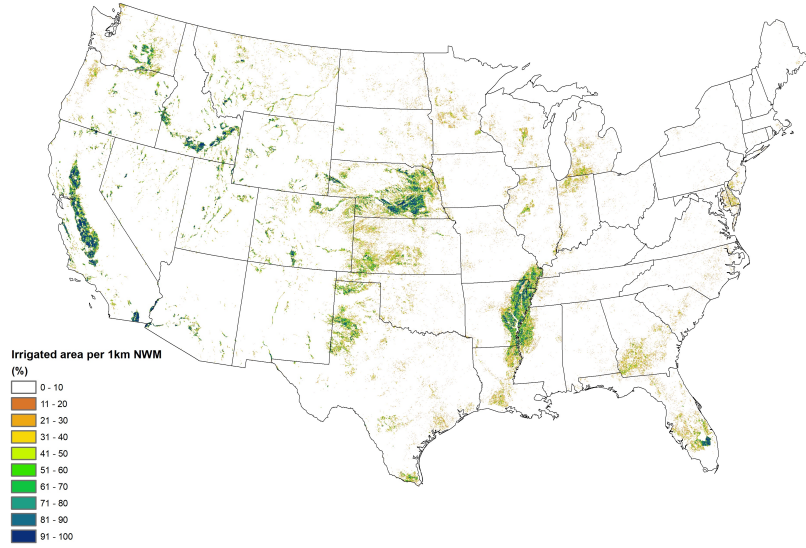
**Joint Modeling of Crop and Irrigation in the central United States Using the Noah-MP Land Surface Model**

**Key Points:**

- Joint modeling of crop growth and irrigation improves crop-yield simulation in irrigated regions
- Applying the state-level planting date helps improve the

Zhe Zhang<sup>1,2</sup> , Michael Barlage<sup>3</sup>, Fei Chen<sup>3</sup> , Yanping Li<sup>1,2</sup> , Warren Helgason<sup>1,4</sup> , Xiaoyu Xu<sup>5</sup> , Xing Liu<sup>6</sup> , and Zhenhua Li<sup>1,2</sup>

Irrigation fraction (%) on 1km NWM grid



# Continental-scale irrigation-model calibration over 747 heavily-irrigated counties and regionalization

## Irrigation model parameters

- IRR\_FRAC** = 0.10 ! Irrigation Fraction
- IRR\_LAI** = 0.05 ! Minimum LAI to trigger irrigation
- IRR\_MAD** = 0.50 ! Management Allowable Deficit (0-1)
- FILOSS** = 0.10 ! fraction of flood irrigation loss (0-1)
- SPRIR\_RATE** = 6.40 ! mm/h, sprinkler irrigation rate
- MICIR\_RATE** = 1.38 ! mm/h, micro irrigation rate
- FIRTFAC** = 1.00 ! flood application rate factor
- IR\_RAIN** = 1.00 ! maximum precipitation to stop irrigation trigger

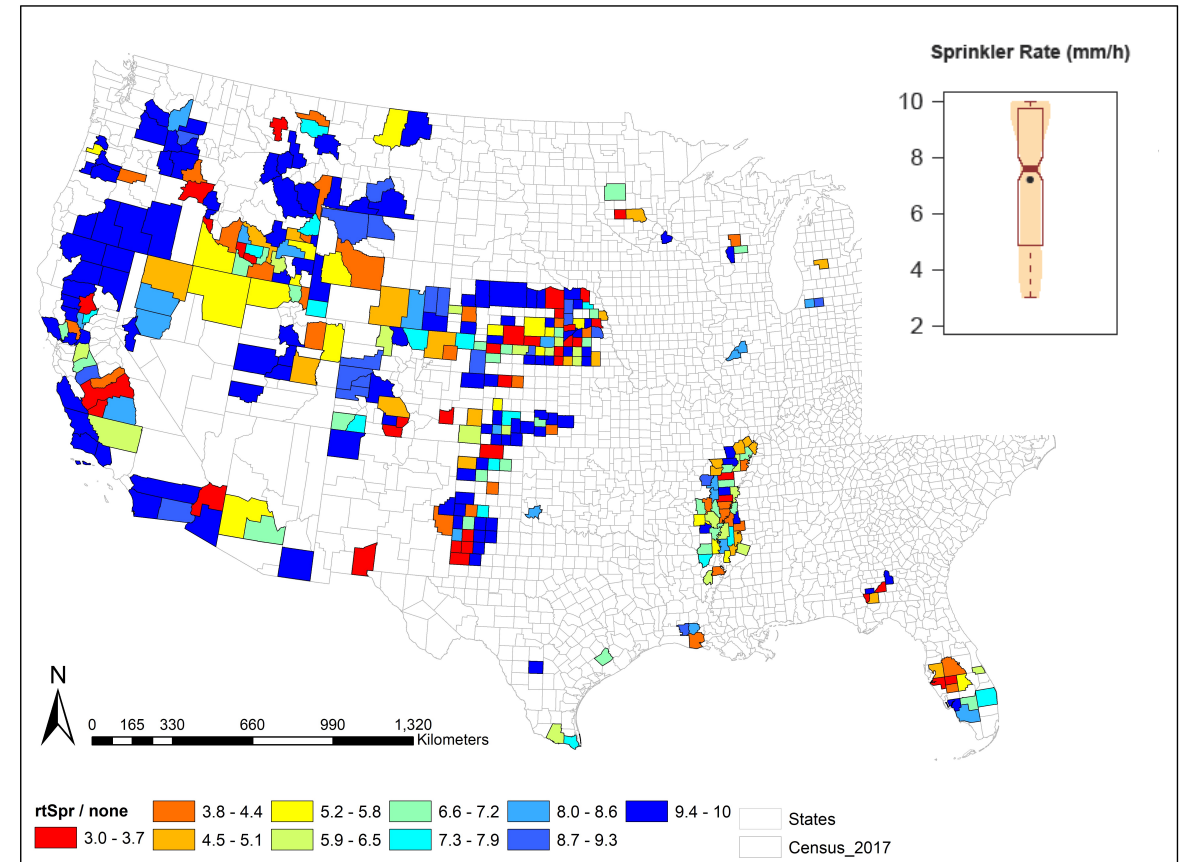
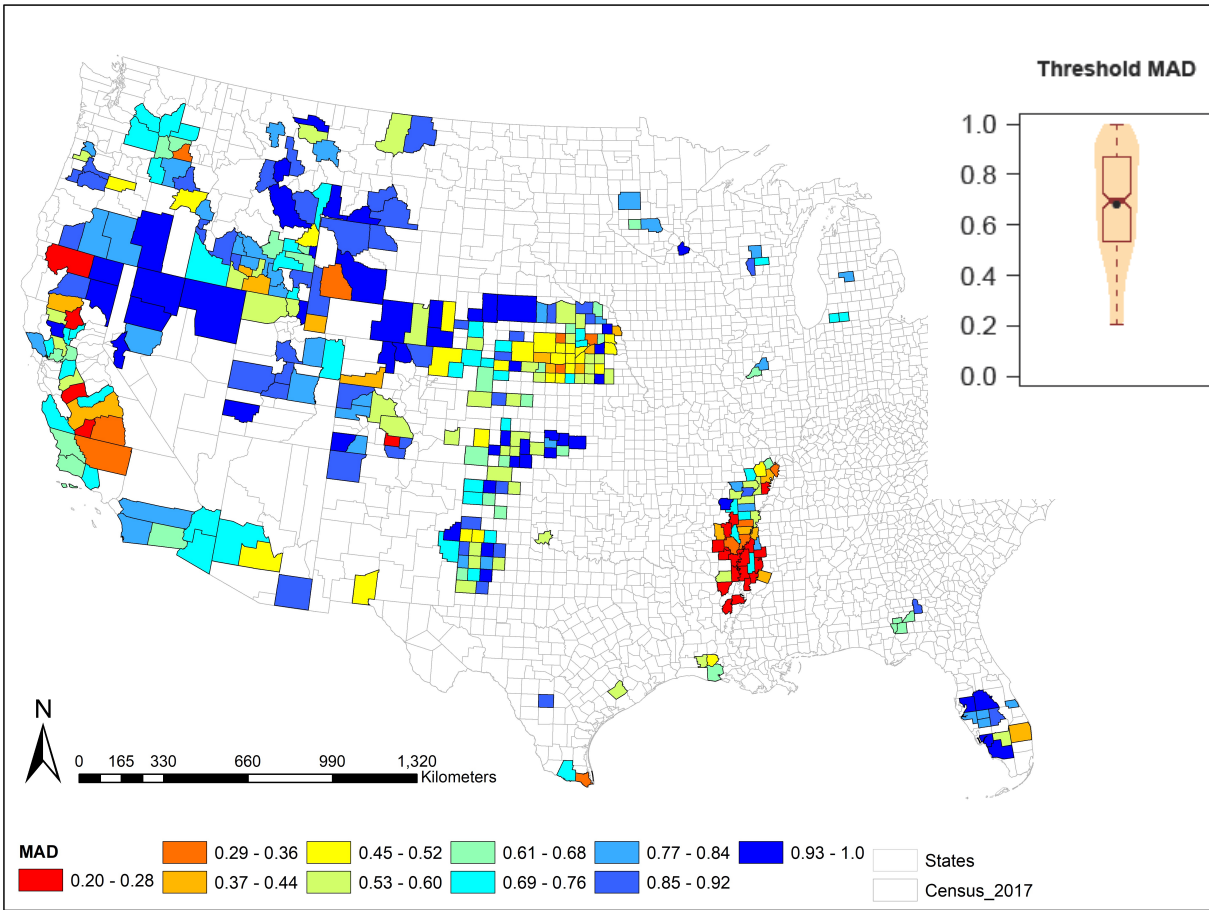
USGS county-level irrig water amount (mm)



# Spatial distribution of calibrated parameter distribution

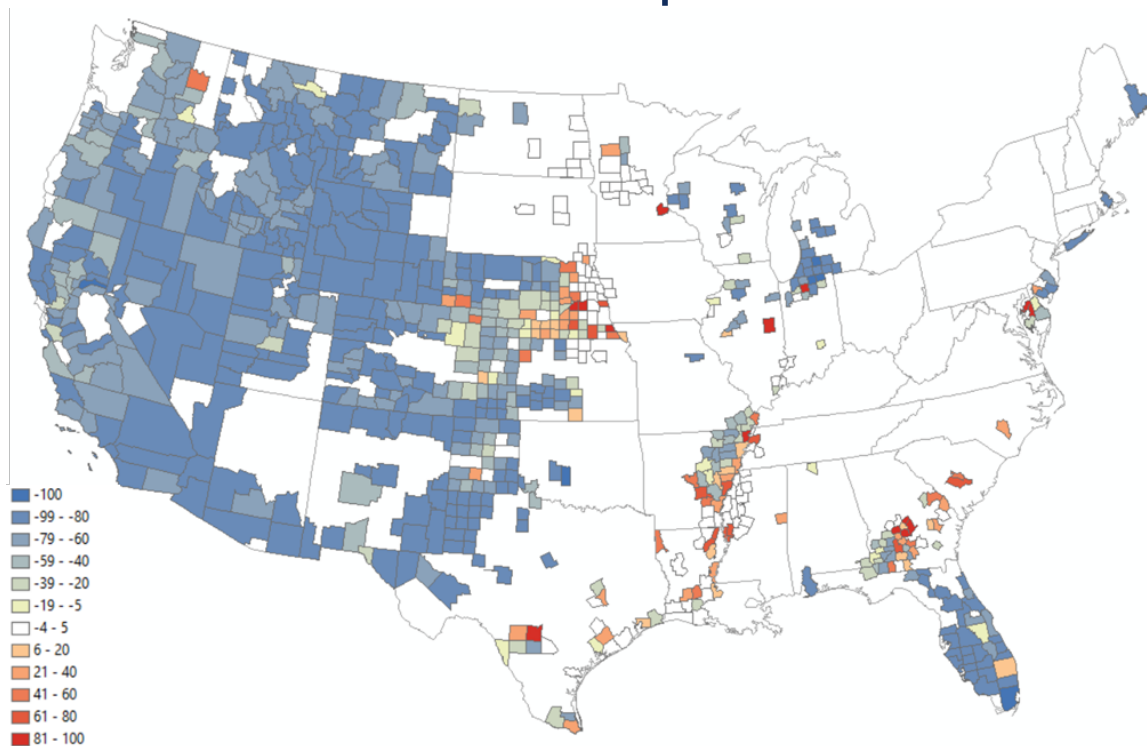
## Management Allowable Deficit

## Sprinkler Rate (mm/h)

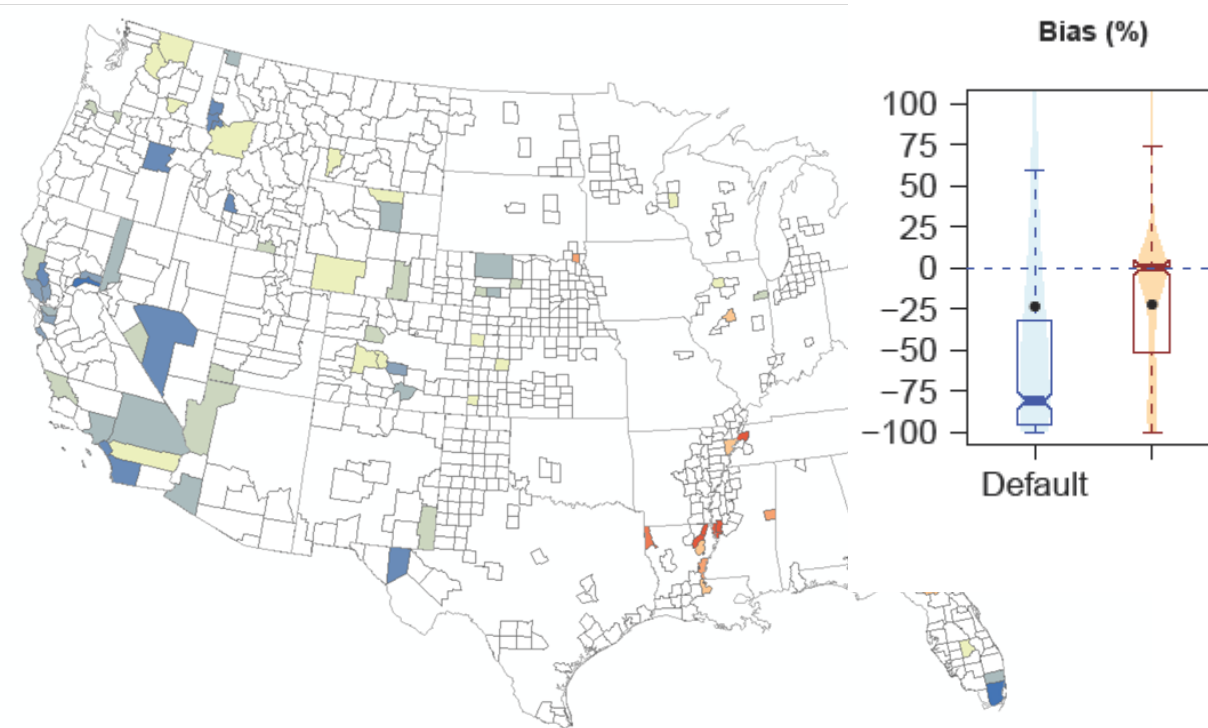


# County-level comparison of irrigation model performance: Default Vs Calibrated Bias (%)

With default parameters



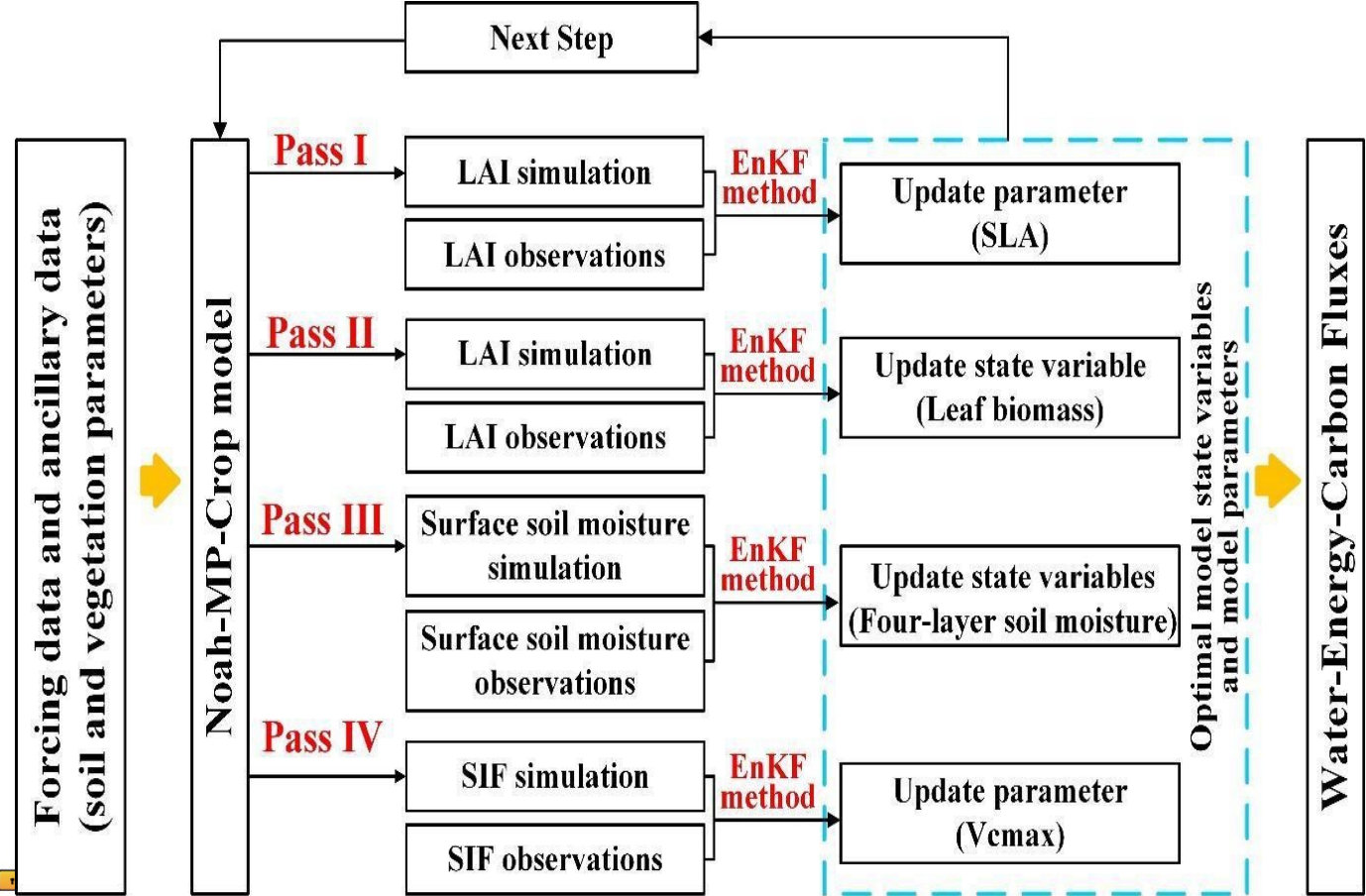
With calibrated parameters



- Irrigation scheme generally underestimated irrigation water
- Calibration improvements low biases, especially over the heavily irrigated counties of the CONUS.

# Irrigation and Ag modeling allows for assimilating more and new land-related data

Develop a multi-pass land data assimilation scheme (MLDAS) based on EnKF and Noah-MP-Crop to jointly assimilate satellite soil moisture and crop data: leaf area index (LAI), and solar-induced chlorophyll fluorescence (SIF).



## Improve the Performance of the Noah-MP-Crop Model by Jointly Assimilating Soil Moisture and Vegetation Phenology Data

Tongren Xu<sup>1</sup>, Fei Chen<sup>2</sup>, Xinlei He<sup>1</sup>, Michael Barlage<sup>2</sup>, Zhe Zhang<sup>3</sup>, Shaomin Liu<sup>1</sup>, and Xiangping He<sup>1</sup>

<sup>1</sup>State Key Laboratory of Earth Surface Processes and Resource Ecology, School of Natural Resource, Faculty of Geographical Science, Beijing Normal University, Beijing, China, <sup>2</sup>National Center for Atmospheric Research, Boulder, CO, USA, <sup>3</sup>School of Environment and Sustainability, University of Saskatchewan, Saskatoon, SK, Canada

**Key Points:**

- The Multipass Land Data Assimilation Scheme (MLDAS) is proposed based on the Noah-MP-Crop model
- Leaf area index (LAI), soil moisture (SM), and solar-induced chlorophyll fluorescence (SIF) measurements are assimilated into the MLDAS to predict sensible heat flux ( $H$ ), latent



# Hydroclimatic impacts of crop irrigation

Impact of irrigation on air temperature simulated by Earth system models:

- Insignificant (Fowler and Helvey 1974)
- 0.5 C° reduction (Sacks et al 2009)
- 3.7 C° reduction (Kueppers et al 2007)
- 10 C° reduction (Lobell et al 2009)
- Why such discrepancies in ESM simulations?

## Environmental Research Letters



LETTER

OPEN ACCESS

Memory of irrigation effects on hydroclimate and its modeling challenge

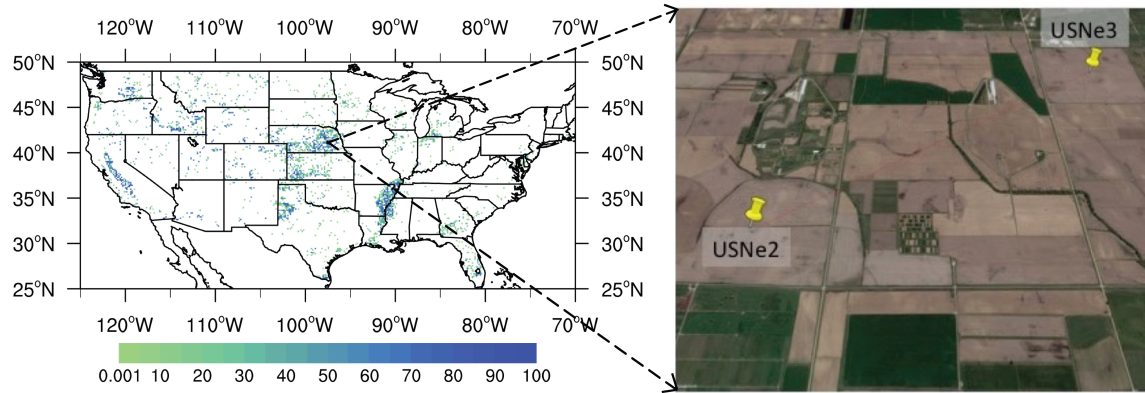
RECEIVED  
3 January 2018

REVISED  
13 March 2018

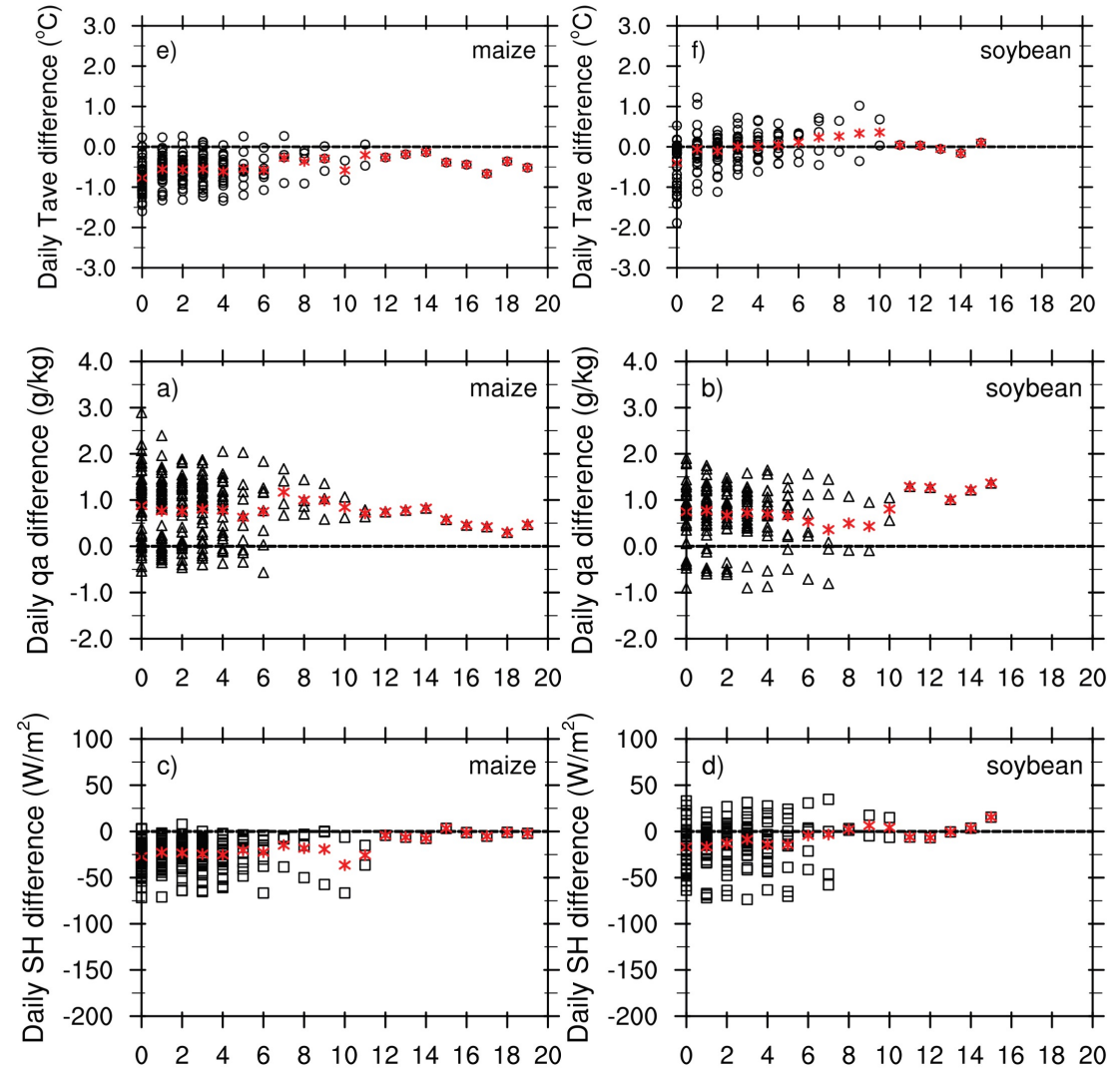
Fei Chen<sup>1,2</sup>, Xiaoyu Xu<sup>3,4,6</sup> , Michael Barlage<sup>1</sup>, Roy Rasmussen<sup>1</sup>, Shuanghe Shen<sup>3</sup>, Shiguang Miao<sup>4</sup> and Guangsheng Zhou<sup>5</sup>

# Hydroclimatic impacts of crop irrigation

Using 10-year AmeriFlux data over nearby irrigated and non-irrigated sites, Mead, Nebraska.



- Irrigation reduce air temperature by  $\sim 1\text{ }^\circ\text{C}$ , increase water vapor by 1 g/kg, reduce sensible heat flux by  $25\text{ W/m}^2$ ; the memory last  $\sim 10$  days
- Bigger impact and longer memory for corn



## Lessons learned

- Capturing the timing of irrigation (important for land-atmosphere interactions, PBL) is more challenging than modeling the irrigation amount
- Calibration of key irrigation model parameters seems necessary; need to develop parameter regionalization strategies
- Need more observations to evaluate and constrain models
- How to transition irrigation models from field to regional to global scales?
- How to transition irrigation models from one region to another?  
Human-, and crop specie – dependent
- How to reduce uncertainties in modeling irrigation in ESMS?

# Thank you!

