



# Are Farmers Adapting to Drier Conditions? Crop Choices and Irrigation Adoption in the Danube River Basin

Noormah Rizwan, Molly Sears, Sean Woznicki, Tao Liu, and Oskar Marko



MICHIGAN STATE  
UNIVERSITY



GRAND VALLEY  
STATE UNIVERSITY



Michigan  
Technological  
University



BioSense  
INSTITUTE





# Motivation

- Under climate change, farmers respond to the changes in crops' productivity by adjusting their crop and management choices.
- We may overstate climate change impacts if we do not also consider other adaptation mechanisms adopted by farmers.

We ask two research questions:

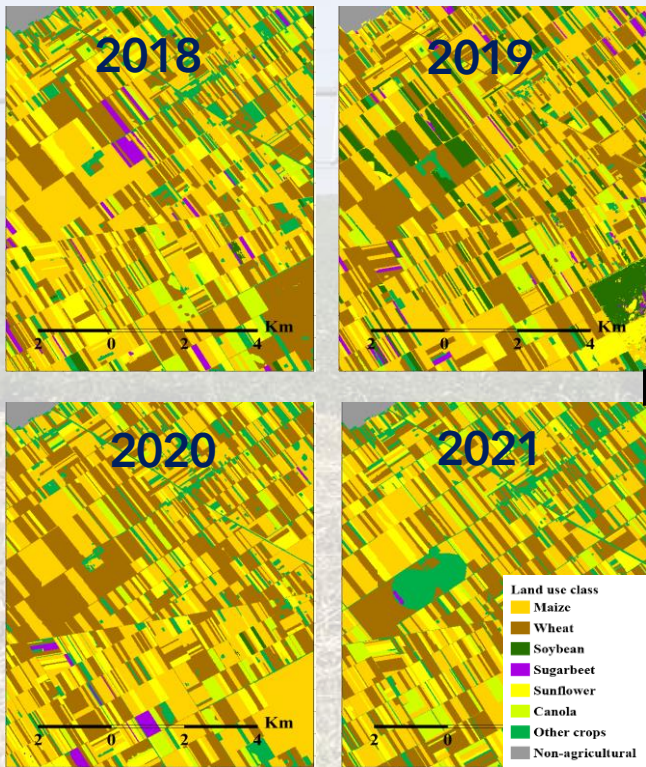
1. How does changing water availability affect farmers' **crop choices**?
2. Under which conditions do farmers adopt irrigation?

Context: Serbia, characterized by complex crop rotations and increasing drought

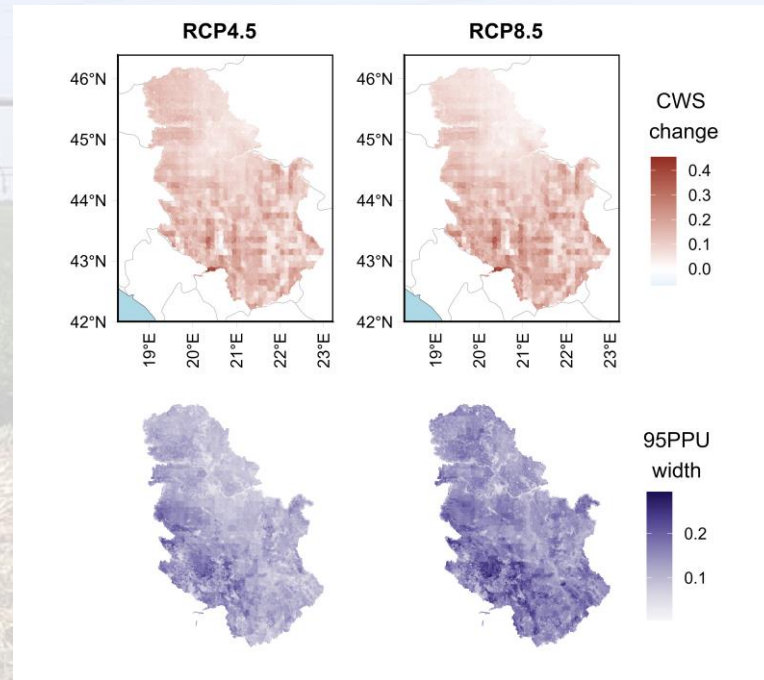


# Process

Multi-year crop classification  
LSTM and domain adaptation

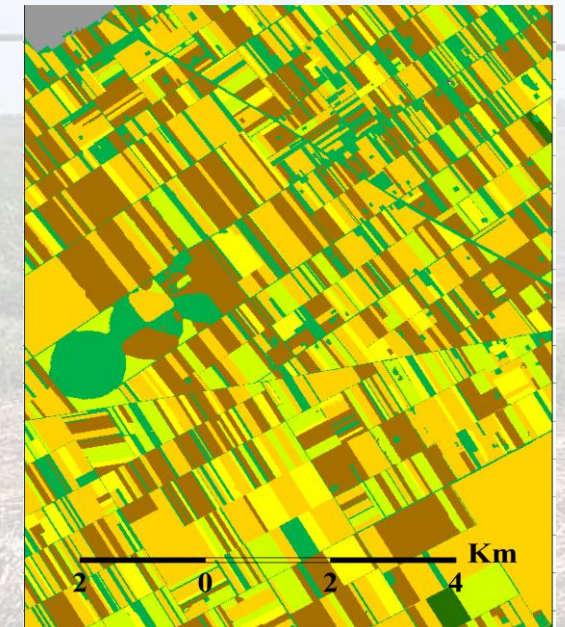


Hydrological modeling incorporating crop  
rotations and irrigation



Increasing crop water stress (2041-2070)  
July, August, September

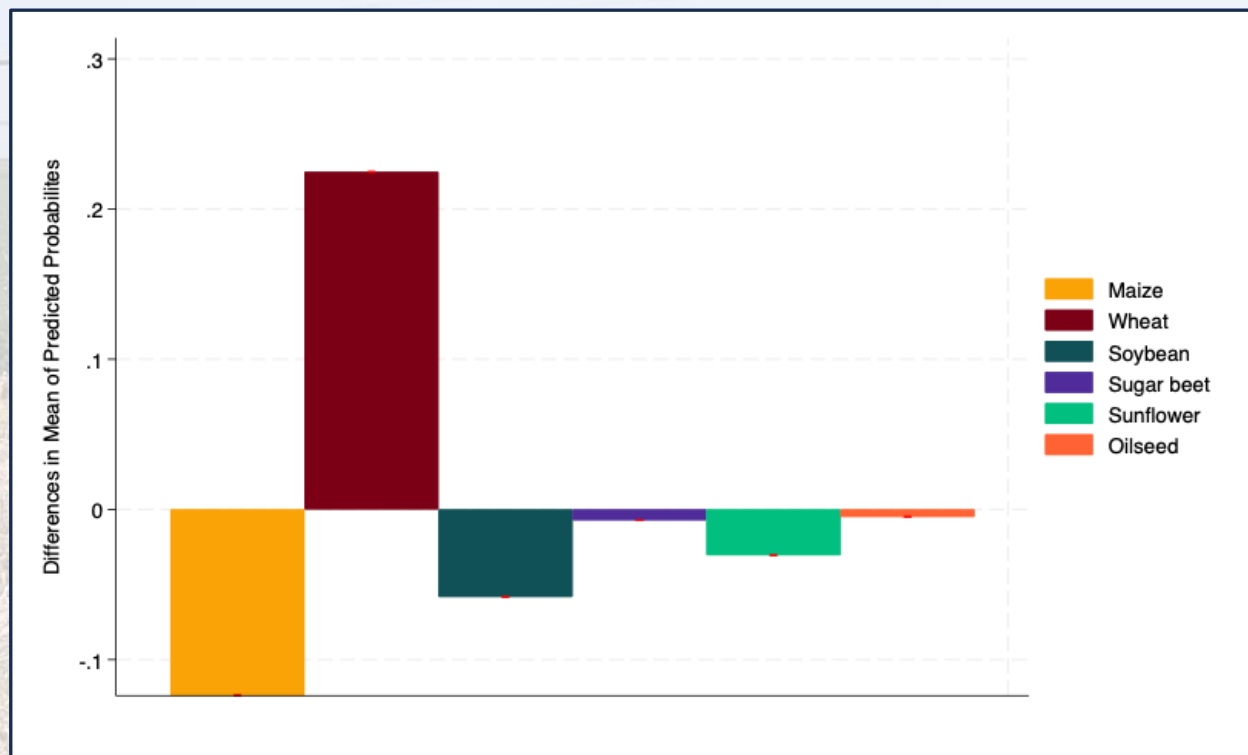
Land use change:  
Crop choice and irrigation  
adoption =  $f(\text{prices, weather, soil moisture})$





# Results

## Crop Choice Predictions after Reduction in Spring Soil Moisture



## Irrigation Adoption Model

Variables	Correlated Random Effects
Lagged Irrigating Season Temperature	0.016*** (0.001)
Lagged Irrigating Season Soil Moisture	-0.00012*** (6.45e-06)
30-yr average of Irrigating Season Temperature	0.092*** (0.0054)
30-yr average of Irrigating Season Soil Moisture	0.00044*** (1.83e-05)
Soil Quality	0.05*** (0.0076)
Elevation	9.31e-05*** (1.24e-05)
Field Size	3.21e-06*** (4.64e-08)