

# Preliminary Work in Determining Rates and Drivers of Agricultural Intensification in Mato Grosso, Brazil

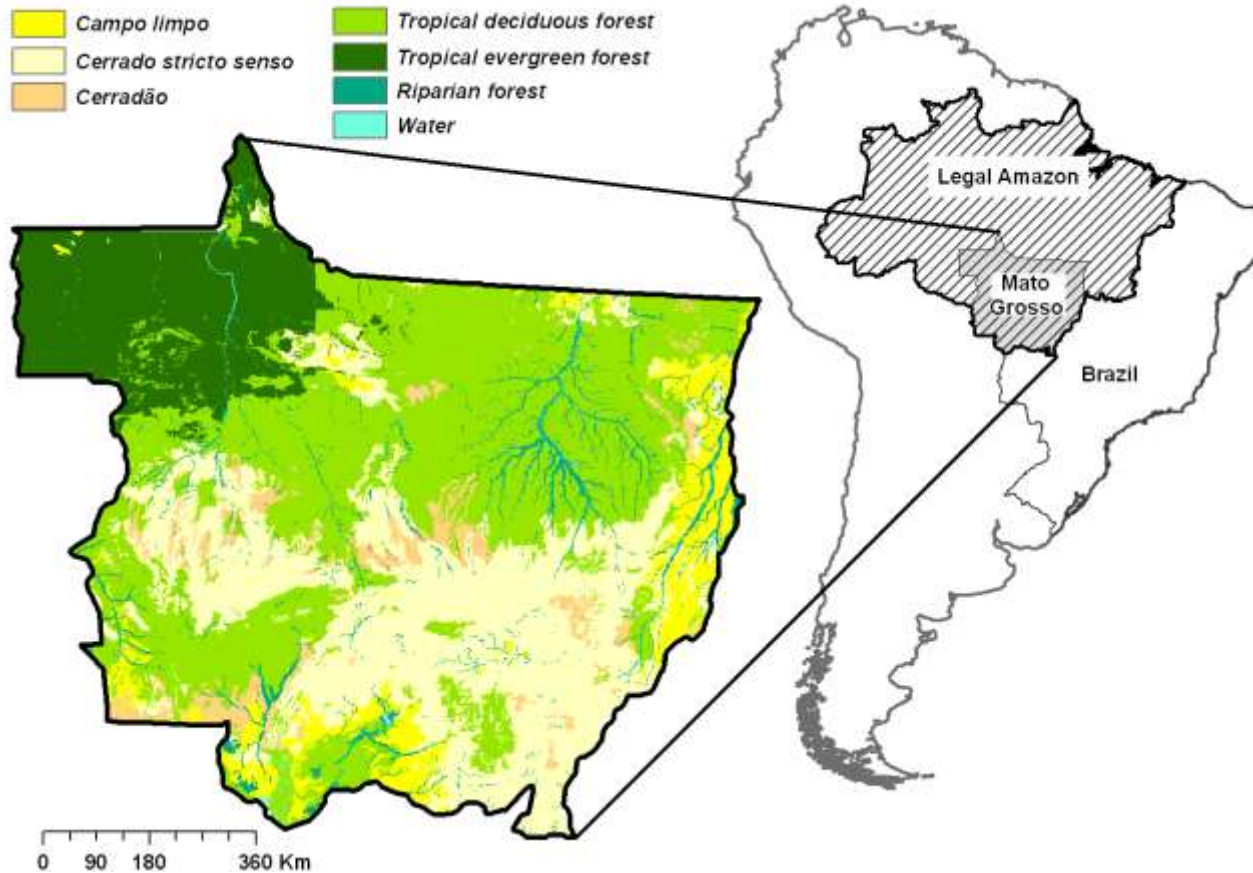


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“Brazil is poised to become one of the few countries to achieve the transition to **a major economic power without destroying tropical forests.**” – Davidson et al., 2012

# Field Site: Mato Grosso, Brazil



**Brazil:** 3<sup>rd</sup> in world grain exports

**Mato Grosso:** Comparable to the American Midwest

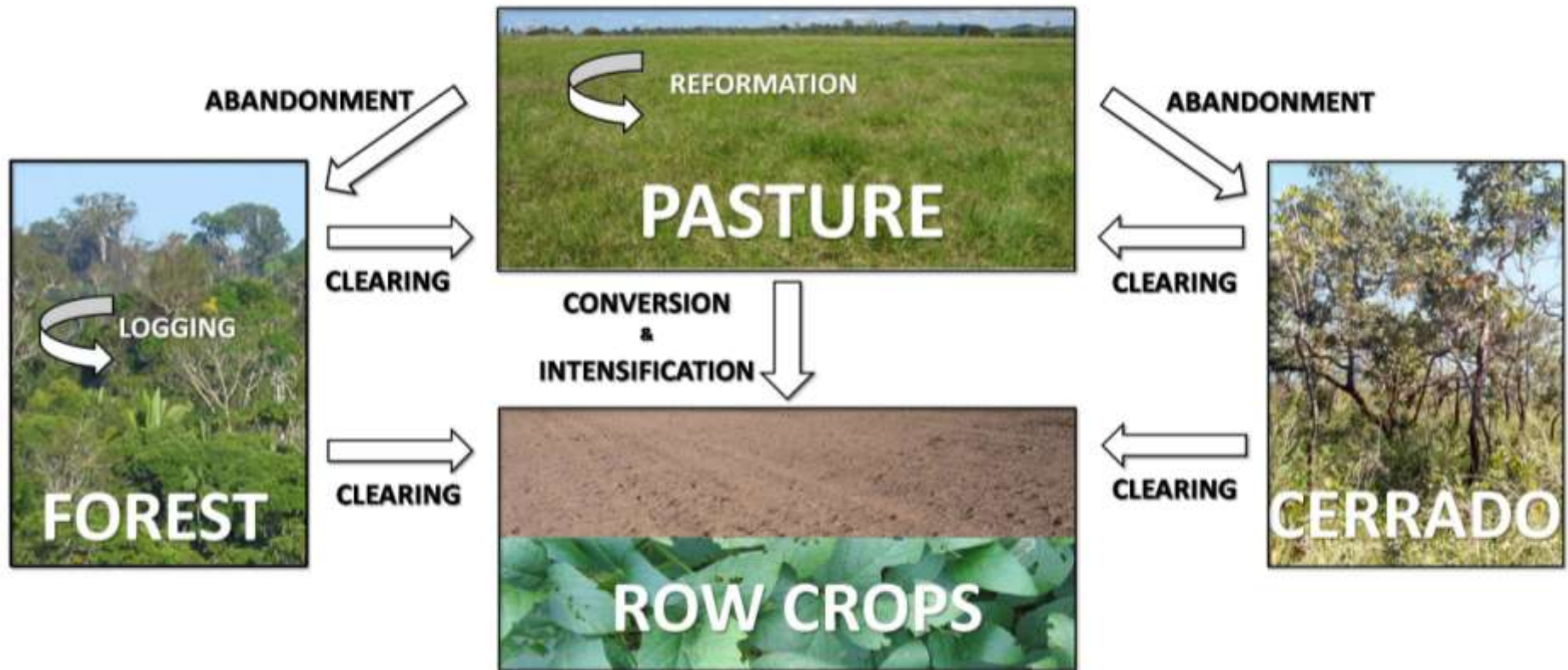
# Research Goal

Explain and attribute land-use land-cover change by determining the spatially and temporally variable drivers of intensification

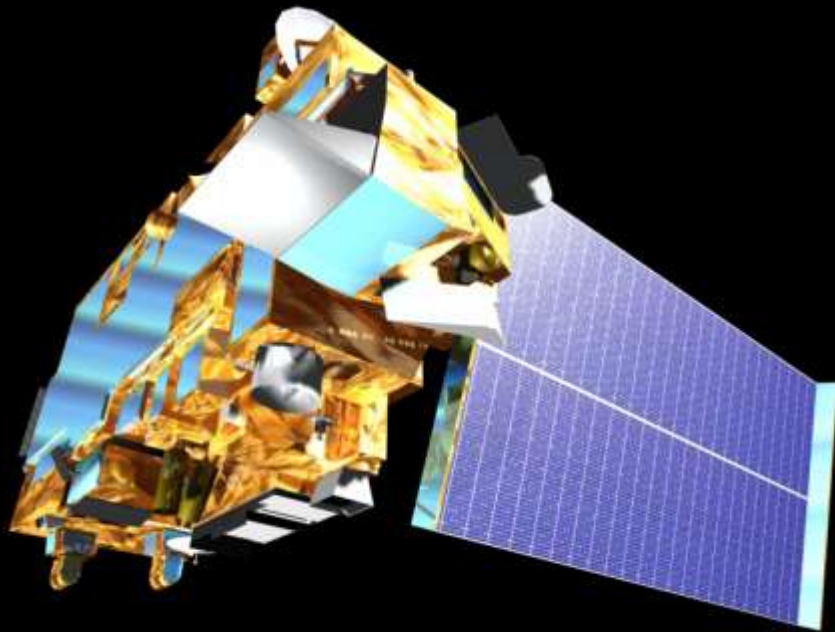
# Step 1

Determine the nature of cropland expansion and intensification in Mato Grosso, Brazil between 2001-2012

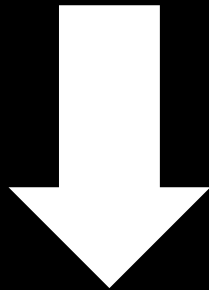
# Determine the Nature of Cropland Expansion and Intensification



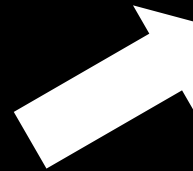




**Terra - MODIS**

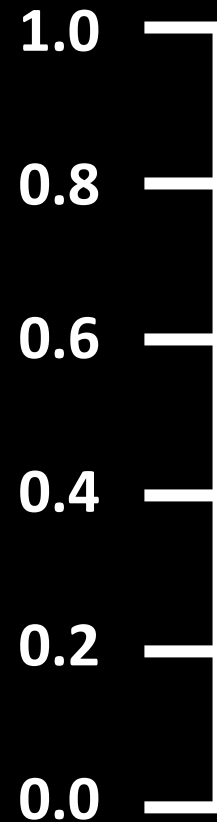


$$EVI = G \times \frac{(NIR - RED)}{(NIR + C1 \times RED - C2 \times Blue + L)}$$



**VEGETATION  
INDEX**

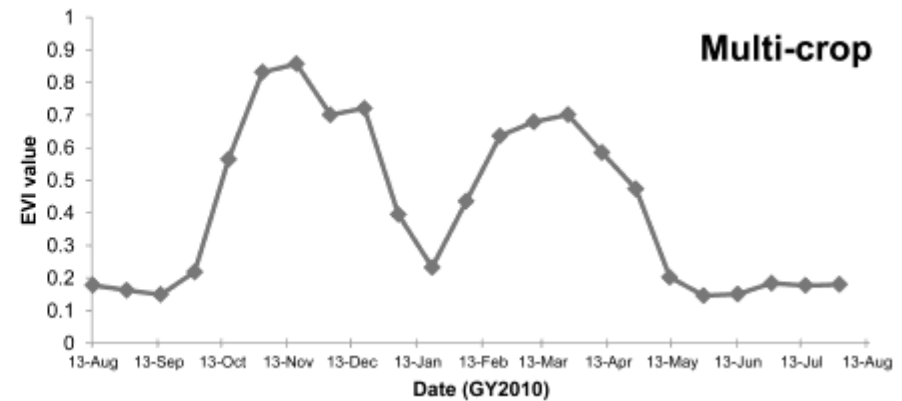
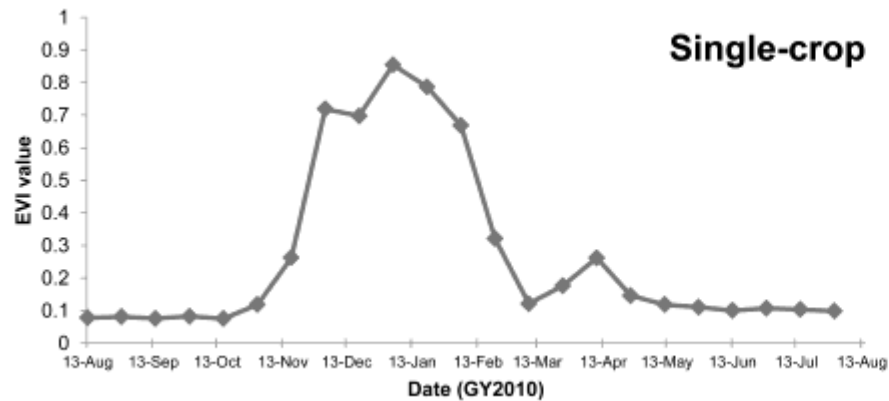
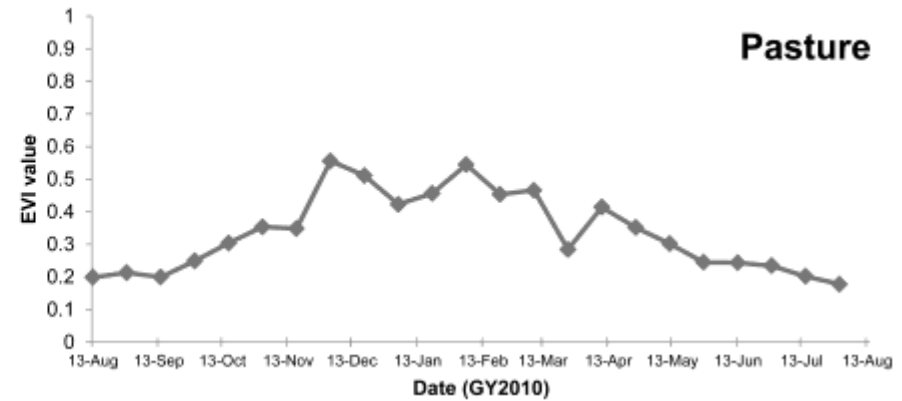
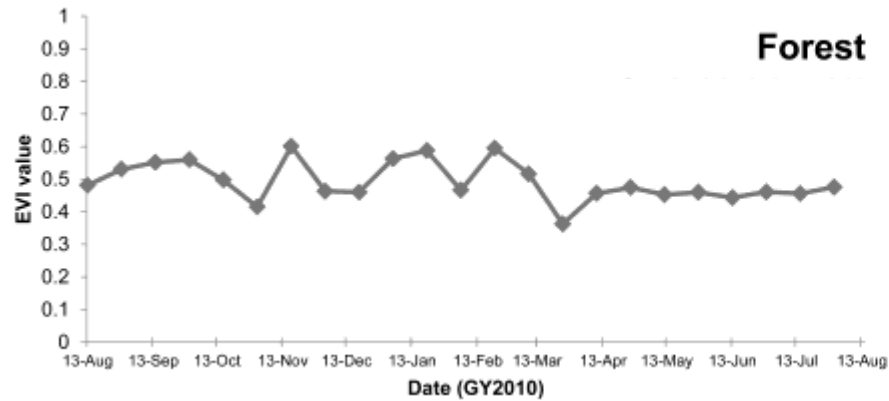
*high  
vegetation*



*low  
vegetation*

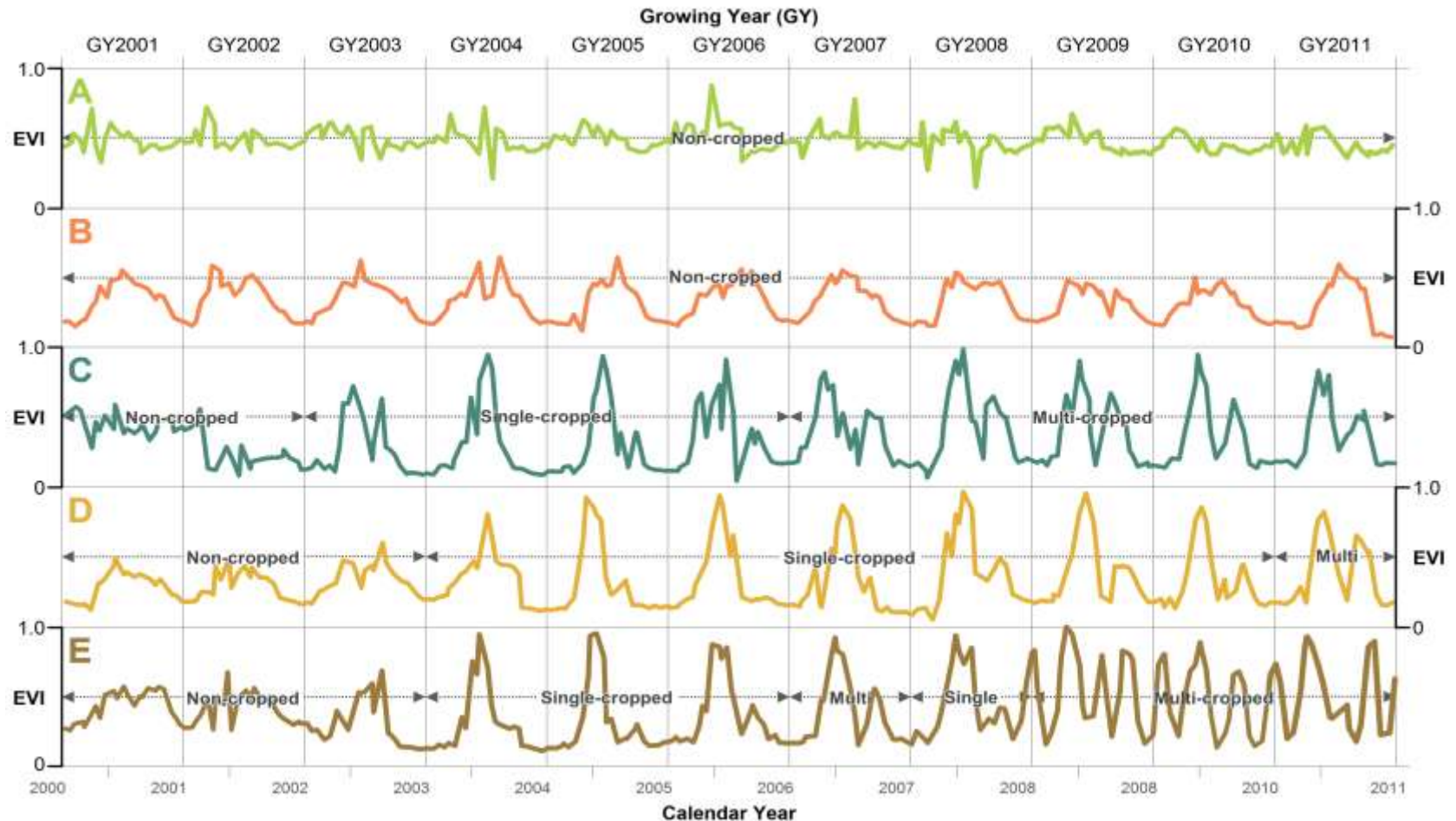


# Typical Phenology Patterns

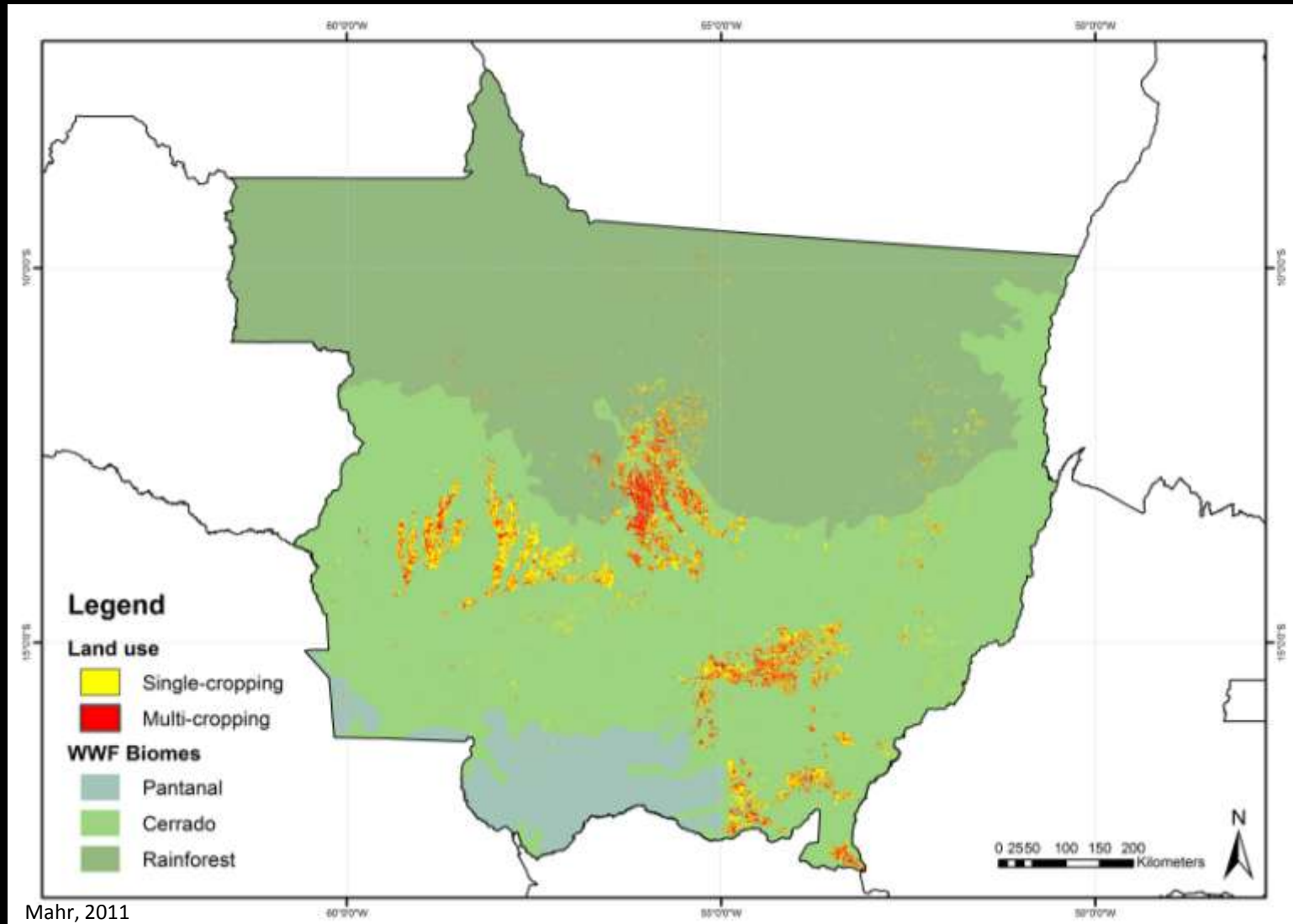




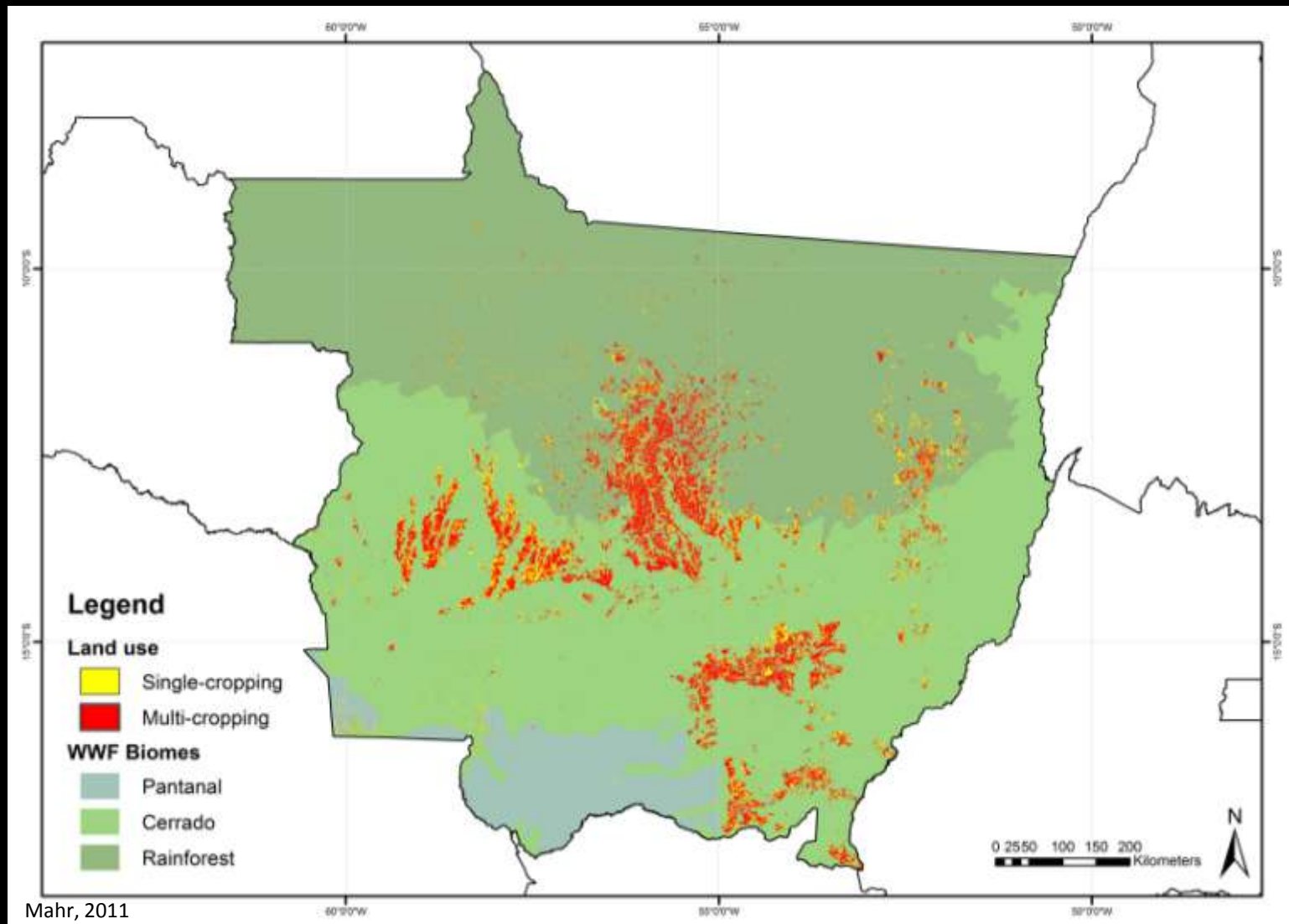
# Land Use Transitions: As Seen from Space



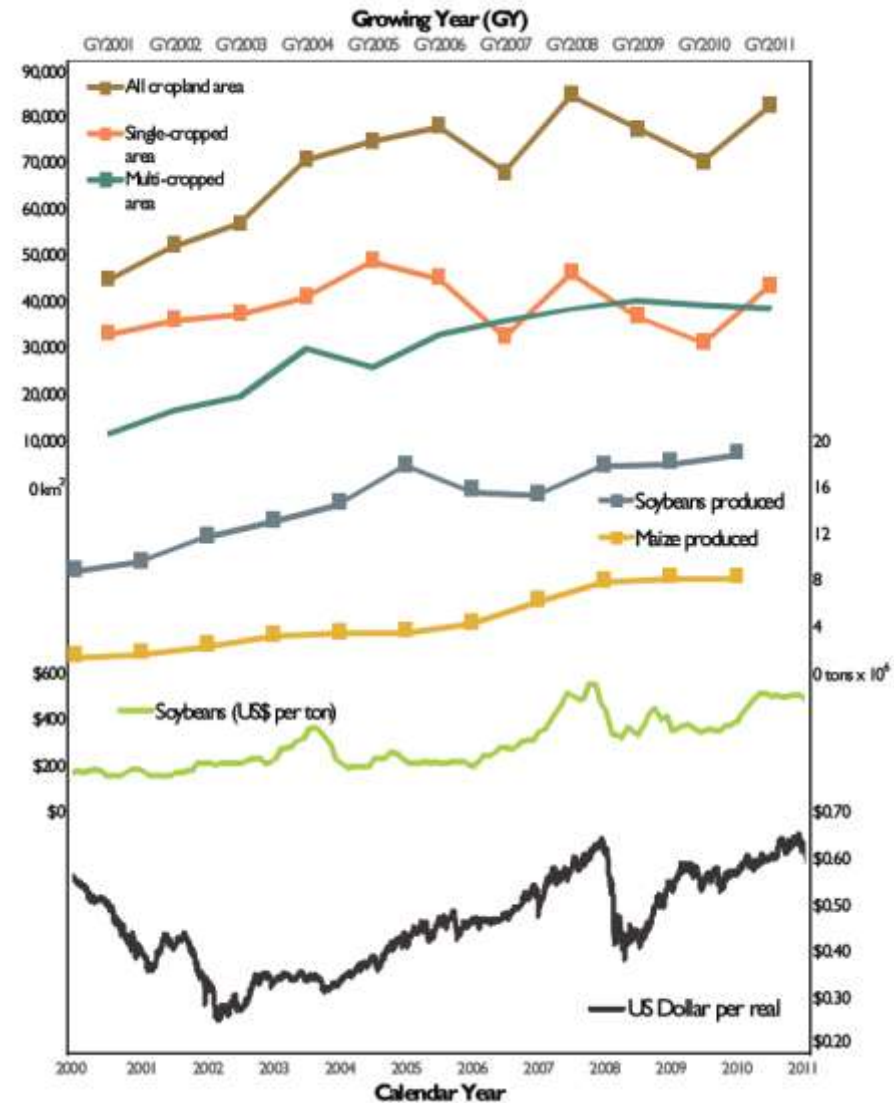
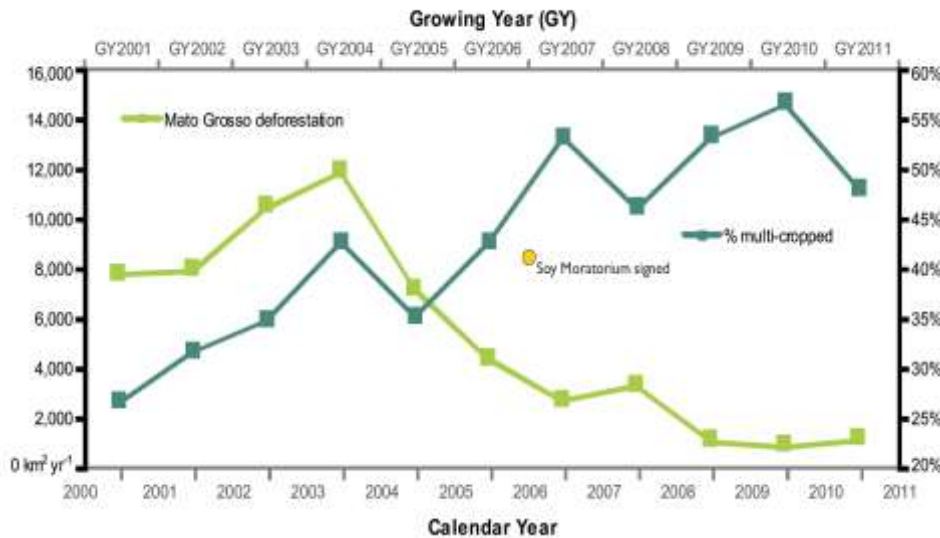
# Mato Grosso Land Use 2000



# Mato Grosso Land Use 2010



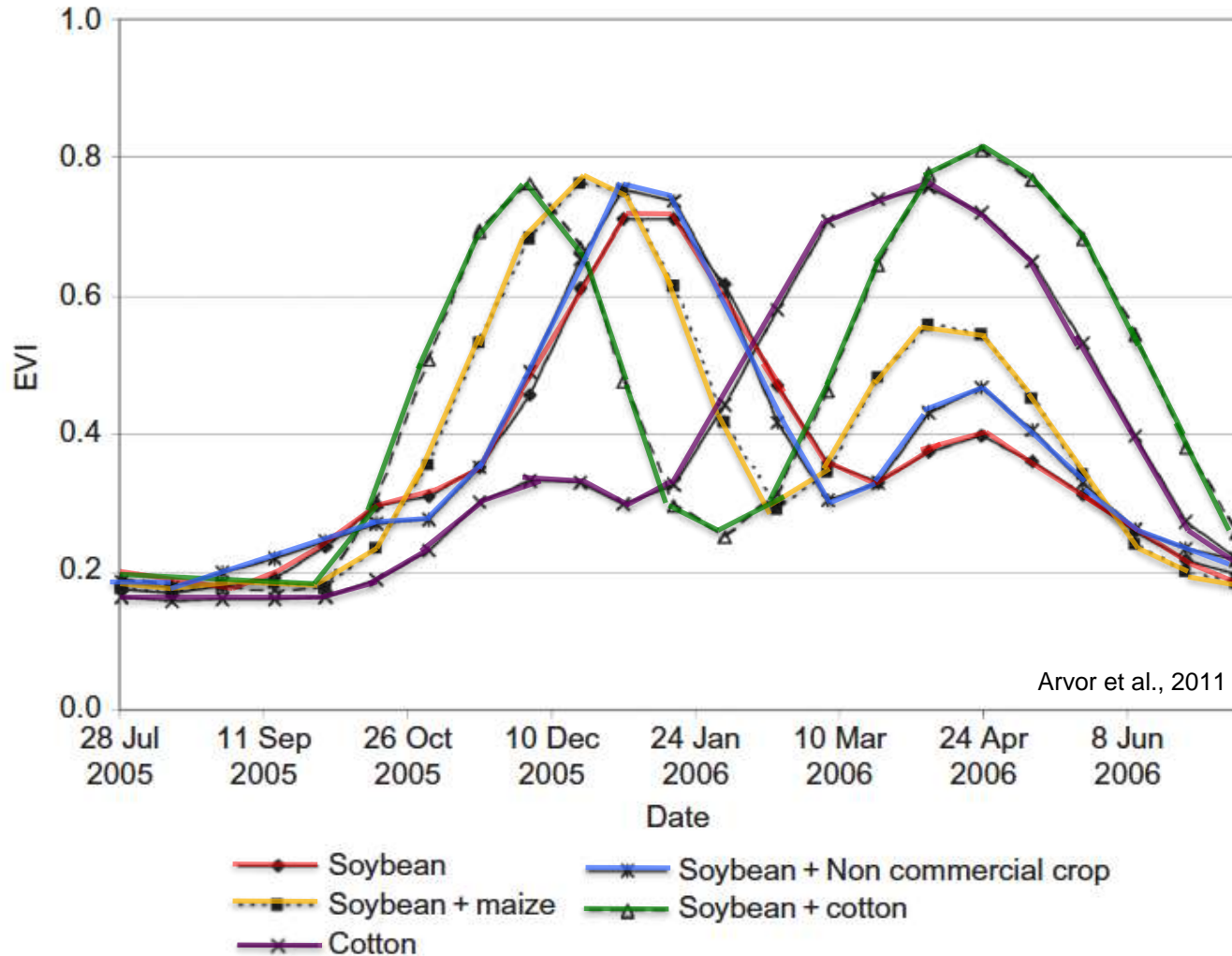
# Socioeconomic Trends



# Step 2

Determine the types of crops  
and their spatial distribution

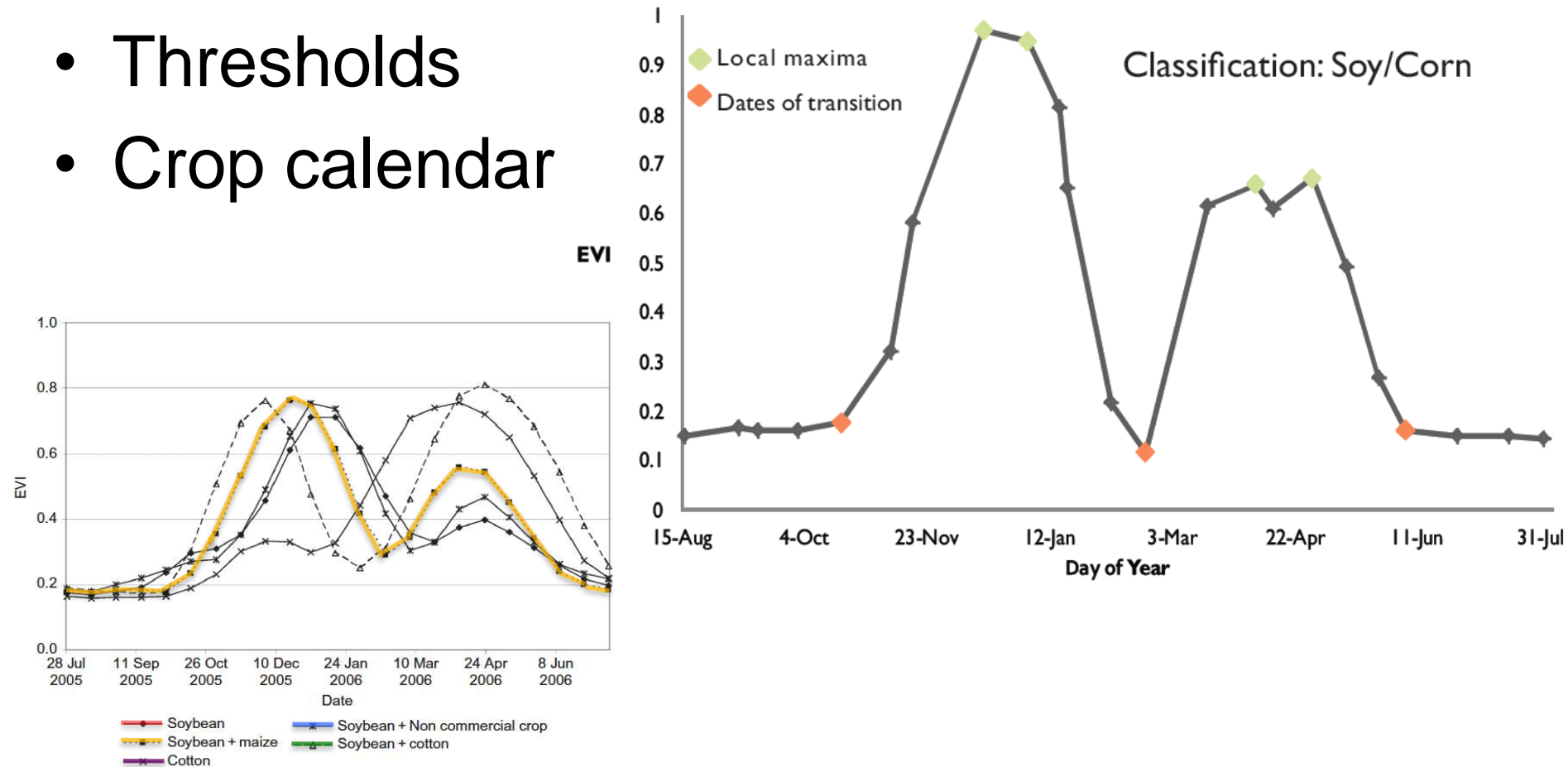
# Determining the types of crops and their spatial distribution



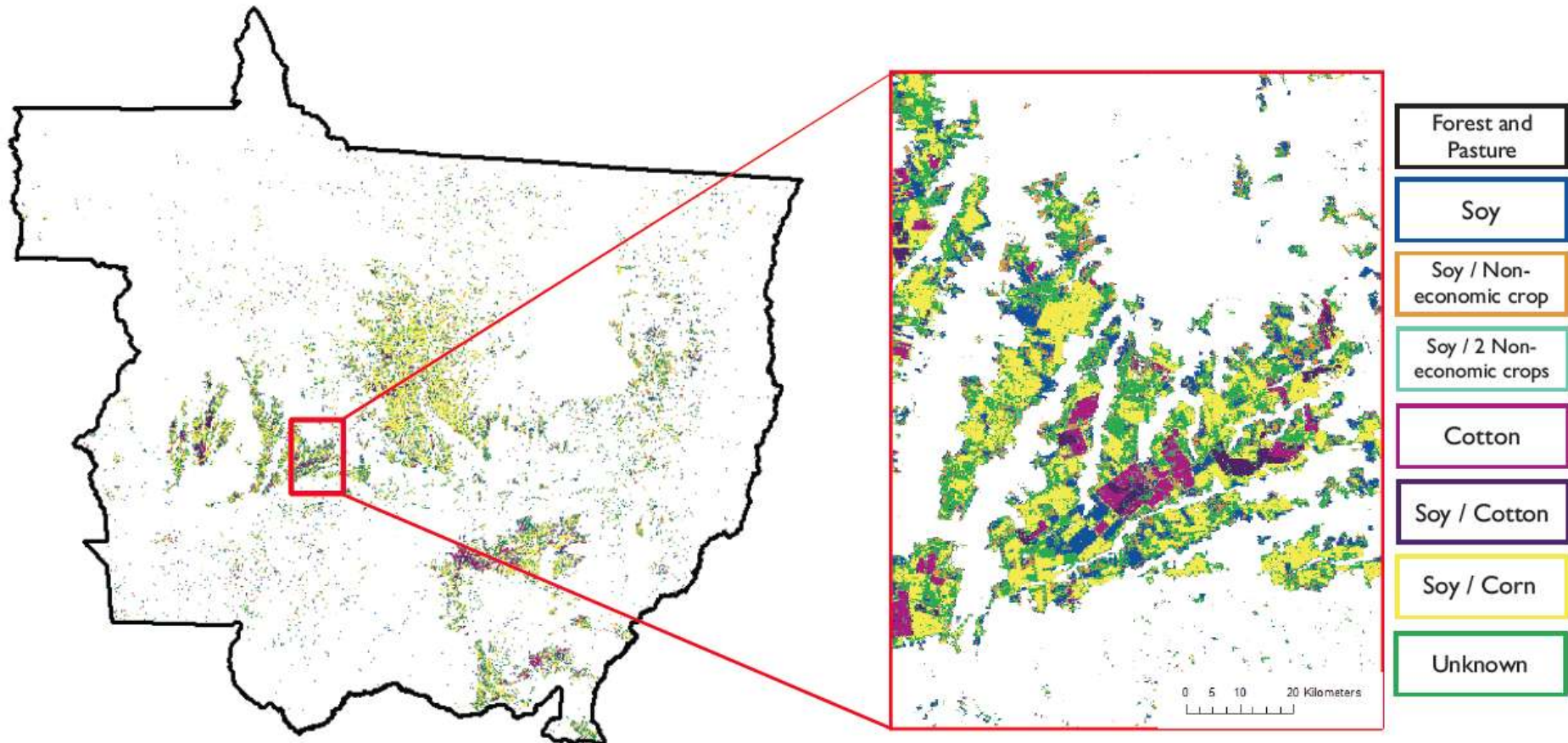


# Determine the types of crops and their spatial distribution

- Thresholds
- Crop calendar



# 2011 Growing Year Results



# Validation

REFERENCE DATA										
Classification	Soy	Cotton	Soy/Corn	Soy/Cotton	Sugarcane	Pasture	Soy/Millet	Forest	Unknown	Row Total
Soy	3									3
Cotton		3								3
Soy/Corn			45	7			1			53
Soy/Cotton		1		11						12
Sugarcane					0					0
Pasture						1				1
Soy/Millet										0
Forest								6		6
Unknown	4		3		1	1				9
Column Total	7	4	48	18	1	2	1	6	0	87
<b>OVERALL ACCURACY = 79.3%</b> <b><math>K_{HAT} = .67</math></b>										




$K_{hat}$  Statistic: Measure of distance between the actual agreement between the reference data and the result of classification, and the chance agreement between the reference data and a random classifier

# Step 2.5

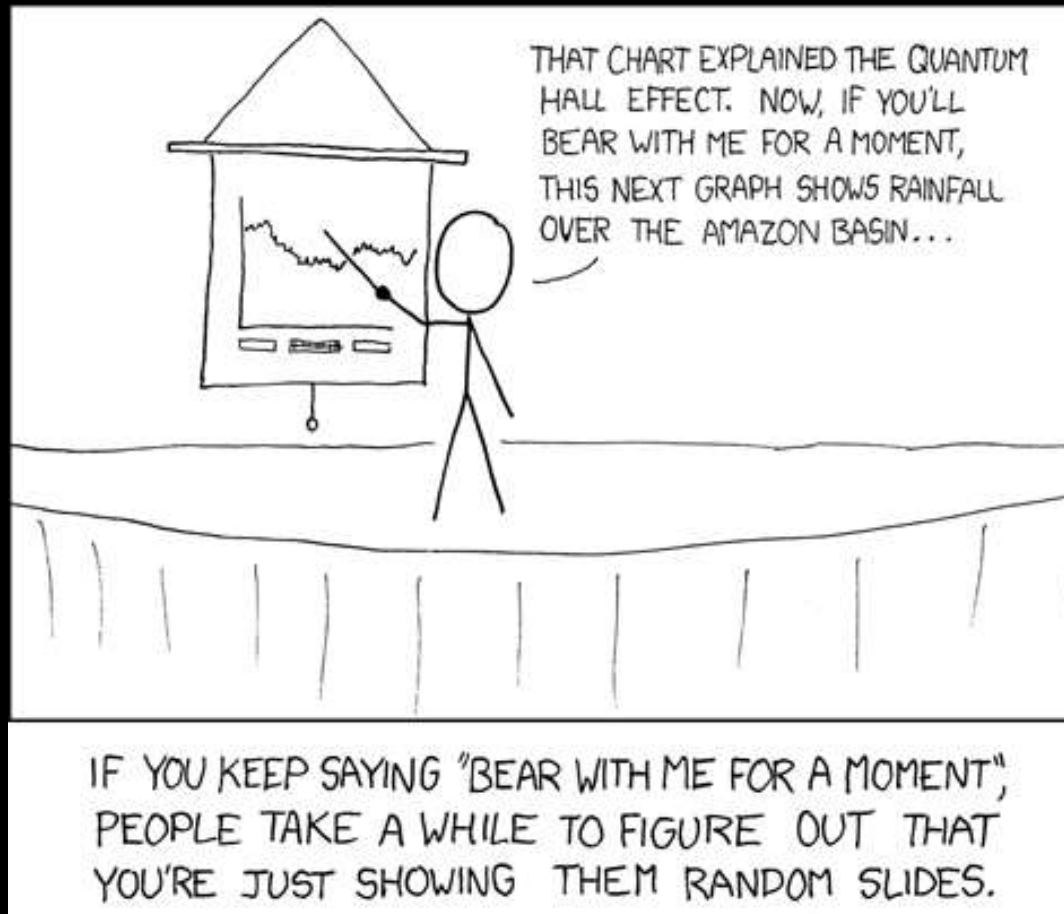
- Determine the nature of cropland expansion and multi-cropping intensification in Mato Grosso, Brazil between 2001-2012
- **Determine the types of crops and their spatial distribution with field work**
- Explain and attribute land-cover land-use change by determining the spatially and temporally variable drivers of intensification

# Field Work



-  Agricultural Land
-  Validation Points
-  Field Work, Summer 2012

# THANKS



## ACKNOWLEDGEMENTS

Lynn Carlson, John Mustard, Dan Mahr, Gillian Galford, Shane White, Ignite Spatial