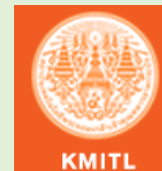


NASA LCLUC 2019 Annual Meeting
April 09-11 | Rockville, MD

Agricultural Land Use Change in Central and Northeast Thailand: Effects on Biomass Emissions, Soil Quality and Rural Livelihoods

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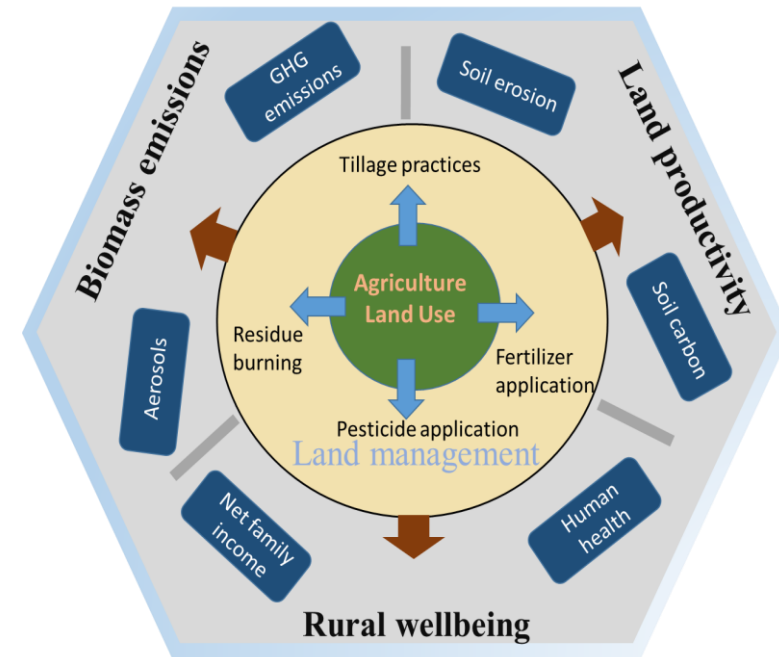


Project Motivation

- Agricultural landscapes are heterogeneous.
- Land use and land management decisions impact rural income, environment and food security.
- The primary obstacle - lack of frequent and sufficiently high/moderate resolution satellite observations.



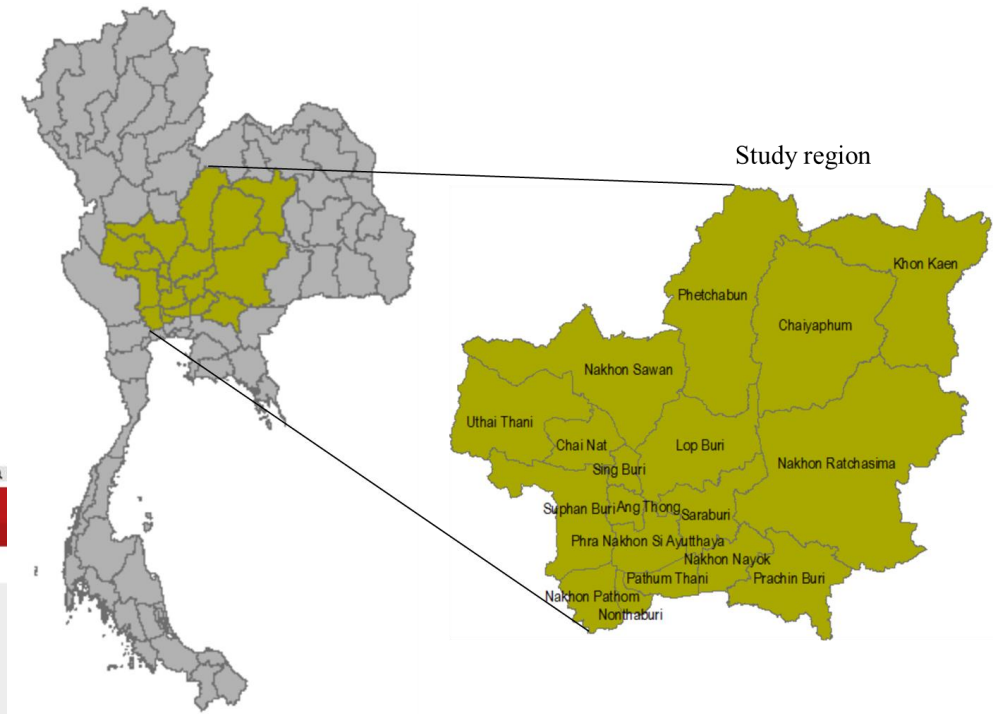
Multiple crops with in the small land area



Schematic showing relationship between land use and land management and their interactive effects on biomass emissions, land productivity and rural well-being.

Study region

- Agricultural restructure program (2015-2019)
- Rice is deprioritized and sugarcane has been promoted.



Provincial map of Thailand with study region represented in olive green color.



Thailand to reform its sugar regime

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Asia

Bangkok schools closed over 'unhealthy' pollution levels

30 January 2019

The smog is among the worst Thailand has ever seen

Toxic smog in Bangkok has forced more than 400 schools to close for the rest of the week, to protect children from its harmful effects.

Thailand's capital city is experiencing some of its worst-ever air pollution levels, caused by ultra-fine dust particles known as PM2.5.

Traffic exhaust, construction works, **burning crops** and pollution from factories are blamed for the haze.

Authorities' efforts to clear the air have so far failed.

Top Stories

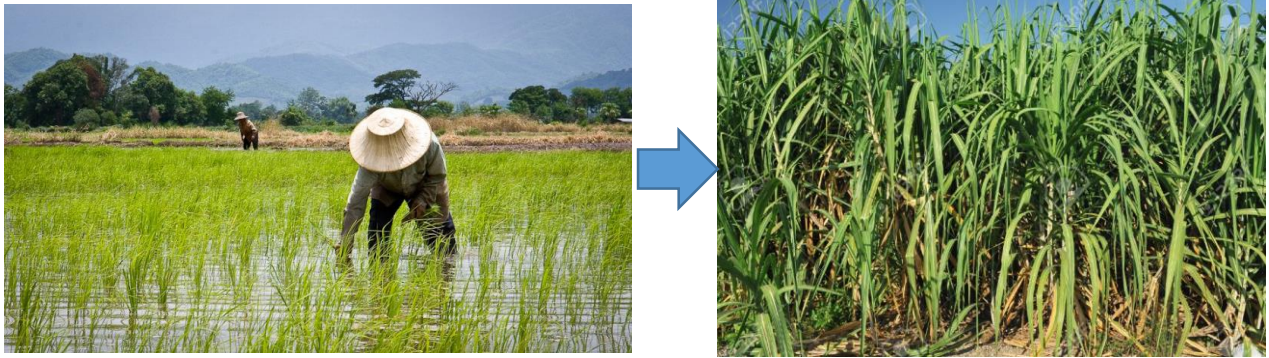
- US polar vortex death toll rises to 21
- Is nuclear control set to self-destruct?
- Images emerge of Brazil dam collapse

Features

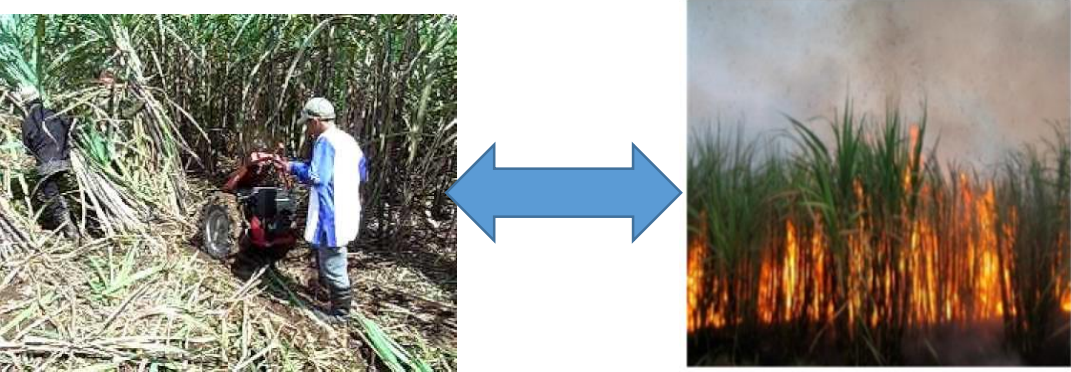
- Images emerge of Brazil dam collapse

Overall objectives

Area change in rice and sugarcane from 2014-2018 period



Residue burning in sugarcane



Residue burning in rice



Project Team

Crop Mapping

Sergii Skakun	UMD
Kristopher Lasko	UMD
Varaprasad Bandaru	UMD

Crop Modeling

Varaprasad Bandaru	UMD
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Jaiying He	UMD
Pallavi Chirumamilla	UMD
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Burned Area Mapping & Emissions

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Socio-Economics

Klaus Hubacek	UMD
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Local Thailand Partners

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Lampan Khurnpoon	KMITL
Bunditt Fungtamman	KMUTT
Vorraveerukorn Veerachit	MitrPhol

Project Tasks

TASKS

PRODUCTS

Crop Type Mapping

Crop type maps of major crops

Change in crop areas

Agroecosystem Modeling

Crop yields, water use
Soil organic carbon

Change in crop production, water use and soil carbon

Biomass Emissions Estimation

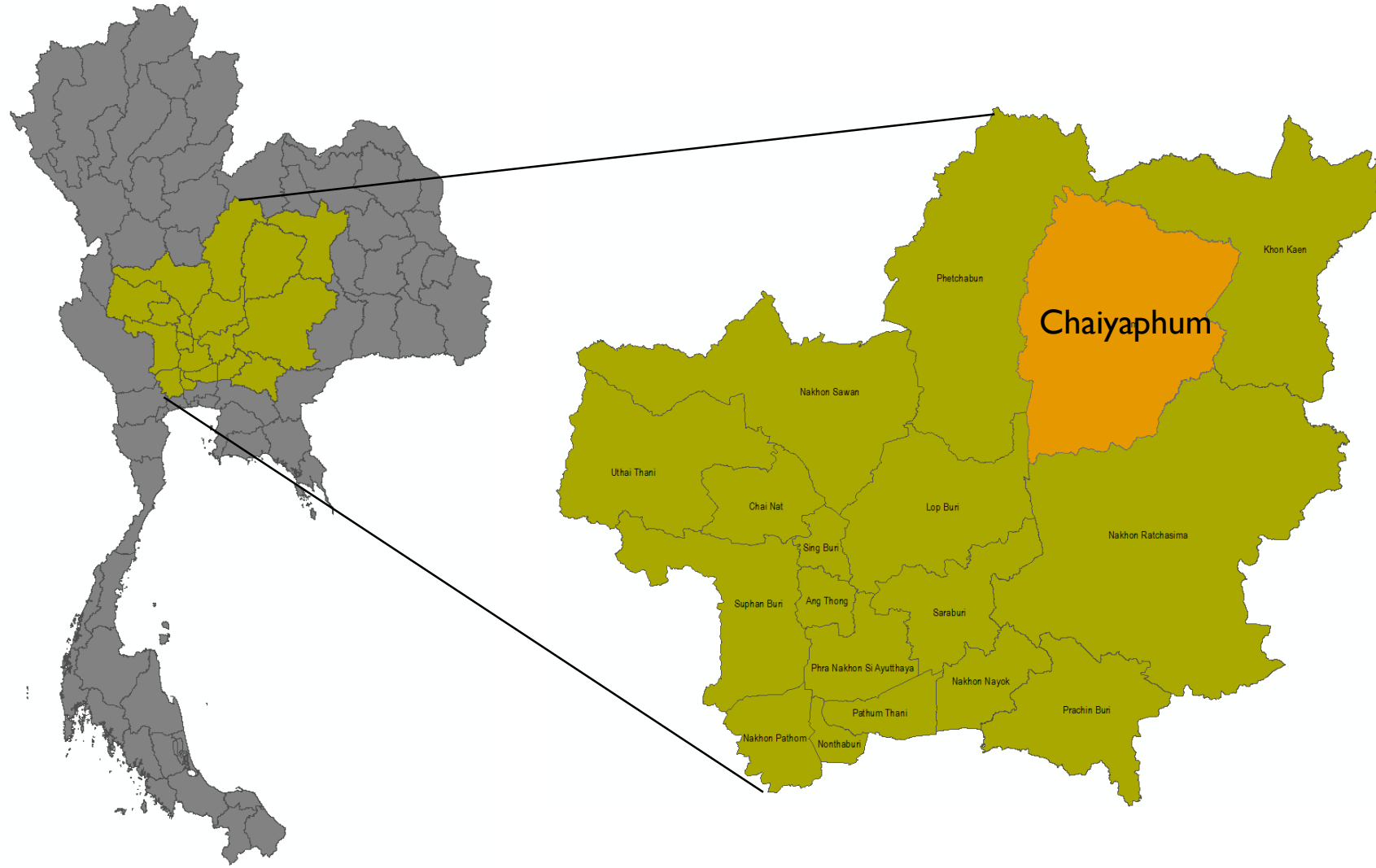
Burned area mapping

Biomass emissions

Socio-economic Modeling

Impacts on economy and rural livelihood

Testbed



Provincial map of Thailand with study and test bed regions represented in olive green and orange colors, respectively.

Task I. Crop type mapping

Remote sensing data

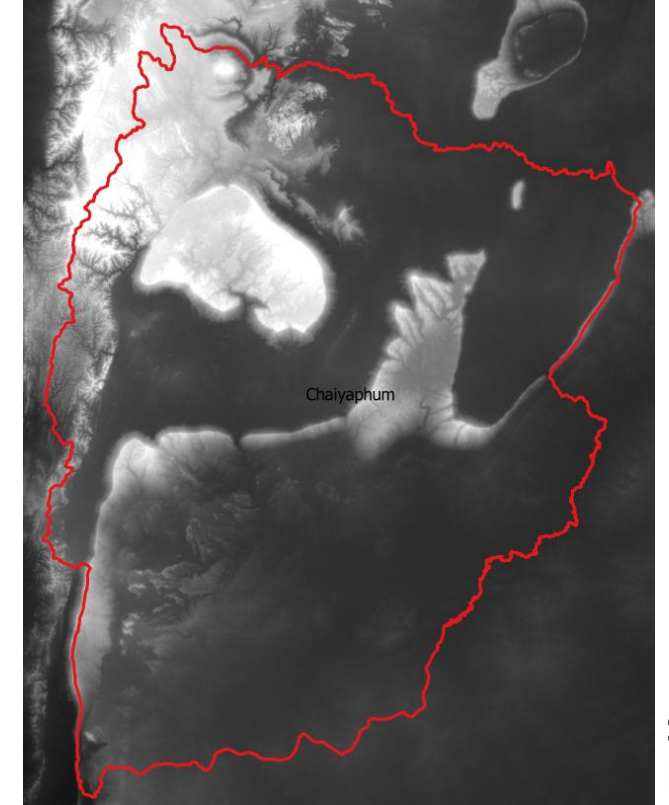
- Optical (HLS: Landsat 8 + Sentinel-2) + SAR (Sentinel-1) + DEM (SRTM)
 - L8: 161 scenes, S2: 396 scenes, S1: 324 scenes



SI
2018-06-23
VV-VH-VV



HLS
2018-10-03
SWIR-NIR-Red

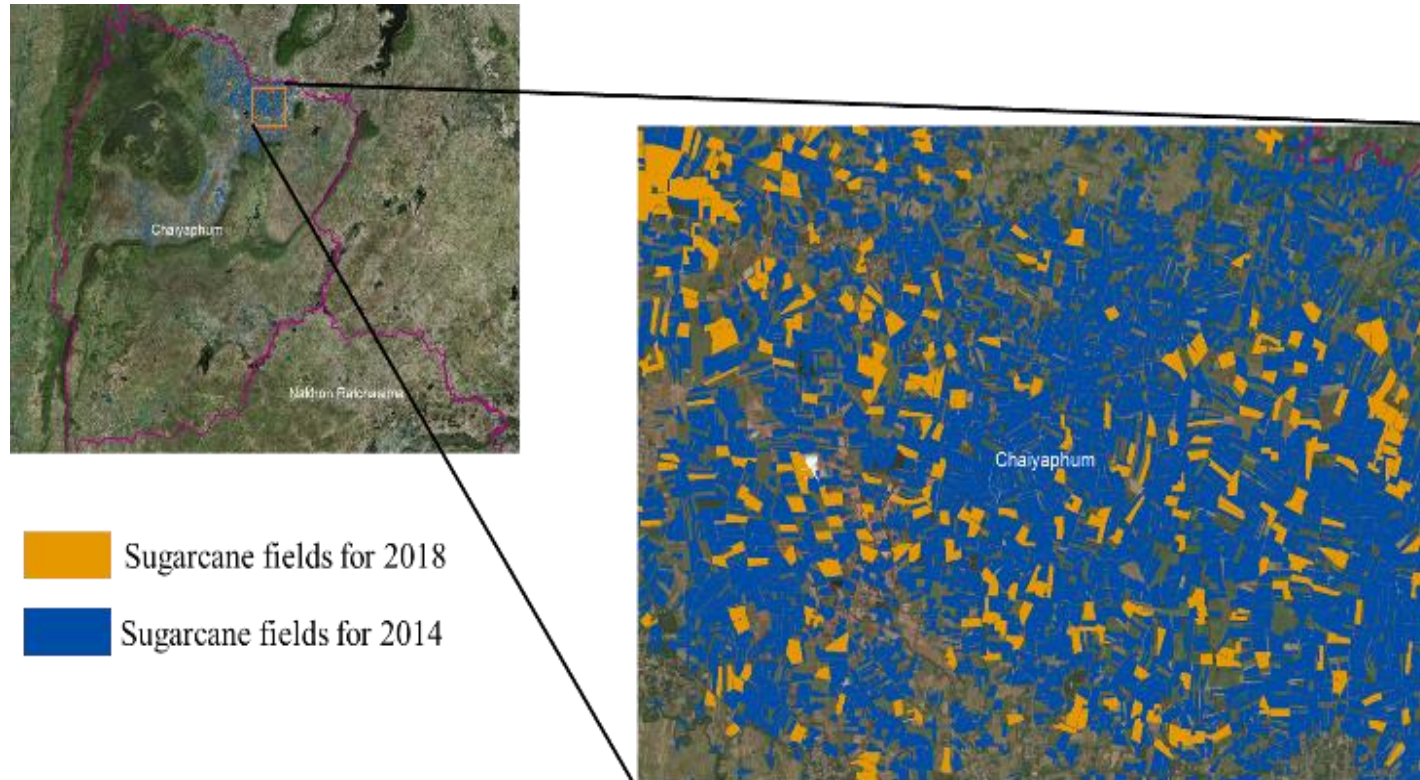


SRTM
DEM

Task I. Crop type mapping

Reference data

- ground truth (for crops) + photointerpretation for generic land cover

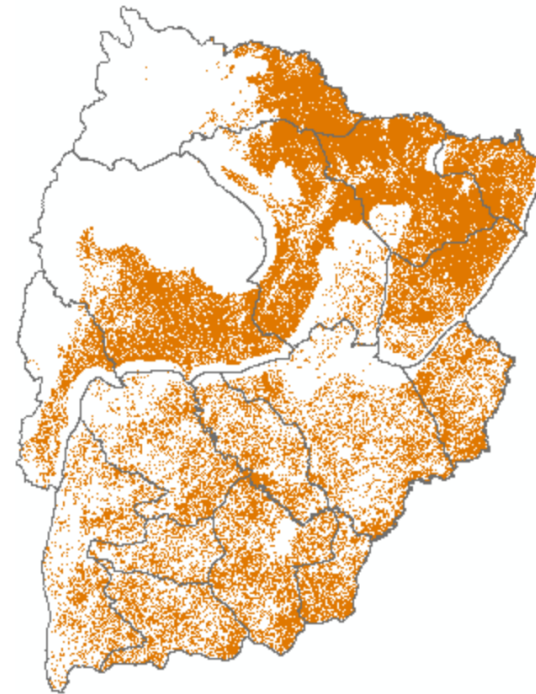
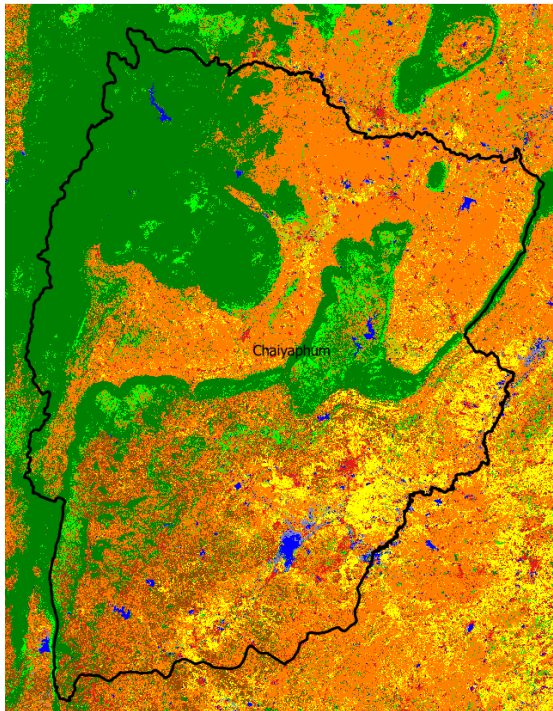


Digitized field locations with sugarcane production in 2014 and 2018 in Chaiyaphum province.

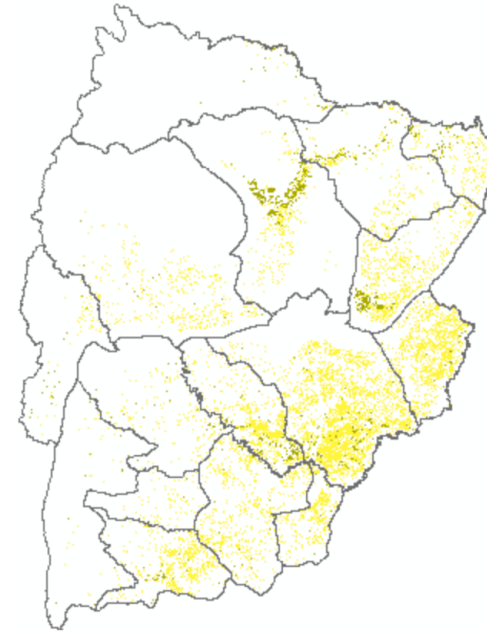
Task I. Crop type mapping

Land use classification

- Multi-layer perceptron (MLP); Architecture: 155-64-64-64-9
- Main confusions: Rice with wetlands; Grassland with crops (sugarcane and cassava)



Sugarcane



Single and double rice

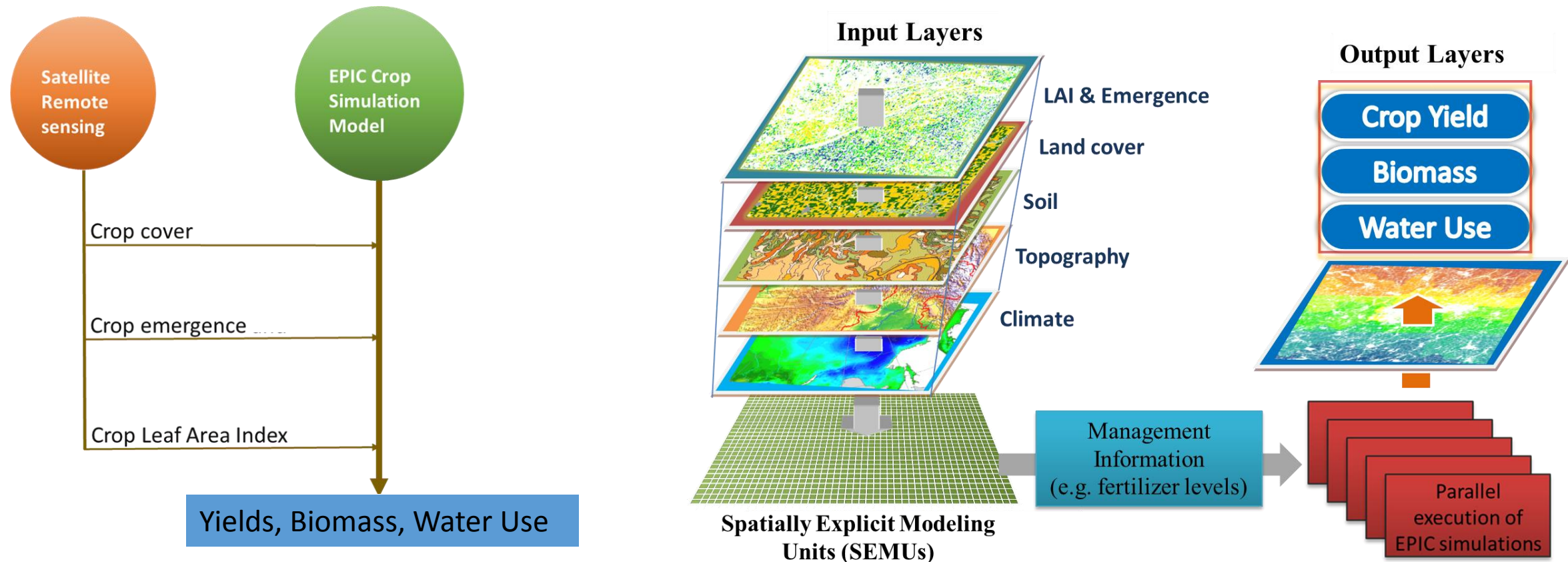
Legend

■ 1=Developed	■ 6=Sugarcane
■ 2=Forest	■ 7=Rice
■ 3=Grassland	■ 8=Rice
■ 4=Water	■ 9=Cassava
■ 5=Wetland	

OA=96.1%		
	UA, %	PA, %
1=Developed	97	99
2=Forest	99	99
3=Grassland	55	27
4=Water	92	100
5=Wetland	68	3
6=Sugarcane	95	99
7=Rice(single)	66	97
8=Rice(double)	84	66
9=Cassava	6	80

Task 2. I Crop yield and water use simulations

- RS-EPIC modeling framework has been used to simulate crop yields and water use for rice and sugarcane crops cultivated in 2018.

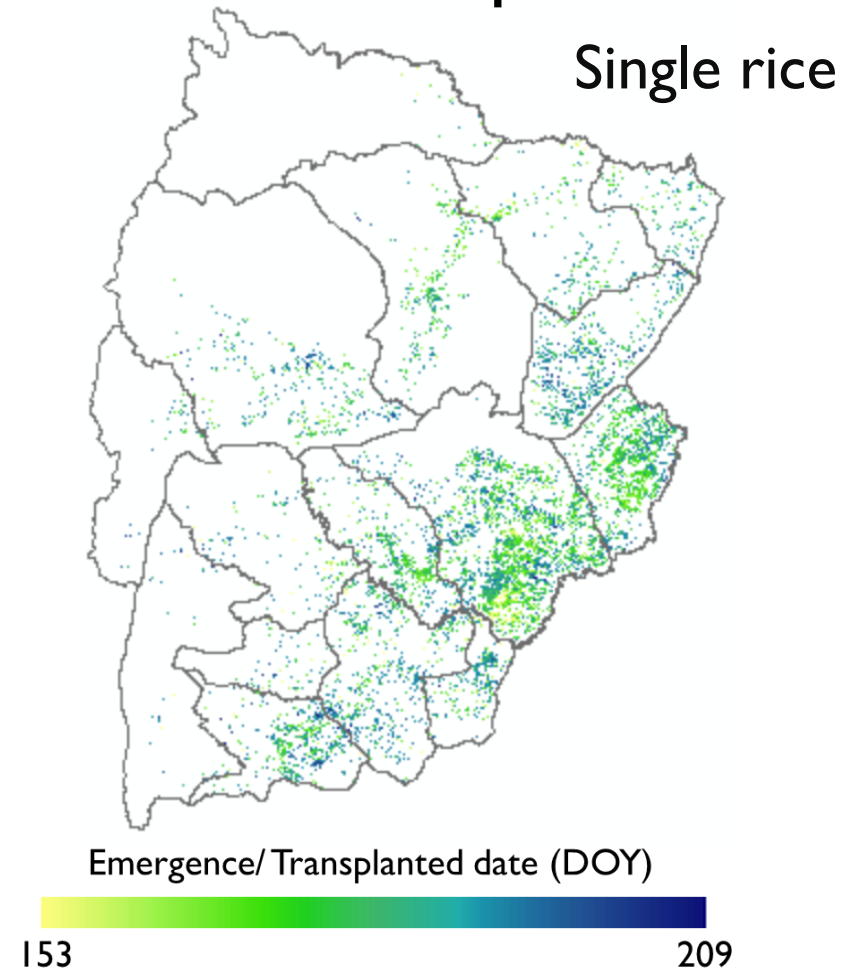
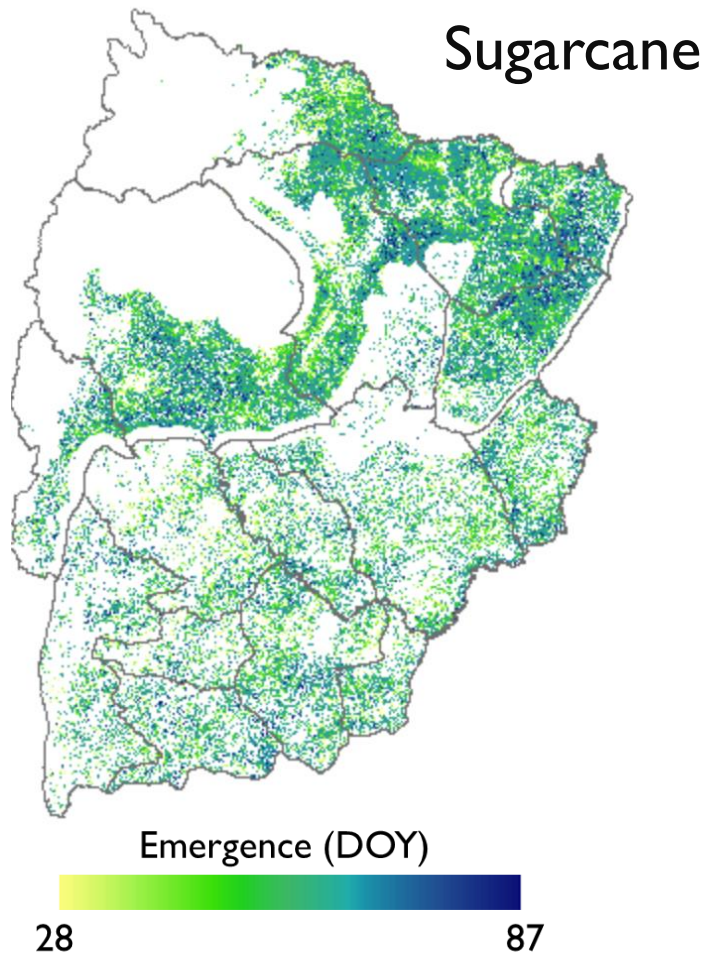


Elements of RS-EPIC

Task 2. I Crop yield and water use simulations

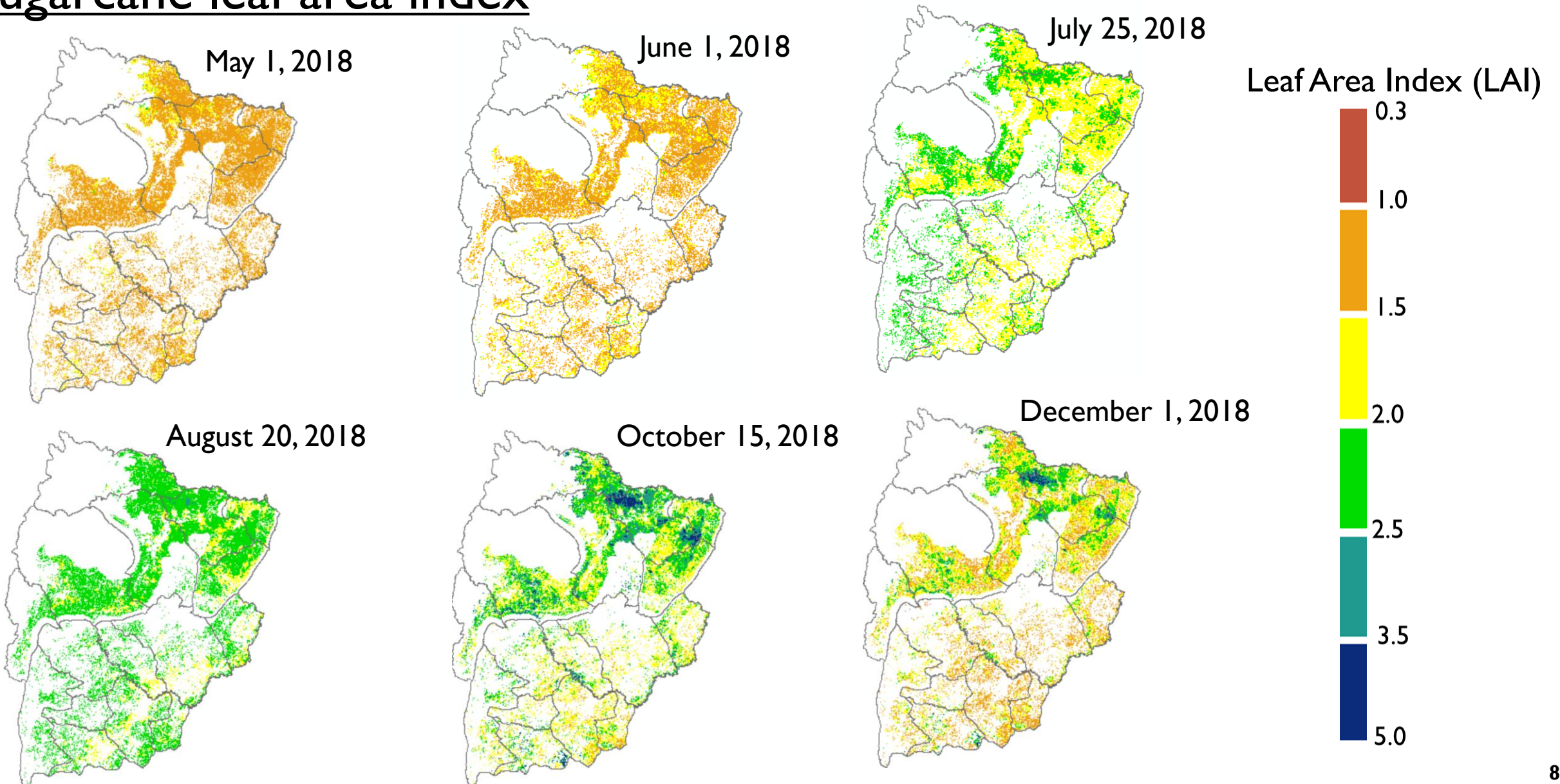
Crop emergence/transplanted dates

- PhenoCrop framework was used to estimate crop emergence/transplanted dates using downscaled MODIS data based on HLS product.



Task 2. Crop yield and water use simulations

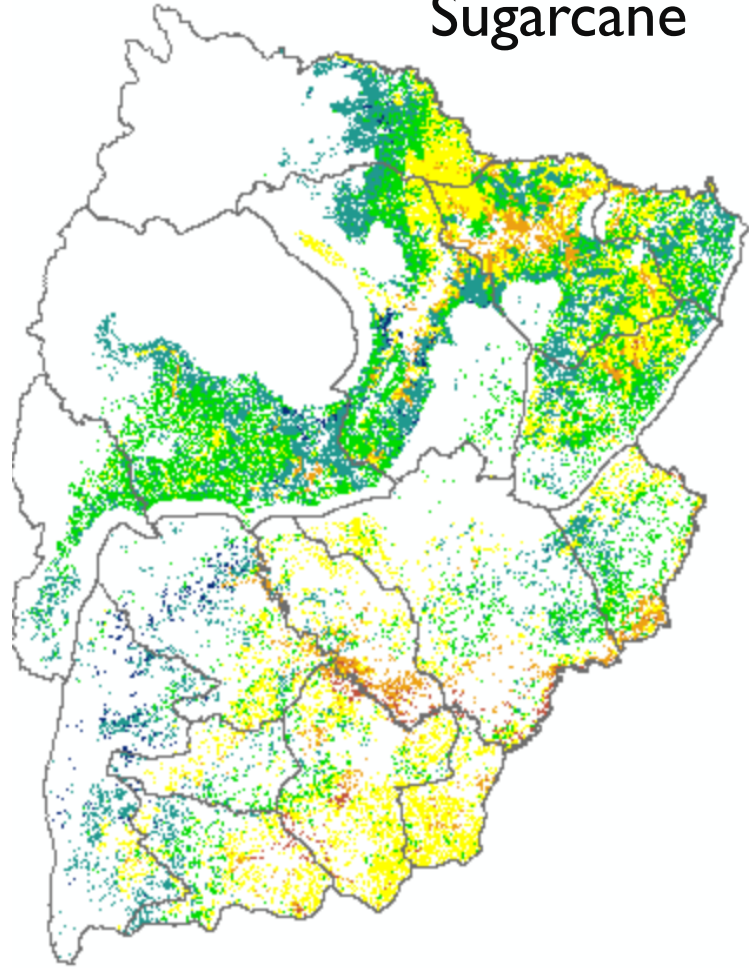
Sugarcane leaf area index



Task 2. Crop yield and water use simulations

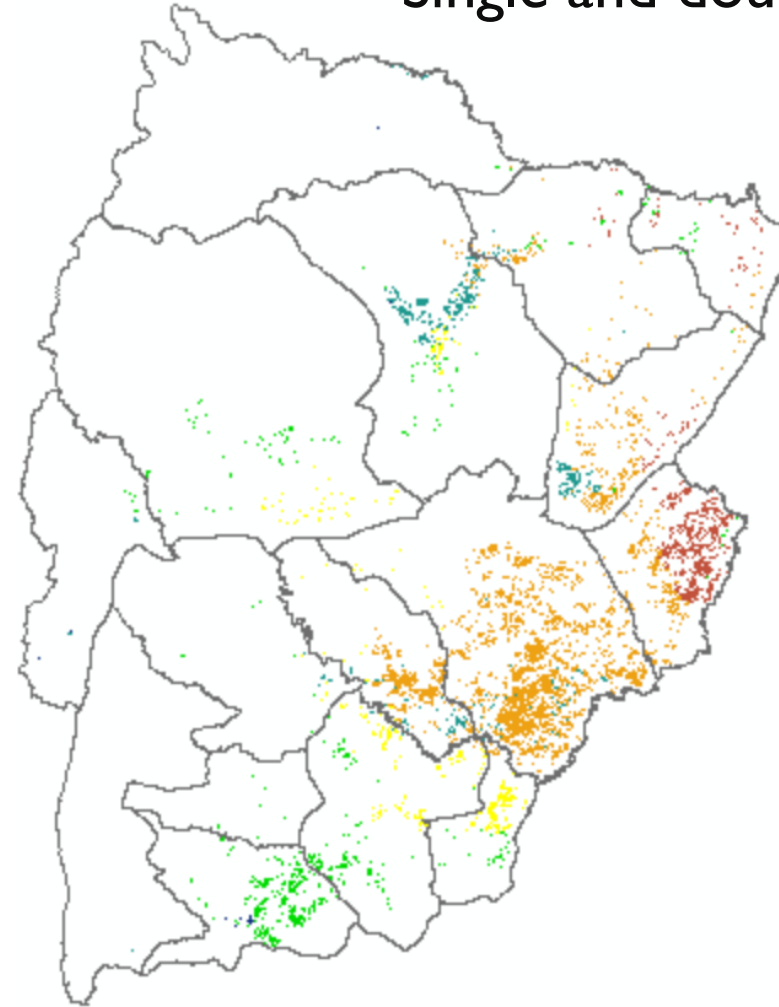
Crop Yields

Sugarcane

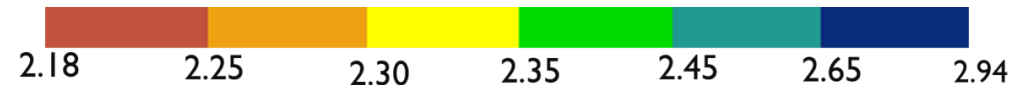
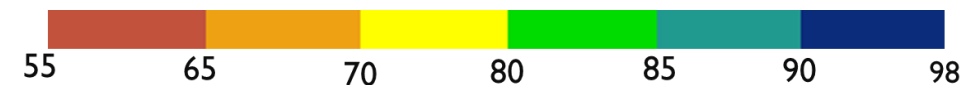


Yields (Mg/ha)

Single and double rice

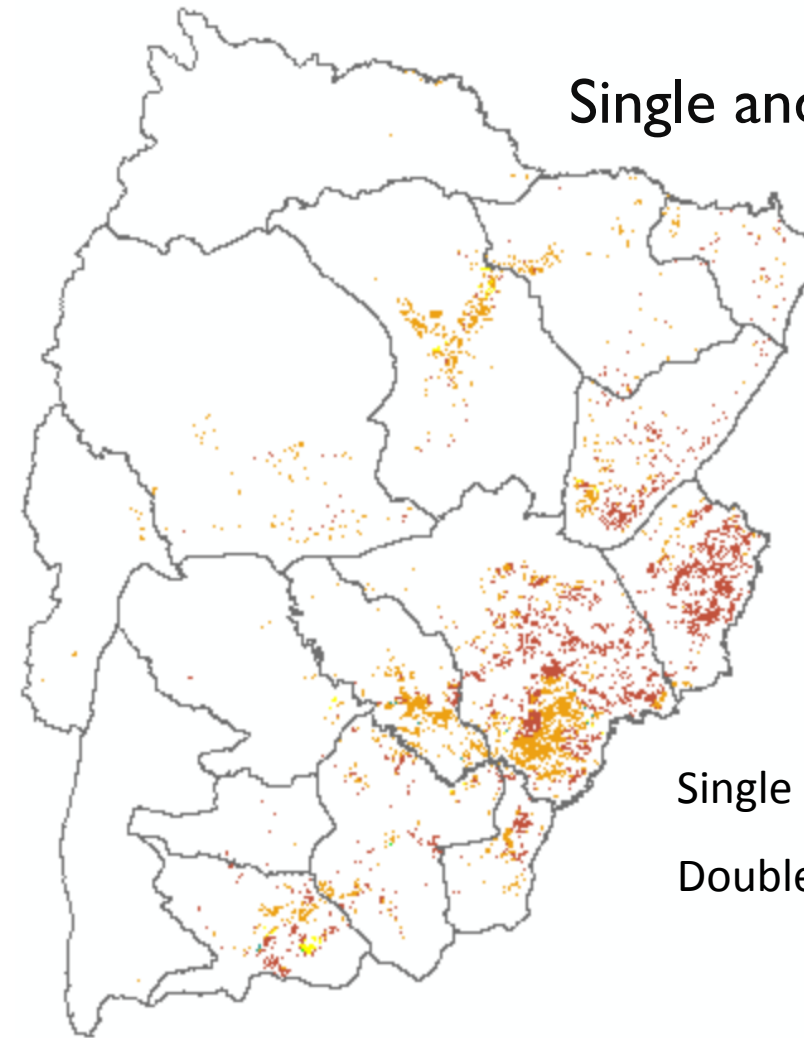
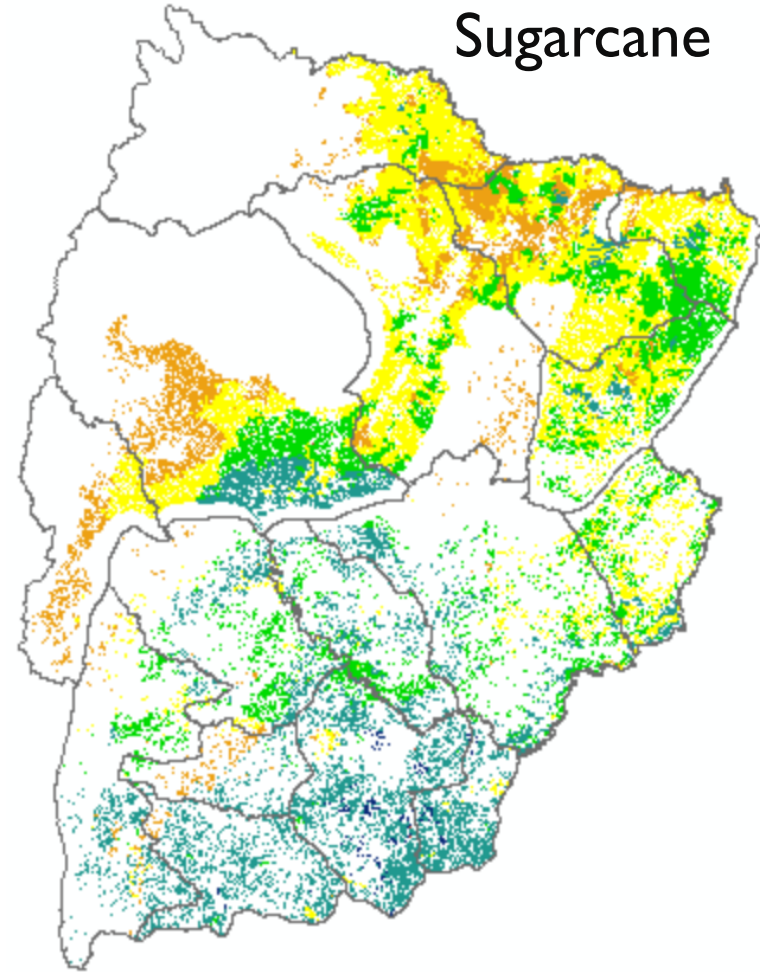


Yields (Mg/ha)



Task 2.1 Crop yield and water use simulations

Crop water use (ET)



Single rice mean = 664 mm

Double rice mean = 791 mm

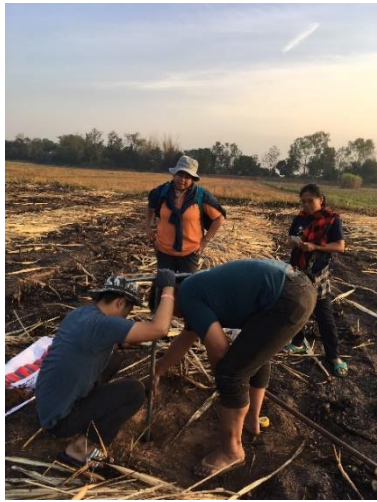
Water use (mm)

Mean = 905 mm



Task 2.2 Soil carbon dynamics

Soil sampling and analysis



Sugarcane field – no residue burning



Sugarcane field – residue burning



Rice field – no residue burning



Rice field - residue burning



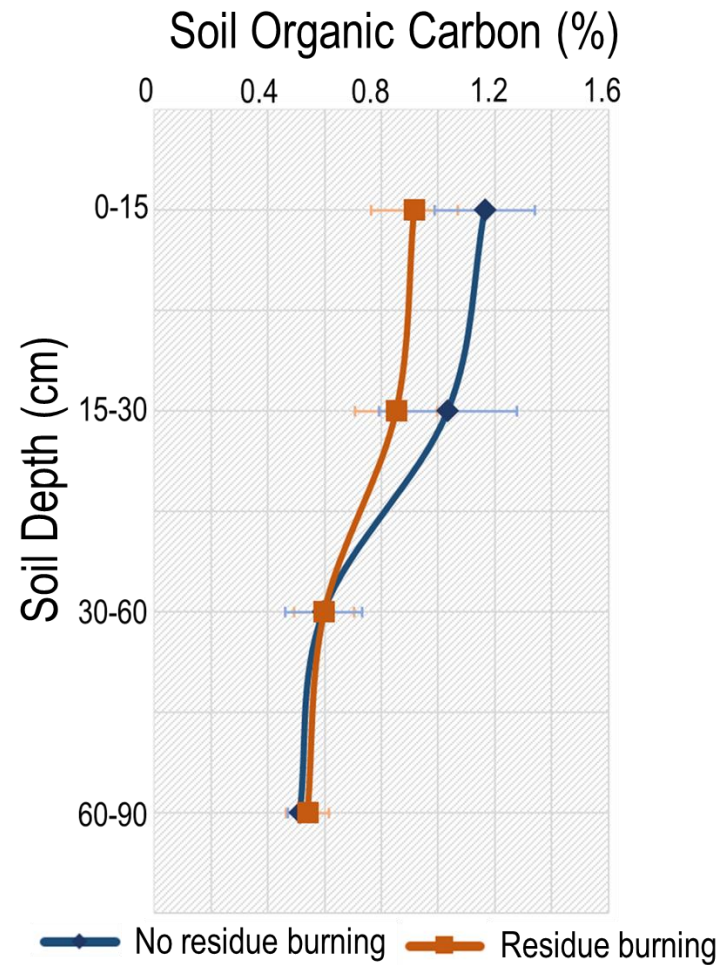
- Collected 12 soil samples in three provinces on fields having history of various residue management practices (e.g. residue burning and no residue burning) in rice and sugarcane.

- Visual interpretation of soil profiles suggested that soils with no residue burning practice are apparently darker (high organic carbon) compared to the soils subjected to residue burning in both rice and sugarcane.

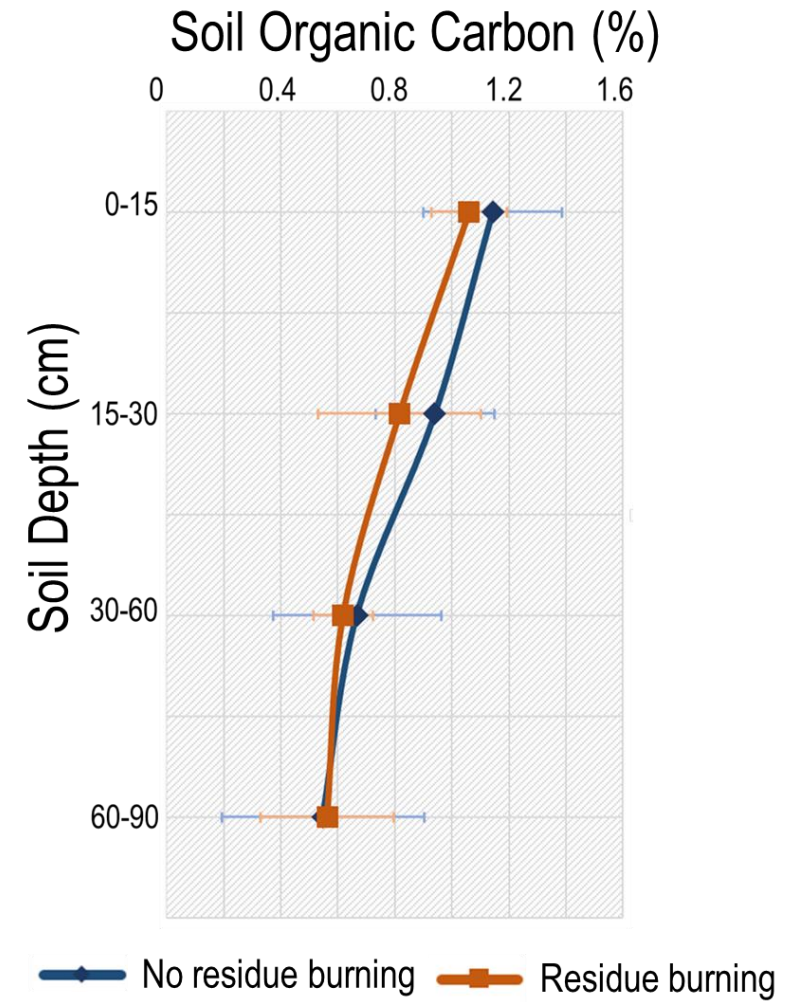
Task 2.3 Soil carbon dynamics

Soil sampling and analysis

Sugarcane



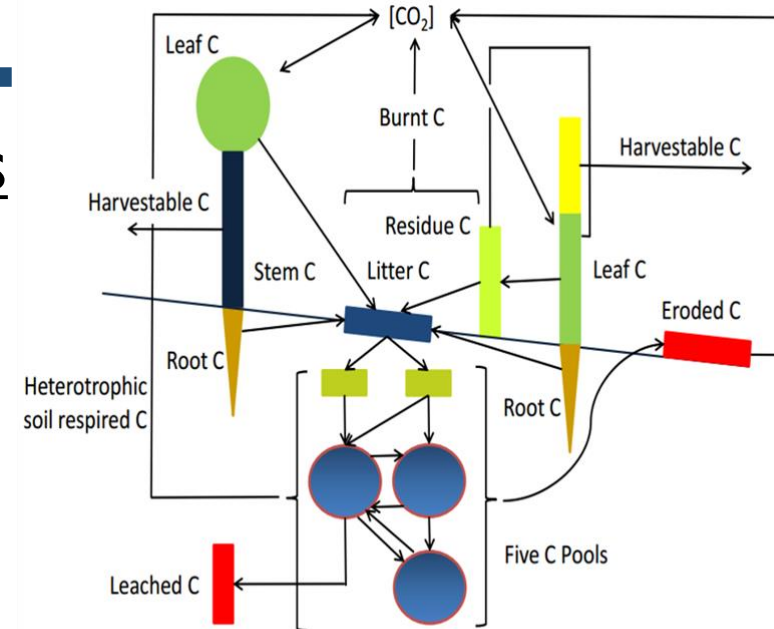
Rice



Task 2.3 Soil carbon dynamics

Land use change and residue management scenarios

Scenarios	Land use change	Change in residue management
Scenario-1	Sugarcane	No burning & no residue removal TO Burning
Scenario-2	Sugarcane	Burning TO No burning & no residue removal
Scenario-3	Sugarcane	Burning TO no burning & 50% residue removal
Scenario-4	Sugarcane	Burning TO no burning & 75% residue removal
Scenario-5	Single rice TO Sugarcane	No burning& no residue removal TO burning
Scenario-6	Single rice TO Sugarcane	No burning TO no burning & no residue removal
Scenario-7	Double rice TO Sugarcane	Burning TO burning
Scenario-8	Double rice TO Sugarcane	Burning TO No burning & no residue removal
Scenario-9	Double rice TO Sugarcane	Burning TO no burning & 50% residue removal
Scenario-10	Double rice TO Sugarcane	Burning TO no burning & 75% residue removal



Representation of carbon pools in EPIC model

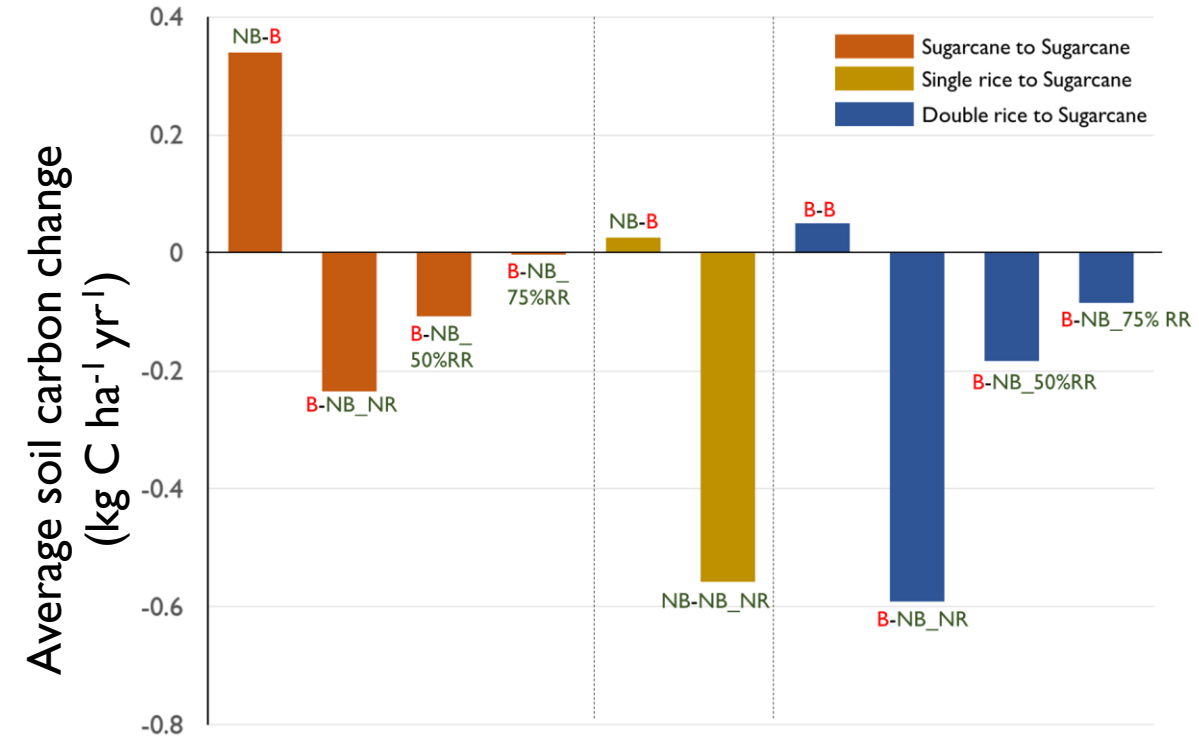
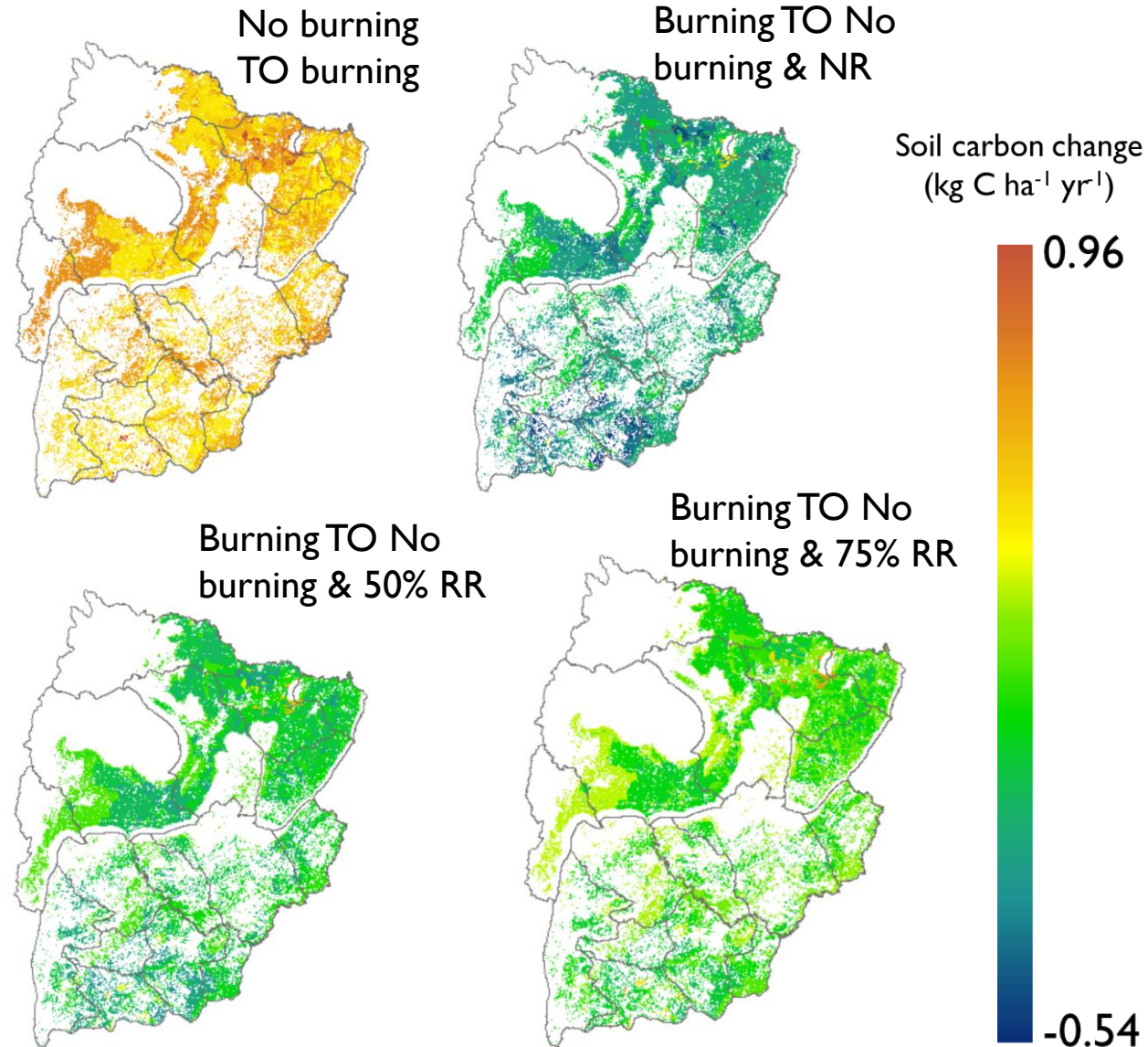


Residue collection for bio-power plant

- EPIC has detailed representation of various carbon pools and accounts both vertical and lateral fluxes.
- Alternative practices in the place of residue burning include 1) retaining residue on the field 2) removing for bioenergy.

Task 2.3 Soil carbon change dynamics

Regional soil carbon change



Average soil carbon change under different scenarios.

Conclusions and future work

- Crop type maps with high accuracy for 2018 were produced using HLS and sentinel-1 SAR data.
- Crop yields and water use under rice and sugarcane systems were estimated using RS EPIC spatial modeling framework.
- Soil organic carbon was shown to decline with residue burning in the top soil layers.
- We estimated regional soil carbon change under combination of different land use change and residue management practices.
- Conversion to no-residue burning irrespective of residue removal up to 75% was shown to increase the carbon sequestration.
- We combine survey data, crop type maps and other satellite observations to improve the burn area mapping and use pixel level residue to improve estimates of greenhouse gas emissions.

Thank You.