



# Parameterization of perennial bioenergy crops in Version 5 of the Community Land Model

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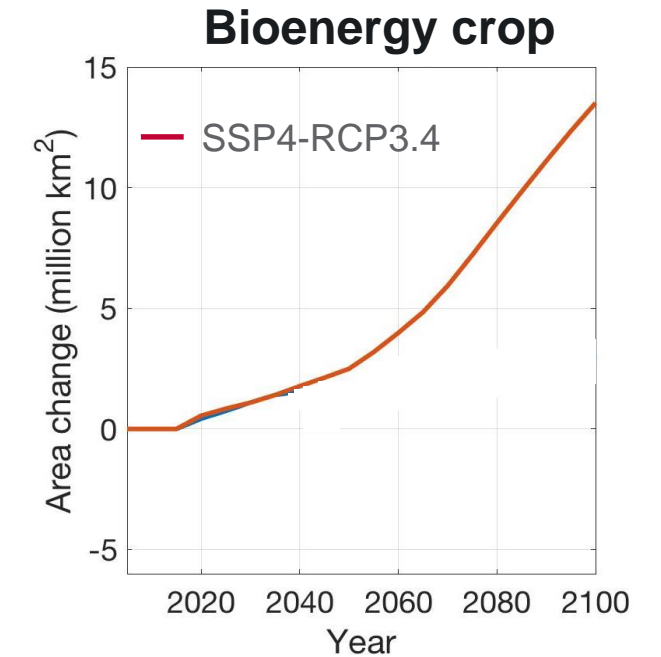
<sup>2</sup>Joint Global Change Research Institute, Pacific Northwest National Laboratory

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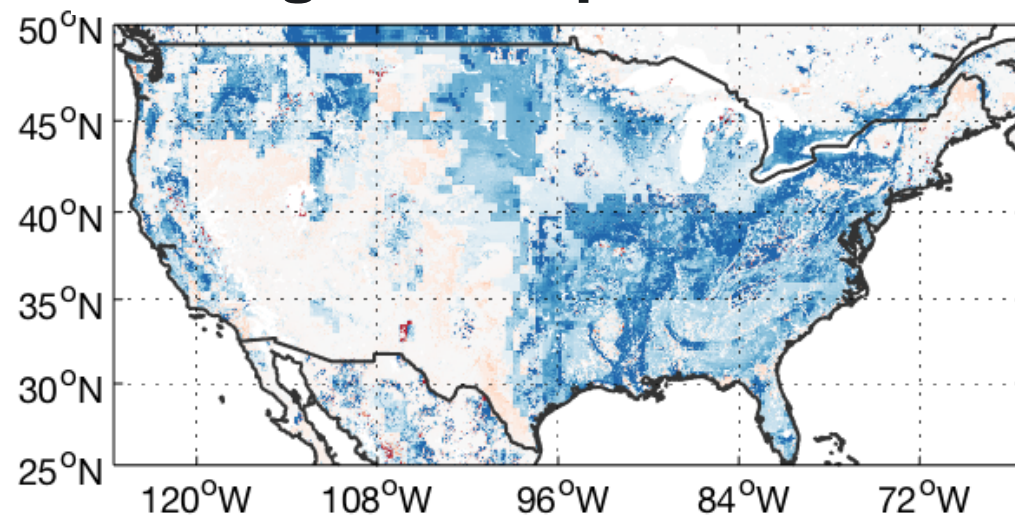
<sup>4</sup>Department of Plant Biology, University of Illinois at Urbana–Champaign

# Motivation

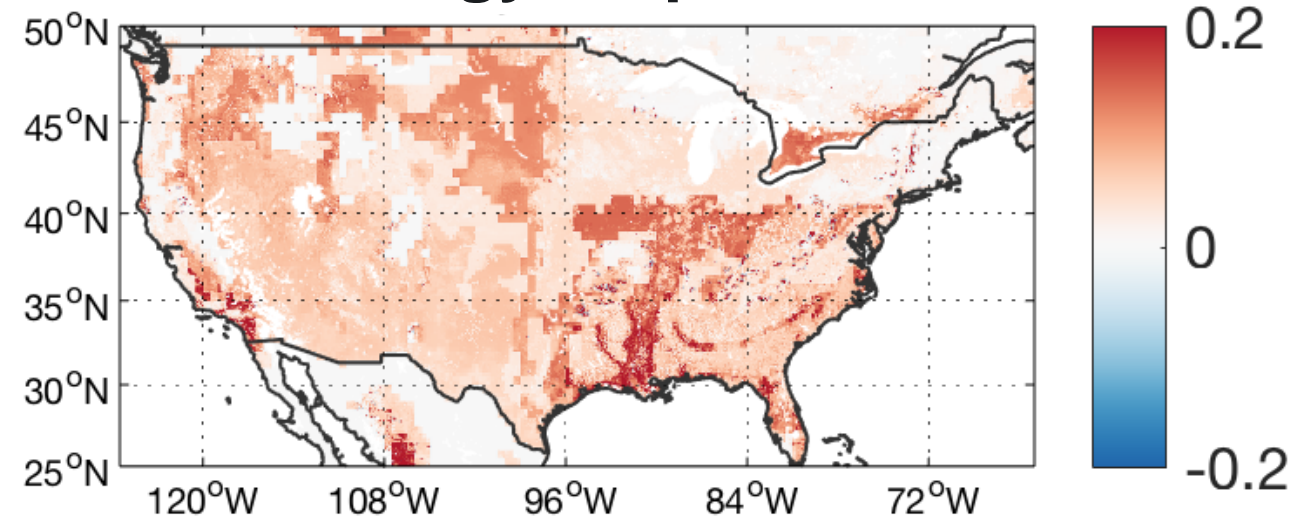
- **Biomass energy** is major renewable and sustainable energy source to replace fossil fuels and mitigate climate changes.
- Plantation areas of bioenergy crops are projected to **expand** in future land use change scenarios.



### Regular crop 2050-2005



### Bioenergy crop 2050-2005



*Changes in regular and bioenergy crop fractions between year 2050 and 2005 in the SSP4-RCP3.4 (with high biofuel mitigation)*

# Motivation

- While traditional crops can be used as biofuel feedstocks, they may have unfavored consequence.
- Perennial grasses such as **Switchgrass** and **Miscanthus** are better alternatives.

## Traditional crops:

- High demands for fertilization and irrigation
- Jeopardize food security and environmental sustainability



Source: <https://www.wideopenspaces.com/7-food-plot-crops-will-create-feeding-frenzy/>



Source: <https://research.umn.edu/inquiry/post/researchers-set-sights-uprooting-land-based-invasive-species>

## Perennial grasses:

- Less demands for nutrients and water
- High productivity



Source: <https://research.umn.edu/inquiry/post/researchers-set-sights-uprooting-land-based-invasive-species>



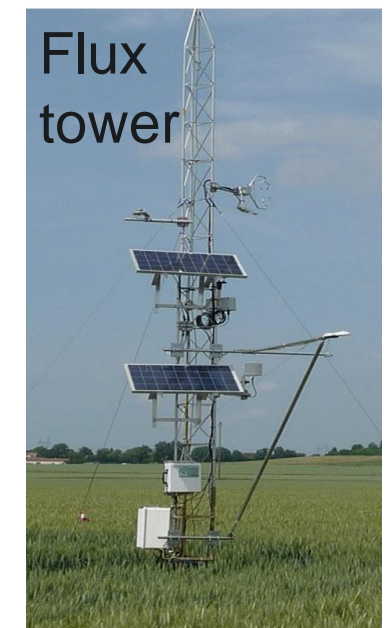
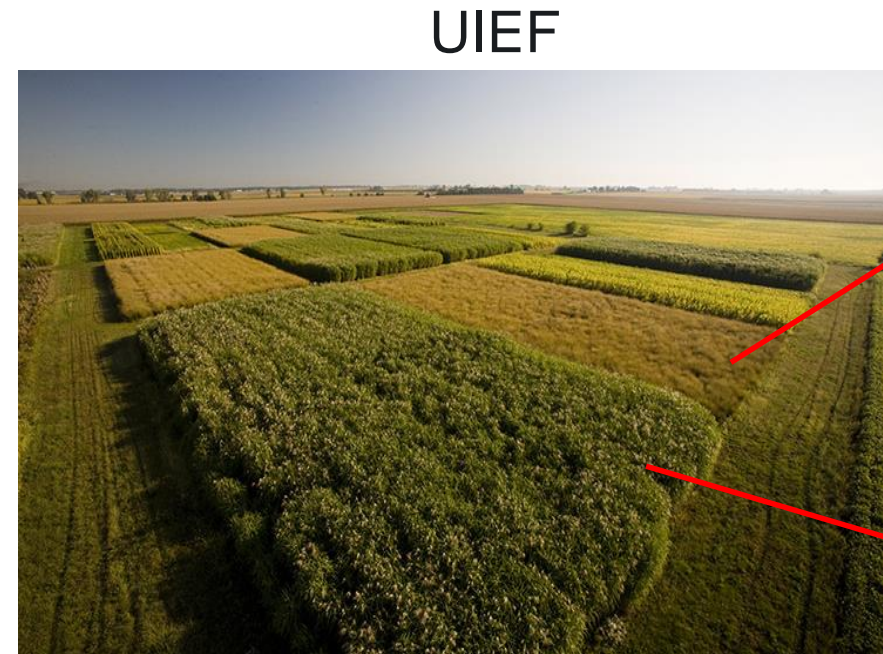
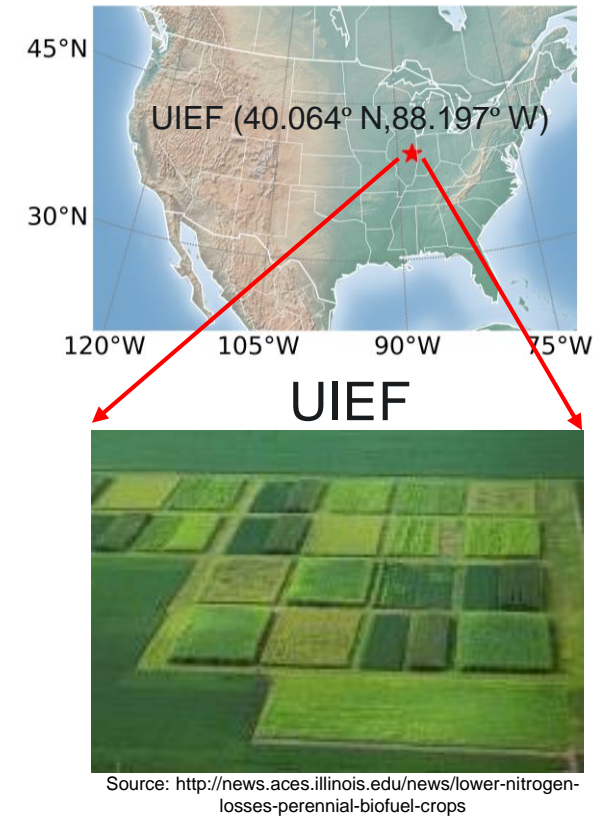
Credit: Rob Mitchell

# Objective

- We aim to **explicitly represent perennial bioenergy crops** in land model:
  - While ESMs are effective tools to study mitigation effects of land use change, representations of key bioenergy crops are missing in ESMs.
  - Developing representations of the key bioenergy crops in ESMs will help quantify their biogeophysical and biogeochemical effects.

# Site description

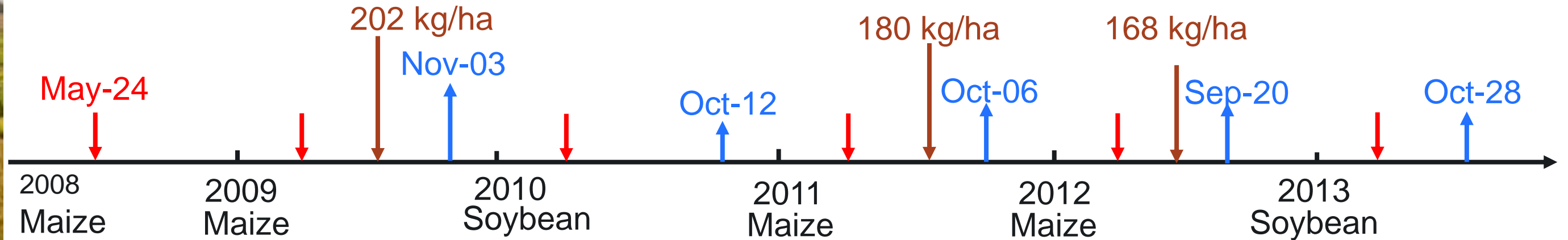
- University of Illinois Energy Farm (UIEF) in central Illinois.
- Three experimental plots (each 4 ha in size, 200 X 200 m) :
  1. Maize-soybean rotation;
  2. Switchgrass;
  3. Miscanthus;
- Three plot-level measurements over **2009-2013**:
  - Meteorological data: rain, incoming radiation, relative humidity, temperature, etc.
  - Carbon fluxes: gross primary production (GPP), net ecosystem exchange (NEE), etc.
  - Energy fluxes: latent heat, etc.
  - Water fluxes: evapotranspiration, runoff, etc.



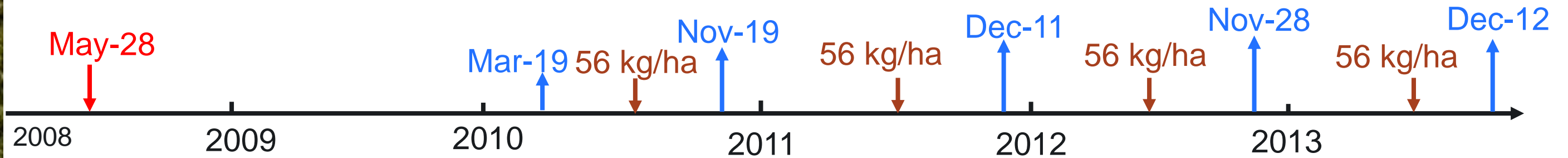
# Site description: Land use management

Planting (date)

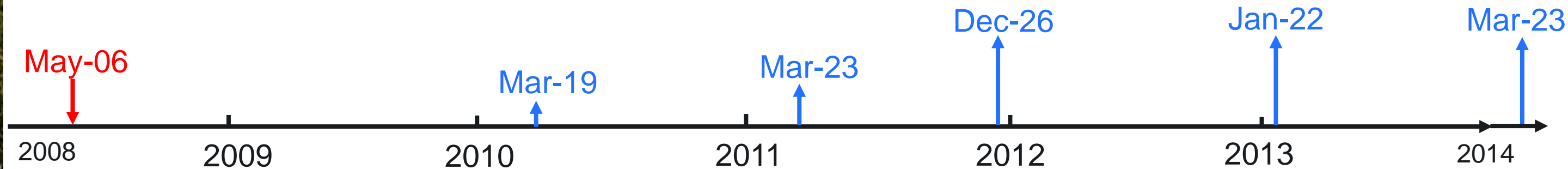
Fertilization  
Harvest (date)



1. Maize-soybean rotation



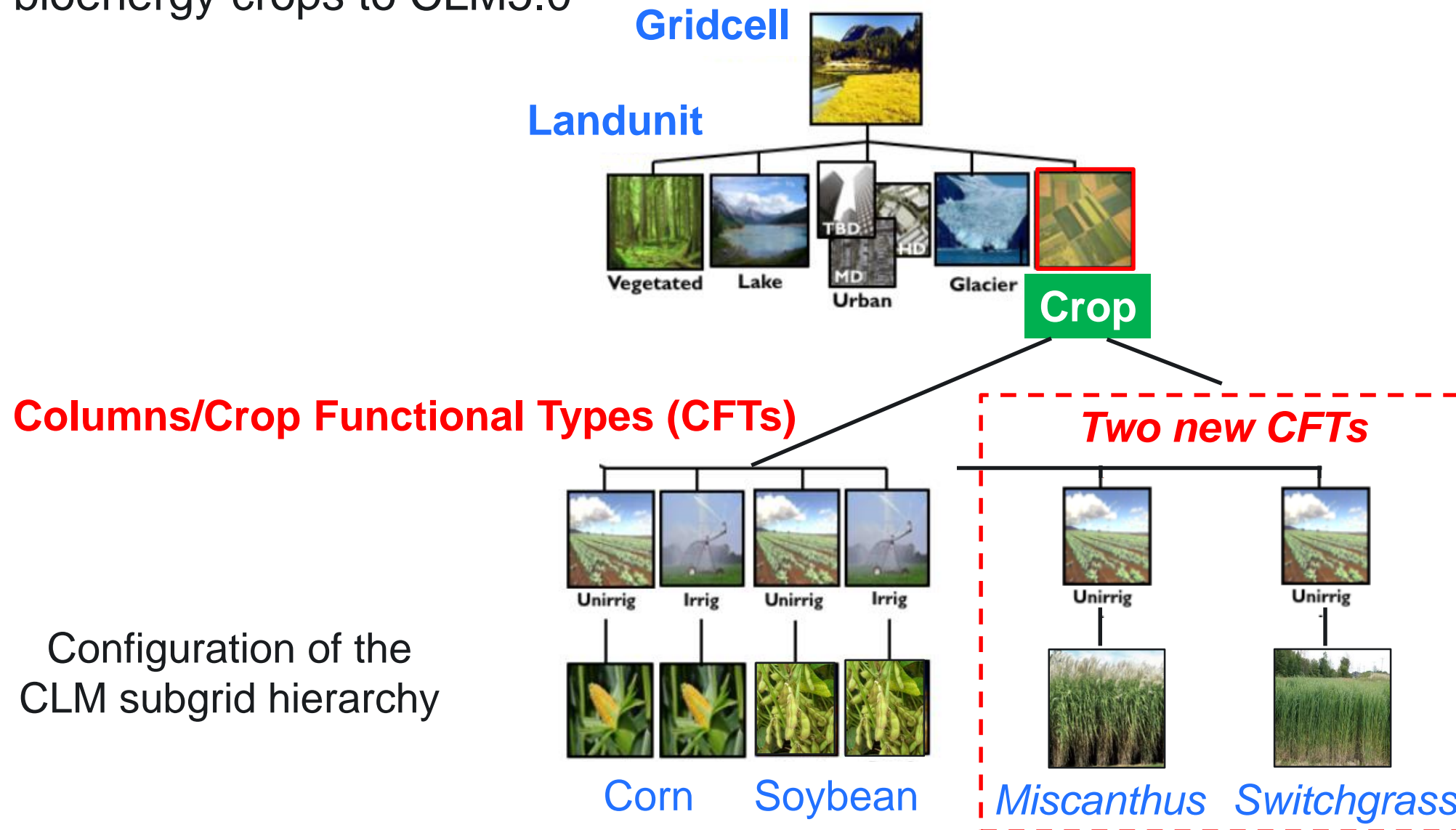
2. Perennial grass: Switchgrass



3. Perennial grass: Miscanthus

# Method: model improvement

- Community Land Model version 5 (CLM5.0)
- Add two bioenergy crops to CLM5.0



# Method: parametrization

	Parameters	Description	Units	Corn	Soybean	Switchgrass	Miscanthus
<b>Photosynthesis capacity</b>	s_vcad	Slope of the relationship between leaf N per unit area and Vcmax25top	umol CO <sub>2</sub> /s/gN	26.48	42.96	40.96	59.23
	i_vcad	Intercept of the relationship between leaf N per unit area and Vcmax25top	umol CO <sub>2</sub> /m <sup>2</sup> /s	3.21	4.71	6.42	14.71
	slatop	Specific Leaf Area (SLA) at top of canopy, projected area basis	m <sup>2</sup> /gC	0.05	0.035	0.042	0.052
<b>Crop phenology</b>	laimx	Maximum Leaf Area Index	-	5	6	6.5	10
	hybgdd	Growing Degree Days for maturity	-	1700	1900	2850	3000
	mxmat	Maximum number of days to maturity	days	165	150	210	210
<b>Carbon cost of nitrogen uptake</b>	kc_nonmyc	Constant relating root C to non-mycorrhizal root active uptake cost	gC/m <sup>3</sup>	7.2	0.72	0.72	0.72
	kn_nonmyc	Constant relating soil layer Nitrogen content to non-mycorrhizal root active uptake cost	gC/m <sup>2</sup>	0.12	0.012	0.012	0.012
	FUN_fracfixers	The maximum fraction of assimilated carbon that can be used to pay for N fixation	fraction	0	1.0	0.25	0.25
	fun_cn_flex_c	Parameter linking leafCN content and N cost to FUN C expenditure	-	5	5	100	500
<b>Allocation</b>	fleafi	Leaf Allocation coefficient parameter fraction used in CNAallocation	-	0.6	0.85	0.7	0.9
	arooti	Root Allocation coefficient parameter used in CNAallocation (initial)	-	0.1	0.2	0.14	0.13
	arootf	Root Allocation coefficient parameter used in CNAallocation (final)	-	0.05	0.2	0.09	0.08
<b>Decomposition</b>	rf_l3s2_bgc	Respiration fraction from litter 3 to SOM 2	-	0.5	0.5	0.25	0.2
	rf_s2s3_bgc	Respiration fraction for SOM 2 to SOM 3	-	0.55	0.55	0.55	0.2
	rf_s2s1_bgc	Respiration fraction SOM 2 to SOM 1	-	0.55	0.55	0.55	0.2



## Method: land management practice

- **Planting:** no annual planting
- **Harvest:** late harvest in winter
- **Fertilization:** little fertilizer for switchgrass and no fertilizer for Miscanthus
- **Irrigation:** no irrigation
- 70% of **Above-ground biomass** → “grain\_to\_food” at harvest, to represent harvest for lignocellulosic biofuel crops



Model configuration at three single points

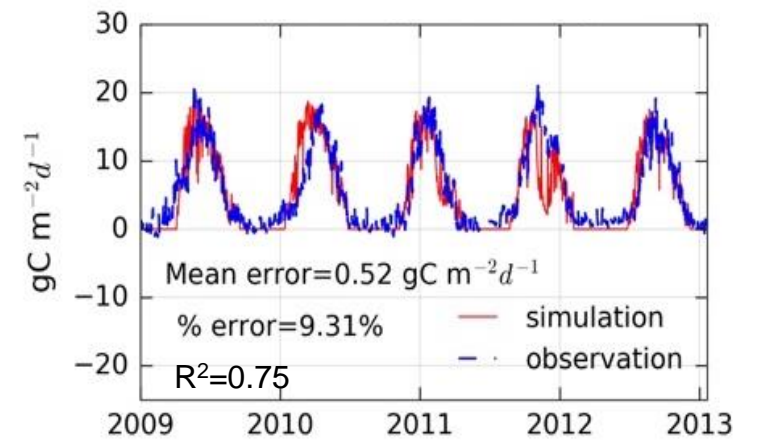
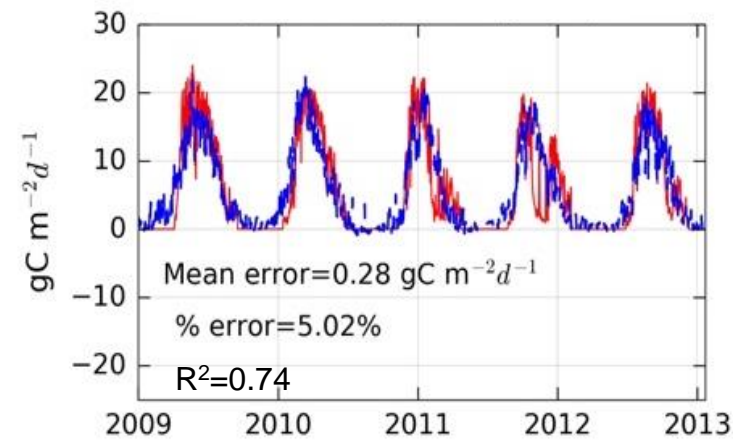
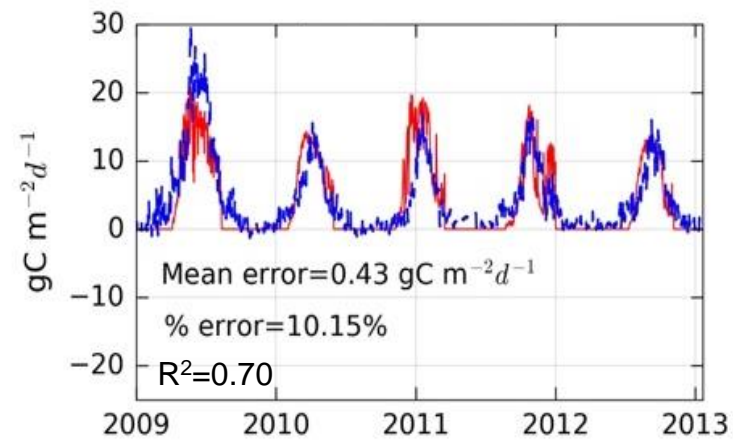
# Single-point simulation results: model evaluation

Maize-soybean rotation

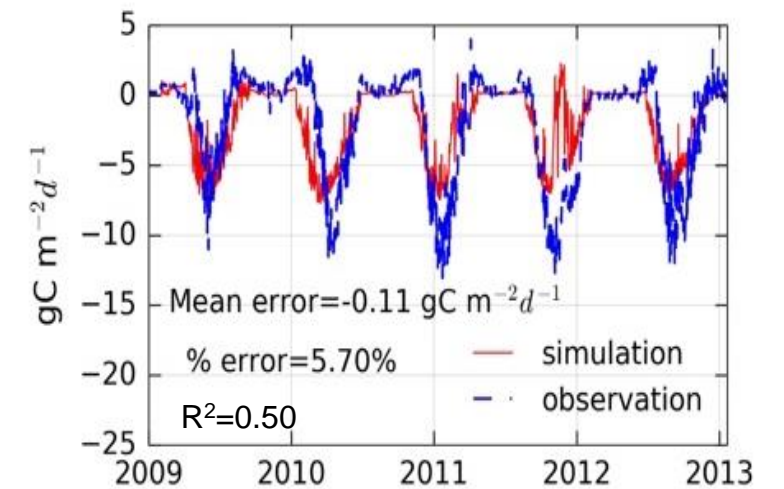
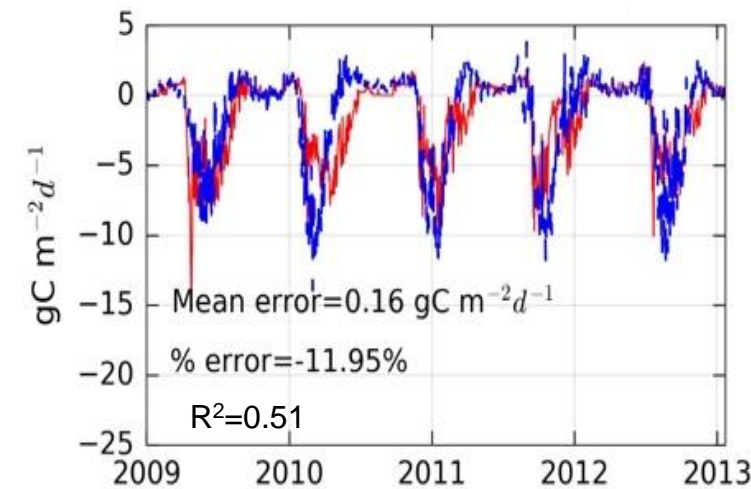
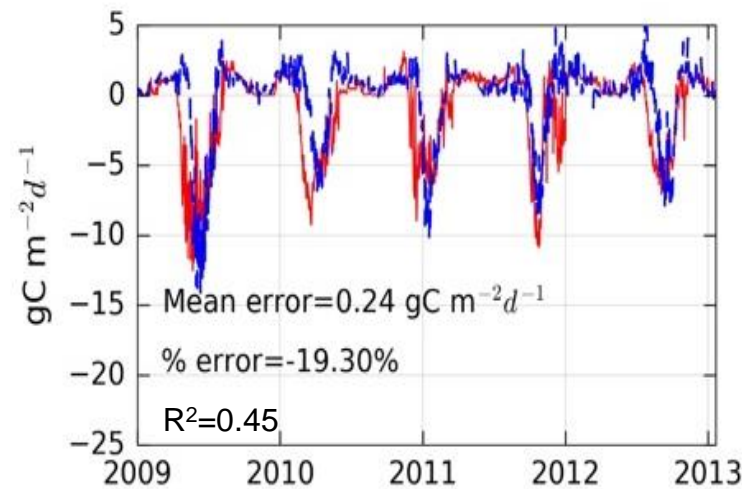
Switchgrass

Miscanthus

GPP



NEE



- All R<sup>2</sup> are greater than 0.5 and all relative errors are less than 20%.
- Simulated carbon fluxes match measurements well.

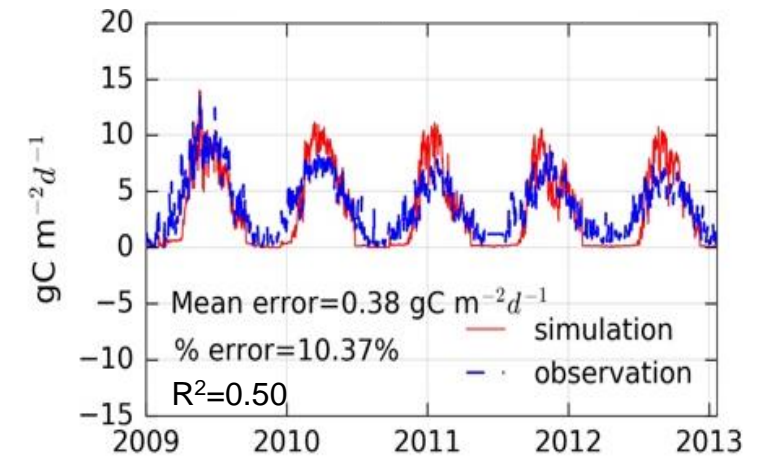
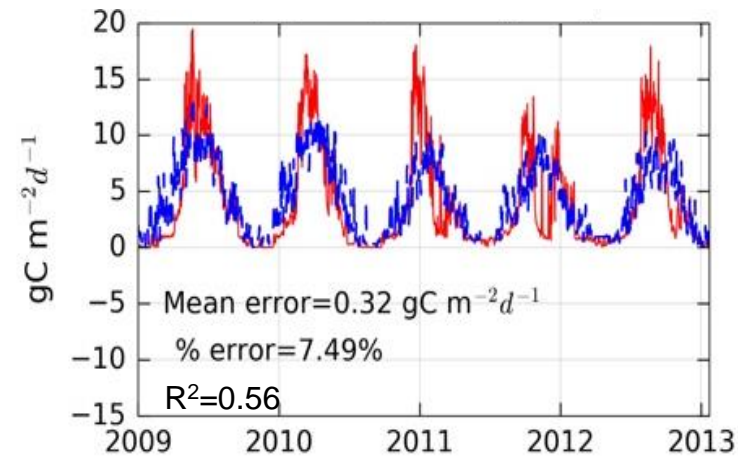
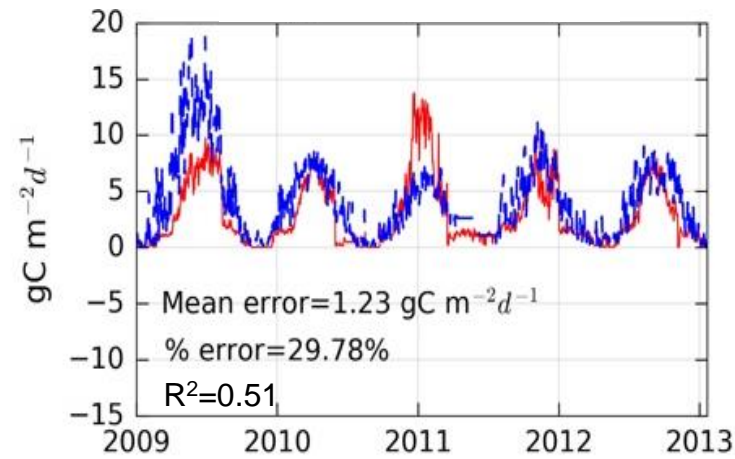
# Single-point simulation results: model evaluation

Maize-soybean rotation

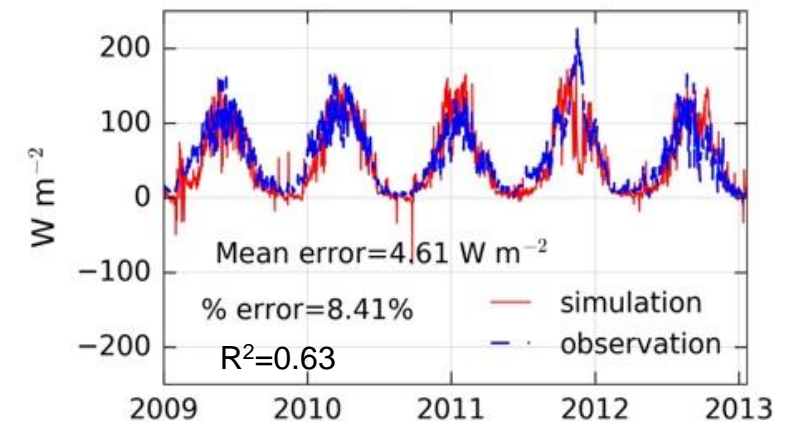
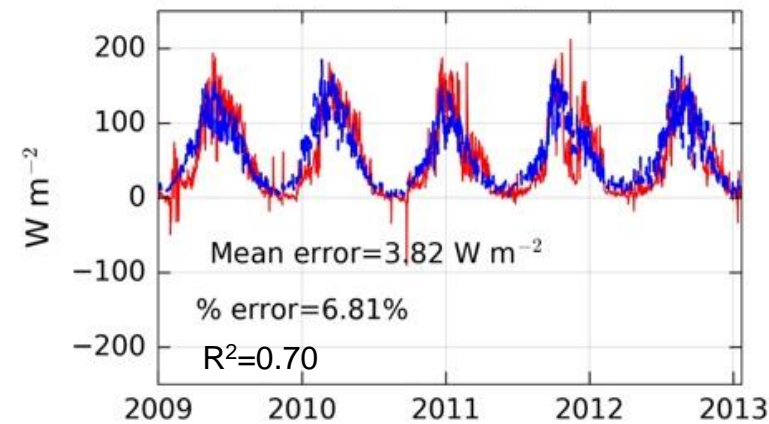
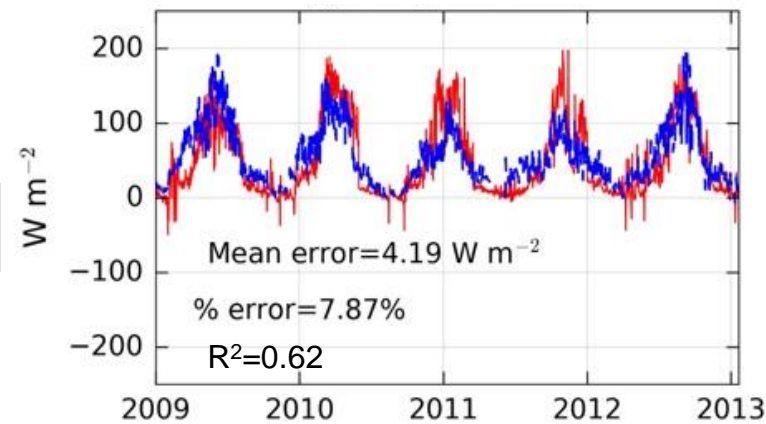
Switchgrass

Miscanthus

ER

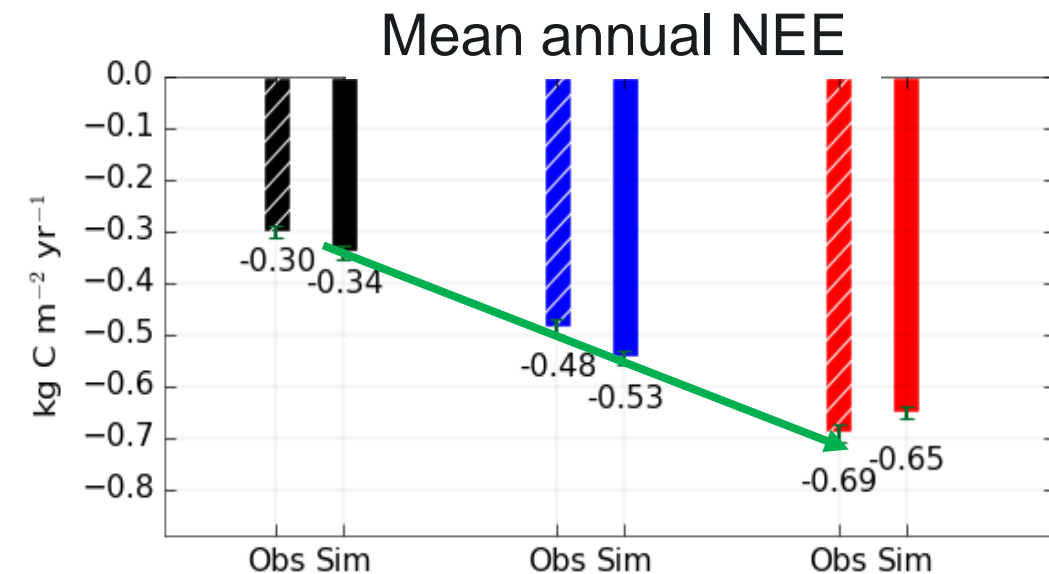
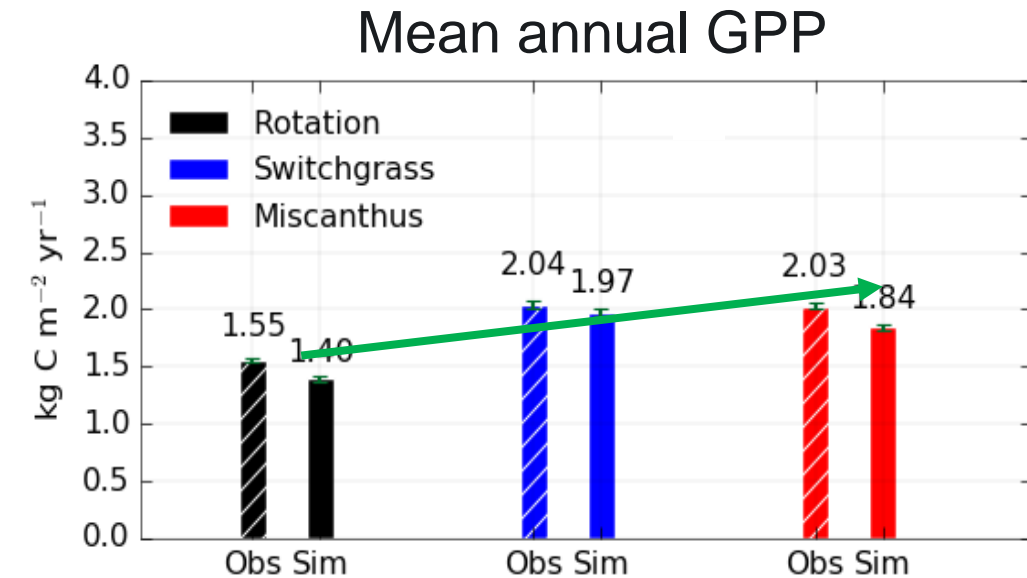
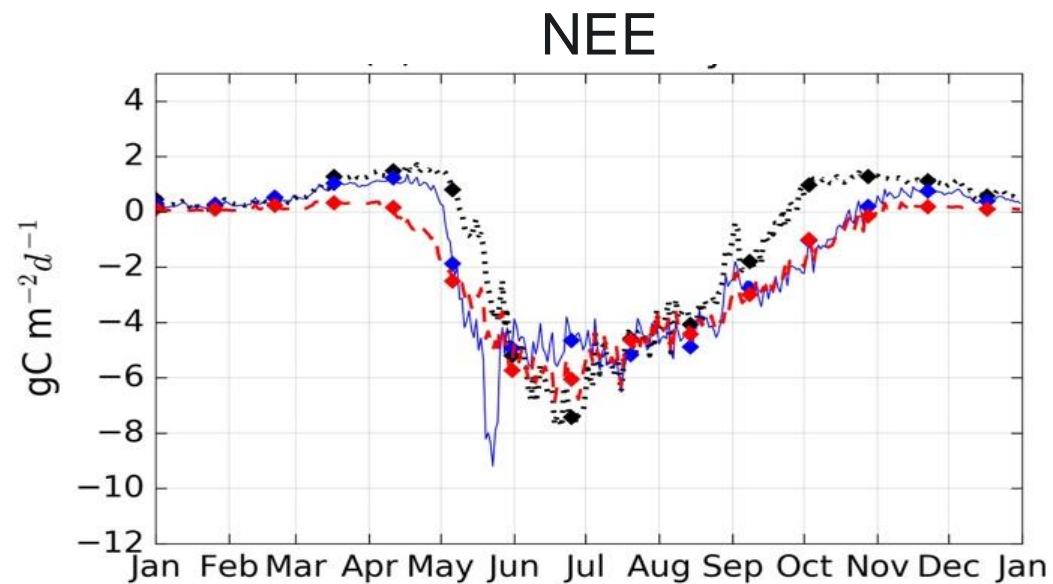
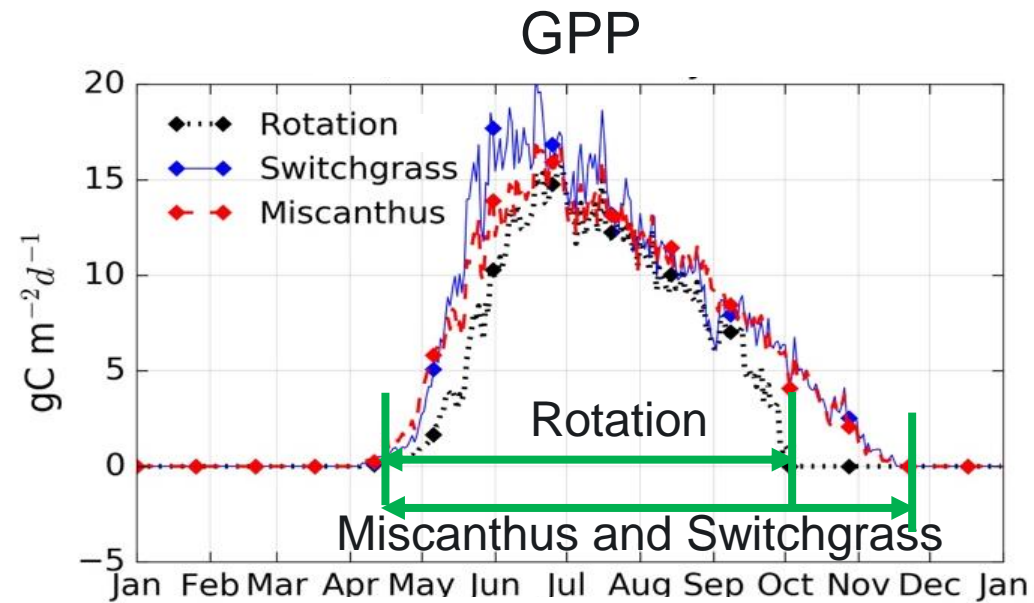


LE



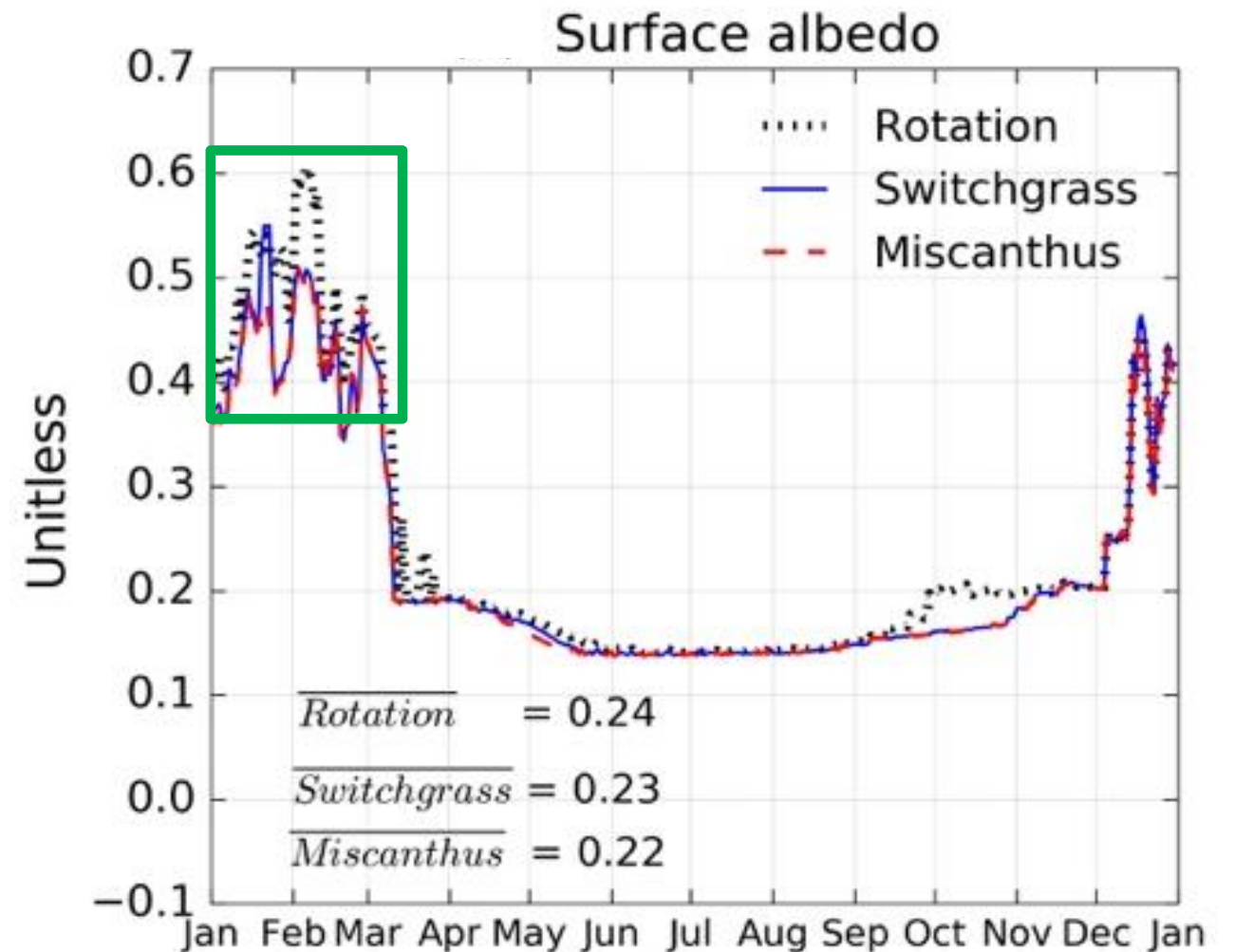
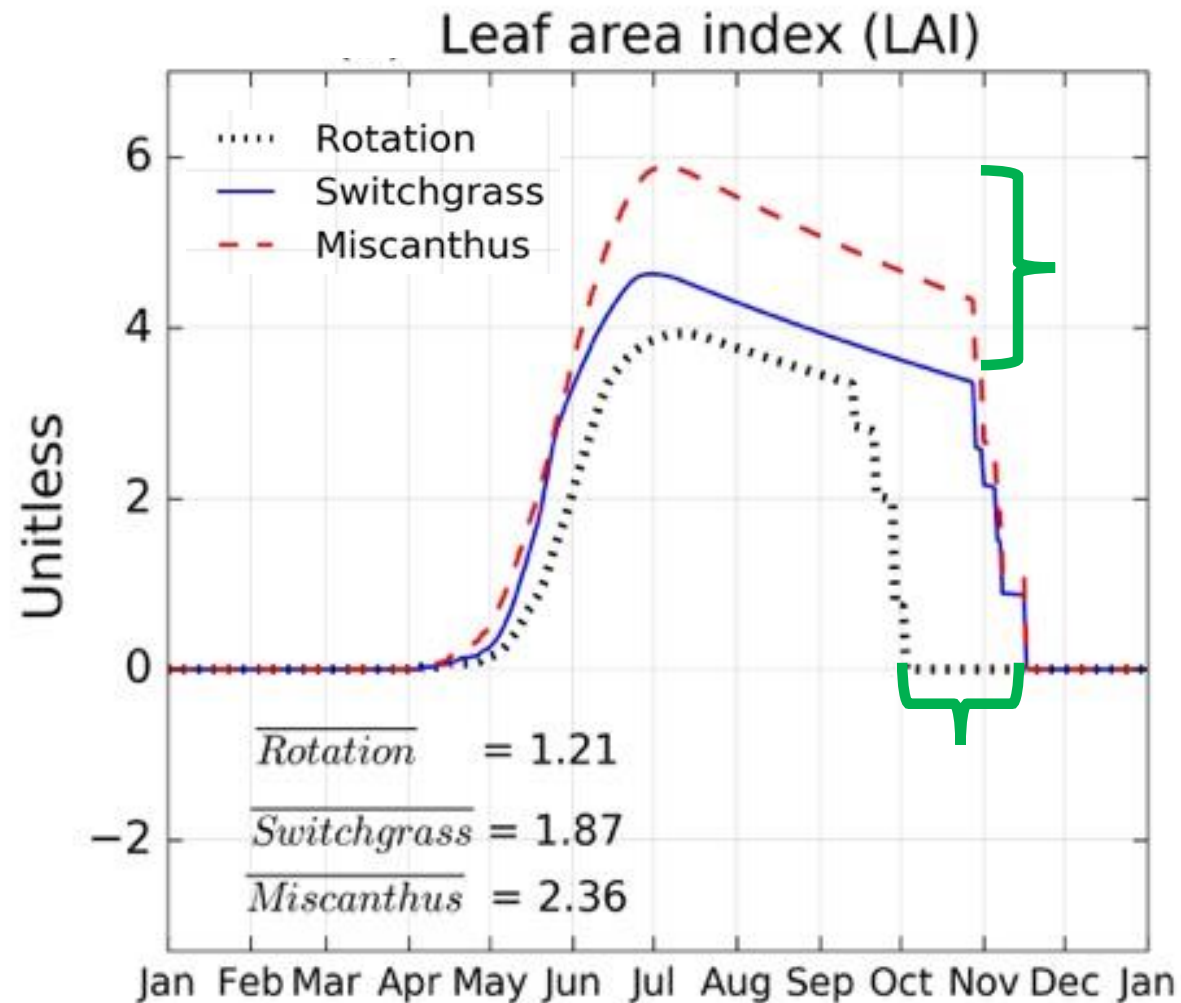
- Simulated energy fluxes match measurements well.

# Single-point simulation results: carbon budget



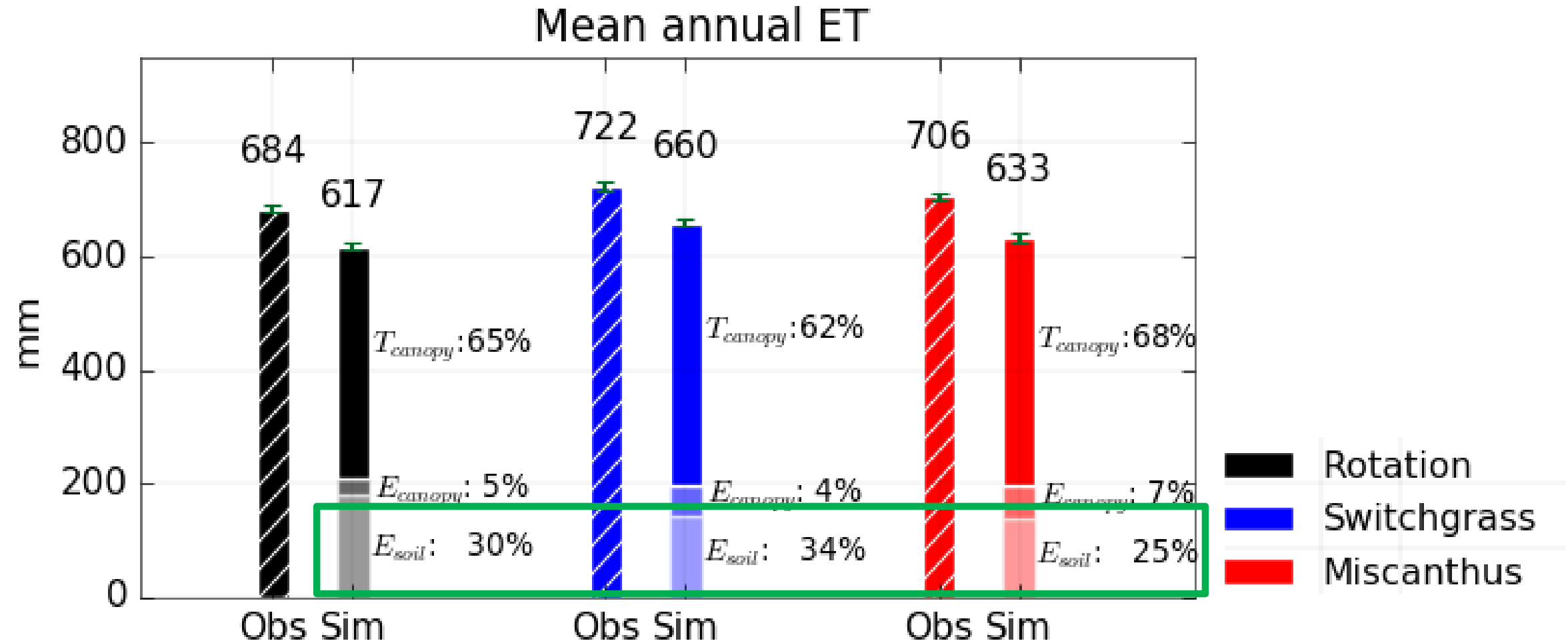
- Bioenergy crops have **longer growing season** and are **more productive** than traditional crops.
- Miscanthus and switchgrass are **larger net carbon sinks**.

# Single-point simulation results: energy budget



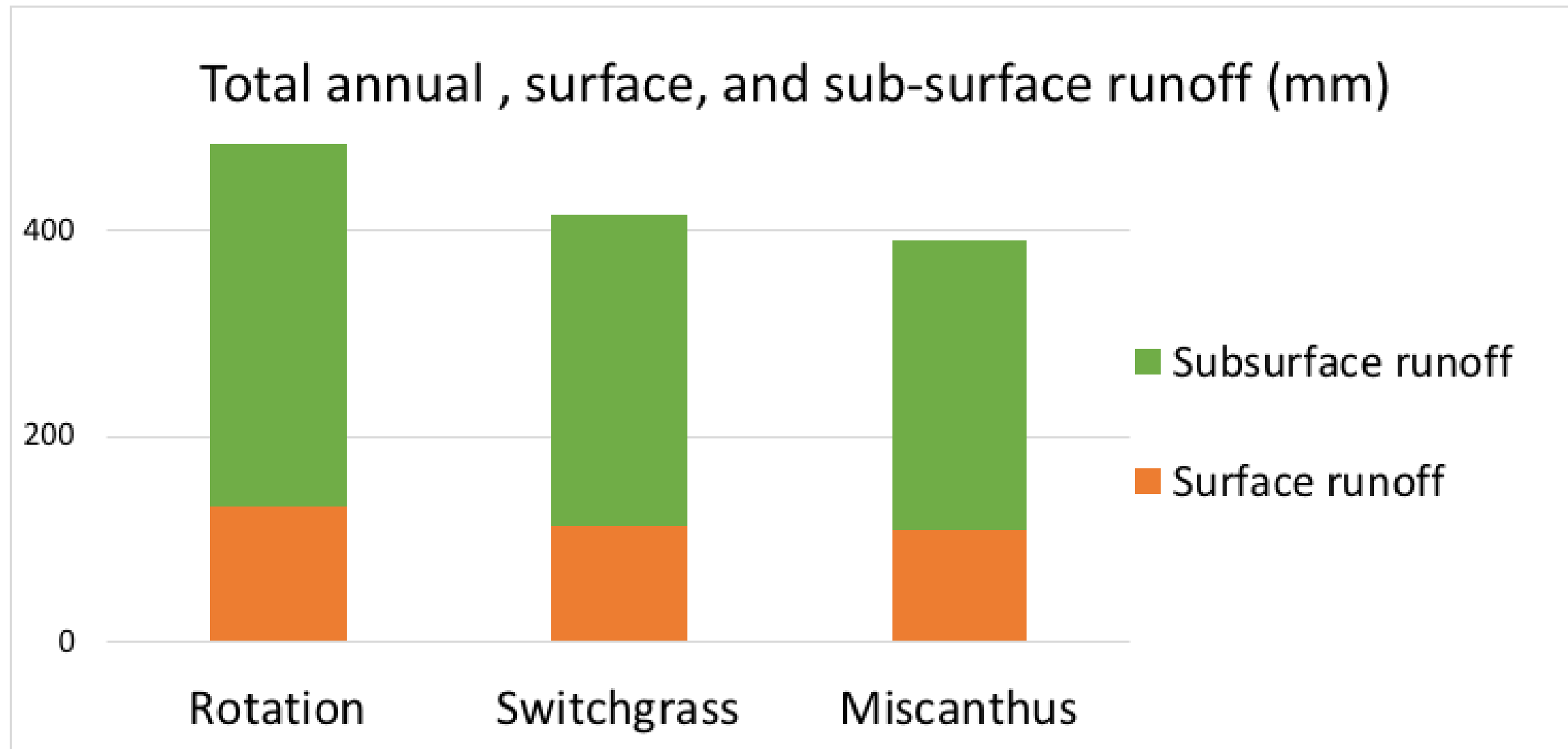
- Average LAI for bioenergy crops is larger due to their **longer growing season and higher productivity**.
- Average albedo for perennial crops is lower due to **higher above-ground biomass during winter that covers snow**.

# Single-point simulation results: water budget



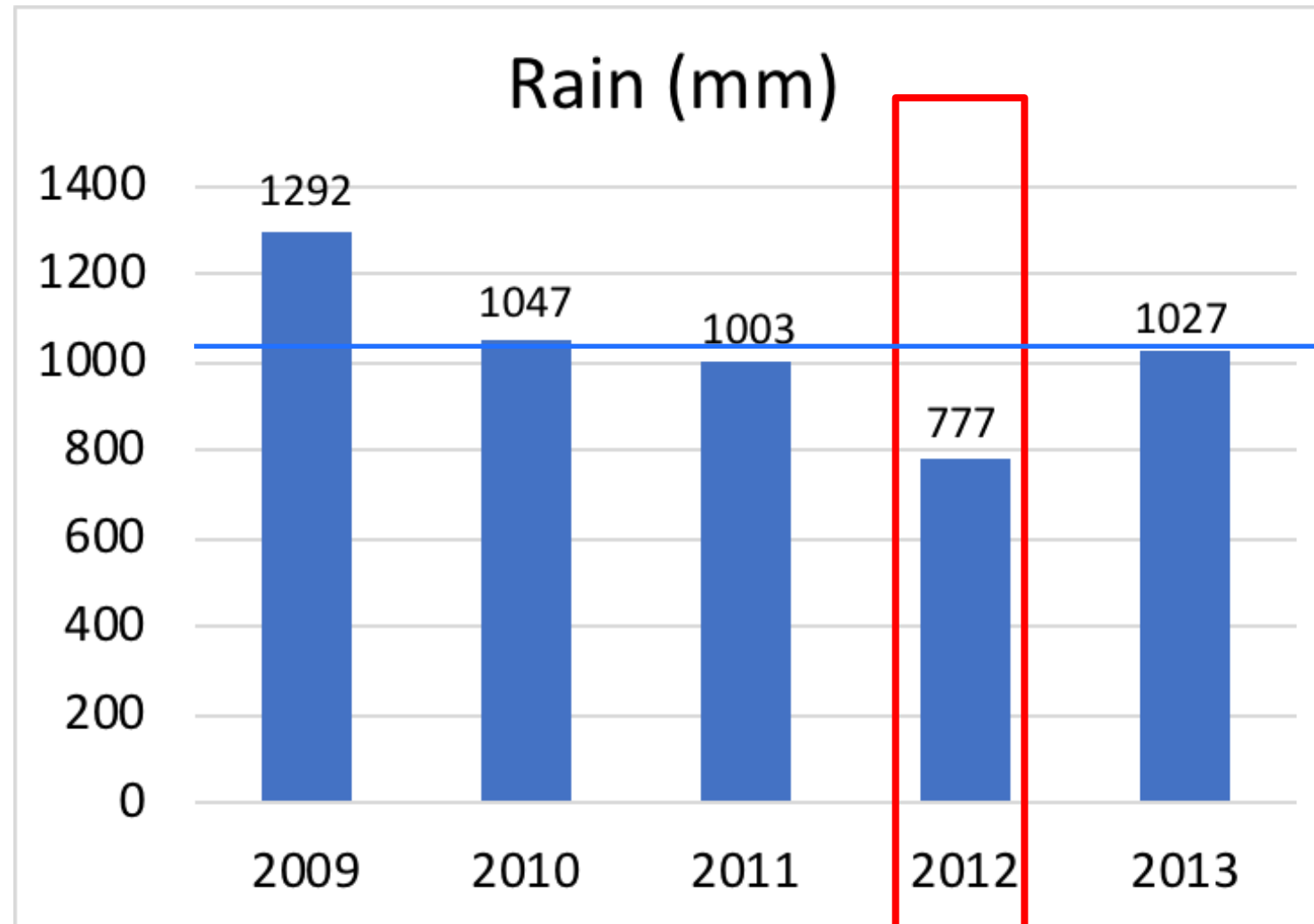
- Miscanthus and switchgrass have higher annual ET owing to their **perennial nature and larger LAI**.
- Miscanthus has **largest LAI** which effectively covers the soil, resulting in the **smallest contribution of soil evaporation** to total ET.

# Single-point simulation results: water budget



- Higher ET of bioenergy crops → **reduced** mean annual, surface, and sub-surface **runoff**
- Implications for soil erosion and groundwater pollution

# Single-point simulation results: inter-annual variability



Historical mean annual  
rainfall: 1042 mm

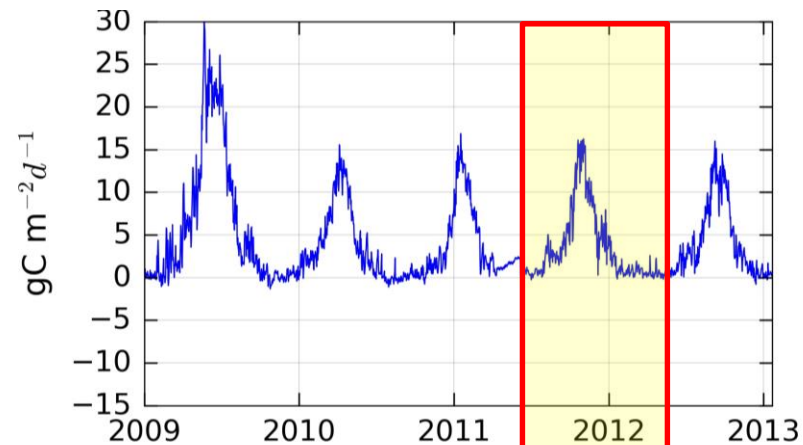
- 2012 is the most severe drought year in the Midwestern USA in the last 100 years.



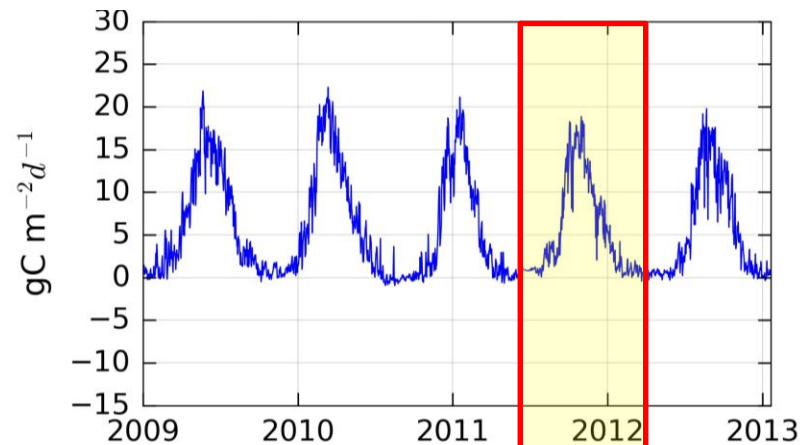
# Single-point simulation results: inter-annual variability

GPP

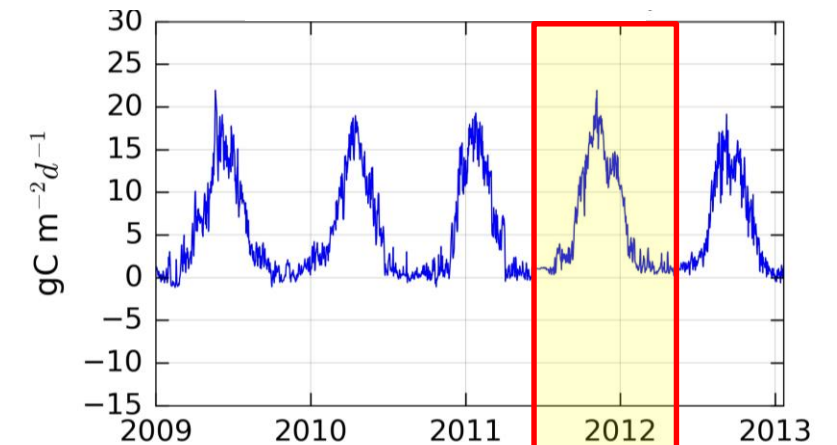
Maize-soybean rotation



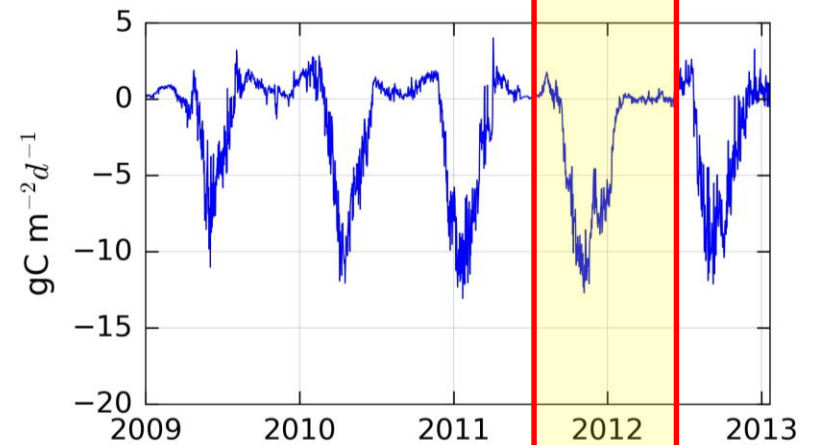
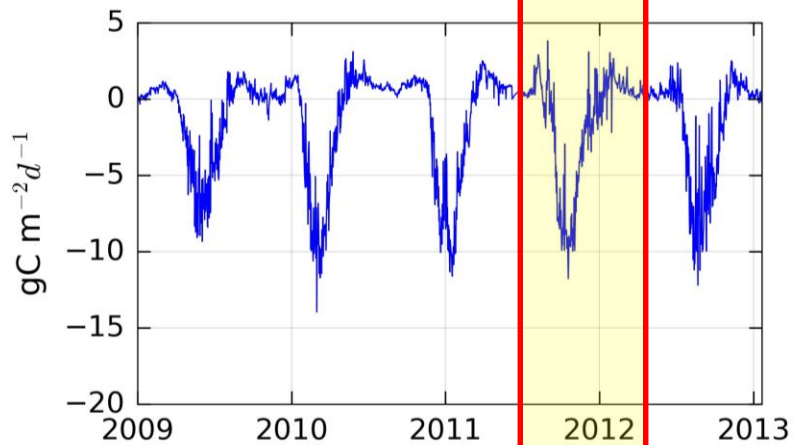
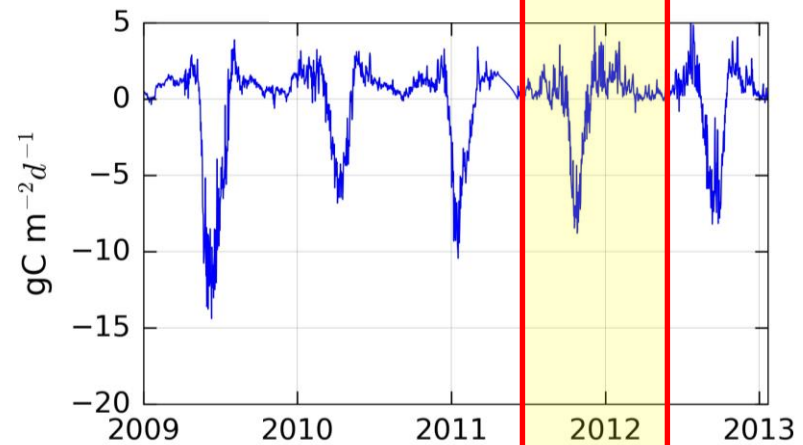
Switchgrass



Miscanthus

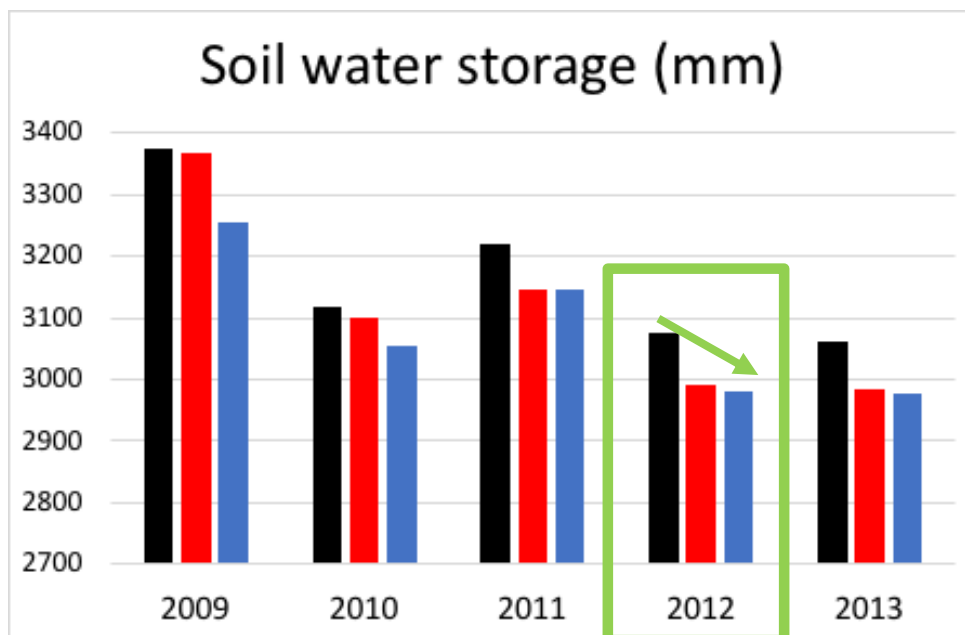
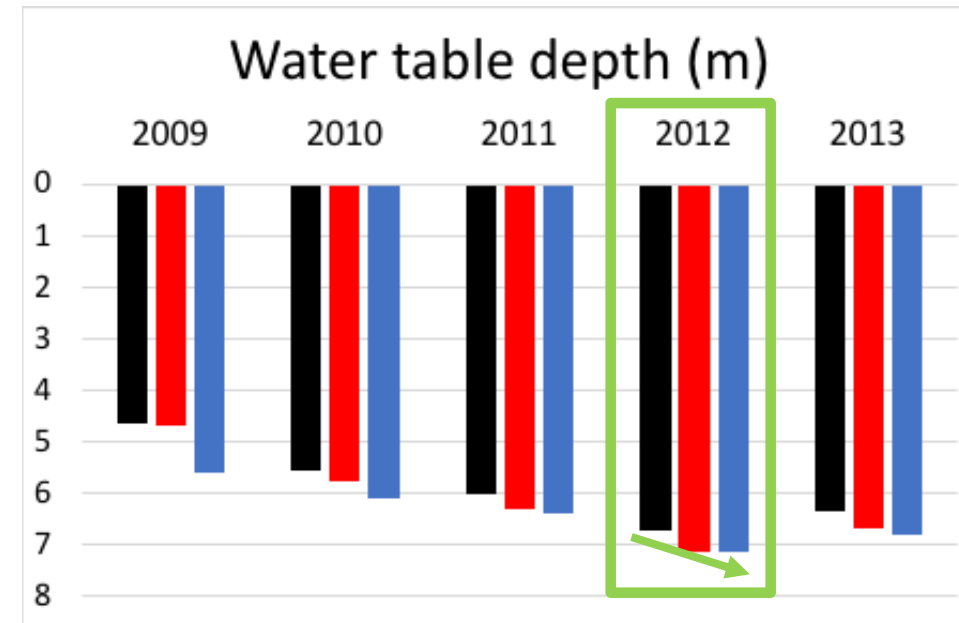
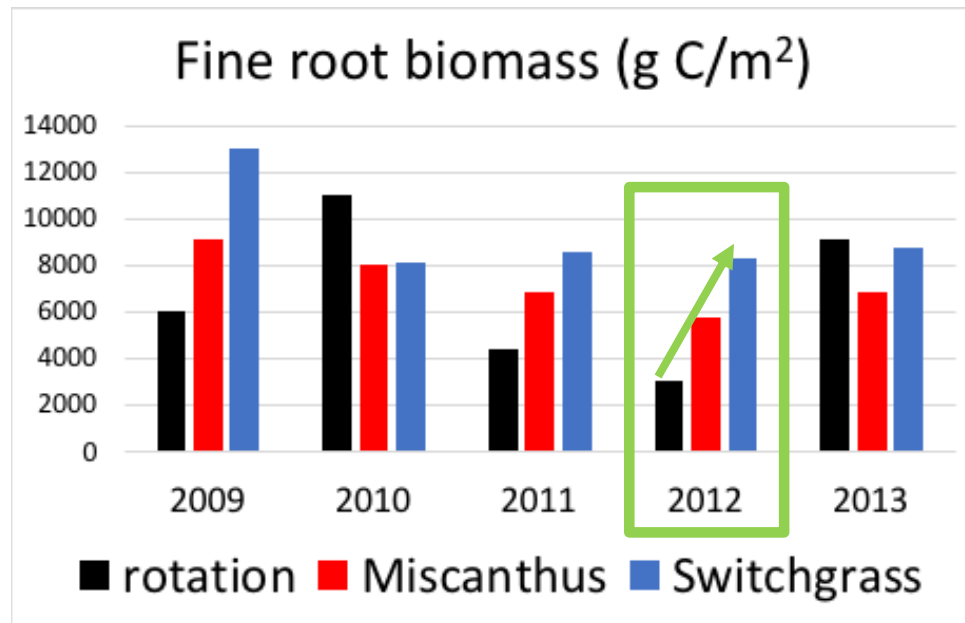


NEE



- Perennial grasses can maintain similar high productivity and large CO<sub>2</sub> fixation as the other years in 2012 during drought → why?

# Single-point simulation results: inter-annual variability

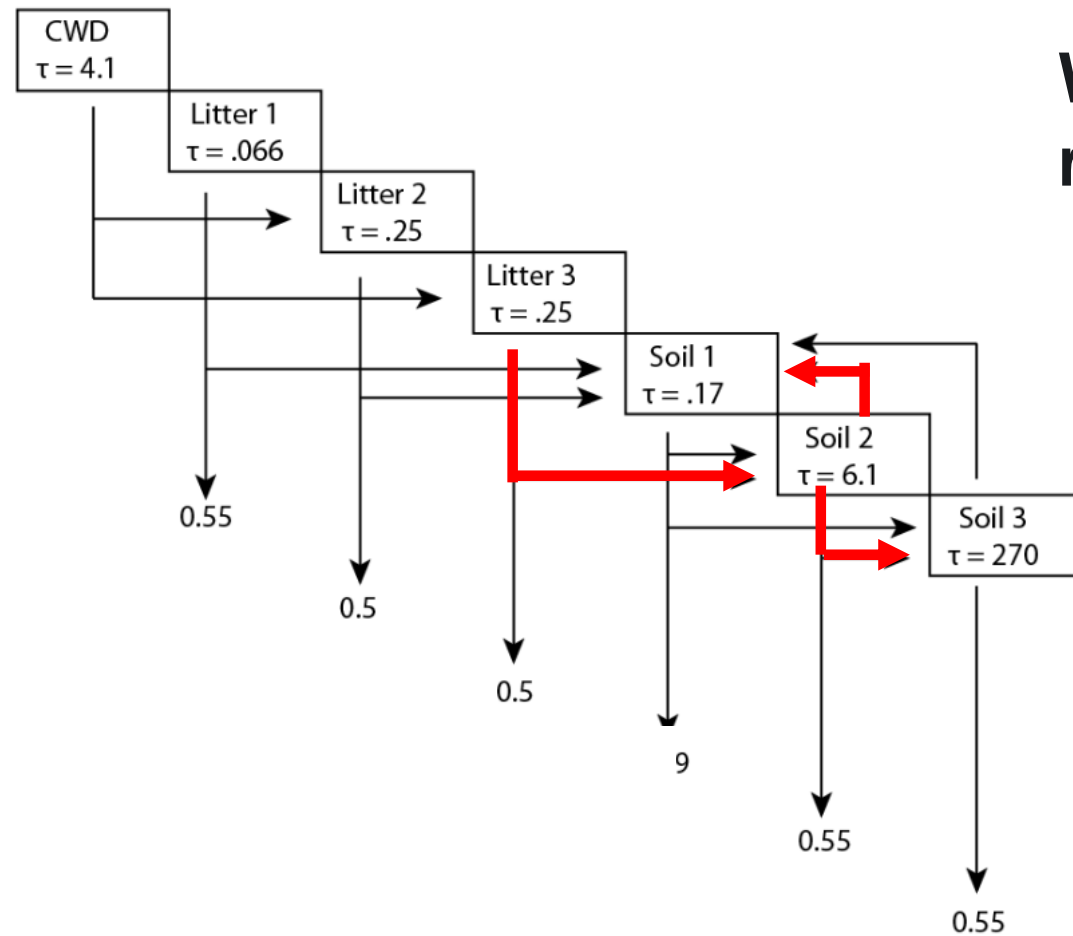


Bioenergy crops have more extensive **rooting system** under drought condition

- Enhanced ability to access **soil moisture in deep soil layers**
- High yield and carbon uptake under drought stress

# Model structure discussion

Century Soil C pool structure

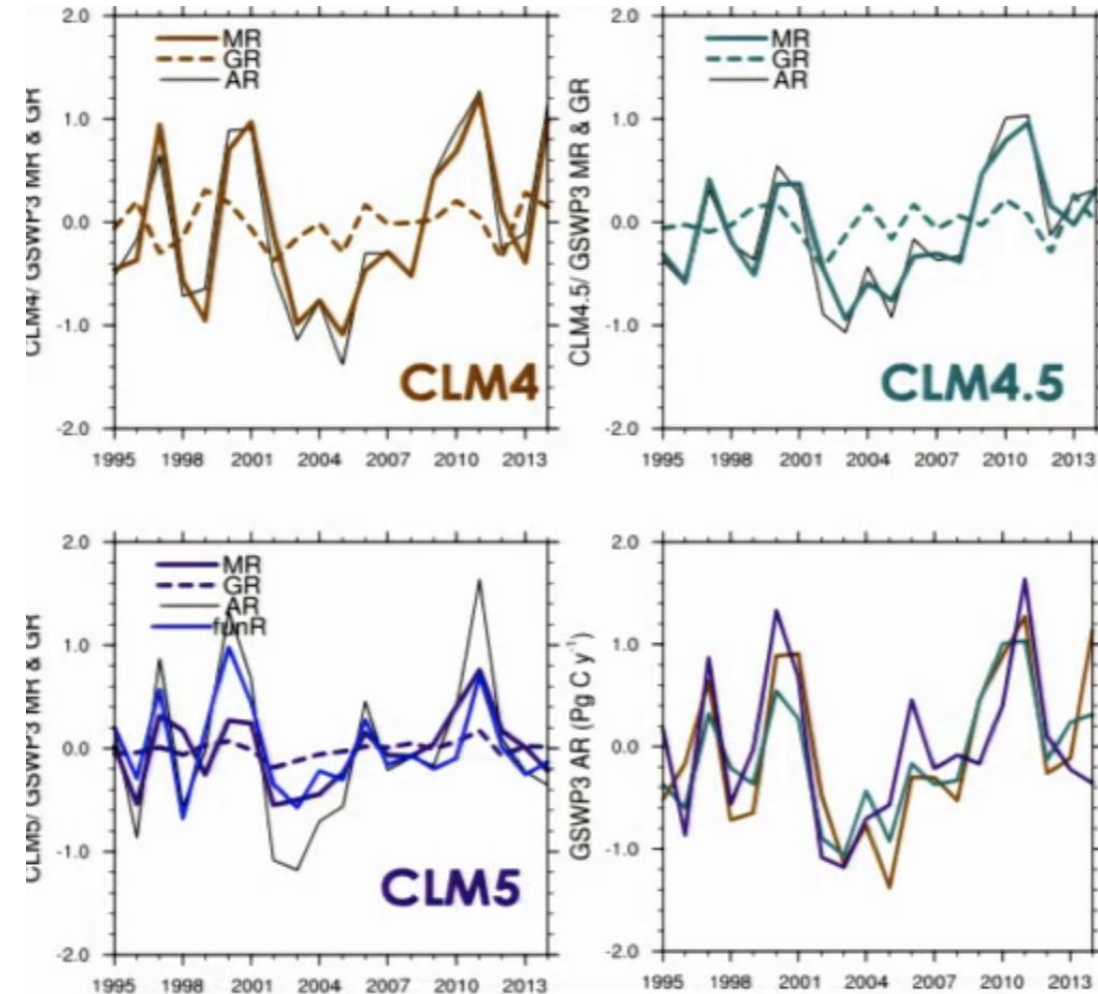
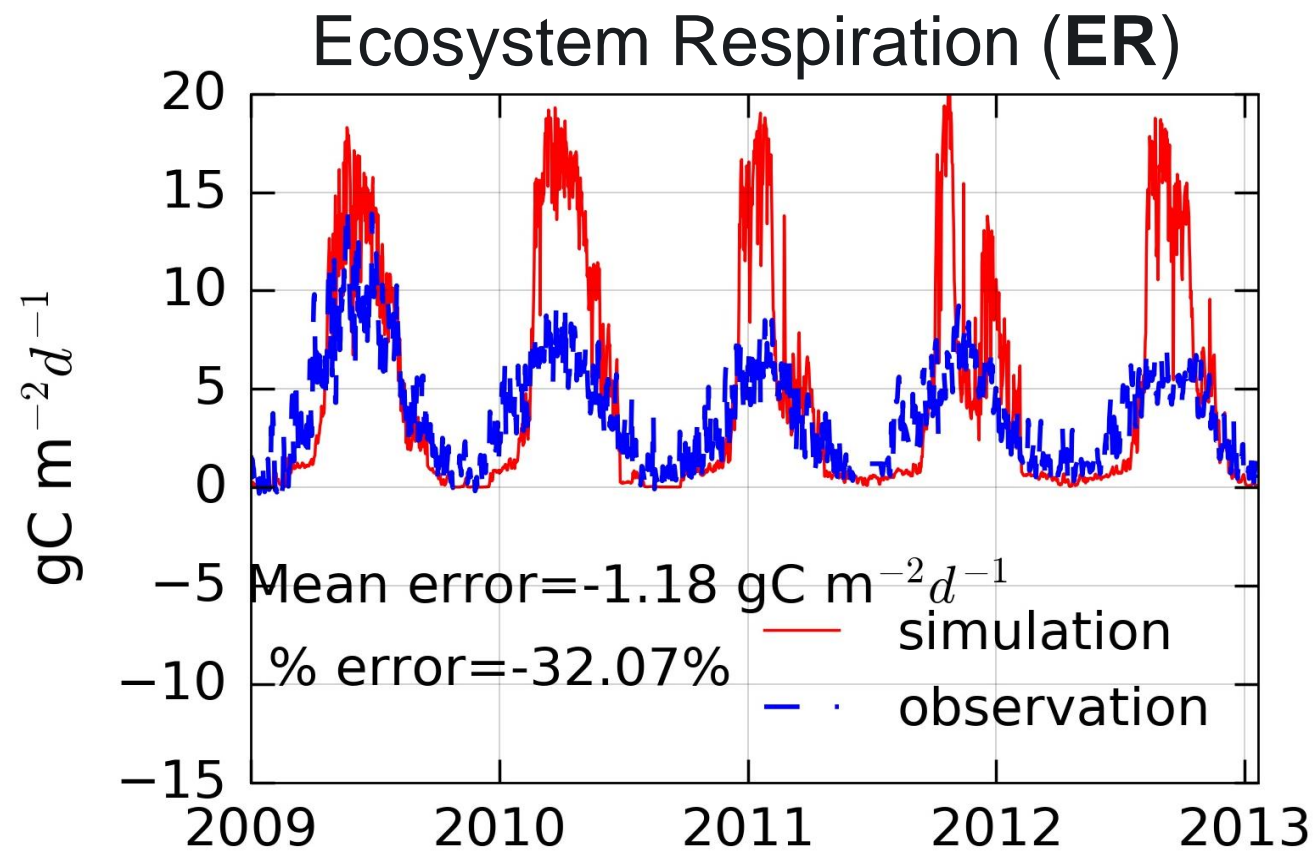


We modified parameters associated with respiration fractions that fixed across all PFTs.

- rf\_l3s2\_bgc Respiration fraction from litter 3 to SOM 2
- rf\_s2s3\_bgc Respiration fraction for SOM 2 to SOM 3
- rf\_s2s1\_bgc Respiration fraction SOM 2 to SOM 1

Pool structure, transitions, respired fractions (numbers at end of arrows), and turnover times (numbers in boxes) for the **Century-like soil C decomposition model**.

# Model structure discussion



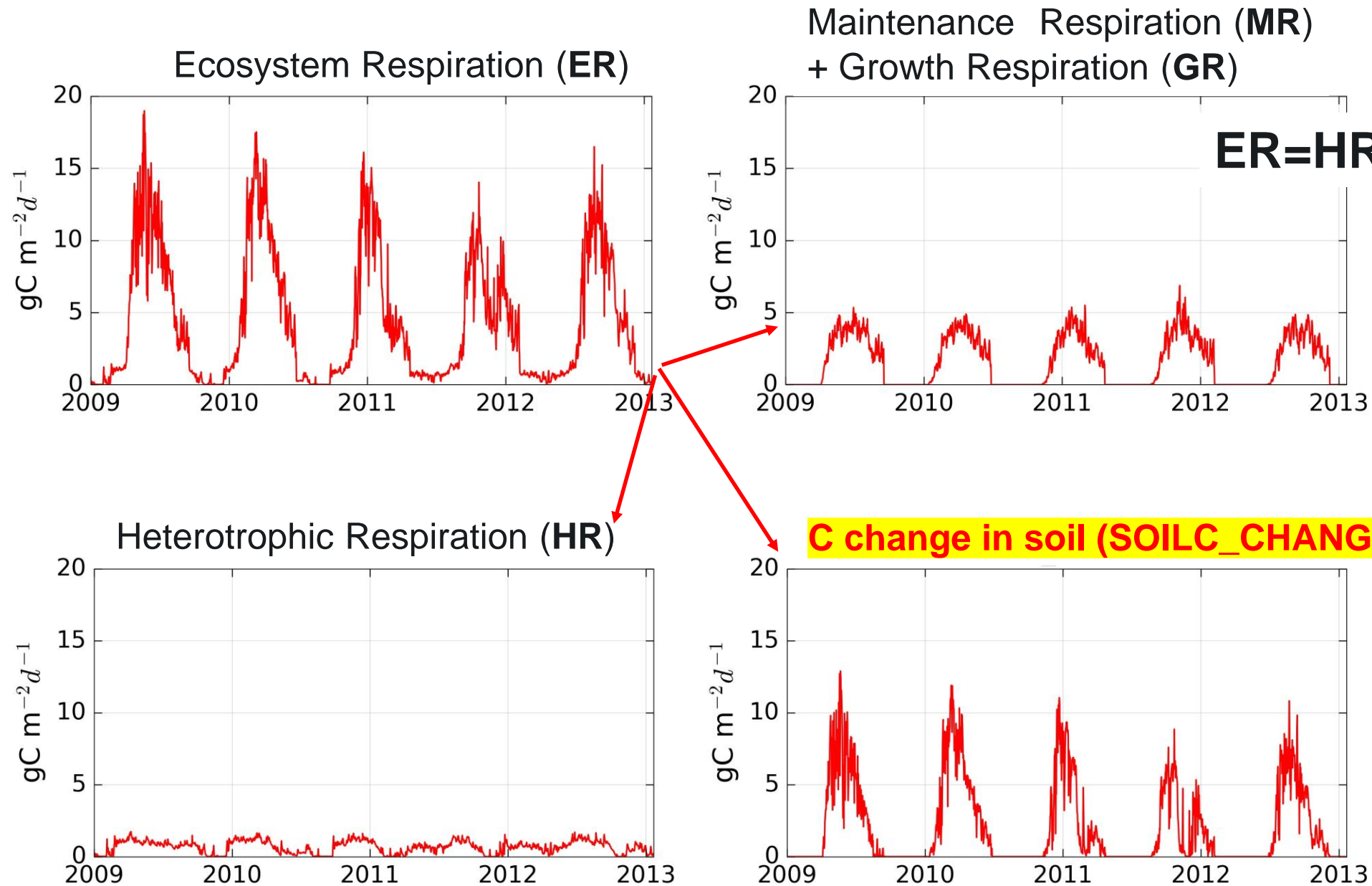
AR component anomalies

Dominated by FUN

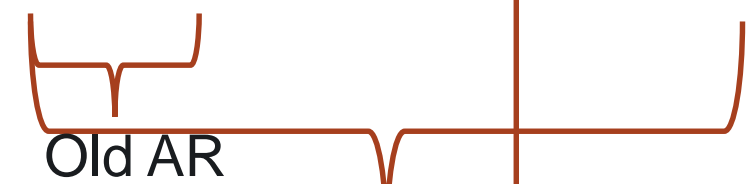
Credit: Will Wieder

- **ER for Miscanthus will be overestimated** if the respiration fraction parameters in Century model are not modified.

# Model structure discussion



$$\text{ER} = \text{HR} + \text{MR} + \text{GR} + \text{SOILC\_CHANGE}$$

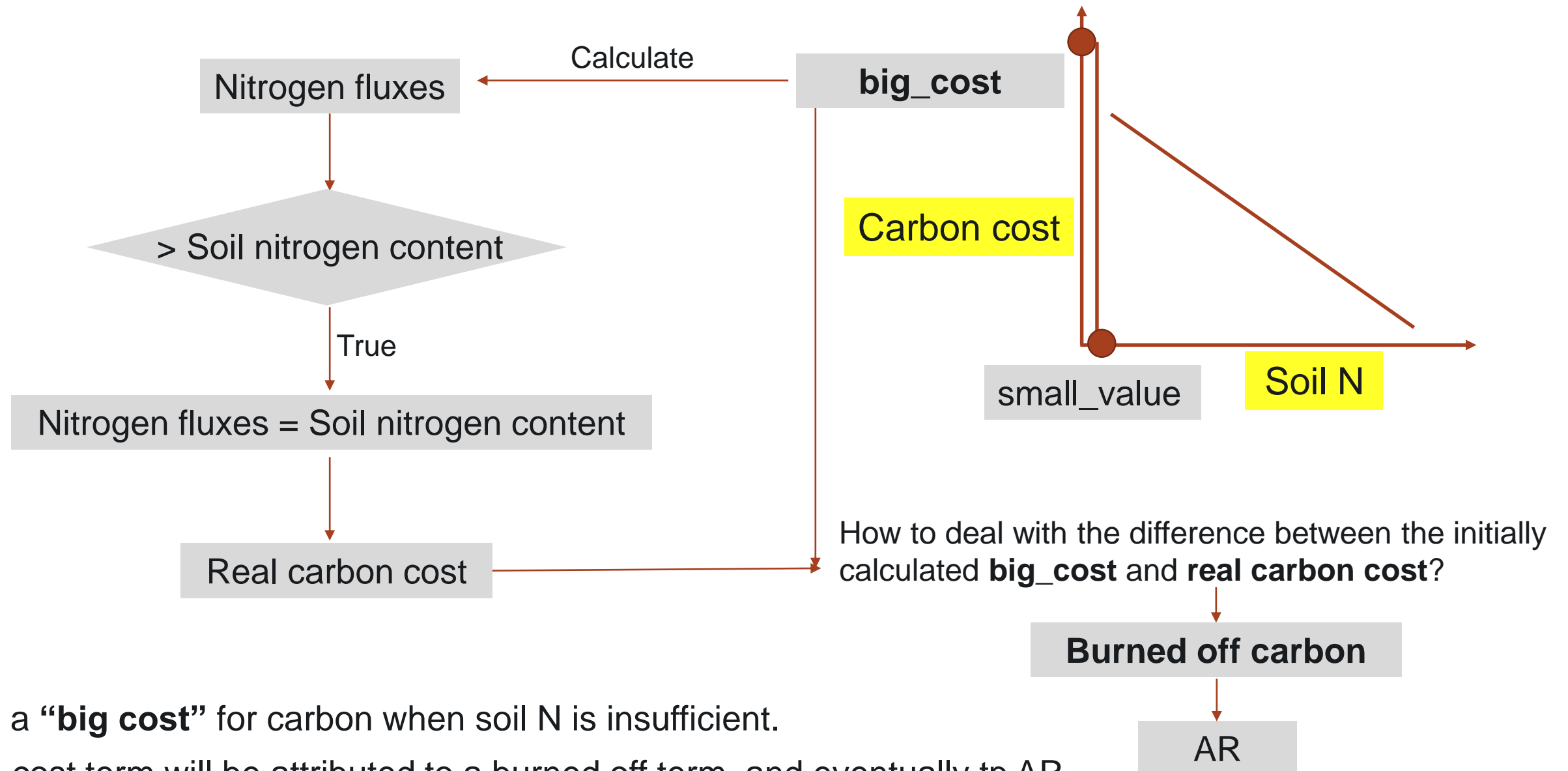


AR in CLM5.0

Fixation and Uptake of Nitrogen (FUN) Model

# Model structure discussion

FUN: Nitrogen uptake requires the expenditure of energy in the form of carbon.



- FUN will a “**big cost**” for carbon when soil N is insufficient.
- This big\_cost term will be attributed to a burned off term, and eventually to AR.

# Model structure discussion

## The FUN Model

```
1397 ! Occasionally, the algorithm will want to extract a high fraction of NPP from a pool (eg leaves) that
1398 ! quickly empties. One solution to this is to iterate round all the calculations starting from
1399 ! the cost functions. The other is to burn off the extra carbon and hope this doesn't happen very often...
1400
1401 if (npp_to_spend .ge. 0.00000000000001_r8)then
1402     burned_off_carbon = burned_off_carbon + npp_to_spend
1403 end if
```

# Summary

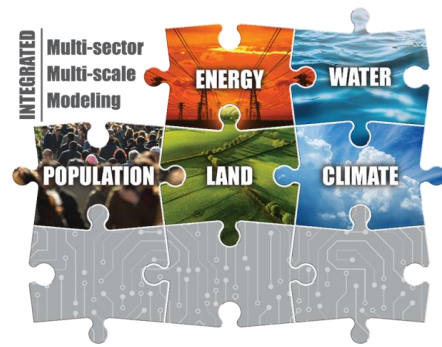
- CLM5 has been parameterized to **represent maize-soybean rotation, Miscanthus, and switchgrass**, and validated against observed fluxes from sites in central Illinois.
- Our results demonstrated that by using more sustainable land management options, the **perennial bioenergy crops could assimilate more carbon** and maintain similar ET levels than typical annual cropping systems.
- **Perennial bioenergy crops** are more **drought-tolerant** than annual crops.
- **Perennial bioenergy crops are promising alternatives to traditional crops under the same climate and environmental conditions** because of their high productivity, large carbon stock, and no requirements for fertilization and irrigation.
- Due to model structure limitation, we need to either modify some parameters associated with decomposition or improve the model structure.
- Future study driven by **future land use change scenarios** is needed to assess the climate change mitigation effect of bioenergy crops at **regional scales**.



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Modeling Program

# Thank you



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