

CLM crops

A process based crop growth model

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CLM Tutorial 2016

Motivation for crop modeling


- Crop yields => Food supply
- Biofuel crop yields => Biofuel supply
- Land atmosphere interactions
 - Biogeophysical
 - Albedo, energy flux partitioning
 - Biogeochemical
 - Carbon uptake and release

CLM4

Temp. corn

Temp. cereals

Temp. soybean

effects on atm. 

Levis et al. (2012)

Based on Agro-IBIS
(Kucharik & Brye, 2003)
crop code

CLM4

Temp. corn

Temp. cereals

Temp. soybean

effects on atm.



Levis et al. (2012)

CLM4.5

w/ options to

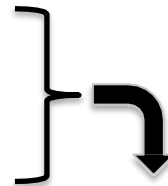
fertilize &

irrigate

Oleson et al. (2013)

enhanced soil C
decomposition

Soy N fixation



Levis et al. (2013)

Drewniak et al. (2013)

CLM4

Temp. corn
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effects on atm.



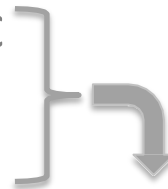
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CLM4.5

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CLM5

Trop. corn
Trop. soybean
Sugarcane
Rice
Cotton
Winter wheat
Grain CN
product pool

78 plant function types if turned on crop model in CLM5

- ! 0 => not_vegetated
- ! 1 => needleleaf_evergreen_temperate_tree
- ! 2 => needleleaf_evergreen_boreal_tree
- ! 3 => needleleaf_deciduous_boreal_tree
- ! 4 => broadleaf_evergreen_tropical_tree
- ! 5 => broadleaf_evergreen_temperate_tree
- ! 6 => broadleaf_deciduous_tropical_tree
- ! 7 => broadleaf_deciduous_temperate_tree
- ! 8 => broadleaf_deciduous_boreal_tree
- ! 9 => broadleaf_evergreen_shrub
- ! 10 => broadleaf_deciduous_temperate_shrub
- ! 11 => broadleaf_deciduous_boreal_shrub
- ! 12 => c3_arctic_grass
- ! 13 => c3_non-arctic_grass
- ! 14 => c4_grass
- ! 15 => c3_crop
- ! 16 => c3_irrigated
- ! 17 => temperate_corn
- ! 18 => irrigated_temperate_corn
- ! 19 => spring_wheat
- ! 20 => irrigated_spring_wheat
- ! 21 => winter_wheat
- ! 22 => irrigated_winter_wheat
- ! 23 => temperate_soybean
- ! 24 => irrigated_temperate_soybean
- ! 25 => barley
- ! 26 => irrigated_barley
- ! 27 => winter_barley
- ! 28 => irrigated_winter_barley
- ! 29 => rye
- ! 30 => irrigated_rye
- ! 31 => winter_rye
- ! 32 => irrigated_winter_rye
- ! 33 => cassava
- ! 34 => irrigated_cassava
- ! 35 => citrus
- ! 36 => irrigated_citrus
- ! 37 => cocoa
- ! 38 => irrigated_cocoa
- ! 39 => coffee
- ! 40 => irrigated_coffee
- ! 41 => cotton
- ! 42 => irrigated_cotton
- ! 43 => datepalm
- ! 44 => irrigated_datepalm
- ! 45 => foddergrass
- ! 46 => irrigated_foddergrass
- ! 47 => grapes
- ! 48 => irrigated_grapes
- ! 49 => groundnuts
- ! 50 => irrigated_groundnuts
- ! 51 => millet
- ! 52 => irrigated_millet
- ! 53 => oilpalm
- ! 54 => irrigated_oilpalm
- ! 55 => potatoes
- ! 56 => irrigated_potatoes
- ! 57 => pulses
- ! 58 => irrigated_pulses
- ! 59 => rapeseed
- ! 60 => irrigated_rapeseed
- ! 61 => rice
- ! 62 => irrigated_rice
- ! 63 => sorghum
- ! 64 => irrigated_sorghum
- ! 65 => sugarbeet
- ! 66 => irrigated_sugarbeet
- ! 67 => sugarcane
- ! 68 => irrigated_sugarcane
- ! 69 => sunflower
- ! 70 => irrigated_sunflower
- ! 71 => miscanthus
- ! 72 => irrigated_miscanthus
- ! 73 => switchgrass
- ! 74 => irrigated_switchgrass
- ! 75 => tropical_corn
- ! 76 => irrigated_tropical_corn
- ! 77 => tropical_soybean
- ! 78 => irrigated_tropical_soybean

How we simulate crop growth?

Temperature

Photosynthesis

Water

Evapotranspiration

Soil

Nutrient uptake

CO₂

Carbon allocation



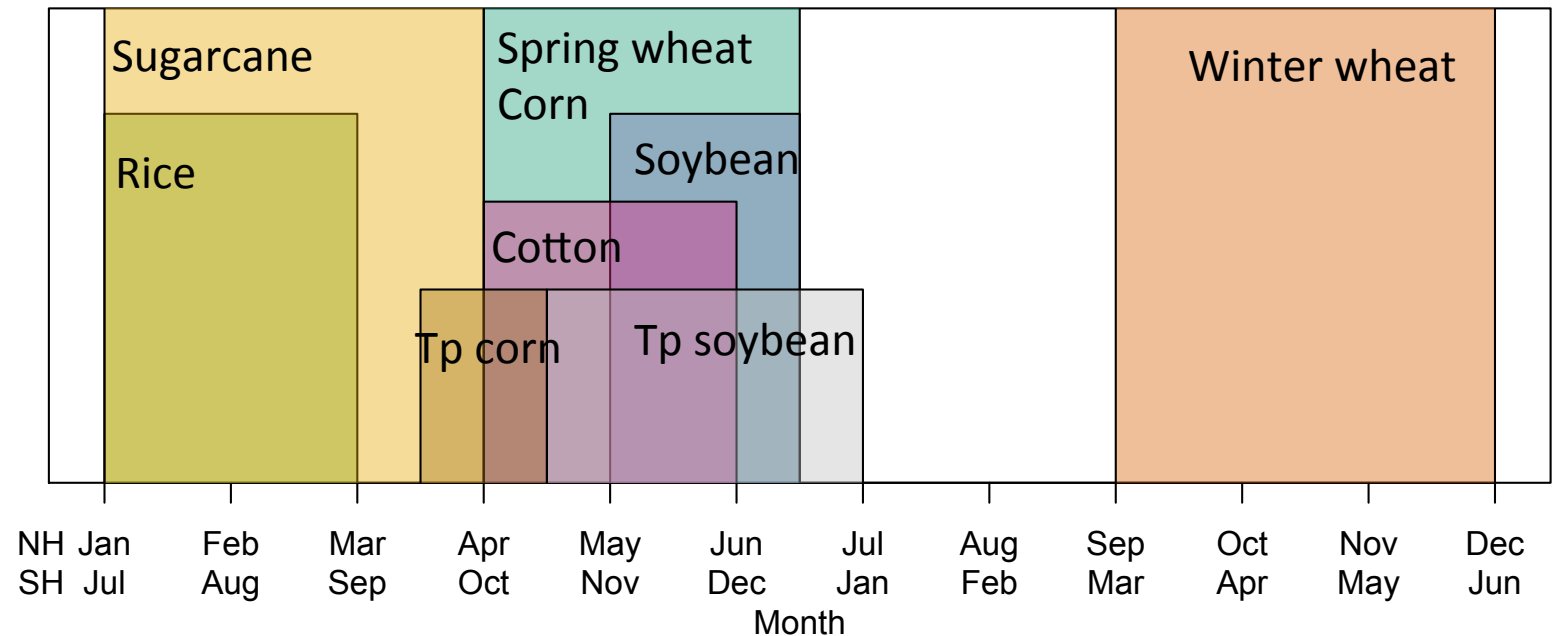
Crop phenology



Phase 1: Planting

- Within planting windows: meet temperature thresholds
e.g., for corn: $\min T_{10} > 6 \text{ }^\circ\text{C}$ and $T_{10} > 10 \text{ }^\circ\text{C}$
- Still allows planting if not meet the threshold and past planting windows

planting windows



Crop phenology



Phase 2: Leaf emergence:

- Based on heat accumulated in the top soil layers
e.g., for winter wheat $GDD_{tsoi} > 3\%GDD_{mat} = 51$ °days
- Leaf, stem, root carbon increasing



Phase 3: Grain fill:

- Based on heat accumulated since leaf emerge
e.g., for winter wheat $GDD_{plant} > 40\%GDD_{mat} = 680$
- Leaf carbon decreasing
- Grain carbon increasing



Phase 4: Harvest:

- Exceed the growing degree days for maturity
- or, exceed the maximum days for crop growth
e.g., for winter wheat $GDD_{plant} > GDD_{mat} = 1700$,
or days since planting > 330 days

Crop carbon allocation

f1=aroot:aleaf
 f3=astem:aleaf
 f5=agrain:aleaf

Phase2:

$$a_{\text{repr}} = 0,$$

$$a_{f\text{root}} = a_{f\text{root}}^i - (a_{f\text{root}}^i - a_{f\text{root}}^f) \frac{\text{GDD}_{T_{2m}}}{\text{GDD}_{\text{mat}}} \quad \text{where} \quad \frac{\text{GDD}_{T_{2m}}}{\text{GDD}_{\text{mat}}} \leq 1,$$

$$a_{\text{leaf}} = (1 - a_{f\text{root}}) \frac{a_{\text{leaf}}^i (e^{-b} - e^{-b(\text{GDD}_{T_{2m}}/h)})}{e^{-b} - 1} \quad \text{where} \quad b = 0.1,$$

$$a_{\text{livestem}} = 1 - a_{\text{repr}} - a_{f\text{root}} - a_{\text{leaf}},$$

Phase3:

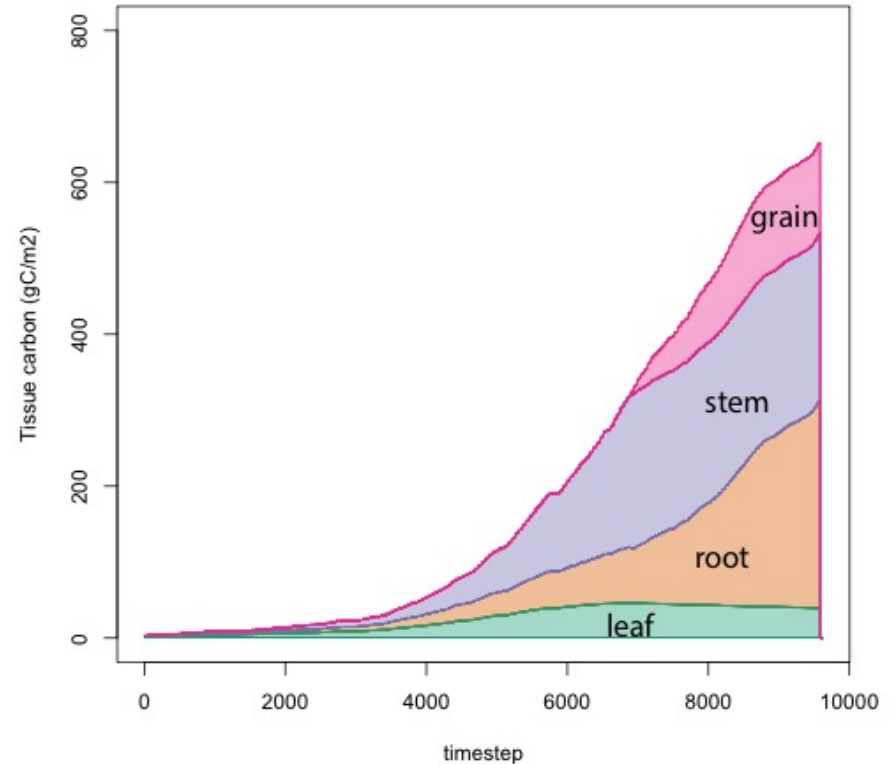
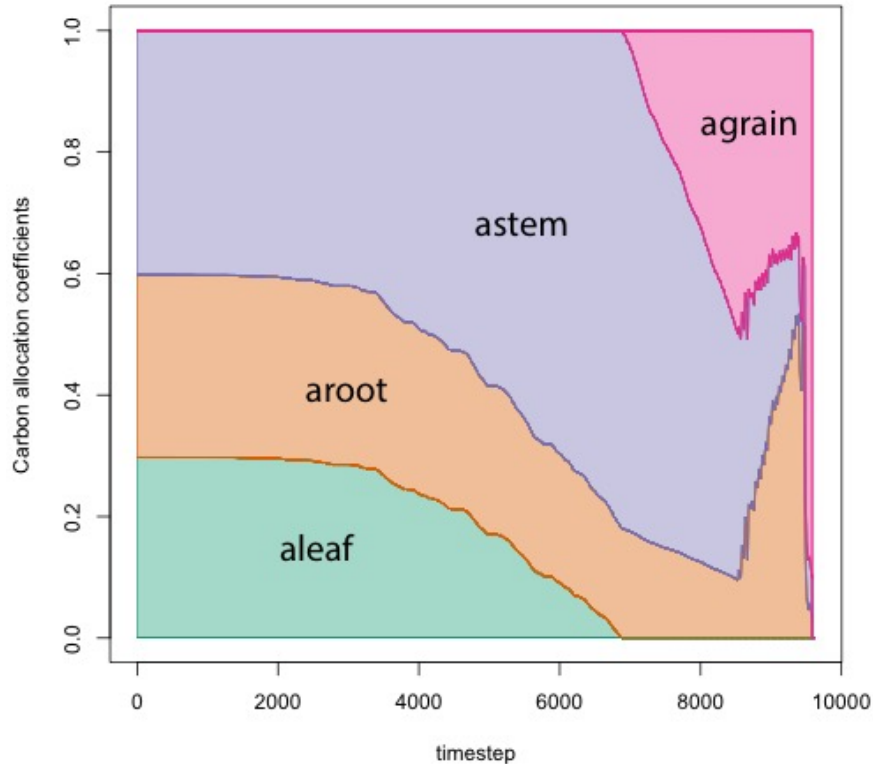
$$a_{\text{leaf}} = a_{\text{leaf}} \left(1 - \frac{\text{GDD}_{T_{2m}} - h}{\text{GDD}_{\text{mat}} d_L - h} \right)^{d_{\text{alloc}}^{\text{leaf}}} \geq a_{\text{leaf}}^f \quad \text{where} \quad \frac{\text{GDD}_{T_{2m}} - h}{\text{GDD}_{\text{mat}} d_L - h} \leq 1,$$

$$a_{\text{livestem}} = a_{\text{livestem}}^{i,3} \quad \text{when} \quad a_{\text{livestem}}^{i,3} \leq a_{\text{livestem}}^f \quad \text{else} \dots,$$

$$a_{\text{livestem}} = a_{\text{livestem}} \left(1 - \frac{\text{GDD}_{T_{2m}} - h}{\text{GDD}_{\text{mat}} d_L - h} \right)^{d_{\text{alloc}}^{\text{stem}}} \geq a_{\text{livestem}}^f \quad \text{where} \quad \frac{\text{GDD}_{T_{2m}} - h}{\text{GDD}_{\text{mat}} d_L - h} \leq 1,$$

$$a_{\text{repr}} = 1 - a_{f\text{root}} - a_{\text{livestem}} - a_{\text{leaf}}$$

Crop Carbon allocation



Leaf carbon => leaf area index, canopy height
Grain carbon => yield

Adding crop specific processes

Additional processes for winter wheat:

- Vernalization process

winter crops must expose to low, nonfreezing temperatures (optimum temperature = 4.9°C) to enter the reproductive stage

A generalized vernalization function for winter wheat (Streck et al., 2003), effective vernalization days and vernalization factor

Vernalization begin after germination and end before flowering

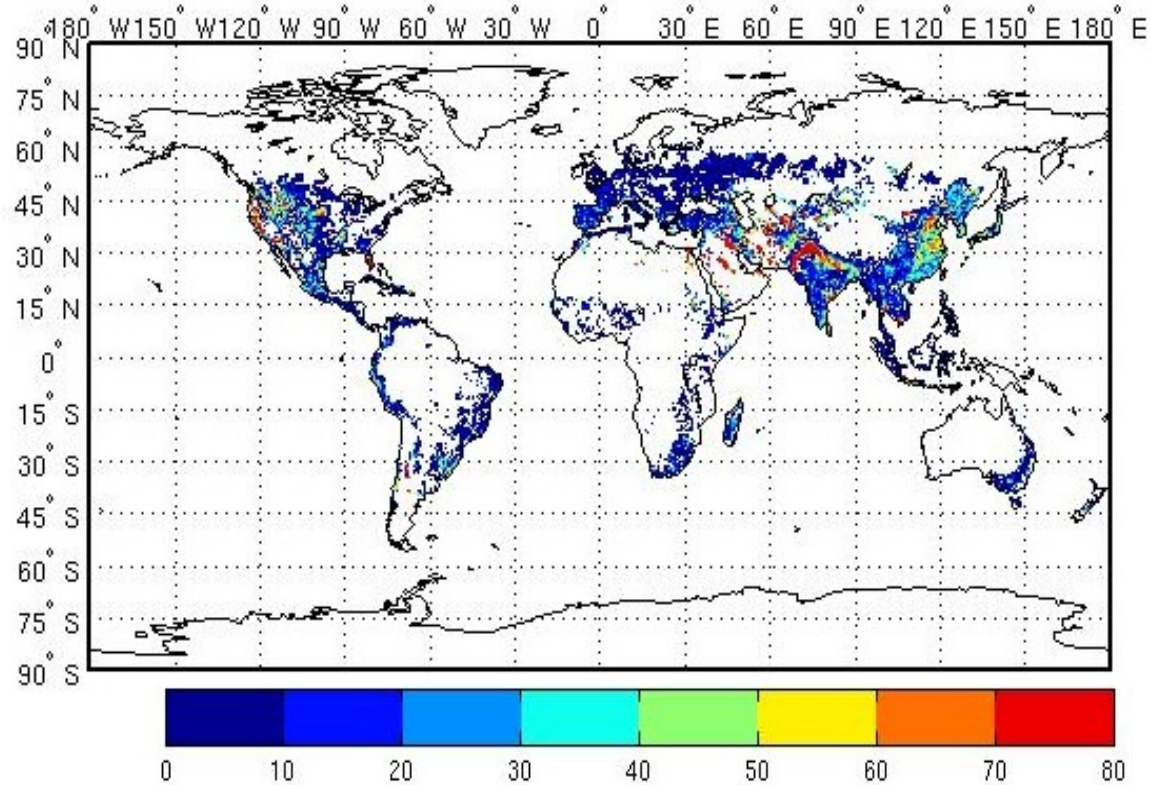
- Cold tolerance and damage

Survival rate and winter killing degree days



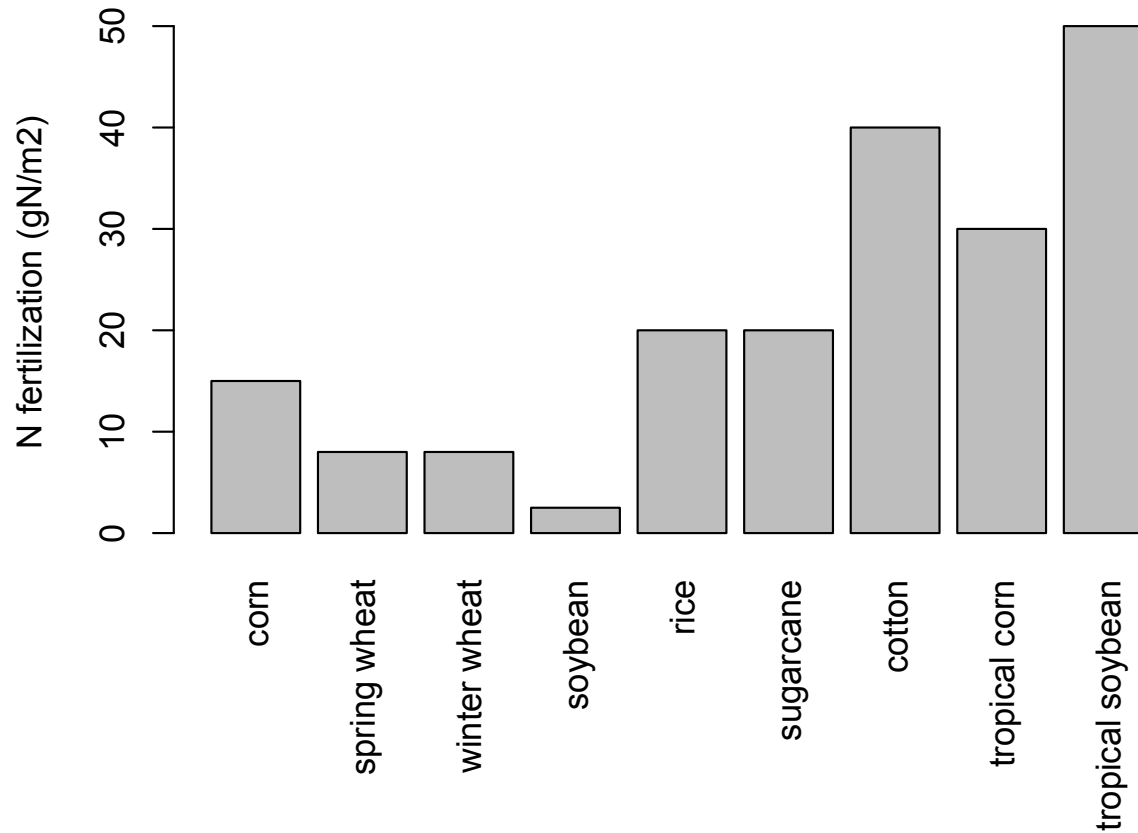
Irrigation

% of crops equipped for irrigation (Portmann et al. 2010)



Nitrogen fertilization

20 days windows for N fertilization since leaf emerge



Run CLM crop and coding

CLM crop model run with BGC, need spin up
Use crop compset: ICRUCLM50BGCCROP

Global simulation:

```
./create_newcase -compset ICRUCLM50BGCCROP -mach  
yellowstone -res f19_g16 -case ~/  
test_f19_g16_ICRUCLM50BGCCROP
```

Single point/regional simulation:

```
./create_newcase -compset ICRUCLM50BGCCROP -  
mach yellowstone -res CLM_USRDAT -case test_usrdat_  
ICRUCLM50BGCCROP
```

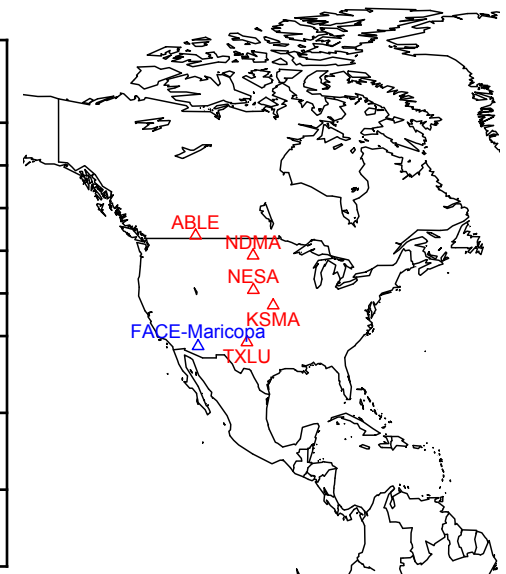
Code:

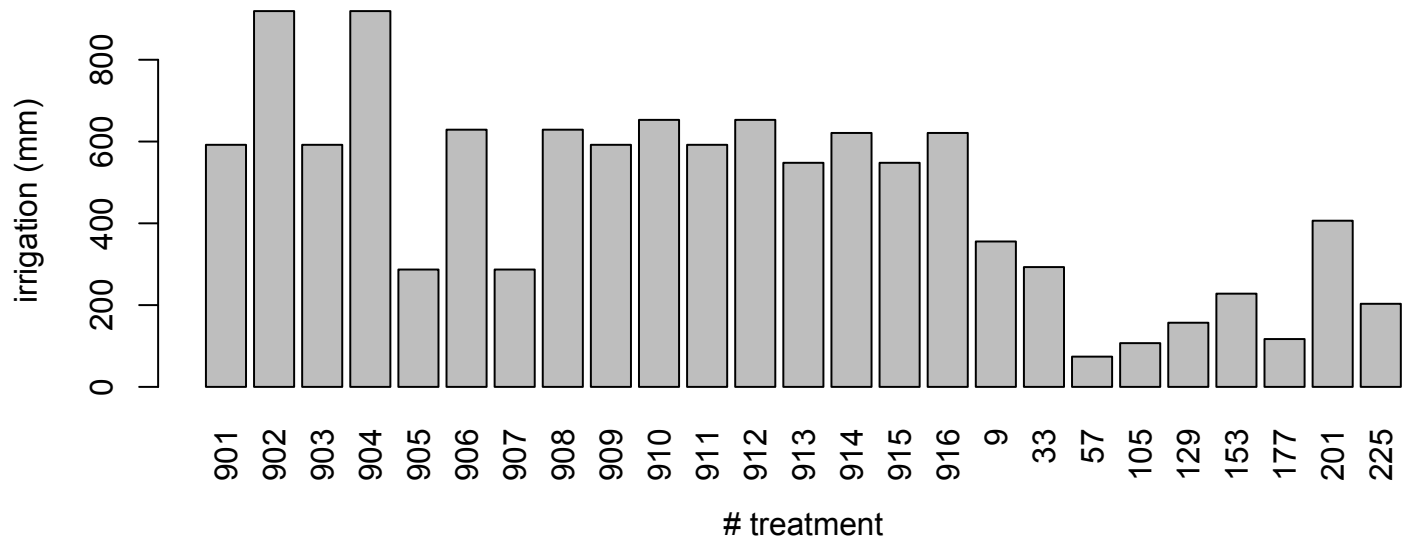
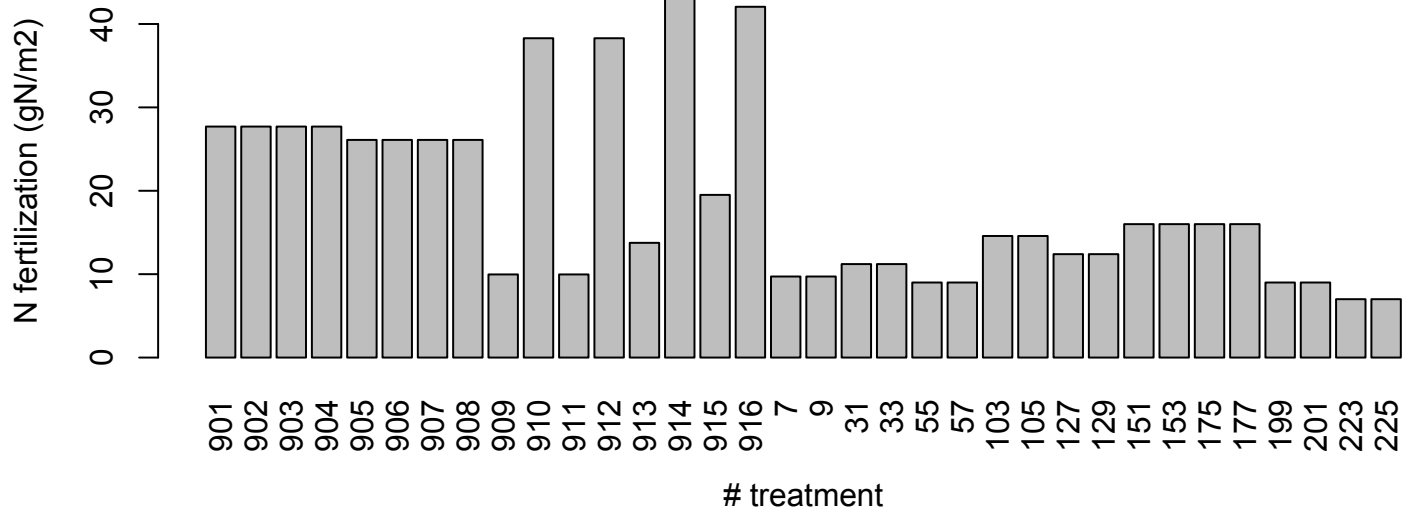
- Define crop variables: src/biogeochem/CropType.F90
- Phenology and growth processes: src/biogeochem/CNPhenologyMod.F90
Subroutine: CropPhenology, CropPhenologyInit, vernalization, coldtolerance
- Carbon allocation: src/biogeochem/NutrientCompetitionFlexibleCNMod.F90
subroutine calc_plant_nitrogen_demand

AgMIP-wheat project (post-CLM4.5)

- Activities: site simulations across 34 nitrogen, irrigation, and CO2 treatments at FACE-Maricopa spring wheat site and five other winter wheat sites.
- 17 crop models inter-comparison
- Goal: understanding whether CLM wheat appropriately response to different levels of nitrogen fertilization, irrigation, CO2.

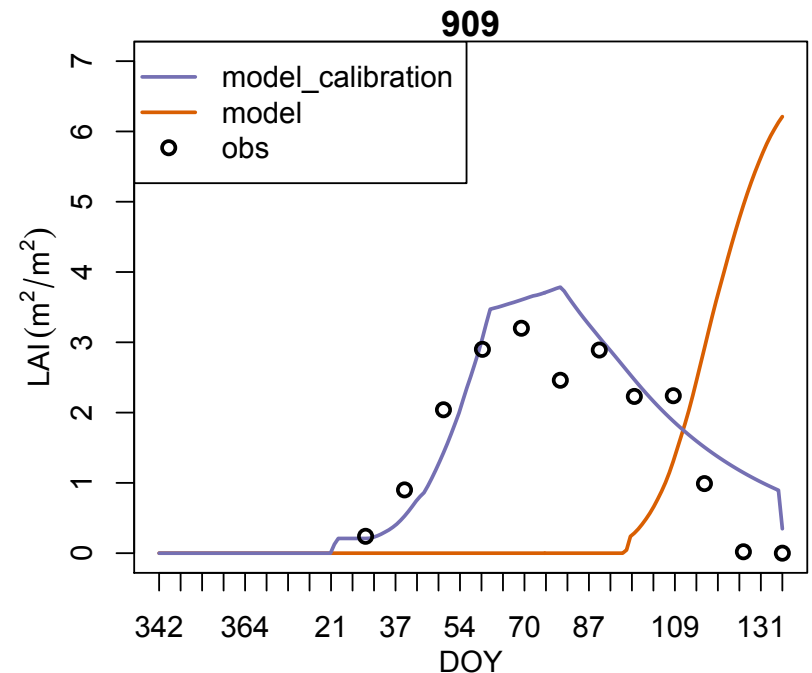
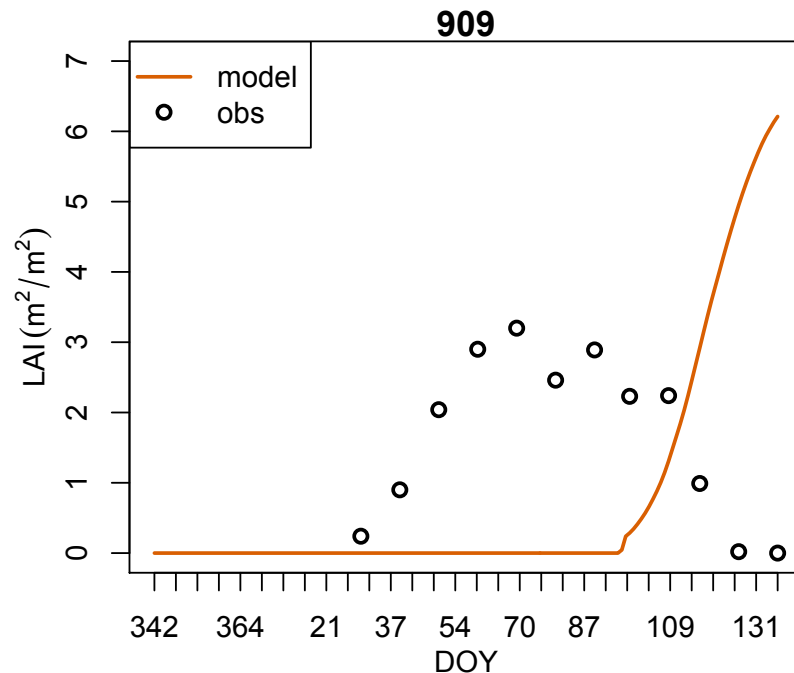
Site	Latitude	Longitude	Elevation (m)	Temperature (°C)	Year	CO2 (ppm)
TXLU	33.63	-101.83	1090	8.2	1984-1986	346
KSMA	39.09	-96.37	122	11.7	1984-1986	346
NESA	41.37	-100.49	975	11.5	1984-1986	346
NDMA	46.46	-100.55	588	14.2	1984-1986	346
ABLE	49.42	-112.5	920	12.2	1984-1986	346
Maricopa-MARA	33.0628	-111.9826	361	11.1	1993-1994	370
Maricopa-MARB	33.0628	-111.9826	361	11.1	1996-1997	370 +1.2TMIN
Maricopa-MARC	33.0628	-111.9826	361	11.1	1993-1997	550+1.2TMIN





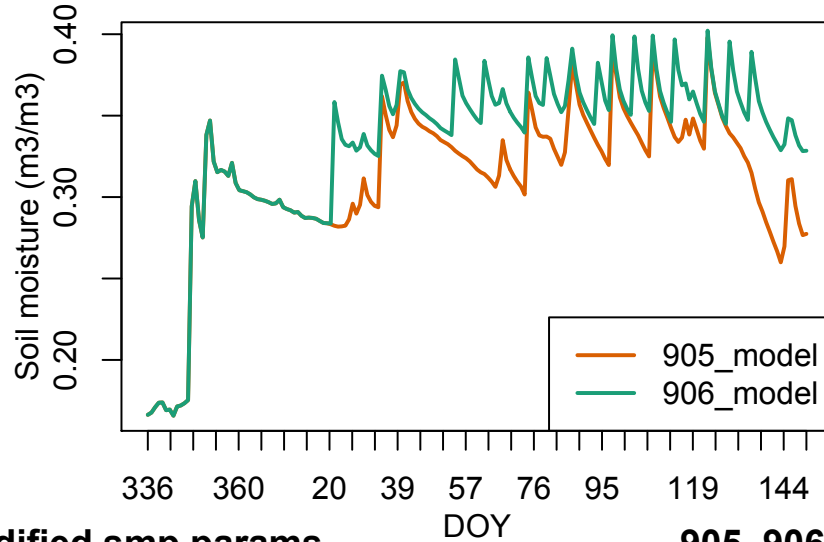
Calibrations

- Minimum planting date: April 1
- Maximum planting date: June 15
- Growing degree days for maturity (GDDm): 1700
- Leaf emerge: 5% GDDm
- Grain fill: 60% GDDm
- Leaf longevity: 1 year

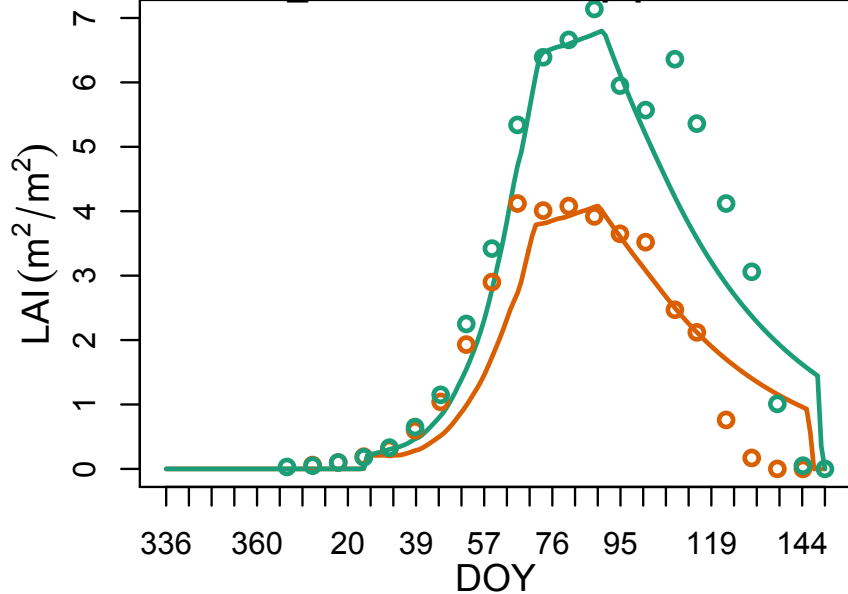


Irrigation effects

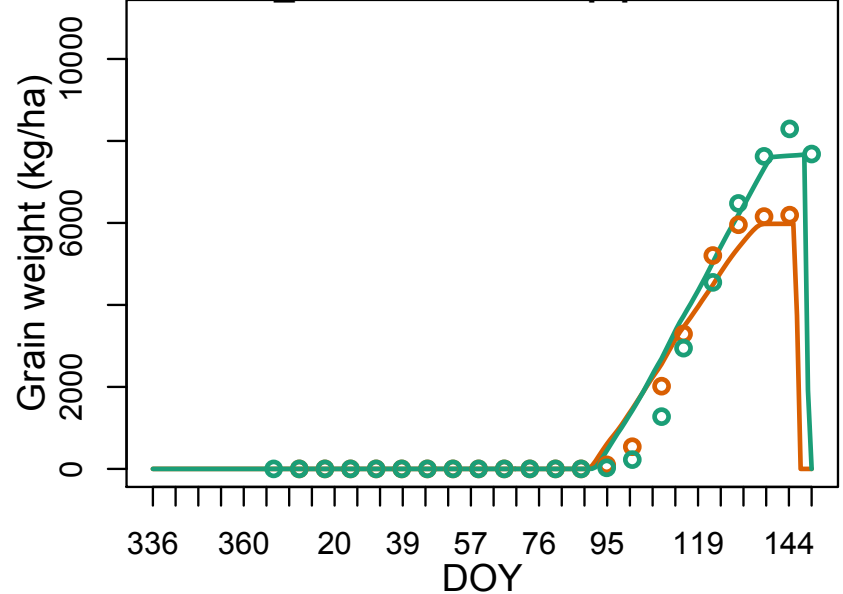
top layer soil moisture



905 906 modified smp params



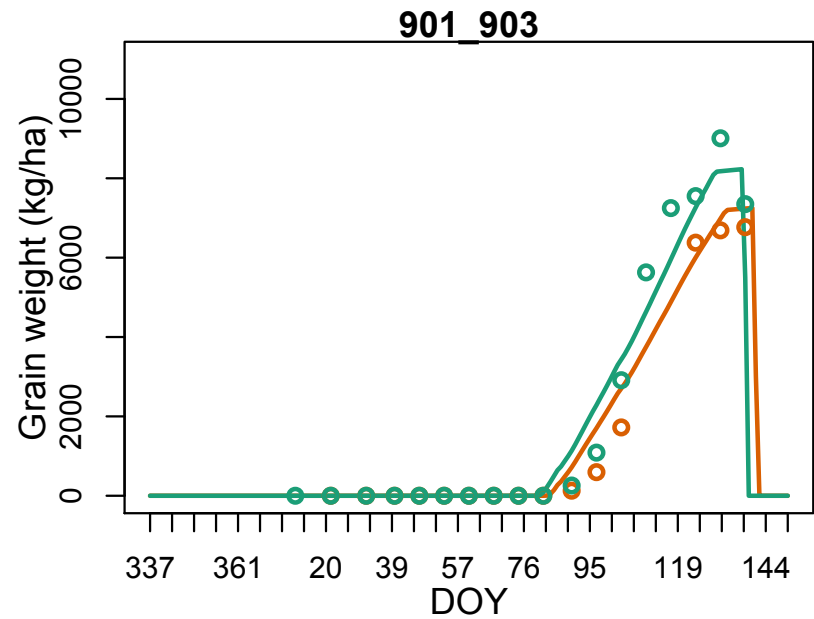
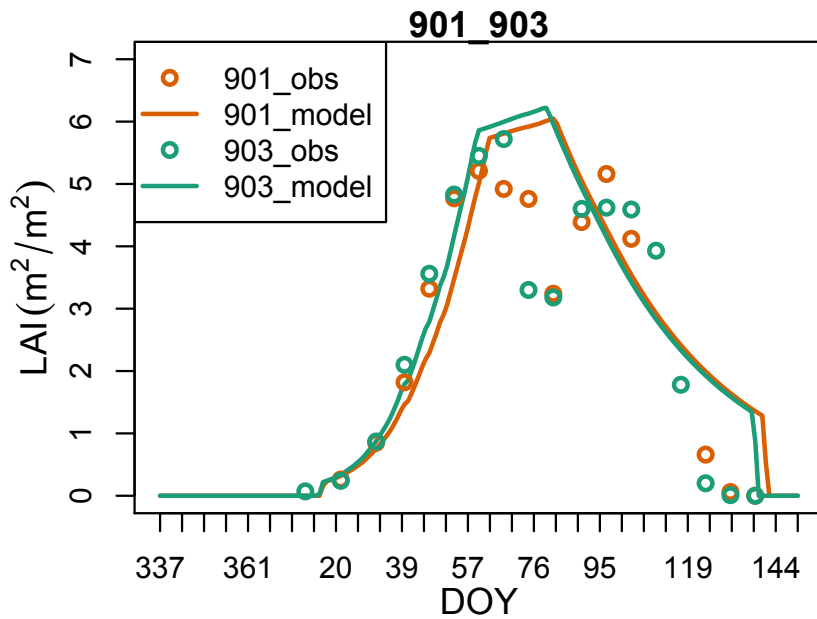
905 906 modified smp params



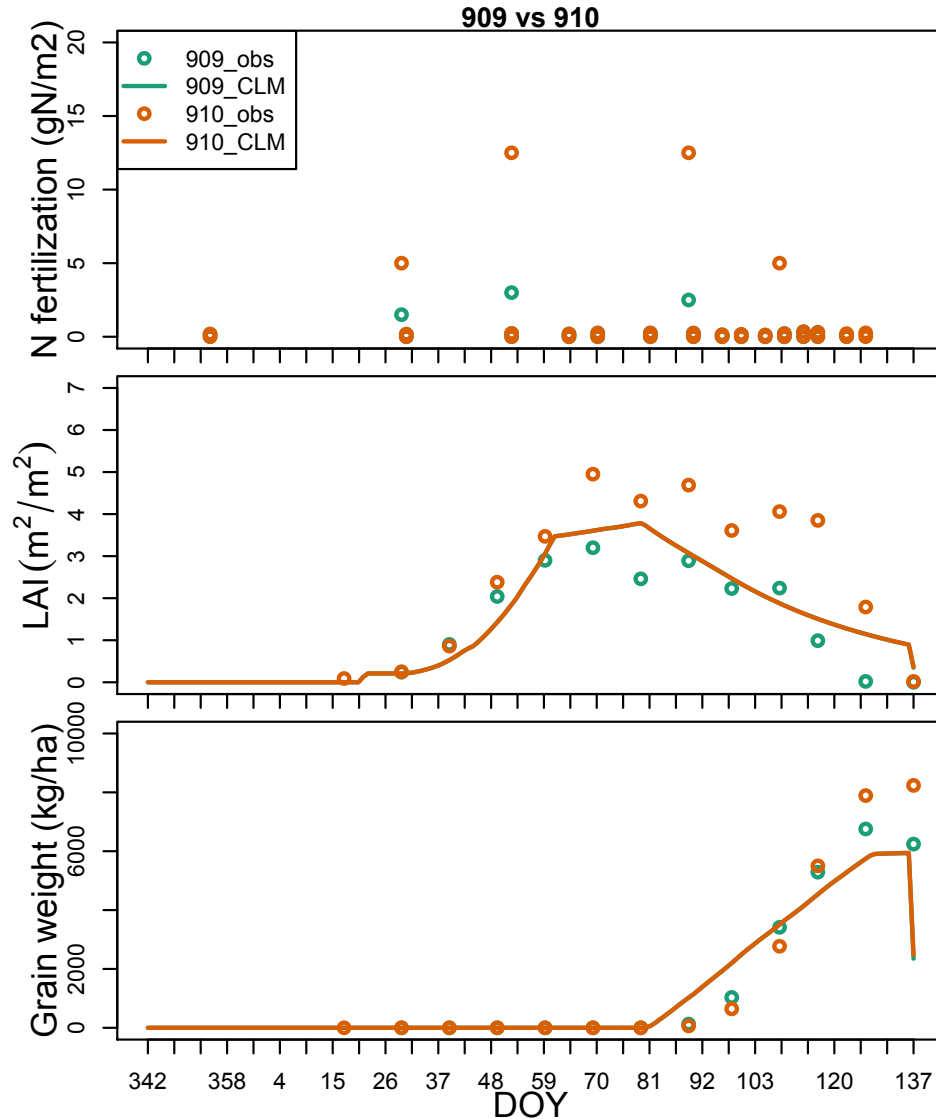
CO2 effects

901: 370ppm

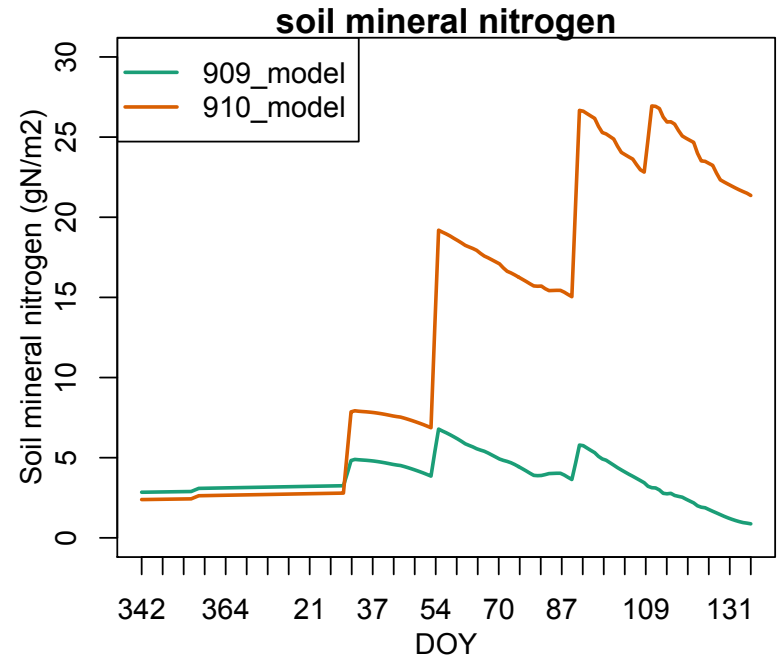
903: 550ppm



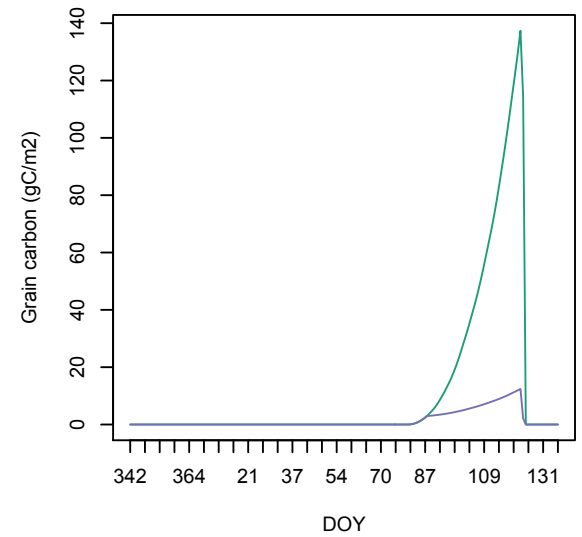
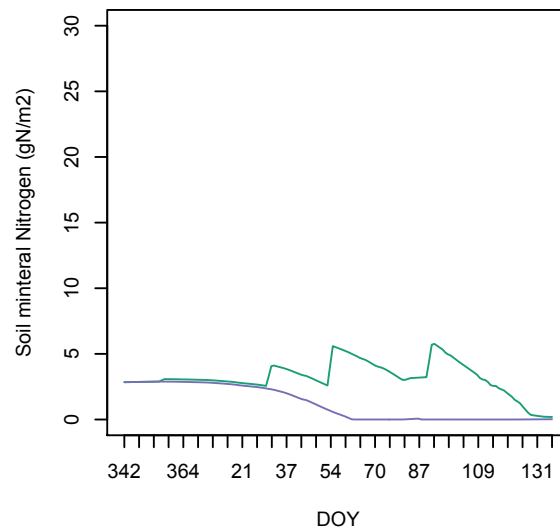
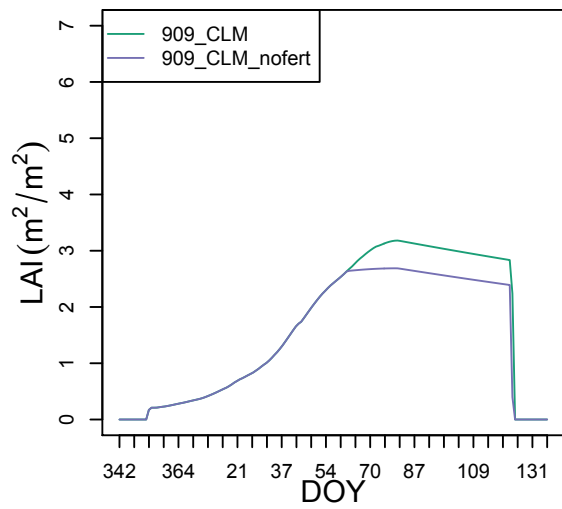
N fertilization effects



CLM has no response to different levels of N fertilization because the lower level of N fertilization is sufficient for crop growth in CLM



How about if not apply N fertilization in CLM?



TODO list

- Validate CLM5 crop response to elevated CO₂, N fertilization, irrigation.
- Develop more crop specific growth processes (response to drought, flood, extreme events)
- Develop the user friendly calibration procedures
- Develop the gridded crop parameters
- Adding more crops (limited by observations)

Questions?