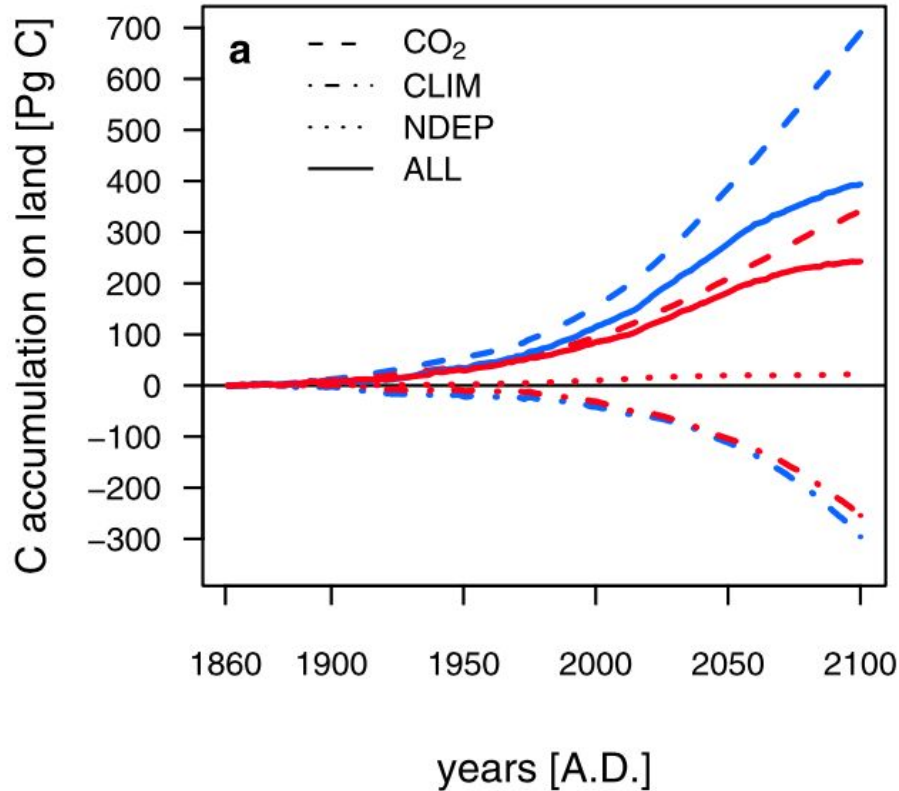


UNDERSTANDING RESPONSES TO ENVIRONMENTAL CHANGE IN CLM5

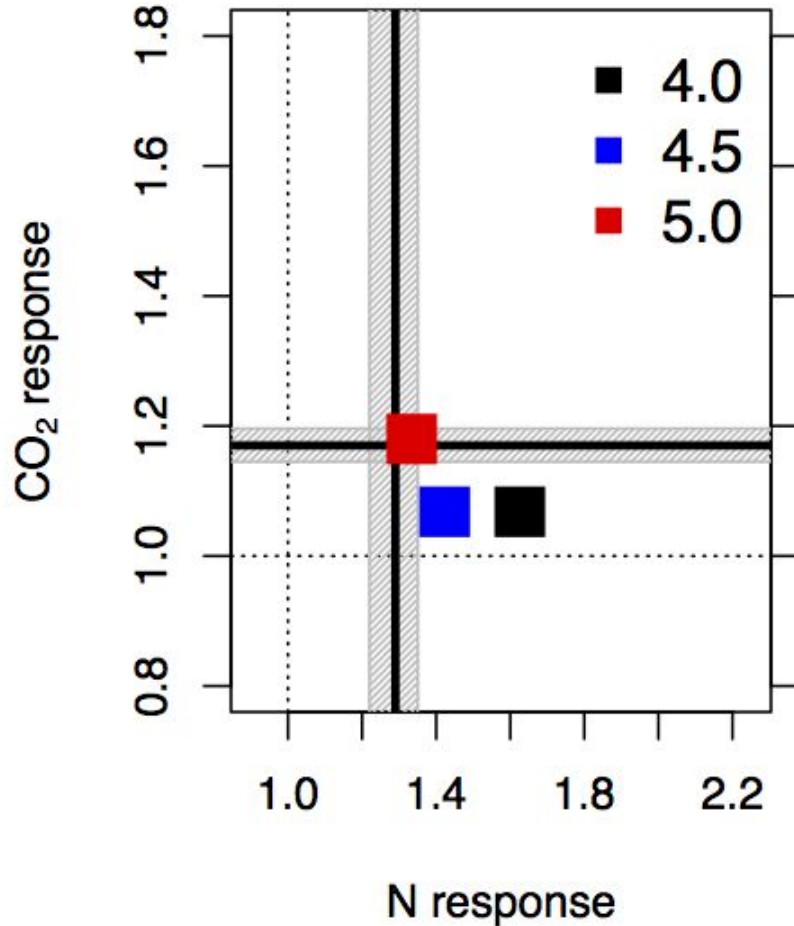
Rosie Fisher. Terrestrial Sciences Section, NCAR

With input/inspiration from Will Wieder, Dave Lawrence, Ben Sanderson,
Charlie Koven, Katie Dagon and the LMWG

It's generally important to understand these responses to CO₂ and N because they have massive feedbacks on the global carbon budget.



ZAEHLE ET AL. 2010.



Productivity in **CLM5**
responds
less to Nitrogen
and
more to CO₂
than its forbears.

Why?

Why does CLM5 respond differently to N and CO₂?

“CLM5 allows us to increase N fixation by spending C on N uptake”

“CLM5 has lower maximum photosynthesis and so responds less to N addition”

“CLM5 occupies a different part of parameter space, it’s nothing to do with model structure”

“CLM5 is awesome and that’s why it nails the experimental results”

“Something is subtly different in the photosynthesis scheme in CLM5”

“My favourite parameter ‘x’ has huge impacts on the CO₂/N response!”

To really answer these questions, we need to look at the parameter space and understand the model structure...

Why does CLM5 respond differently to N and CO₂?

“CLM5 allows us to increase N fixation by spending C on N uptake”

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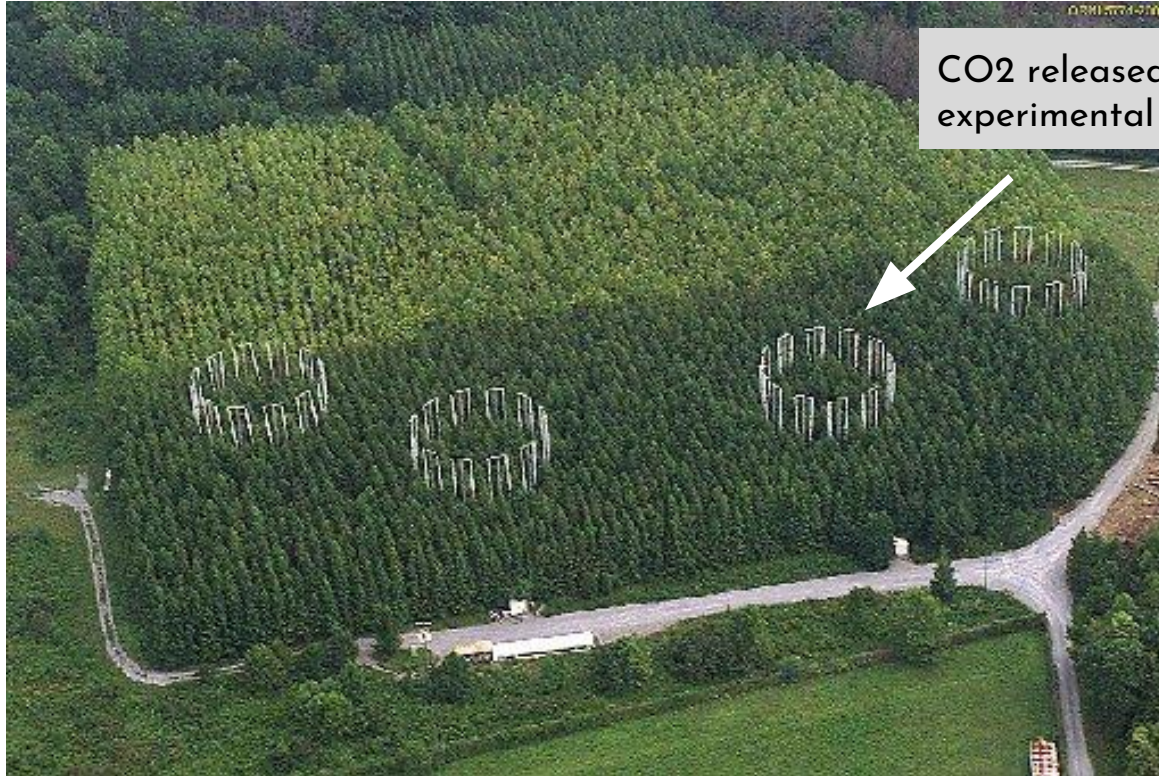
“CLM5 is awesome and that’s why it nails the experimental results”

“Something is subtly different in the photosynthesis scheme in CLM5”

“My favourite parameter ‘x’ has huge impacts on the CO₂/N response!”

...& it is important to understand how robust this result is, to (help) assess how much weight we should ascribe to predictions.

Free Air Carbon Enrichment (FACE) at Oak Ridge.



CO₂ released around volume of experimental forest

Where does the carbon go? A model–data intercomparison of vegetation carbon allocation and turnover processes at two temperate forest free-air CO₂ enrichment sites

Martin G. De Kauwe¹, Belinda E. Medlyn¹, Sönke Zaehle², Anthony P. Walker³, Michael C. Dietze⁴, Ying-Ping Wang⁵, Yiqi Luo⁶, Atul K. Jain⁷, Bassil El-Masri⁷, Thomas Hickler^{8,9}, David Warland¹⁰, Ensheng Weng¹¹, William J. Parton¹², Peter E. Thornton³, Shusen Wang¹³, I. Colin Prentice^{1,14}, Shinichi Asao¹², Benjamin Smith¹⁰, Heather R. McCarthy¹⁵, Colleen M. Iversen³, Paul J. Hanson³, Jeffrey M. Warren³, Ram Oren⁴

The ORNL FACE site has been the subject of many excellent terrestrial model inter-comparison studies, but no parameter perturbation experiments

PERSPECTIVE

PUBLISHED ONLINE: 21 MAY 2015 | DOI: 10.1038/NCLIMATE2621

nature
climate change

Using ecosystem experiments to improve vegetation models

Belinda E. Medlyn^{1,2*}, Sönke Zaehle³, Martin G. De Kauwe¹, Anthony P. Walker⁴, Michael C. Dietze⁵, Paul J. Hanson⁴, Thomas Hickler⁶, Atul K. Jain⁷, Yiqi Luo⁸, William Parton⁹, I. Colin Prentice¹⁰, Peter E. Thornton⁴, Shusen Wang¹¹, Ying-Ping Wang¹², Ensheng Weng¹³, Colleen M. Iversen⁴, Ram Oren^{14,15} and Richard J. Norby⁴

Evaluation of 11 terrestrial carbon–nitrogen cycle models against observations from two temperate Free-Air CO₂ Enrichment studies

Sönke Zaehle¹, Belinda E. Medlyn², Martin G. De Kauwe², Anthony P. Walker³, Michael C. Dietze⁴, Thomas Hickler^{5,6}, Yiqi Luo⁷, Ying-Ping Wang⁸, Bassil El-Masri⁹, Peter Thornton³, Atul Jain⁹, Shusen Wang¹⁰, David Warland¹¹, Ensheng Weng¹², William Parton¹³, Colleen M. Iversen³, Anne Gallet-Budynek^{14,15}, Heather McCarthy⁷, Adrien Finzi¹⁶, Paul J. Hanson³, I. Colin Prentice^{2,17}, Ram Oren^{18,19} and Richard J. Norby³

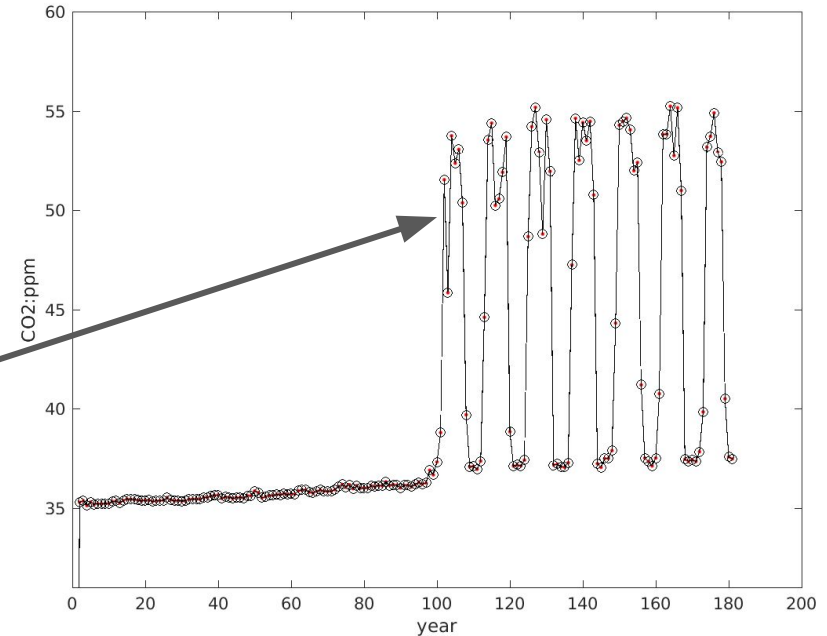
SINGLE POINT PERTURBED PARAMETER METHODOLOGY.

1. Spin up base state in **accelerated mode** for 400 years.
2. Spin up base case in **non-accelerated mode** for 100 years
3. **Perturb** parameters (one at a time. x5)
4. **Ensemble** run: Spin up @1765
5. **Ensemble** run: **Transient** 1765-2010
6. Increase **CO₂** (using site data)

100% deciduous broadleaf trees (DBT)

CO₂ only increased in growing season

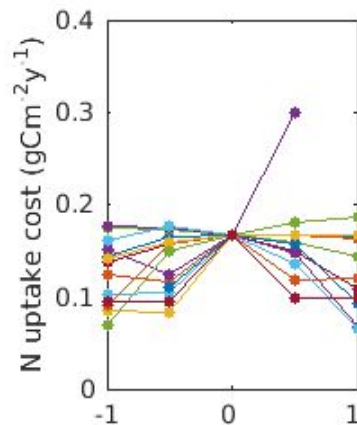
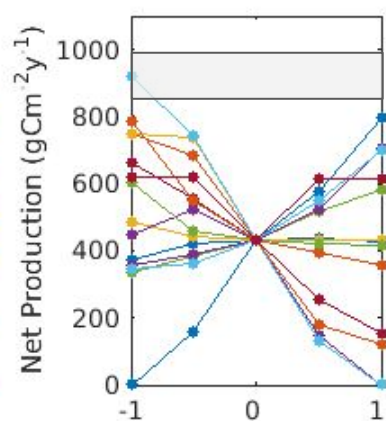
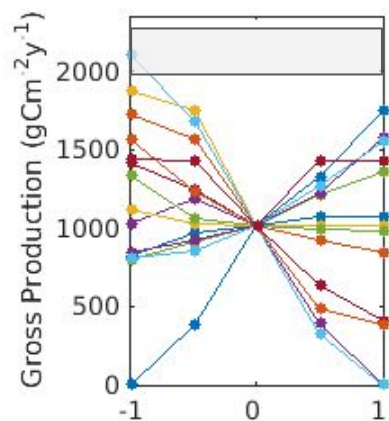
Target 550ppm



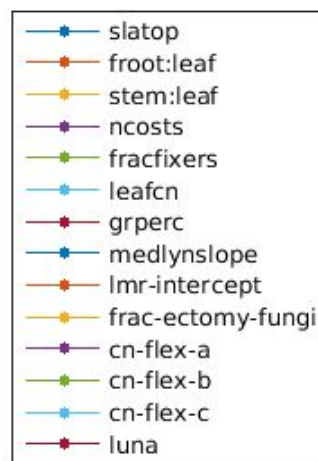
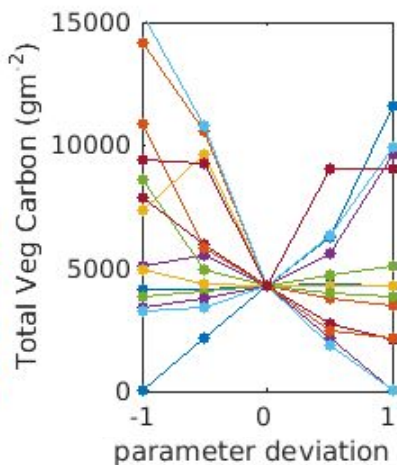
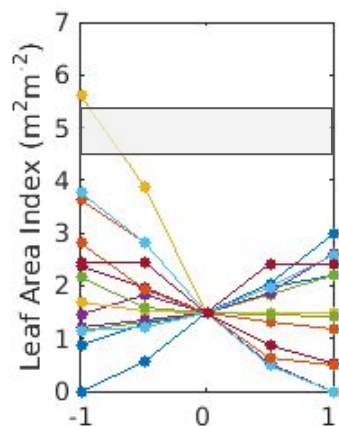
Parameter	Name	Range Determined By
Specific Leaf Area	SLATOP	TRY database
Leaf C:N ratio	LEAFCN	TRY database
Root:leaf ratio	FROOT_LEAF	Litton et al. (2011)
Stem:leaf ratio	STEM_LEAF	Litton et al. (2011)
Fraction N fixers	FRACFIXERS	Logical Range (0-1)
Growth Respiration	GRPERC	Atkin et al. 2018
Stomatal Slope	MEDLYN_SLOPE	Medlyn et al. 2011
Respiration BaseRate	LMR_INTERCEPT	Atkin et al. 2015
Fraction Ectomyccorrhizal fungi	PERECM	Logical Range (0-1)
Flexible CN ratio 'a'	FUN_FLEX_CN_A	Logical Range (0-1)
Flexible CN ratio 'b'	FUN_FLEX_CN_B	Sensitive Range (1-400)
Flexible CN ratio 'c'	FUN_FLEX_CN_C	Sensitive Range (1-32)
N Costs (x6 parameters)	N_COSTS	Sensitive range (4 ord.magnitude)

PARAMETER PERTURBATIONS :
 FOCUS ON CARBON AND
 NITROGEN CYCLING
 PARAMETERS.

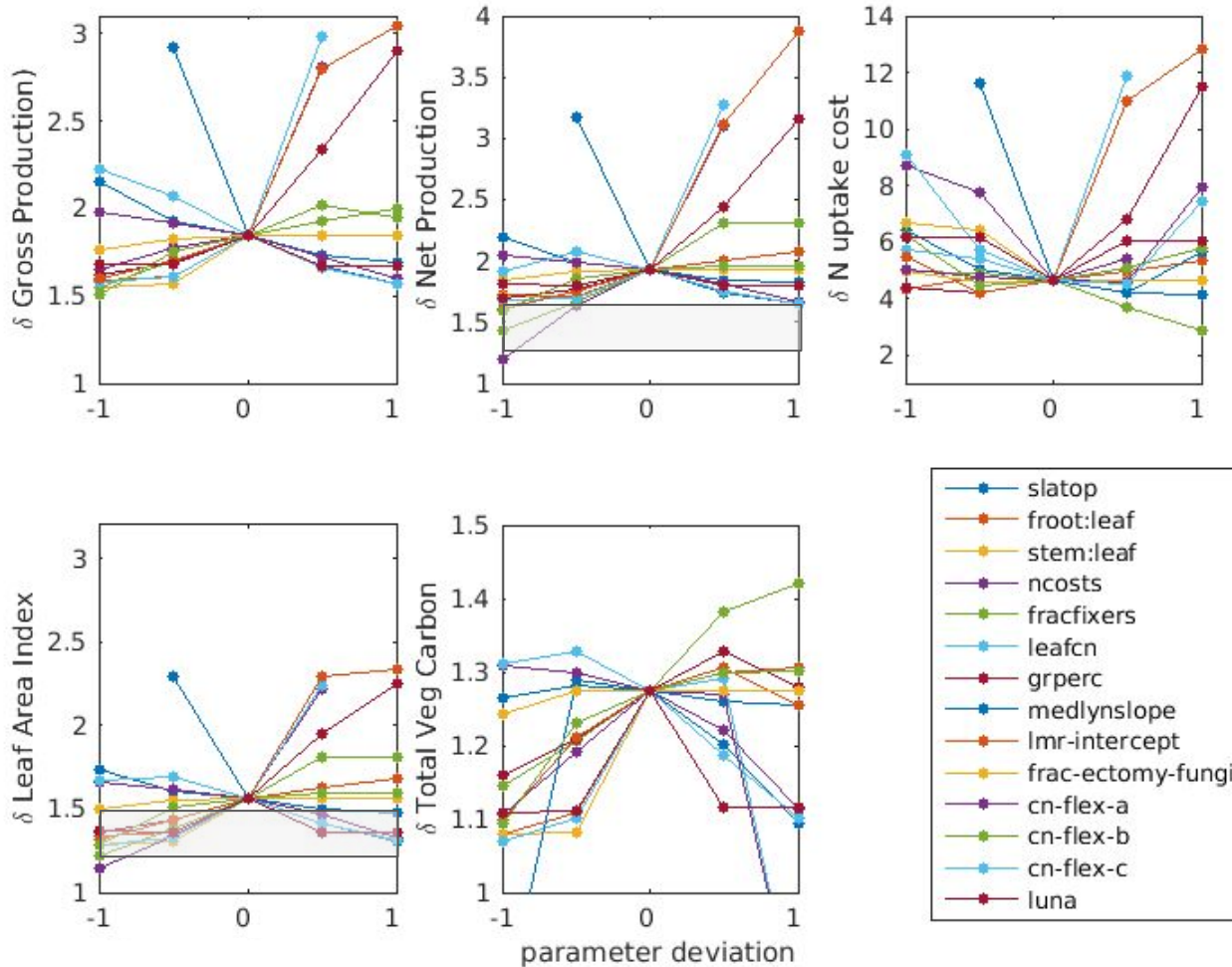
System State: Default



Default state has not got enough leaves!

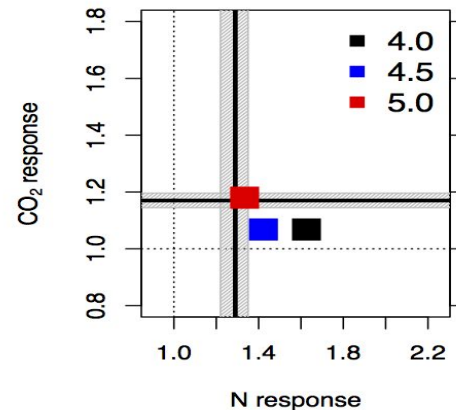


CO₂ response: Default

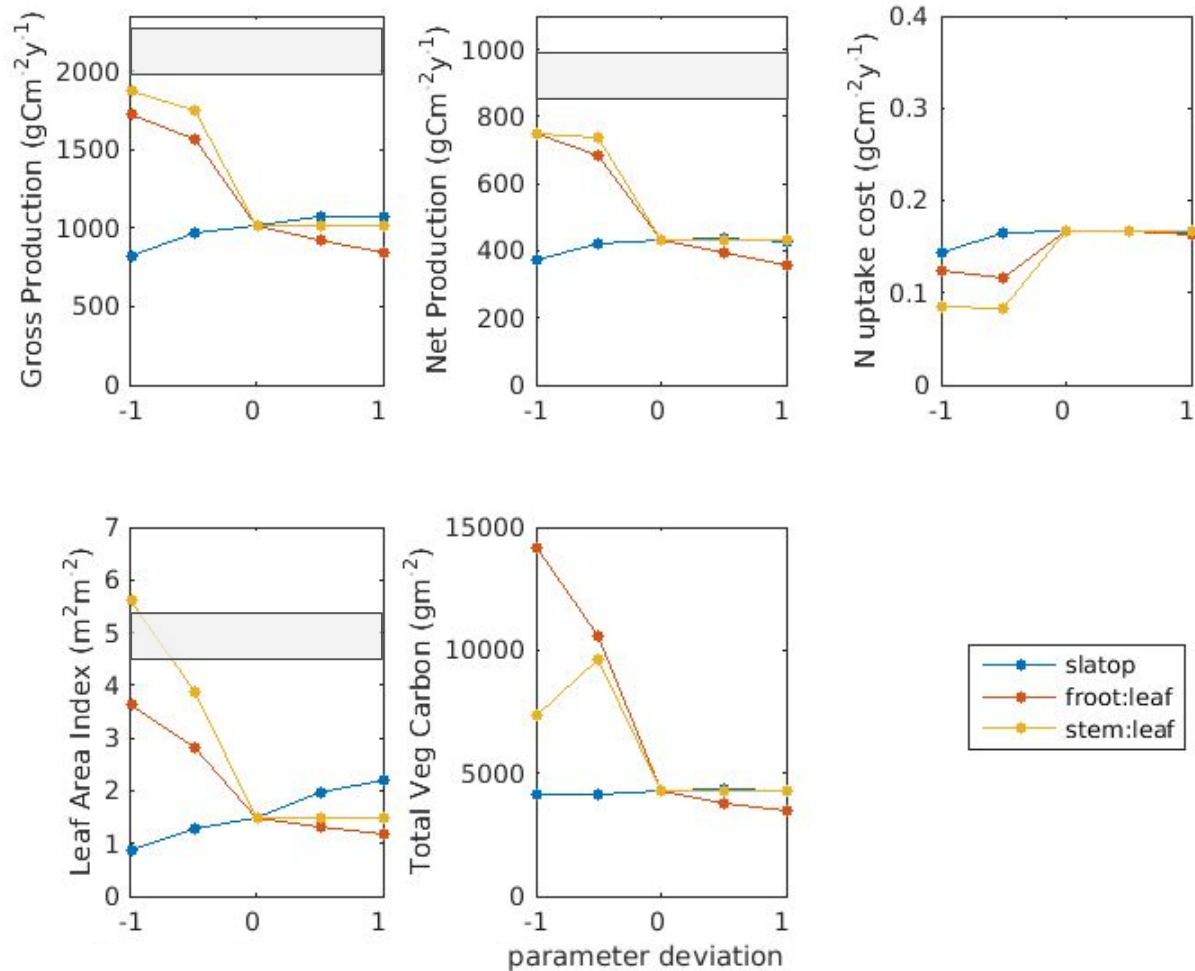


This means that everything is very sensitive to CO₂ fertilization.

Increasing productivity increases leaf area which increases productivity. Hence whole system is **very** sensitive to fertilization

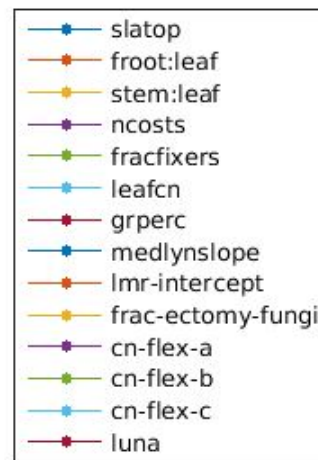
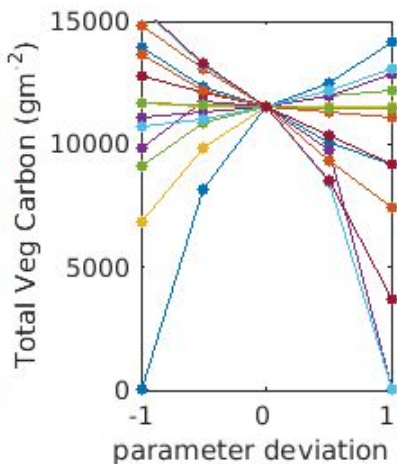
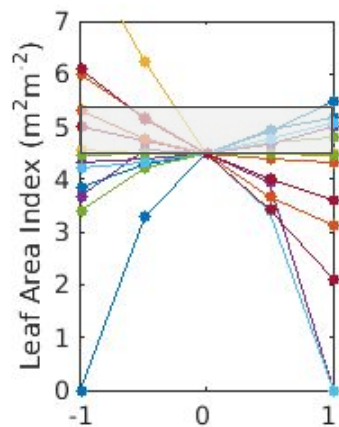
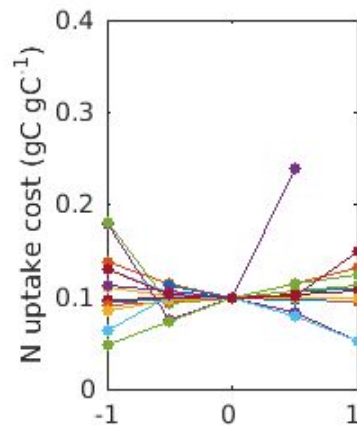
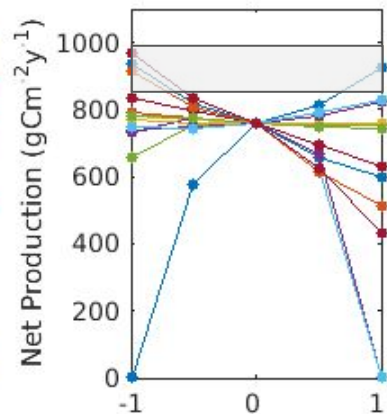
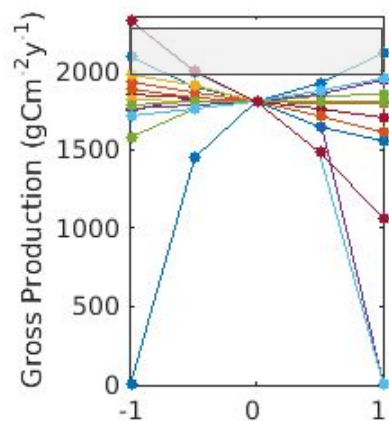


System State: Default



...mostly because it is trying to build too much root and stem tissue

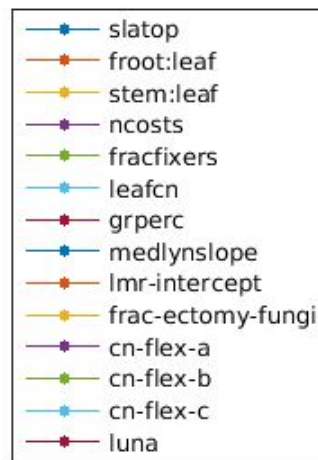
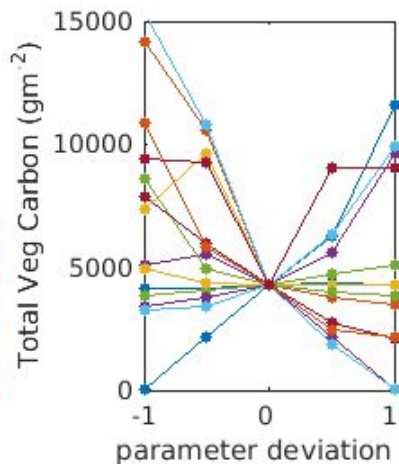
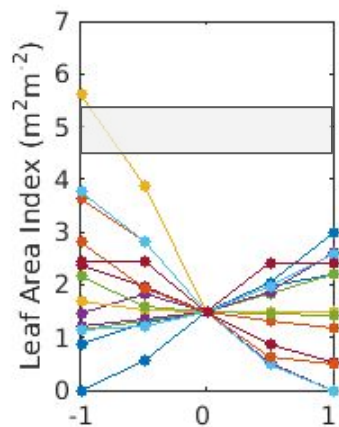
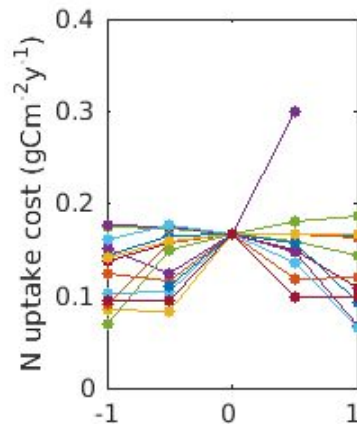
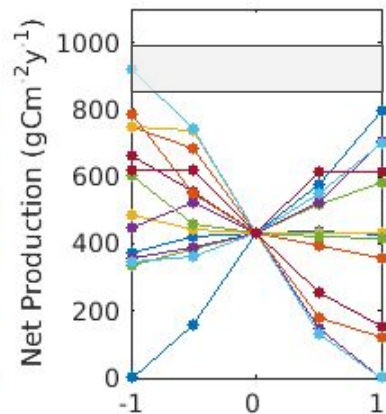
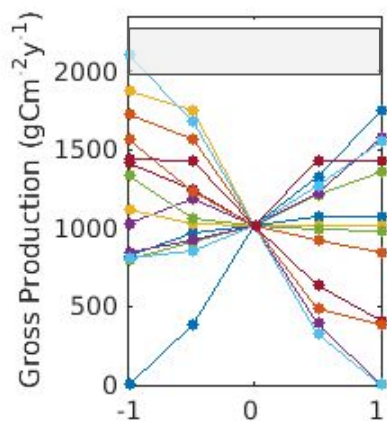
System State: High Leaf Allocation



Higher leaf allocation state is more realistic

froot_leaf
and
stem_leaf
adjusted down into observed range for deciduous broadleaf trees.

System State: Default



Higher leaf allocation state is more realistic

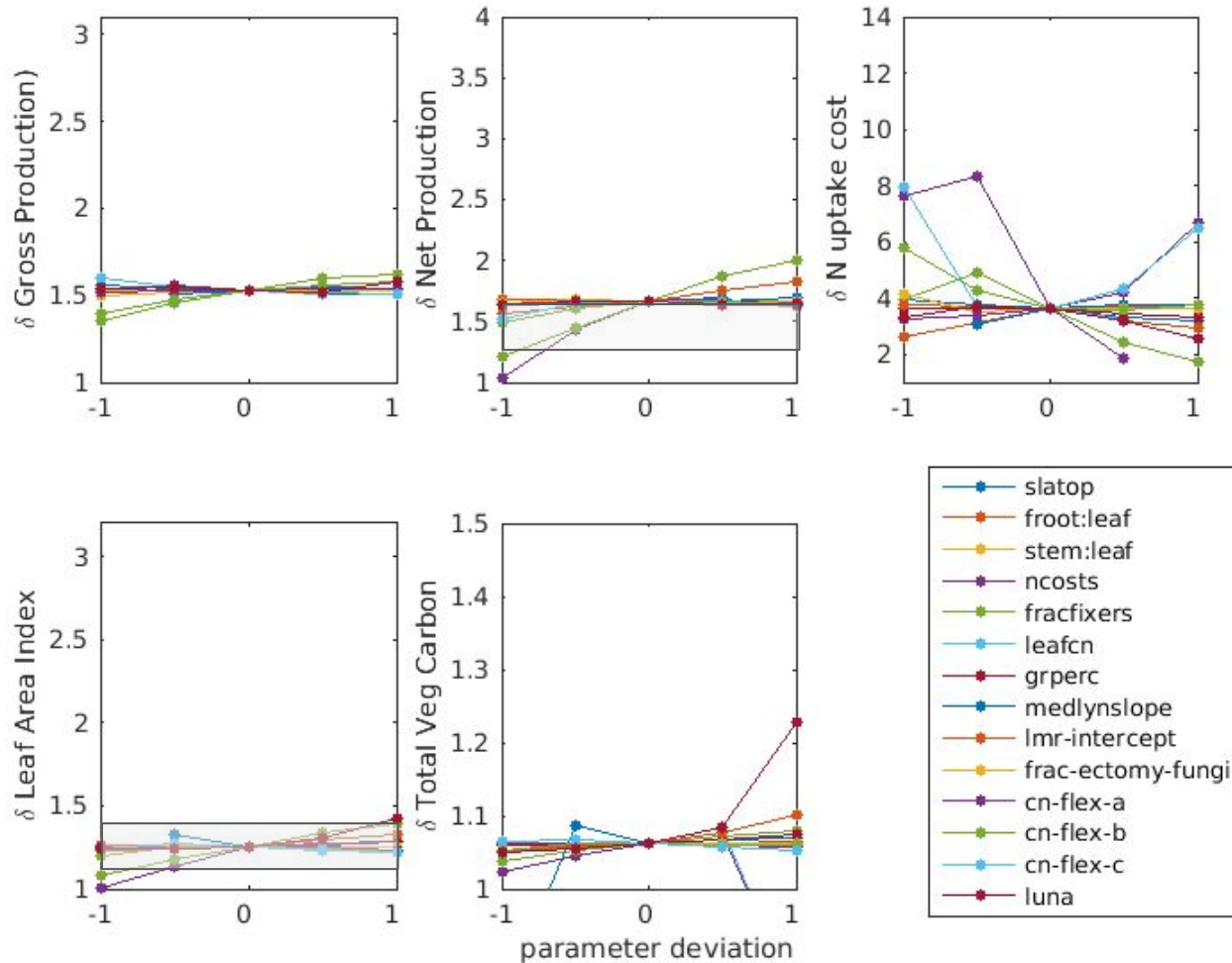
froot_leaf

and

stem_leaf

adjusted down into observed range for deciduous broadleaf trees.

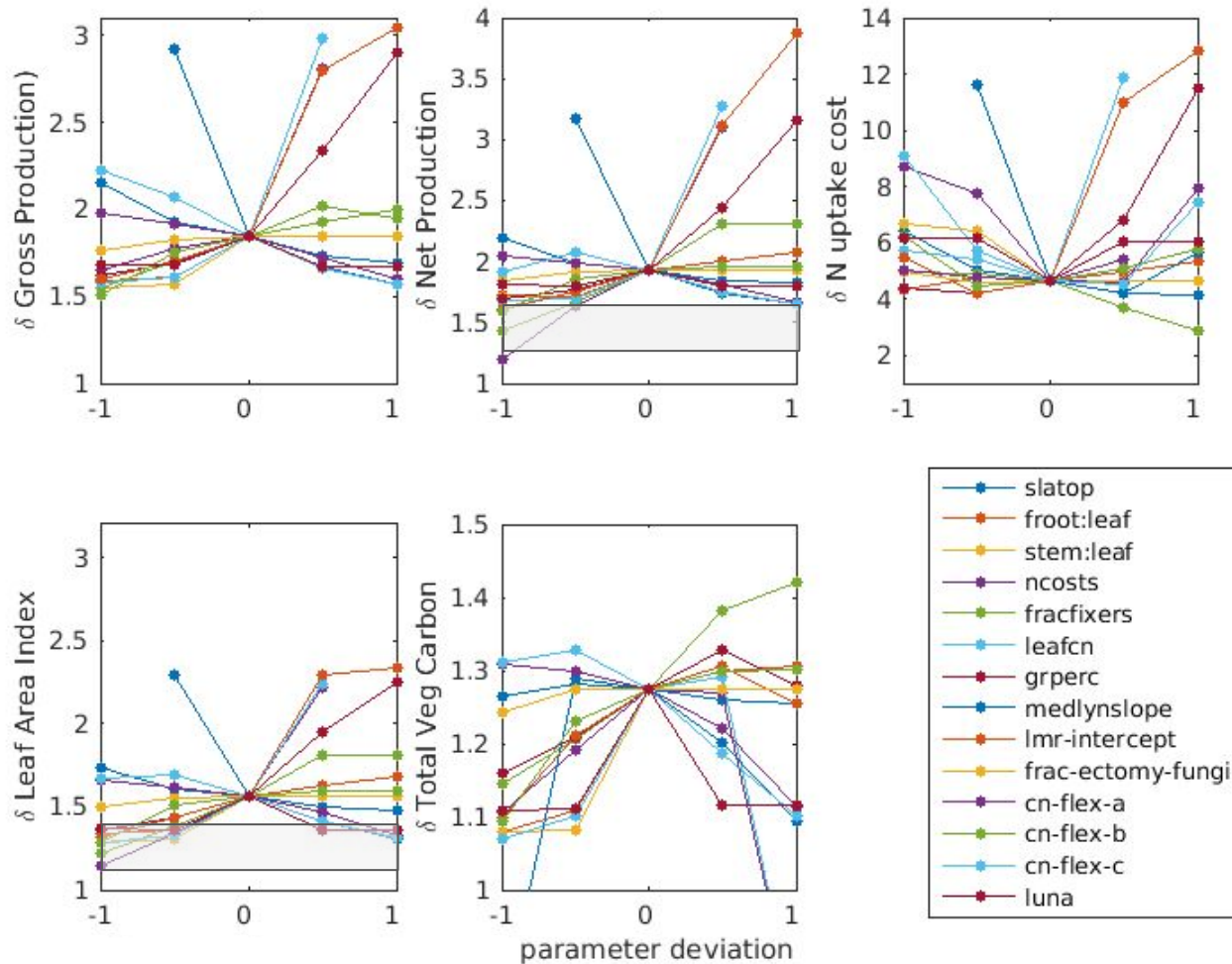
CO₂ response: Higher leaf allocation



Higher leaf allocation state has more conservative response to CO₂

At closed canopy, changes in leaf area do not feed back on productivity as light interception is saturated...

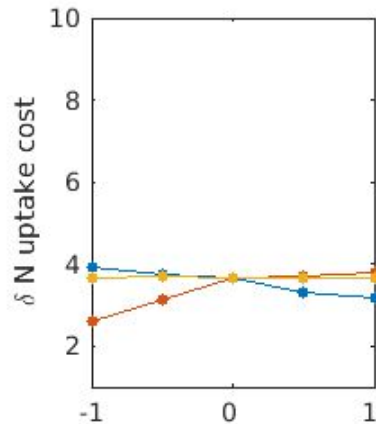
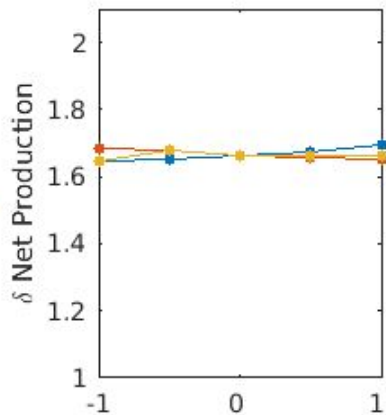
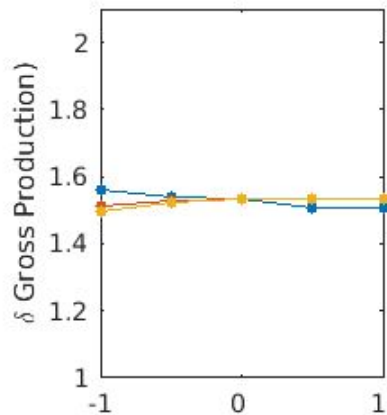
CO₂ response: Default



Higher leaf allocation state has more conservative response to CO₂

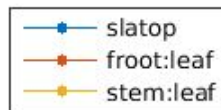
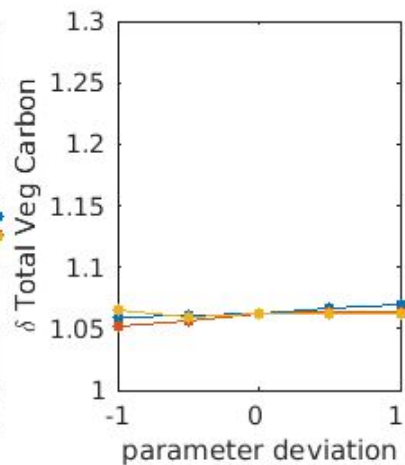
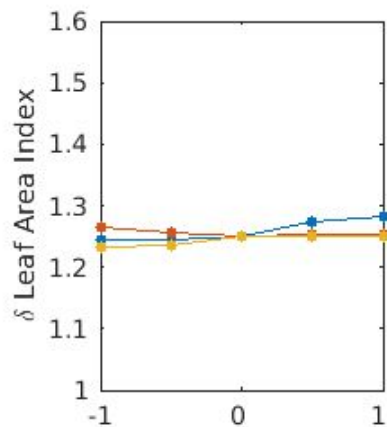
At closed canopy, changes in leaf area do not feed back on productivity as light interception is saturated...

CO₂ response: Higher leaf allocation

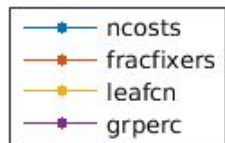
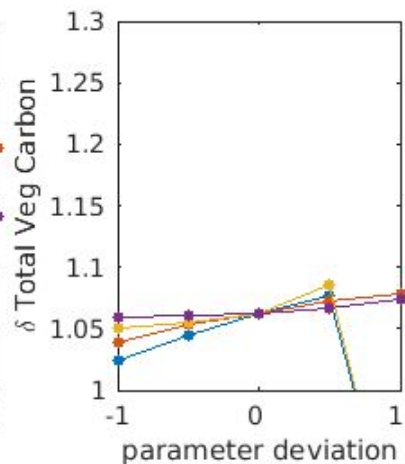
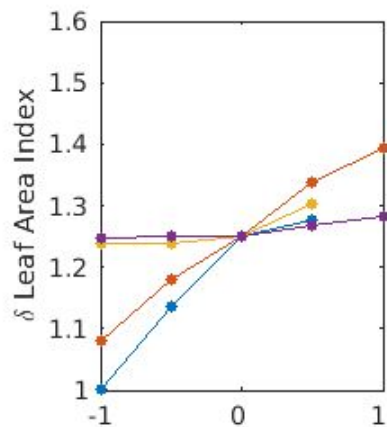
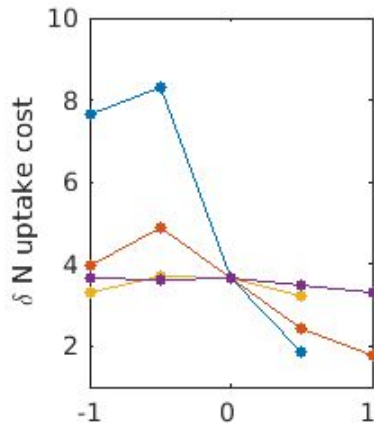
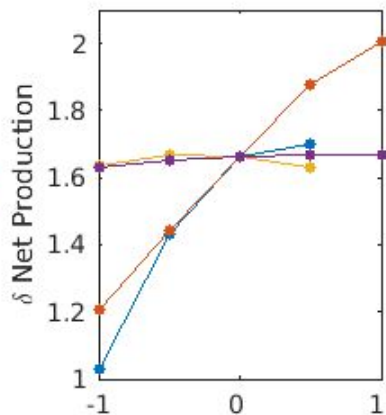
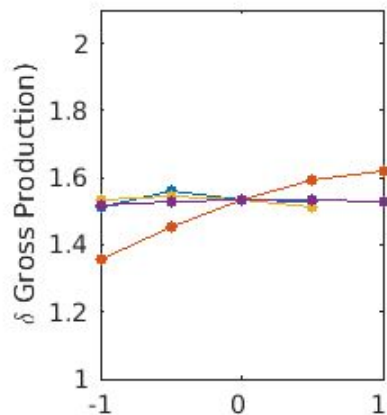


Allocation parameters don't affect CO₂ response

(these act linearly on C cycle)



CO₂ response: Higher leaf allocation



N uptake parameters
DO affect response

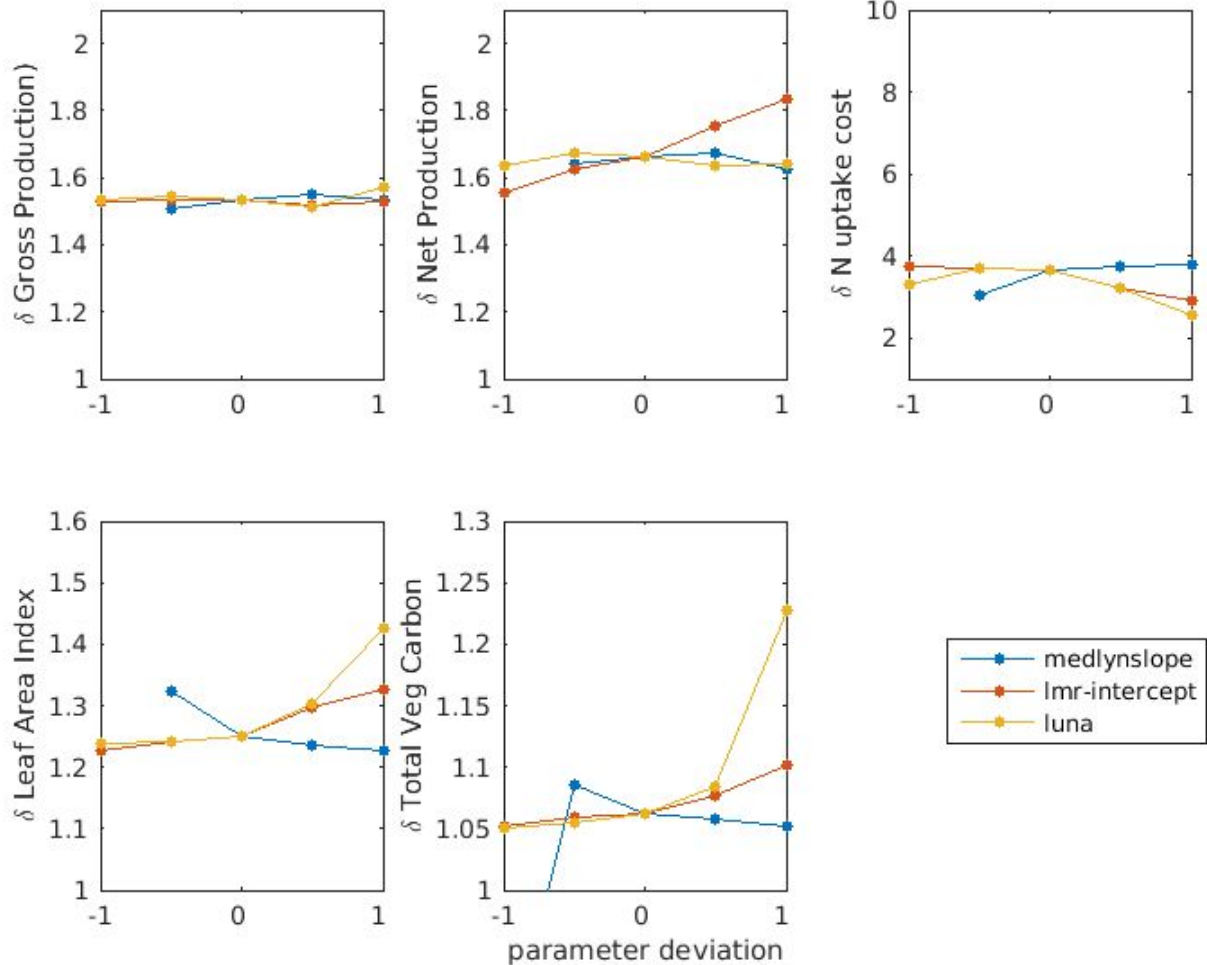
Fraction of fixers
significantly alters result

As does cost of N
uptake

So, the Nitrogen cycle
is constraining the CO₂
response...

..and in CLM5, plants
can **buy their way out**
of that problem!

CO₂ response: Higher leaf allocation

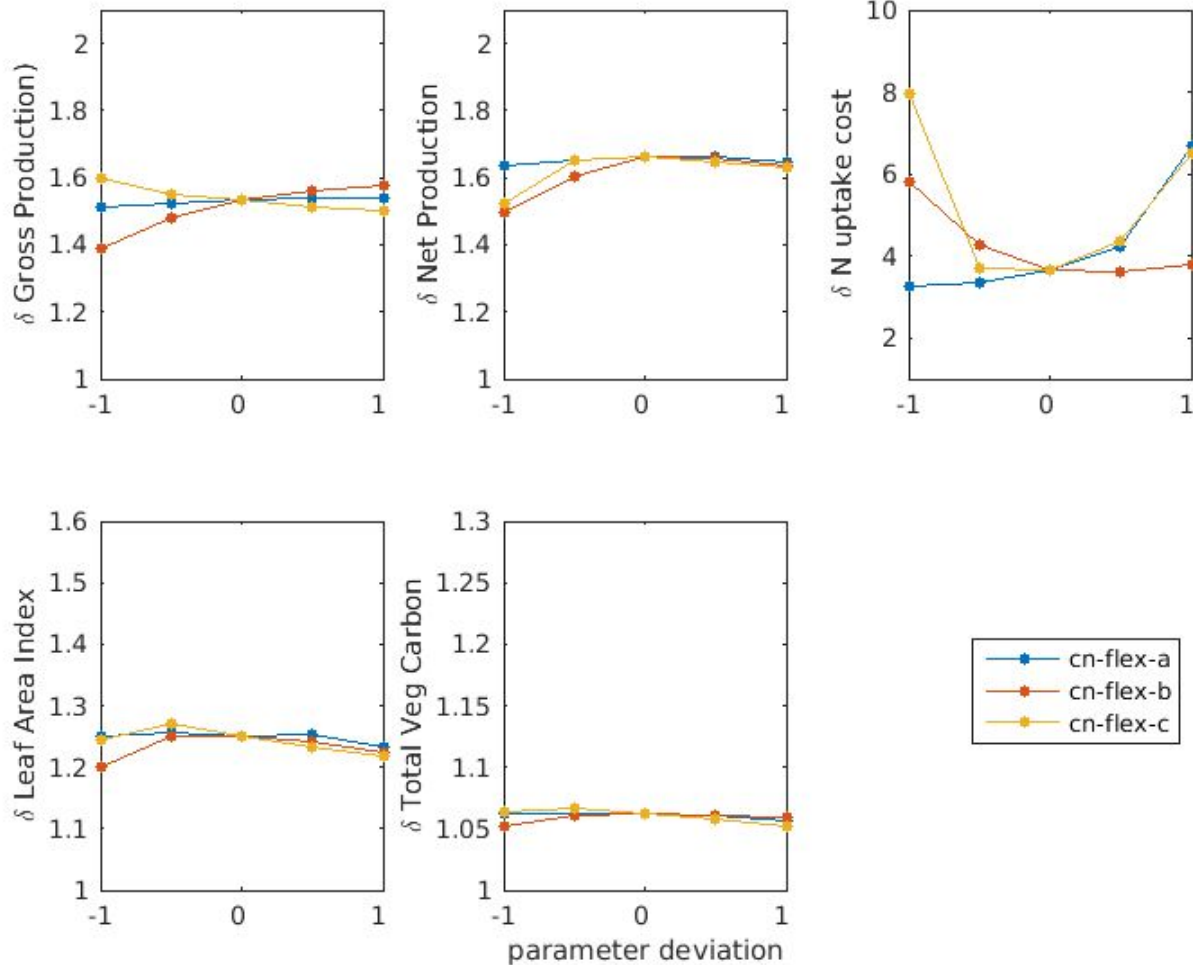


Photosynthesis parameters are less fundamental to impact

Stomatal slope is generally found to have a large impact.

Further evidence of primacy of N cycling parameters.

CO₂ response: Higher leaf allocation



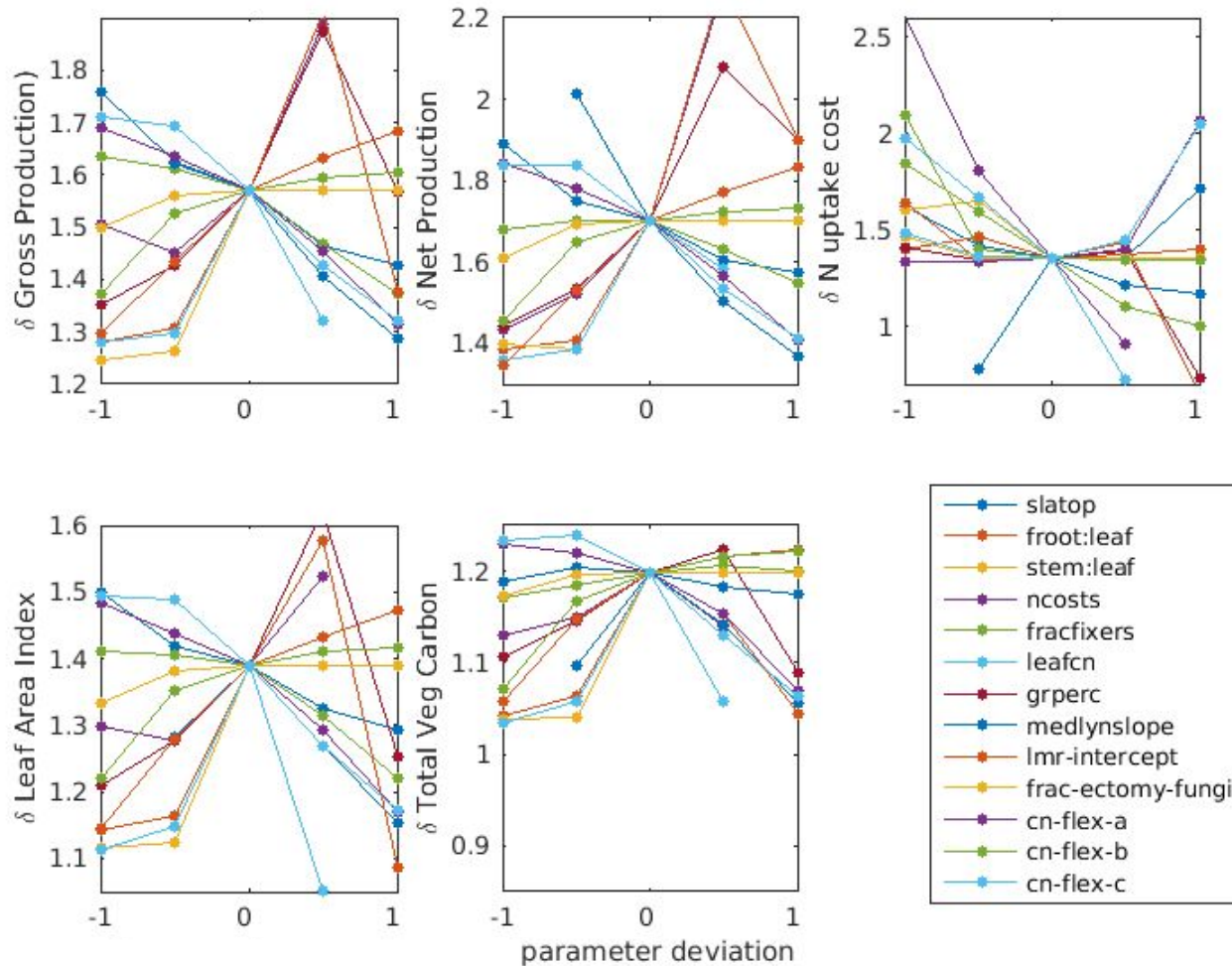
C:N flexibility parameters are not of 1st order importance

This is mildly surprising, since 'diluting' Nitrogen is one way around limitation

(but diluting Nitrogen also reduces growth)

These parameters are highly unconstrained...

Nitrogen response: Default



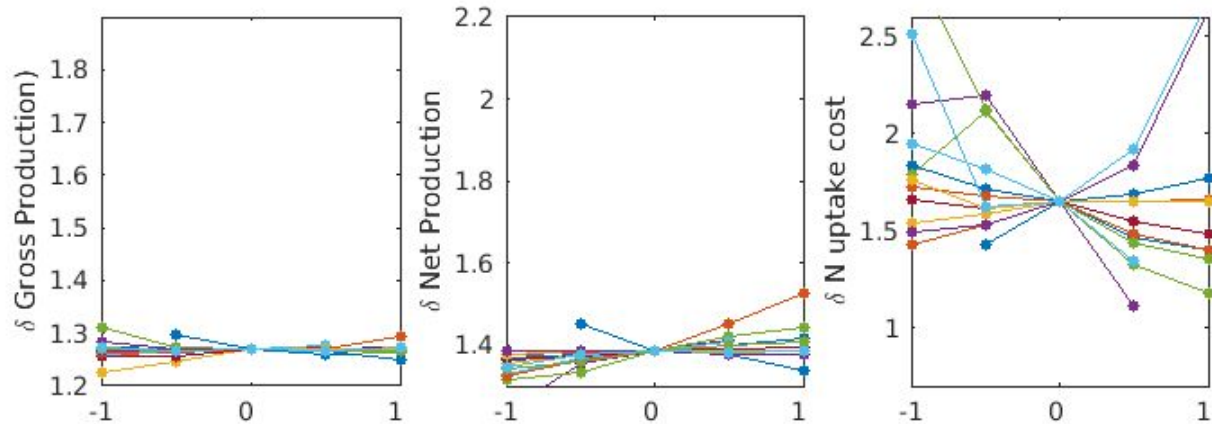
Wide range of responses to N fertilization.

This is the default state...

Parameters behaving as expected.

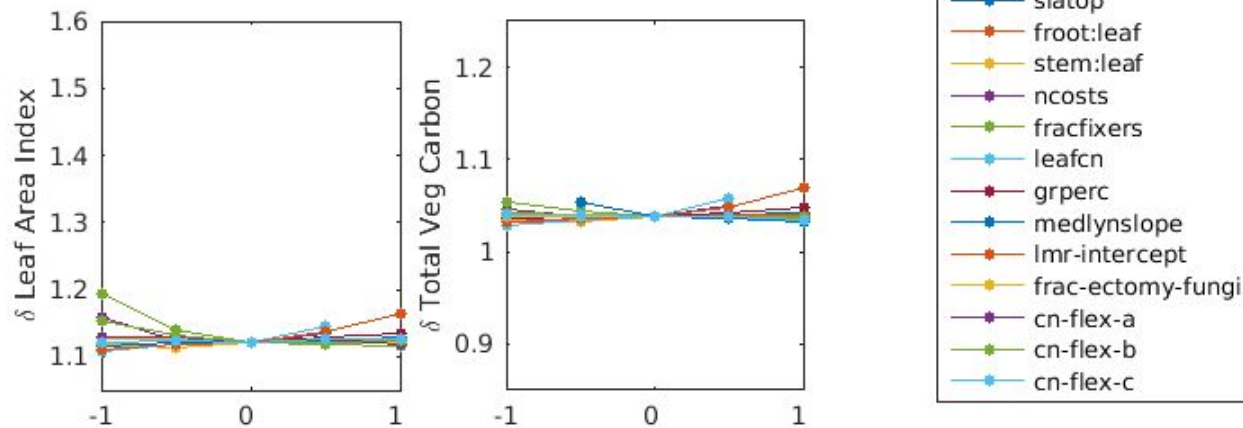
Need to re-run with realistic leaf area.

Nitrogen response: Higher leaf allocation

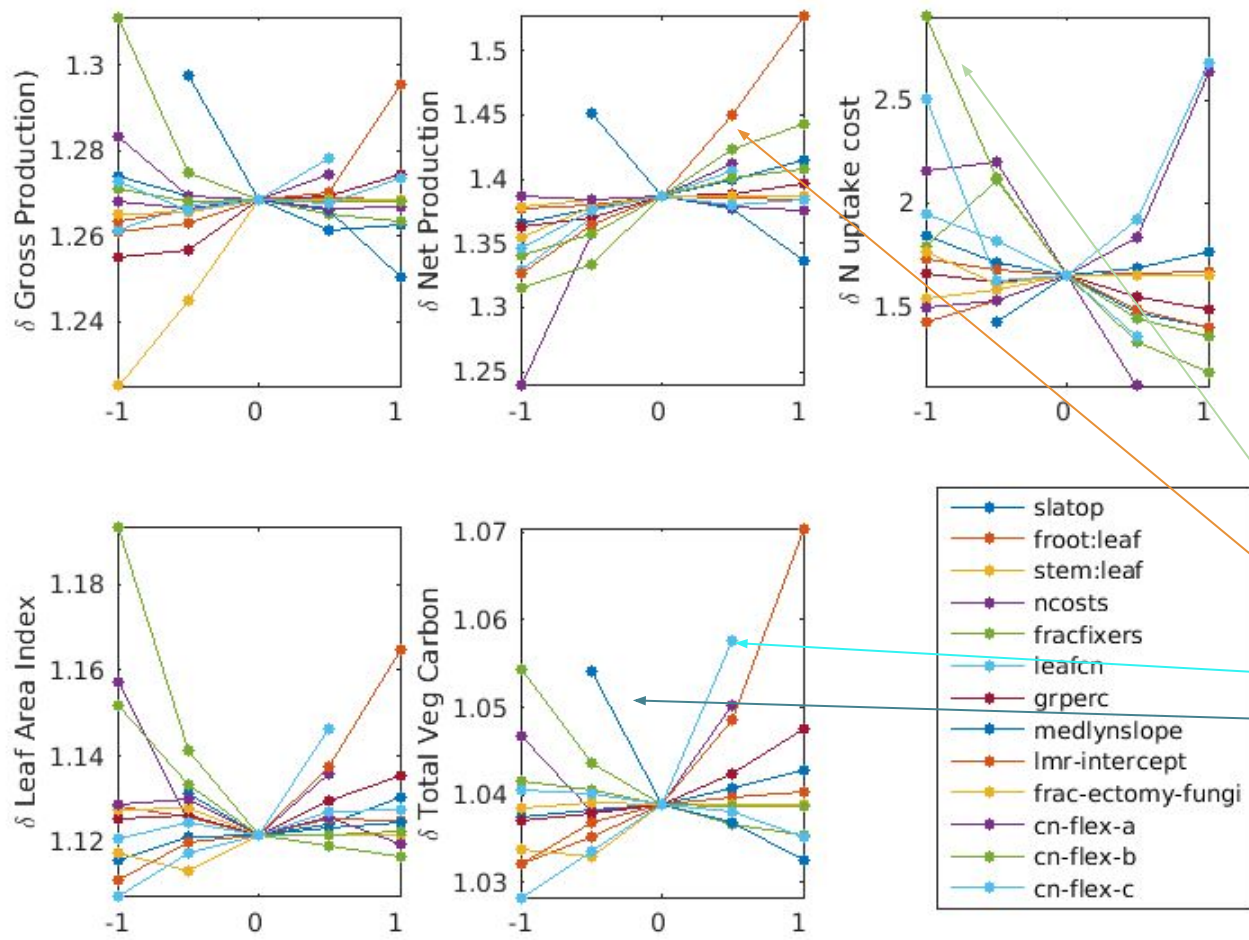


Closed canopy reduces

1. Sensitivity to NDEP
2. Sensitivity of model response to parameters.



Nitrogen response: Higher leaf allocation (bigger scale) year 4



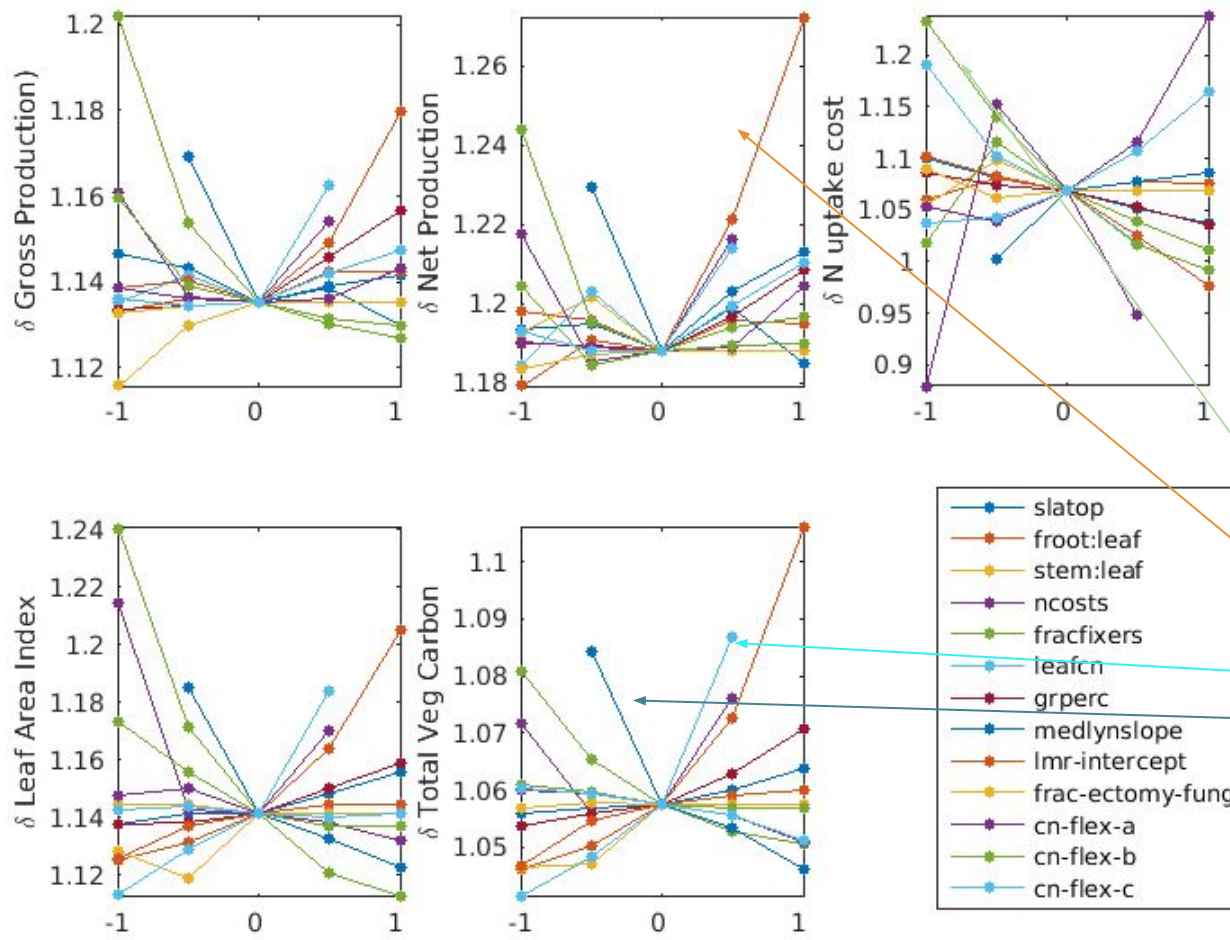
Closed canopy reduces

1. Sensitivity to NDEP
2. Sensitivity of model response to parameters.

Model parameters of greatest impact are:

- frac_fixers
- lmr_intercept
- leafcn
- medlyn_slope

Nitrogen response: Higher leaf allocation (bigger scale) year 8



Closed canopy reduces

1. Sensitivity to NDEP
2. Sensitivity of model response to parameters.

Model parameters of greatest impact are:

- frac_fixers
- lmr_intercept
- leafcfn
- medlyn_slope

Response changes through fertilization transient...

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“Something is subtly different in the photosynthesis scheme in CLM5”

“My favourite parameter ‘x’ has huge impacts on the global carbon cycle!”

TO BE CONTINUED...

1. Latin Hypercube ensemble to test full spread to most sensitive parameters.
2. Extend analysis to other ecosystems
3. Add other drivers (temperature, rainfall, humidity)
4. Linkages with biophysical parameter investigation (Katie Dagon)