

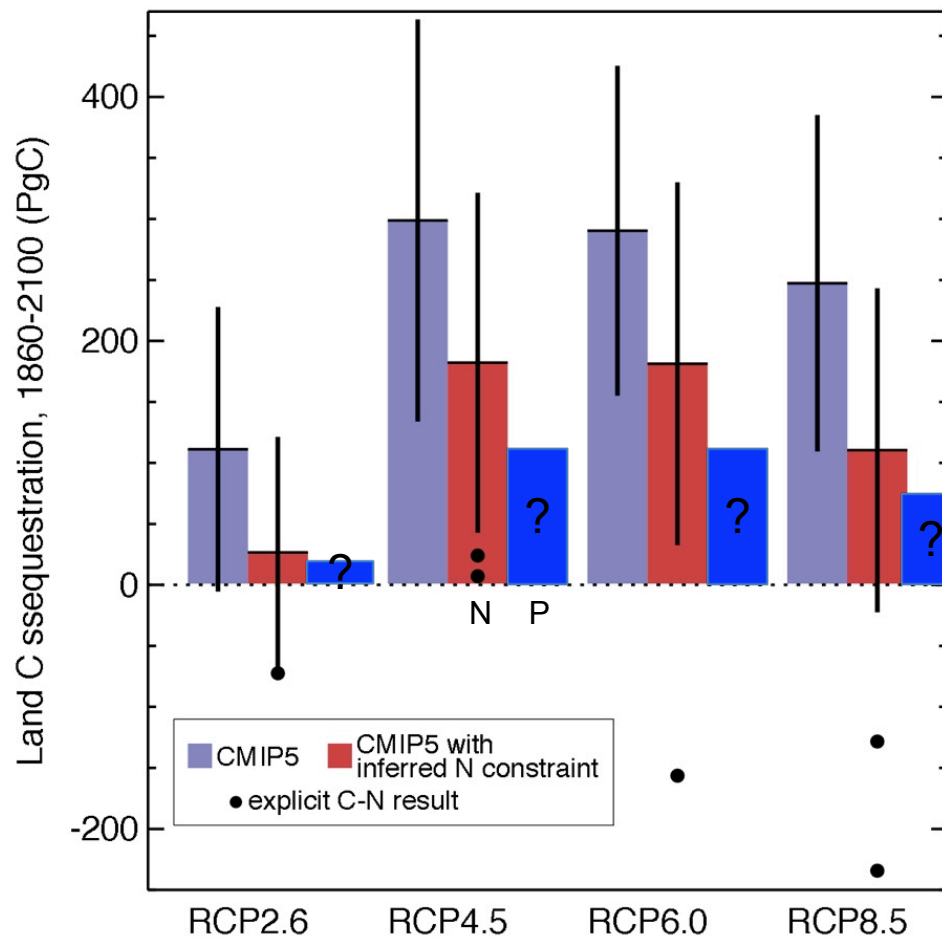
# Influence of phosphorus cycle coupling on land model response to changes in atmospheric CO<sub>2</sub> and climate

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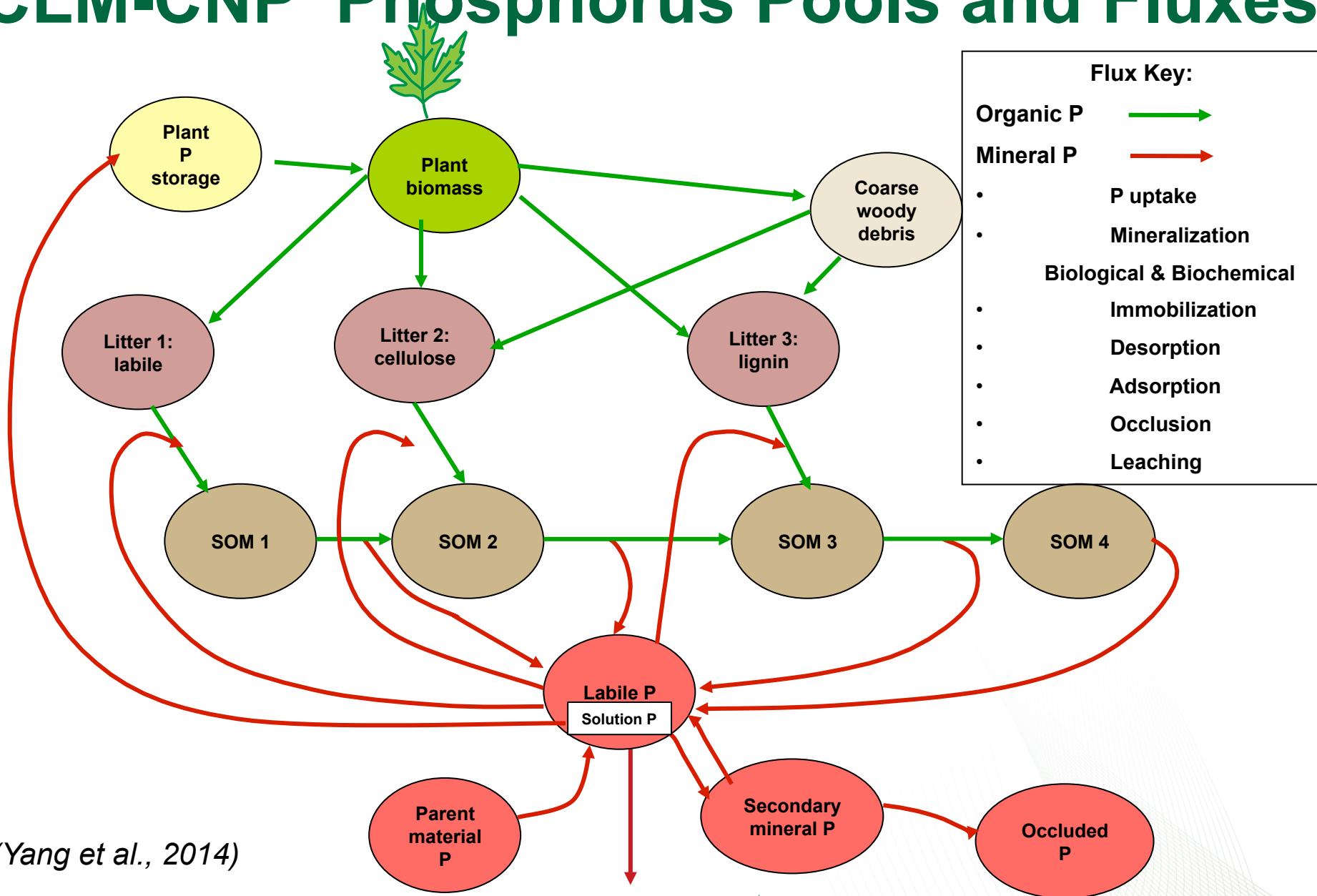


# Nutrient limitation will reduce the global land carbon storage projected by CMIP5 C-only models



(IPCC,2013)

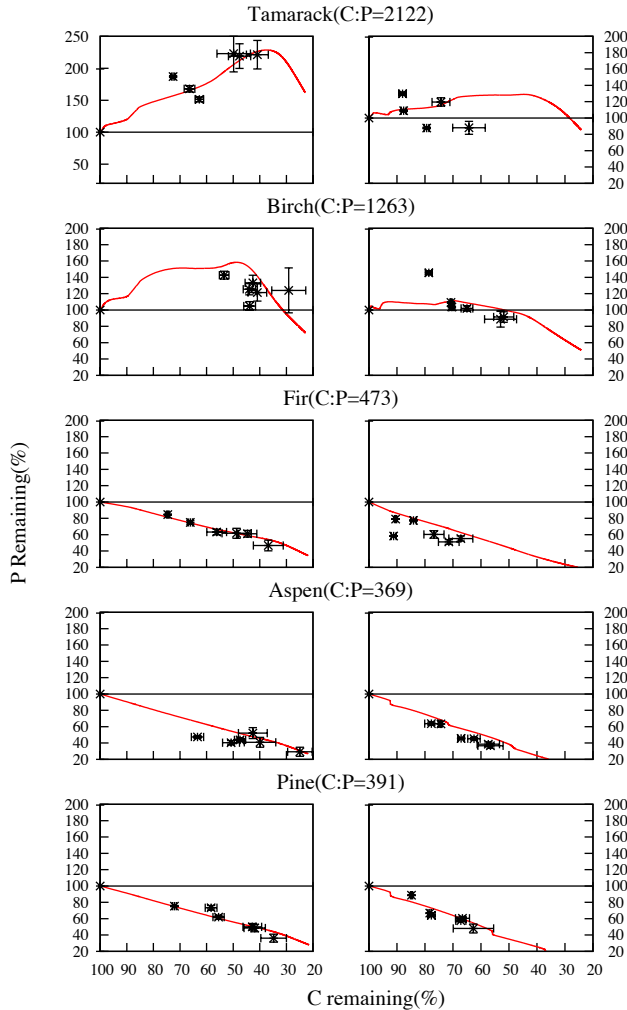
# CLM-CNP Phosphorus Pools and Fluxes



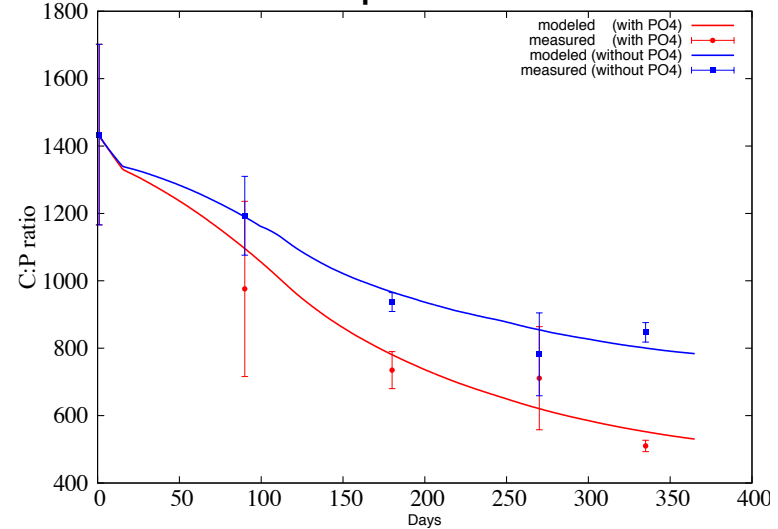
(Yang et al., 2014)

# Litter bag studies – evaluation of P dynamics during decomposition

## Two CIDET sites



## P fertilized plot in Brazil



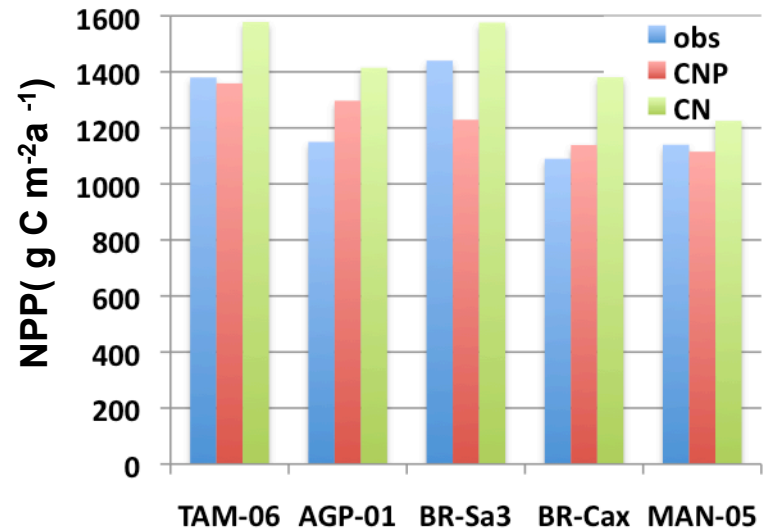
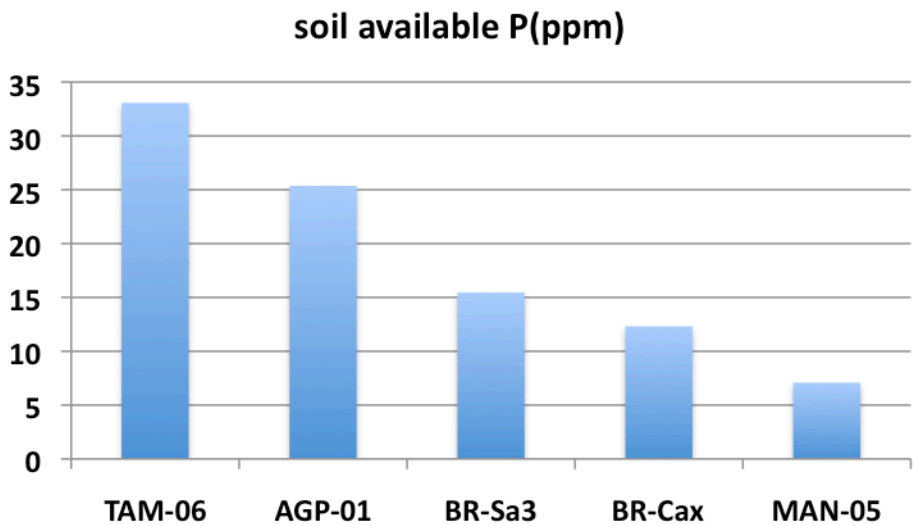
### Biochemical mineralization

- With PO4: off
- Without PO4: on

- Stoichiometric relationship can explain P dynamics during decomposition when there is adequate available P in soils.
- P cycle can be decoupled from C and N during decomposition when soil available P is in short supply, due to biochemical mineralization of organic P
- Measurement data from McGroddy et al. (2004)



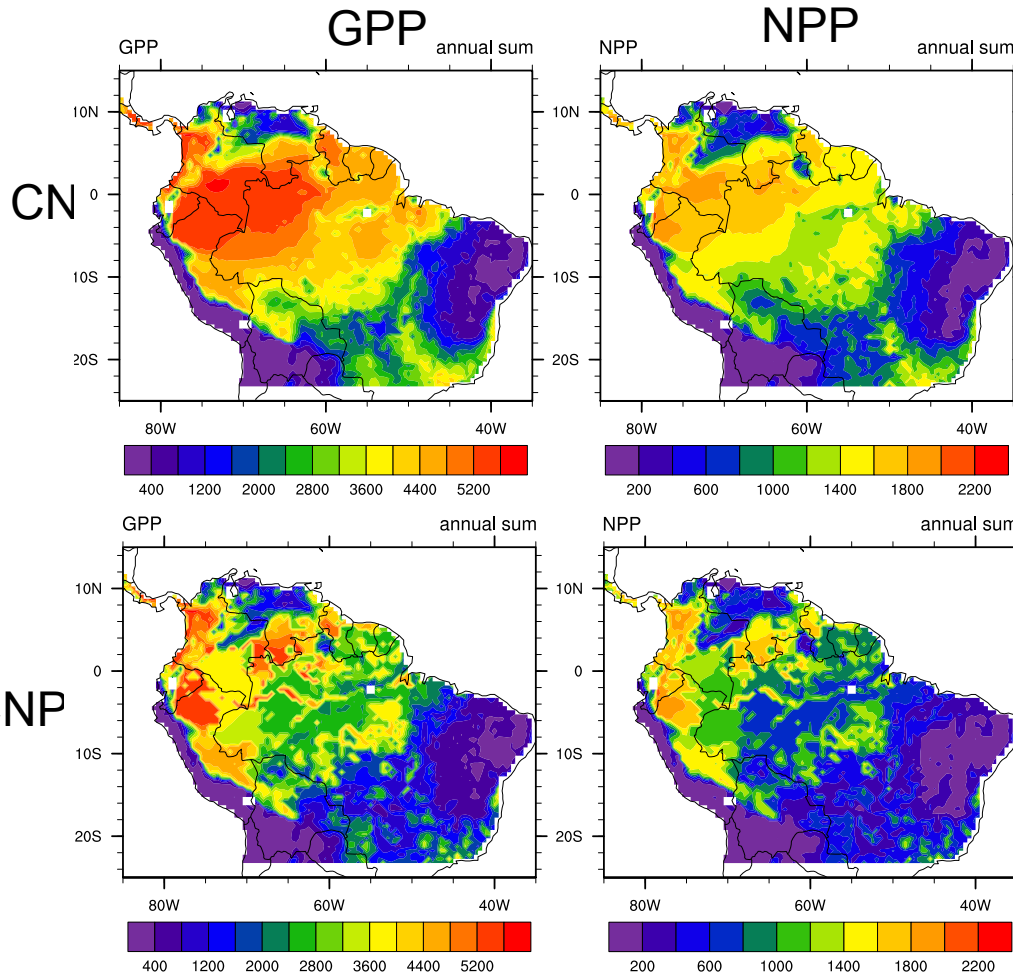
# Introduction of P limitation improved model simulated NPP in tropical forests



- Observations show that NPP tends to decrease with decreasing soil P availability
- Model simulations using CNP model capture the overall trend in NPP along the P availability gradient
- Site characteristics and land use history need to be considered to explain the discrepancy between models results and observations

(Yang et al., 2014)

# Mean annual simulated fluxes for the period 2000-2009



(Unit:  $\text{g C m}^{-2} \text{a}^{-1}$ )

- Improved heterogeneity of simulated GPP & NPP in CNP model.
- NPP decreases from west to east across the Amazon basin following the gradient of total soil P.
- Spatial pattern of NPP consistent with field observations (Quesada et al., 2012; Aragão et al., 2011; Malhi et al., 2004).
- Comparison with satellite products in progress.

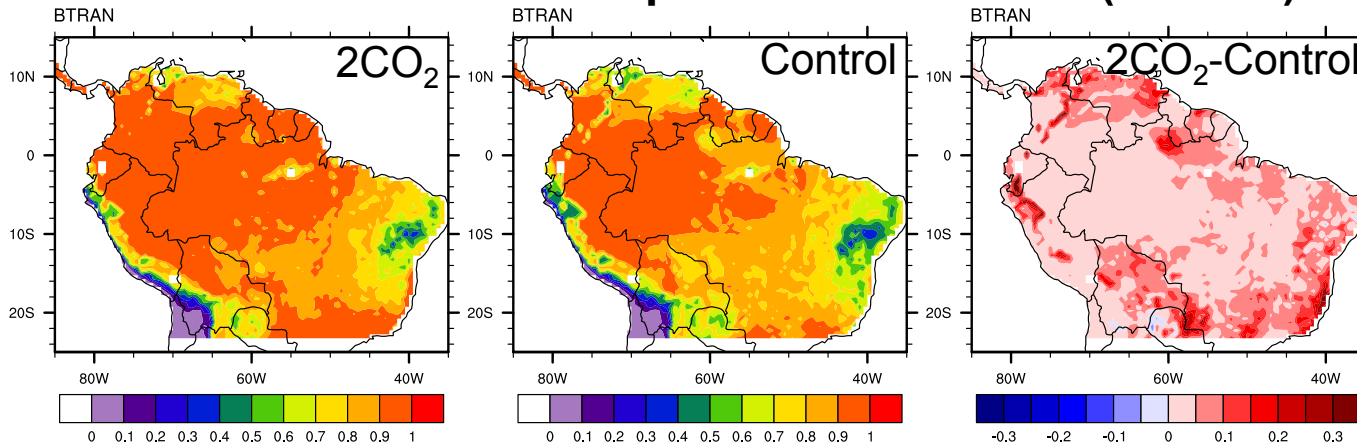
(Yang et al., 2015, in revision)

# Exploratory model experiments

- Question: how does nutrient cycling interact with increasing [CO<sub>2</sub>] and warming to affect future C uptake in the Amazon region?
- Three exploratory simulations (2010-2050)
  - #1 : 2CO<sub>2</sub>
  - #2 : +4 °C
  - #3 : +4 °C and constant RH

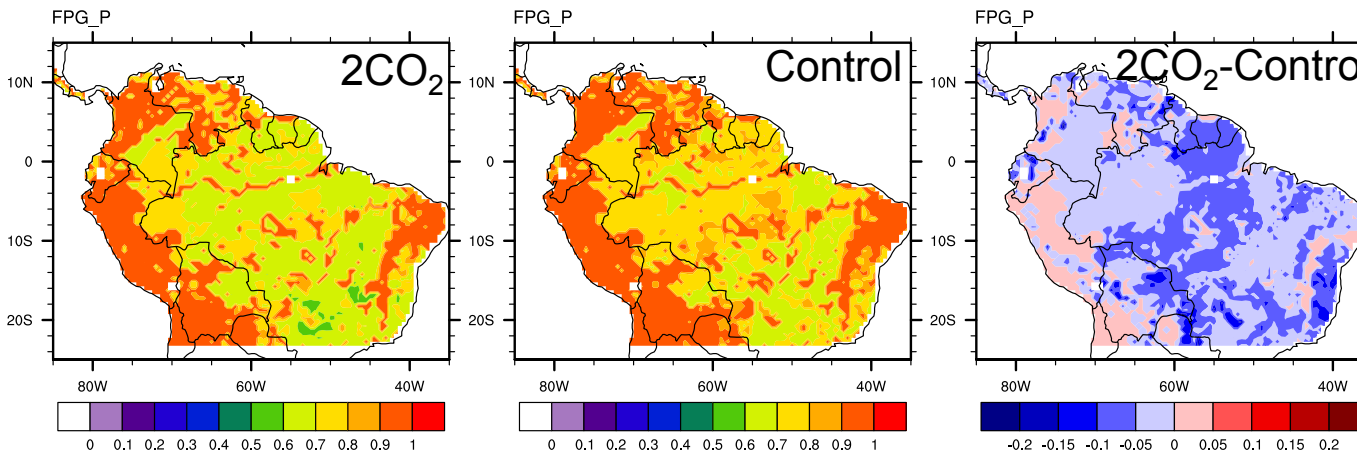
# 2CO<sub>2</sub>

## Annual Means of Transpiration Beta Factor(BTRAN)



- Elevated CO<sub>2</sub> increases WUE and reduces water stress, especially in drier areas.

## P limitation factor



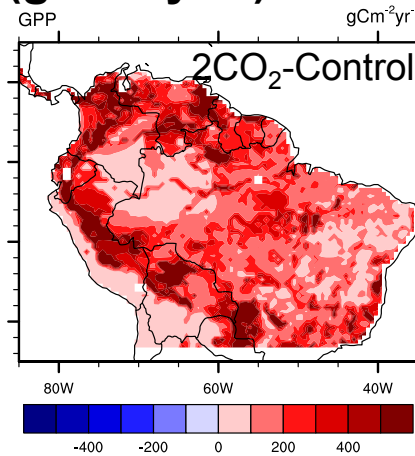
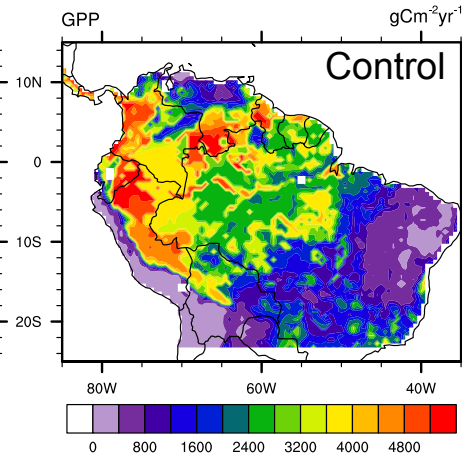
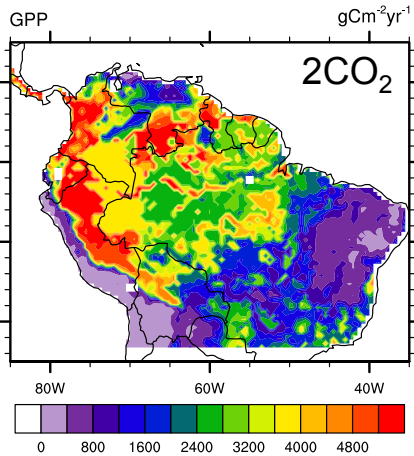
- Phosphorus becomes more limiting under elevated CO<sub>2</sub> condition.

(Yang et al., 2015, in revision)



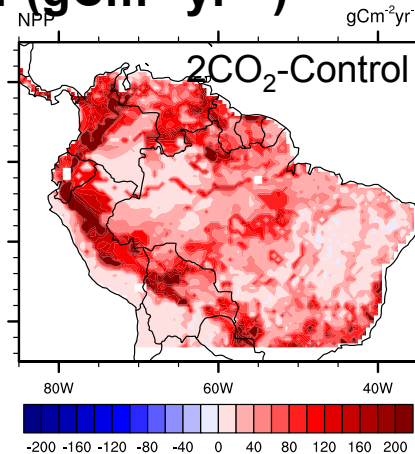
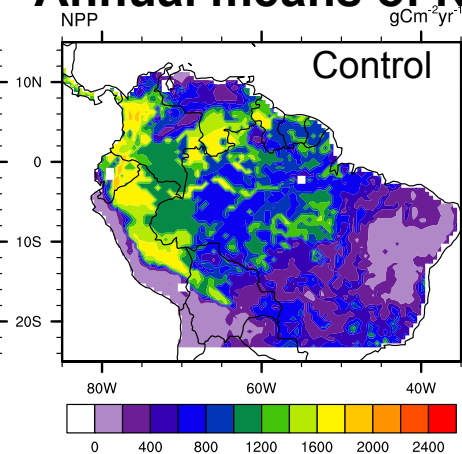
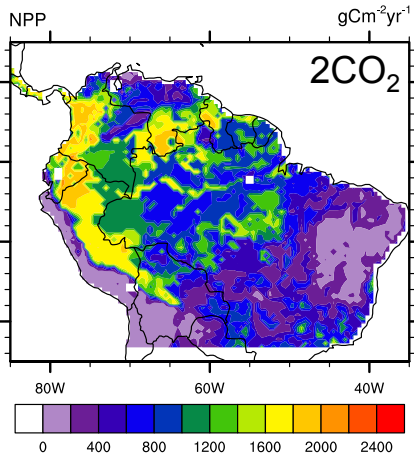
# 2CO<sub>2</sub>

## Annual means of GPP(gCm<sup>-2</sup>yr<sup>-1</sup>)



- Productivity is enhanced with elevated CO<sub>2</sub>, especially in drier regions because of improved WUE.

## Annual means of NPP(gCm<sup>-2</sup>yr<sup>-1</sup>)

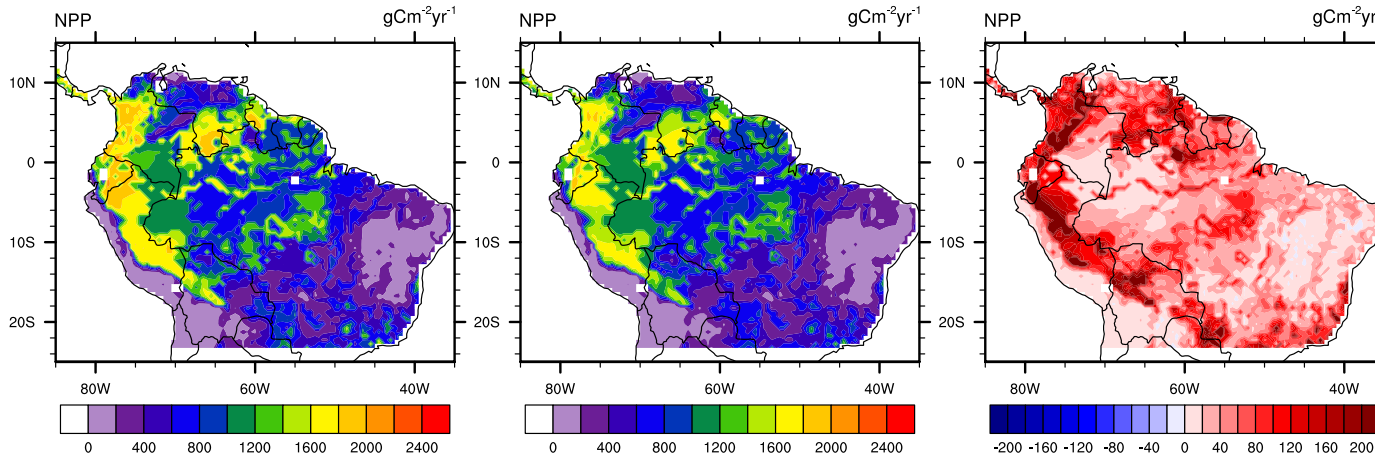


- CO<sub>2</sub> fertilization effect is constrained by P availability in lowland tropical forests on highly weathered soils.

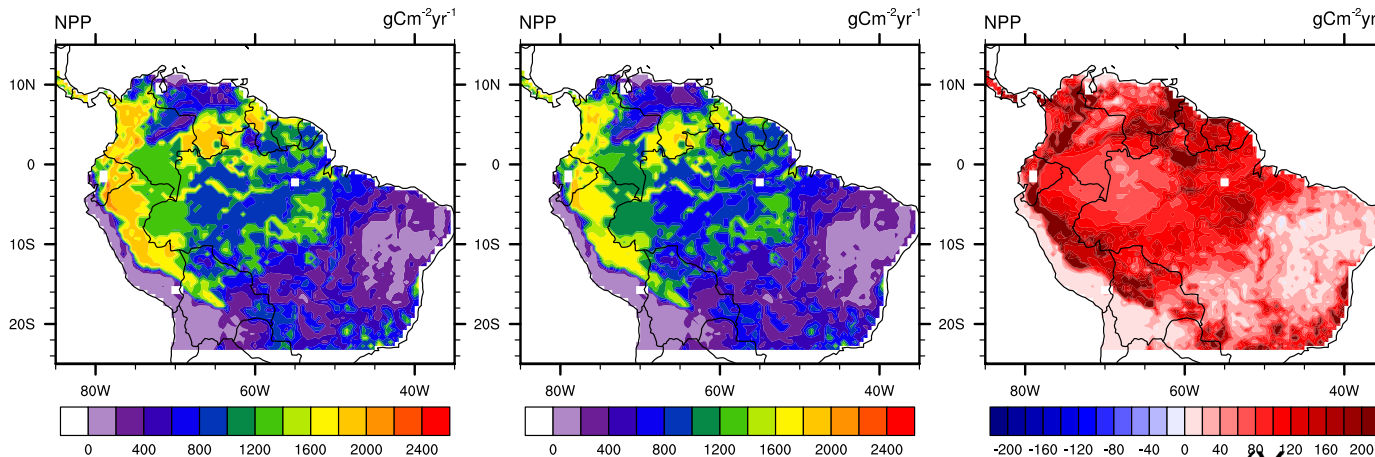
(Yang et al., 2015, in revision)

# Enhanced phosphatase activity under elevated CO<sub>2</sub> could alleviate P limitation

NPP(Default model parameters for phosphatase activity)



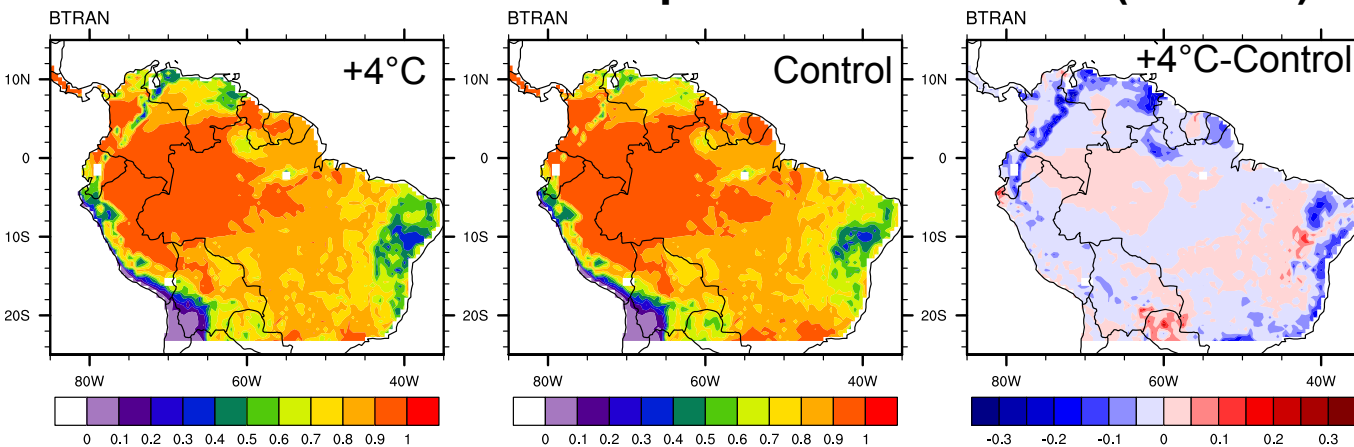
NPP(Enhanced phosphatase activity)



(Yang et al., 2015, in revision)

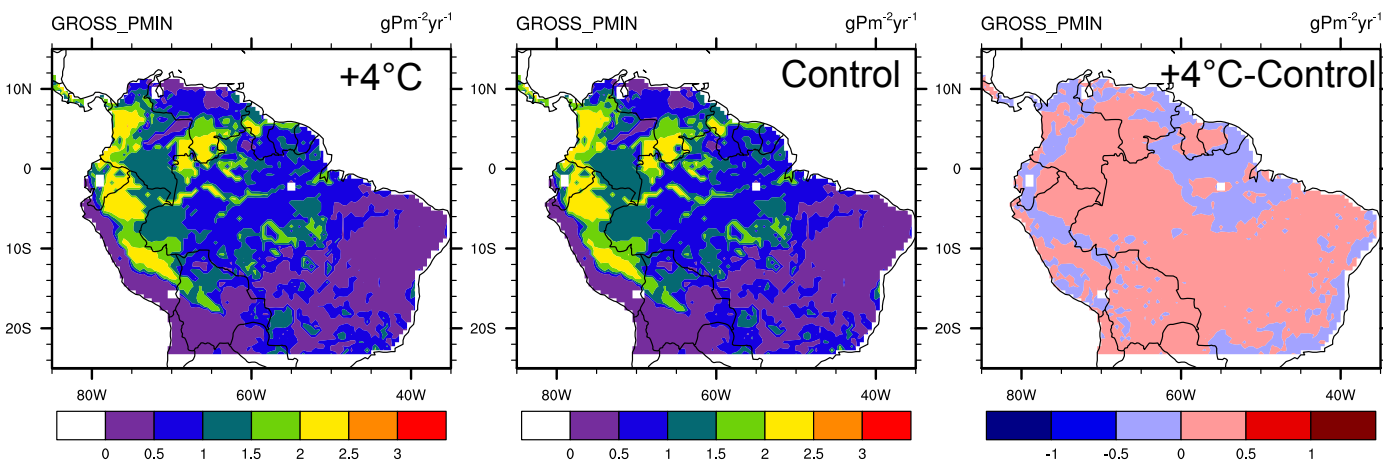
# Warming(+4°C)

## Annual Means of Transpiration Beta Factor(BTRAN)



- Higher temperature leads to deepening of dry season water stress.

## Annual Means of P mineralization( $\text{gPm}^{-2}\text{yr}^{-1}$ )

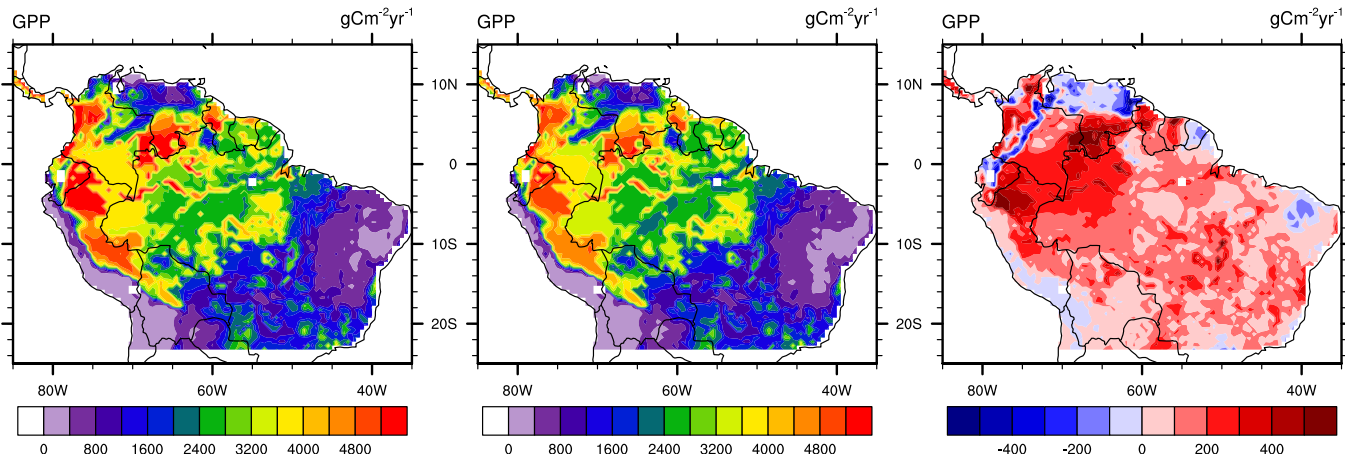


- Warming leads to increased nutrient mineralization.

(Yang et al., 2015, in revision)

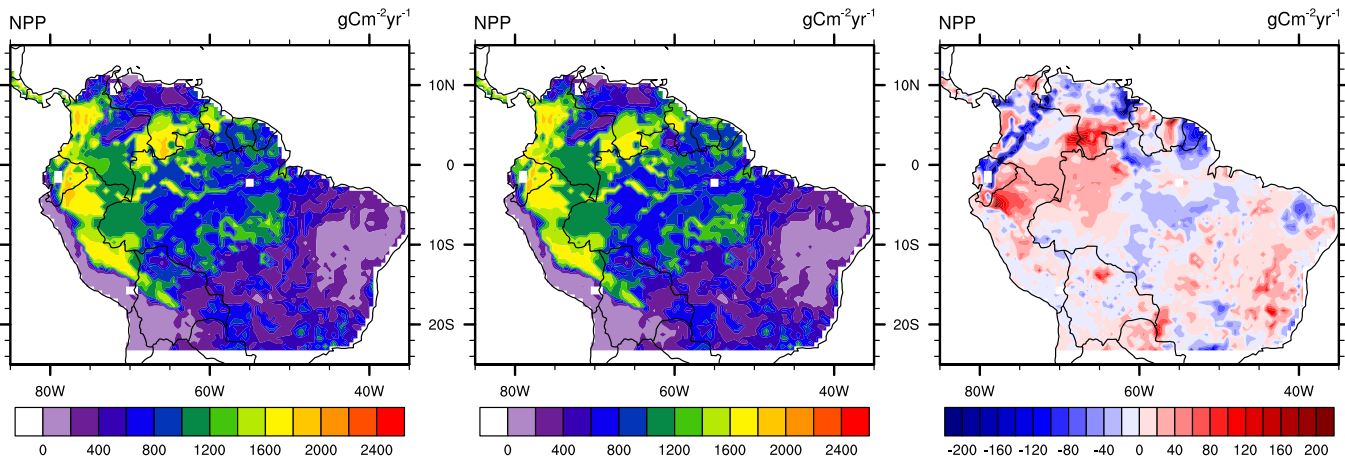
# Warming(+4°C)

## Annual means of GPP(gCm<sup>-2</sup>yr<sup>-1</sup>)



- Wet season GPP is increased due to enhanced nutrient mineralization.

## Annual means of NPP(gCm<sup>-2</sup>yr<sup>-1</sup>)

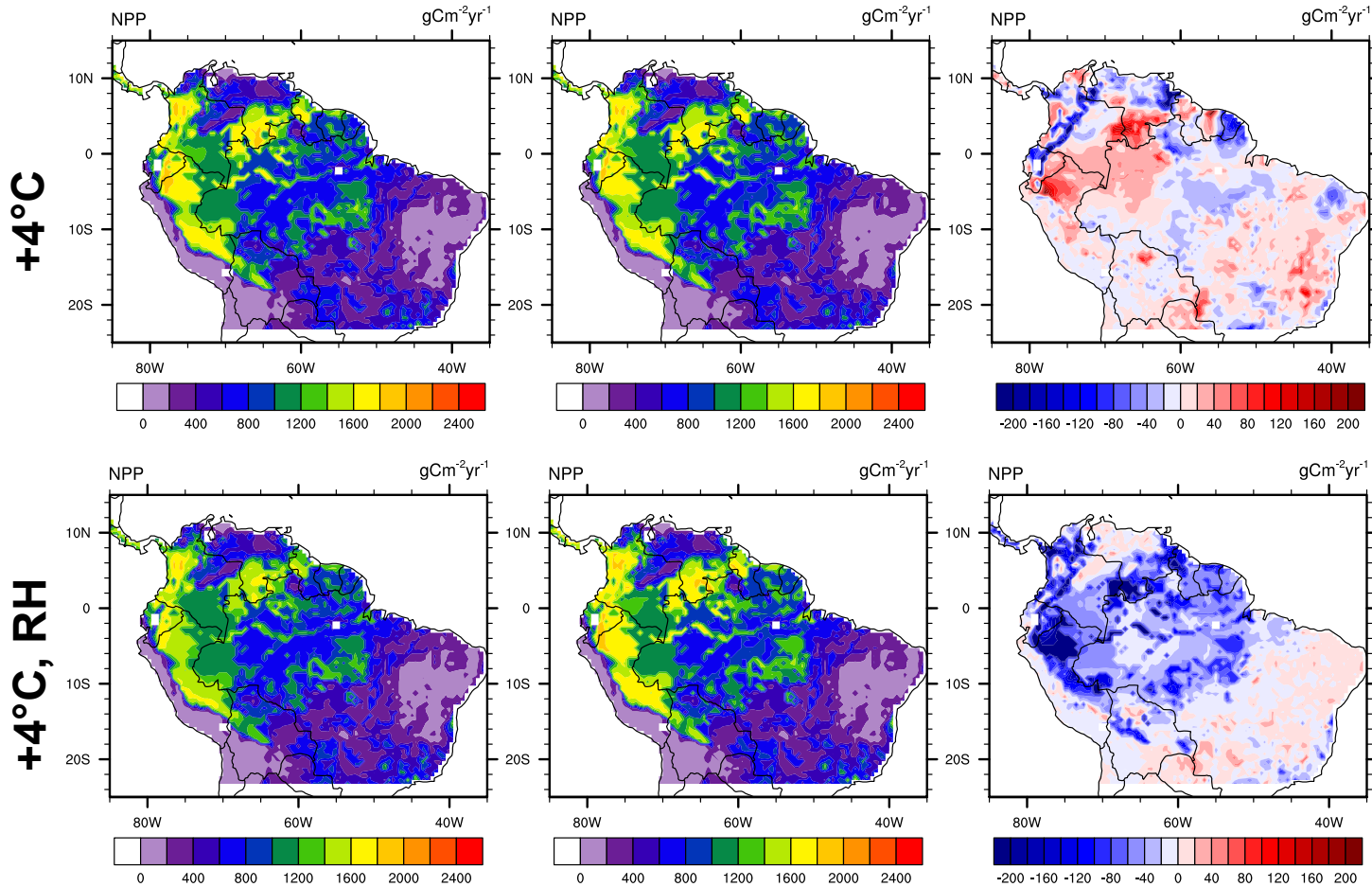


- Autotrophic respiration response to warming greatly limits NPP response.

(Yang et al., 2015, in revision)

# The effect of maintaining constant RH

## NPP



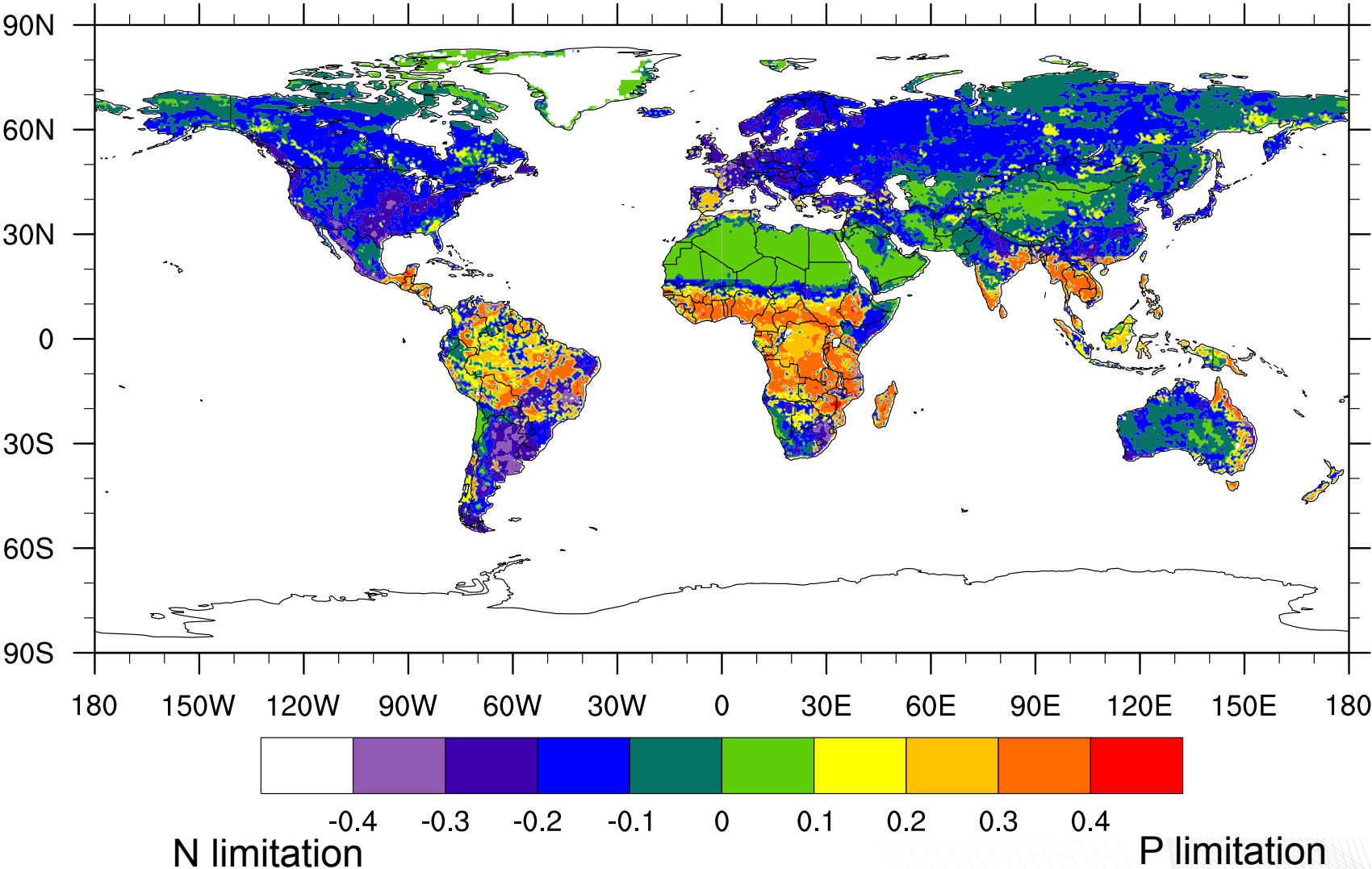
(Yang et al., 2015, in revision)

# Global Simulations

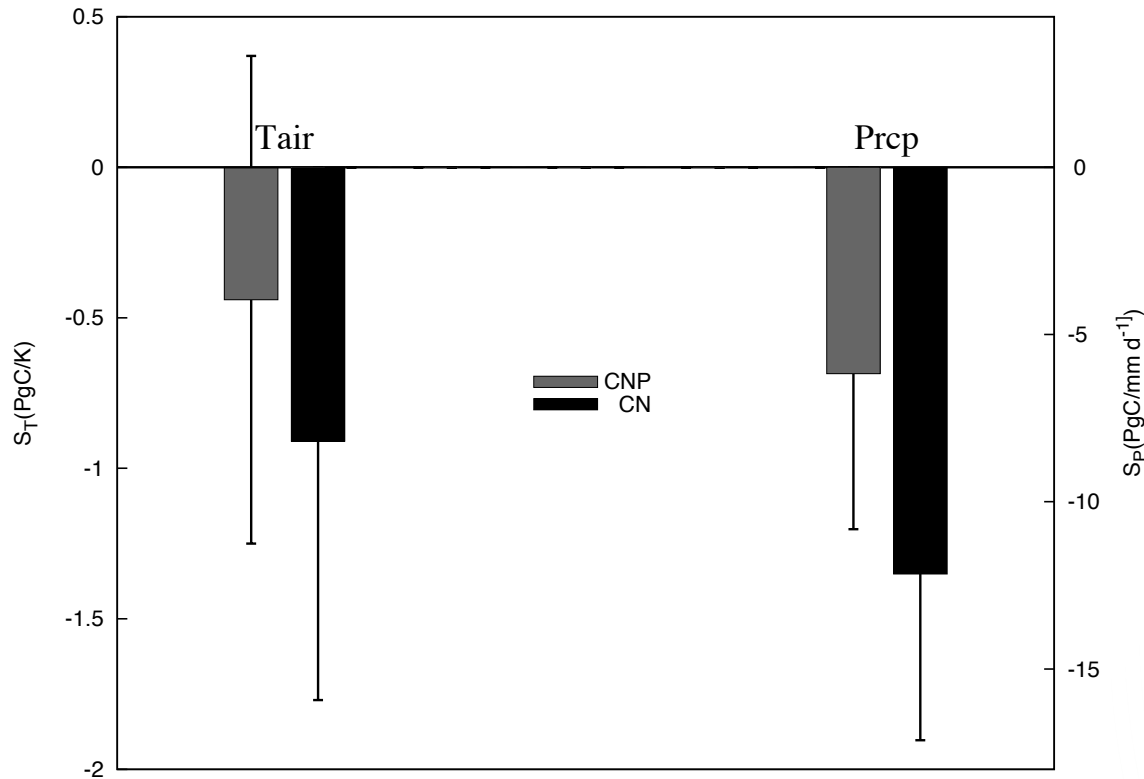
- CLM4-CNP and CLM4-CN
- 0.5-by-0.5 degree
- Offline mode
- Steady-state simulations (Pre-industrial spinup)
- Transient simulations
  - CRU-NCEP reanalysis fields 1901-2009
  - historical [CO<sub>2</sub>]



# Distribution of N vs. P limitation



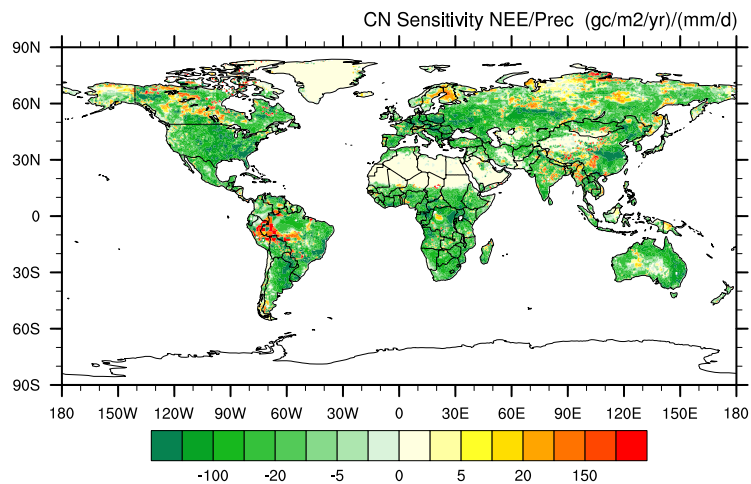
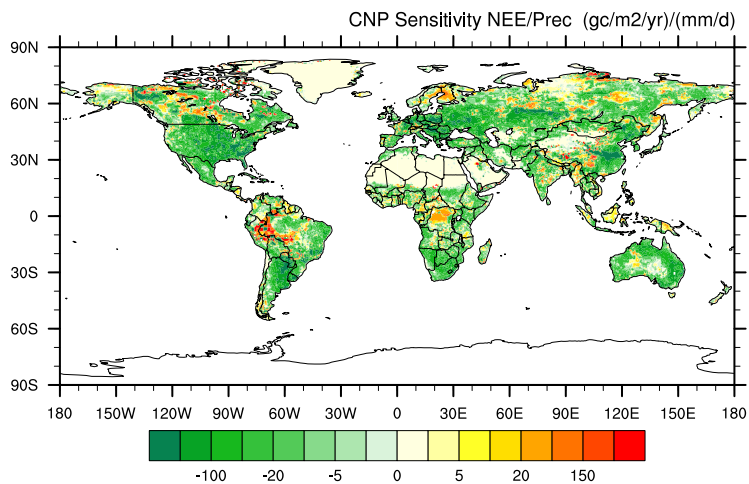
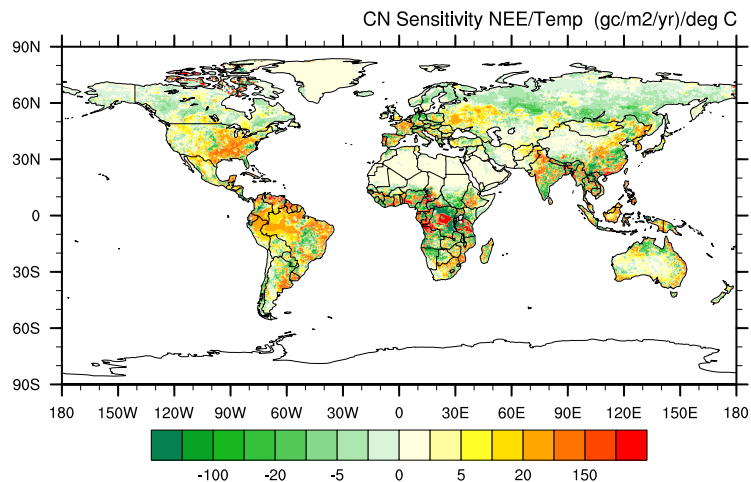
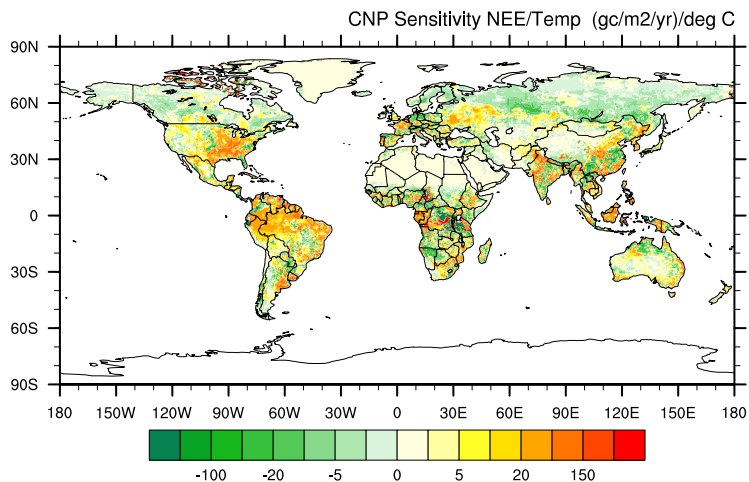
# Phosphorus cycle dynamics reduce the sensitivity of global NEE to variations in temperature and precipitation



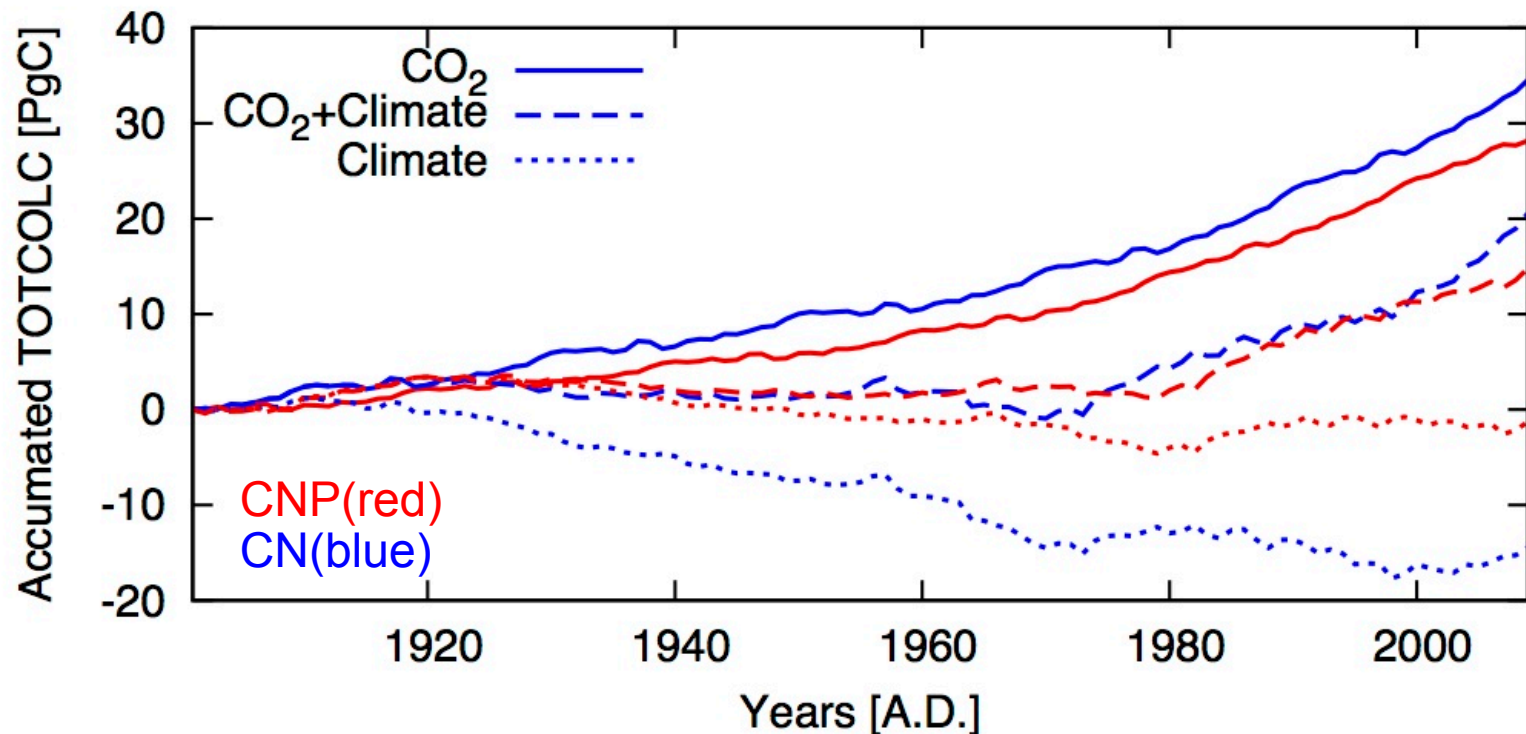
- Global integrated NEE against variations in global mean temperature and precipitation, assessed using multiple least-squares regression, following the methodology of Thornton et al. (2007)
- In particular, CN model shows significant negative relationship between NEE and precipitation, but slope is reduced for CNP model



# NEE sensitivity to variations in temperature and precipitation (CLM-CNP vs. CLM-CN)



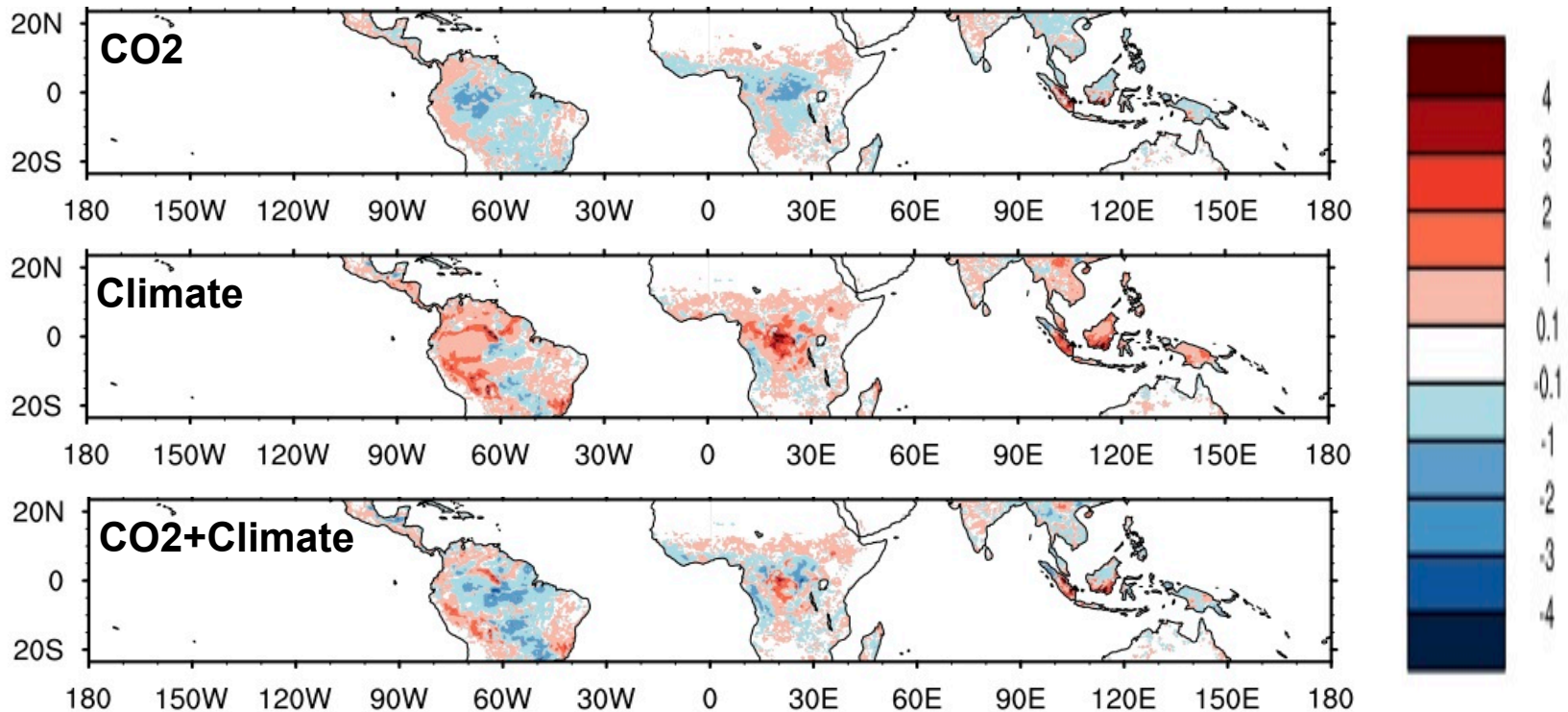
# The role of phosphorus in tropical ecosystem responses to changes in [CO<sub>2</sub>] and climate



- P limitation leads to a reduced CO<sub>2</sub> fertilization effect
- Carbon release associated with historical climate change is reduced with P coupling, as warming induced mineralization may lead to indirect fertilization effect in P-limited ecosystems

# The role of phosphorus in tropical ecosystem responses to changes in [CO<sub>2</sub>] and climate

**CNP - CN**



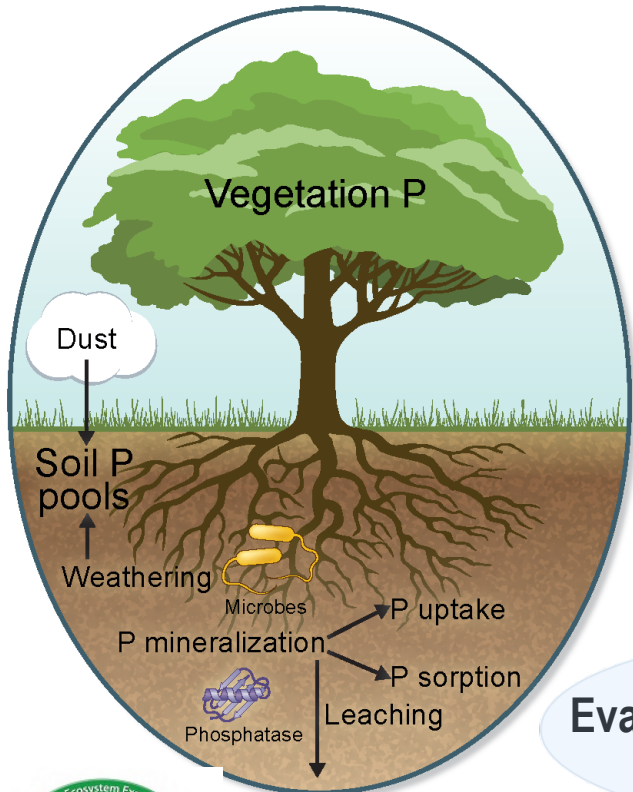
# Summary

- The introduction of P cycling and limitation improved model simulated NPP at site-level and heterogeneity of simulated GPP & NPP across the Amazon region, relative to the original CLM-CN model.
- Introduction of P coupling leads to a smaller CO<sub>2</sub> fertilization effect and warming-induced CO<sub>2</sub> release from tropical ecosystems
- P cycle dynamics tend to reduce the sensitivity of NEE to inter-annual variation in temperature and precipitation

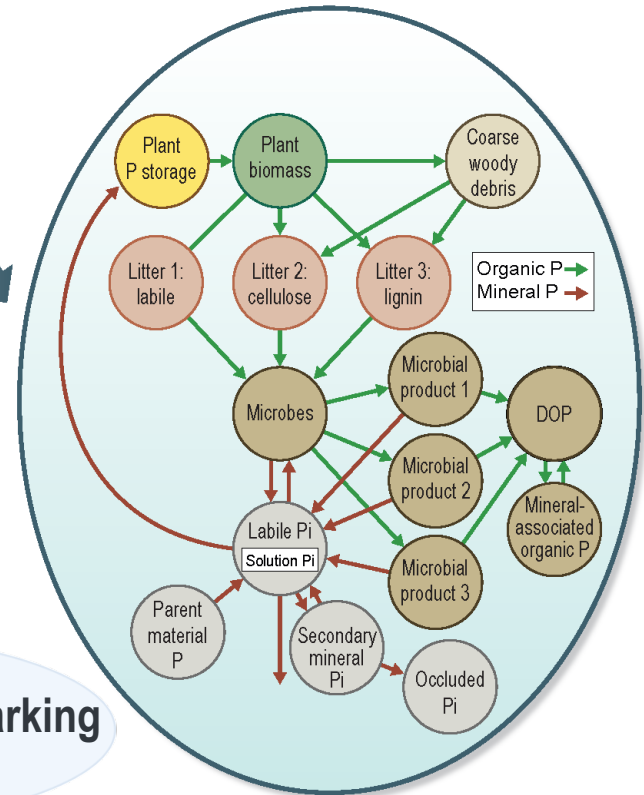


# Path forward

Observations of P



Modeling of P

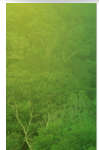


Concept development  
Parameter estimation  
Model initialization

**Model-data integration**

(Re)formulation of concept  
Model evaluation  
Hypothesis testing  
and scaling

**Evaluation and Benchmarking**



(Reed, Yang and Thornton, 2015)