



All Team PINEMAP meeting

April 21, 2016



Upcoming dates

- Executive committee meeting 4/22 10:30am ET
- Modeling summits 4/25 3pm ET
- Annual meeting in Athens: Tuesday 5/24 am –
Thursday 5/26 lunchtime



Meeting deadlines

- Meeting May 24-26 (Tuesday am – Thursday lunchtime)
- Annual meeting registration deadline has passed (extenuating circumstances? Please email Grace ASAP)
- Poster registration through 5/15. Link on intranet landing page
- Hotel block drops 4/25! Fewer rooms reserved for 5/25, so please reserve early if possible



Final meeting preparation

- If you are a 1st or 2nd order integrative paper author, come prepared to participate in:
 - Presentations of the 1st set of integrative papers,
 - Workshop sessions to develop 2nd level integrative papers
- Questions? Contact Grace or Tim

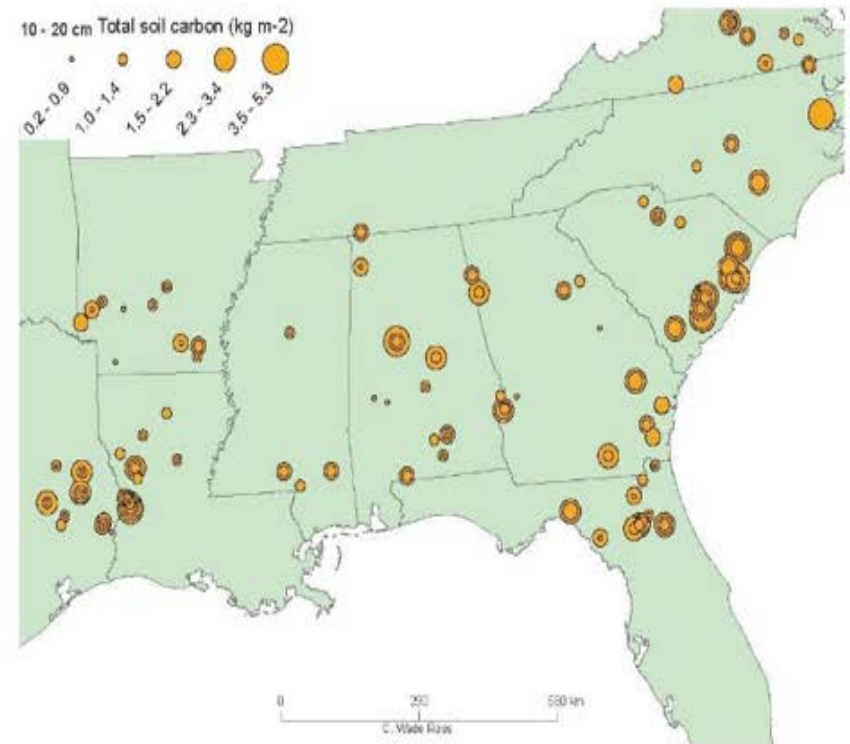
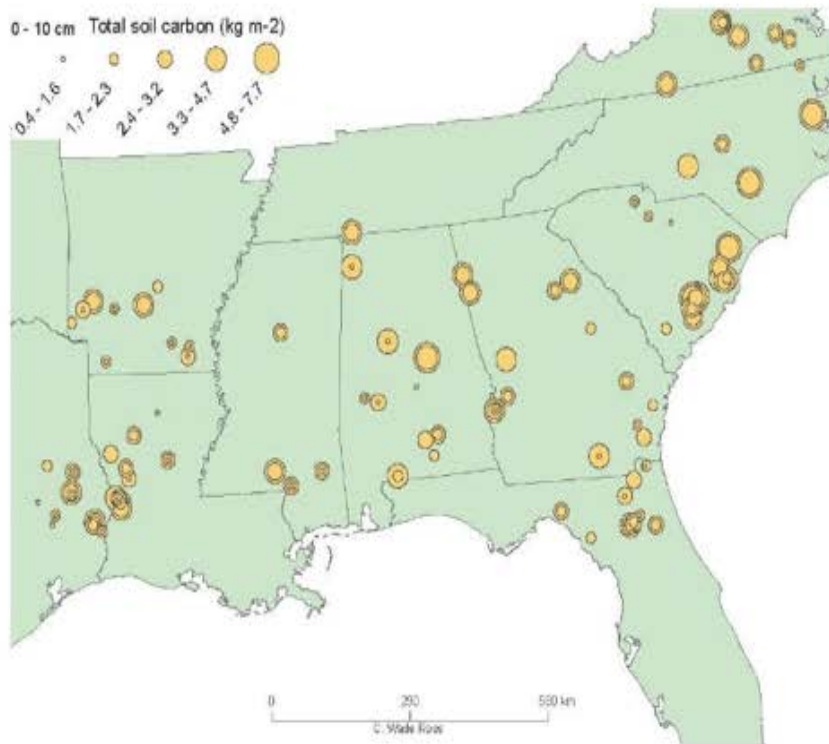


Overview of Tier II data and analysis

Jason G. Vogel with contributions from many, many others

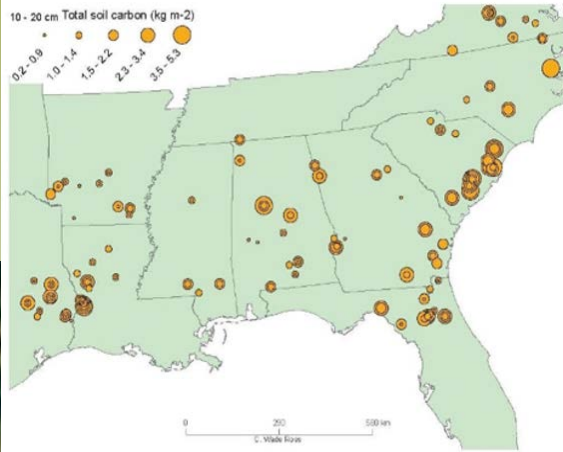


Tier II site distribution and Soil Carbon





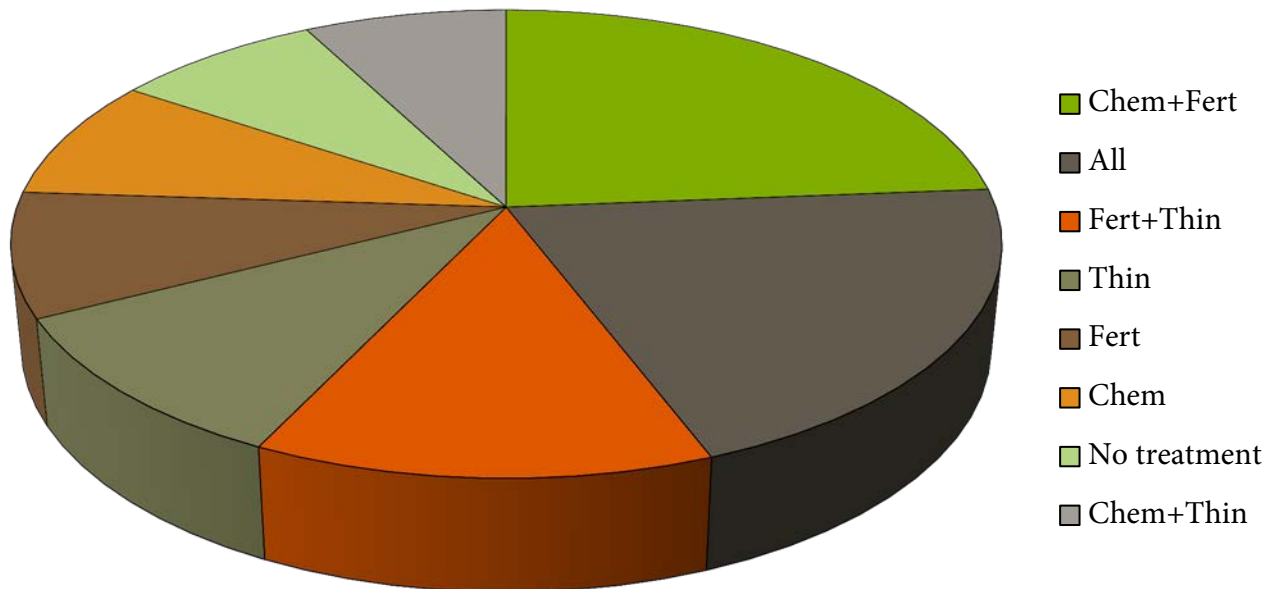
One replicate plot per treatment type





Silvicultural Treatments in Network

Silvicultural treatments among 332 treatment combinations: Chemical competition control, Thinning, Fertilization





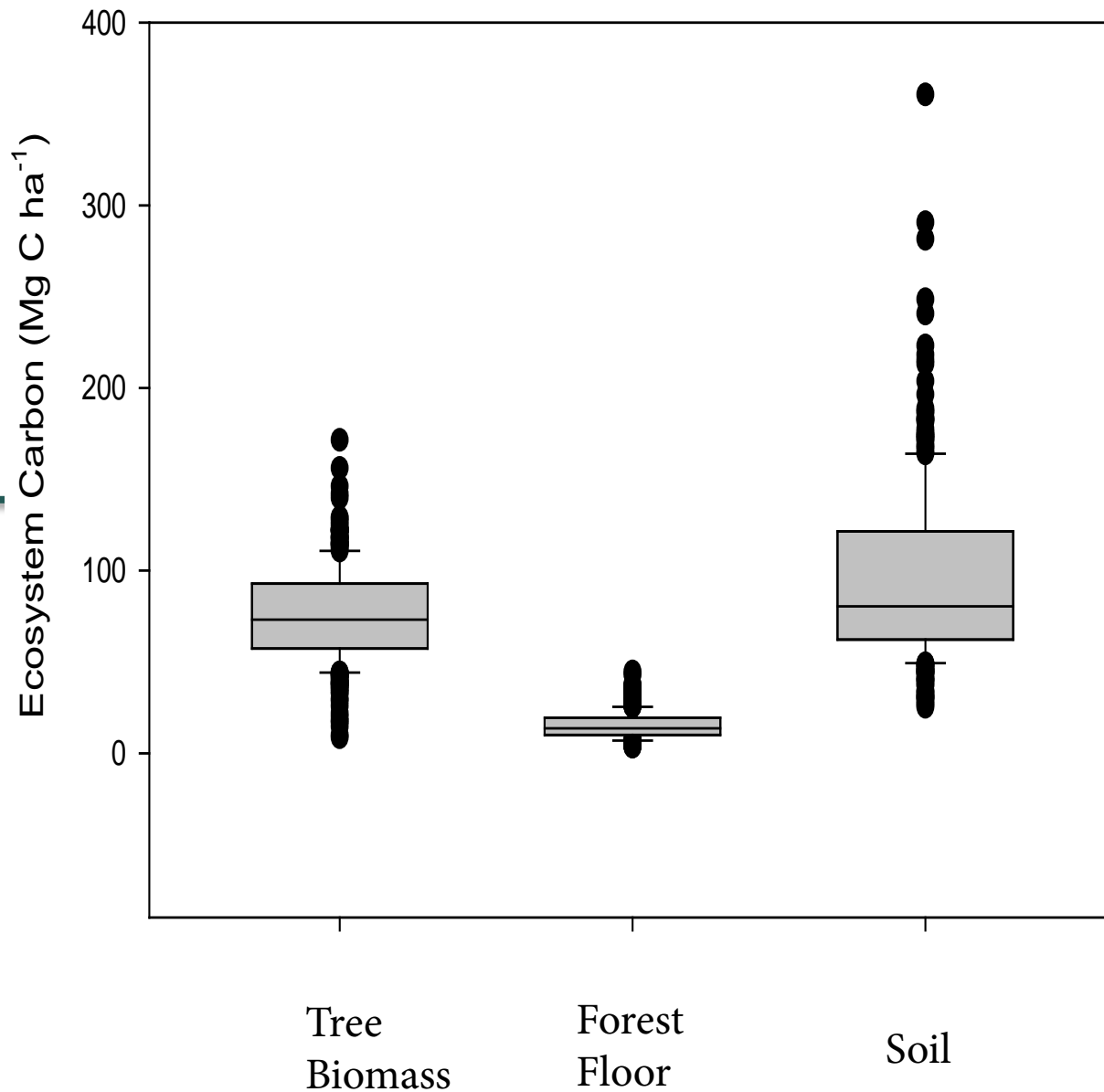
Data Summary

	Mean	Median	Range
Stand Density Index	744	757	0-1283
Age (years)	16	17	4-29
Tree biomass C	76	73	9-171
Forest Floor C (Mg C ha ⁻¹)	15	14	2-41
Understory C (Mg C ha ⁻¹)	0.73	0.43	0-18.3



Fertilizer Treatment Breakdown

Fertilization type (kg ha ⁻¹)	Mean	Median	Max	No. of Treatments	Treatment (%)
N	277	200	1492	206	62
P	51	28	198	207	63
K	18	<1	183	69	21
B	0.58	<1	86	55	17
Ca	4	<1	106	27	8
S	4	<1	165	16	5
Mg	2	<1	4	14	4
Cu	0.20	<1	11	13	4
Mn	0.63	<1	55	11	3
Zn	0.09	<1	3.9	9	3
Fe	0.90	<1	38	8	2



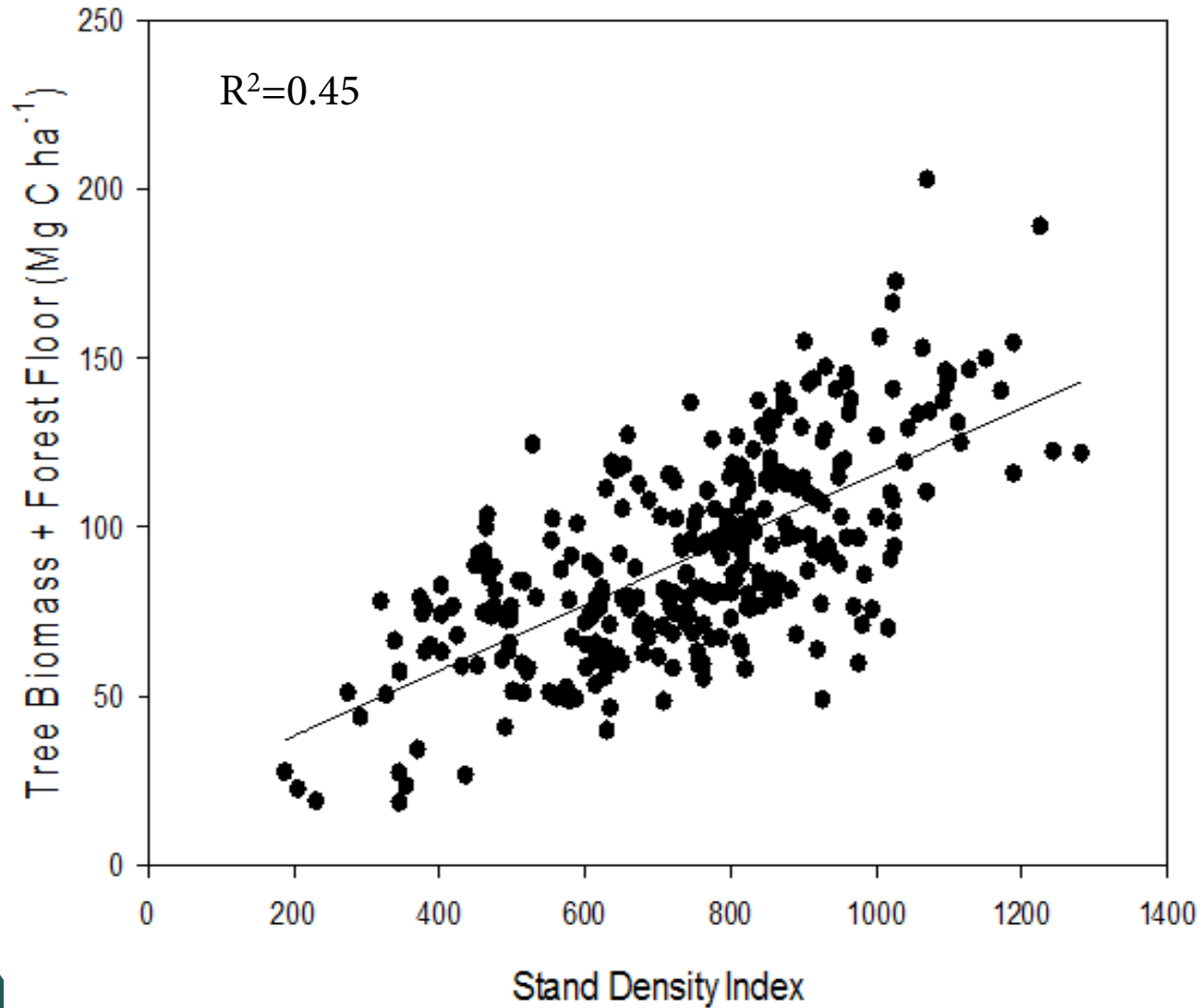


Dependent variables

- Tree Biomass Increment
- $(\text{Aboveground biomass} + \text{Coarse Roots}) / \text{Stand age}$
- $\text{Forest C increment} = (\text{Tree Biomass} + \text{Forest Floor} + \text{Understory} + \text{Fine Roots} (<2 \text{ mm}) + \text{Coarse Woody Debris}) / \text{Stand Age}$



Stand Density Index vs. Tree Biomass + Forest Floor Carbon





Analysis Approach

$$Y = a_0 + SO \times SDC \times TN \times TP + SDI \times Th \times UB \times SA + Pcp \times Temp \times rH + \epsilon$$

Managed Nutrition ($SO \times SDC \times TN \times TP$)

Soil Order=Order (class variable)

Soil Drainage Class=SDC (class variable)

1=Very Well drained

2=Moderately Well drained

3=Somewhat poor to Very Poorly

Total Nitrogen Added=TN

Total Phosphorus Added=TP

Managed Vegetation ($SDI \times Th \times UB \times SA$)

Understory Biomass=UB

Thinning=T (1,0) (class variable)

Stand Density Index=SDI

Stand Age=SA (removed if looking at increment)

Unmanaged Site Characteristics

($Pcp \times Temp \times rH$)

Precipitation=Pcp

Max. Temperature=Temp

Min. Relative humidity=rH



Analysis approach

- GLMselect procedure in SAS v.9.1
 - General linear model selection
 - Classification variables (soil order, drainage class) are split and enter model independently of others within a group
 - Creates model from training data and then splits this main data and cross validates parameter estimates with subset of data.
- Examined multicollinearity using variable inflation factor
- Graphing of relationships, correlation analyses, influential points



Variables dropped because.....

High collinearity as indexed with variable inflation factor (VIF) or low explanatory power.....

- Average Solar Radiation
- Average specific humidity and relative humidity maximum
- Minimum average temperature
- Treatments with $N > 1250 \text{ kg ha}^{-1}$. This is about 12 plots and reduces the VIF for N to less than 5.



Variables dropped because

Of incomplete information...

- Chemical control (understory biomass used as a stand in)
- Site preparation information

....too many possibilities (this needs more work)

- Timing of nutrient application (just cumulative amounts for N and P)

....Poor data coverage

- Infrequent elements (e.g. B, K, Ca, micronutrients)



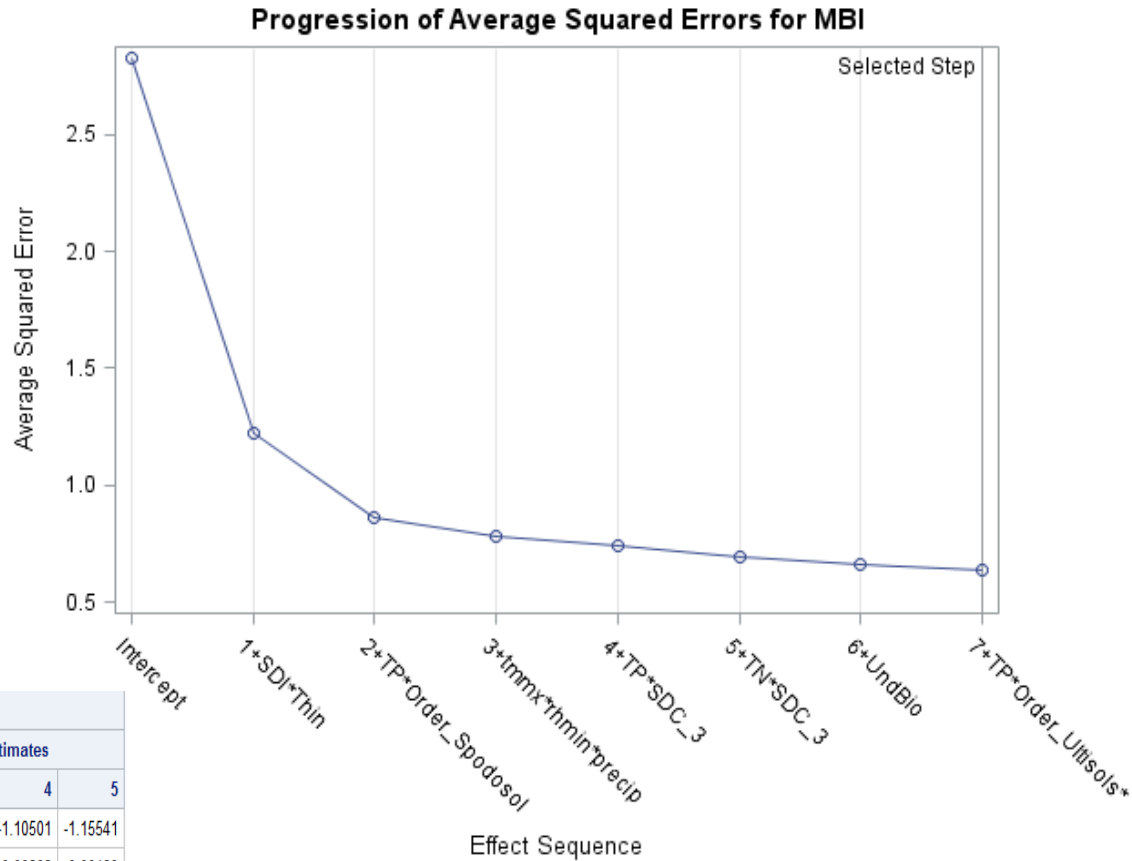
Nitrogen and Phosphorus

- 63% of treatments had N and P added.
- 8 treatments had only P and 1 treatment only N
- There are no comparisons for N and P only treatments
- Correlation between N and P application ($r=0.80$, $p<0.01$)



Stand biomass increment

Root MSE	0.81058
Dependent Mean	4.65778
R-Square	0.7748
Adj R-Sq	0.7683
AIC	178.47569
AICC	179.26706
BIC	-112.07002
C(p)	44.87070
PRESS	201.06184
SBC	-79.52647
ASE	0.63658
CV PRESS	201.51115



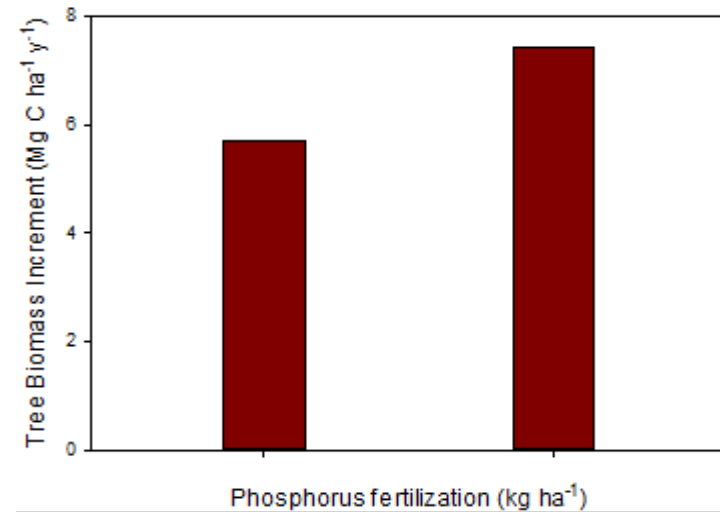
Parameter Estimates										
Parameter	DF	Estimate	Standard Error	t Value	Pr > t	Cross Validation Estimates				
						1	2	3	4	5
Intercept	1	-0.879998	0.578154	-1.52	0.1291	-0.76660	-0.68142	-0.58381	-1.10501	-1.15541
TN*SDC_3	1	-0.002244	0.000519	-4.32	<.0001	-0.00215	-0.00249	-0.00280	-0.00202	-0.00189
TP*Order_Spodosol	1	0.015658	0.002127	7.36	<.0001	0.01553	0.01731	0.01331	0.01611	0.01609
TP*SDC_3	1	0.018346	0.002966	6.18	<.0001	0.01786	0.01906	0.02150	0.01851	0.01572
TP*Order_Ultisols*SDC_2	1	0.006035	0.001801	3.35	0.0009	0.00786	0.00446	0.00668	0.00659	0.00469
tmx*rhmin*precip	1	5.2983412E-8	1.3483444E-8	3.93	0.0001	0.00000	0.00000	0.00000	0.00000	0.00000
UndBio	1	-0.150068	0.037985	-3.95	<.0001	-0.14510	-0.22297	-0.14522	-0.13512	-0.14114
SDI*Thin 0	1	0.004761	0.000249	19.09	<.0001	0.00487	0.00463	0.00466	0.00471	0.00484
SDI*Thin 1	1	0.004198	0.000293	14.31	<.0001	0.00425	0.00394	0.00416	0.00427	0.00429



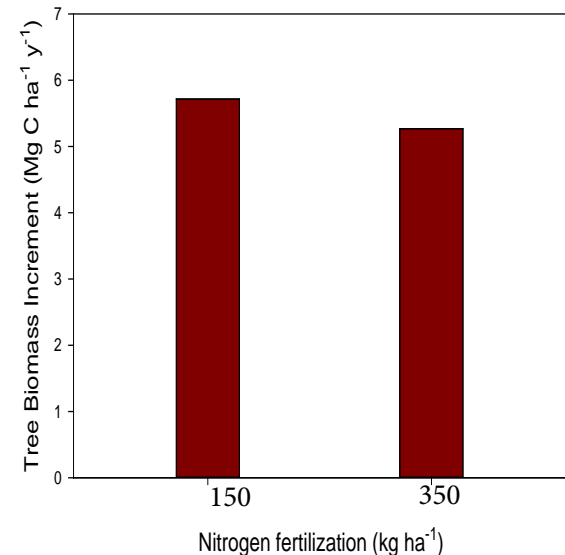
Biomass Increment Model: N and P effects

- Scenarios
 - Phosphorus 50 to 100 kg ha⁻¹
 - Nitrogen 150 to 300 kg ha⁻¹
- Constants
 - Spodosol
 - Drainage Class 3 (somewhat poor-very poor)
 - Understory Biomass=0.5 Mg C ha⁻¹
 - Climate (Gainesville, Florida)
 - Stand Density=740
 - Unthinned

30% increase



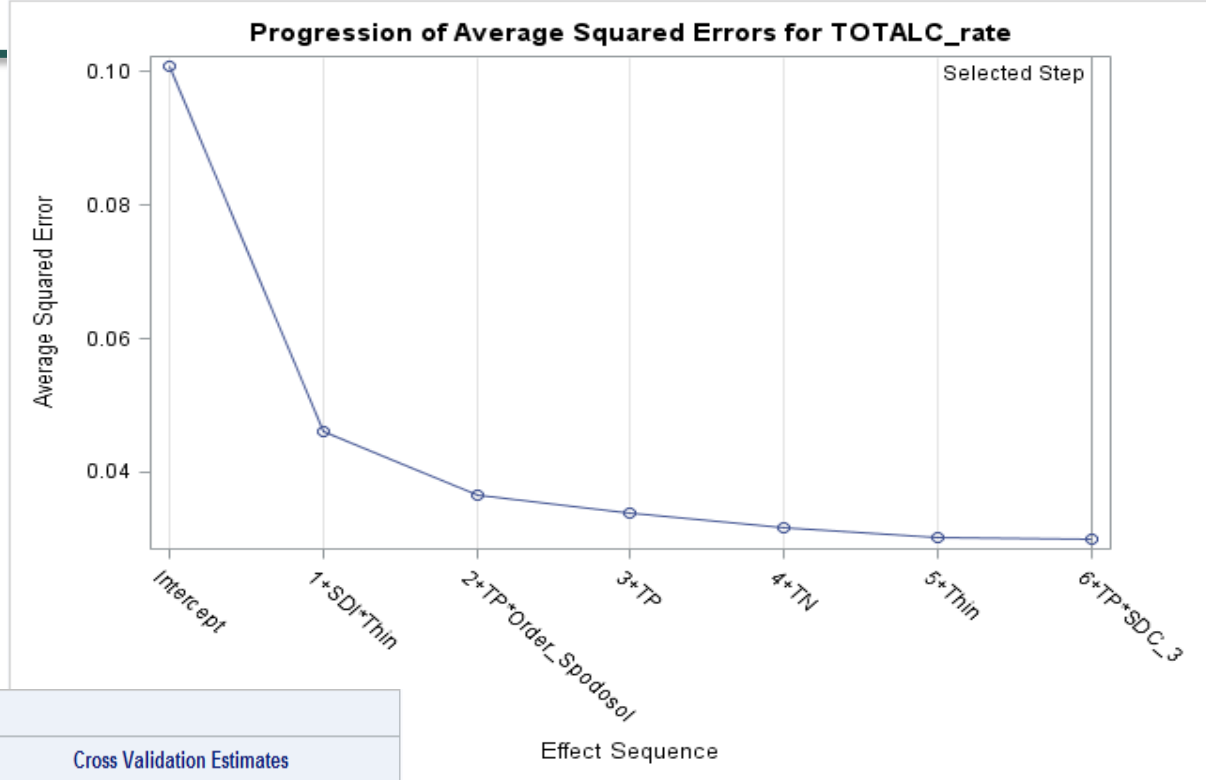
7% decrease





Forest Carbon Increment

Root MSE	0.17529
Dependent Mean	1.77468
R-Square	0.7039
Adj R-Sq	0.6964
AIC	-702.63444
AICC	-701.98462
BIC	-990.59721
C(p)	34.23054
PRESS	9.14331
SBC	-962.35859
ASE	0.02987
CV PRESS	8.98240

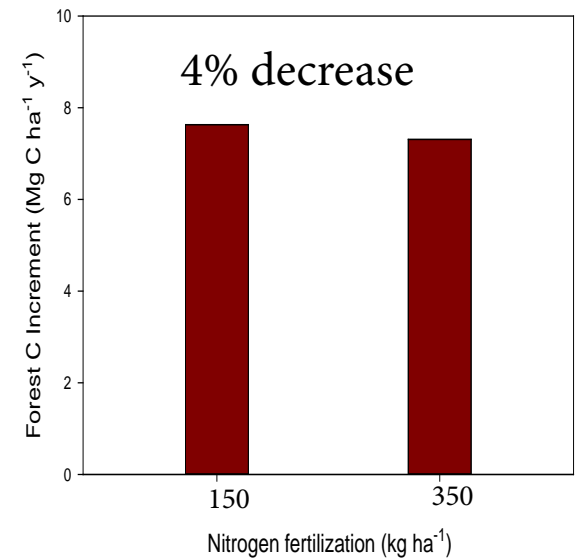
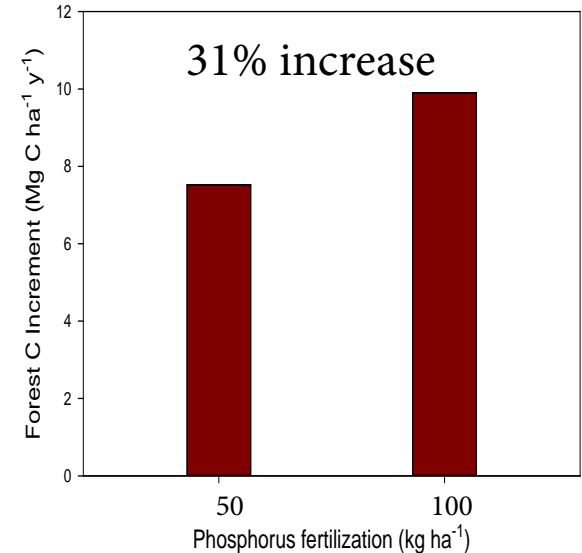


Parameter Estimates										
Parameter	DF	Estimate	Standard Error	t Value	Pr > t	Cross Validation Estimates				
						1	2	3	4	5
Intercept	1	1.062978	0.054452	19.52	<.0001	1.045448	1.098143	1.053337	1.069918	1.047626
TN	1	-0.000289	0.000073608	-3.92	0.0001	-0.000295	-0.000317	-0.000320	-0.000264	-0.000258
TP	1	0.002346	0.000461	5.09	<.0001	0.002483	0.002569	0.002357	0.002329	0.002061
TP*Order_Spodosol	1	0.002416	0.000460	5.25	<.0001	0.002410	0.002532	0.002496	0.002379	0.002261
TP*SDC_3	1	0.000735	0.000386	1.90	0.0581	0.000358	0.000685	0.000738	0.000848	0.001007
Thin 0	1	0.293512	0.083162	3.53	0.0005	0.250675	0.286699	0.363489	0.297026	0.262741
Thin 1	0	0				0.000000	0.000000	0.000000	0.000000	0.000000
SDI*Thin 0	1	0.000595	0.000076275	7.80	<.0001	0.000673	0.000559	0.000535	0.000570	0.000645
SDI*Thin 1	1	0.000751	0.000078633	9.55	<.0001	0.000767	0.000703	0.000780	0.000733	0.000773



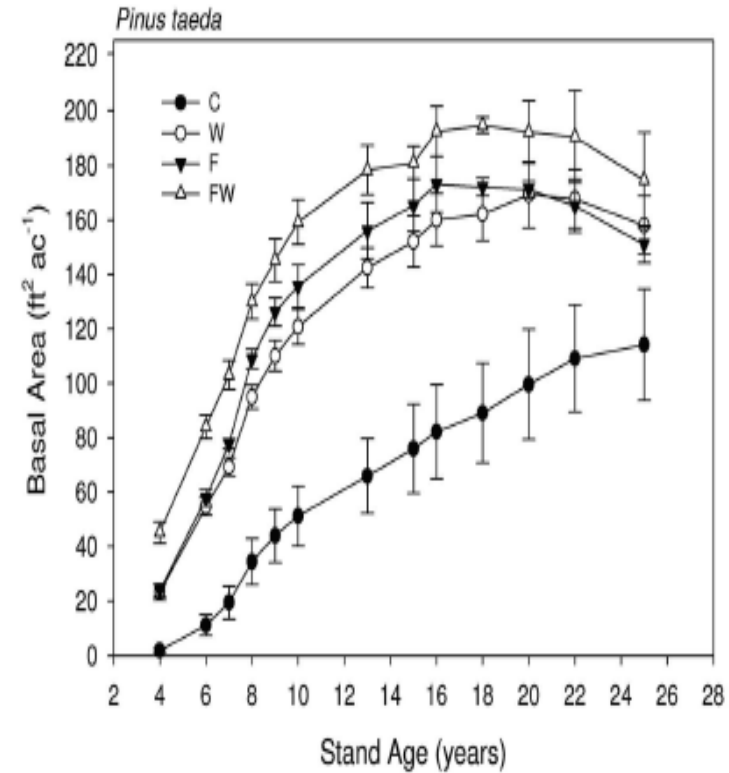
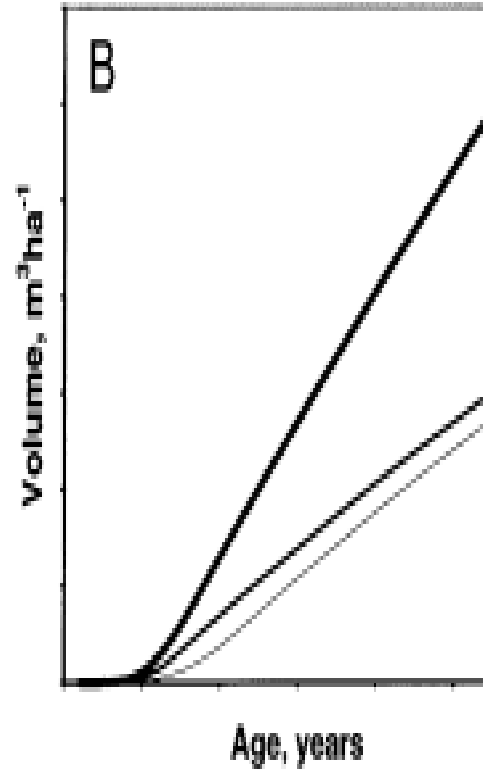
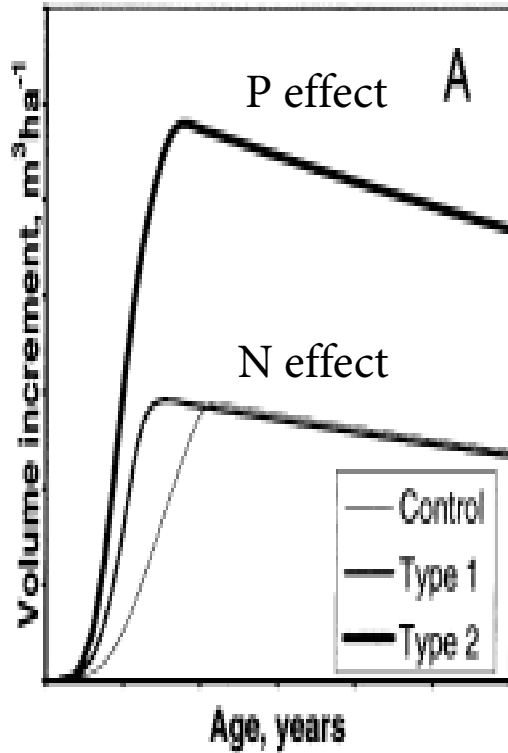
Forest C Increment model: N and P effects

- Scenarios
 - Phosphorus 50 to 100 kg ha⁻¹
 - Nitrogen 150 to 300 kg ha⁻¹
- Constants
 - Spodosol
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 - Stand Density=740
 - Unthinned





Type 1 vs. Type 2 response?





Summary

(for this model configuration)

- Density management is the primary control on rates of C accumulation in trees and forest (sans soils) across the climate gradient.
- Climate has a very small effect on biomass increment
- Phosphorus has positive effects and interacts with drainage class; greater effect in poorly drained soils and Spodosols.
- Nitrogen is a slight detriment to forest C accumulation rate.
- There are forms of the models where a negative N effect “goes away” but N is never a stand-alone positive effect.



The effects of rainfall reduction and nutrient availability on net ecosystem productivity (NEP). Tier_3

Bracho et al.....

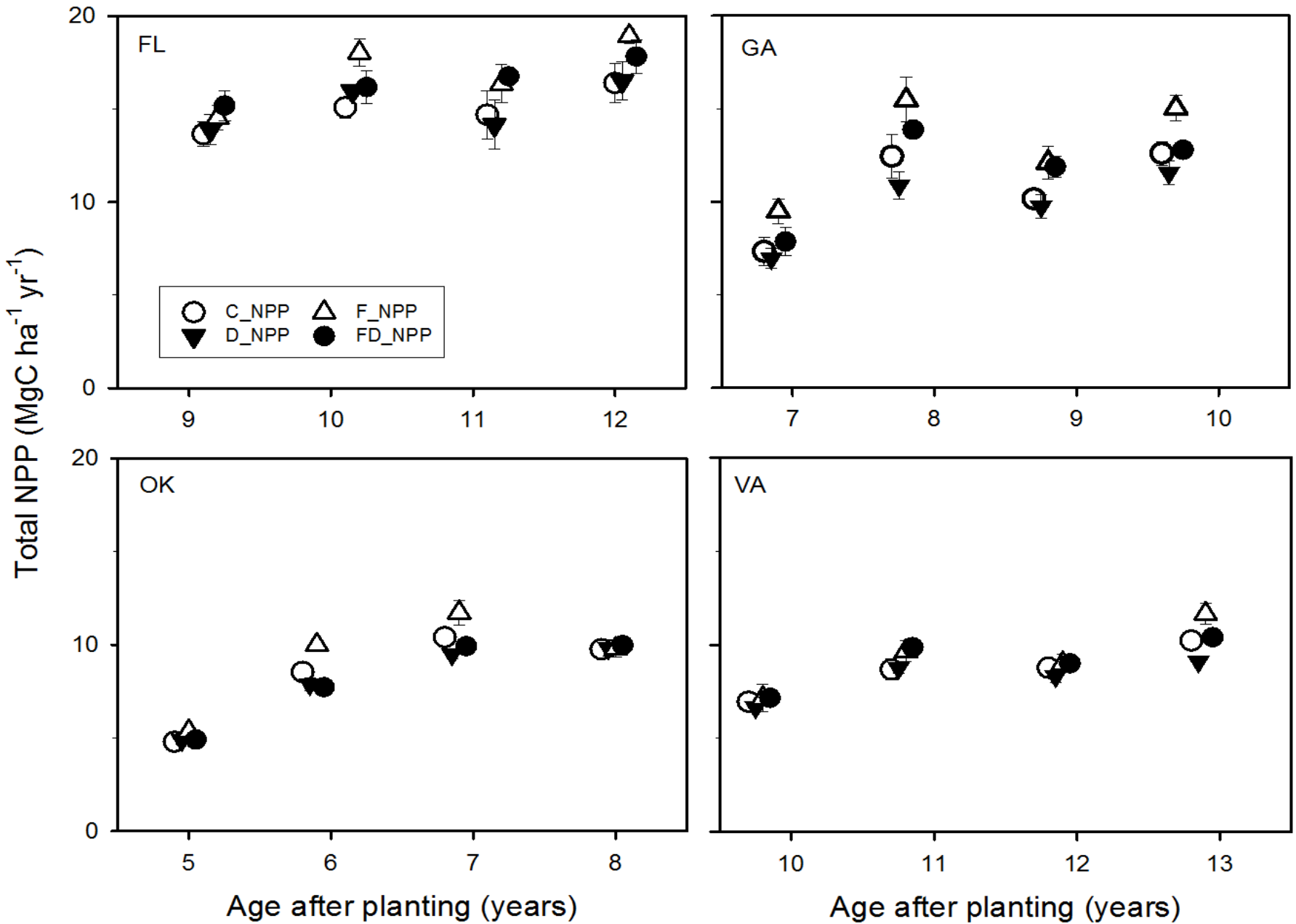


$$NEP = NPP - R_H$$

NPP= Net primary productivity
biomass inventories.

R_H = Heterotrophic respiration
Root severing collars

NPP Tier 3 sites

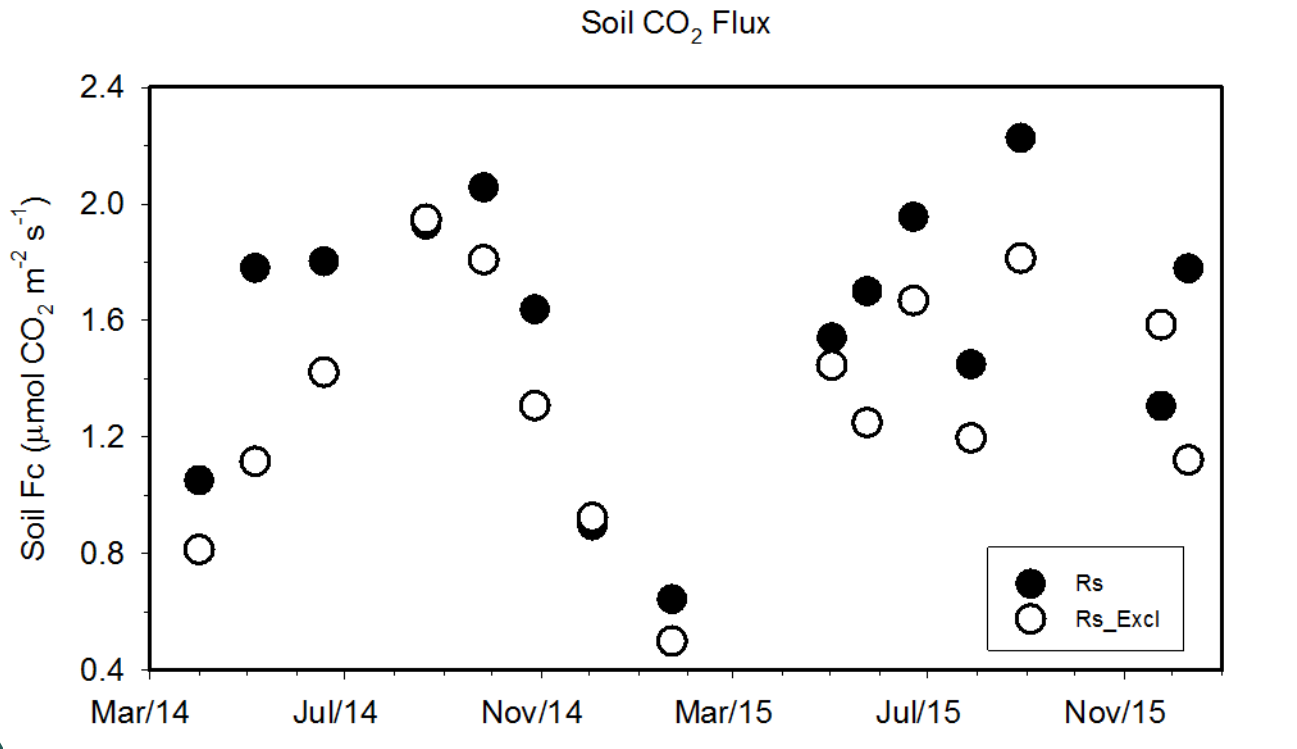




Heterotrophic component (R_H)

Soil respiration measurements (R_S & R_H):

All Tier3 sites with at least one year of paired R_S & R_H .
Soil temperature (T_s) & soil moisture (VWC)



Soil Respiration (Rs)

Model Soil respiration by treatment $Rs=f(Ts, \text{age}, \text{VWC})$

Analysis of Variance (CONTROL)					
Source	DF	Sum of Squares	Mean Square	F Value	Pr > F
Model	3	68.82951	22.94317	132.10	<.0001
Error	299	51.93055	0.17368		
Corrected Total	302	120.76006			

Root MSE	0.41675	R-Square	0.5700
Dependent Mean	0.99155	Adj R-Sq	0.5657
Coeff Var	42.03038		

Parameter Estimates					
Variable	DF	Parameter Estimate	Standard Error	t Value	Pr > t
Intercept	1	0.32112	0.18999	1.69	0.0920
Ts	1	0.07063	0.00467	15.11	<.0001
age	1	-0.04034	0.01494	-2.70	0.0073
VWC	1	-1.75118	0.40738	-4.30	<.0001



SOIL TEMPERATURE

$$T_{s_{\text{daily}}} = f(T_{\text{air}_{\text{daily}}})$$

studyID=VA_Tier3. Treatment=Control

Analysis of Variance				
Source	Sum of Squares	Mean Square	F Value	Pr > F
Model	15.45724	15.45724	442.79	<.0001
Error	2.54835	0.03491		
Corrected Total	18.00559			

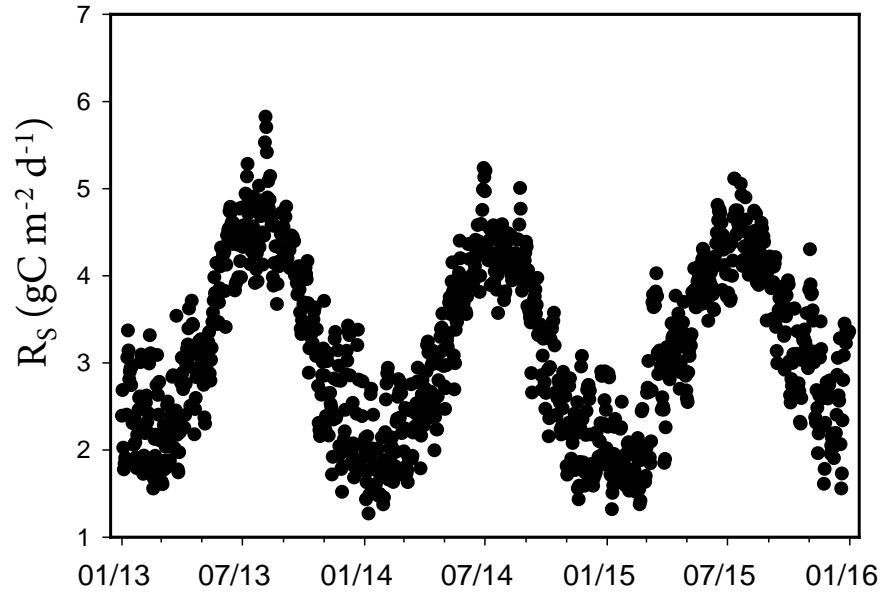
Root MSE	0.18684	R-Square	0.8585
Dependent Mean	2.73997	Adj R-Sq	0.8565
Coeff Var	6.81903		

Parameter Estimates				
Variable	Parameter Estimate	Standard Error	t Value	Pr > t
Intercept	1.81686	0.04889	37.16	<.0001
daily_Tair	0.05520	0.00262	21.04	<.0001



Soil C fluxes

Daily Rs (Control FL)



Annual Soil respiration, 2013 ($\text{gC m}^{-2} \text{yr}^{-1}$)

SITE	Control	Drought	Fertilized	F * D
FL	1189.00	902.30	977.18	988.0
GA	952.21	771.51	734.17	759.44
OK	1045.44	882.31	740.86	857.45
VA	804.87	707.52	727.94	688.22



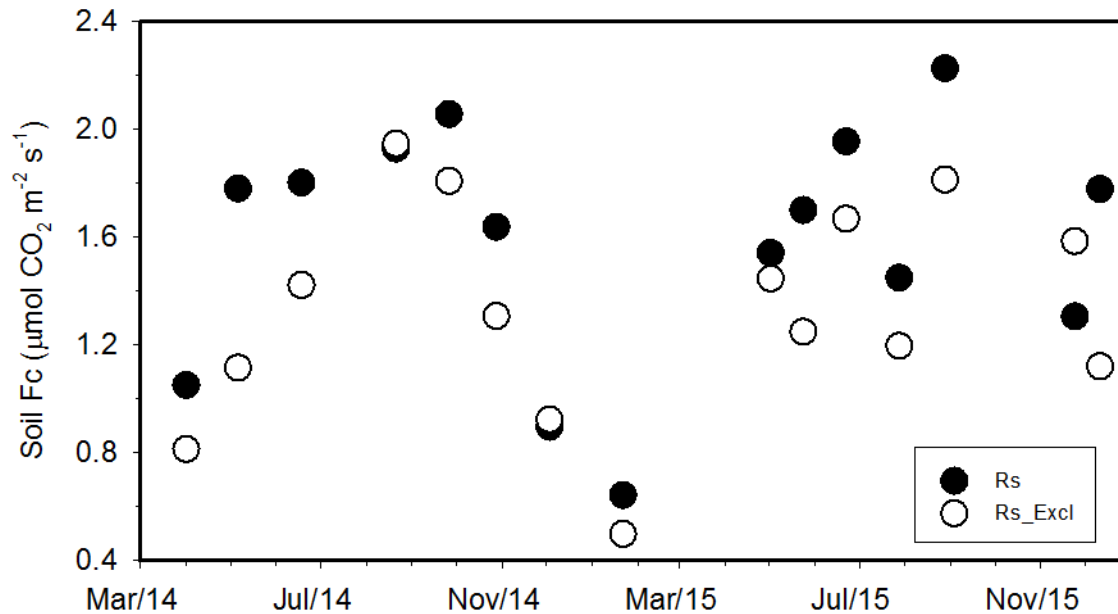
Heterotrophic respiration (R_H)

R_H ~ Root severing collars

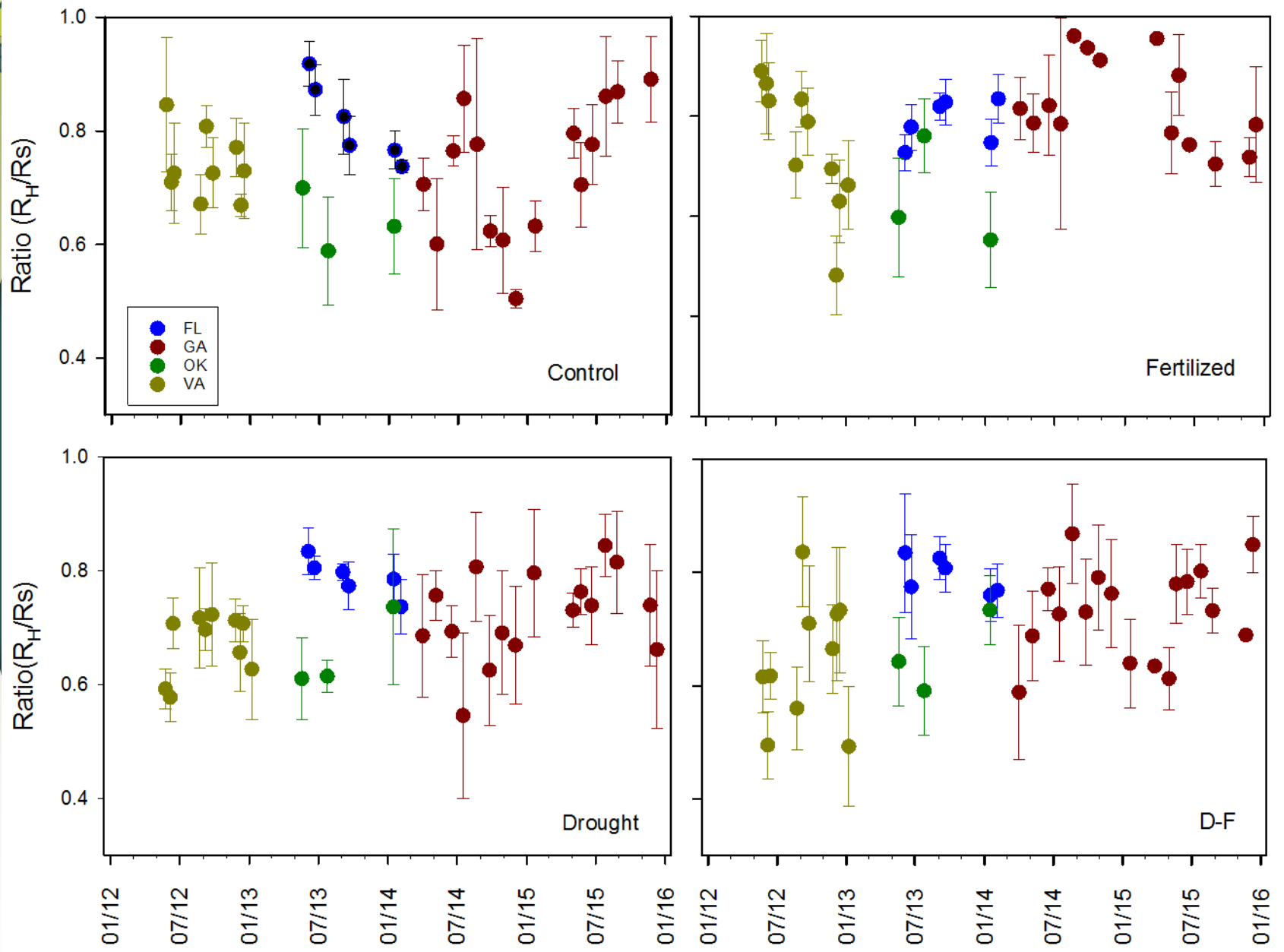
Paired R_s & R_H measurements after 60 days of installation:

Ratio ($R_H:R_S$)

Soil CO_2 Flux



$R_H:R_s$





Ratio=f(Ts age)

Treatment=CONTROL

Treatment = FERTILIZED

Root MSE	0.13231	R-Square	0.1279
Dependent Mean	0.73857	Adj R-Sq	0.1115
Coeff Var	17.91491		

Root MSE	0.13769	R-Square	0.2171
Dependent Mean	0.75706	Adj R-Sq	0.2010
Coeff Var	18.18719		

Parameter Estimates

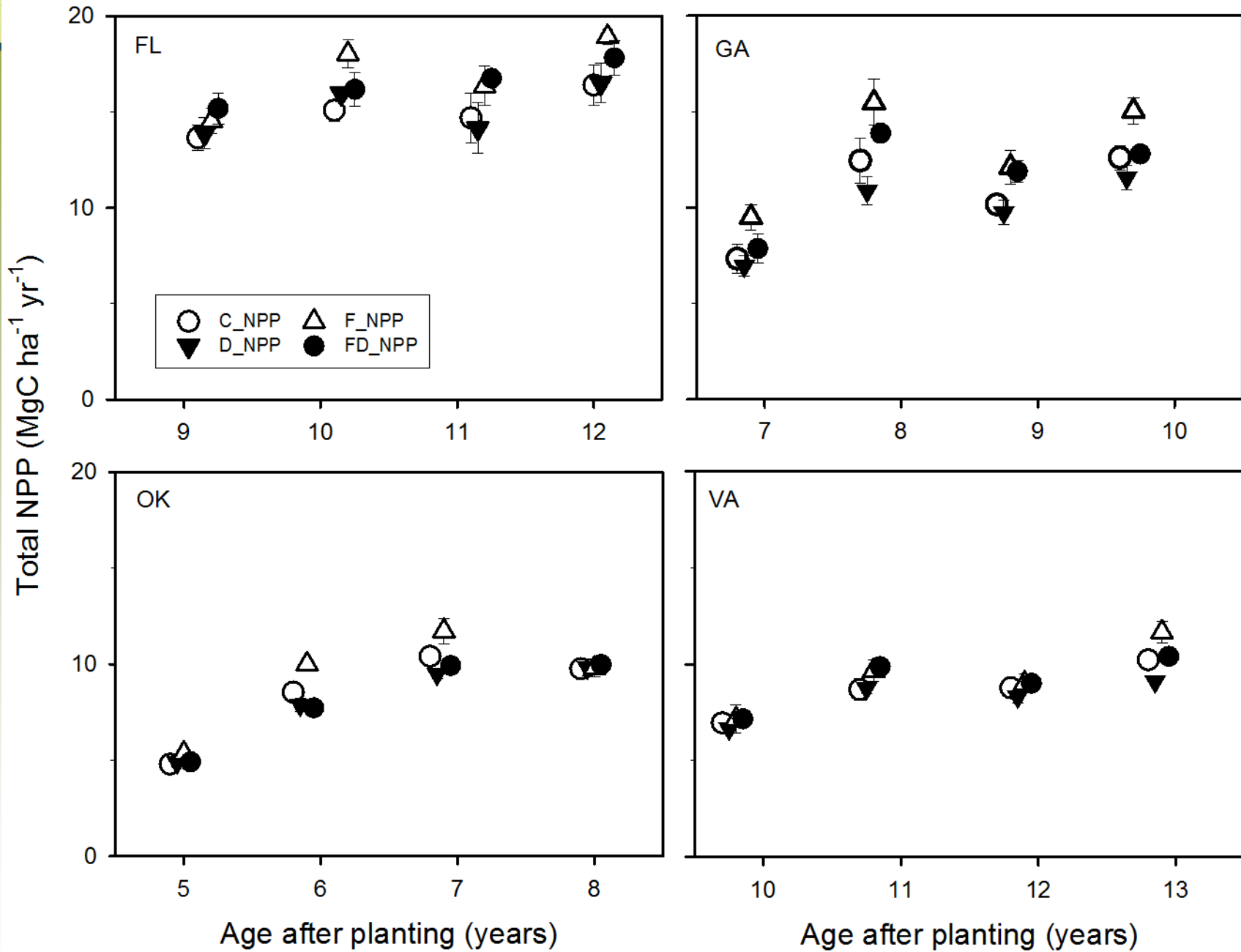
Variable	Parameter Estimate	Standard Error	t Value	Pr > t
Intercept	0.38605	0.09734	3.97	0.0001
Ts	0.00664	0.00213	3.12	0.0023
age	0.02488	0.00914	2.72	0.0076

Parameter Estimates

Variable	Parameter Estimate	Standard Error	t Value	Pr > t
Intercept	0.38467	0.10456	3.68	0.0004
Ts	0.01018	0.00206	4.93	<.0001
age	0.02137	0.01016	2.10	0.0380

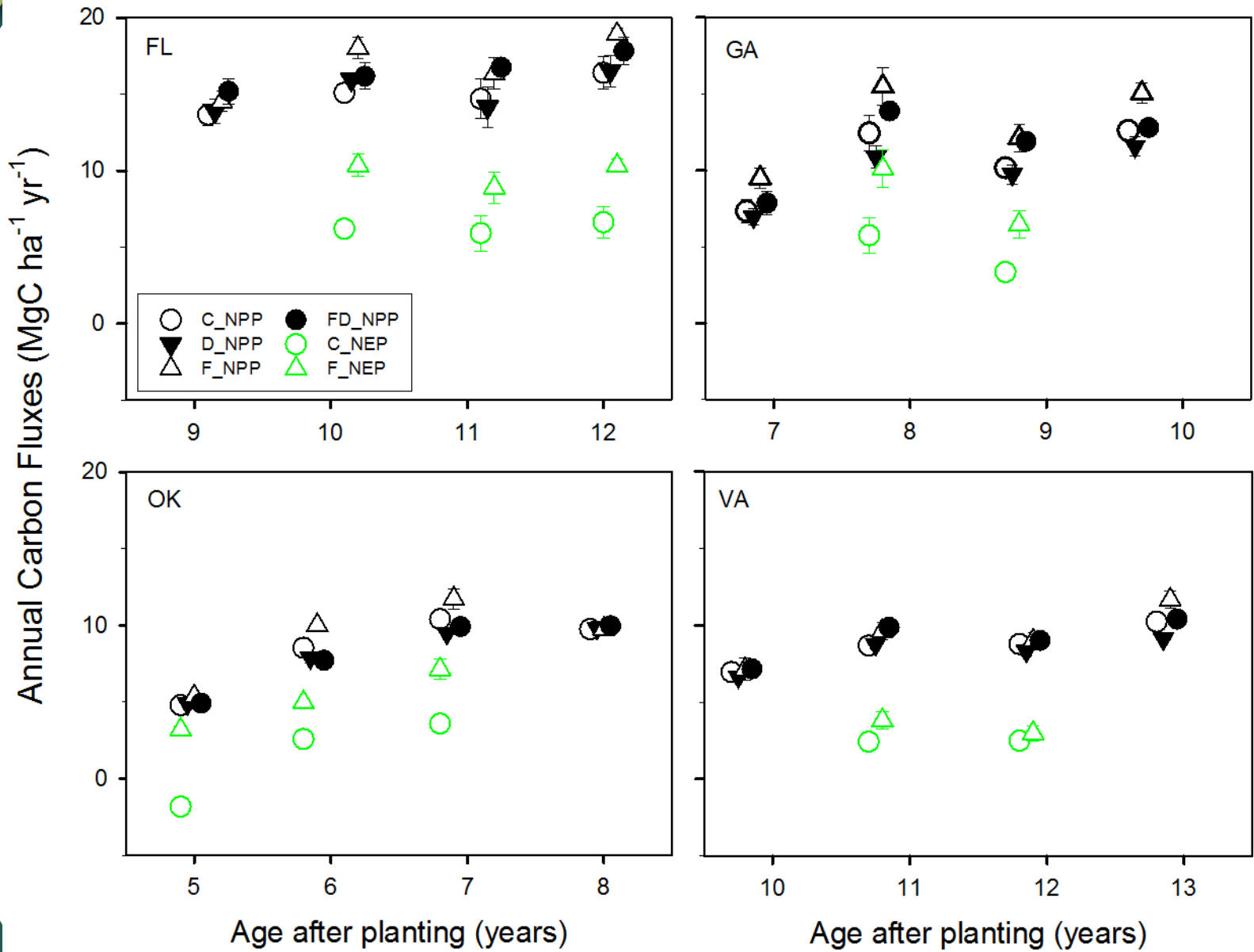
$$R_H = R_S^* \text{ratio}$$

NPP Tier 3 sites





Annual C Fluxes Tier 3 sites





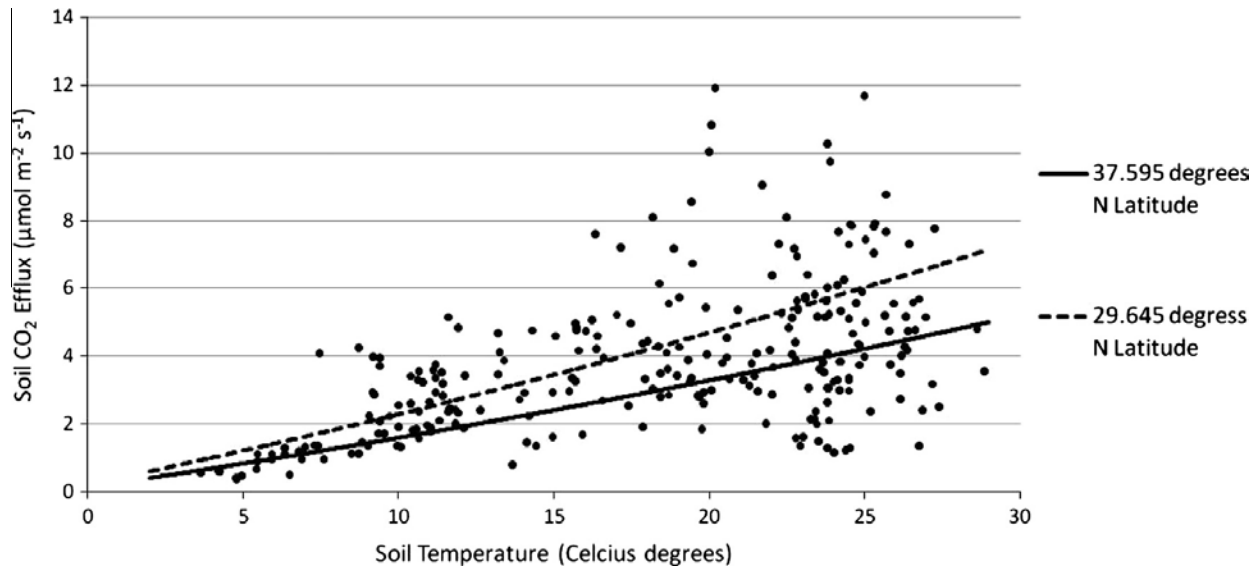
Soil Respiration Modeling



Overview

- Step 1: Develop a region wide relationship between soil temperature and respiration
 - Focus on total soil respiration

logy and Management 355 (2015) 15–23





Overview

- Step 1: Develop a region wide relationship between soil temperature and respiration
 - Focus on total soil respiration
 - Concerns
 - Dependence on background productivity (initial tests suggest that SI is not a strong predictor of total soil respiration)
 - Dependence on soil moisture
 - Dependence on stand age
 - Dependence on soil properties
 - Space-for-time substitution
 - Acclimation of respiration to increased temperatures



Overview

- Step 2: Calculate monthly total soil respiration for each HUC simulated by 3PG
 - Challenges
 - Need to translate air temperature to soil temperature
 - Currently developing model



Overview

- Step 3: Calculate heterotrophic respiration for each month of the 3PG simulation
 - Use the autotrophic respiration produced by the 3PG model: $R_a = GPP * (1-y)$
 - Use the ration of aboveground to belowground biomass to calculate R_{a_below} ($R_{a_below} = R_a * (\text{below biomass}/\text{total biomass})$)
 - Add R_{a_below} to the total soil respiration
 - $R_h = R_s + R_{a_below}$



Overview

- Step 4: Calculate monthly NEP (NPP from 3PG - R_h)



Overview

- Needs from group
 - Tier 2 soil respiration vs. temperature to combine with the Templeton data.
 - Tier 2 and 3 soil temperature and atmospheric temperature data