

# Updating the Forest Vegetation Simulator with climate response recorded in tree rings

Courtney Giebink, R. Justin DeRose, Mark Castle, John D. Shaw, &  
Margaret E.K. Evans

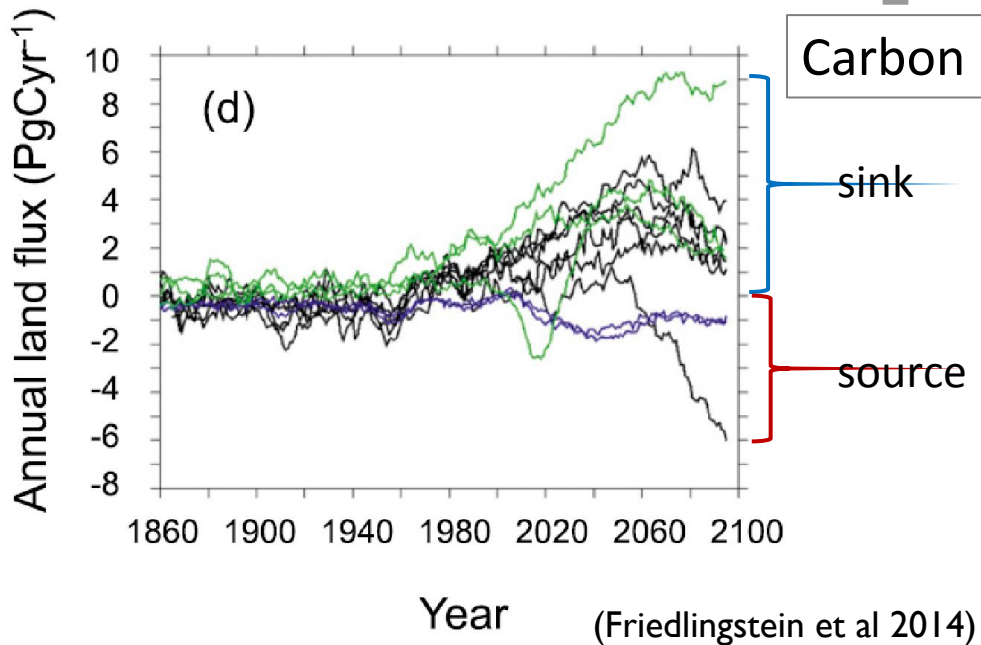


UA SCIENCE  
Laboratory of  
Tree-Ring Research  
Ecology & Evolutionary Biology

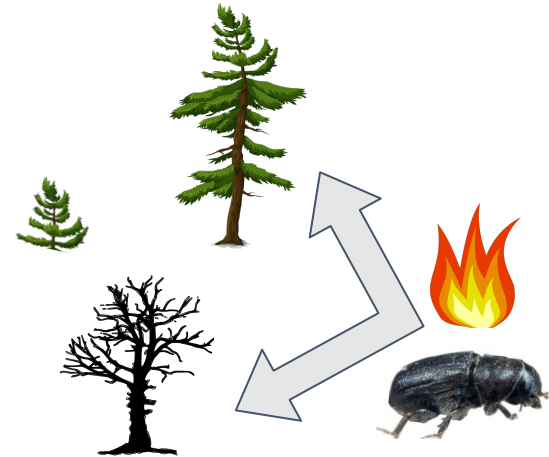
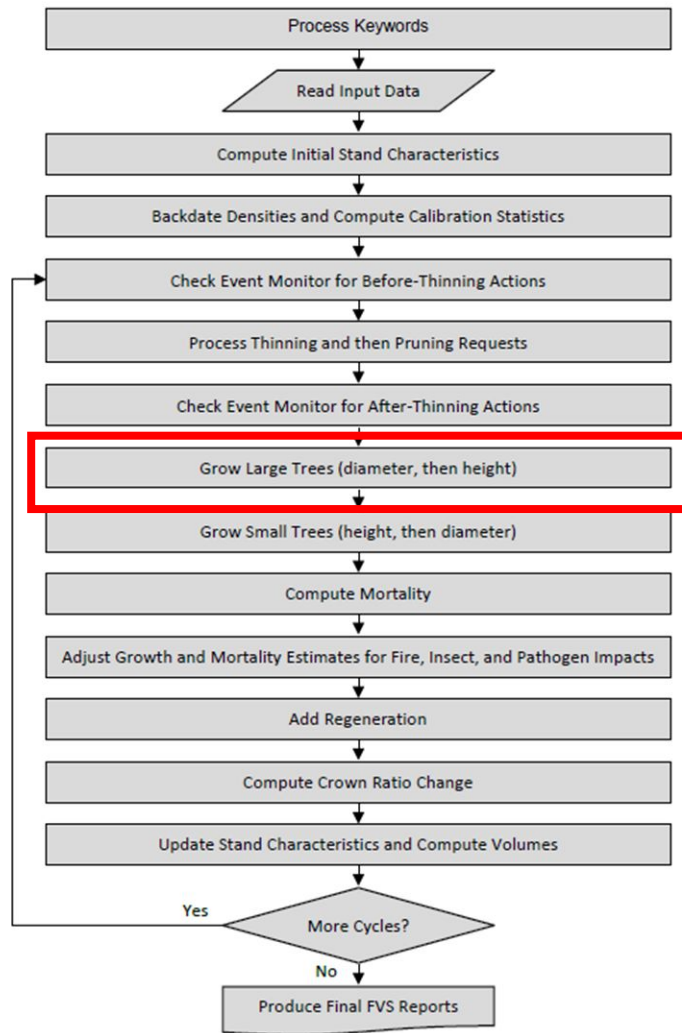
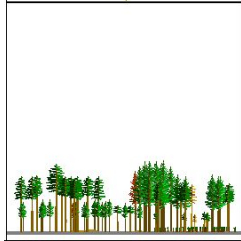
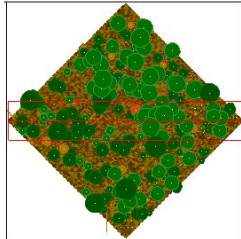




*Common goal:*  
Understanding the  
future of forests.

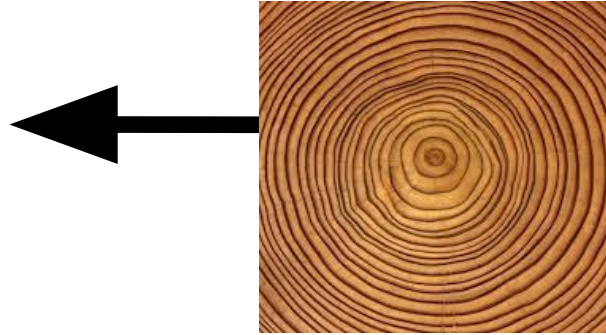


# Forest Vegetation Simulator

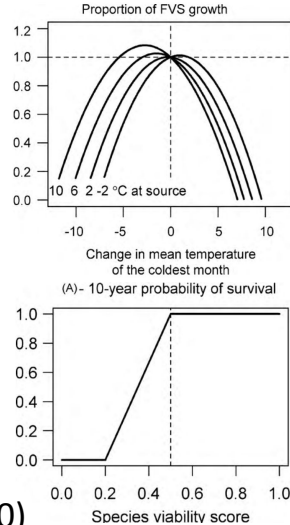
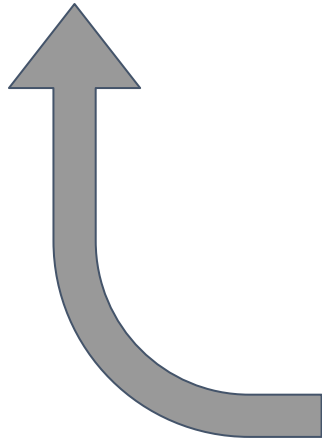


Ring Width = f (Tree, Competition, Site, and **Climate**)

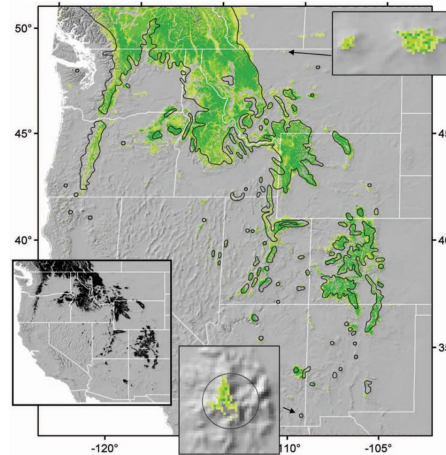
Tree  
growth



Climate



(Crookston et al. 2010)



(Rehfeldt et al. 2006)



# Taking back the increment borer

“This useful little instrument is the invention of the late **Dr. Max Pressler, Professor of Applied Mathematics in the Saxon School of Forestry**...The practical and scientific uses of the instrument are very various...The **effect upon trees of thinning, pruning, or any other arboricultural or silvicultural operation**, can be ascertained by examining the rate of growth a year or two after the trees have been subjected to the new conditions...



...the instrument may be employed for determining the commencement, progress, and conclusion of **growth as affected by species, weather, elevation, exposure, [etc.]**”

(Somerville 1891)

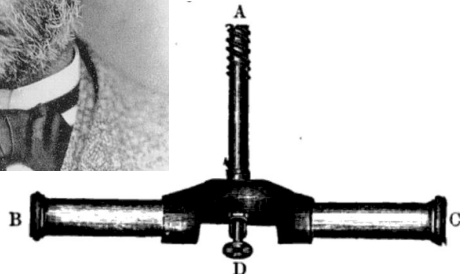
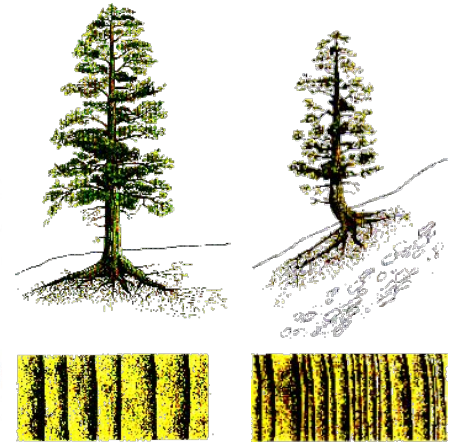
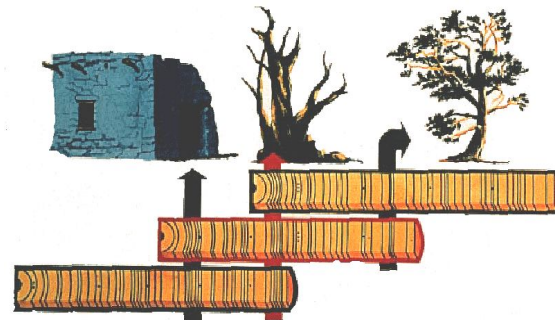


Fig. 6.

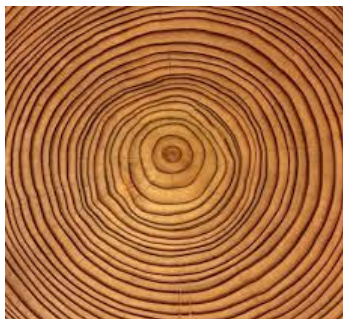


# Building the Forest Inventory and Analysis Tree-Ring Data Set

*Journal of Forestry*  
2017 155(4): 283-291

Robert J. DeRose, John D. Shaw, and James N. Long

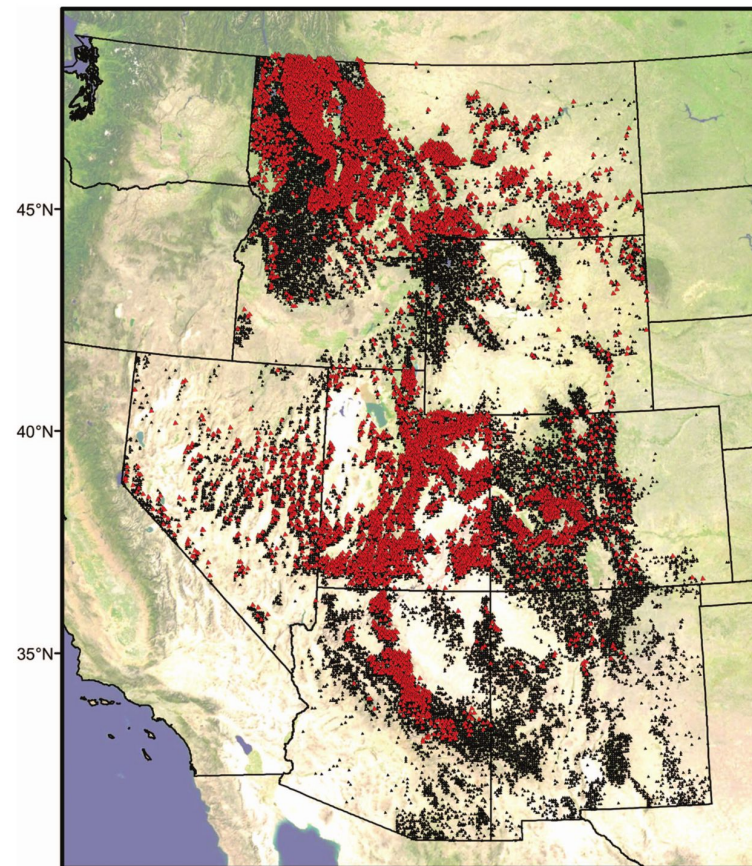
- Tree-ring data (red)
- FIA plots (black)
  - Metadata



+



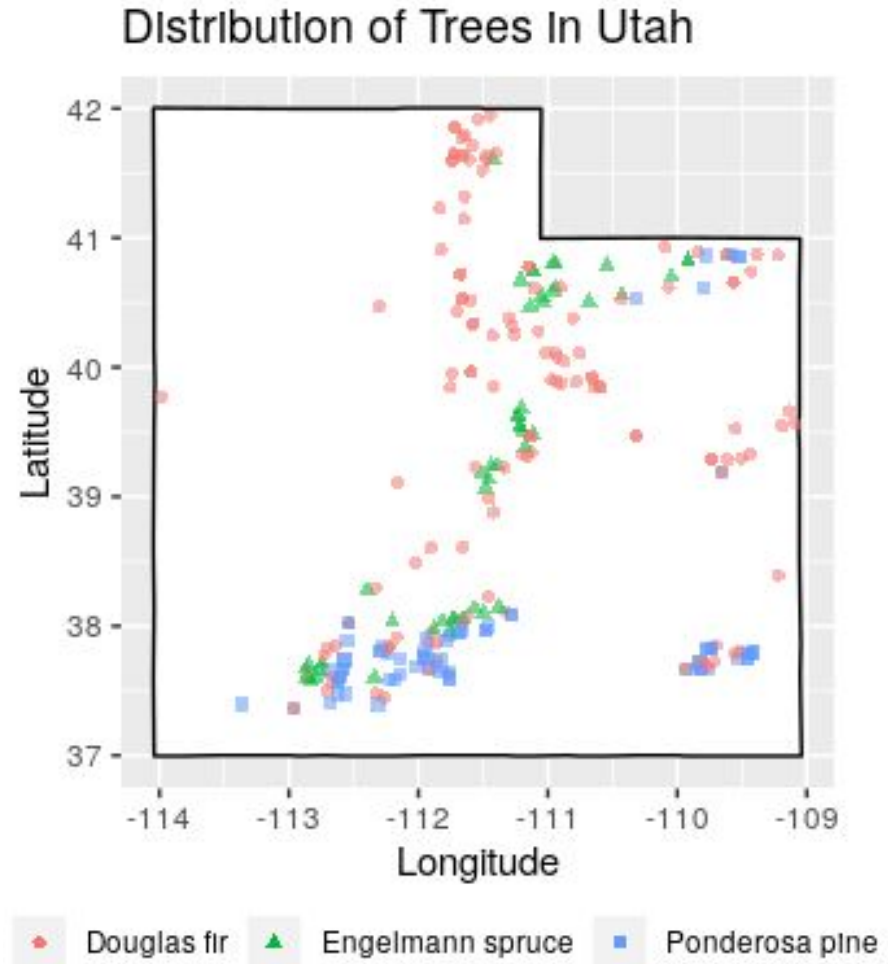
growth = f(tree, competition, site, climate)



DeRose, Shaw and Long 2017

# Variant and Species

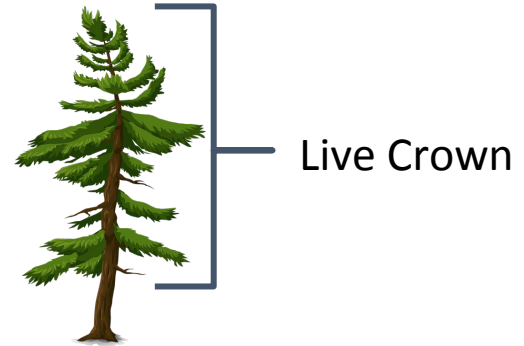
- Utah variant of FVS
- 3 species-specific growth models
  - Douglas fir
  - Ponderosa pine
  - Engelmann spruce



$$\text{growth} = f(\text{tree, competition, site, climate})$$

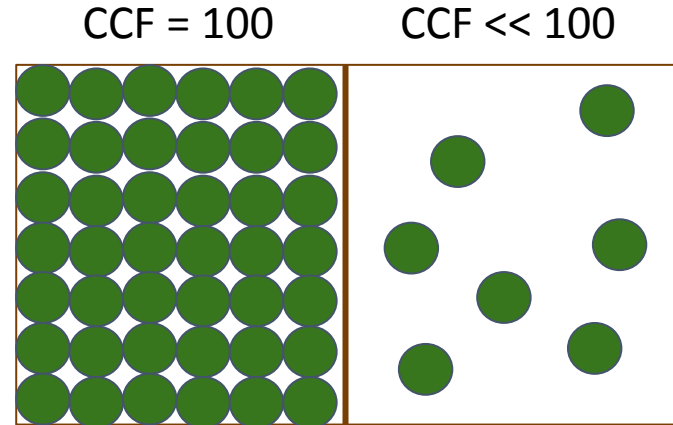
## Tree

- **DBH** = diameter at breast height
- **Crown Ratio** = percentage of a tree's total height that has foliage



## Density/competition

- **BAL** = basal area of trees larger than subject tree
- **PCCF** = subplot crown competition factor
- **CCF** = stand crown competition factor





# growth = f(tree, competition, site, climate)

## Tree

- **DBH** = diameter at breast height
- **Crown Ratio** = percentage of a tree's total height that has foliage

## Density/competition

- **BAL** = basal area of trees larger than subject tree
- **PCCF** = subplot crown competition factor
- **CCF** = stand crown competition factor

## Site

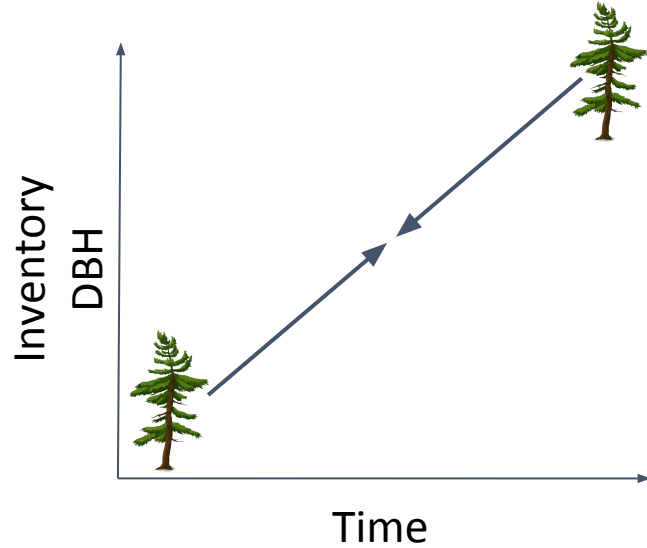
- **Site index** = measure of site productivity
- **Slope** = degree of incline

## Climate

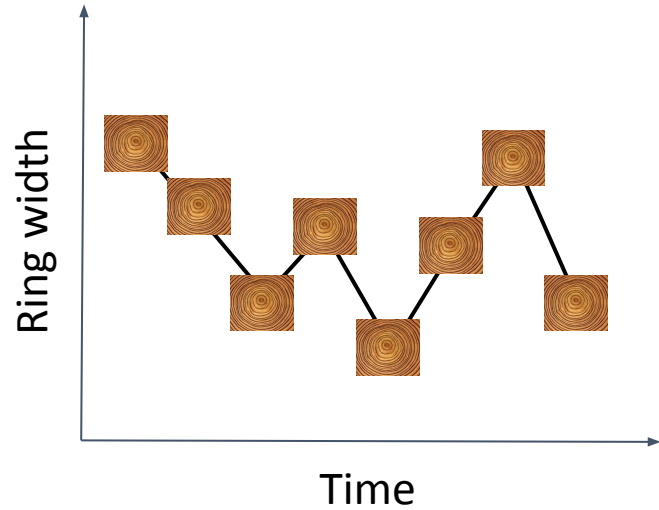
- **Precipitation** = total water year precipitation
- **Temperature** = average max monthly temperature

# Different temporal scales

Periodic



Annual

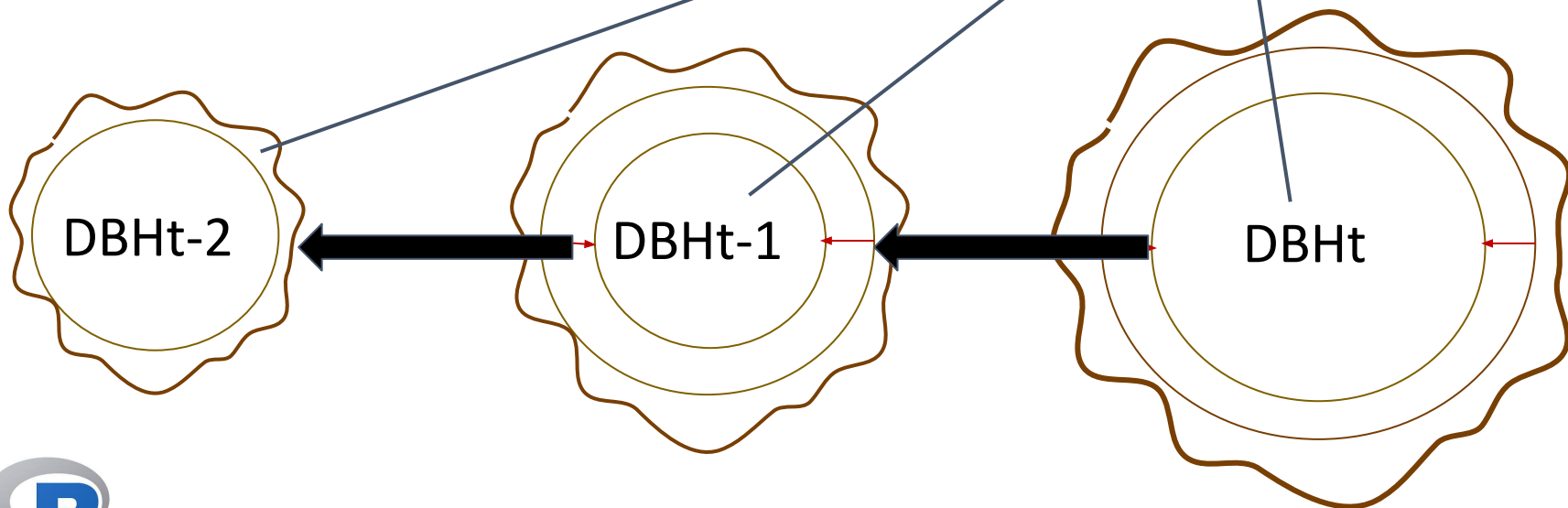


# Annualize DBH

Measure Year



RWt-1RWt

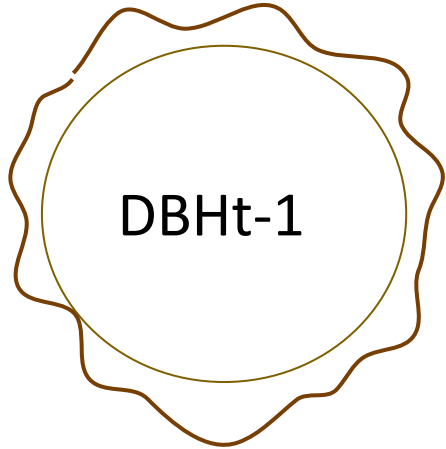


DBHt-2

DBHt-1

DBHt

# Annualize Covariates



$$CCF_t = R1 + (R2 * DBH) + (R3 * DBH^2)$$

- PCCF
- CCF

$$BA = 0.005454 * DBH^2$$

- BAL

$$SDI = \sum (DBH_i / 10)^{1.6}$$

- Crown Ratio



# Updating the current large-diameter growth model

$$\{4.7.1.1\} \ln(DDS) = b_1 + (b_2 * SI) + (b_3 * \sin(ASP - 0.7854) * SL) + (b_4 * \cos(ASP - 0.7854) * SL) + (b_5 * SL) + (b_6 * SL^2) + (b_7 * \ln(DBH)) + (b_8 * (BAL / 100)) + (b_9 * CR) + (b_{10} * CR^2) + (b_{11} * DBH^2) + (b_{12} * PCCF) + (b_{13} * (CCF / 100))$$

- Decadal
- Multiple linear regression
- No climate variables



- Annual
- Mixed effect model
- Climate variables
- Reduce based on collinearity and significance

growth = f(tree, competition, site, climate)

Met?

Expectation



DBH



DBH^2



Crown Ratio



CCF



Site Index



Slope

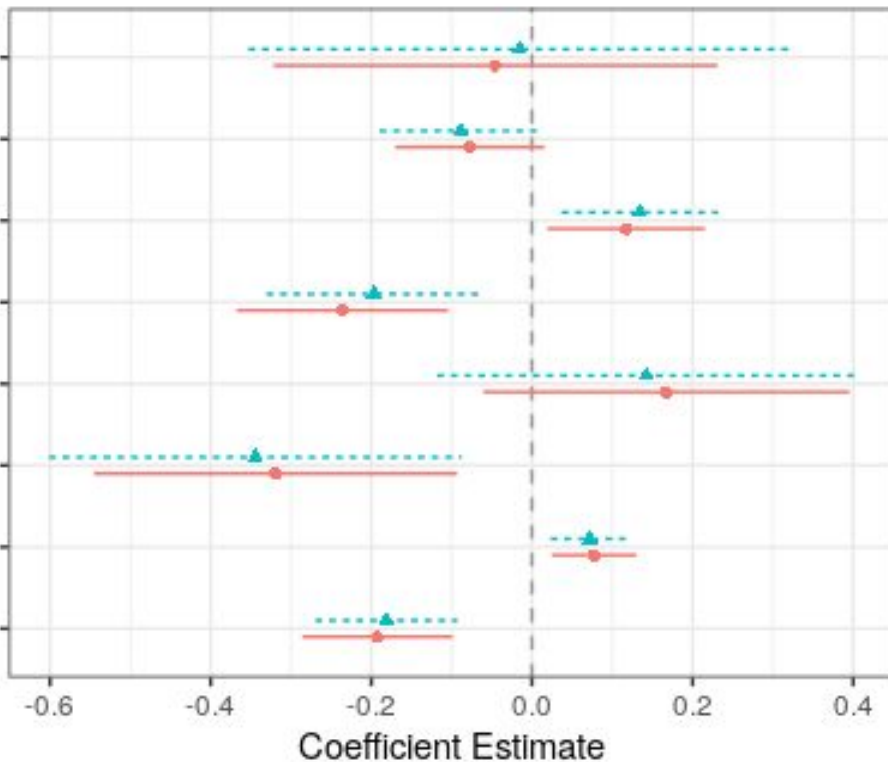


Precipitation



Temperature

Growth for Douglas Fir



growth = f(tree, competition, site, climate)

Met?

Expectation

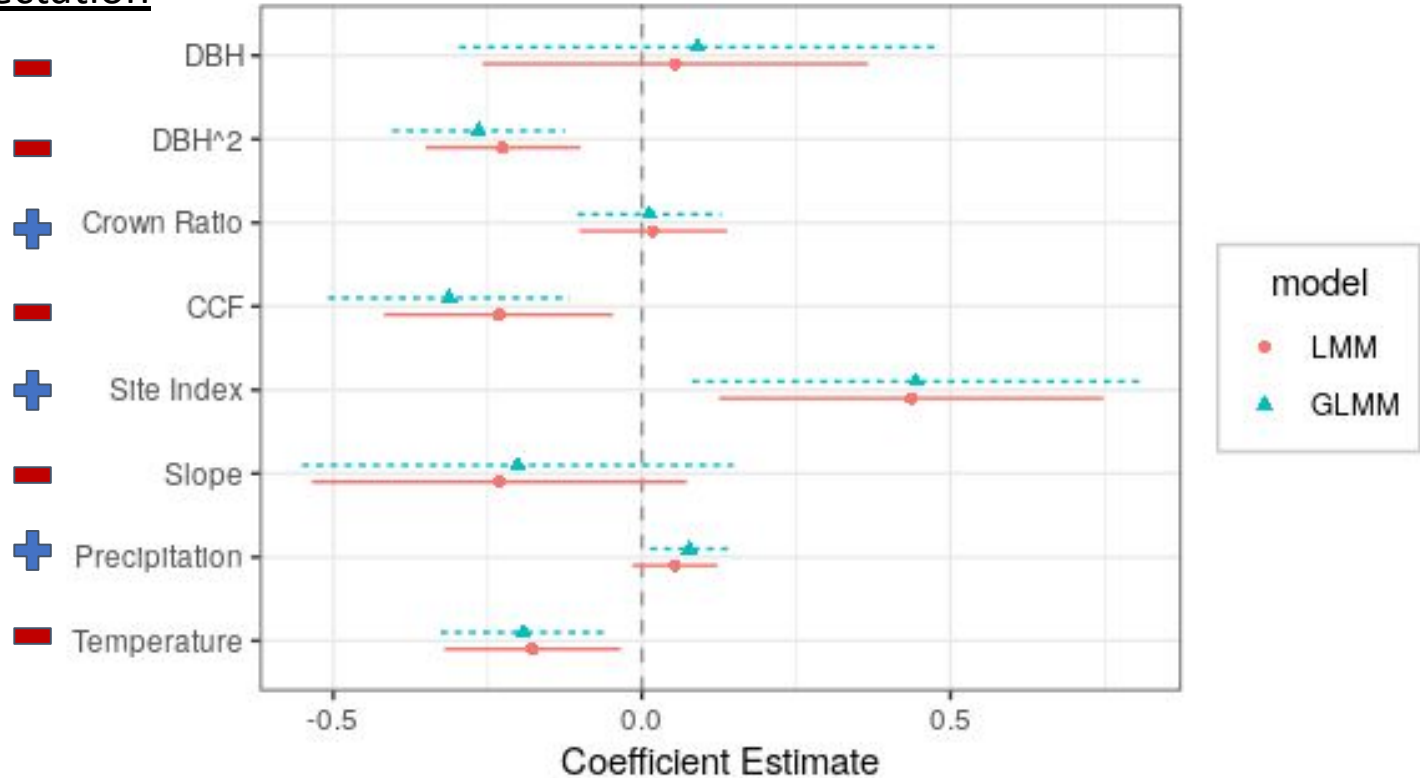
Growth for Ponderosa Pine

✓ ?

✓

✓

✓



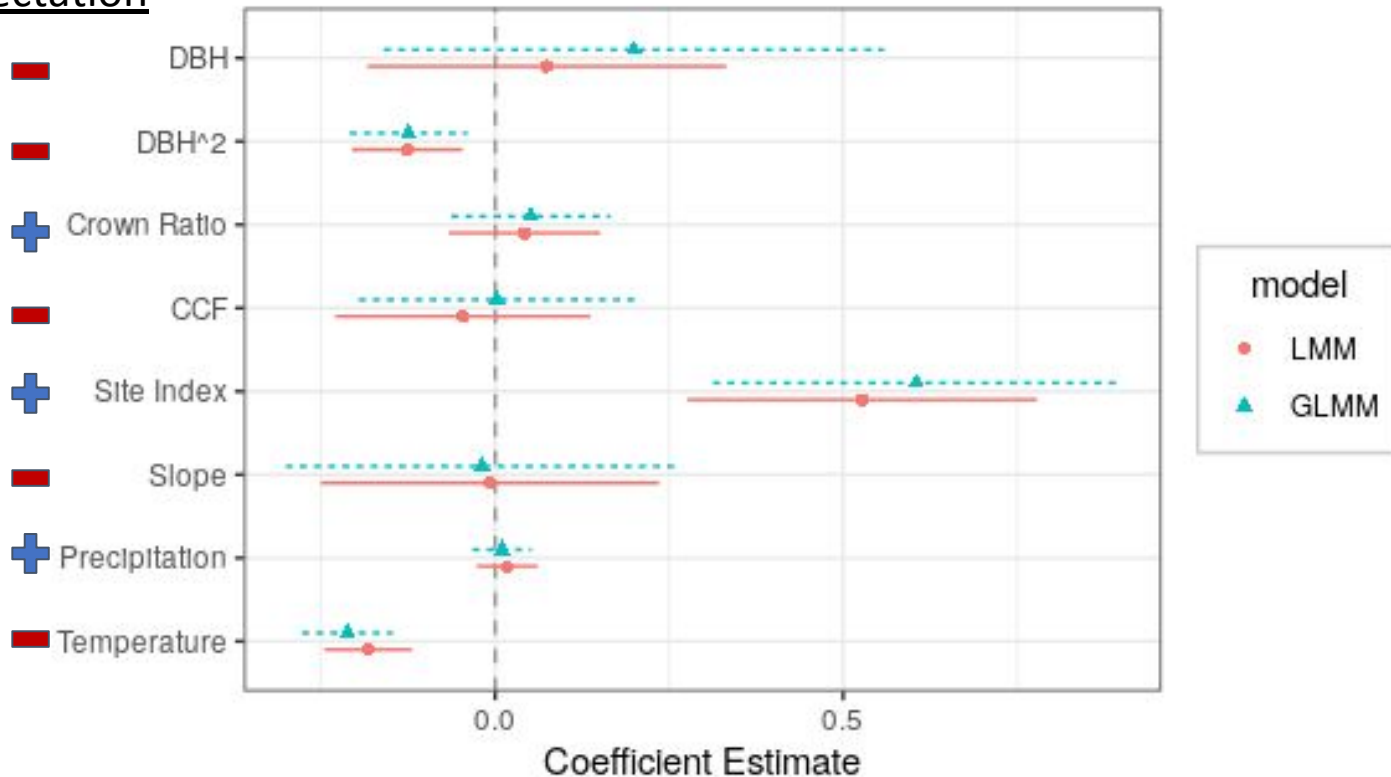
growth = f(tree, competition, site, climate)

Met?

Expectation

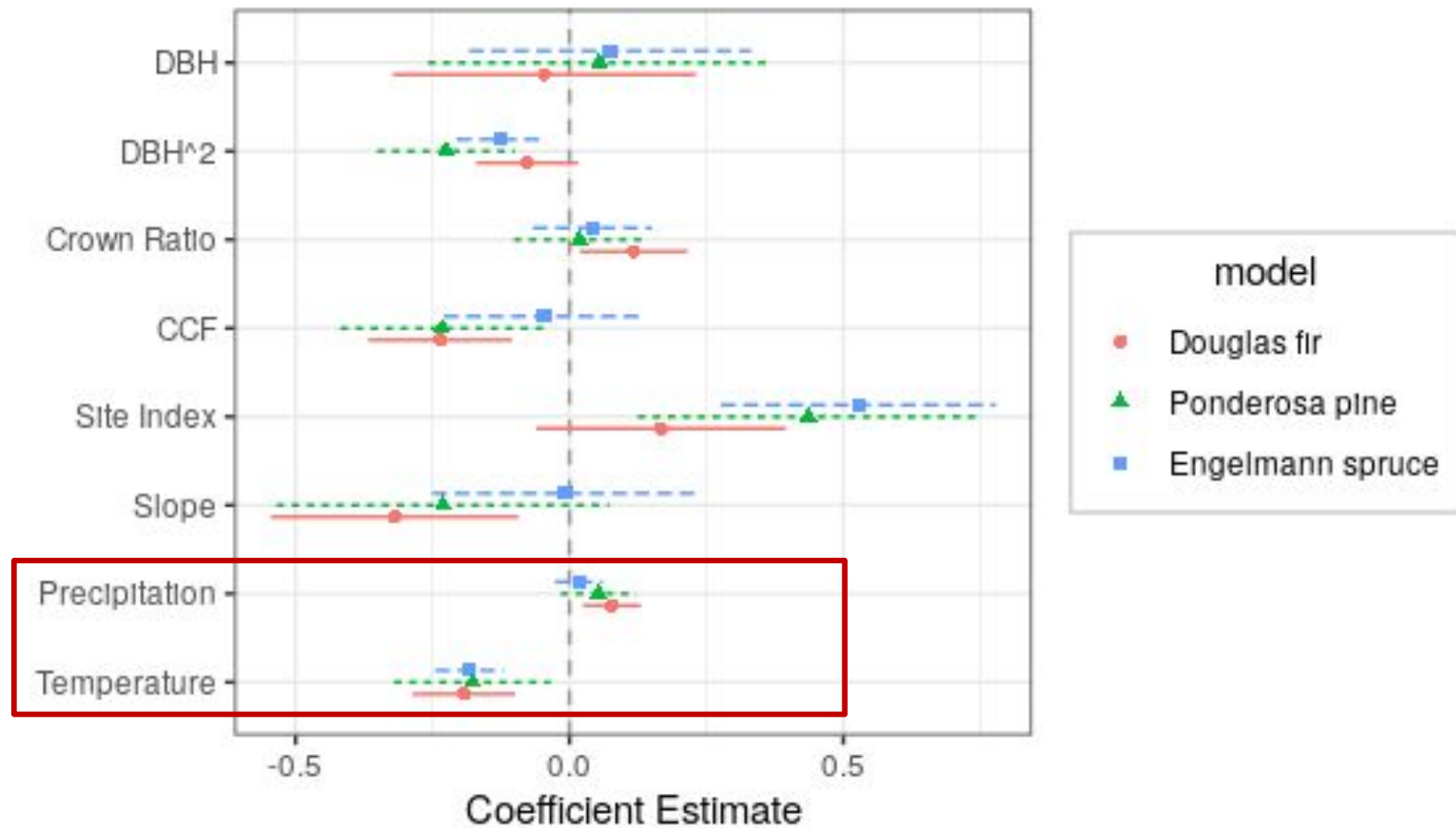
Growth for Engelmann Spruce

✓ ?  
?  
✓ ?  
✓



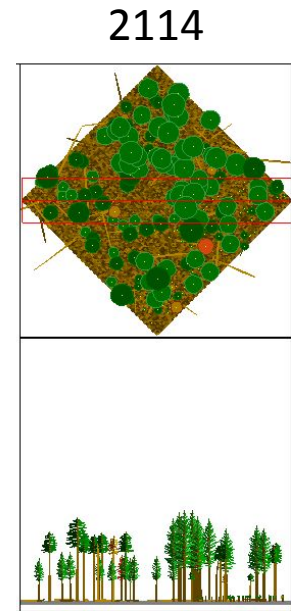
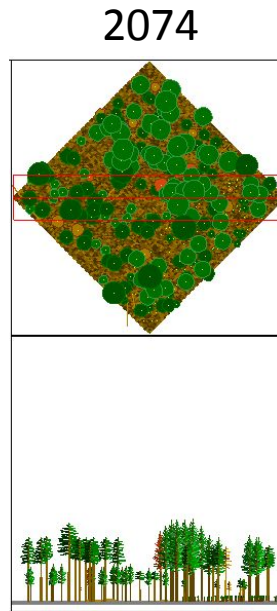
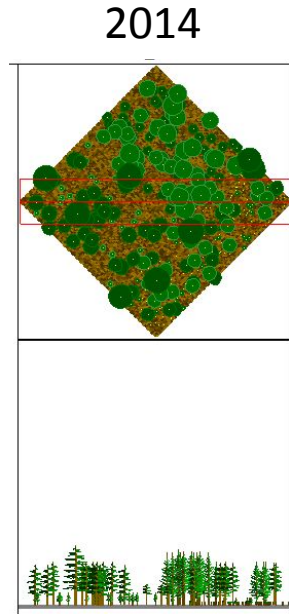
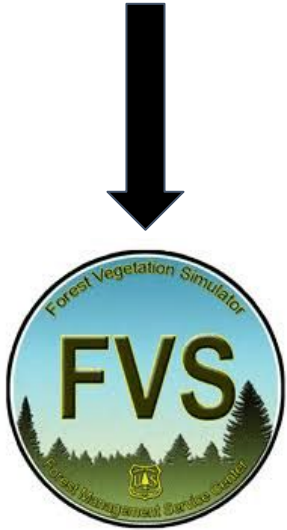


## LMM Growth Models



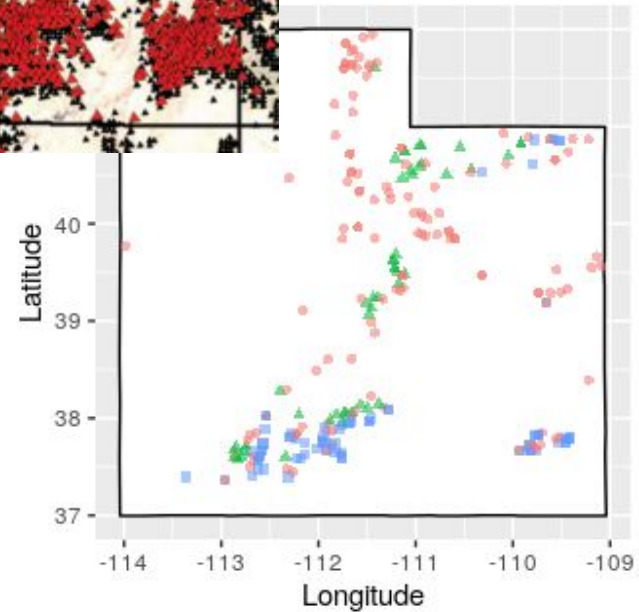
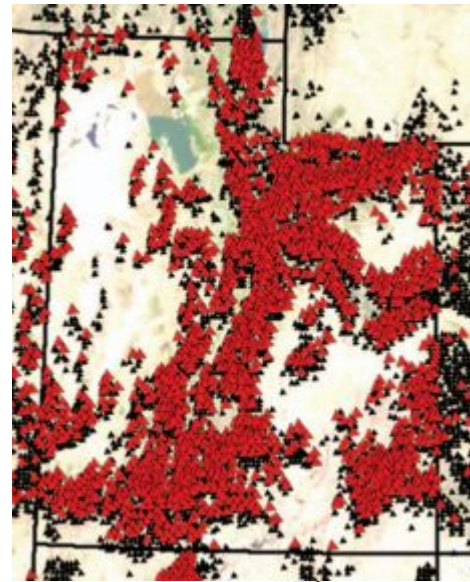


growth = f(tree, competition, site, **climate**)



# Next Steps...

- Choose final model for each species
- Model validation
- Sensitivity analysis
- Model verification



# Thank you!

Evans Lab:  
Emily Schultz  
Erin Riordan  
Kelly Heilman



Margaret Evans



Mark Castle



John  
Shaw



Justin DeRose



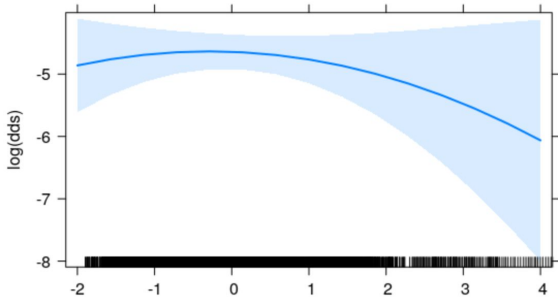
UA SCIENCE  
Laboratory of  
Tree-Ring Research

Ecology & Evolutionary Biology

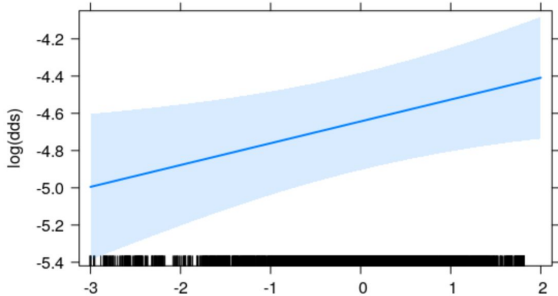


# Effects Plots for Douglas fir

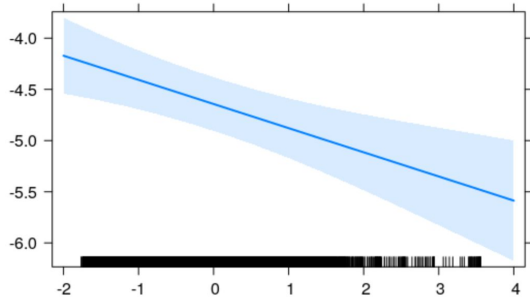
DBH



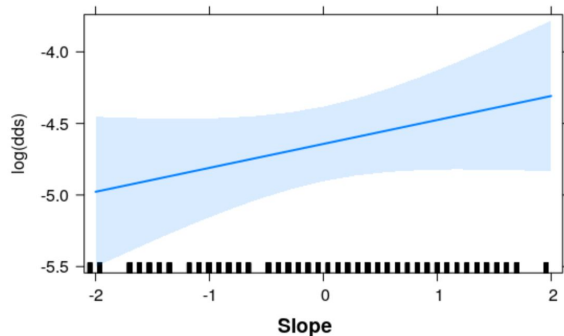
Crown Ratio



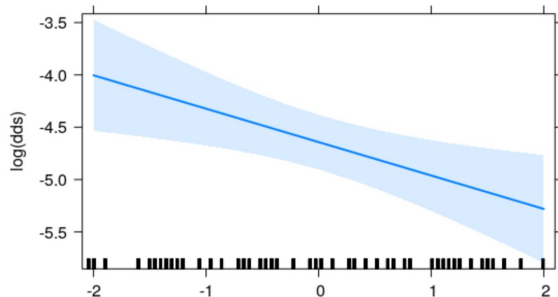
CCF



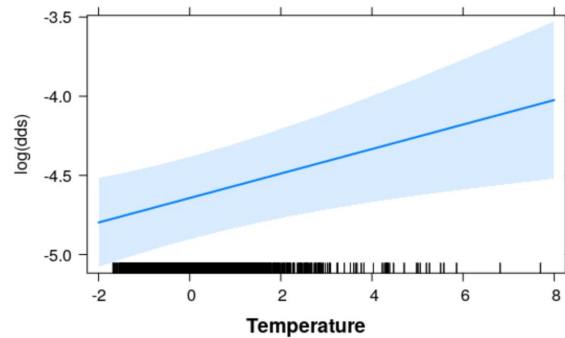
Site Index



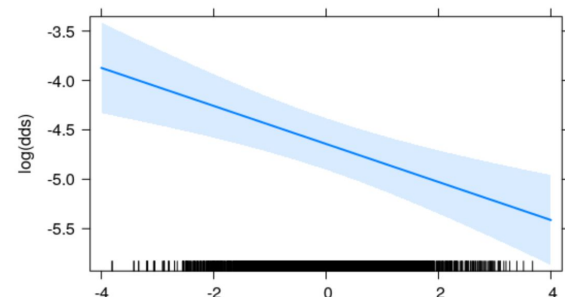
Slope



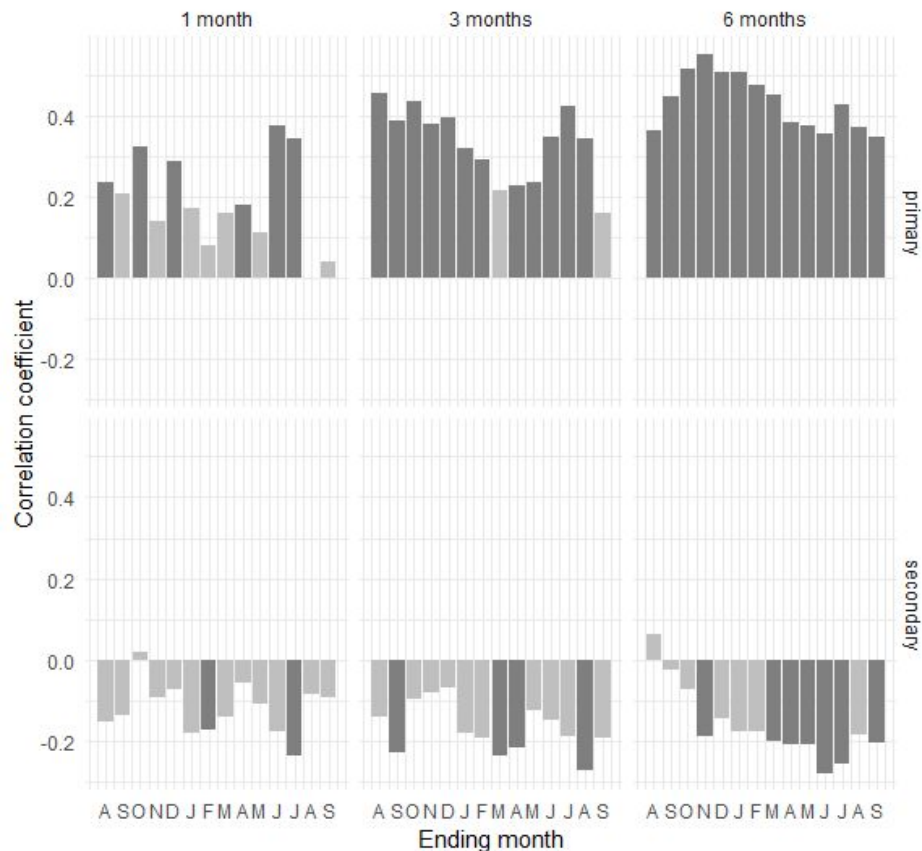
Precipitation



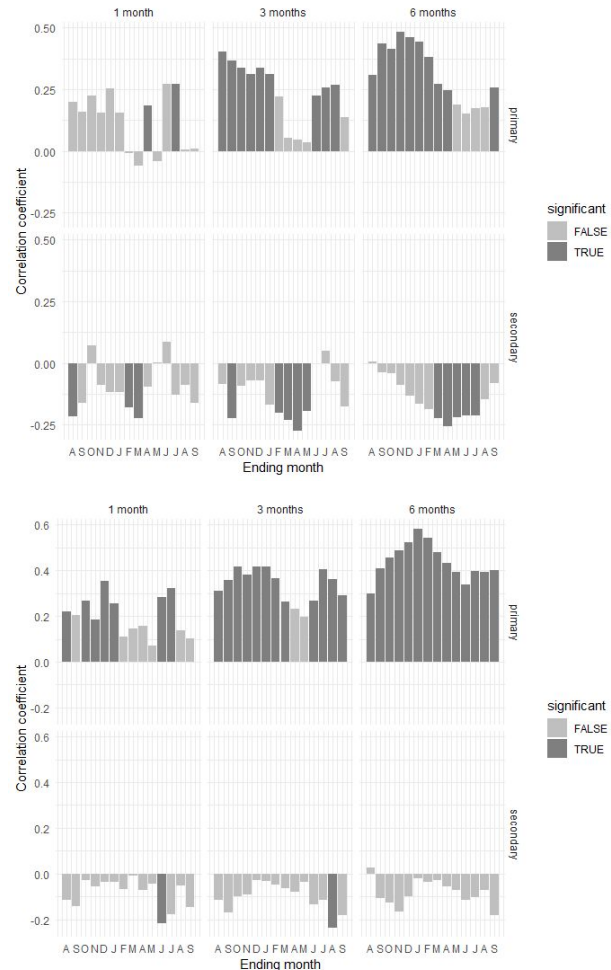
Temperature



# Climate-growth relationships



(Bunn 2008, Zang and Biondi 2015)



# Mixed Effect Model

- Non-independent observations
- LMM and GLMM used
  - Linear mixed-effects model (LMM)
  - Generalized linear mixed-effects model (GLMM)
    - Link function

