

The responses of forest species composition and biomass to climate change

Why

- Importance of forest ecosystems
- Forest responses to climate change are of major concern
- Uncertain future of global forests

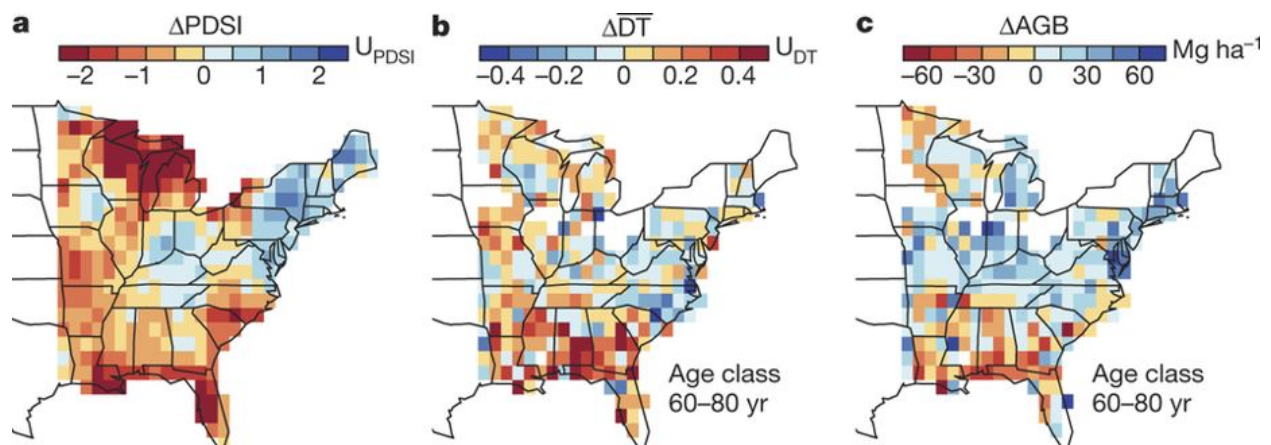
Questions

- How sensitive (or resilient) the forest ecosystems are to climate variability within ~3 decades?
 - Did forest species composition shift over the decades following the climate variability?
 - Did forest biomass or productivity respond to the climate variability over the decades?
 - Did forest biodiversity change over the decades following the climate variability?
- Does biodiversity affect forest resilience in responding to climate variability?
 - How to quantify biodiversity?
 - Which trait is the most important one whose diversity affects forest resilience?
- How to use phenology information to build predictive models of forest biomass or productivity?
 - Can phenology indicators reflect forest biomass change?
 - How do biodiversity and climate variability affect phenology indicators?
 - Is it necessary to design new phenology indicators to improve model's performance?

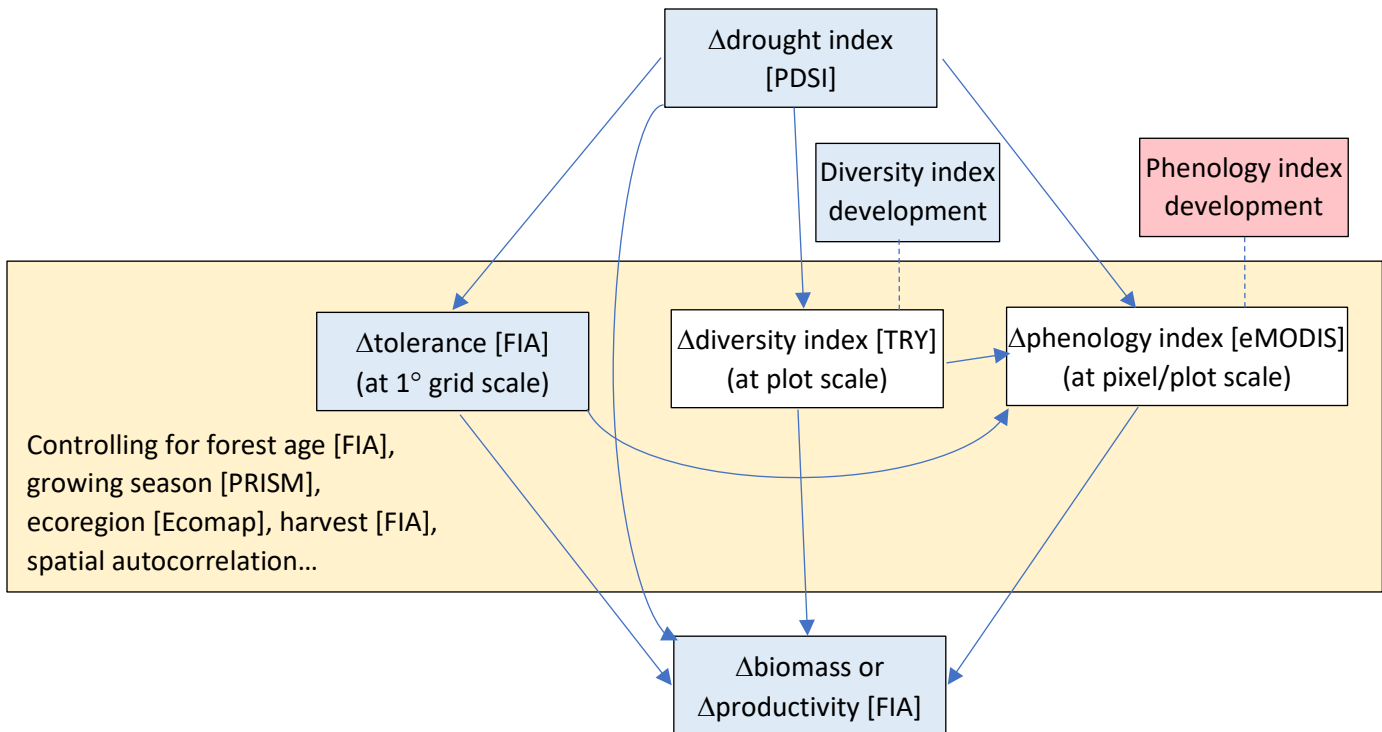
Data

- Forest inventory data (FIA – USFS): 9.92 GB in csv
- Historical climatic data (PRISM – Oregon State University): ? GB in raster bil
- Historical drought index data (PDSI – Princeton University): 143 GB in NetCDF
- Tree species trait data (TRY – Max Plank Institute): 4.23 GB in plain txt
- Phenological index data (eMODIS – USGS): 7.91 GB in raster bsq
- Ecoregion data (Ecomap – USFS): 36 MB in shp

Examples of change (more examples can be found at <https://tz05.github.io/climfor.html>):



Model framework



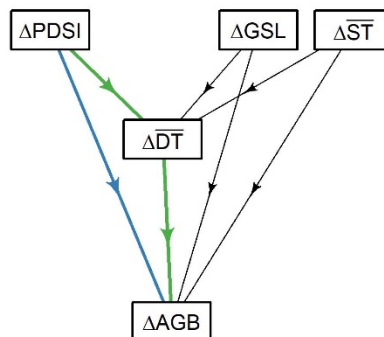
Methods

- Spatial regression modeling (with the “spautolm” function in the R “spdep” package), e.g.,





























$$\Delta \text{biomass} = a_0 \mathbf{1} + a_1 \Delta \text{drought index} + a_2 \Delta \text{tolerance} + a_3 \Delta \text{growing season} + \dots + \mathbf{u}$$

where the bold terms are vectors (change of specific variable over decades) for the grids (inventory plots are aggregated into 1° grids); \mathbf{u} is a vector of spatially autocorrelated errors.

- Structural equation modeling (with the “sem” function in the R “lavaan” package), e.g.,



- Mixed models (with the “nlme” function in the R “nlme” package)

- | n | CFD | FRic | FEve | FDiv | FDIs | Rao's Q | |
|---|---|---|---|---|---|---|---------|
|  | -0.036 | 0.620*** | 0.012 | -0.089*** | 0.158*** | 0.182*** | n |
|  |  | 0.557*** | 0.114*** | 0.180*** | 0.823*** | 0.752*** | CFD |
|  |  |  | -0.194*** | 0.123*** | 0.663*** | 0.719*** | FRic |
|  |  |  |  | 0.026 | -0.220*** | -0.305*** | FEve |
|  |  |  |  |  | 0.207*** | 0.128*** | FDiv |
|  |  |  |  |  |  | 0.962*** | FDis |
|  |  |  |  |  |  |  | Rao's Q |

