

# Using State-and-Transition Simulation Models to Guide Sustainable Management of Ecosystems: Three Case Studies from across the US



**Brian Miller**, Colorado State University (North Central CSC)

**Jennifer Costanza**, North Carolina State University (Southeast CSC)

**Megan Creutzburg**, Portland State University (Northwest CSC)

# Outline

- Overview of State-and-Transition Modeling
- Climate Change

# Outline

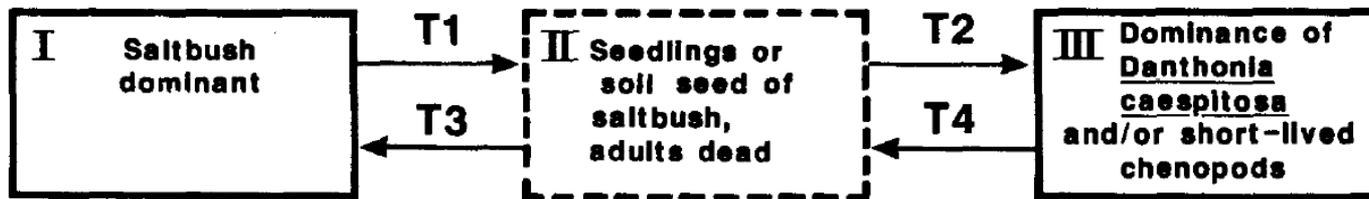
- Overview of State-and-Transition Modeling
- Climate Change
- Whitebark Pine
  - Combining STSMs and Species Distribution Models
- Longleaf Pine
  - Modeling effects of climate change, urbanization, & fire
- Rangeland Condition and Greater Sage-Grouse
  - Integrate STSMs, Species Distribution Models, and a Dynamic Global Vegetation Model

# Case Studies



# State-and-Transition Models

- Conceptual Models
  - Represent groups of vegetation communities and shifts between them (Westoby et al. 1989)



Source: Example from Westoby et al. (1989)

# State-and-Transition Models

## States

- Suites of veg. communities
  - Cover type, structural stage, age
- Based on objectives
- Limited by data

# State-and-Transition Models

## States

- Suites of veg. communities
  - Cover type, structural stage, age
- Based on objectives
- Limited by data

## Transitions

- Key processes influencing vegetation
- Natural (e.g., succession, fire, drought, dispersal)
- Anthropogenic (e.g., grazing, planting, urbanization)

# State-and-Transition Simulation Models

- State-and-Transition Models
  - Conceptual models representing groups of vegetation communities and shifts between them (Westoby et al. 1989)

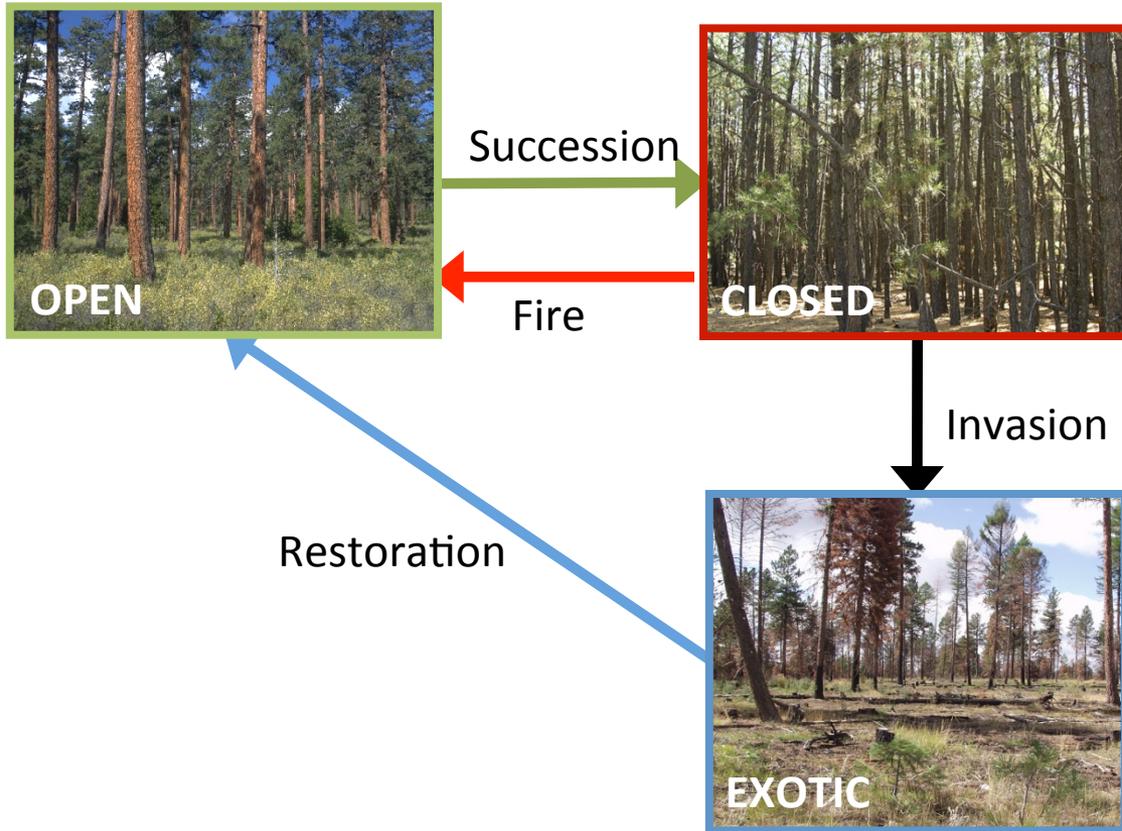
# State-and-Transition Simulation Models

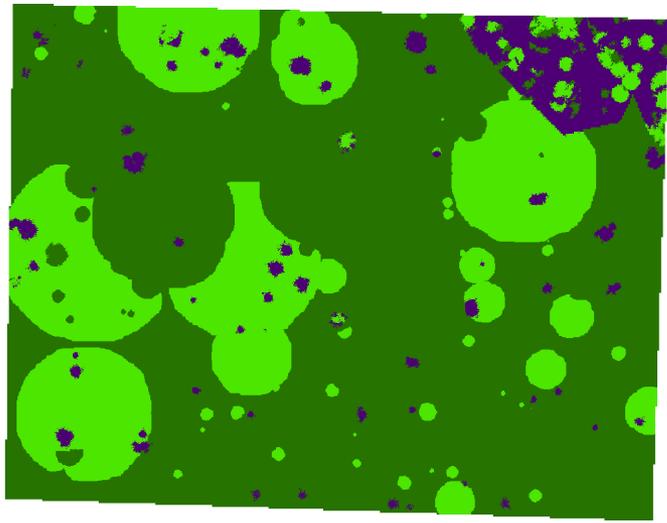
- State-and-Transition Models
  - Conceptual models representing groups of vegetation communities and shifts between them (Westoby et al. 1989)
- Simulations
  - Computer-based prototype of real world
  - Complexity: thresholds, secondary effects, emergent patterns
  - Virtual Laboratory: “What if” Scenarios

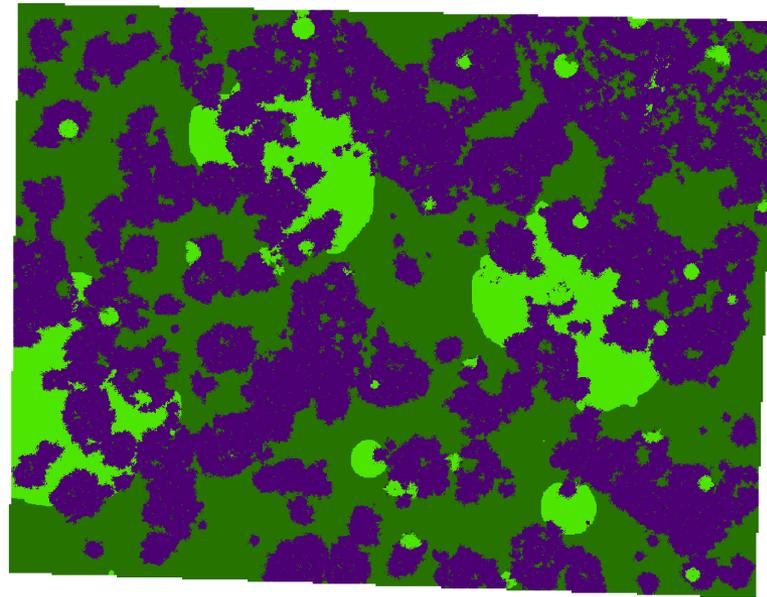
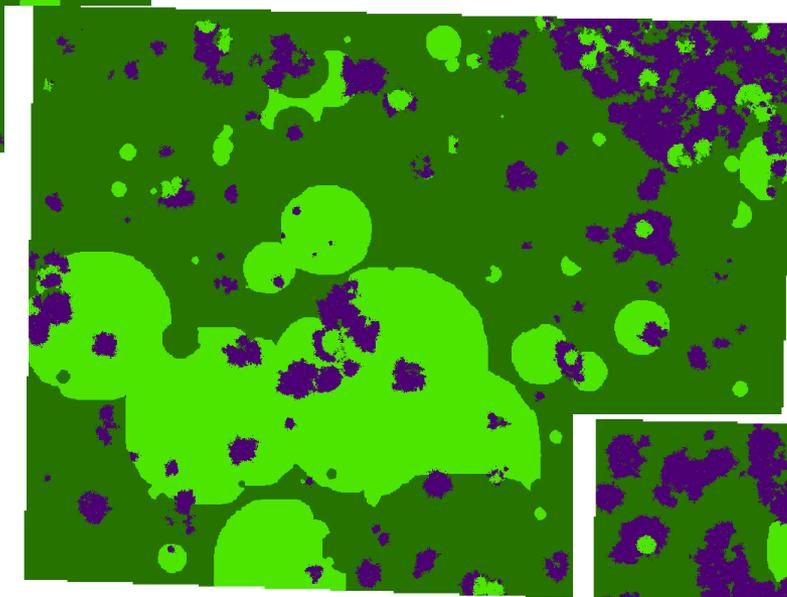
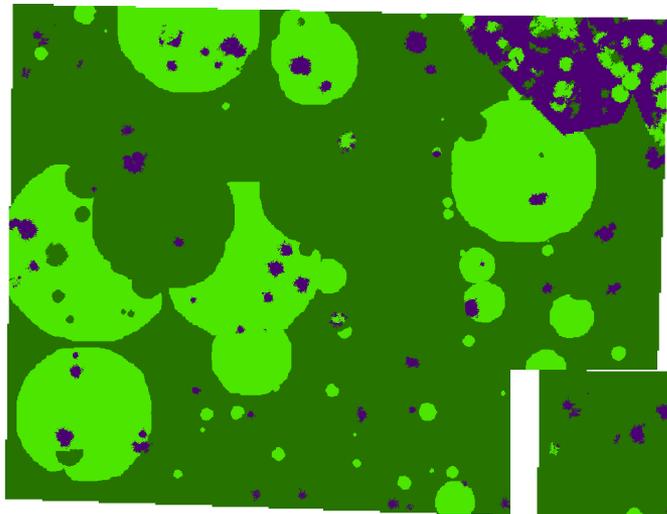
# State-and-Transition Simulation Models

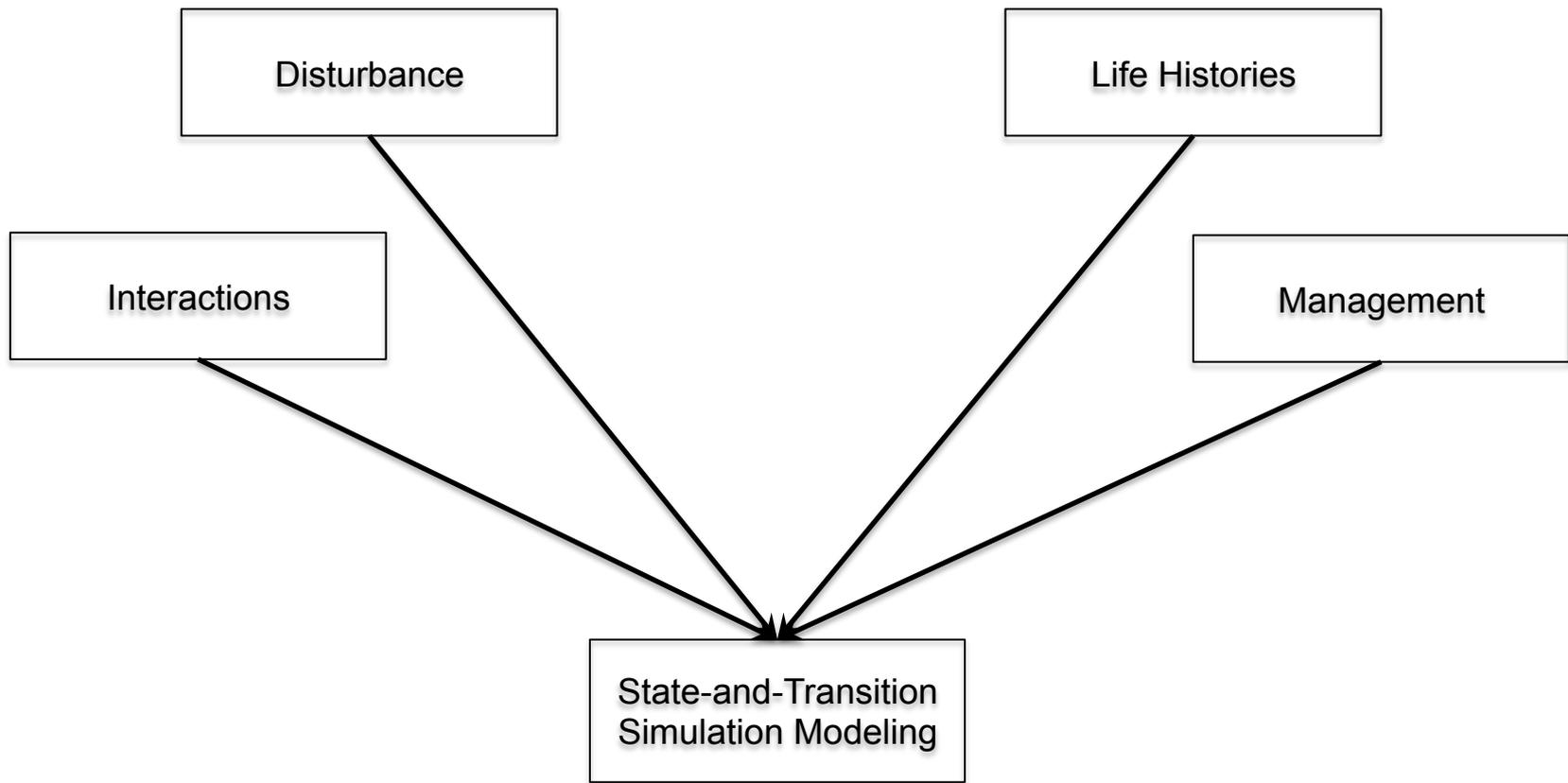
- State-and-Transition Models
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- Simulations
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  - Complexity: thresholds, secondary effects, emergent patterns
  - Virtual Laboratory: “What if” Scenarios
- STSMs: State-and-Transition Simulation Models
  - Temporally dynamic, spatially explicit
  - Biotic interactions, disturbance, and management scenarios

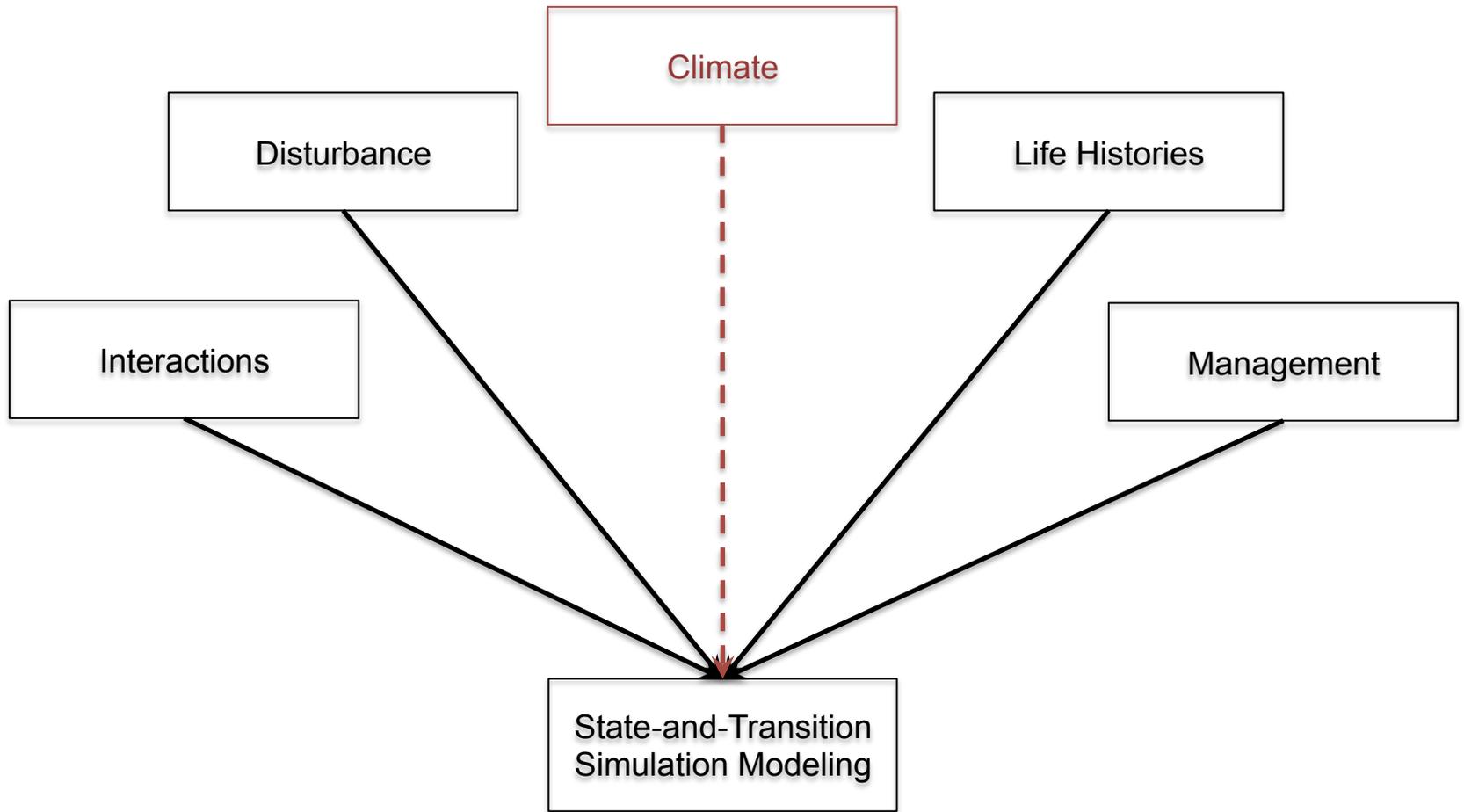
# Example Model











Climate

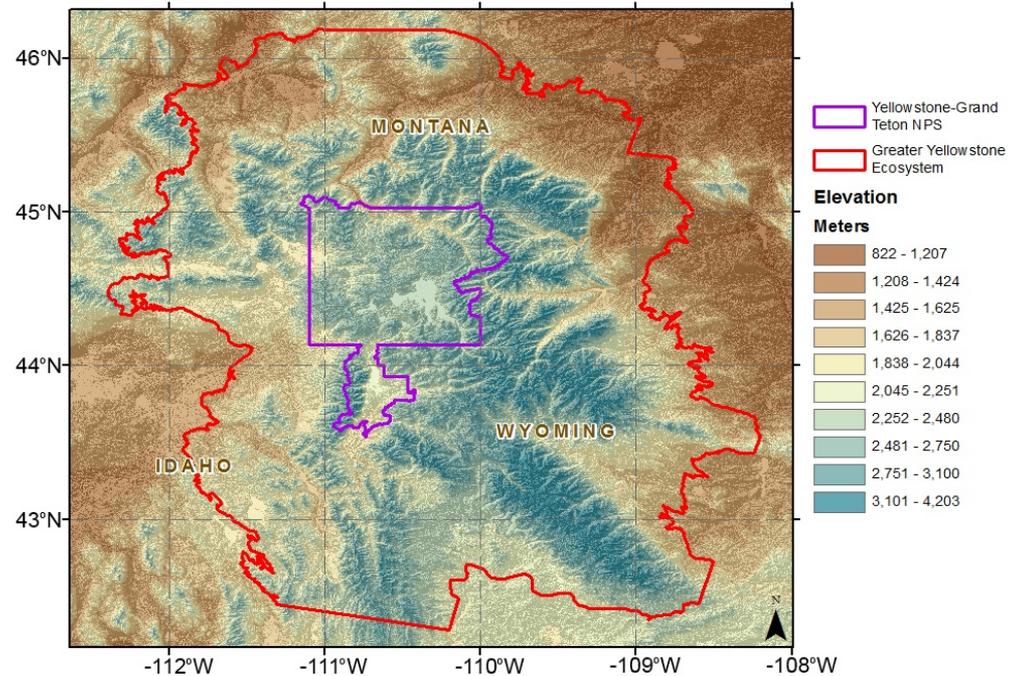
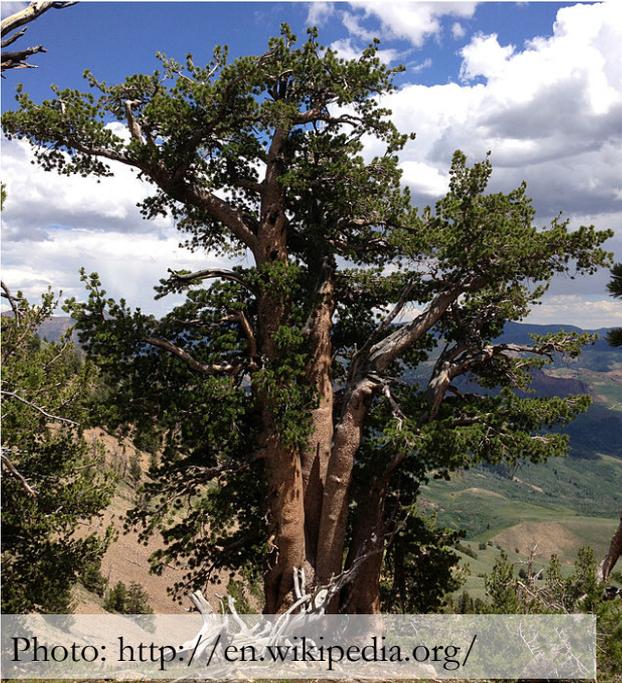


State-and-Transition  
Simulation Modeling

# Case Studies



# Case Study #1: Whitebark Pine



Brian Miller  
Colorado State University



Leonardo Frid, Tony Chang, Nathan Piekielek, Andy Hansen, Jeff Morisette



# Whitebark Pine (*Pinus albicaulis*)

- Keystone species
- Listed candidate species



Photo: <http://en.wikipedia.org/>



Photo: Jesse Logan

# Whitebark Pine (*Pinus albicaulis*)



Photo: [www.fs.fed.us/](http://www.fs.fed.us/)



Photo: Wilson Kern ([nrdc.org/](http://nrdc.org/))

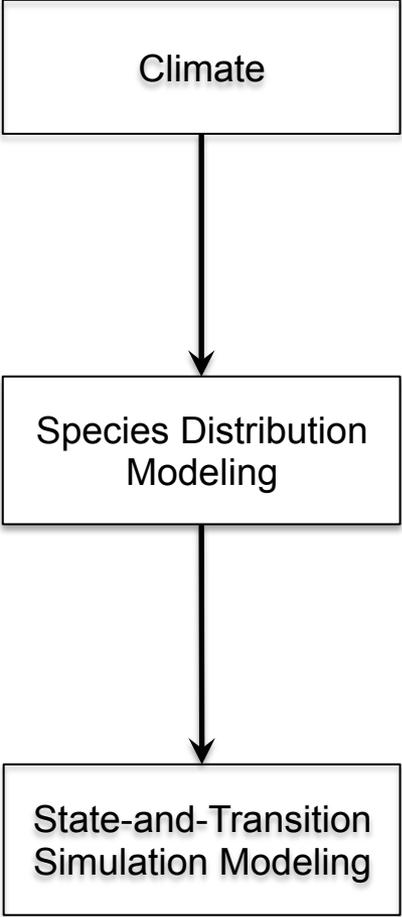


Photo: [switchboard.nrdc.org/](http://switchboard.nrdc.org/)

Climate



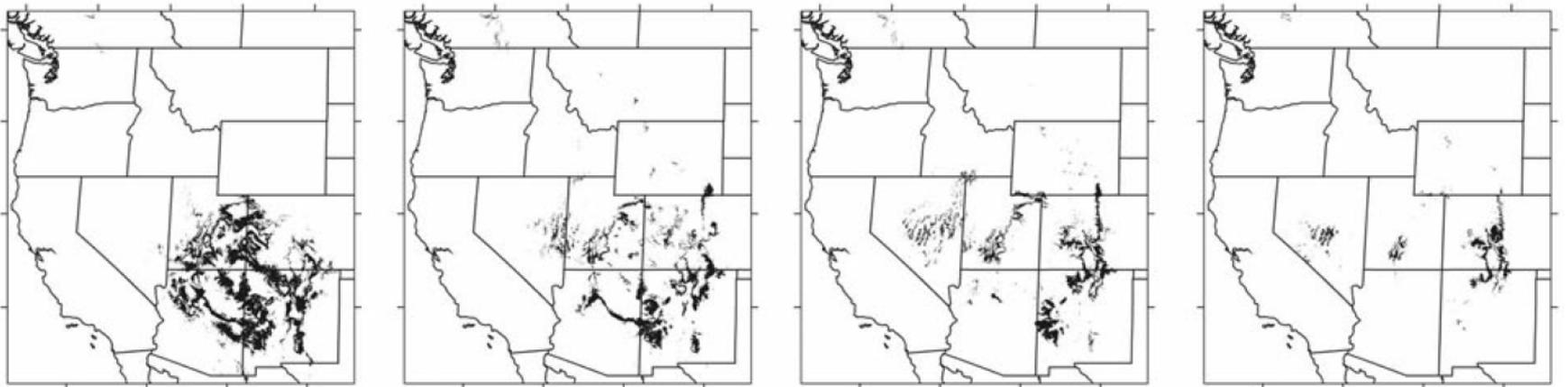
State-and-Transition  
Simulation Modeling



# Background: Species Distribution Modeling

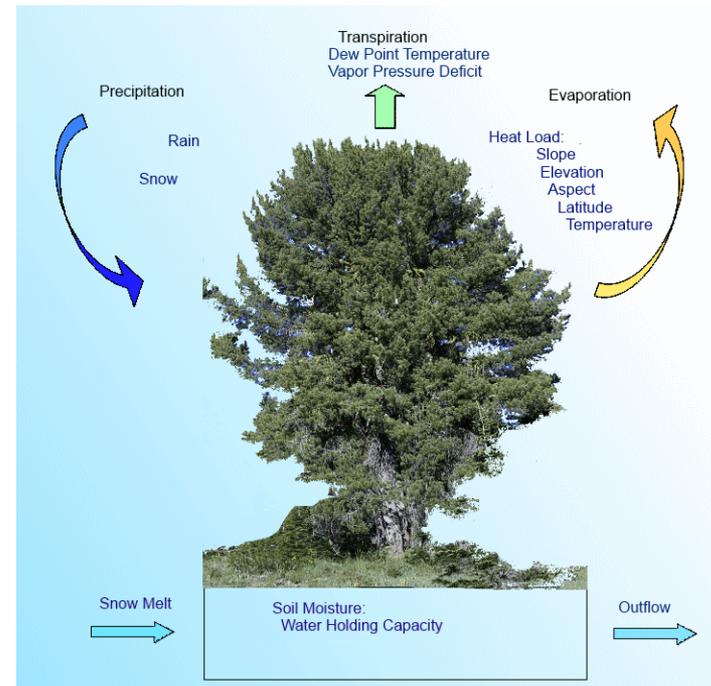
- Correlative model of abiotic variables and species occurrence
- Does not project species distributions, but models projected suitable climates

*Pinus edulis*



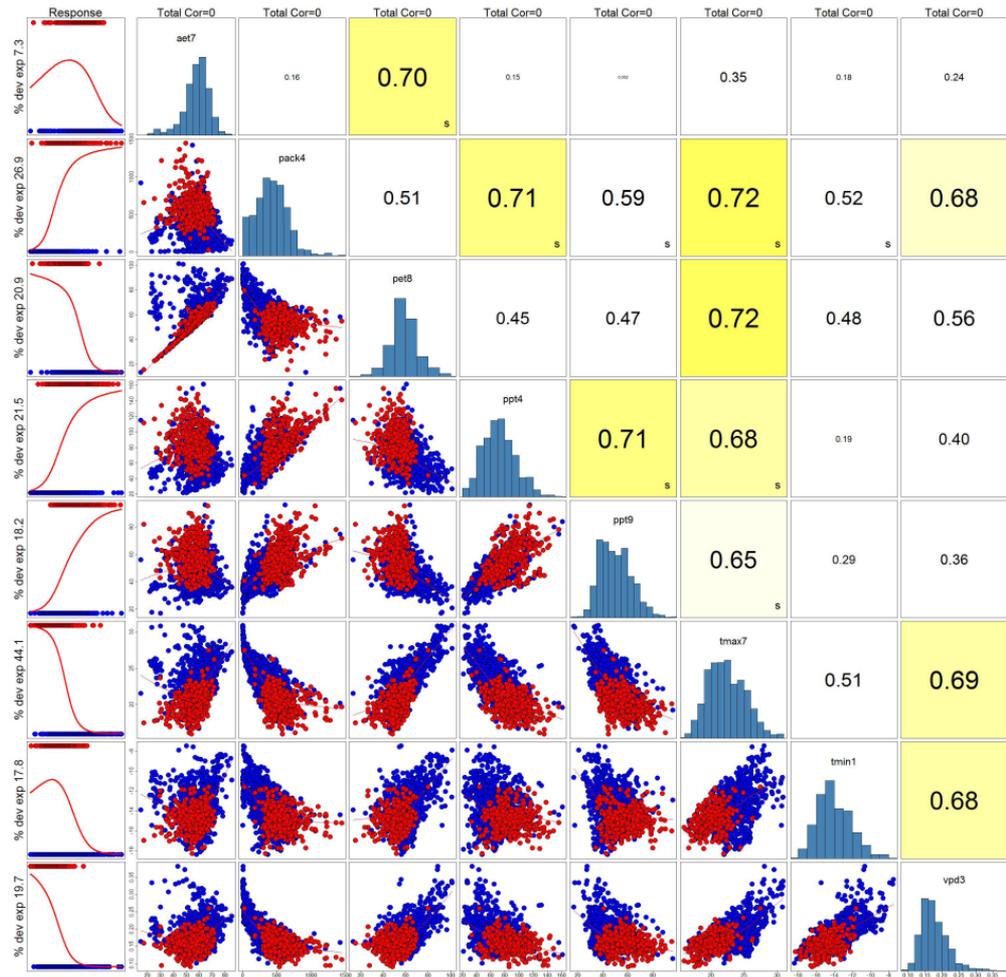
# Methods: Predictor Data

- Historic Climate Data
  - PRISM 800m climate
    - (Daly et al. 2011)
  - Monthly
  - Summarized using 1950-1980 means
- Water Balance Modeling
  - 10 additional metrics



# Methods: Predictor Selection

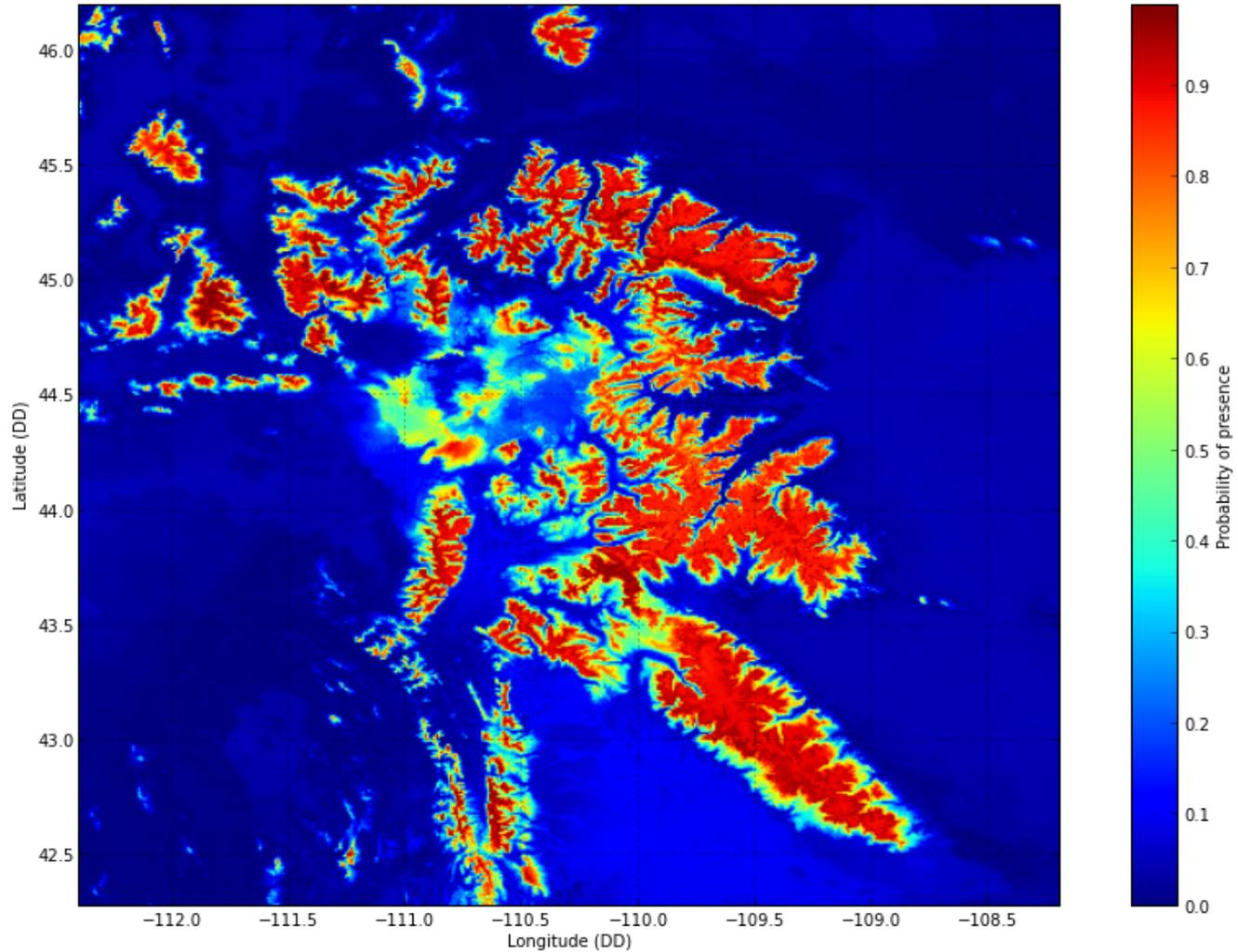
- 122 predictor covariates
- Suite considering ecologically meaningful predictors



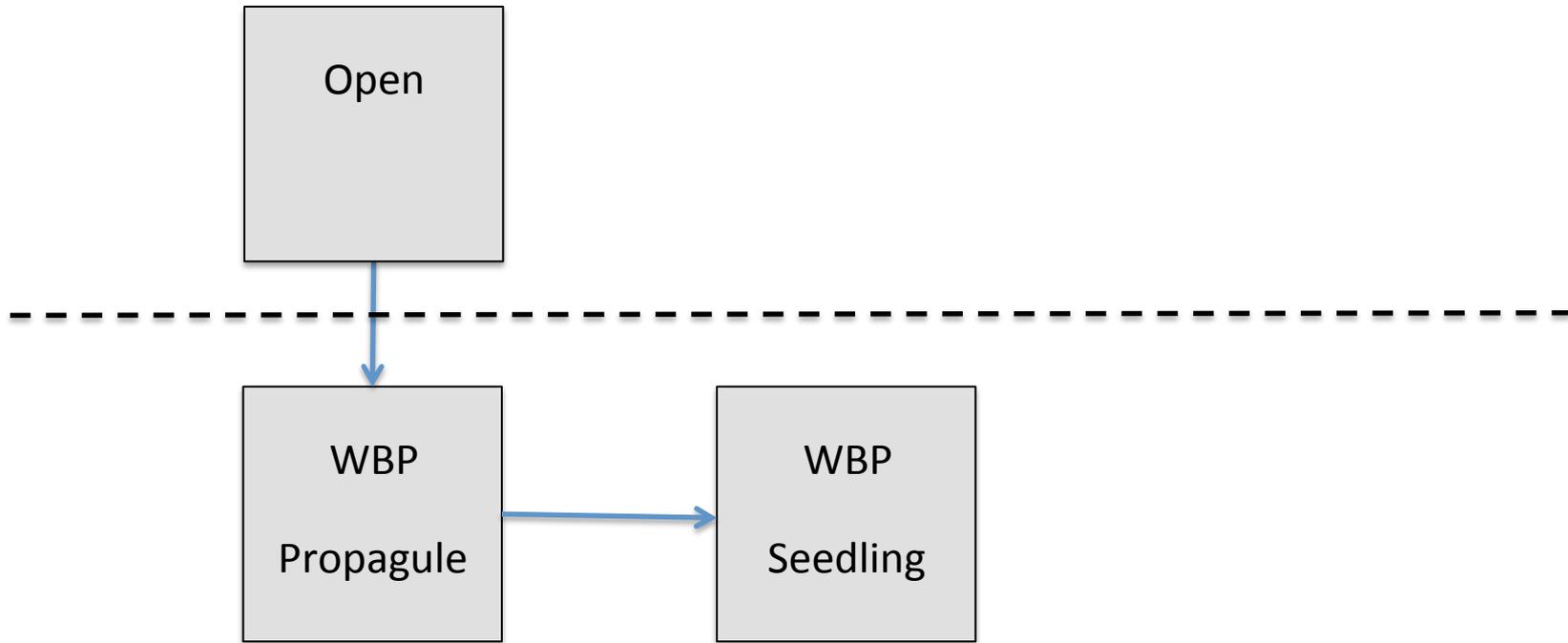
# Methods: Model Algorithm

- Random Forest
- Historic runs: 1950-2010
- Projections: 2010-2100
  - RCP 4.5, 8.5
  - GCMs: CNRM-CM5, HadGEM2-AO

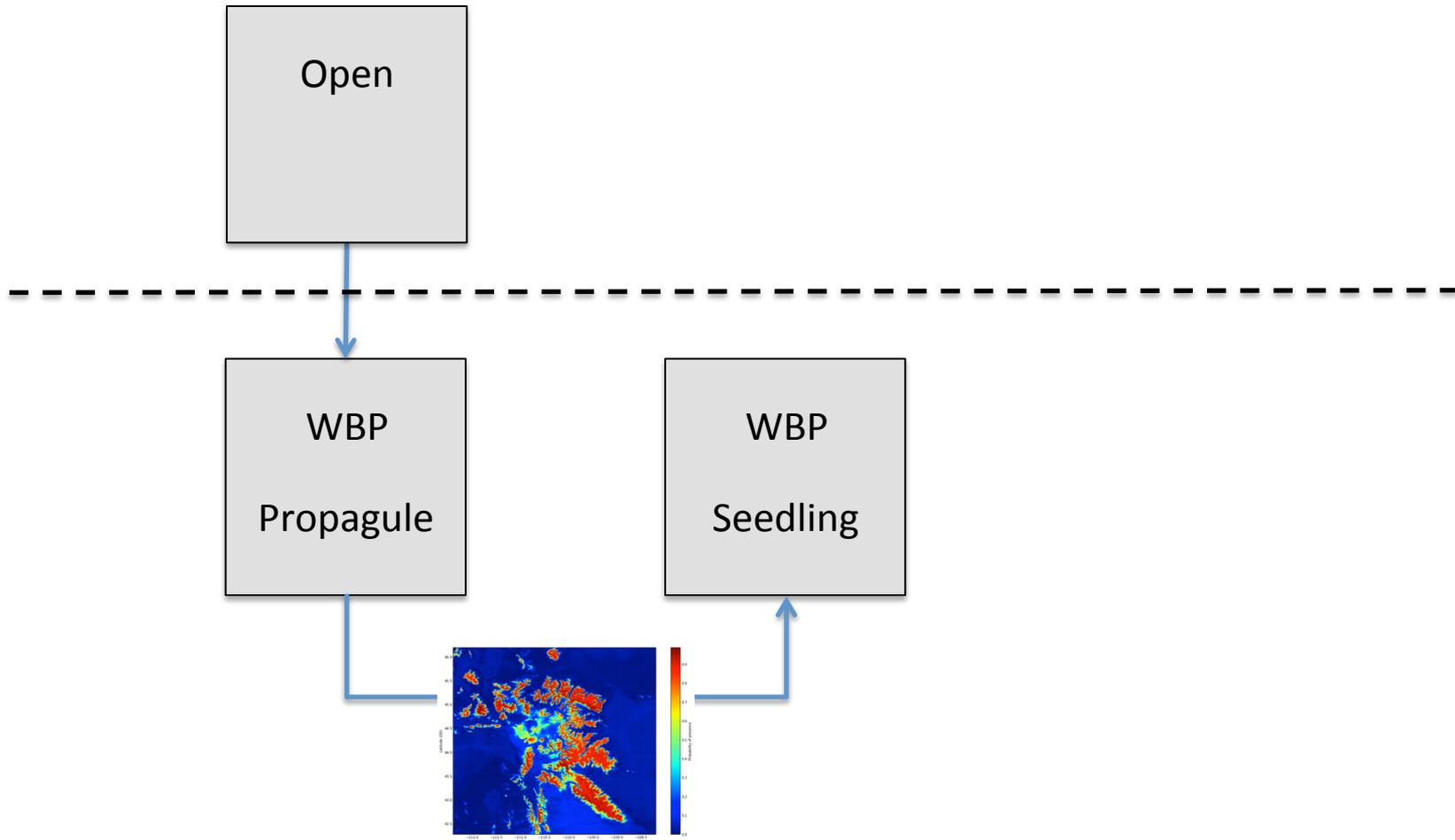
# Species Distribution Model Results



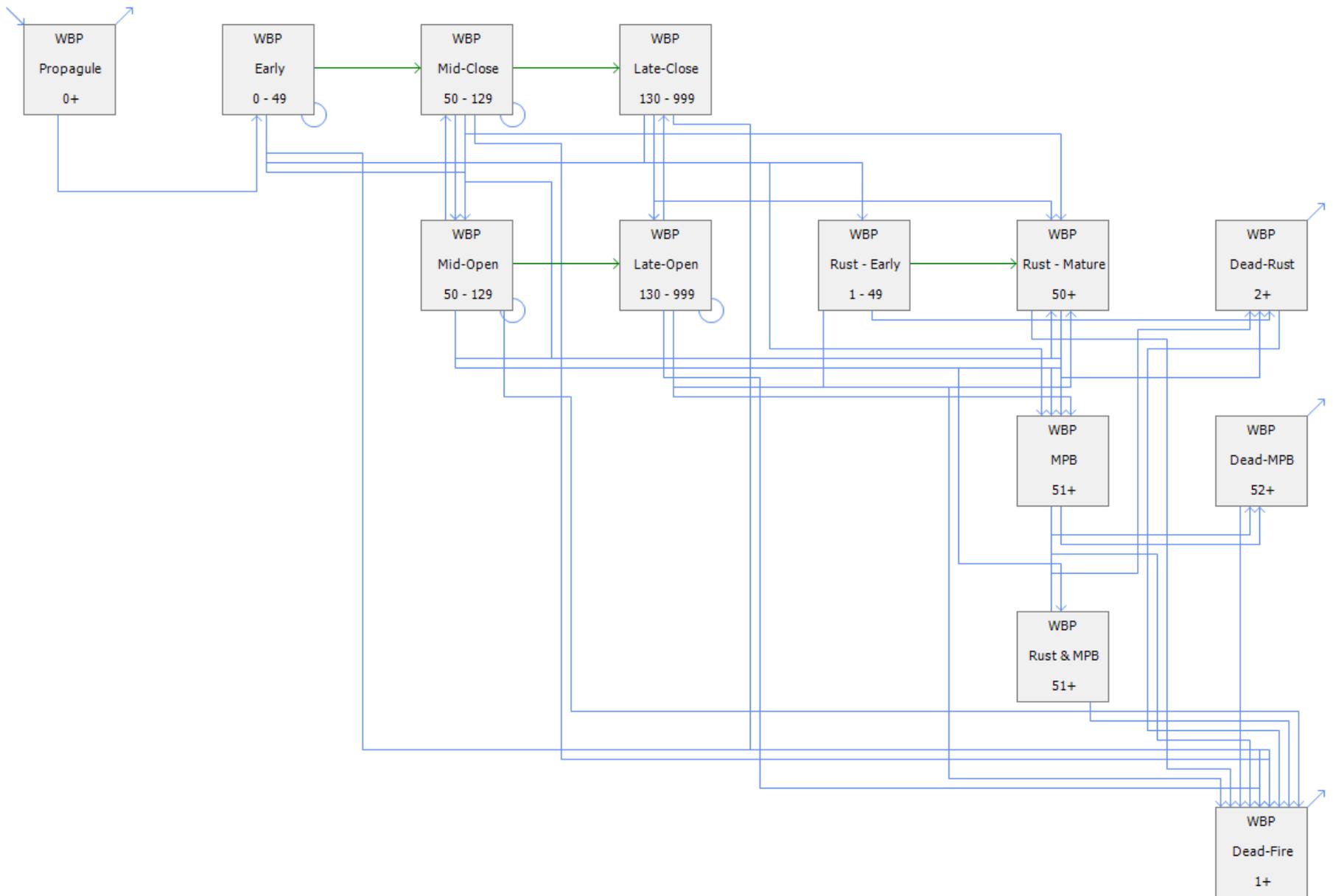
# Basic Structure of State-and-Transition Simulation



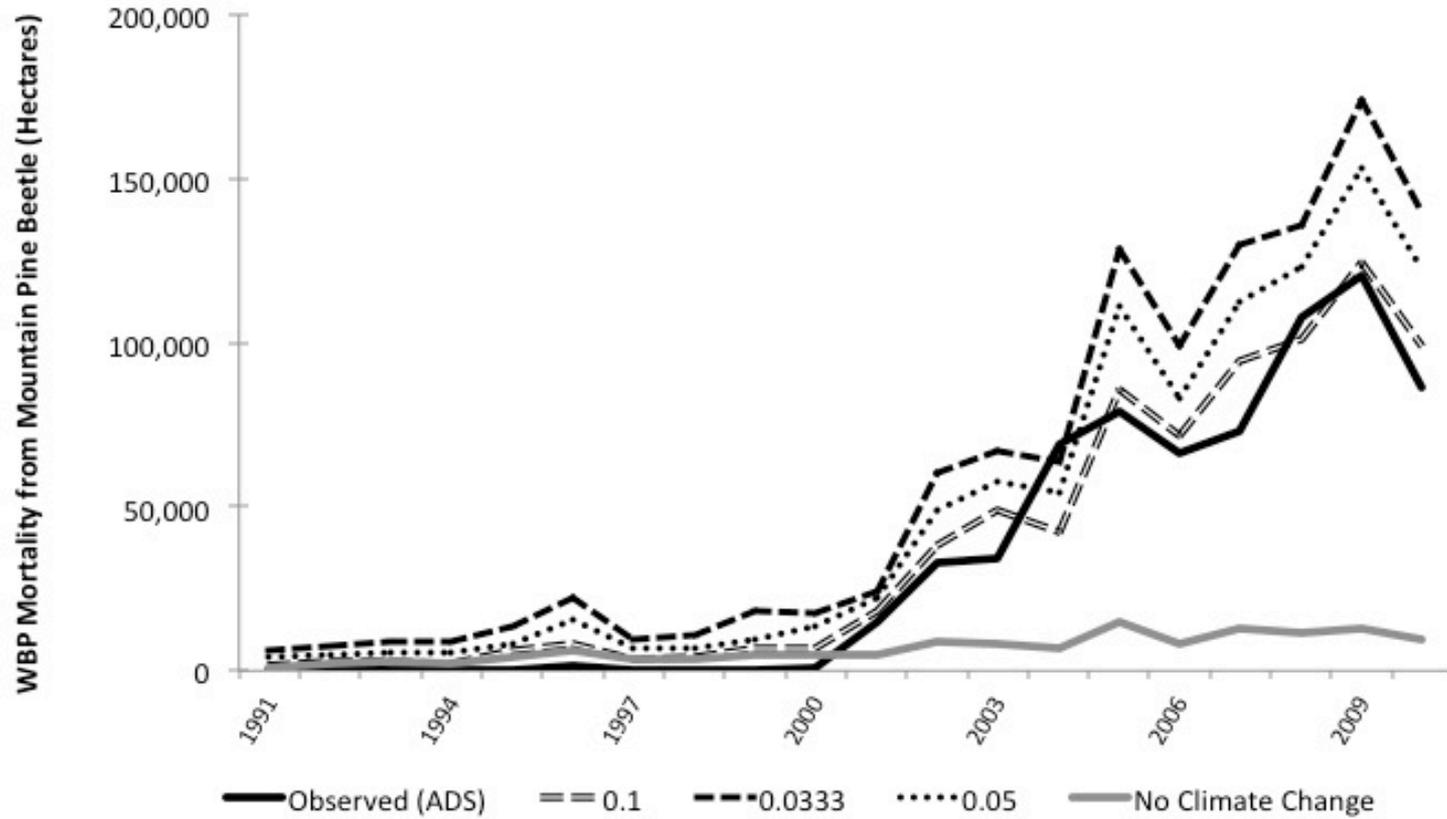
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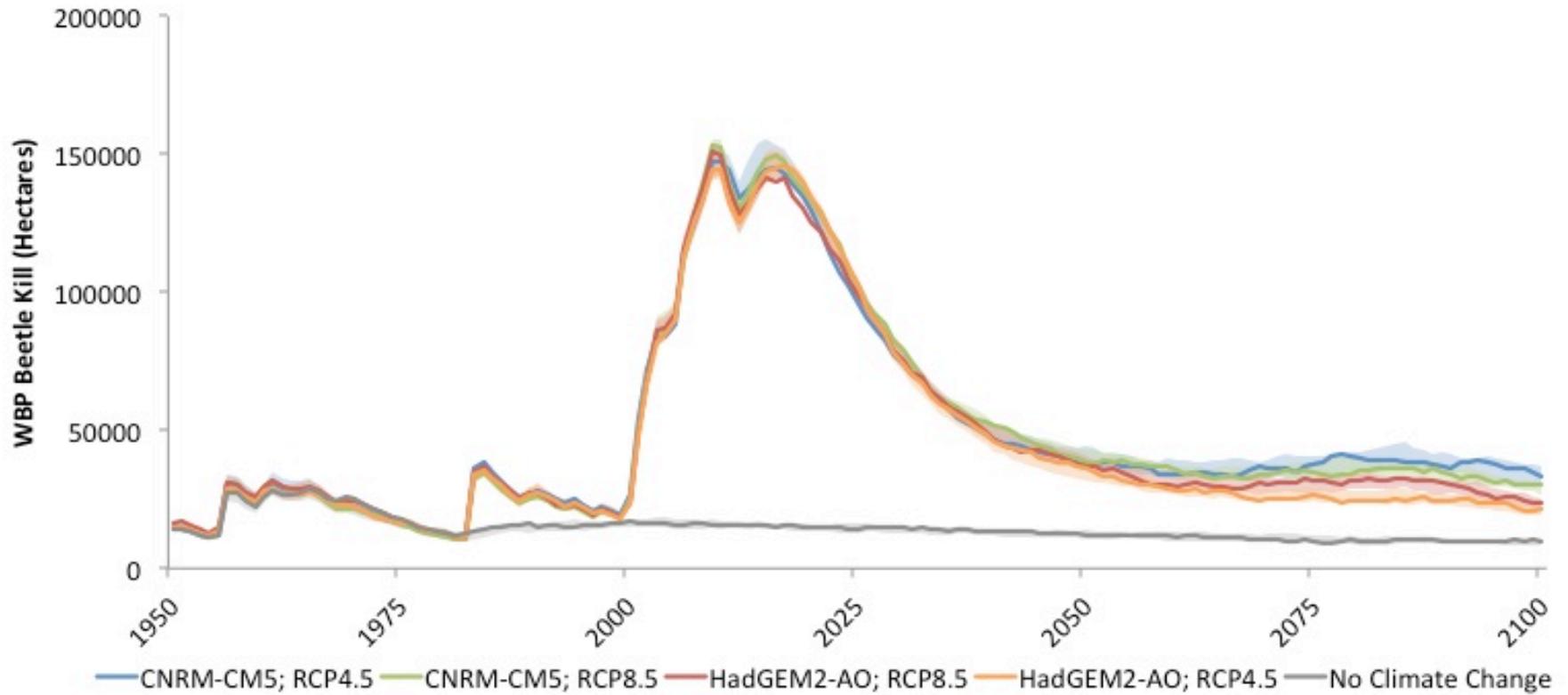
Spatial Multiplier = Habitat Suitability



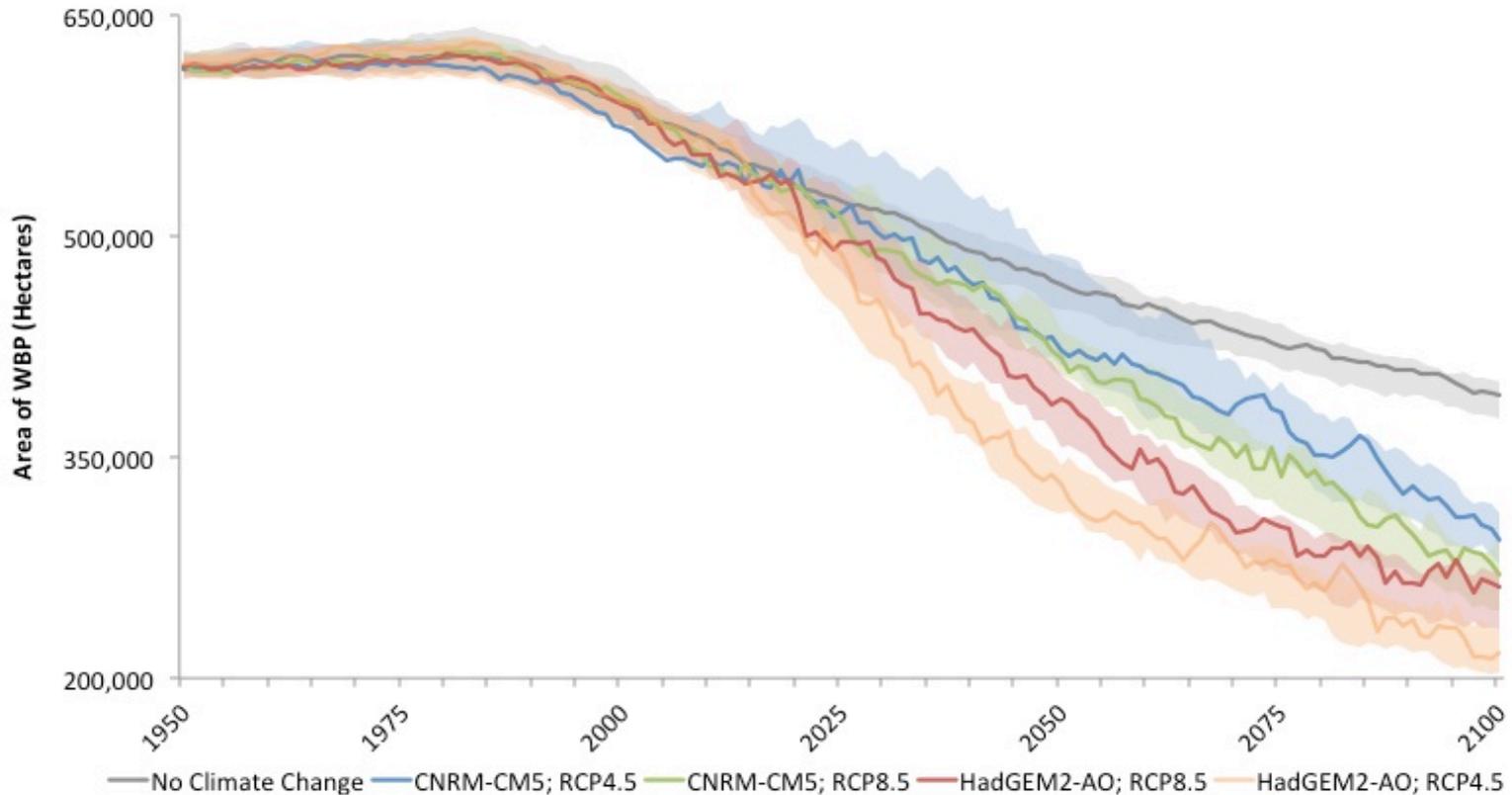
# Validation



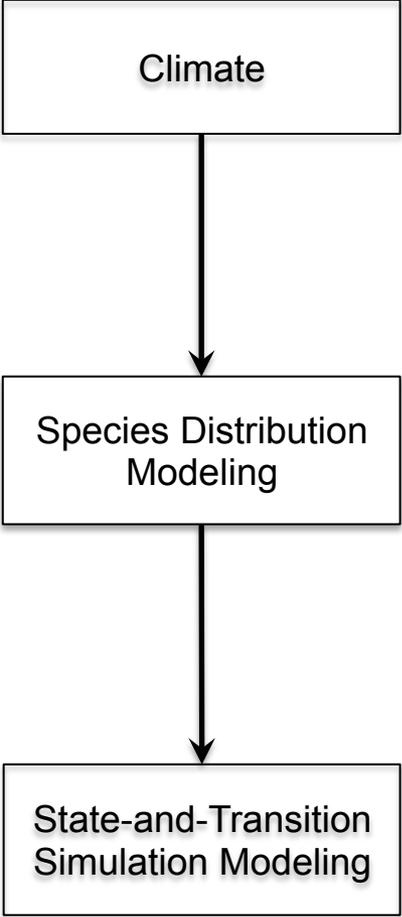
# Results

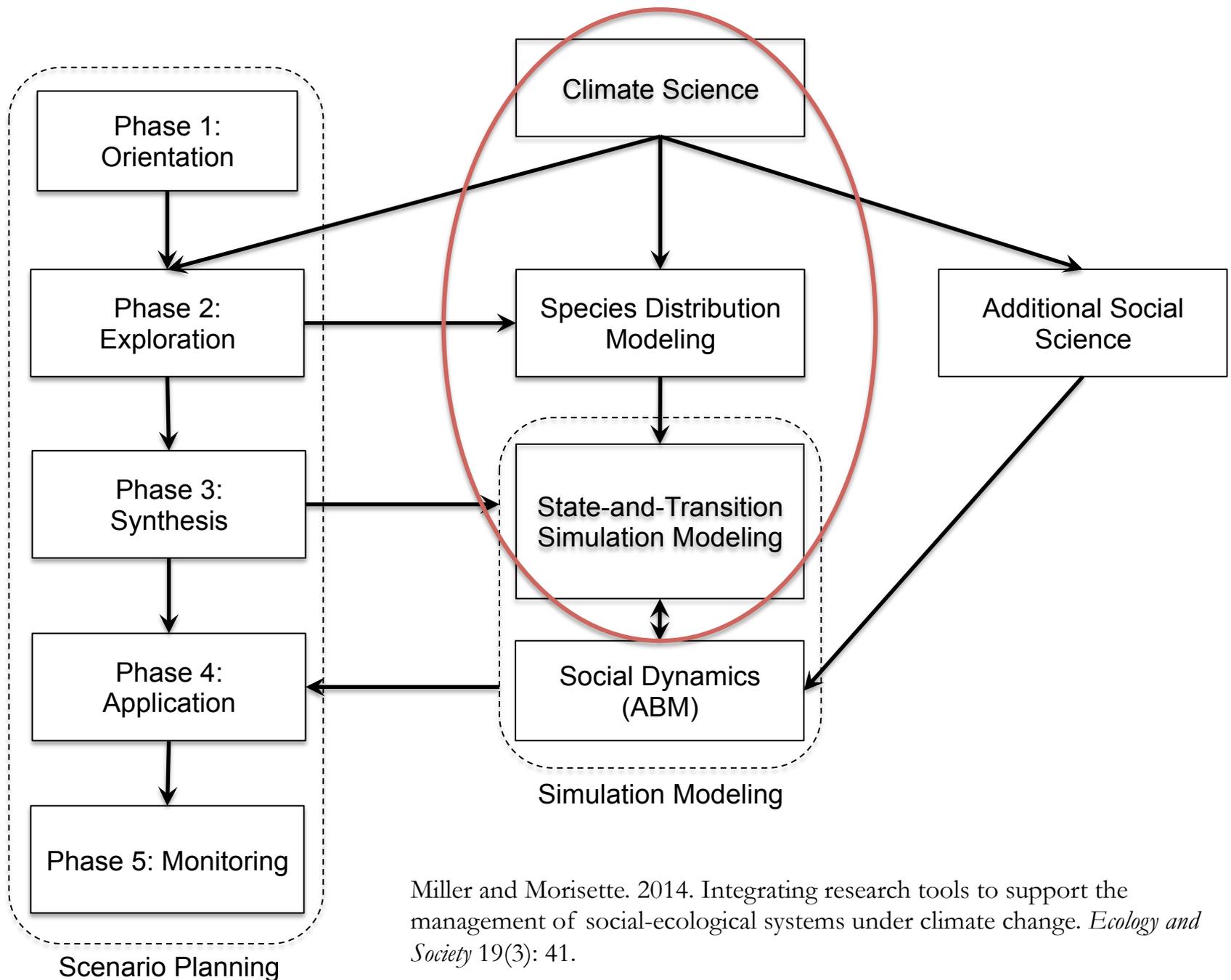


# Results



Miller, BW, L Frid, T Chang, N Piekielek, AJ Hansen, JT Morisette. Forthcoming. Combining state-and-transition simulations and species distribution models to anticipate the effects of climate change. *AIMS Environmental Science*.



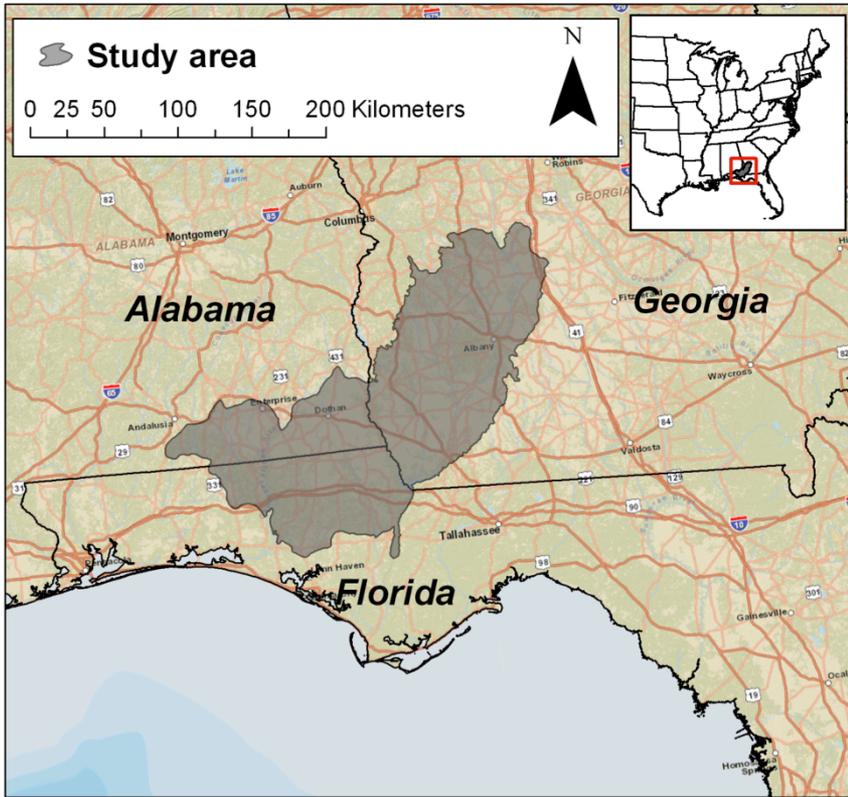


Miller and Morisette. 2014. Integrating research tools to support the management of social-ecological systems under climate change. *Ecology and Society* 19(3): 41.

# Outline

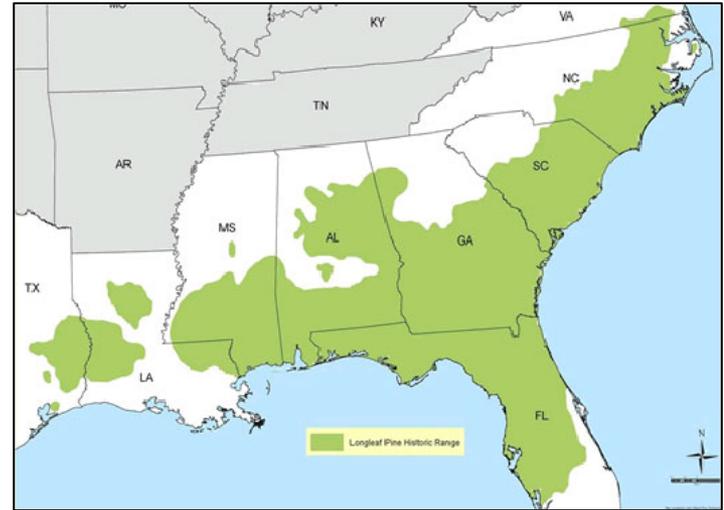


# Case Study #2: Longleaf Pine



Jennifer Costanza  
North Carolina State University

# The longleaf pine ecosystem



# Conservation goals and strategies for longleaf

## America's Longleaf report (2009)

Increase the total area of longleaf  
by 135%

Double the area of open longleaf

Focus on maintaining open  
stands

Also improve and restore  
degraded stands

**Range-Wide  
Conservation Plan  
for Longleaf Pine**

Prepared by the  
Regional Working Group  
for *America's Longleaf*

**AMERICA'S  
LONGLEAF**  
A Restoration Initiative for the Southern Longleaf Pine Forest

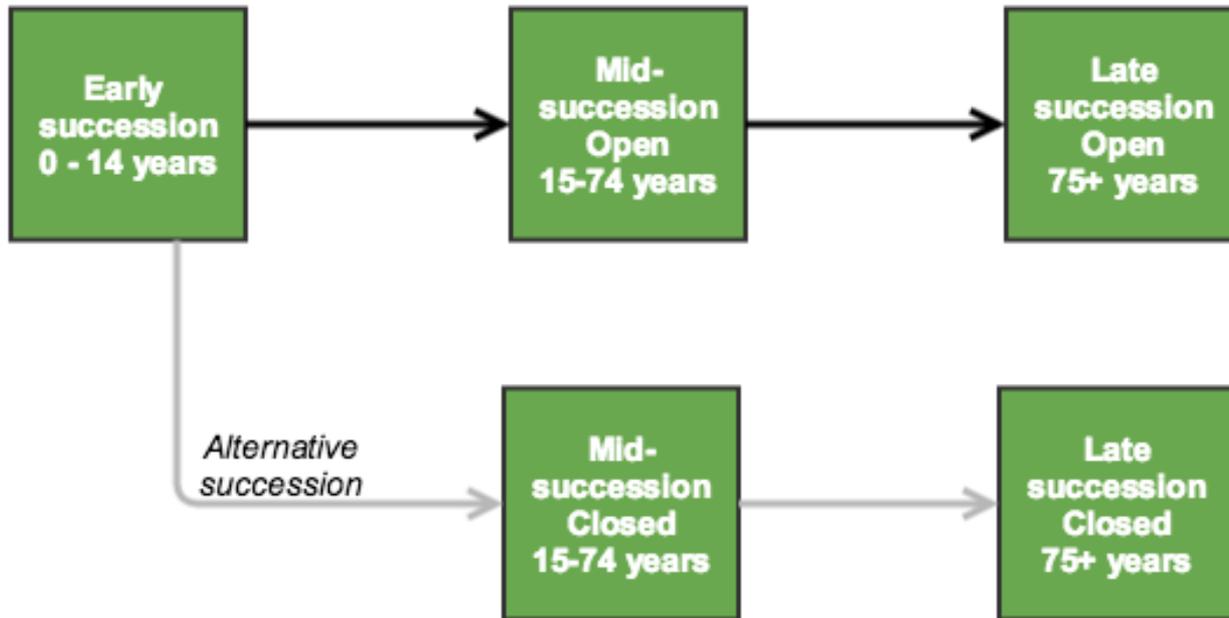
03.19.2009

# Research question

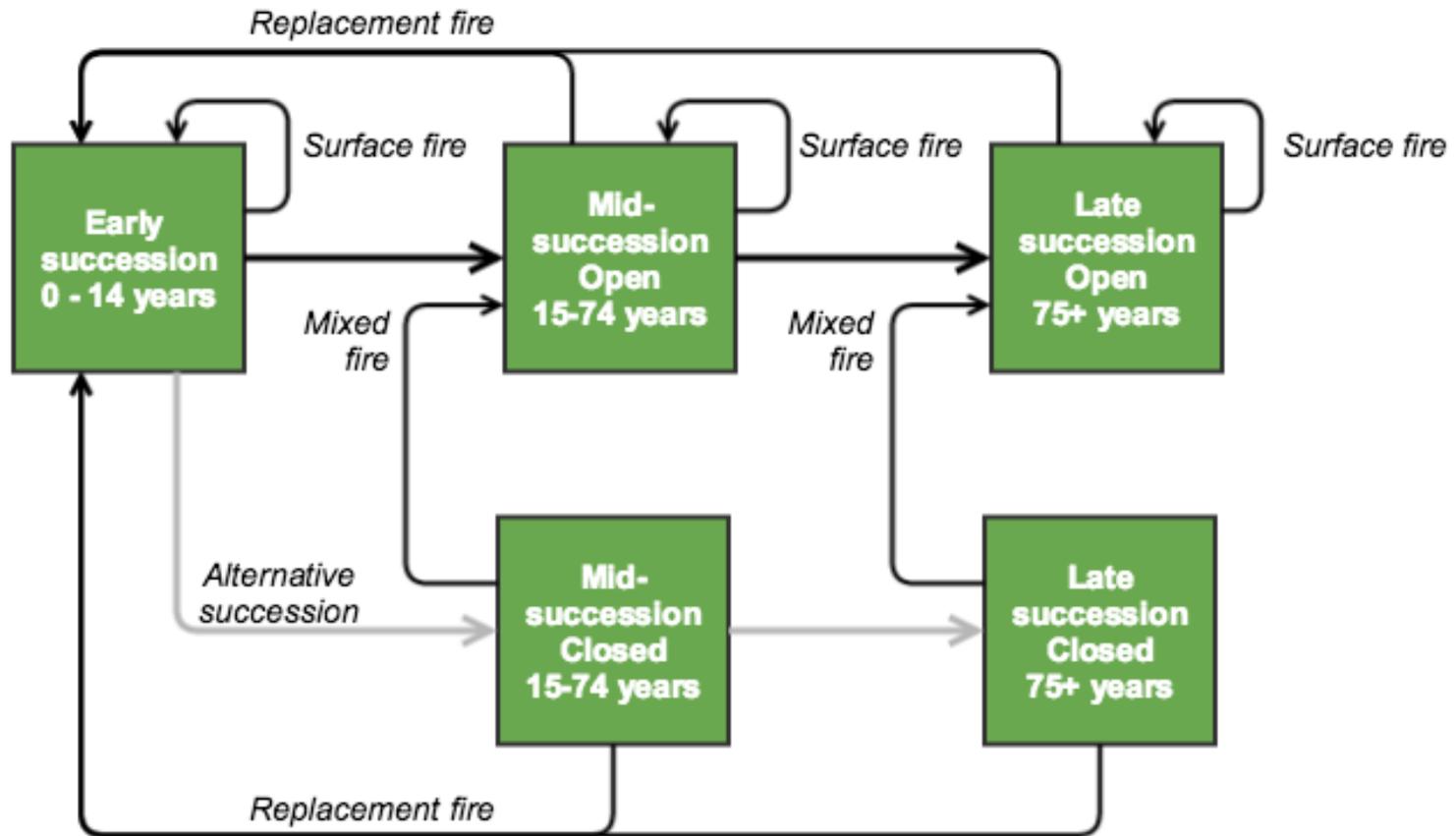
Over the next century, will conservation goals for longleaf be met under scenarios of:

- Climate change
- Urbanization
- Potential management

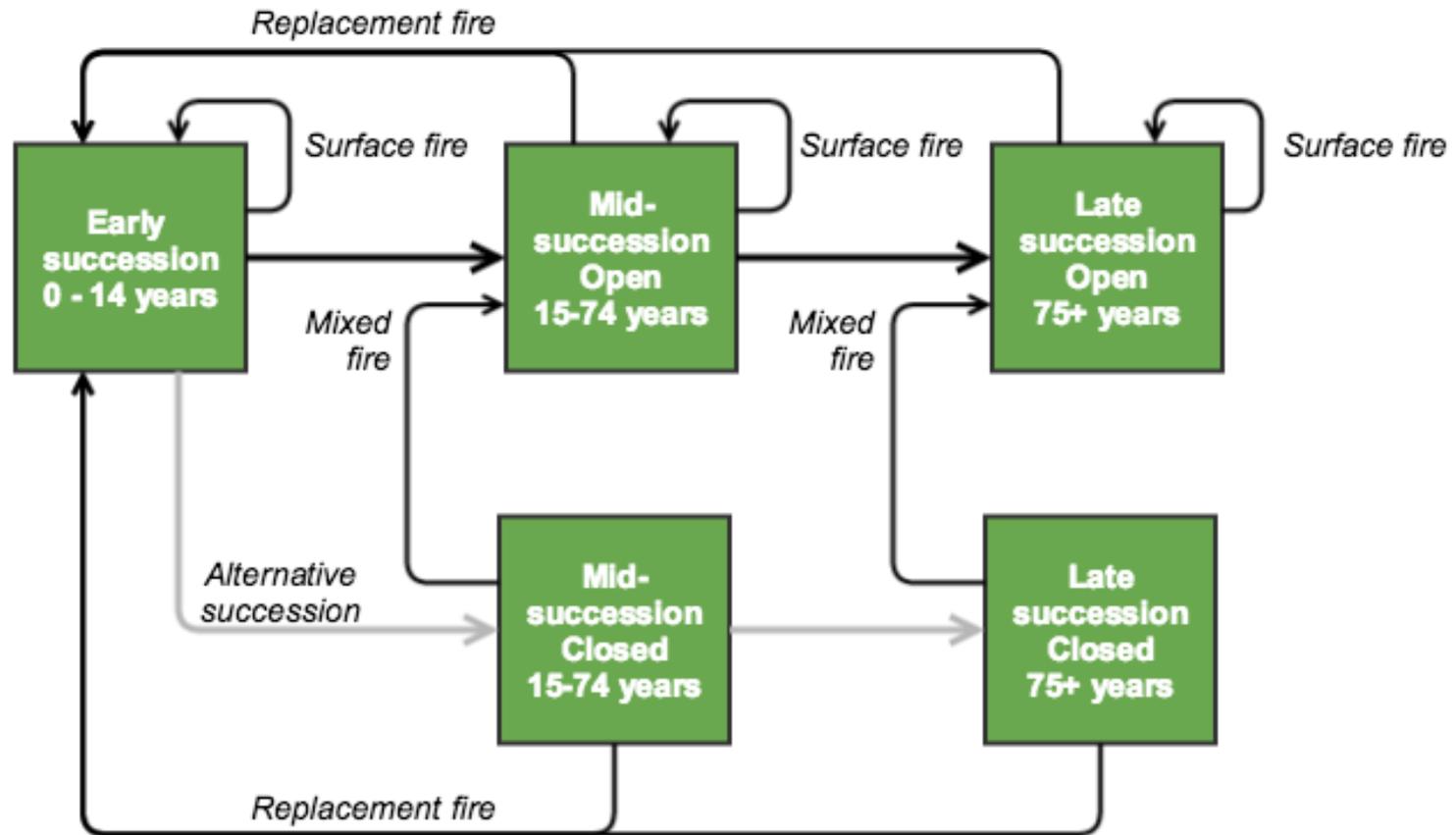
# State-and-transition model for the longleaf pine ecosystem



# State-and-transition model for the longleaf pine ecosystem

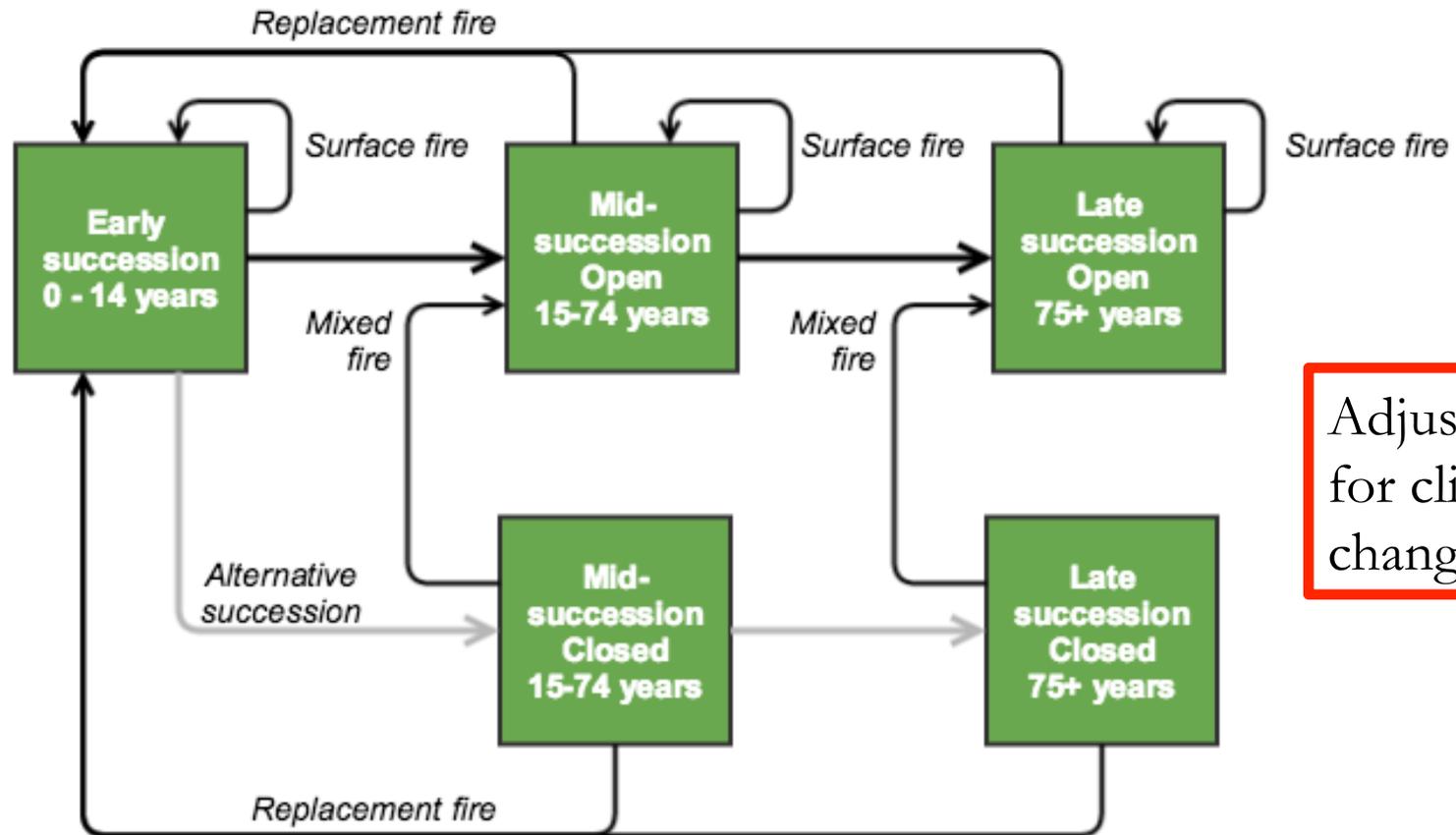


# State-and-transition model for the longleaf pine ecosystem



Wildfire probabilities:	Surface fire	0.02
	Mixed fire	0.0004
	Replacement fire	0.0006

# State-and-transition model for the longleaf pine ecosystem



Adjust all  
for climate  
change

Wildfire probabilities:	Surface fire	0.02
	Mixed fire	0.0004
	Replacement fire	0.0006

# Climate change effect on wildfires

## Wildfire and climate data

Regression

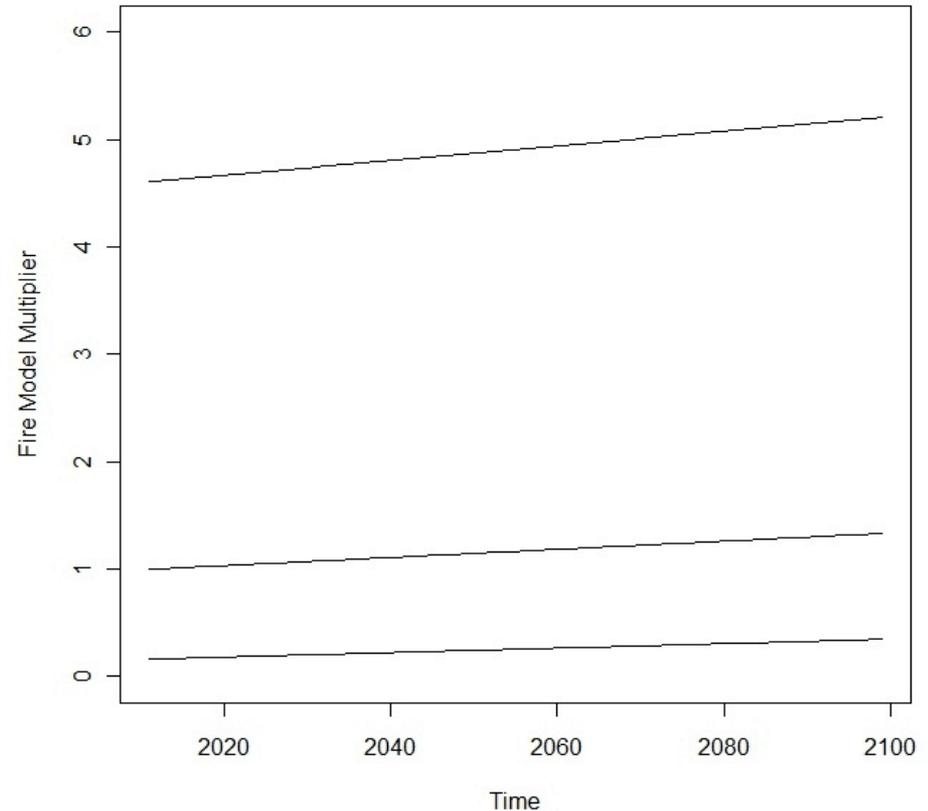
Recent Area burned =  
 $f(\text{recent climate})$

Future area burned =  
 $f(\text{K. Hayhoe downscaled  
climate projections  
2012-2100})$

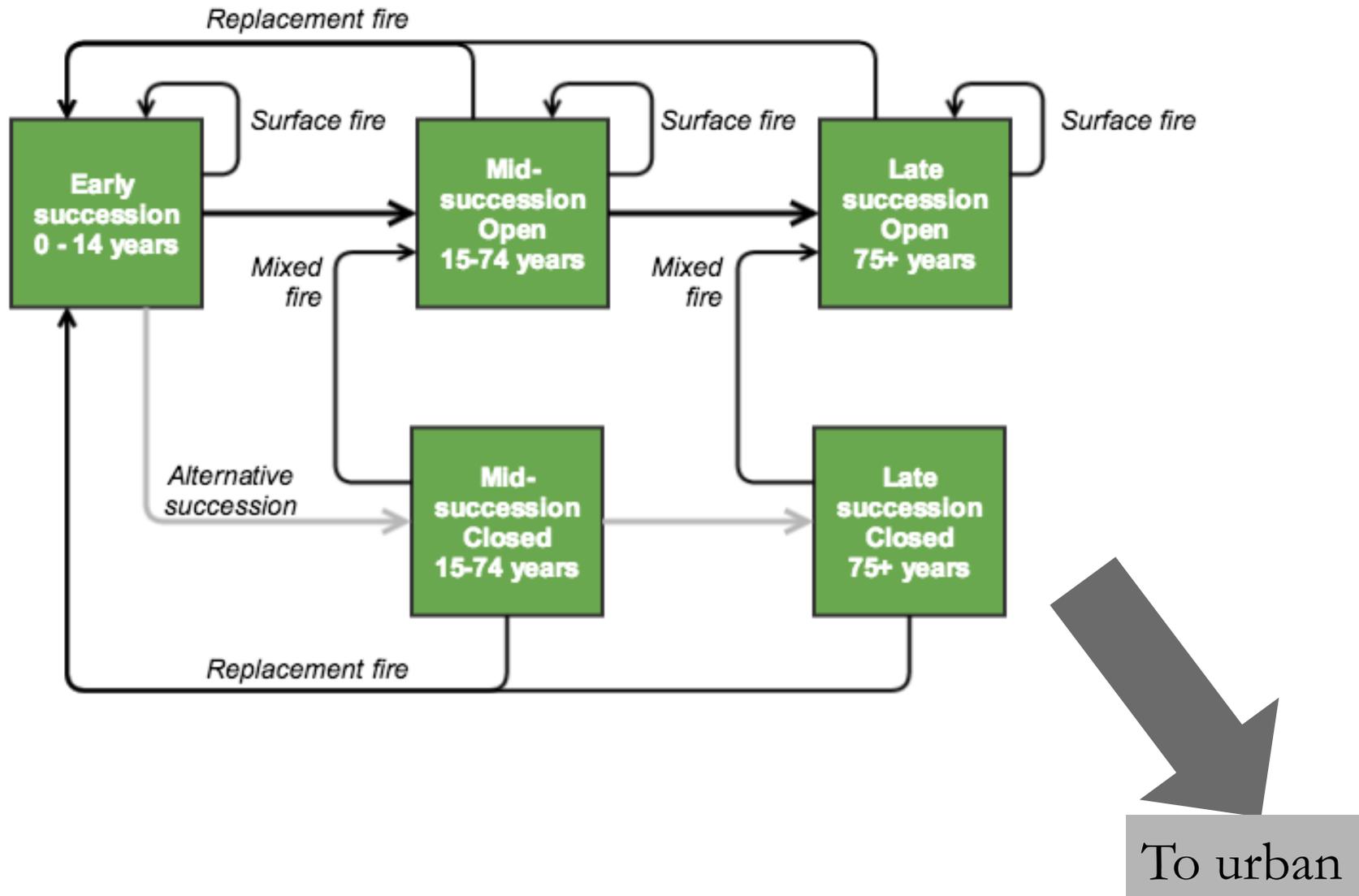
Applied as time series of wildfire  
probability multipliers over time:  
A1FI and B1 scenarios

50 Monte Carlo simulations

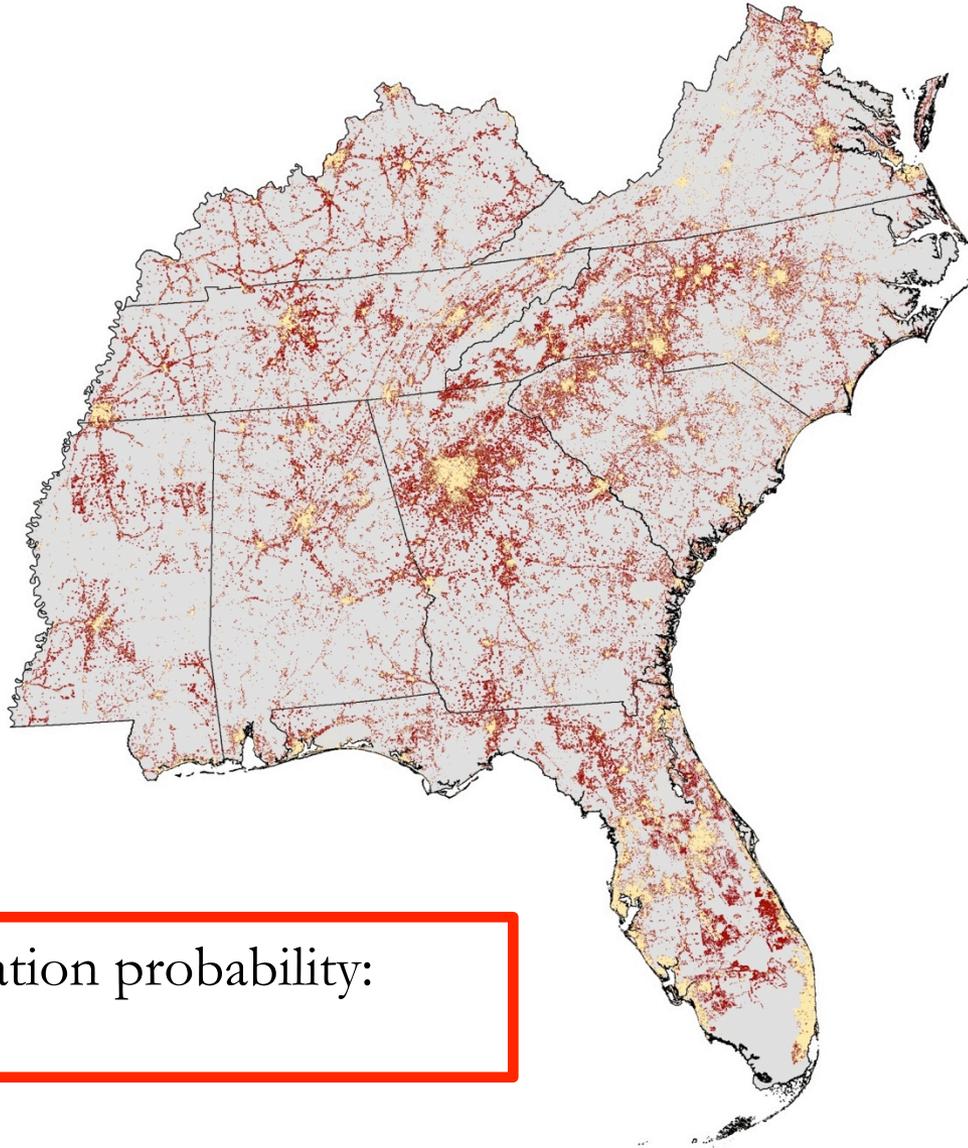
A1FI scenario



# Adding urbanization

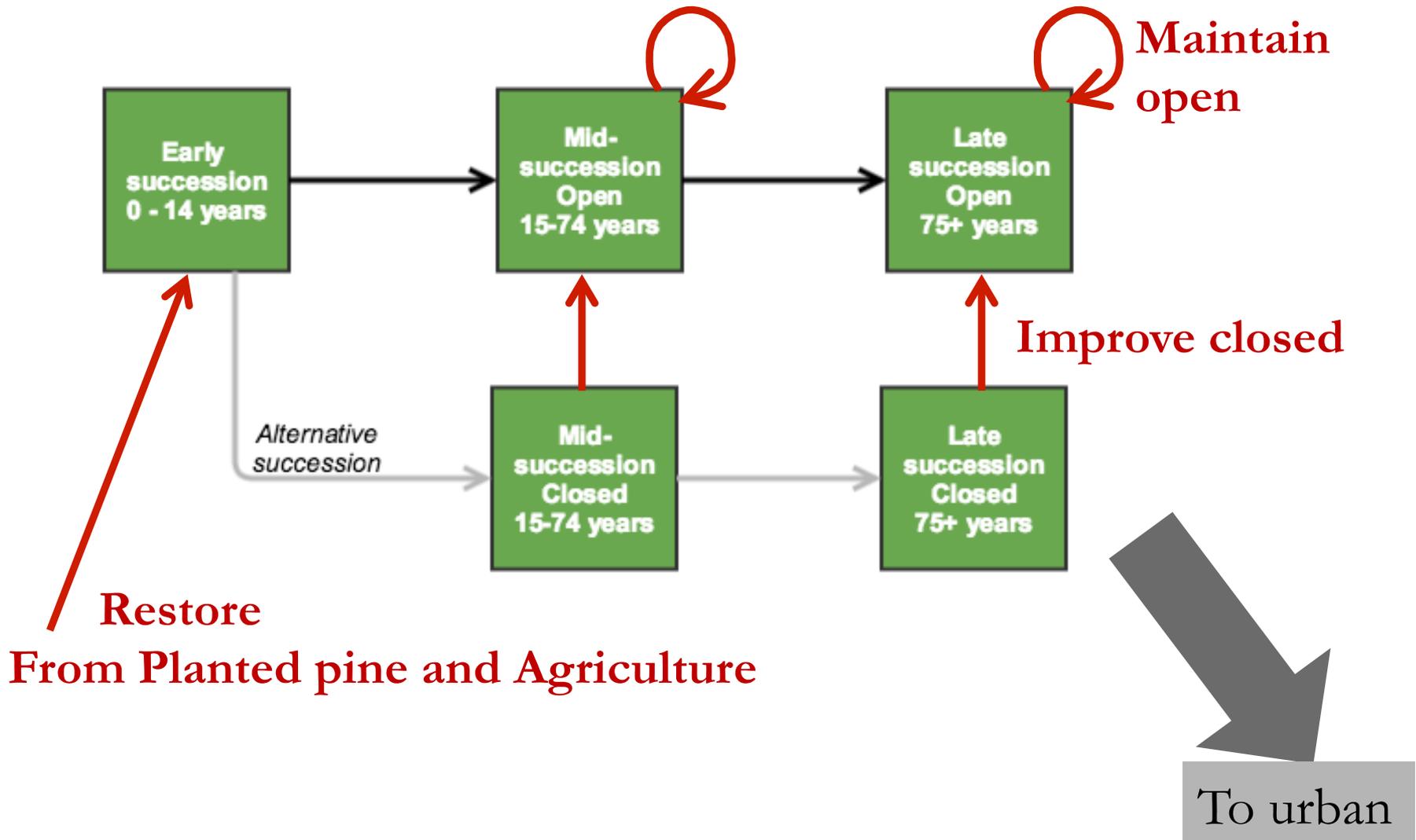


# Urbanization



Annual urbanization probability:  
0.0018

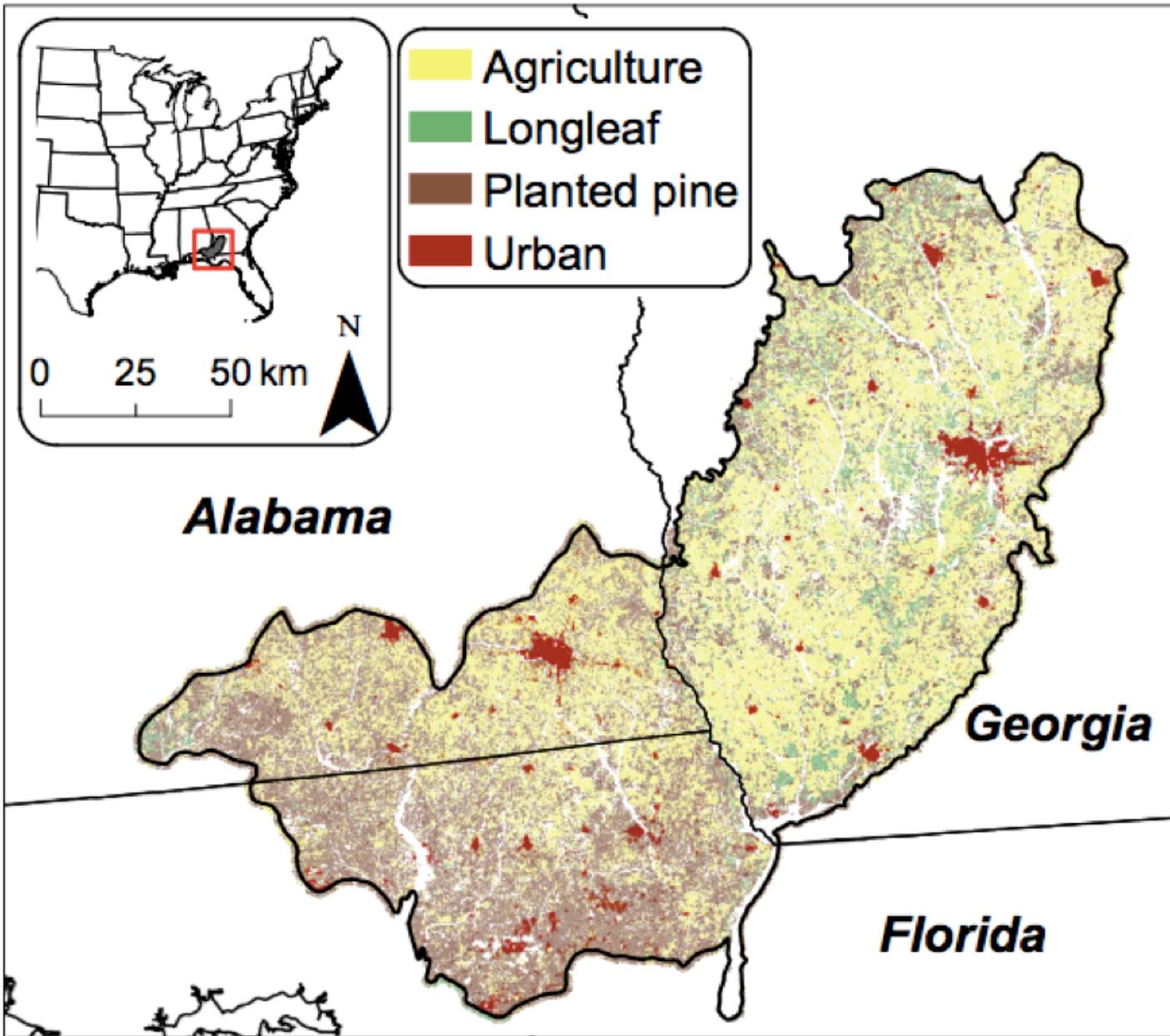
# Adding management transitions



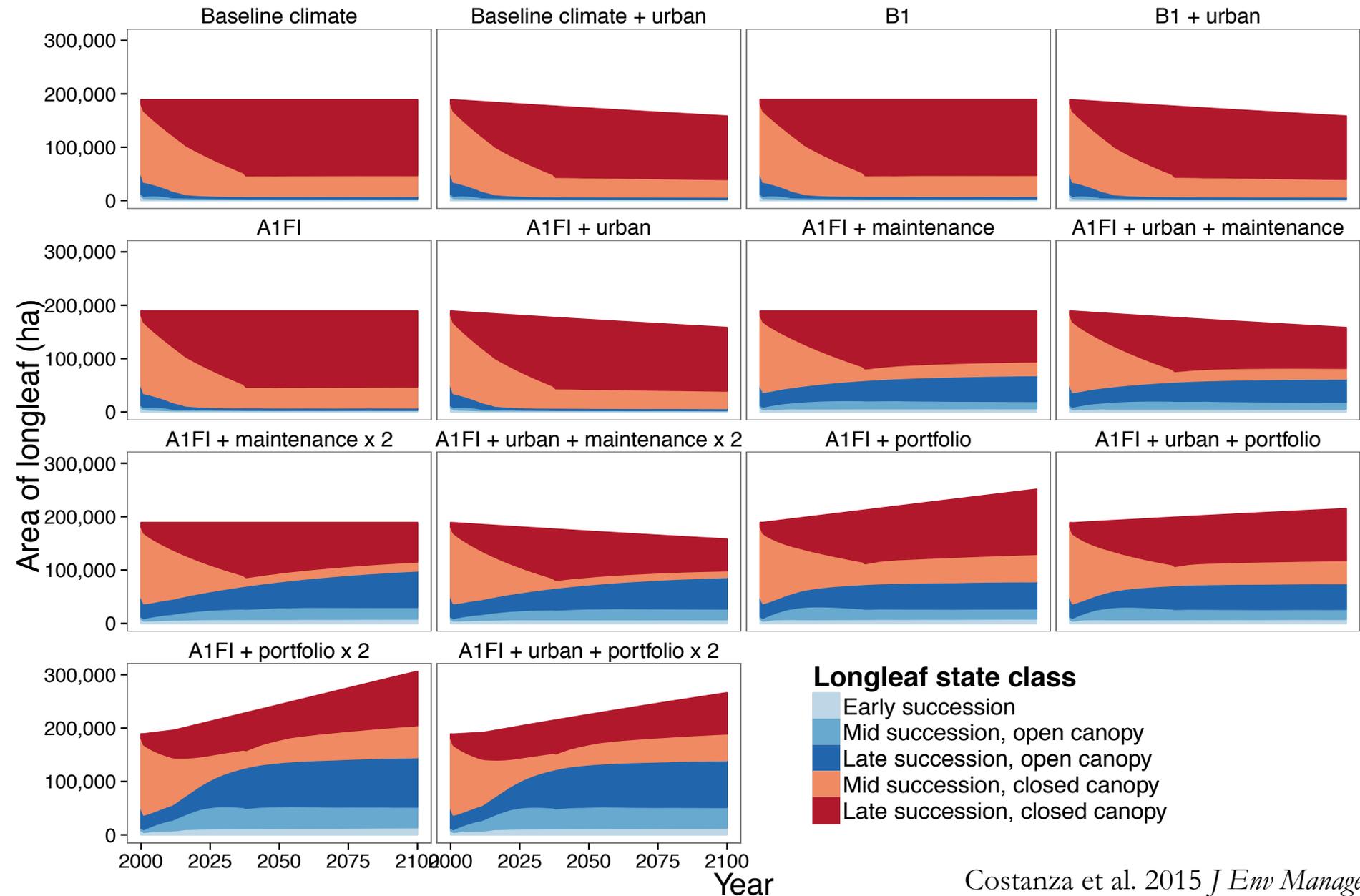
# Scenarios (14)

	Without urbanization	With urbanization
<b>Climate only</b>	No climate, no management	No climate, no management, urban
	A1FI climate (high emissions)	A1FI climate (high emissions), urban
	B1 climate (low emissions)	B1 climate (low emissions), urban
<b>With management</b>	A1FI, Maintenance burning	A1FI, Maintenance burning, urban
	A1FI, Maintenance burning x 2	A1FI, Maintenance burning x 2, urban
	A1FI, Management portfolio	A1FI, Management portfolio, urban
	A1FI, Management portfolio x 2	A1FI, Management portfolio x 2, urban

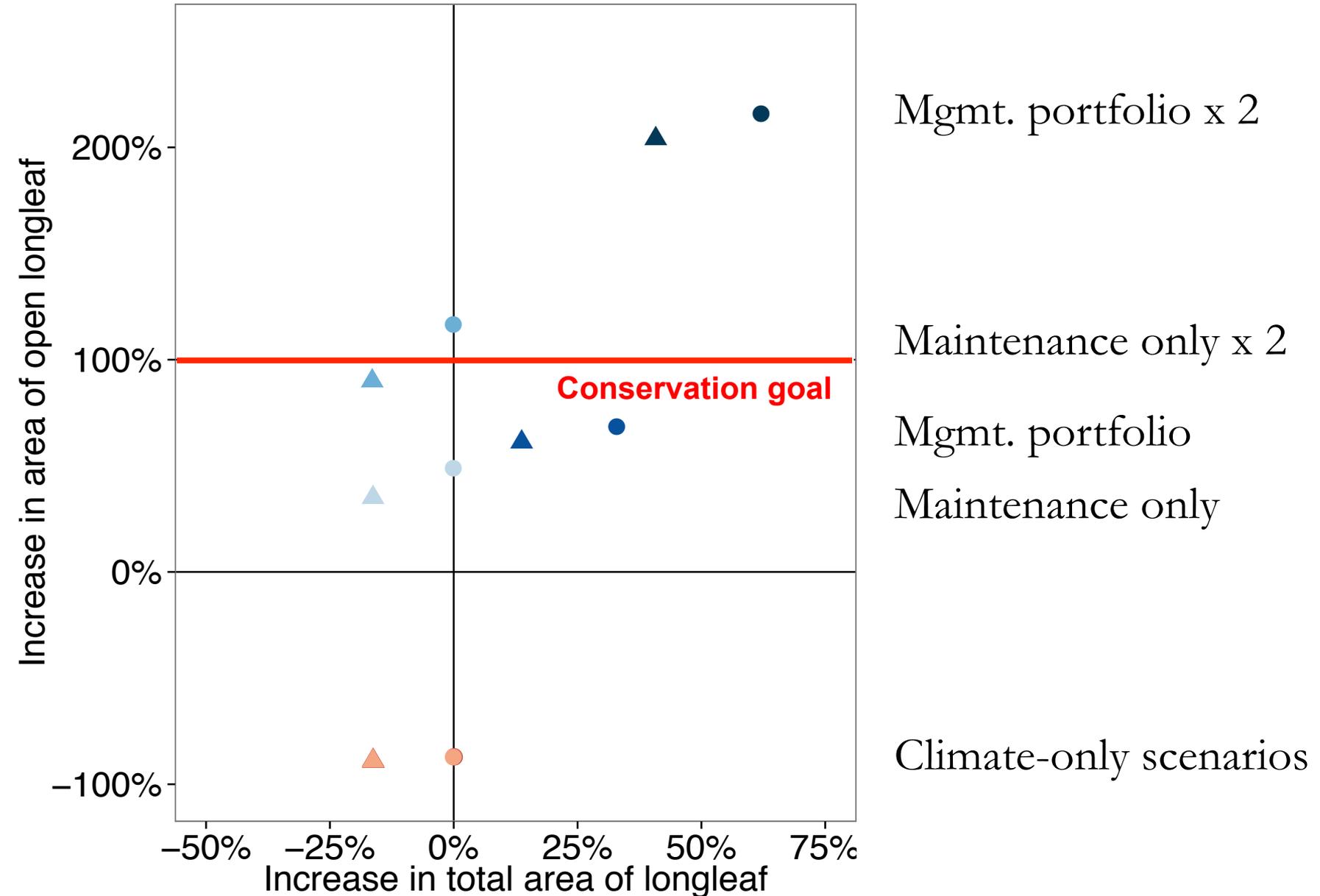
# Initial (2001) landscape



# Results: Longleaf state classes over time



# Results: Change in longleaf area at 2100



# Outline



# Case Study #3: Rangeland Condition and Sage-Grouse Habitat



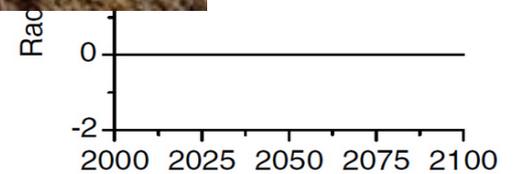
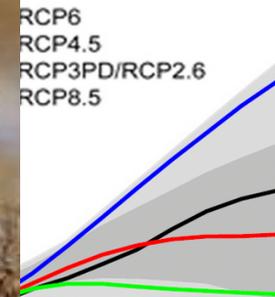
Megan Creutzburg  
Institute for Natural Resources



# Southeast Oregon

Cool-moist shrub steppe

Warm-dry shrub steppe



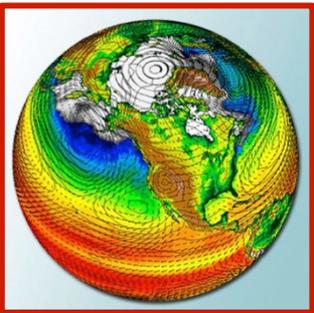
IPCC

# Objectives

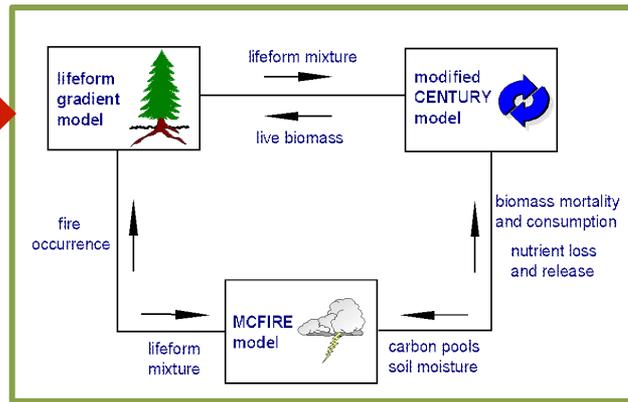
- Model vegetation change into the future under varying scenarios of climate and management
- Interpret implications for vegetation condition and sage-grouse habitat

# Integrating Models

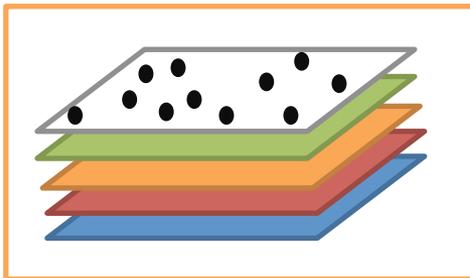
Climate Scenarios



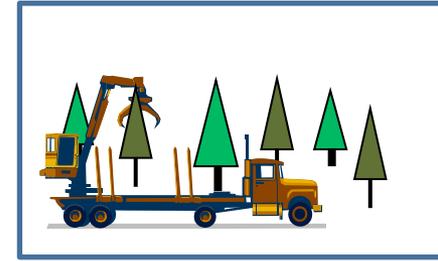
MC2 Dynamic Global Vegetation Model



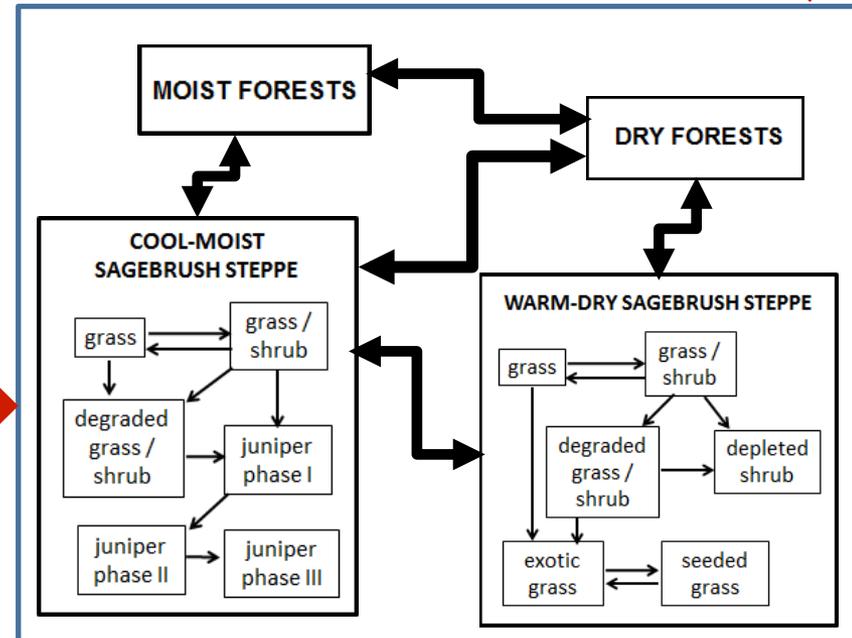
Sage-Grouse Species Distribution Model



Management Scenarios

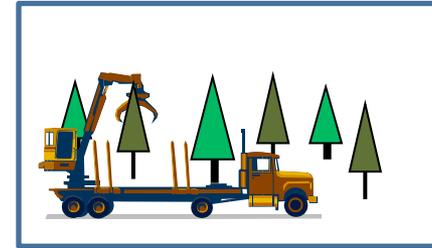
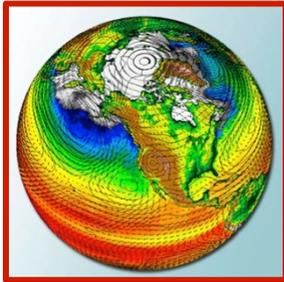


Climate-informed State-and-Transition Simulation Models



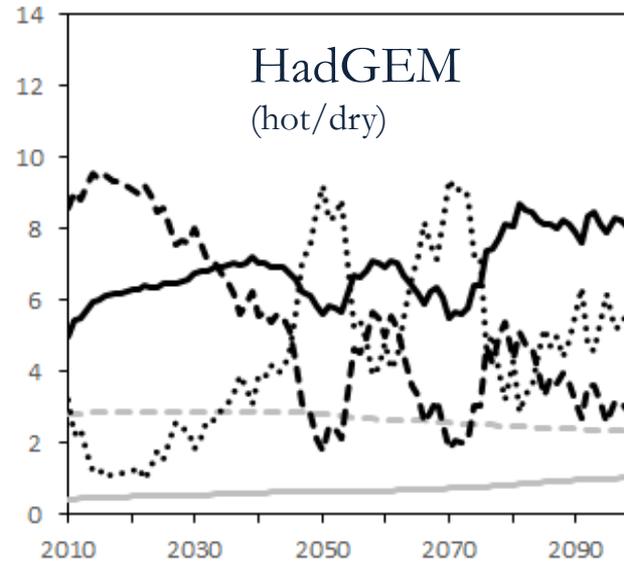
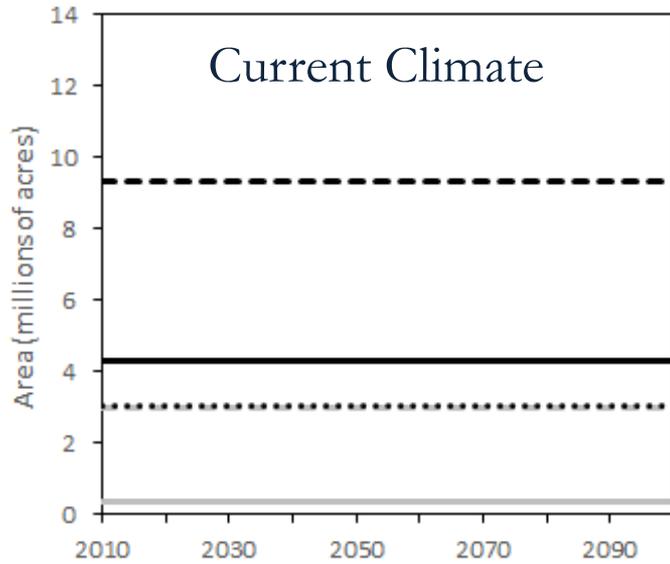
Sage-Grouse Habitat

# Scenarios

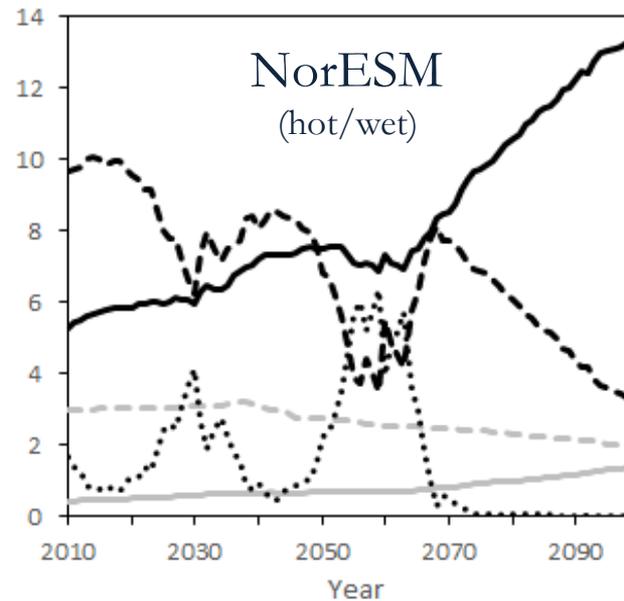
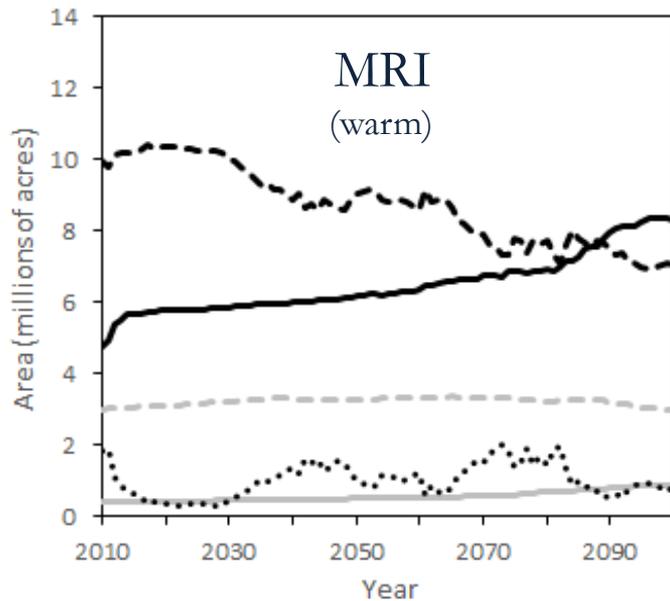


- 3 Global circulation models
  - HadGEM (hot/dry)
  - NorESM (hot/wet)
  - MRI (warm)
- Higher temperatures in all seasons
- Similar or higher annual precipitation
- No Management
- Current Management
  - Current treatments specific to ownership type
- Restoration Management
  - Alternative scenario to restore sage-grouse habitat

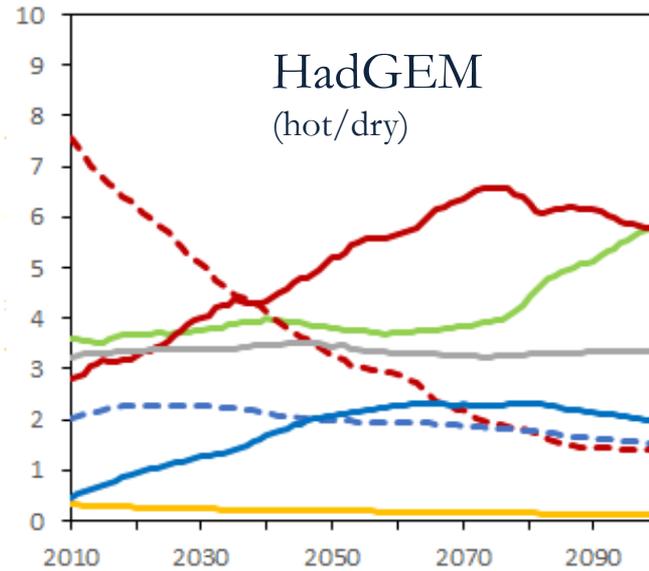
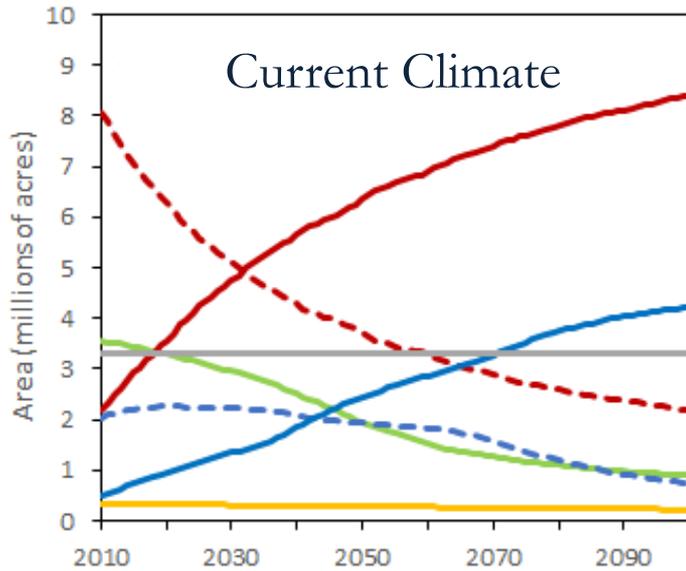
# Potential Vegetation Types



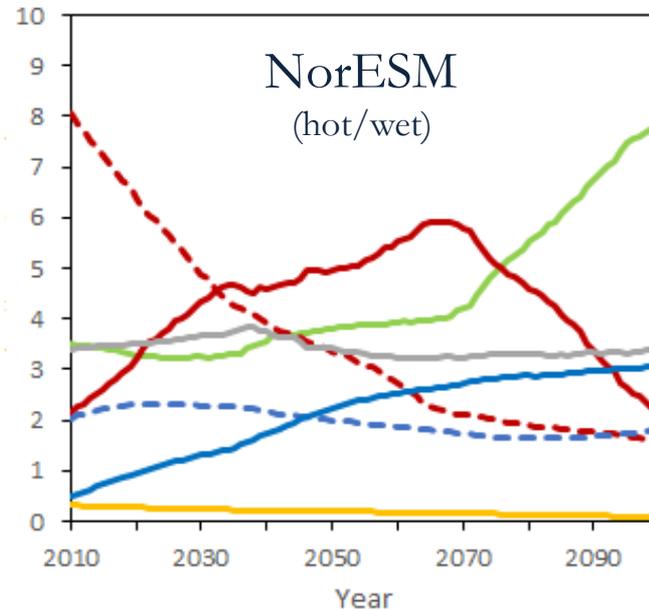
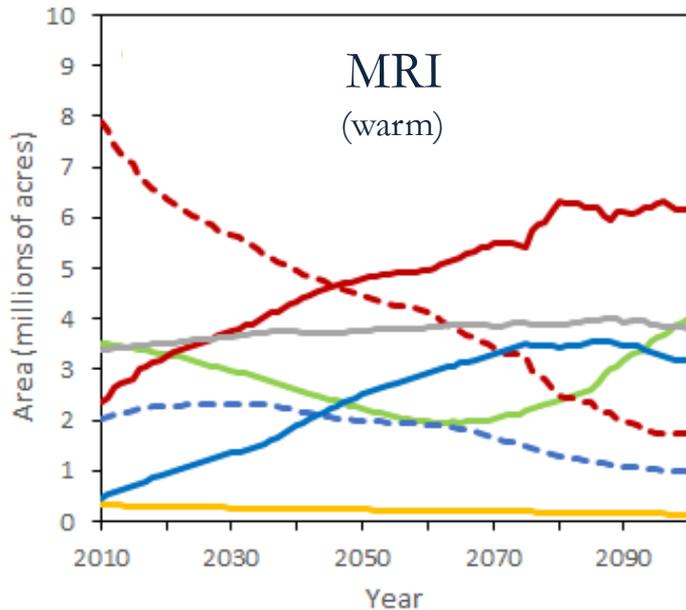
- Moist Forest
- - - Dry Forest
- Moist Shrub Steppe
- - - Dry Shrub Steppe
- ..... Xeric Shrub Steppe



# Vegetation Composition

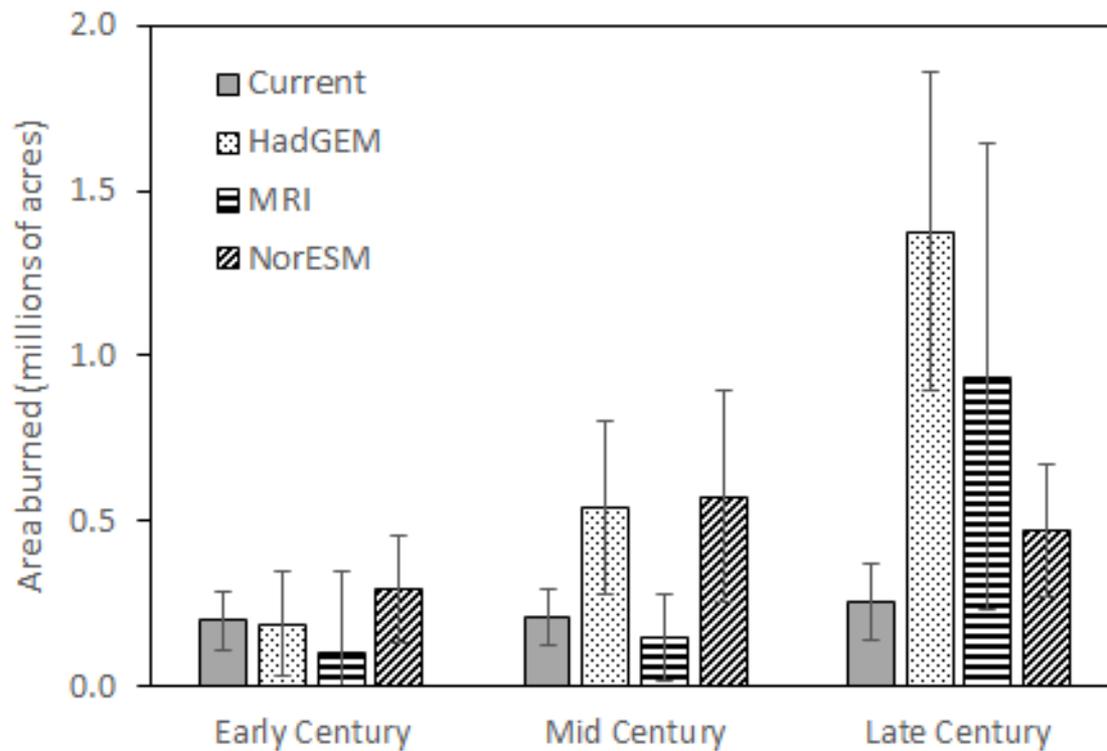


- Shrub Steppe-Native
- Shrub Steppe-SemiDegraded
- Shrub Steppe-Exotic
- Shrub Steppe-Seeded
- Woodland-Threshold
- Woodland
- Forest



# Wildfire

2-4 fold increase in wildfire with climate change



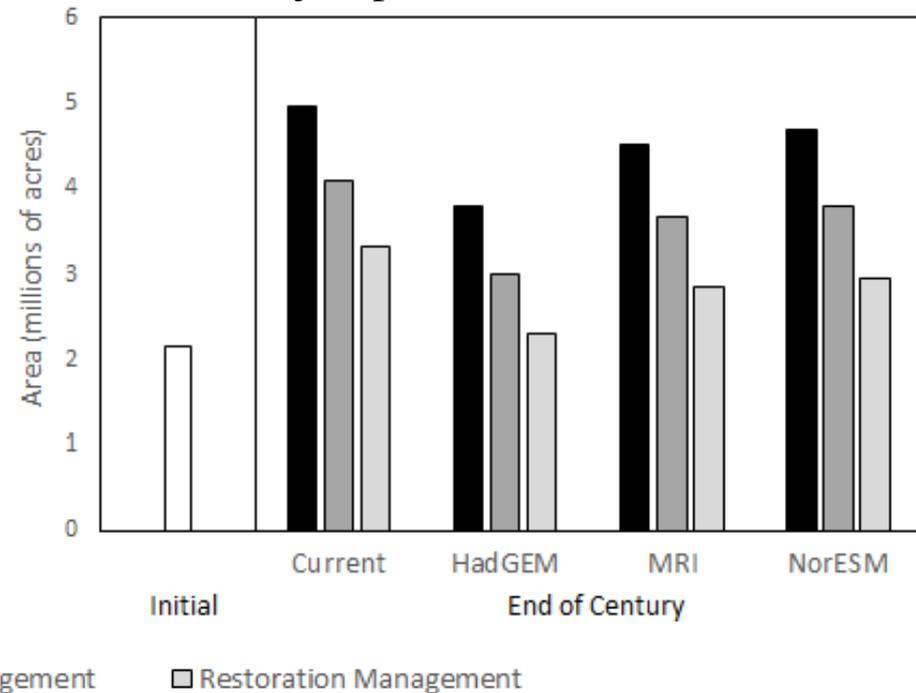
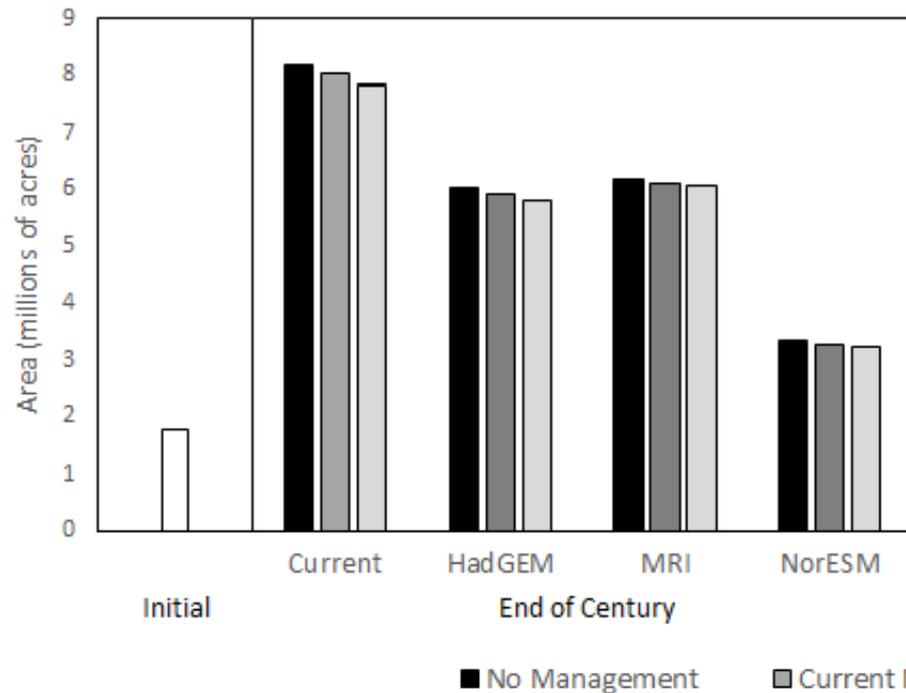
# Exotic Grass and Juniper Invasion



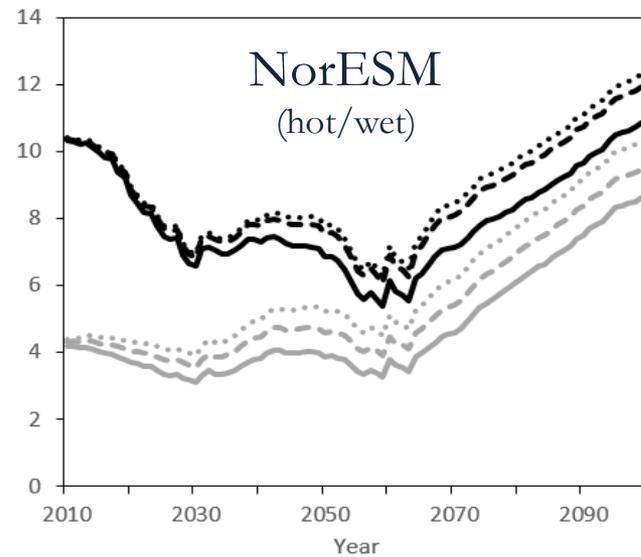
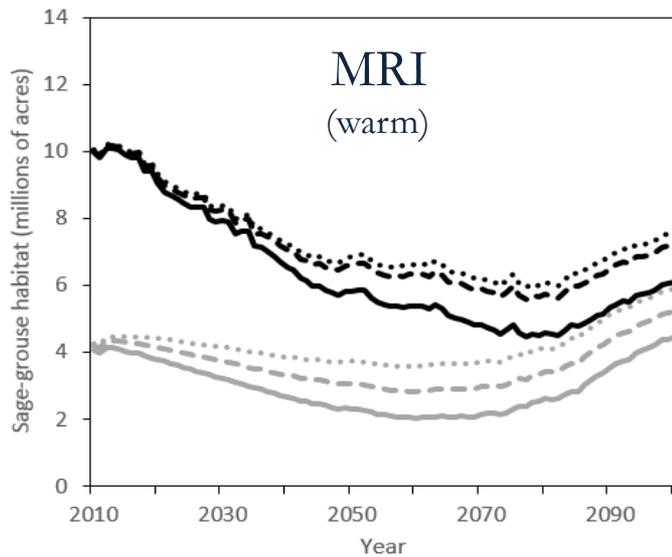
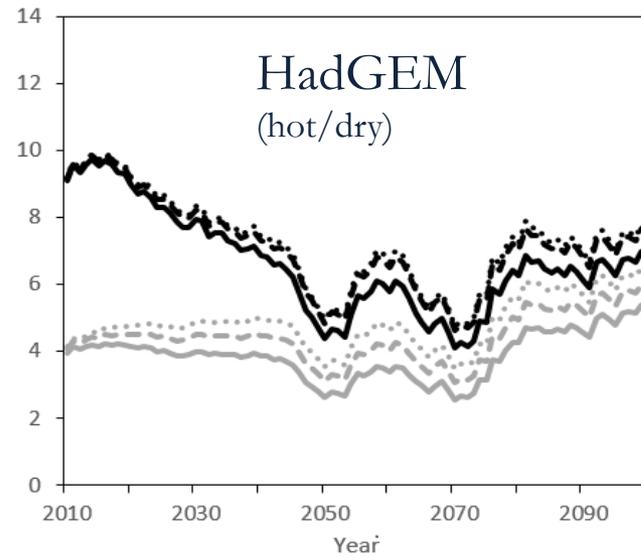
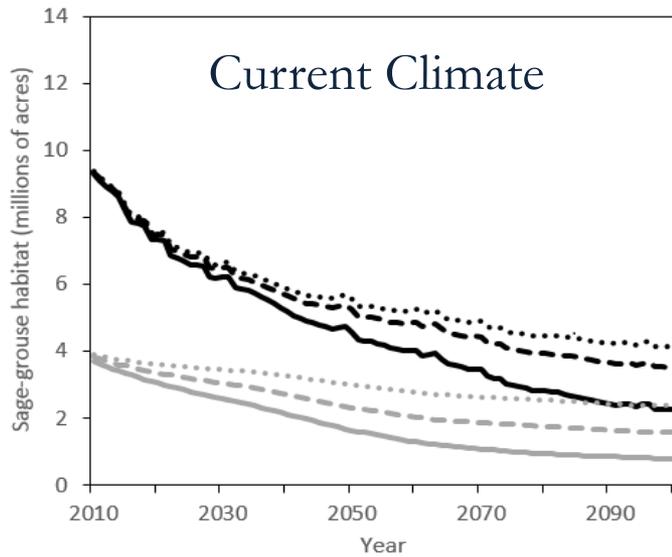
Exotic Grass



Juniper Phases I, II, III



# Sage-Grouse Habitat



— General Habitat - No Management  
 - - - General Habitat - Current Management  
 ..... General Habitat - Restoration Management

— High-quality Habitat - No Management  
 - - - High-quality Habitat - Current Management  
 ..... High-quality Habitat - Restoration Management

# Conclusions

- Climate change is likely to cause expansion of moist shrub steppe and increases in wildfire
- Current landscape composition presents a high risk for expansion of exotic grasses and juniper
- Climate change is projected to reduce exotic grass and juniper relative to current climate
- Management was effective in controlling juniper but not exotic grass
- Sage-grouse habitat declined in the short term, but rebounded late in the century under some climate change scenarios

Creutzburg, M.K., Grossmann, E.B. Conklin, D. 2015. Climate change and land management impact rangeland condition and sage-grouse habitat in southeastern Oregon. *AIMS Environmental Science* 2: 203-236.

# Summary:

## State-and-Transition Simulation Models

- Useful and flexible tool for conceptualizing vegetation dynamics and projecting future conditions
- Used widely to inform management of ecosystems
- Useful for a wide variety of ecosystems
- Can be used to assess impacts of climate change
- Allow incorporation of data from multiple models and other sources

# Thank You!

## Contact information:

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Megan Creutzburg: [mkc3@pdx.edu](mailto:mkc3@pdx.edu)