

# ARSET

Applied Remote Sensing Training

<http://arset.gsfc.nasa.gov>

 @NASAARSET

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## Introduction to Remote Sensing for Scenario- Based Ecoforecasting

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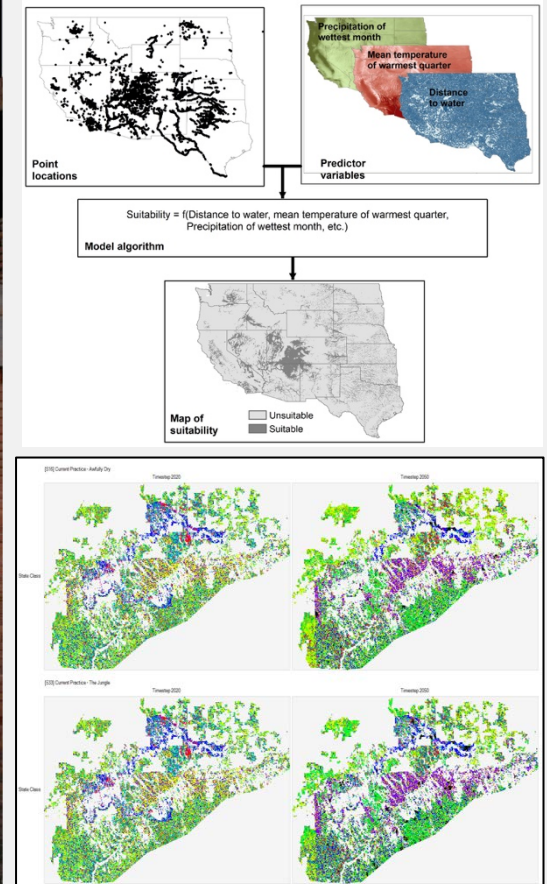
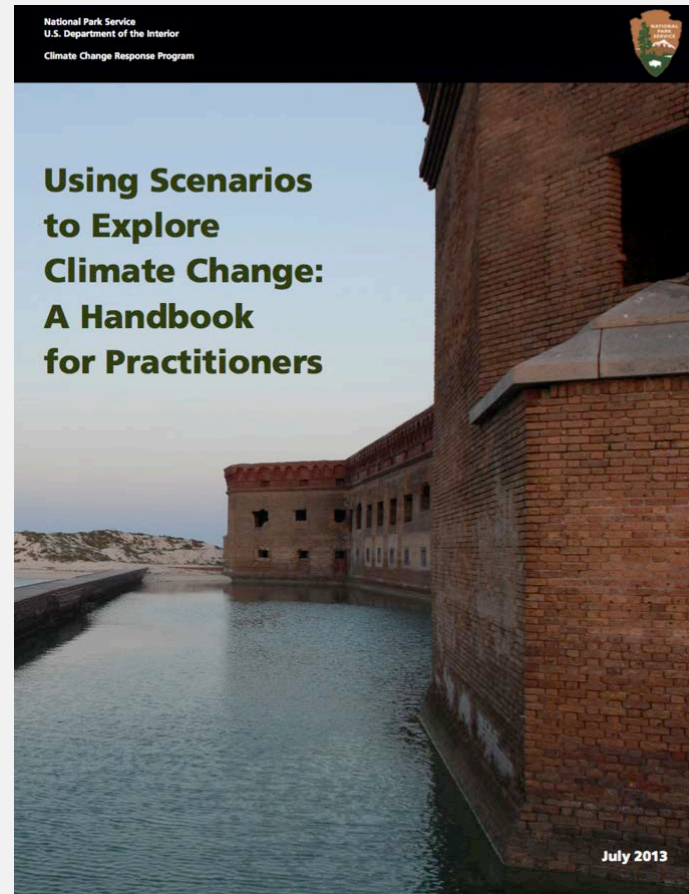
Week 4: Overview of Species Distribution and State-And-Transition Simulation  
Modeling

Catherine Jarnevich, Research Ecologist: USGS, Fort Collins Science Center

Brian W. Miller, Research Ecologist: USGS, North Central  
Climate Science Center

# Overview of Species Distribution & State-and-Transition Simulation Modeling

- Qualitative scenario planning has proven useful in a variety of contexts
- Quantitative information often desired or needed
- Quantitative methods include:
  - Species distribution modeling
  - Simulation modeling





Gombe  
National Park

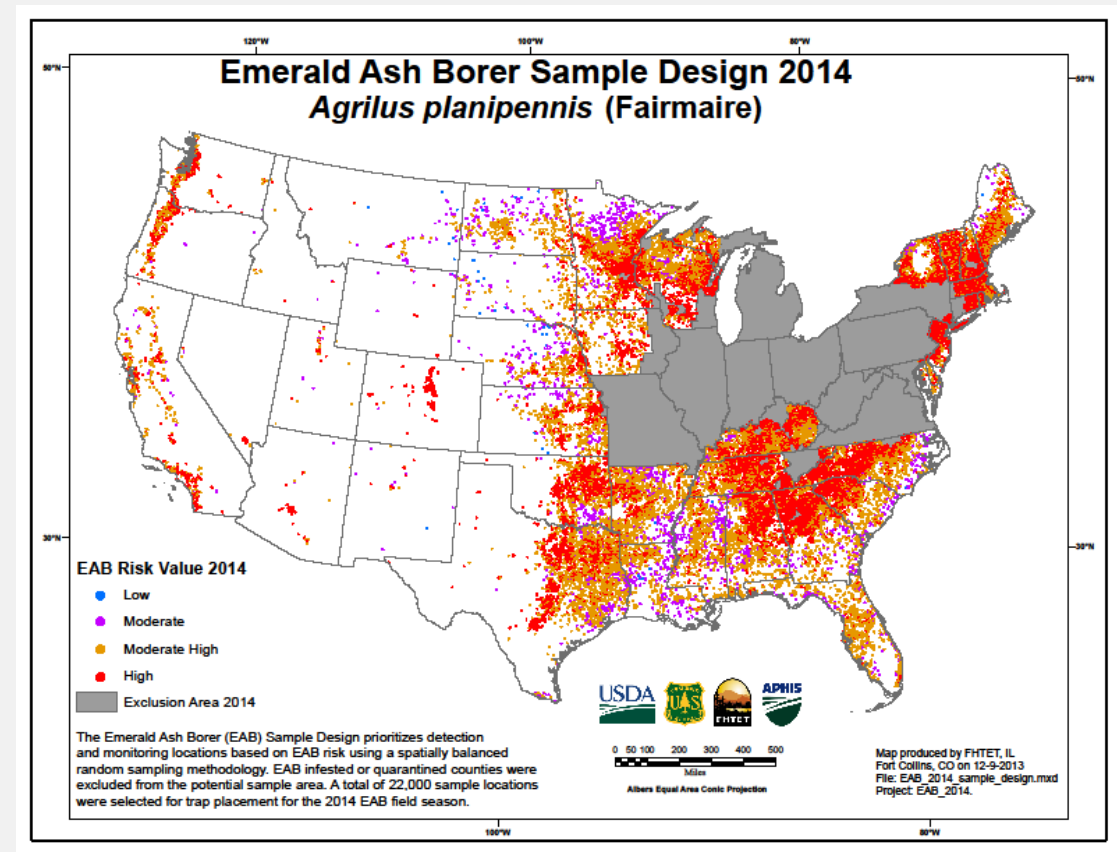
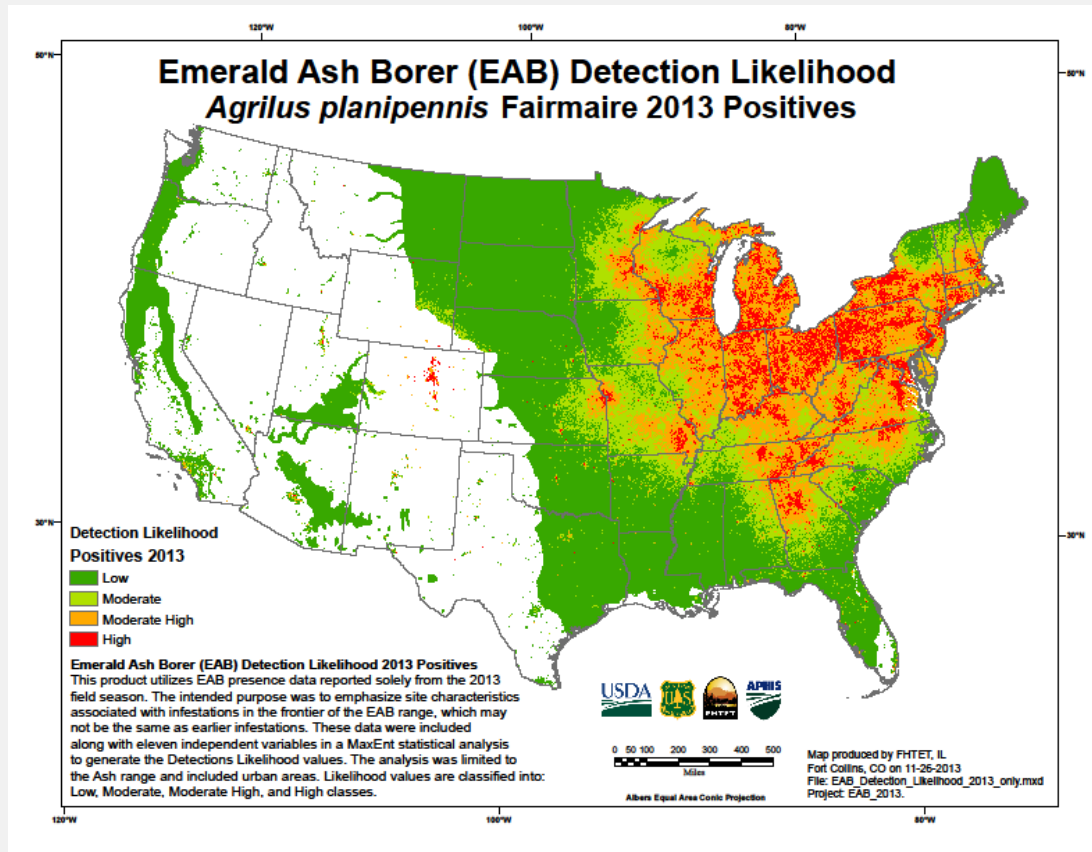
# Introduction to Species Distribution Modeling

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# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Introduction

### Monitoring Strategies



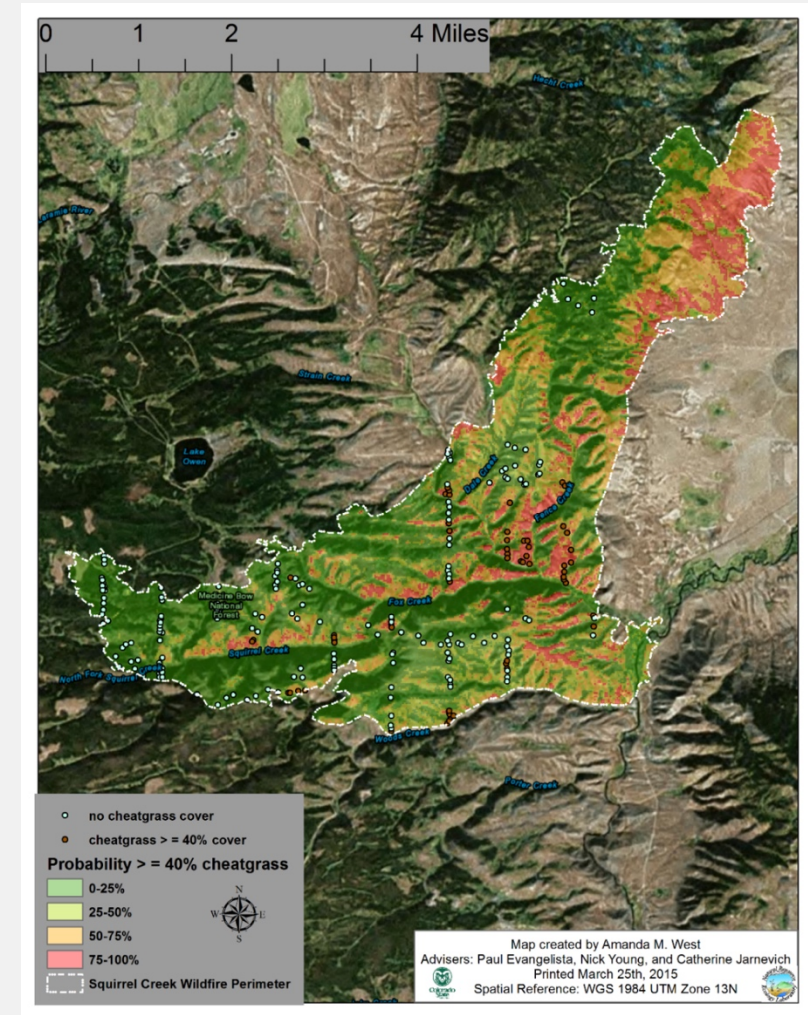
# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Introduction

- Invasive species control



West et al. 2017, International Journal of Applied Earth Observation and Geoinformation

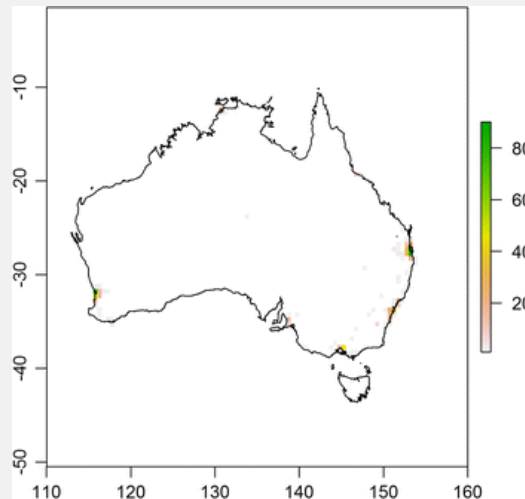


# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Introduction

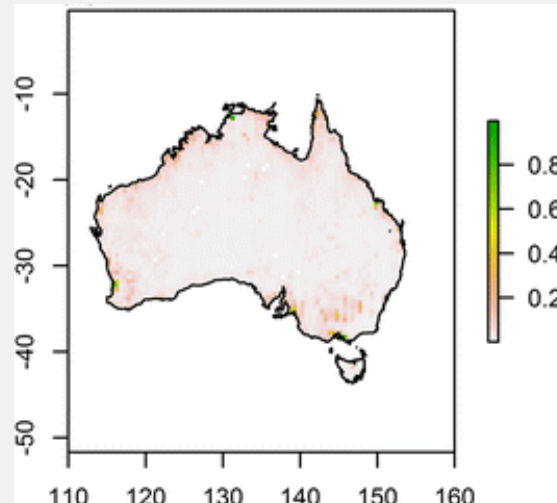
- Risk assessment

Predicted  
incursion events



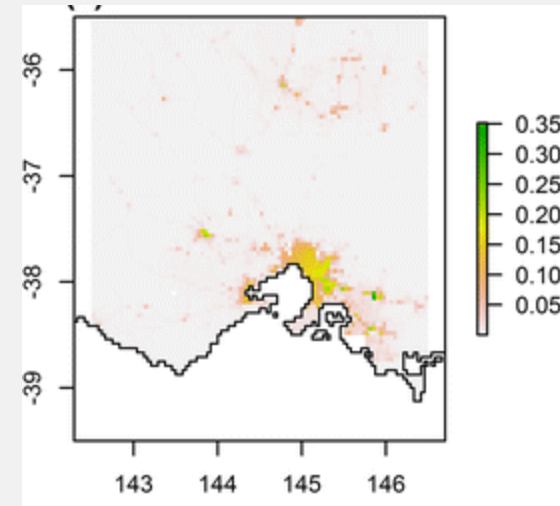
+

Predicted habitat  
suitability



=

Potential  
establishment area



Vall-Ilosera et al. 2017, Biological invasions



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National Park

# Species Distribution Models

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# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Species Distribution Models

Numerical relationships with the environment define where a species may be found

### **Do:**

identify areas with environmental conditions similar to where a species occurs

### **Do not:**

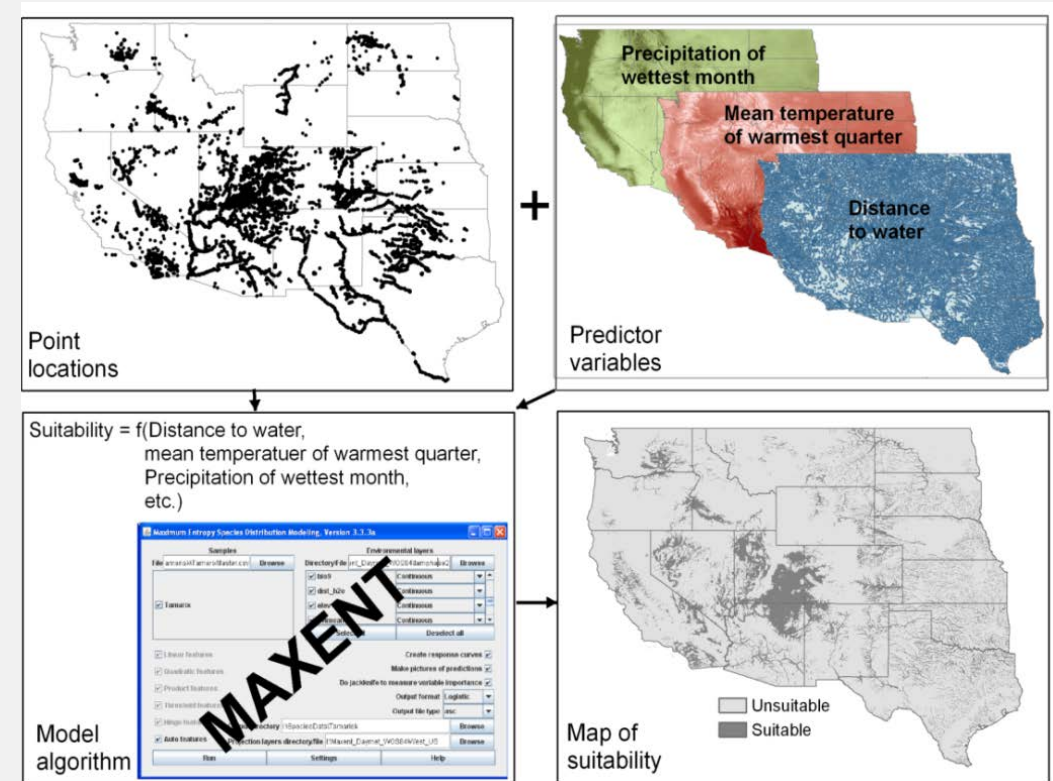
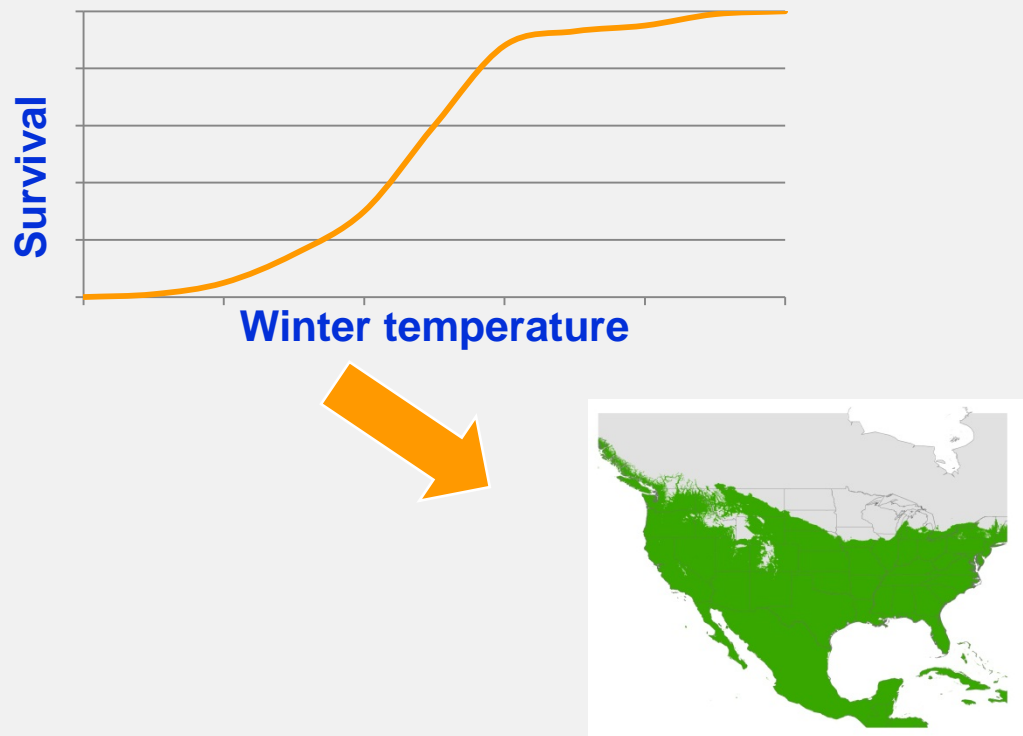
necessarily identify where a species actually is



# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Species Distribution Models

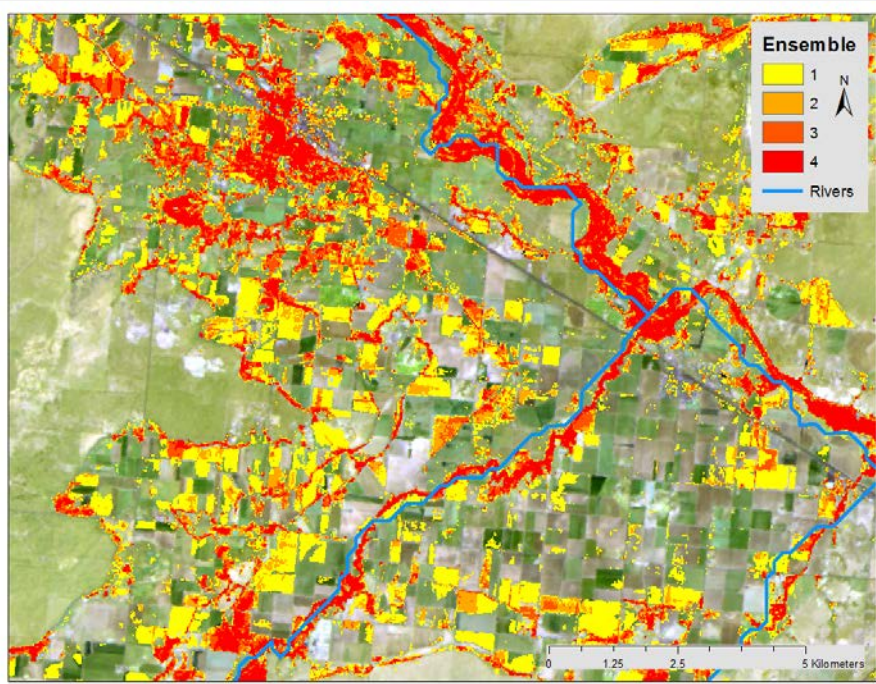
- Process – mechanism; physiological constraints
- Correlation – pattern; based on current locations



# Overview of Species Distribution & State-and-Transition Simulation Modeling

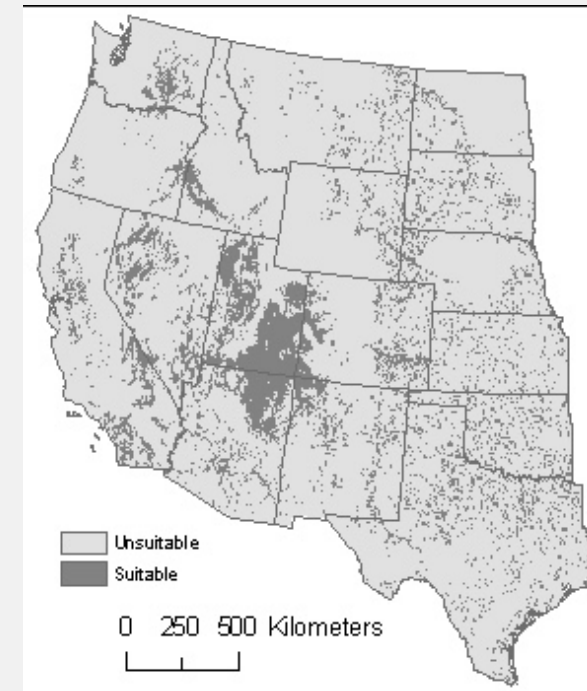
## Species Distribution Models

- Where is it now?
  - mapping



West et al. 2016, JoVE

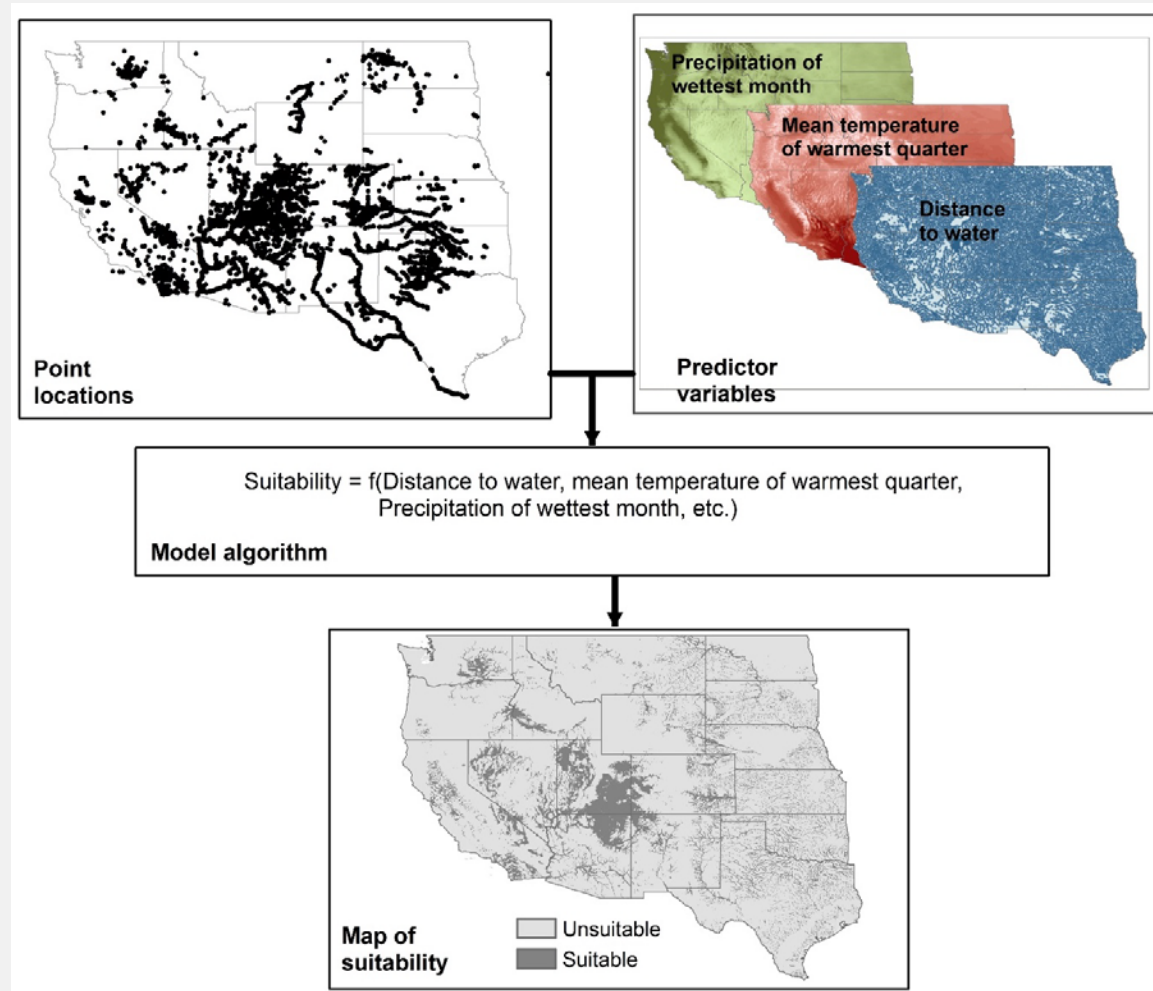
- Where might it be?
  - potential



Jarnevich et al. 2011, Western North American Naturalist

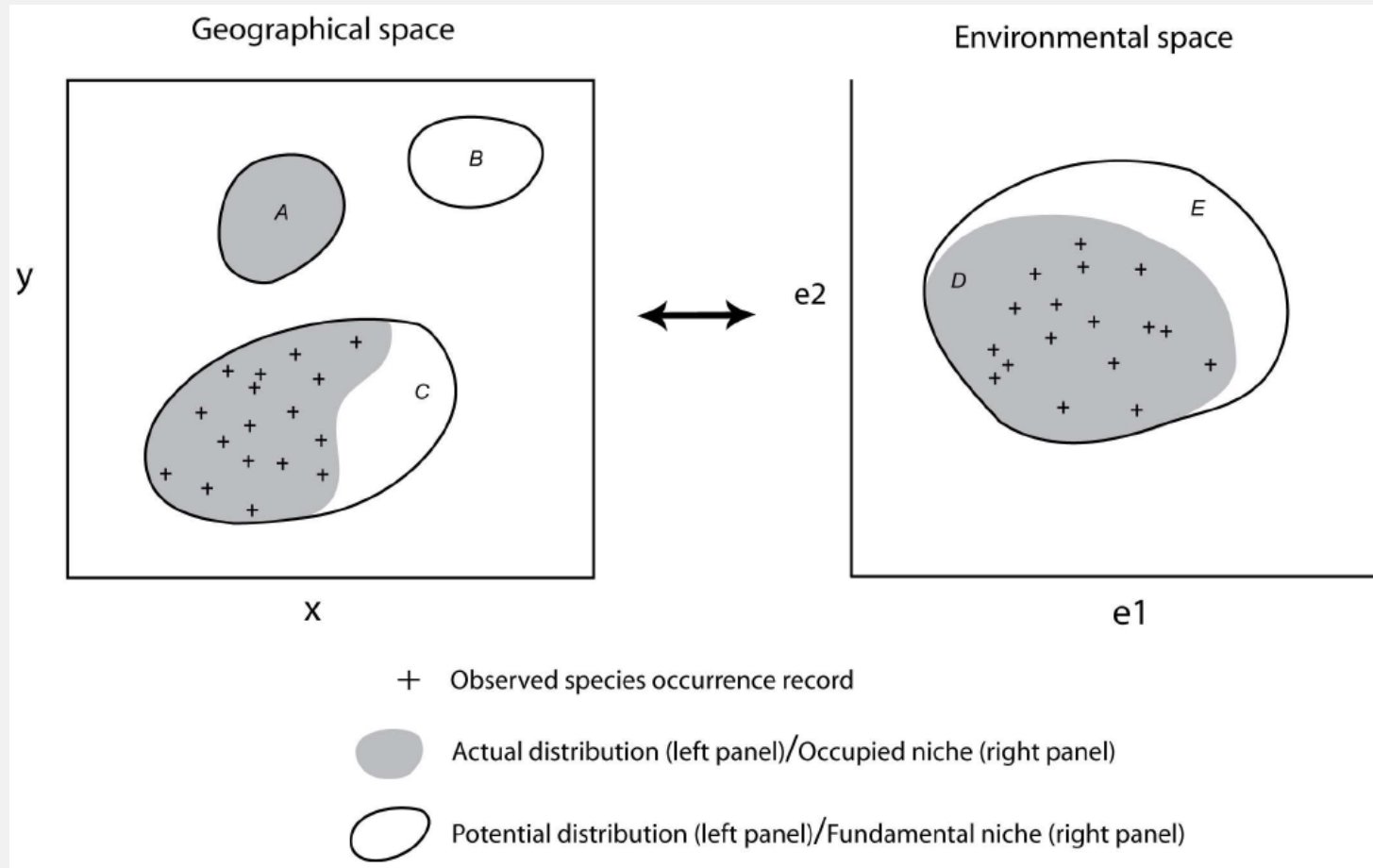
# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Species Distribution Models



# Overview of Species Distribution & State-and-Transition Simulation Modeling

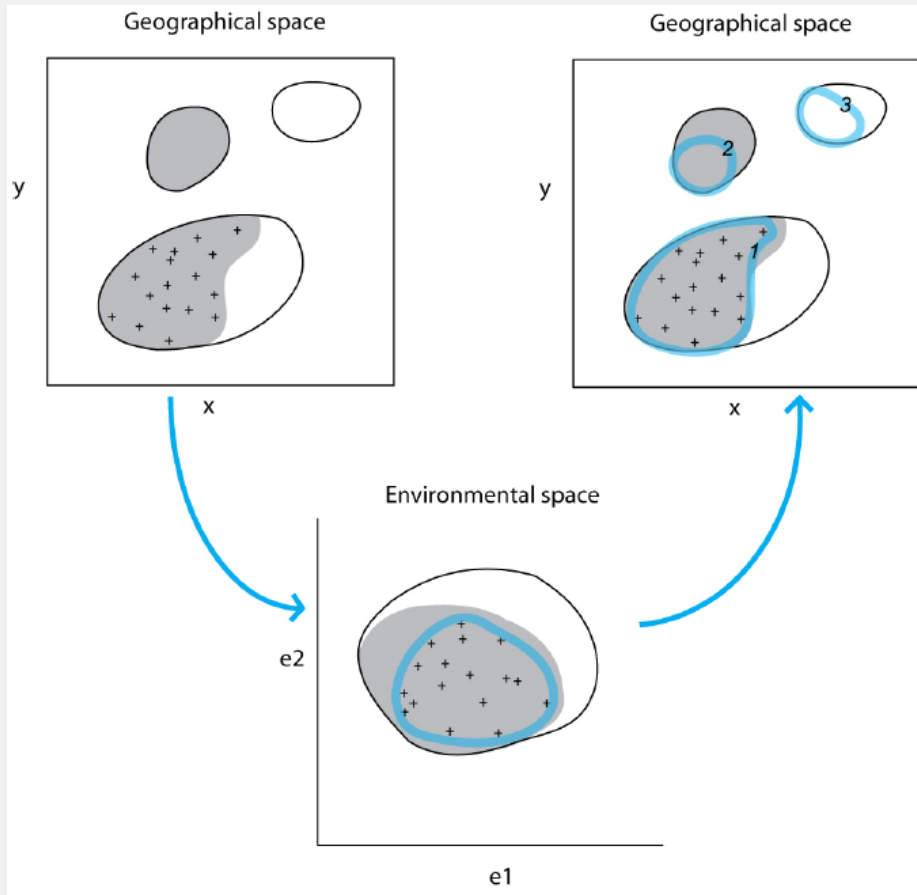
## Species Distribution Models



Pearson, R.G. 2007. Species' Distribution Modeling for Conservation Educators and Practitioners. Synthesis. American Museum of Natural History. Available at <http://ncep.amnh.org>.

# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Species Distribution Models

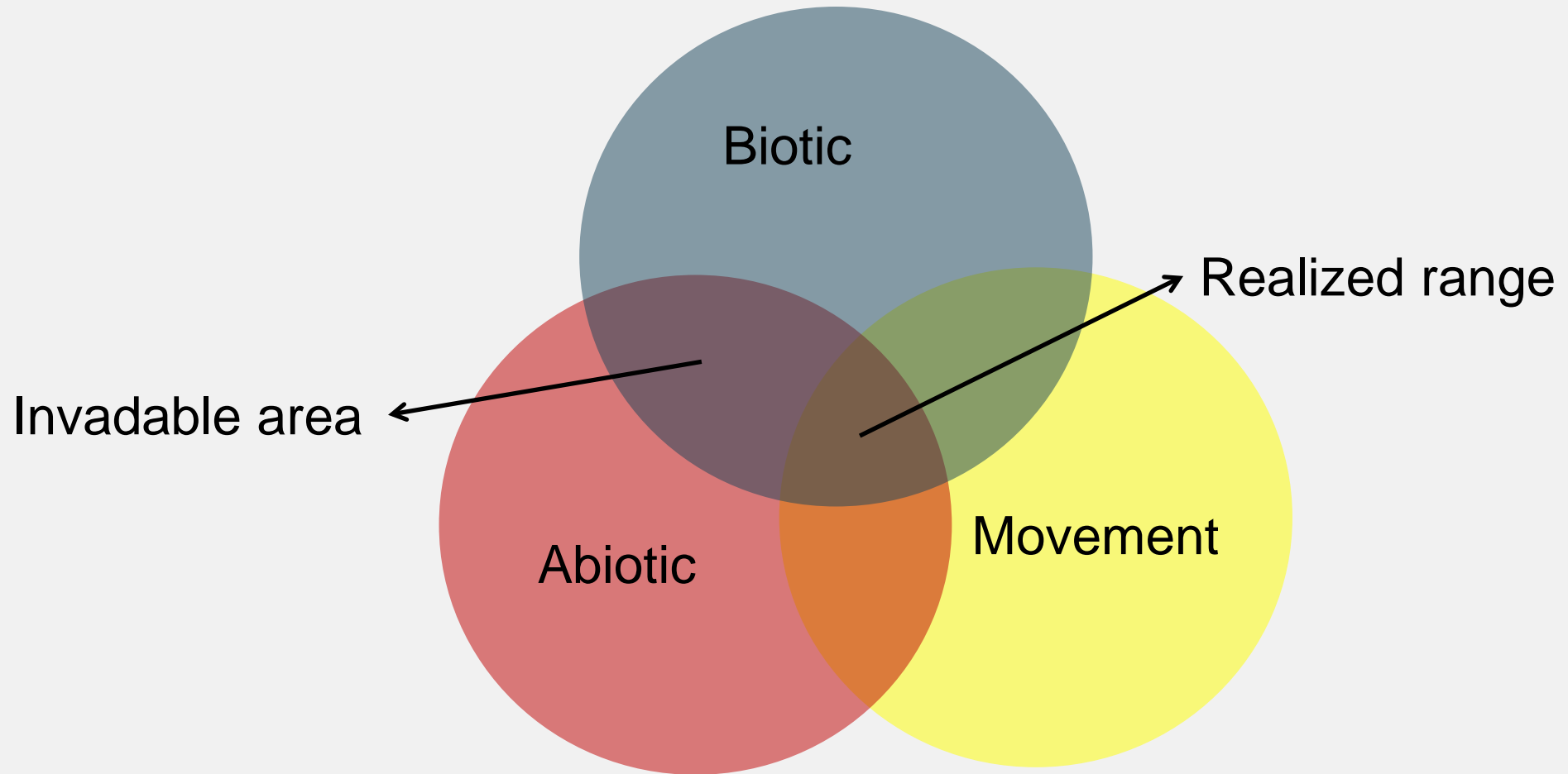


- + Observed species occurrence record
- Actual distribution (upper panels)/Occupied niche (lower panel)
- Potential distribution (upper panels)/Fundamental niche (lower panel)
- Species distribution model fitted to observed occurrence records

Pearson, R.G. 2007. Species' Distribution Modeling for Conservation Educators and Practitioners. Synthesis. American Museum of Natural History. Available at <http://ncep.amnh.org>.

# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Species Distribution Models



Soberon and Peterson 2005, Biodiversity Informatics

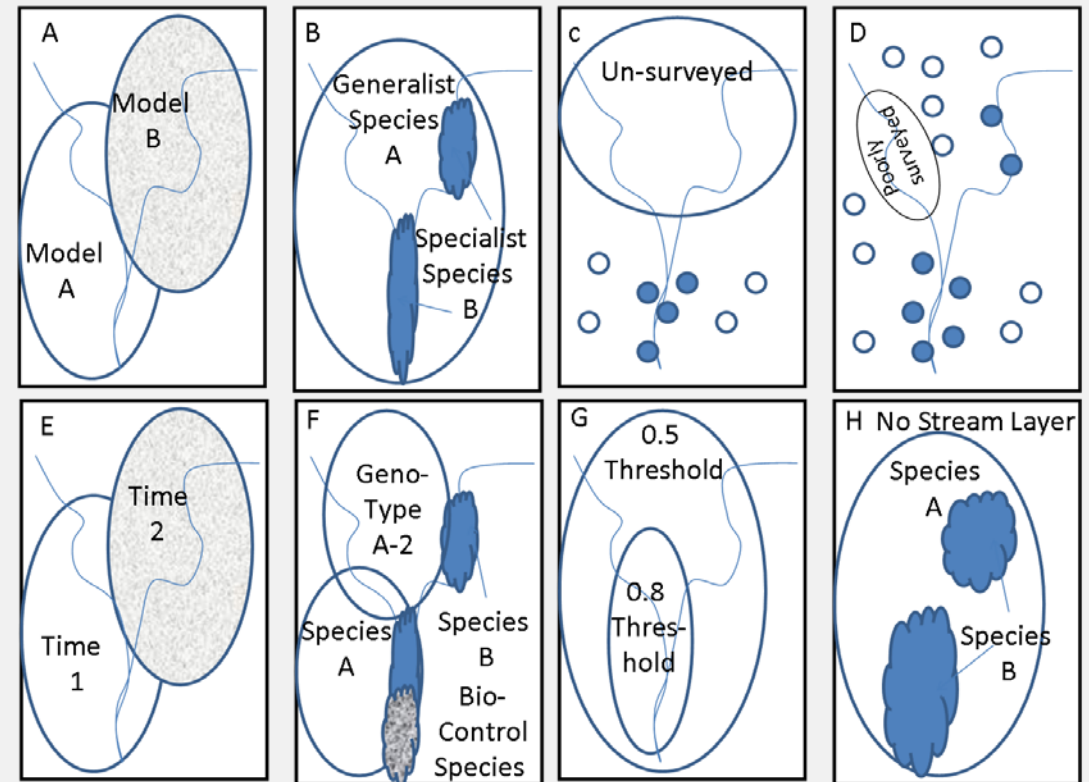
# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Species Distribution Models

- Assessment



- Caveats



Jarnevich et al. 2015, Ecological informatics



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VisTrails: SAHM software

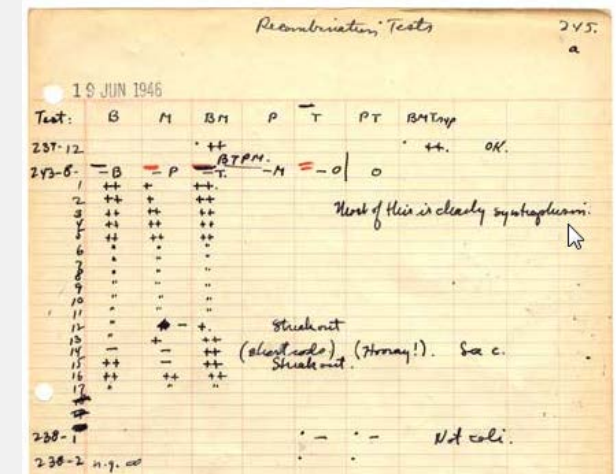
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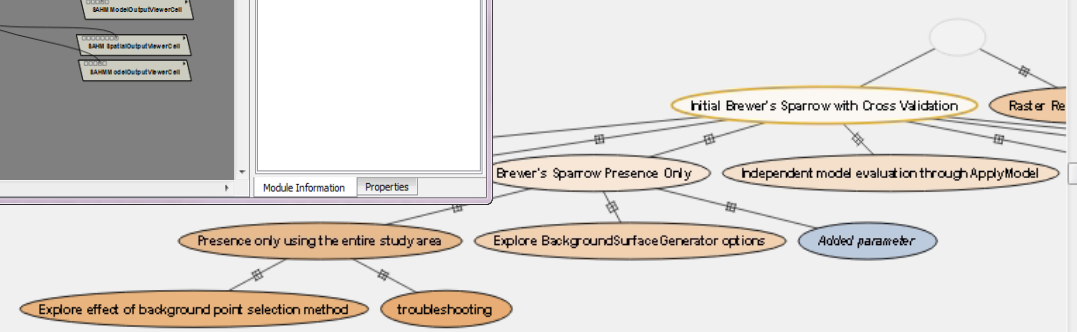
# Overview of Species Distribution & State-and-Transition Simulation Modeling

## VisTrails: SAHM software

The screenshot shows the VisTrails interface with a workflow diagram in the center. The workflow consists of several modules connected by arrows, including 'Temperature', 'PARC', 'PARC', 'PARC', 'CovariateCorrelationAndSelection', 'Brewer's Sparrow Presence Only', 'Independent model evaluation through ApplyModel', and 'Initial Brewer's Sparrow with Cross Validation'. A red arrow points to a 'Module' in the workflow, another red arrow points to a 'Parameter' in the 'Module Information' panel, and a third red arrow points to the 'SAHM' package in the 'Modules' list on the left.



The screenshot shows a metadata window for a workflow. The title is 'Sparrow with Cross Validation'. The fields are: Tag: Sparrow with Cross Validation, User: mitalbert, Date: 22 Aug 2013 10:45:57, and Notes: This is the 'basic' SAHM workflow that most other workflows are derived from. Quickstart: Click the Execute button to begin execution. The modules will turn green sequentially as they finish their processes. When you get to the CovariateCorrelationAndSelection module about half way down execution will stop and a chard showing the correlation between your variables will pop up in a new window. Click ok and Preview:



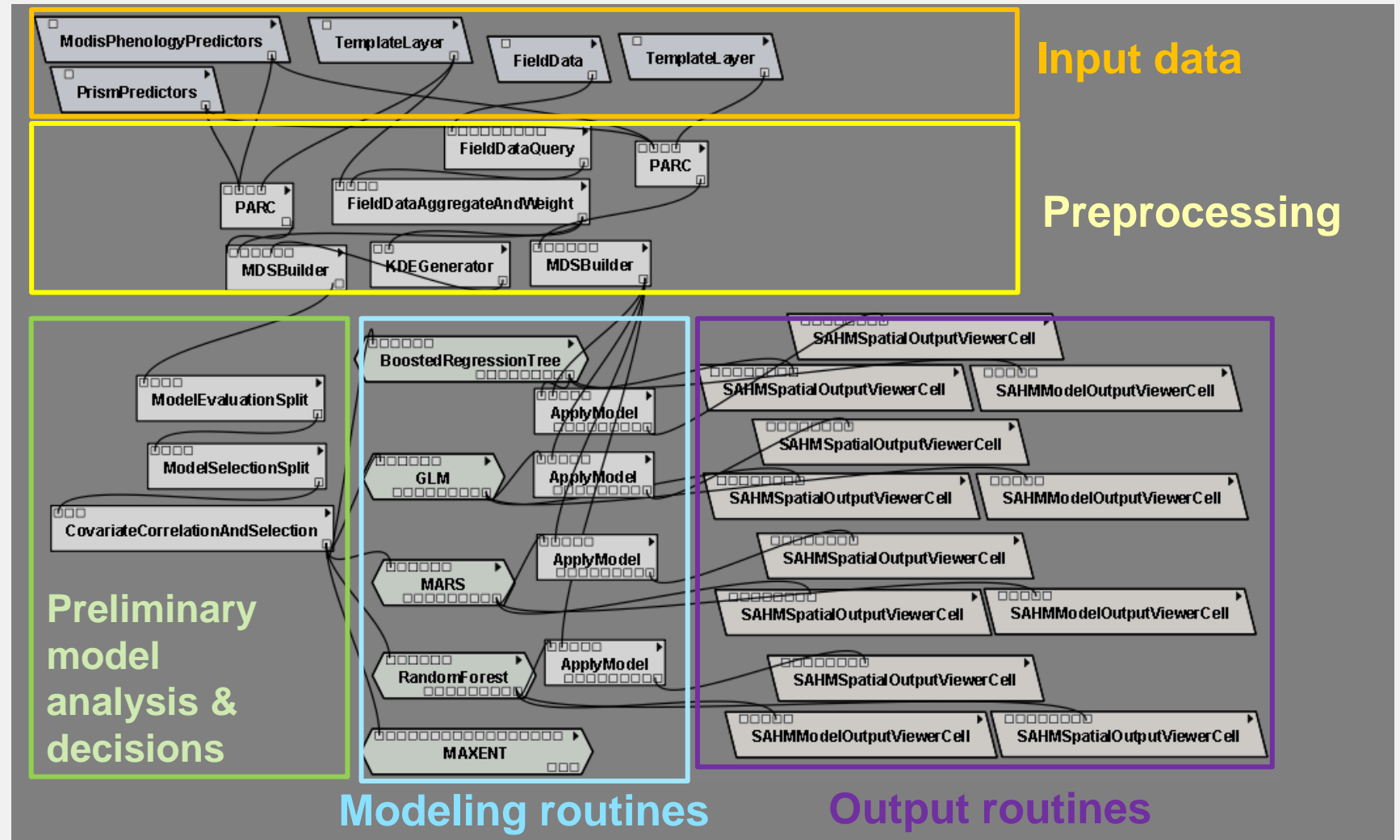
Morissette et al. 2013, Ecography



# Overview of Species Distribution & State-and-Transition Simulation Modeling

## VisTrails: SAHM software

VisTrails: SAHM  
standard workflow



Morisette et al. 2013, Ecography

# Overview of Species Distribution & State-and-Transition Simulation Modeling

## VisTrails: SAHM software

- Freely available software
- Google group:  
<https://groups.google.com/forum/?fromgroups=#!forum/vistrails-sahm>
- Ecography paper
- User's guide and tutorial
- Training materials  
<https://my.usgs.gov/catalog/RAM/SAHM>



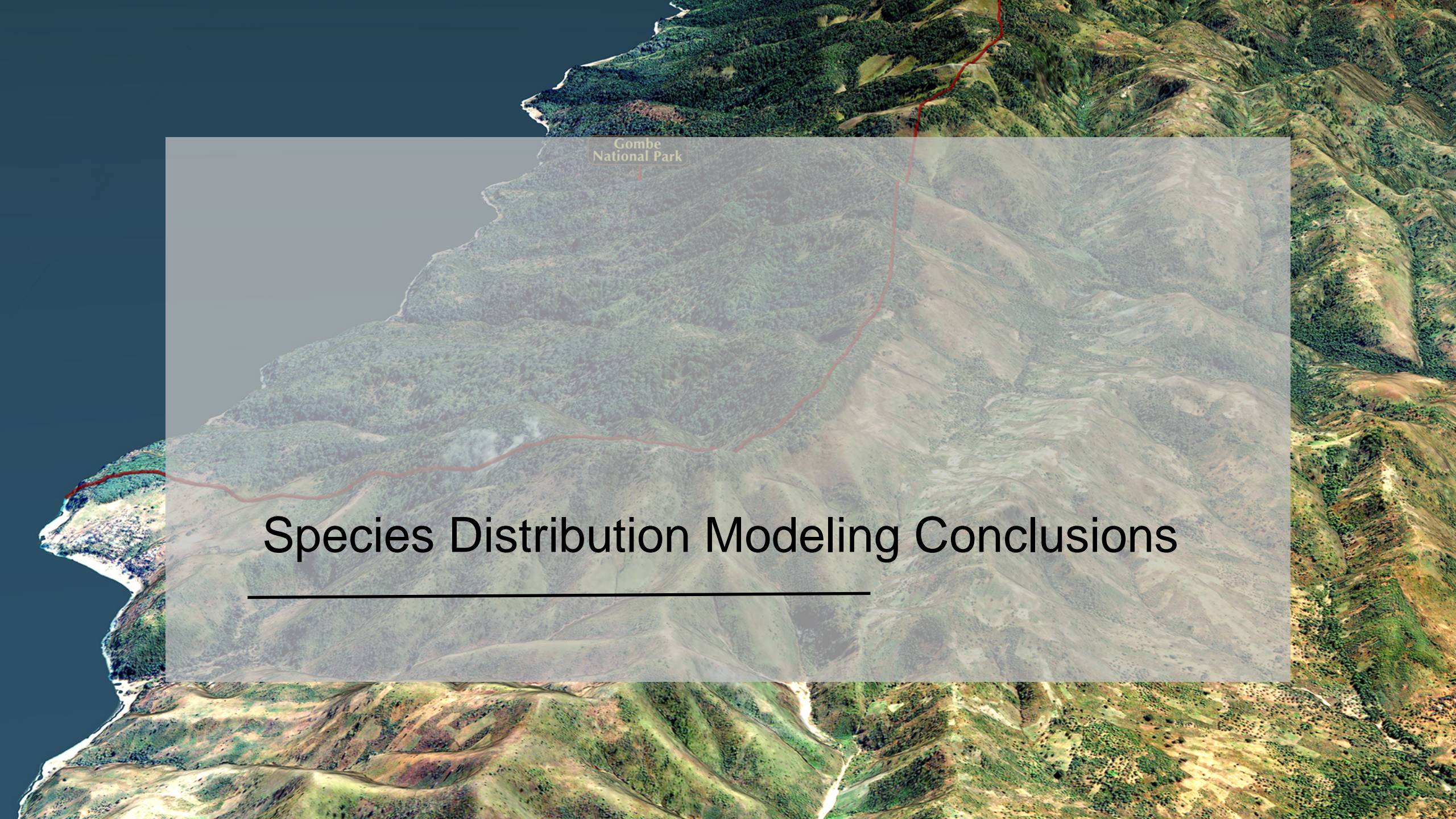
Ecography 36: 001–007, 2013  
doi: 10.1111/j.1600-0587.2012.07815.x  
© 2013 The Authors. Ecography © 2013 Nordic Society Oikos  
Subject Editor: Thiago Rangel. Accepted 16 November 2012

## VisTrails SAHM: visualization and workflow management for species habitat modeling

Jeffrey T. Morisette, Catherine S. Jarnevich, Tracy R. Holcombe, Colin B. Talbert, Drew Ignizio, Marian K. Talbert, Claudio Silva, David Koop, Alan Swanson and Nicholas E. Young

*J. T. Morisette (morissettj@usgs.gov), U.S. Geological Survey, North Central Climate Science Center, 2150 Centre Dr., Fort Collins, CO 80526, USA. – C. S. Jarnevich, T. R. Holcombe and C. B. Talbert, U.S. Geological Survey, Fort Collins Science Center, 2150 Centre Dr., Fort Collins, CO 80526, USA. – D. Ignizio and M. K. Talbert, Cherokee Services Group, LLC, Contractor to DOI-U.S. Geological Survey, 2150 Centre Dr., Fort Collins, CO 80526, USA. – C. Silva and D. Koop, Polytechnic Inst. of New York Univ., Six Metro Tech Center, Brooklyn, NY 11201, USA. – A. Swanson, 144 Burlington Ave., Missoula, MT 59801, USA. – N. E. Young, Natural Resource Ecology Lab, Colorado State Univ., Fort Collins, CO 80523, USA.*

The Software for Assisted Habitat Modeling (SAHM) has been created to both expedite habitat modeling and help maintain a record of the various input data, pre- and post-processing steps and modeling options incorporated in the construction of a species distribution model through the established workflow management and visualization VisTrails software. This paper provides an overview of the VisTrails:SAHM software including a link to the open source code, a table detailing the current SAHM modules, and a simple example modeling an invasive weed species in Rocky Mountain National Park, USA.



Gombe  
National Park

# Species Distribution Modeling Conclusions

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# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Species distribution modeling conclusions

- No universally correct way!
- Methodology adapted to
  - Ecological and biogeographical situation
  - Meet study goals
  - Available data
- VisTrails: SAHM is one software option



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# Simulation Models

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# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Species Distribution Modeling

- Correlative models of abiotic variables & species occurrence
- Common tool for estimating species response to climate
- *Does not project species distributions, models project suitable climates*
- *Does not account for disturbances, competition, or management*

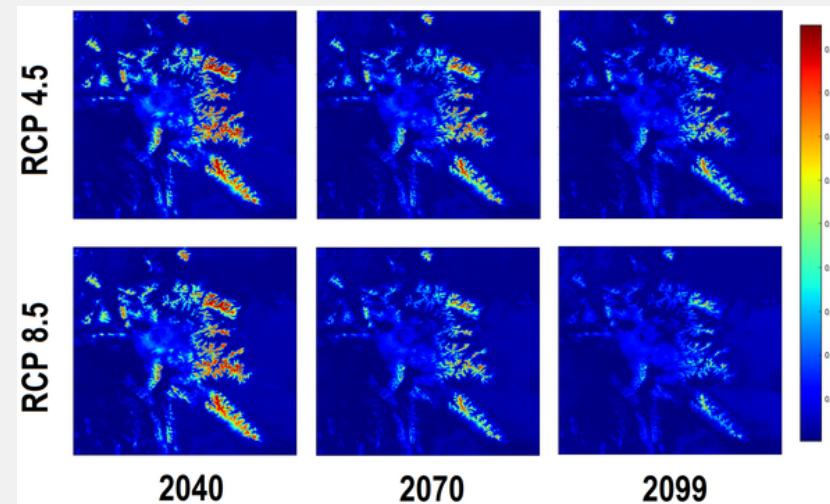
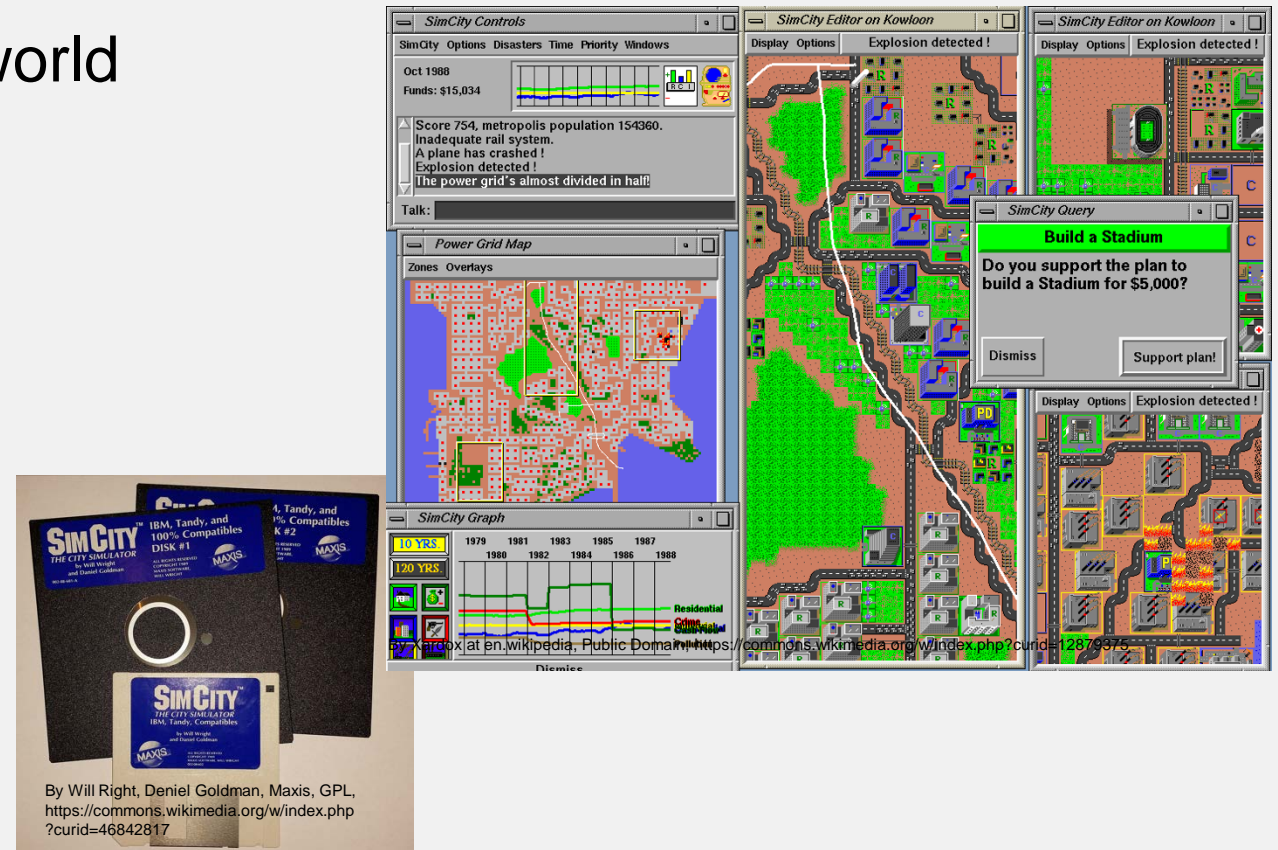


Image: Chang, T., Hansen, A.J. and, N., 2014. Patterns and variability of projected bioclimatic habitat for *Pinus albicaulis* in the Greater Yellowstone Area. PloS one, 9(11), p.e111669.

# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Simulation Models

- Computer-based prototype of real world

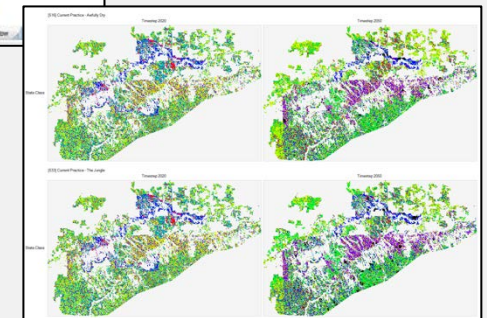
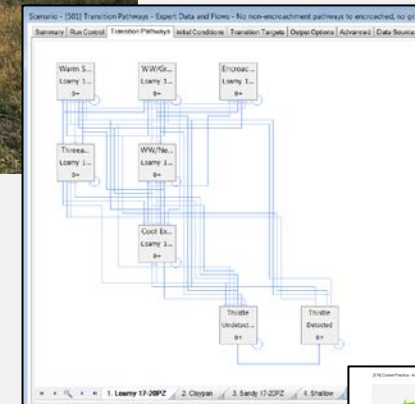
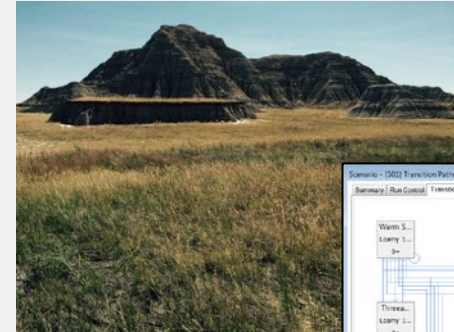




# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Simulation Models

- Computer-based prototype of real world
- Many kinds of simulation models:
  - Climate
  - Population
  - Biogeochemistry
  - Dynamic Global Vegetation Models
  - Agent-Based Models
  - State-and-Transition Simulation Models
  - Etc...

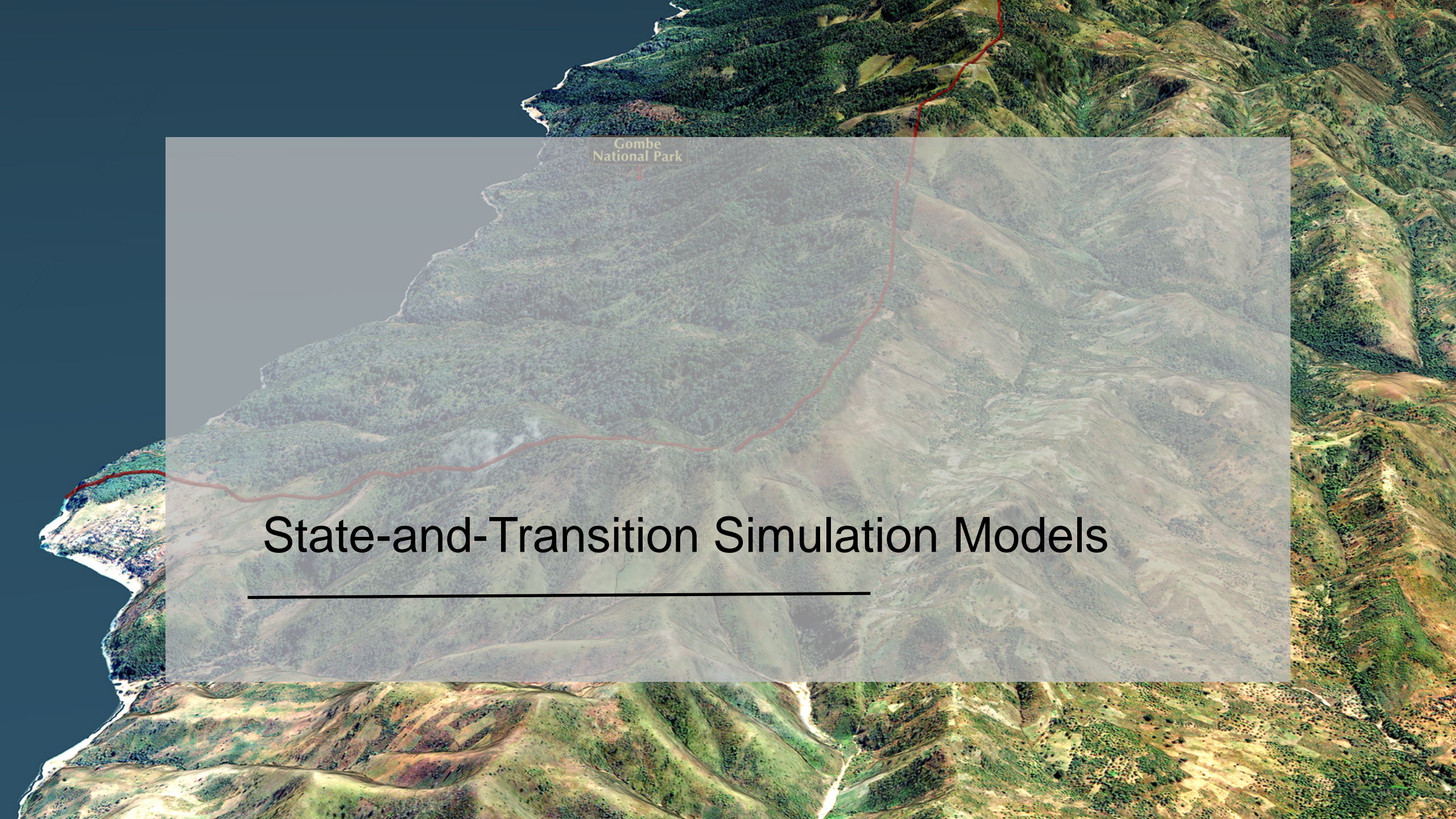


Images: B. W. Miller

# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Simulation Models

- Why Simulations?
  - Integrate data
  - Identify data gaps and influential uncertainties
  - Reproduce complexity
    - Thresholds, secondary effects, emergence
  - Understand processes
  - Explore “what if...?” scenarios
- What can't they do?
  - Create scenarios
  - Capture everything
  - Statistical analysis
  - Give you the answer



Gombe  
National Park

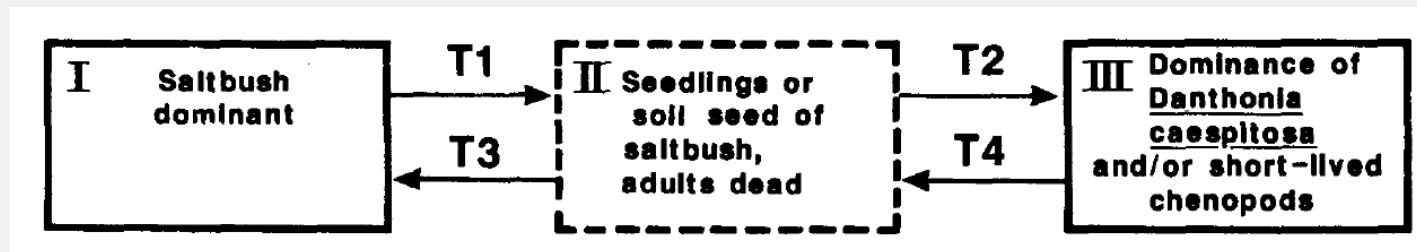
# State-and-Transition Simulation Models

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# Overview of Species Distribution & State-and-Transition Simulation Modeling

## State-and-Transition Simulation Models

- **States:** any suite of vegetation communities
- **Transitions:** process (natural or management) that can move vegetation between states



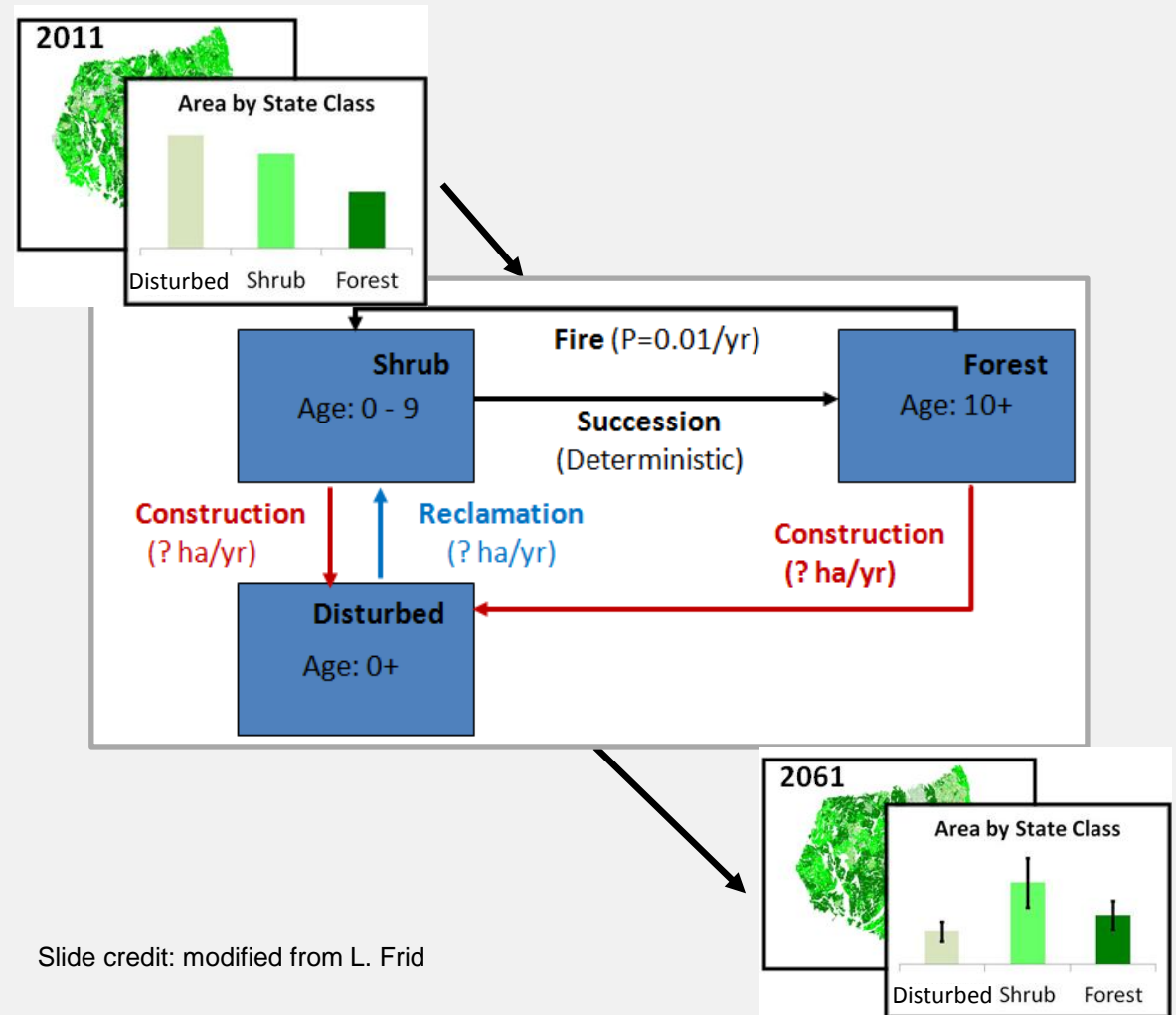
Source: Westoby et al. (1989)

Westoby, M., Walker, B. and Noy-Meir, I., 1989. Opportunistic management for rangelands not at equilibrium. Journal of range management, pp.266-274.

# Overview of Species Distribution & State-and-Transition Simulation Modeling

## State-and-Transition Simulation Models

- Stochastic simulation models
- Run using software
- Can be spatially explicit
- Model Inputs:
  - Transition probabilities and/or targets
  - Area in each state today
- Model Outputs:
  - Area in each state over time
  - Area transitioned over time
- → Predict vegetation dynamics (w/uncertainty)



Slide credit: modified from L. Frid

# Overview of Species Distribution & State-and-Transition Simulation Modeling

## State-and-Transition Simulation Models

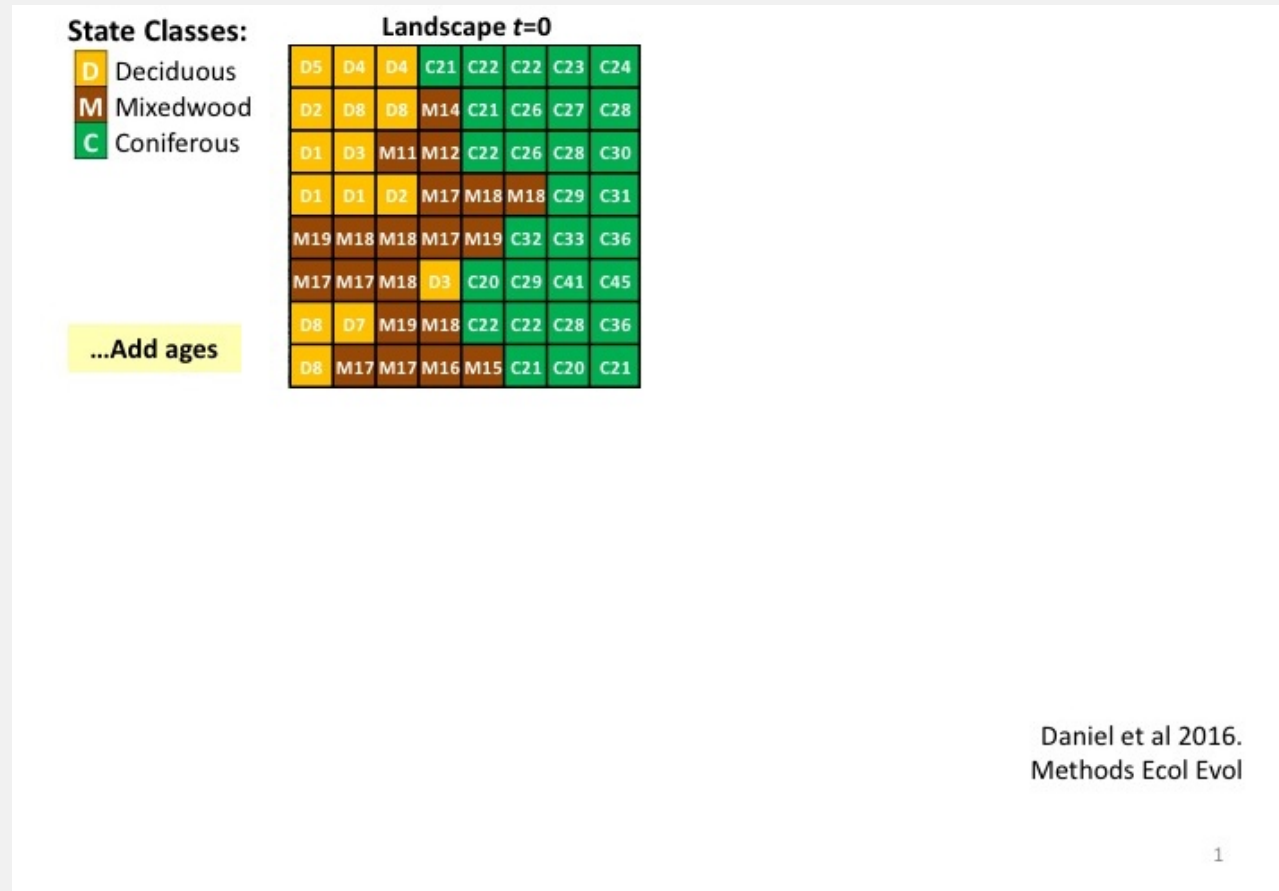


Image: L. Frid

Daniel, C. J., Frid, L., Sleeter, B. M. and Fortin, M.-J. (2016), State-and-transition simulation models: a framework for forecasting landscape change. *Methods Ecol Evol*, 7: 1413–1423.

# Overview of Species Distribution & State-and-Transition Simulation Modeling

## State-and-Transition Simulation Models

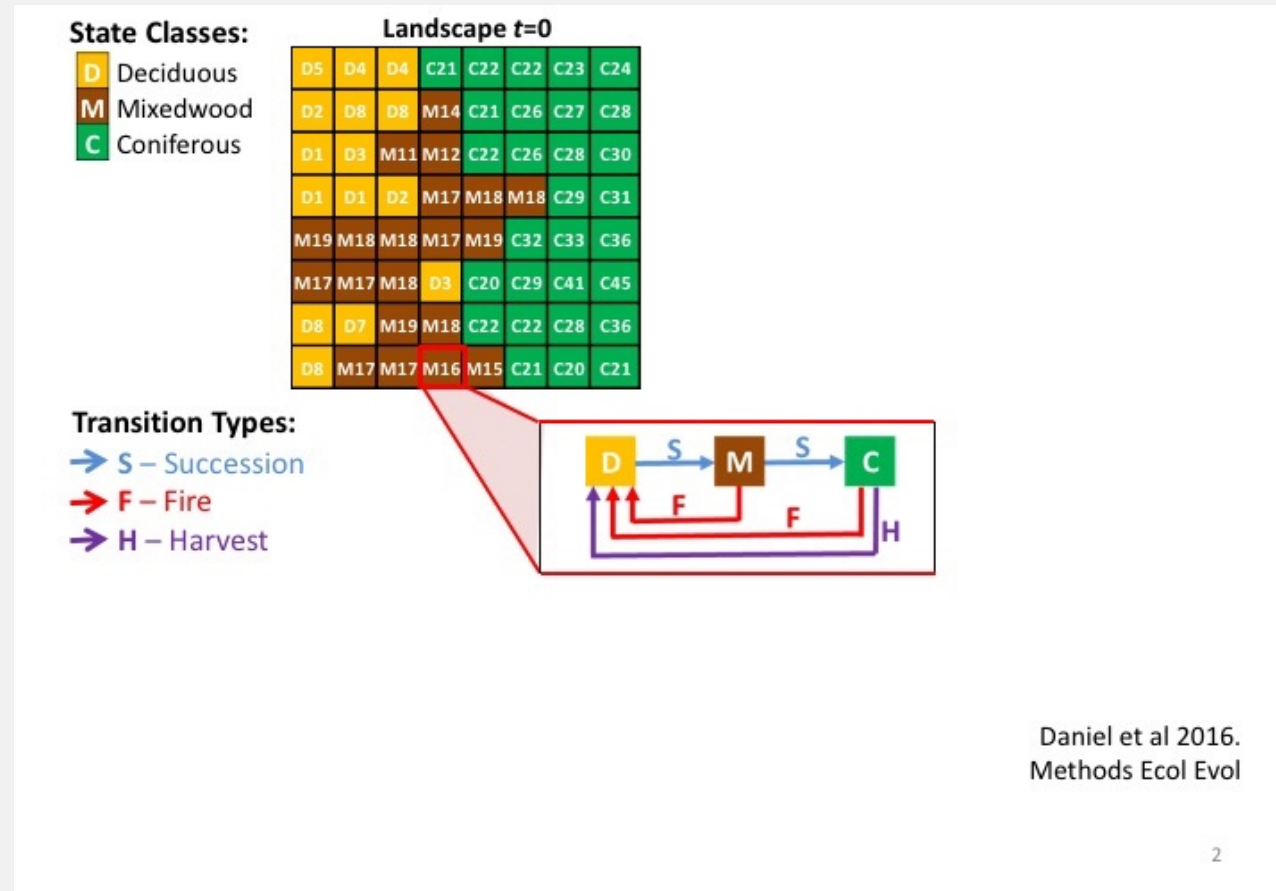


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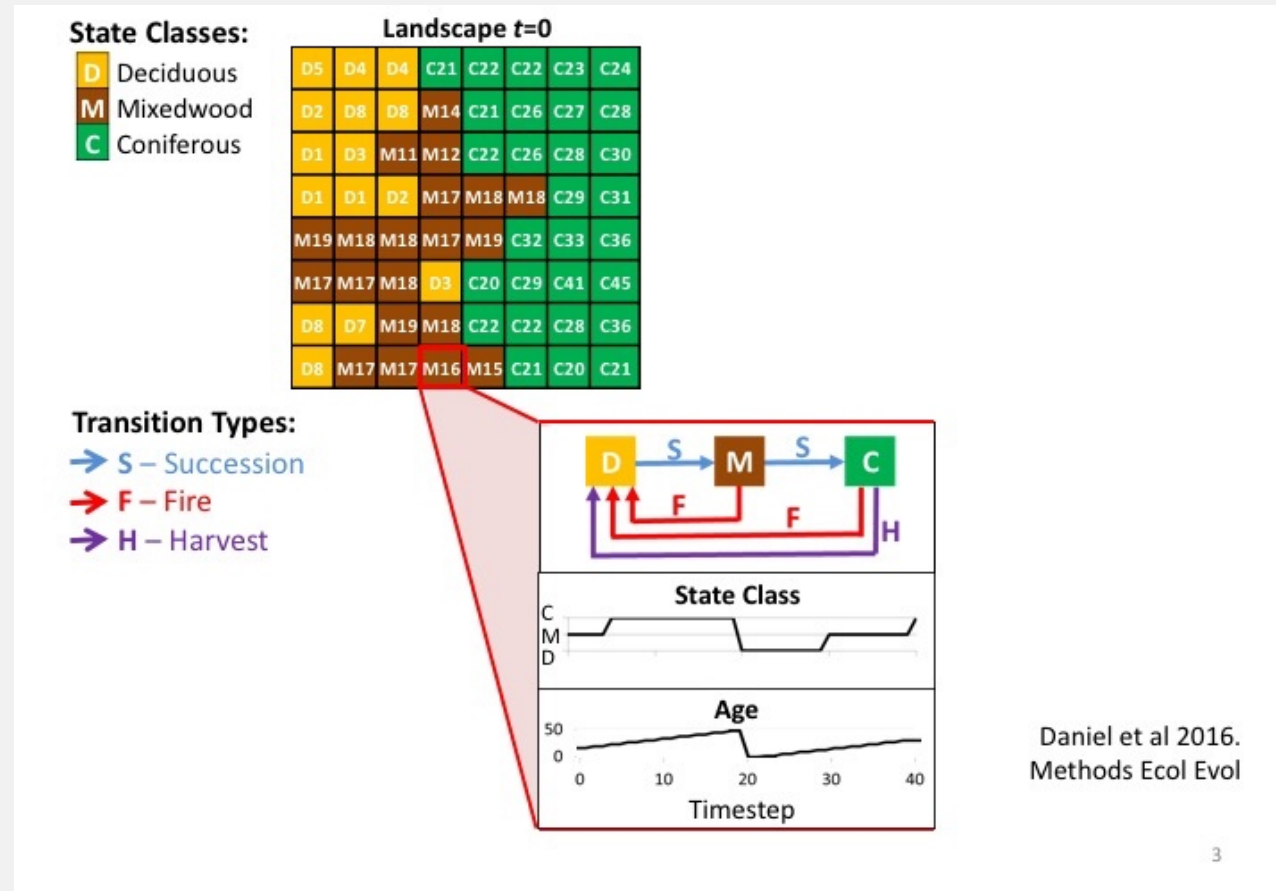


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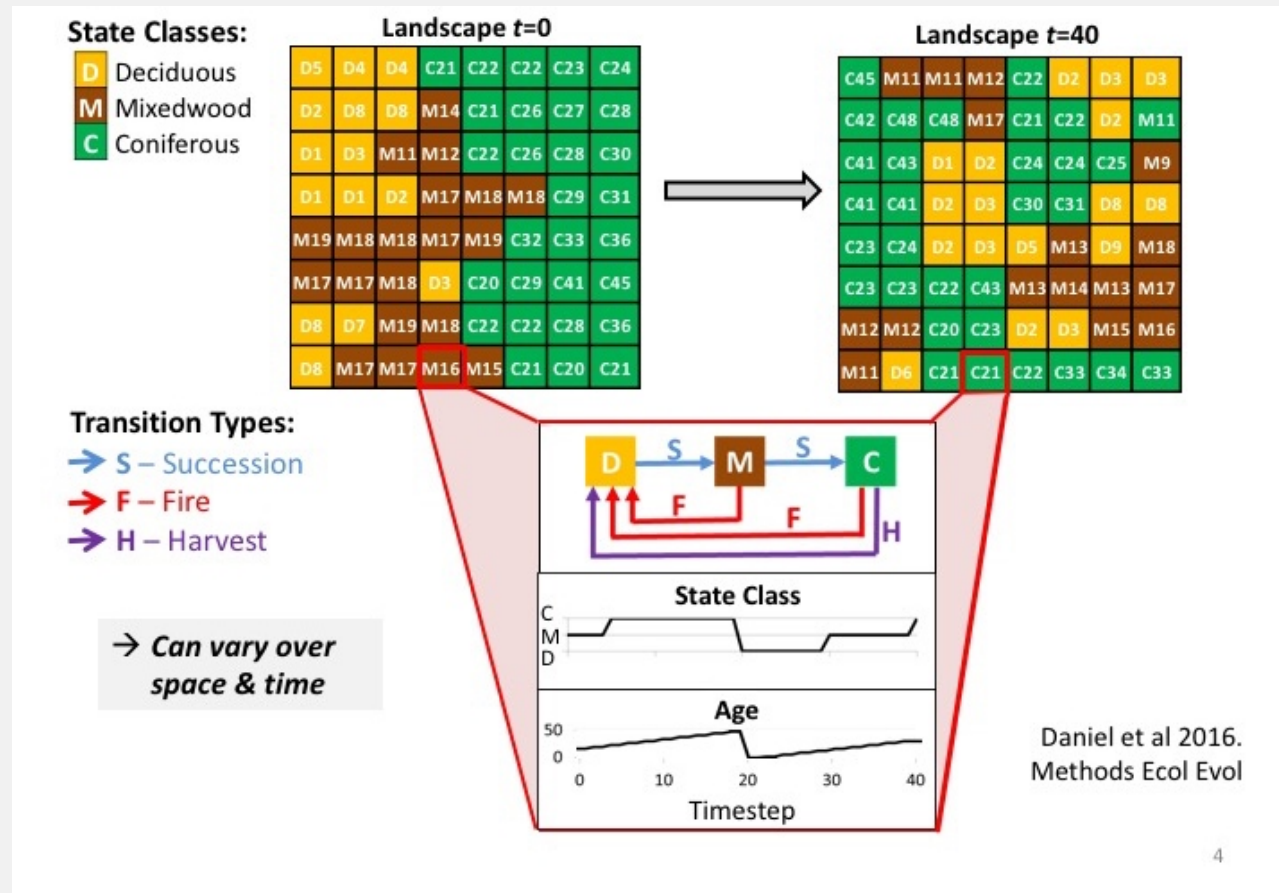


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## State-and-Transition Simulation Models

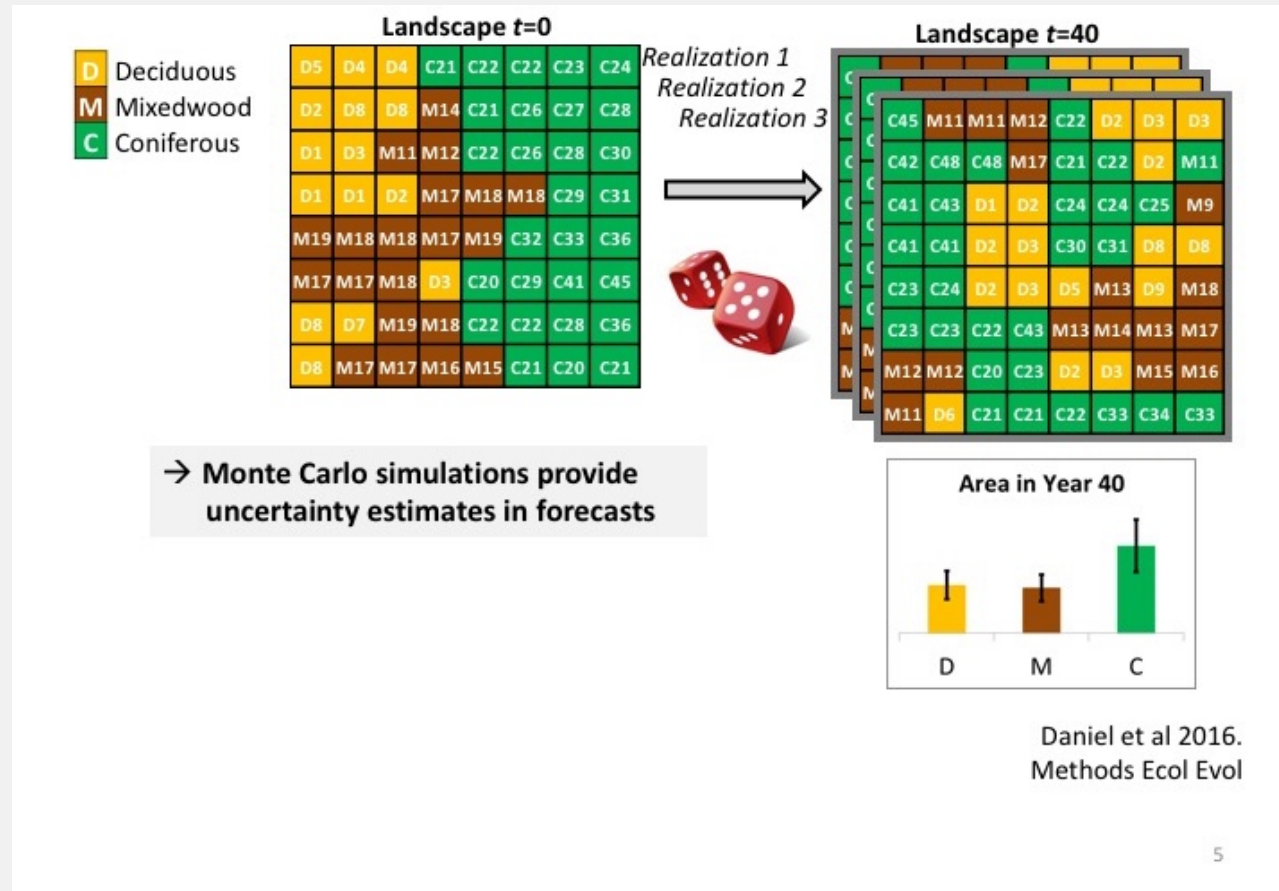


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# Overview of Species Distribution & State-and-Transition Simulation Modeling

## State-and-Transition Simulation Models

- Optional Model Features
  - Spatial autocorrelation (e.g., clustering)

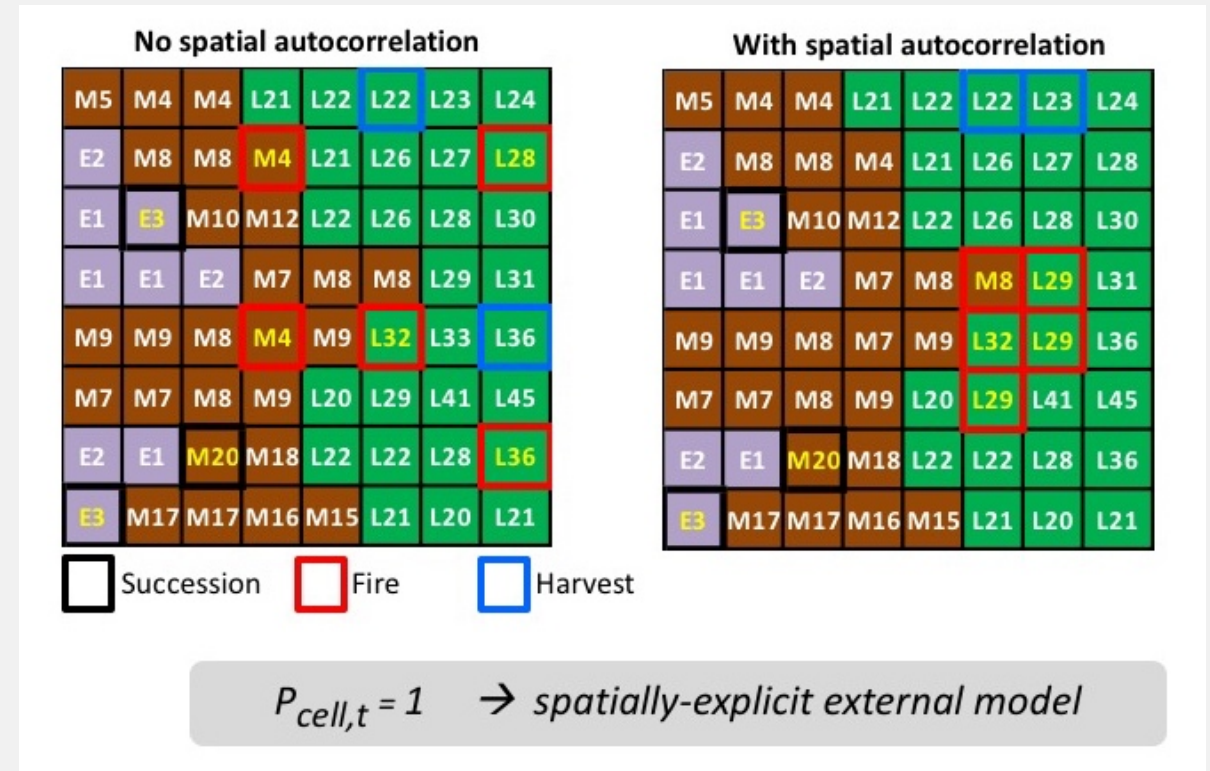


Image: L. Frid

# Overview of Species Distribution & State-and-Transition Simulation Modeling

## State-and-Transition Simulation Models

- Optional Model Features
  - Spatial autocorrelation (e.g., clustering)
  - Spatial and/or temporal variability in transitions (e.g., jurisdictions, fire)

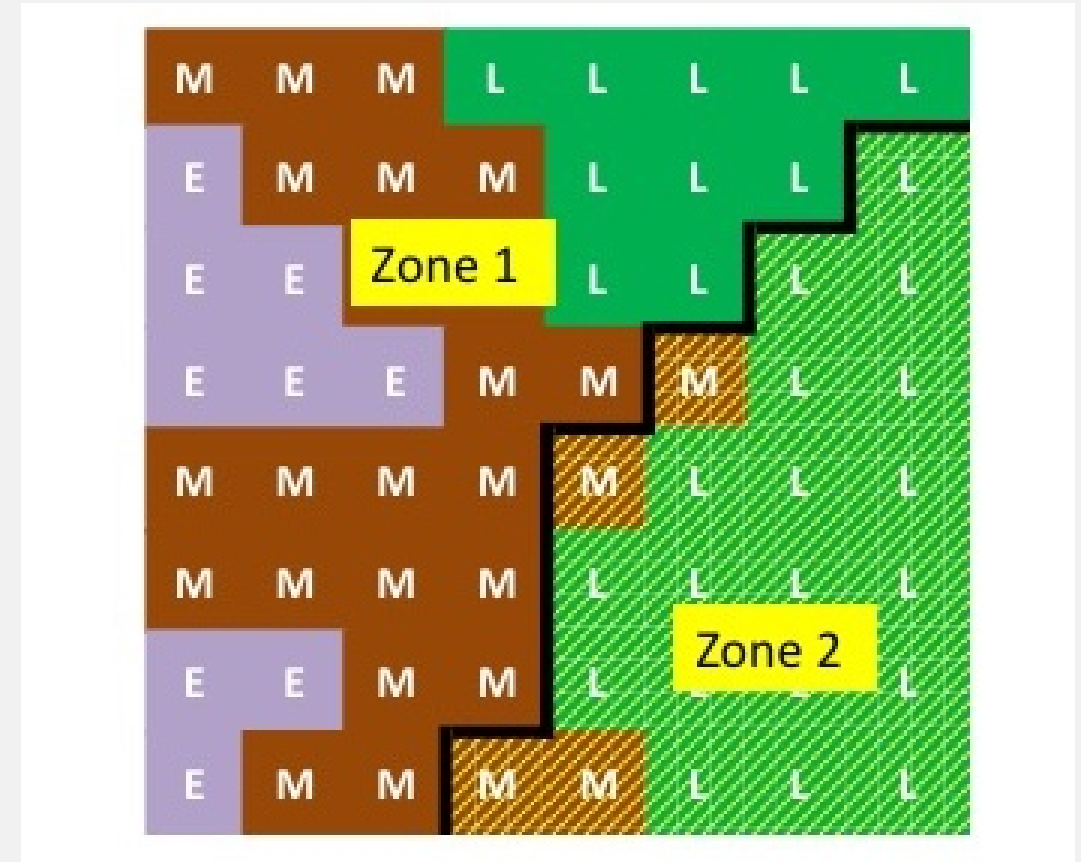


Image: L. Frid

# Overview of Species Distribution & State-and-Transition Simulation

## Modeling

### State-and-Transition Simulation Models

- Optional Model Features
  - Spatial autocorrelation (e.g., clustering)
  - Spatial and/or temporal variability in transitions (e.g., jurisdictions, fire)
  - Management targets (e.g., exotic species inventory and treatment)

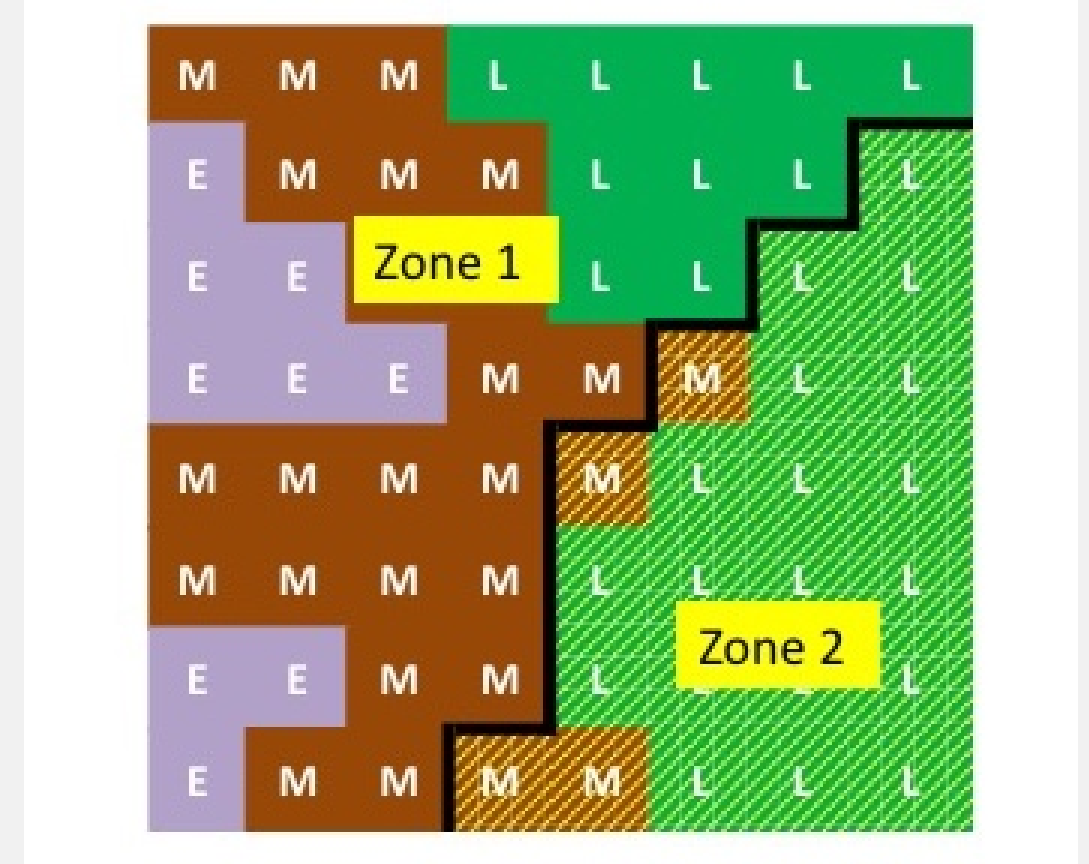
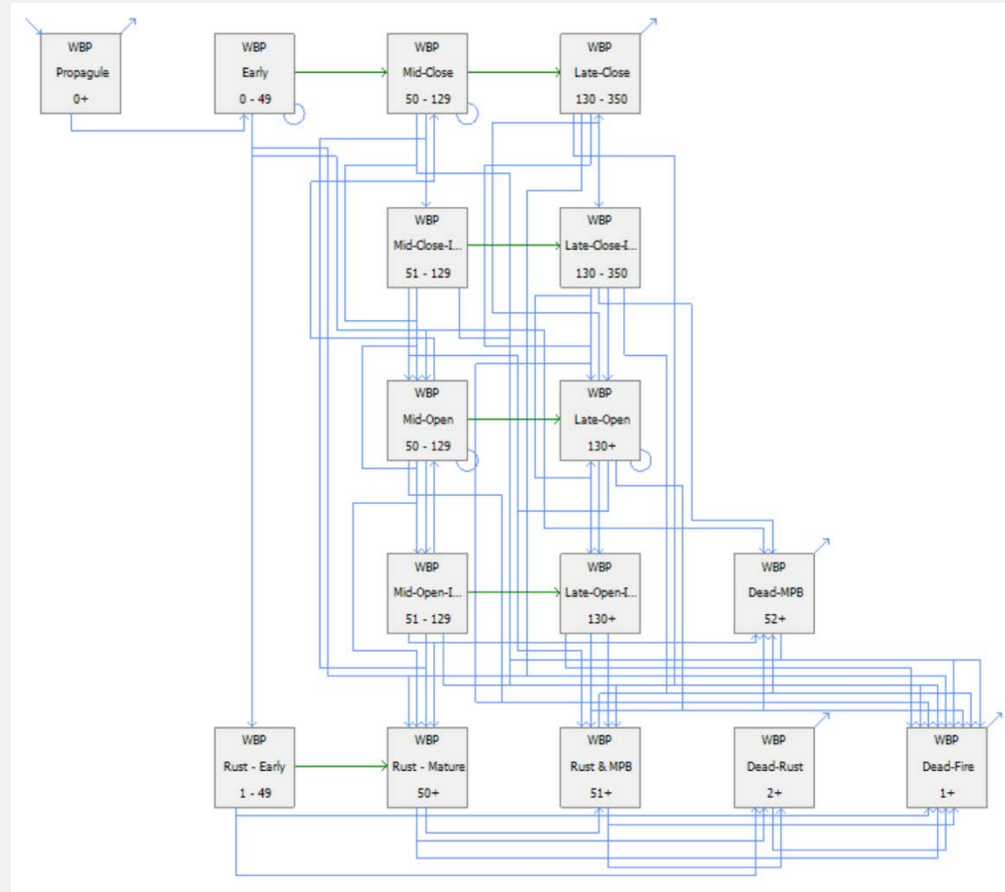


Image: L. Frid

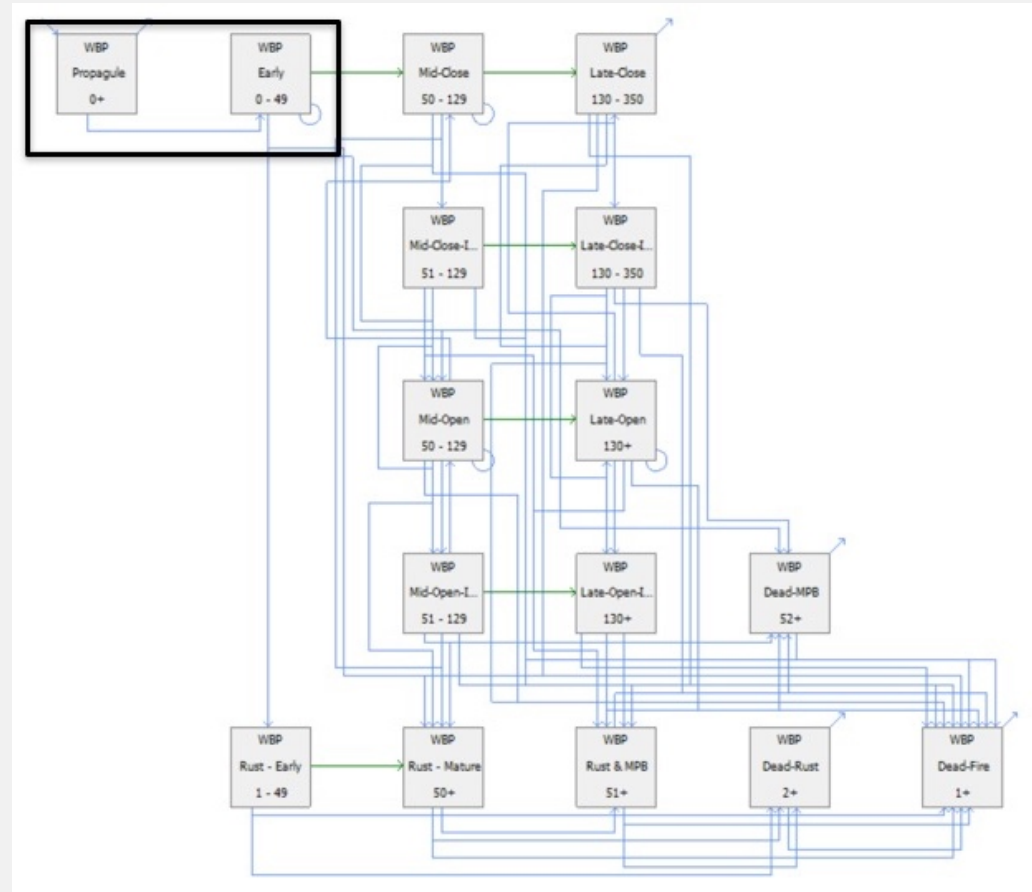
# Overview of Species Distribution & State-and-Transition Simulation Modeling

## State-and-Transition Simulation Models



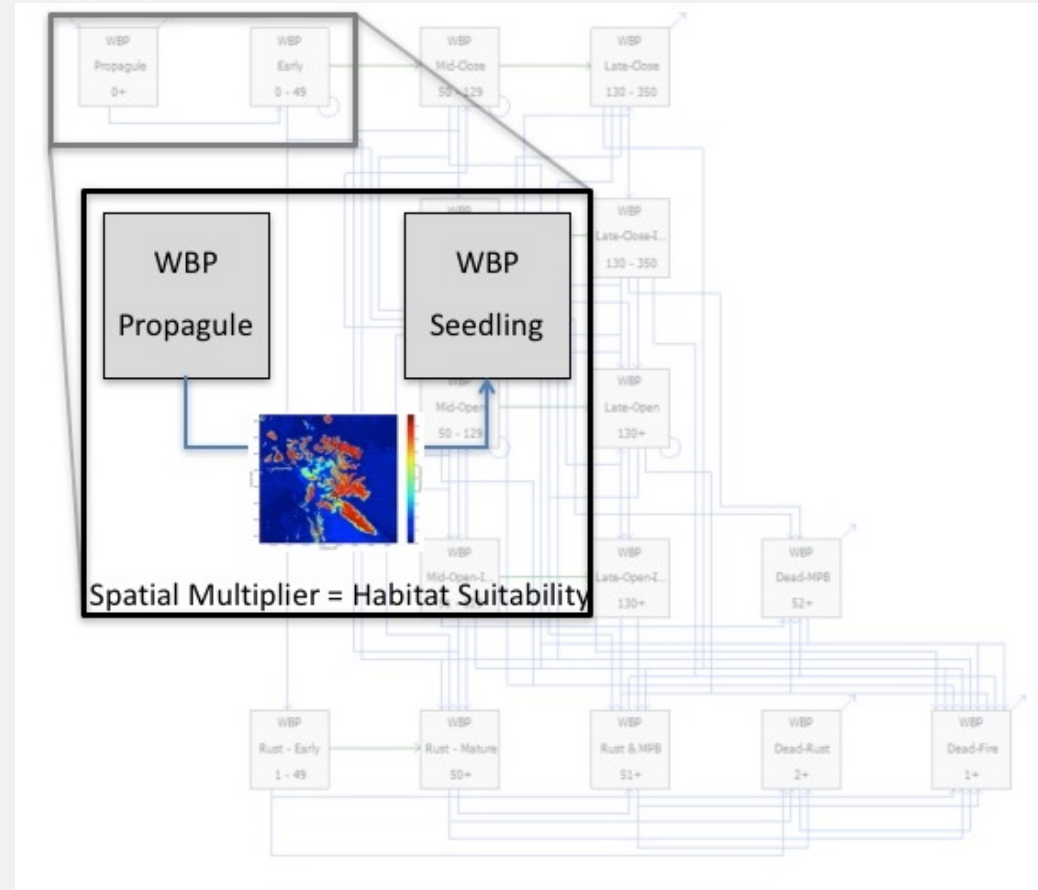
# Overview of Species Distribution & State-and-Transition Simulation Modeling

## State-and-Transition Simulation Models



# Overview of Species Distribution & State-and-Transition Simulation Modeling

## State-and-Transition Simulation Models

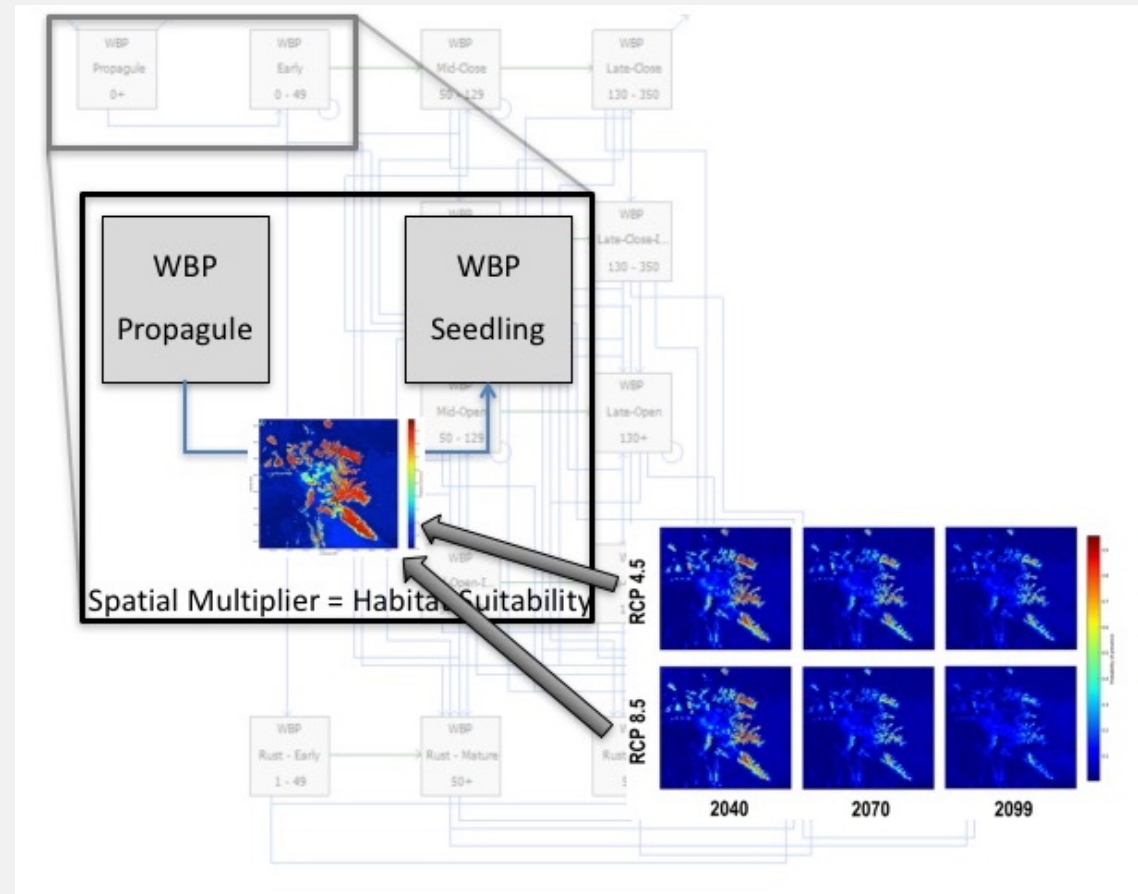


Miller, BW, L Frid, T Chang, N Piekielek, AJ Hansen, JT Morisette. 2015. Combining state-and-transition simulations and species distribution models to anticipate the effects of climate change. AIMS Environmental Science 2(2):400–426.



# Overview of Species Distribution & State-and-Transition Simulation Modeling

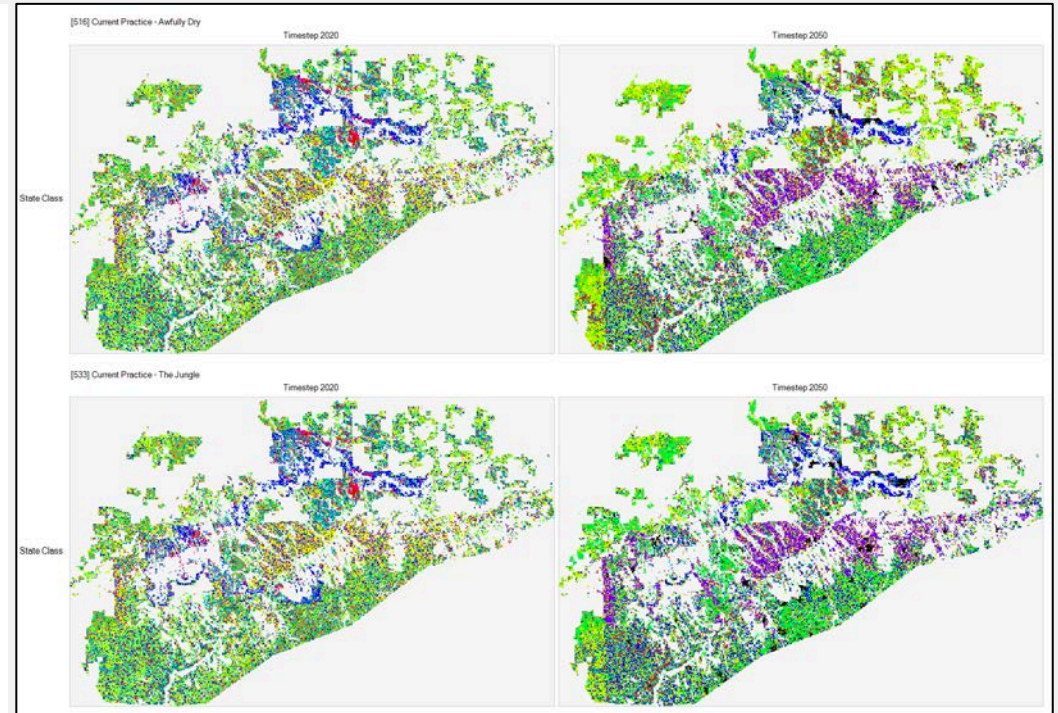
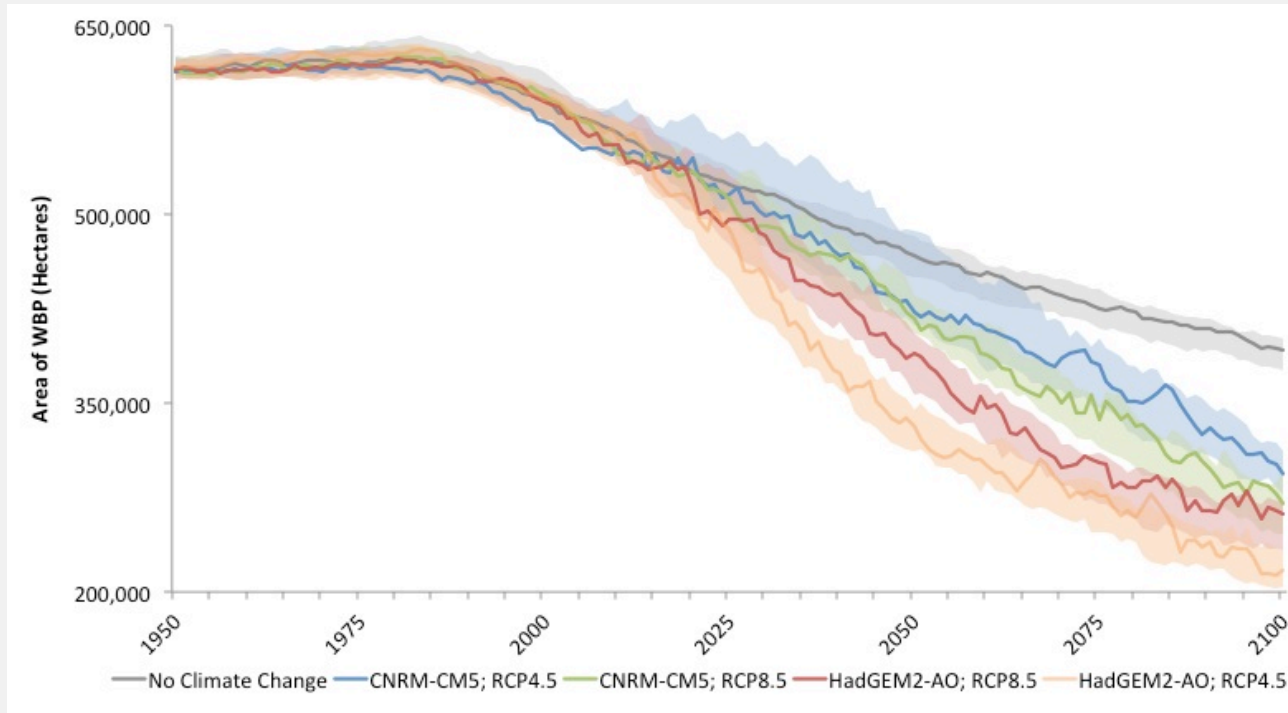
## State-and-Transition Simulation Models



Miller, BW, L Frid, T Chang, N Piekielek, AJ Hansen, JT Morisette. 2015. Combining state-and-transition simulations and species distribution models to anticipate the effects of climate change. AIMS Environmental Science 2(2):400–426.

# Overview of Species Distribution & State-and-Transition Simulation Modeling

## State-and-Transition Simulation Models



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# Overview of Species Distribution & State-and-Transition Simulation Modeling

## ST-Sim Software

- Free software for building and running STSMs: [www.apexrms.com](http://www.apexrms.com)
- Released in 2013
- Next generation of TELSA & VDDT
- 15 peer-reviewed publications since 2014

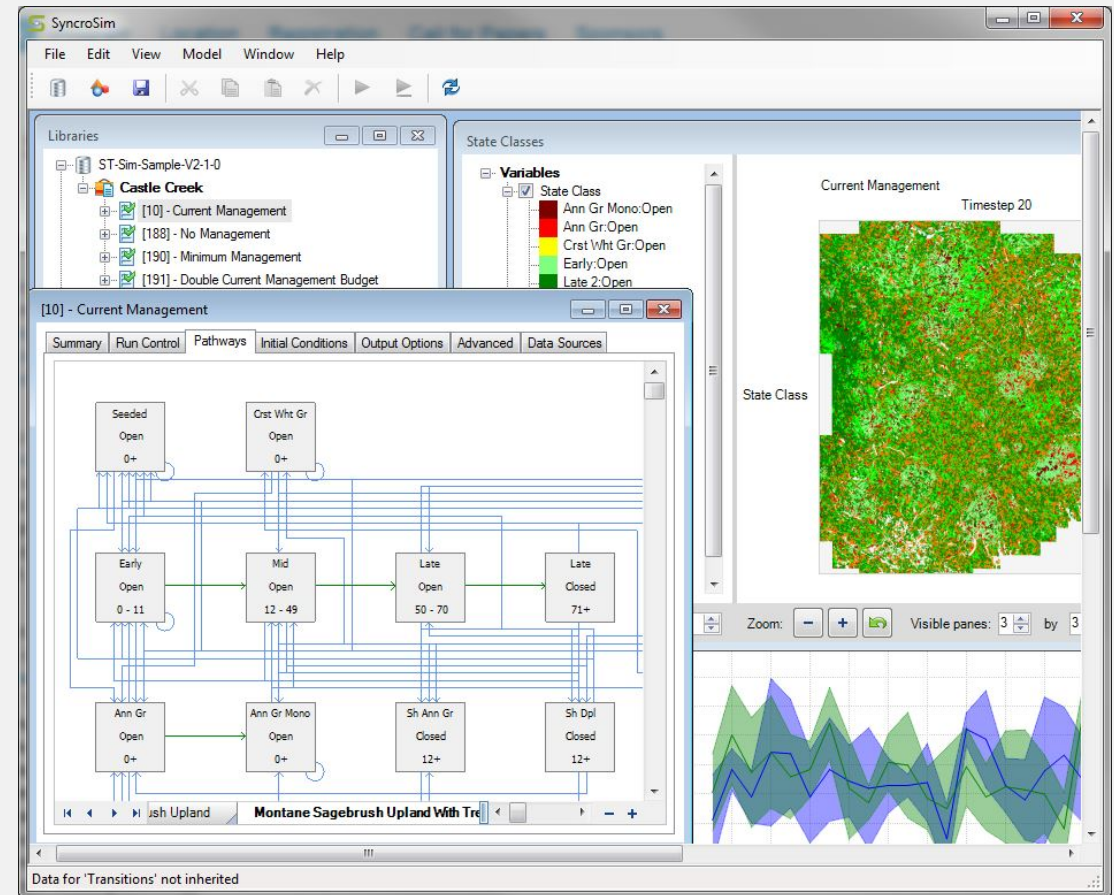


Image: L. Frid

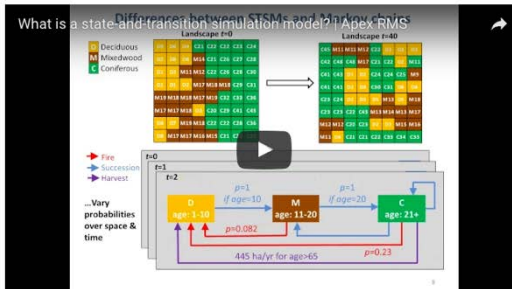
# Overview of Species Distribution & State-and-Transition Simulation Modeling

## ST-Sim Software

- Video Tutorials
- “SyncroSim” -> “Getting Started”
- [http://syncrosim.com/index.php?title=Getting\\_Started](http://syncrosim.com/index.php?title=Getting_Started)

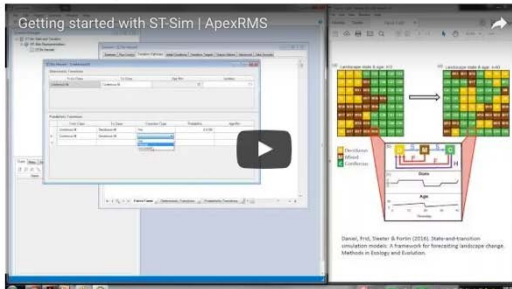
**What is a state-and-transition simulation model?**

This 13 minute video provides an overview of the state-and-transition simulation model (STSM) approach for projecting I




**Getting started with ST-Sim: creating a simple non-spatial model**

This brief tutorial will provide you with an overview of ST-Sim (version 3).



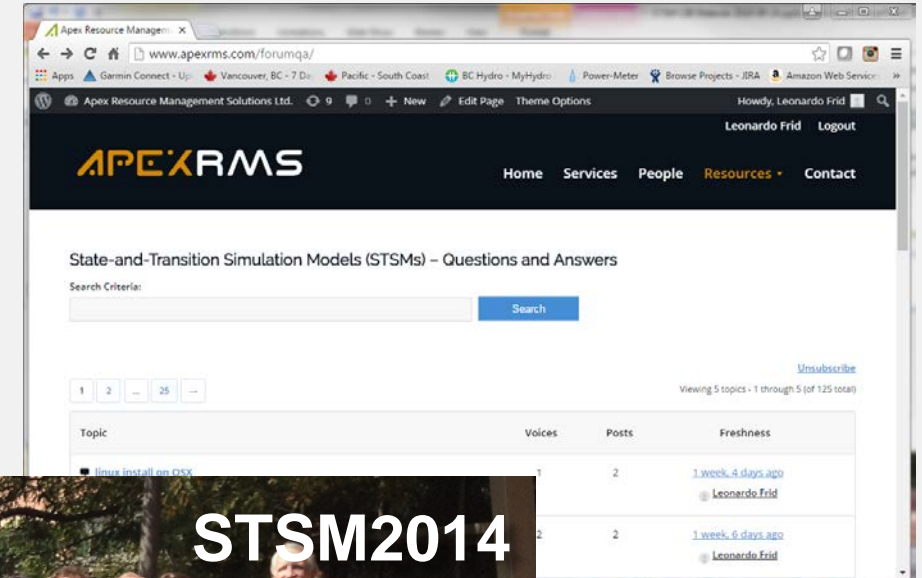
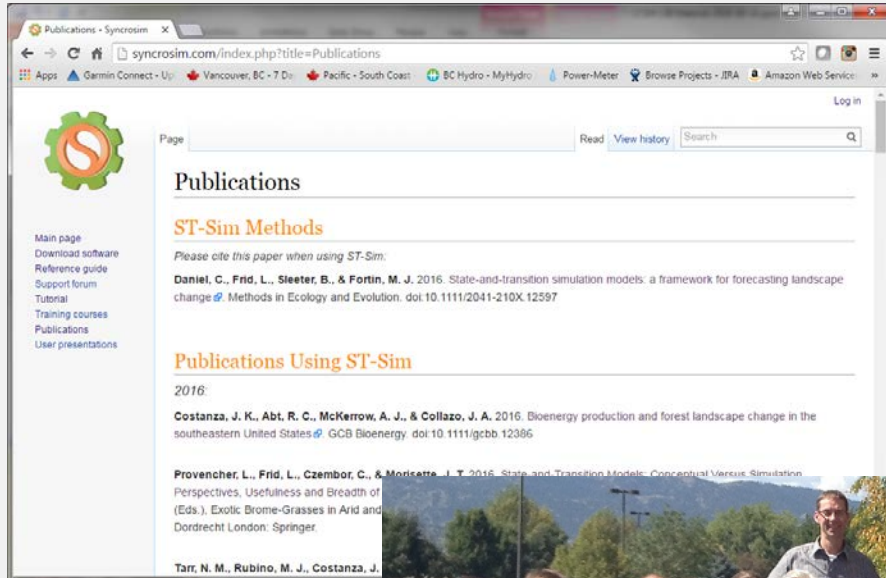
**Spatial models in ST-Sim: getting from non-spatial to spatial**

In this tutorial, we will take the non-spatial model created in the previous tutorial and turn it into a spatial model. You will



Note that a copy of the ST-Sim library produced in the tutorial can be found [here](#). Extract the contents of the ZIP file to

# Overview of Species Distribution & State-and-Transition Simulation Modeling ST-Sim Software



Images: L. Frid



# Overview of Species Distribution & State-and-Transition Simulation Modeling

## Conclusions

- State-and-Transition Simulation Models (STSMs)
  - Integrate existing knowledge
  - Identify data gaps & research priorities
  - Explore “what if” climate & management scenarios
- Simulations can leverage the strengths of other methods (e.g. species distribution modeling)



Gombe  
National Park

Questions?

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