

# Inter-LCC Greater Sage-grouse Research Projects

## Results and Applications to Inform Landscape-scale Management



How Did We Get Here?



# Region 6

## Inter-LCC Sage-Grouse Collaboration Proposal

Spoke to a paradigm shift in sage-grouse management

### Envisioned paradigm:

- Collaboration among management entities at range-wide and LCC scales
- Coordination of planning and implementation to reduce redundancy, target efforts to high priorities and increase efficiency
- Management informed by science-based decision support tools
- Sage-grouse data shared and available to all through a common data portal
- WAFWA as appropriate entity to lead collaborative efforts

# Collaboration Started with Oversight Committee

- Developed and distributed RFP & scoring criteria
- OC makeup, 23 individuals with science/sage-grouse expertise or responsibility
  - 6 state Division of Wildlife sage-grouse biologists/researchers
  - 5 LCC Science Coordinators
  - 7 Federal (FWS, BLM, USFS, USGS)
  - 3 University Professors
  - 2 WAFWA (Stiver and Remington)

# RFP – called for:

- Meaningful impact to sage-grouse conservation in the short term, completed by 30 Sept. 2015
- Large-scale; at least at scale of single LCC, ideally multi-LCC
- Research to fill data gaps, mapping, decision support tools, adaptive management constructs, evaluate effectiveness of current management, etc. eligible
- Data must be made available to LC MAP portal, appropriate protections allowed

- 42 proposals received requesting \$5.13 million, leveraging over \$6 million
- Reviewed and ranked by 13 OC members
- Funding awarded to 4 projects



# Revisions:

Principal Investigators	Title
Mike Gregg, FWS	Using cheatgrass suppressive soil bacteria to break the fire cycle and proactively maintain greater sage-grouse habitats
Collin Homer, USGS Matt Bobo, BLM	Annual Grass Cover Mapping for Greater Sage-Grouse Conservation
Lyman McDonald Ryan Nielson West, Inc.	Analysis of Greater Sage-Grouse Lek Data: Trends in Peak Male Counts, 1965-2015

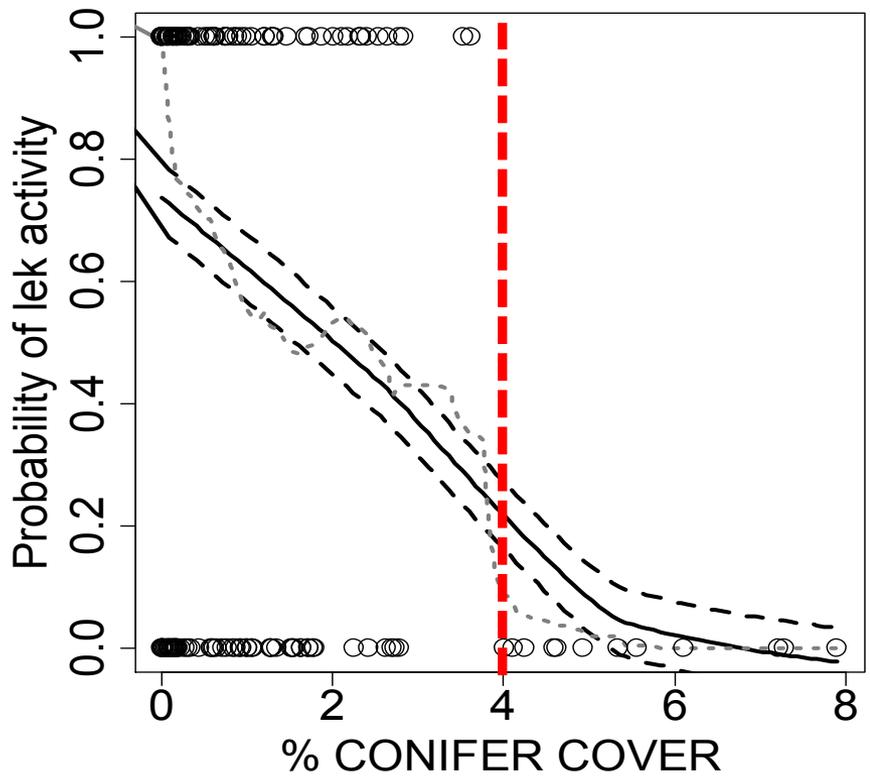
# Sage Grouse Hate Trees: A Range-Wide Solution for Increasing Bird Benefits Through Accelerated Conifer Removal

Michael J. Falkowski  
Colorado State University  
Department of Ecosystem Science and Sustainability

Collaborators: Aaron Poznanovic (UMN), Dave Naugle (UMT/SGI), Jeremy Maestas (NRCS), Christian Hagen (OSU/LPCI), Jeffery Evans (TNC), Brady Allred (UMT)

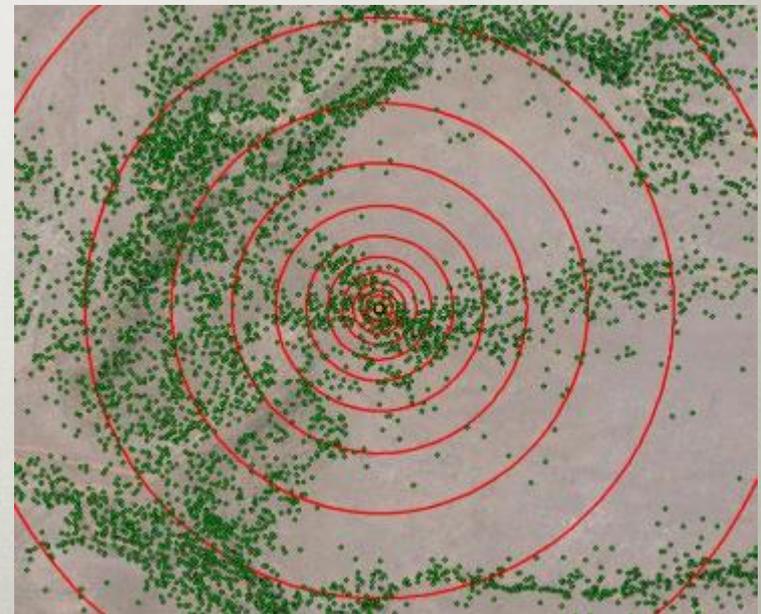
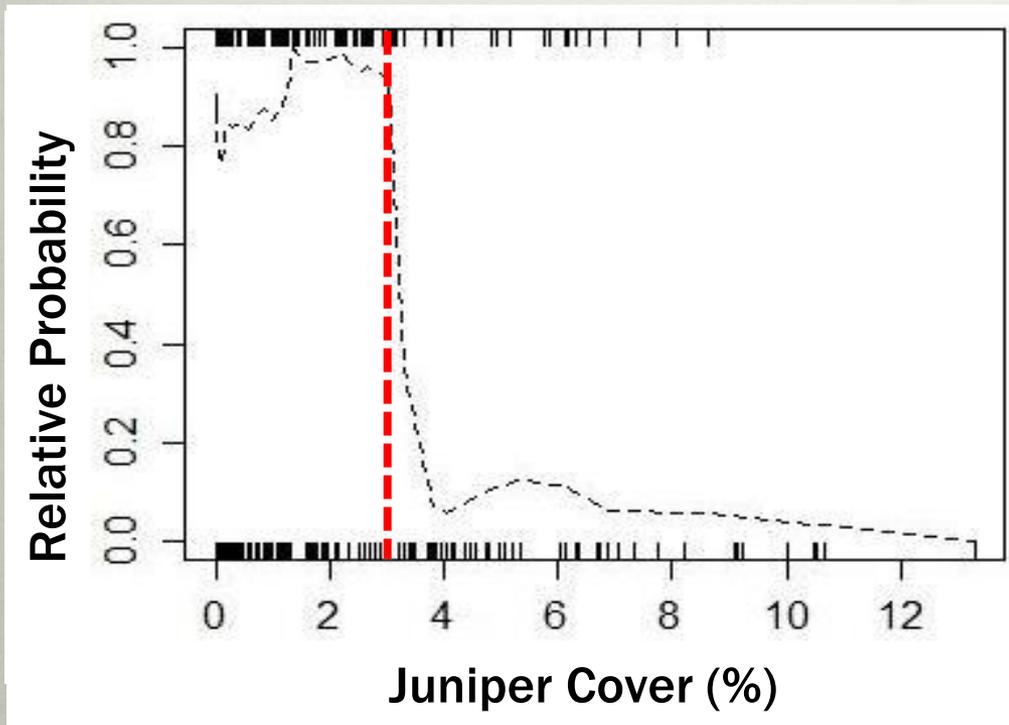


# Top down threat with population-level impacts at low levels of tree cover

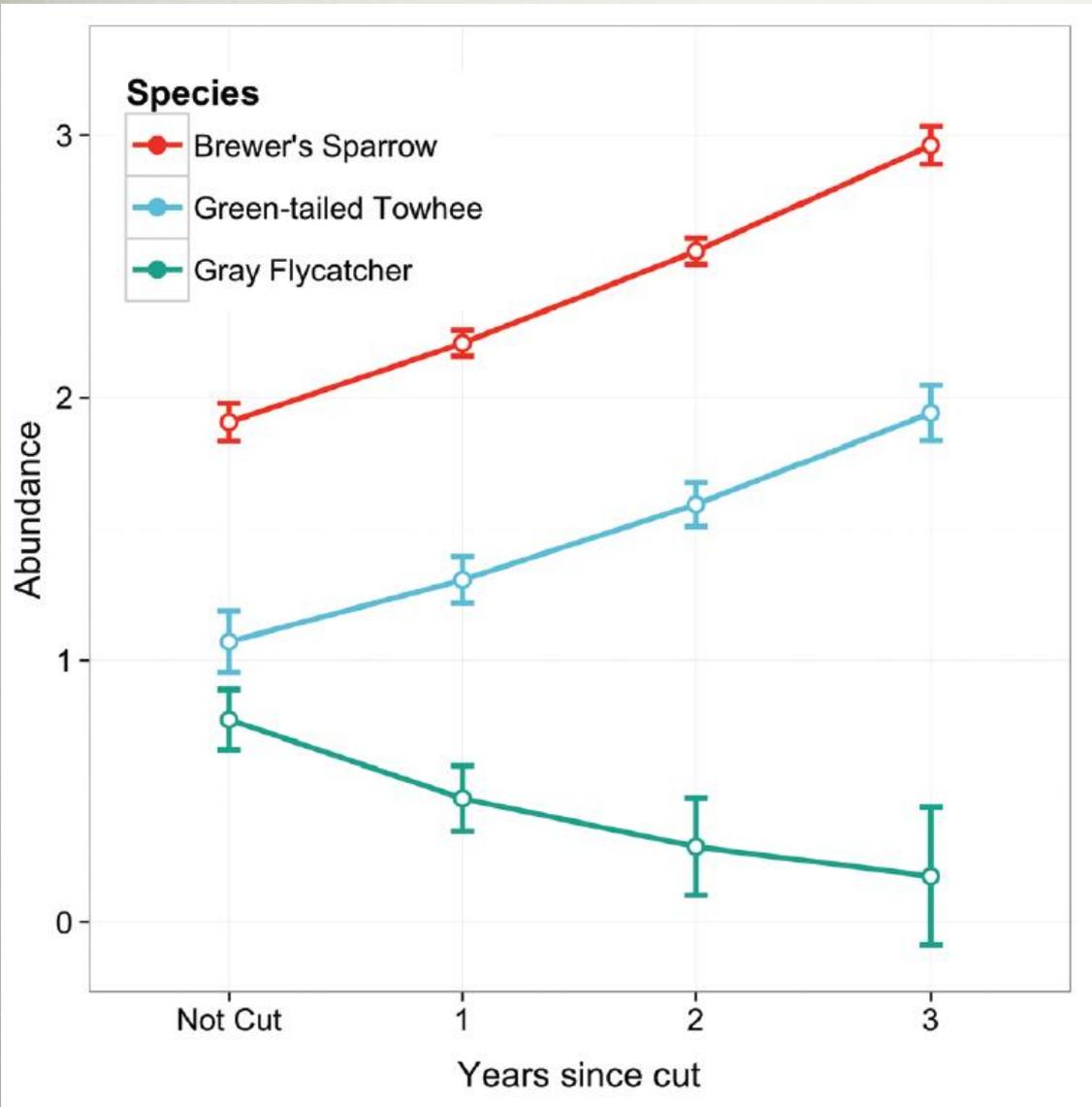




## Sage-Grouse Nesting Impacts



# It's not just about grouse....



+55%

Sagebrush  
Obligates of  
High  
Conservation  
Concern

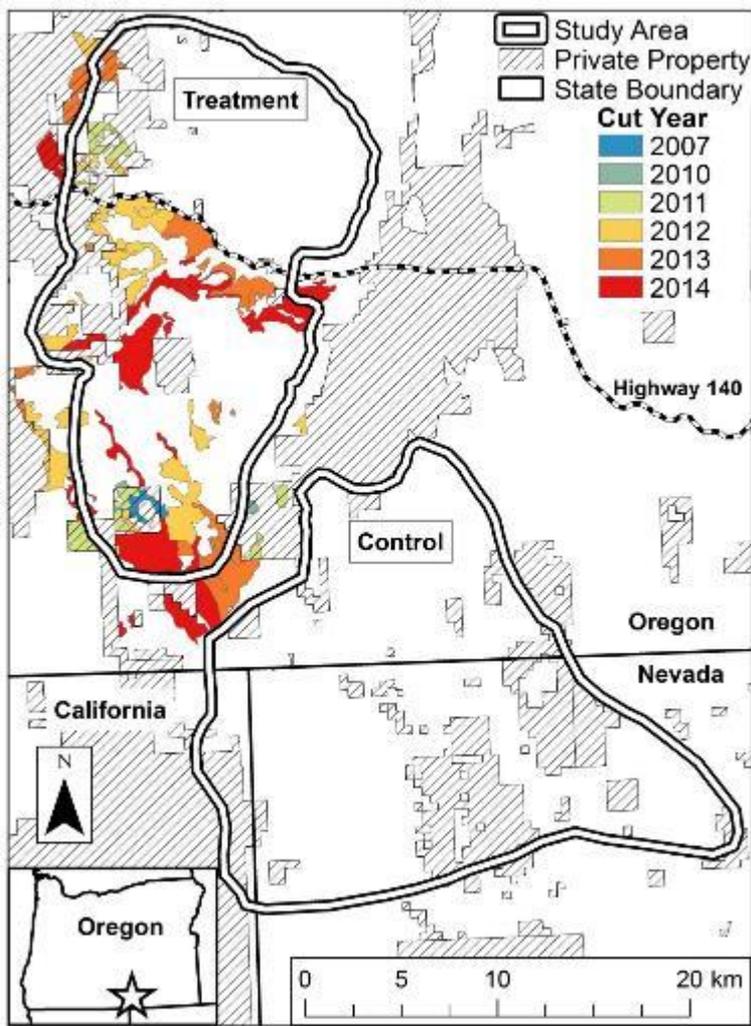


+85%



Open Woodland  
Songbird

# Does conifer removal work?

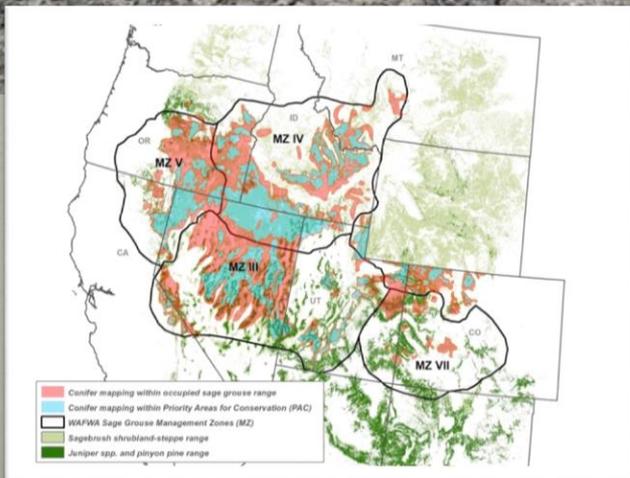


- Tree removal increased available nesting habitat by 28%
- Probability of use of newly restored sites increased by 22% annually
- Hens were 43% more likely to nest within 1000 m of treatments
- 29% of marked birds shifted nesting into treated habitats



## Where Are the Trees?

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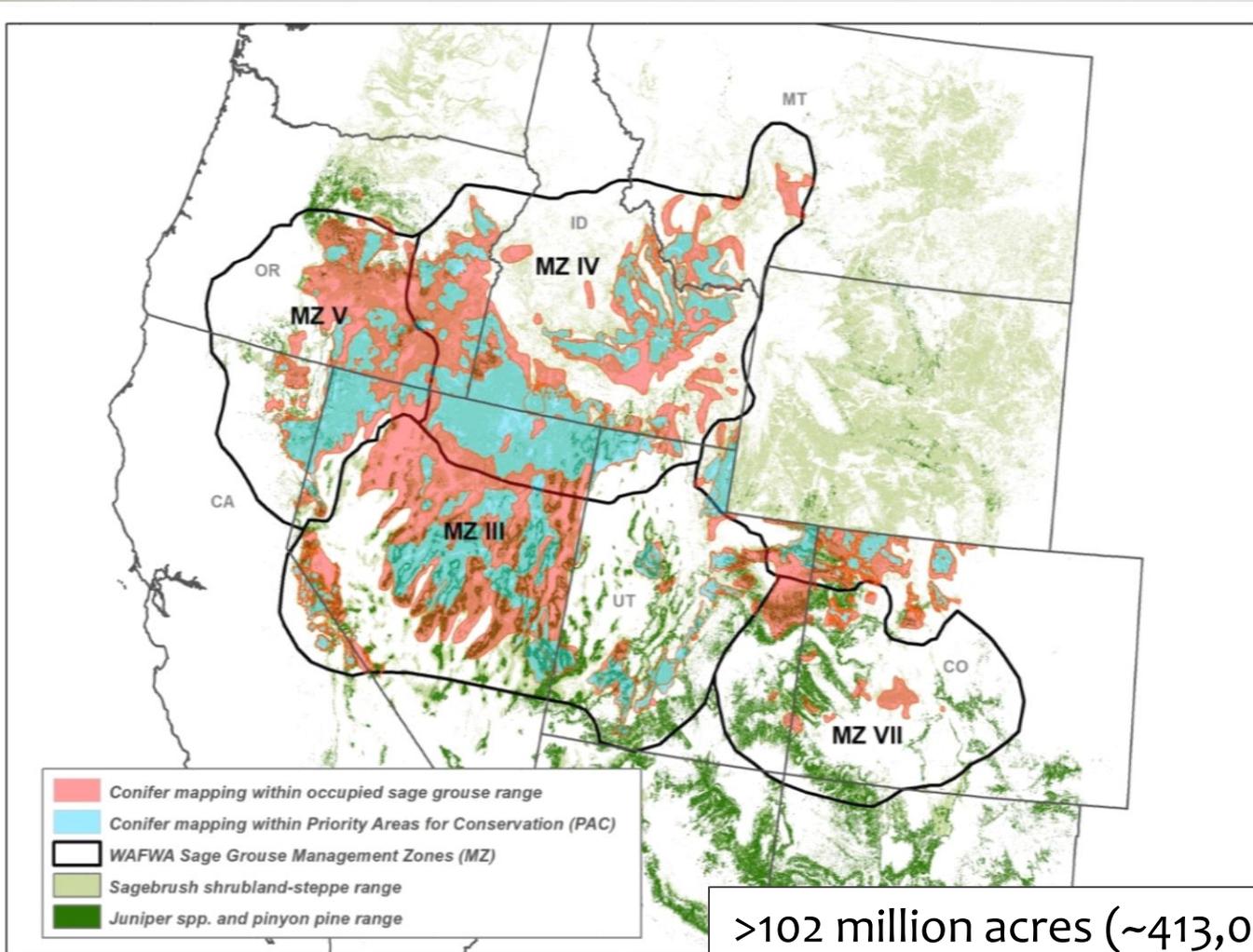


How do we prioritize? Where do we start?

Source: Dave Naugle - Photos by: Andy Gallagher

# A rangewide tool for scaling up implementation

How do we prioritize? Where do we start?



State	Status	Acres
CA	PAC	2.1
	Non PAC	1.1
CO	PAC	2.4
	Non PAC	6.3
ID	PAC	9.8
	Non PAC	7.1
MT	PAC	1.4
	Non PAC	2.2
NV	PAC	20.4
	Non PAC	21.4
OR	PAC	6.6
	Non PAC	12.5
UT	PAC	7.5
	Non PAC	4.2

Proposed acres (millions) of conifer mapping by state within PAC and non-PAC areas.

>102 million acres (~413,000 km<sup>2</sup>) to be mapped

# Object Based Juniper Detection

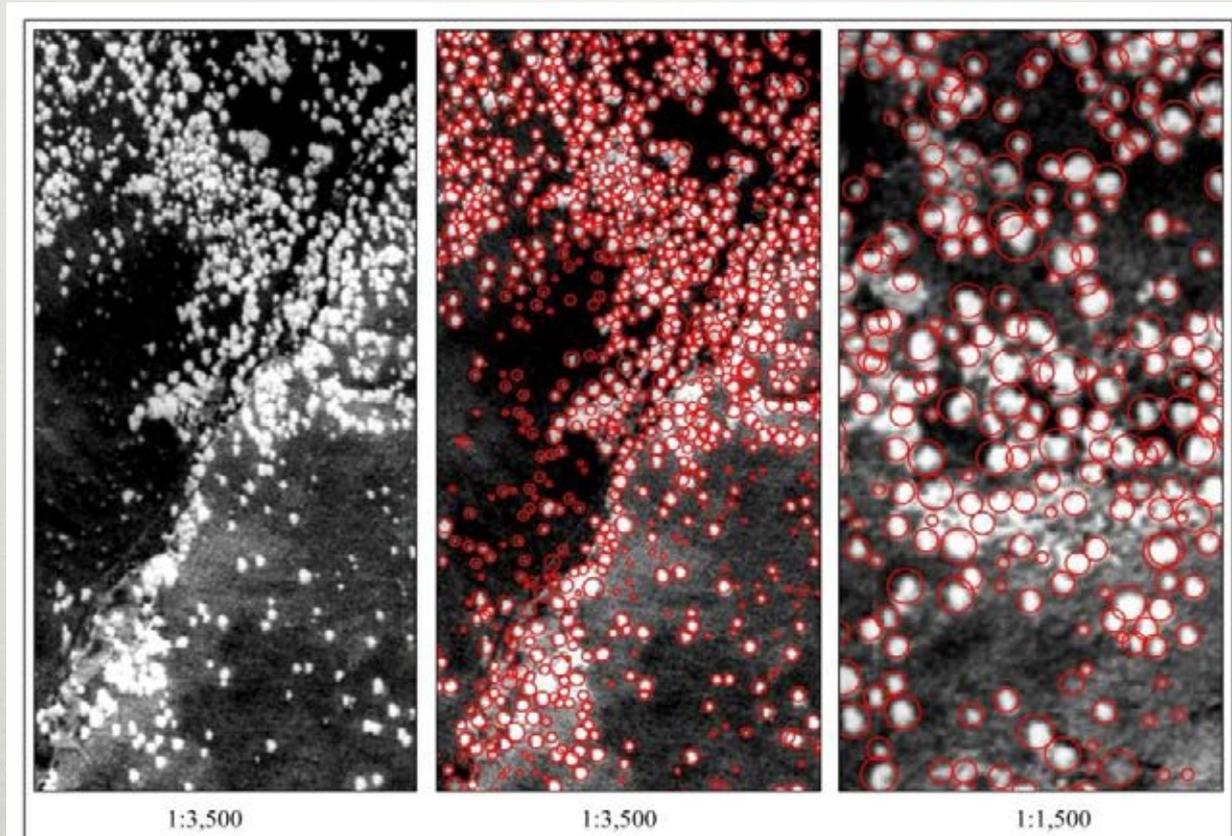
Can We Determine the Size and Location of Every Tree?



# Object Oriented Approach: Spatial Wavelet Analysis

Applied to NAIP NDVI Image

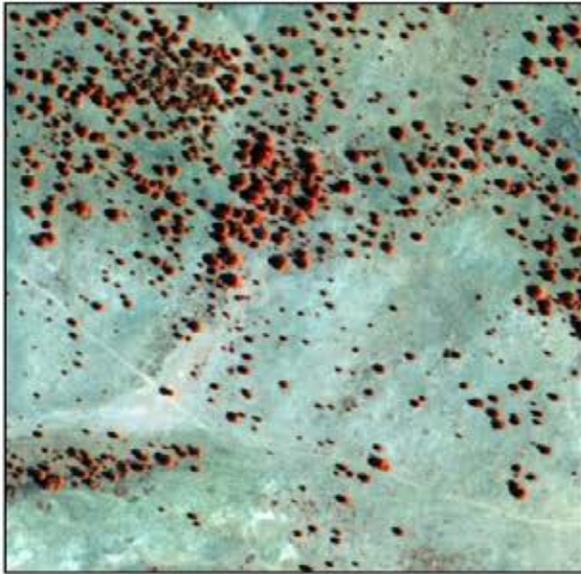
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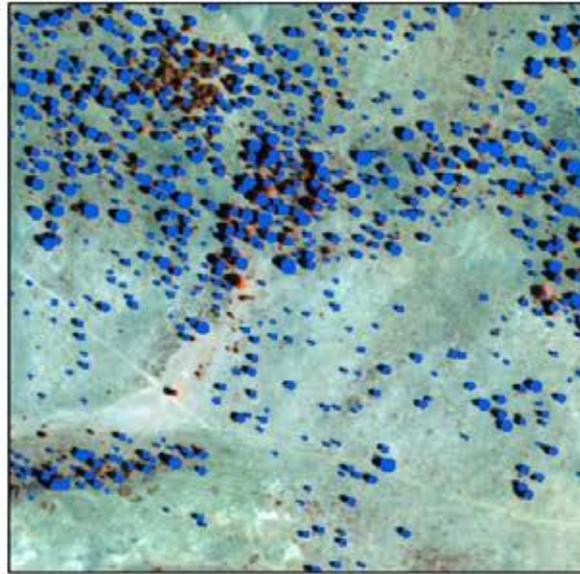
We use an object-based image analysis approach (spatial wavelet analysis) to map the location and crown diameter of individual juniper trees in NAIP images, then calculate canopy cover per acre using a moving window. Can also calculate tree density.

# Object Oriented Approach: Spatial Wavelet Analysis

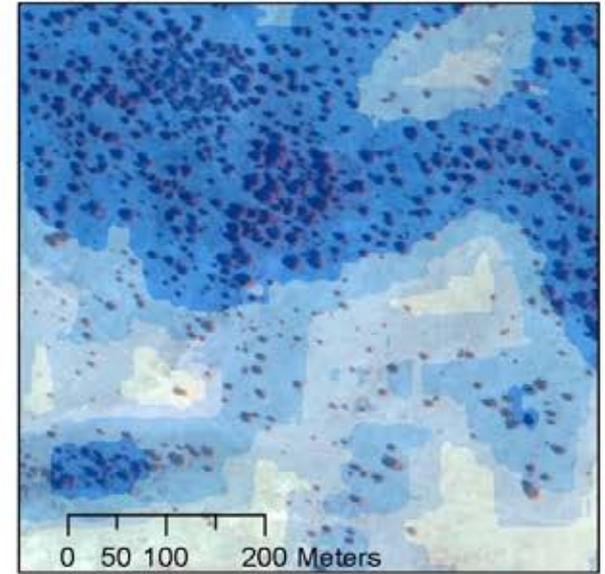
Applied to NAIP NDVI Image



4-Band NAIP

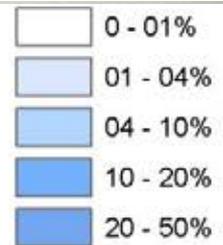


Tree Coordinates & Crown Radii

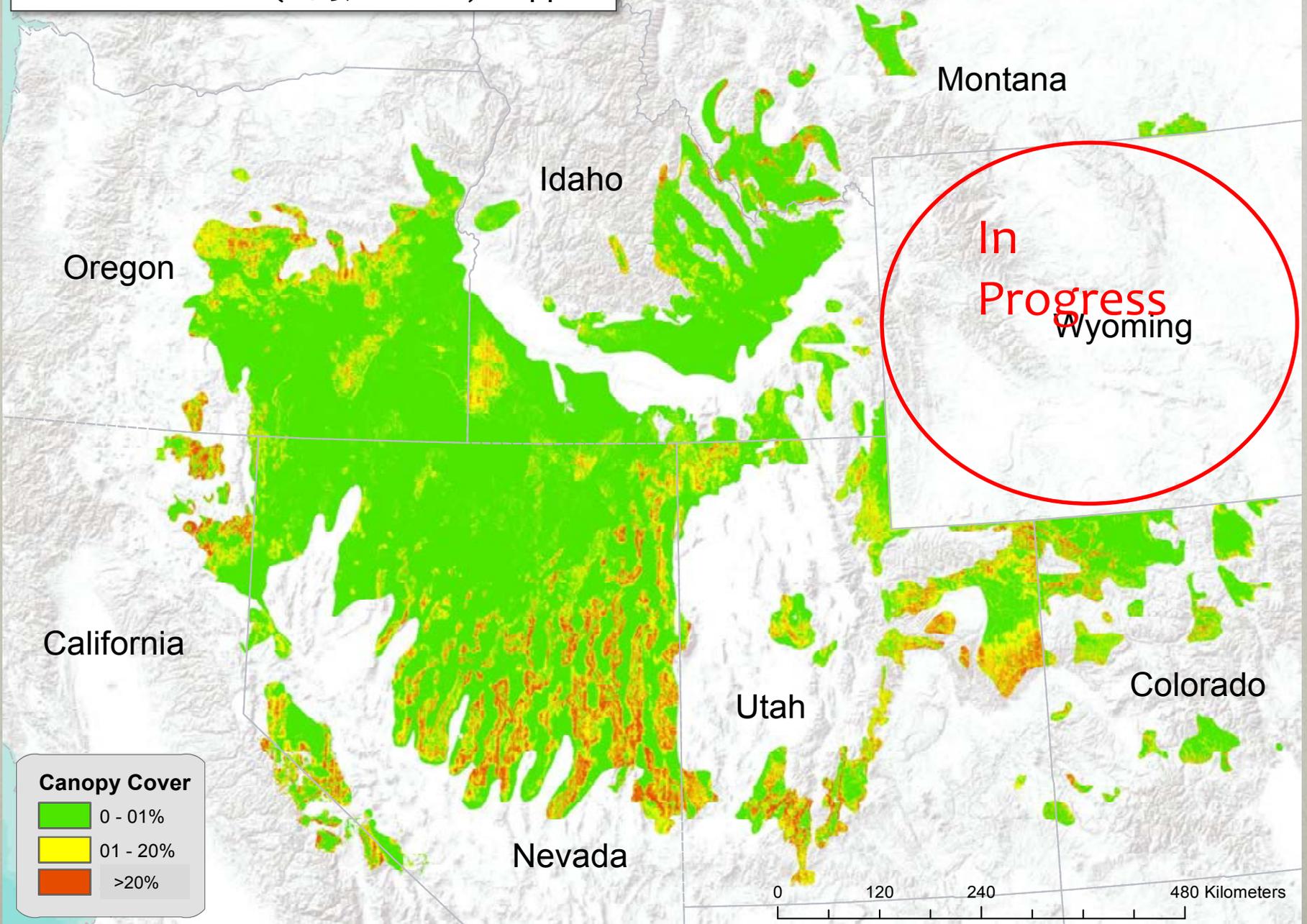


Reclassified Canopy Cover

We use an object-based image analysis approach (spatial wavelet analysis) to map the location and crown diameter of individual juniper trees in NAIP images, then calculate canopy cover per acre using a moving window.



>102 million acres (~413,000 km<sup>2</sup>) mapped



Montana

Idaho

Oregon

In  
Progress  
Wyoming

California

Utah

Colorado

Nevada

**Canopy Cover**

0 - 01%

01 - 20%

>20%

0 120 240 480 Kilometers

>24 million acres (~107,000 km<sup>2</sup>) mapped

Colorado

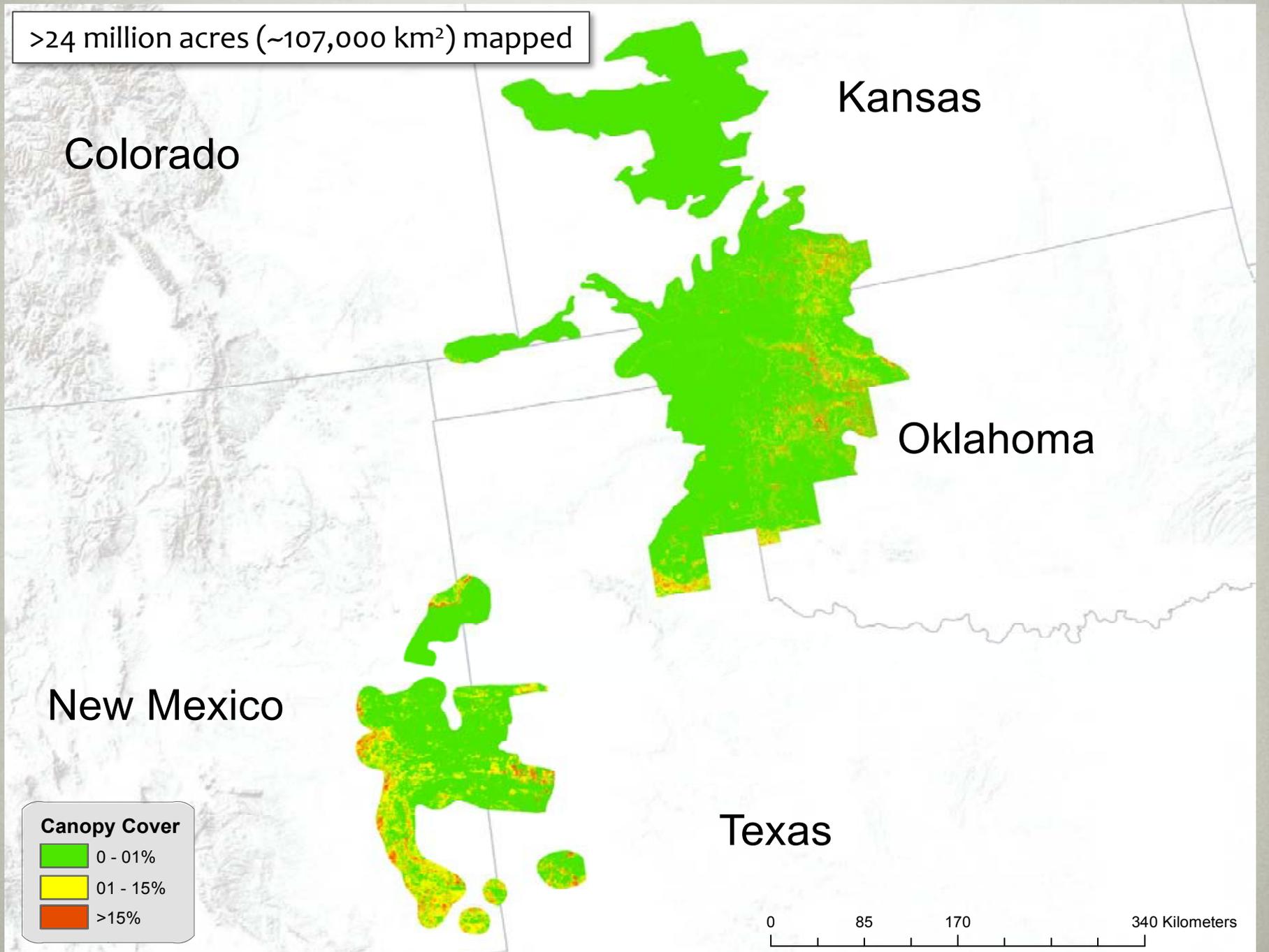
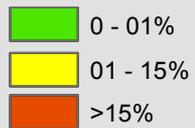
Kansas

Oklahoma

New Mexico

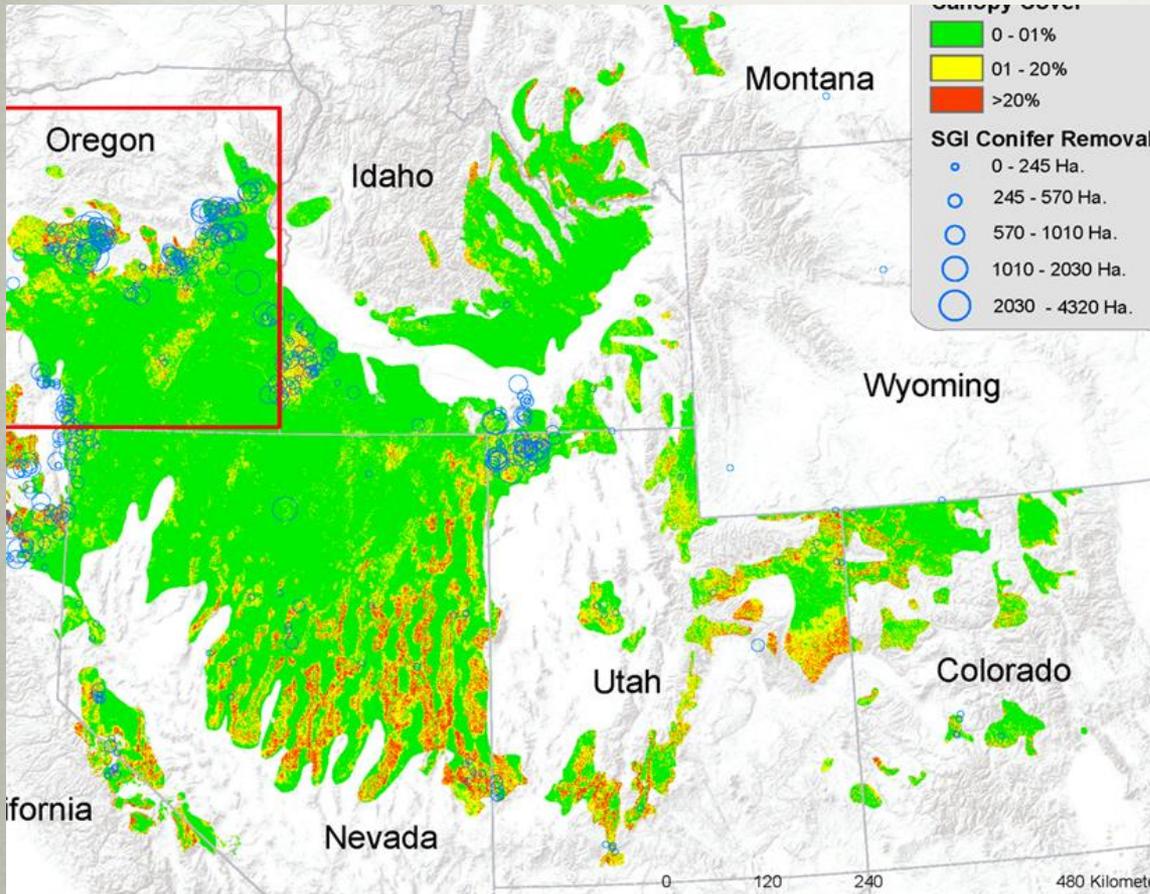
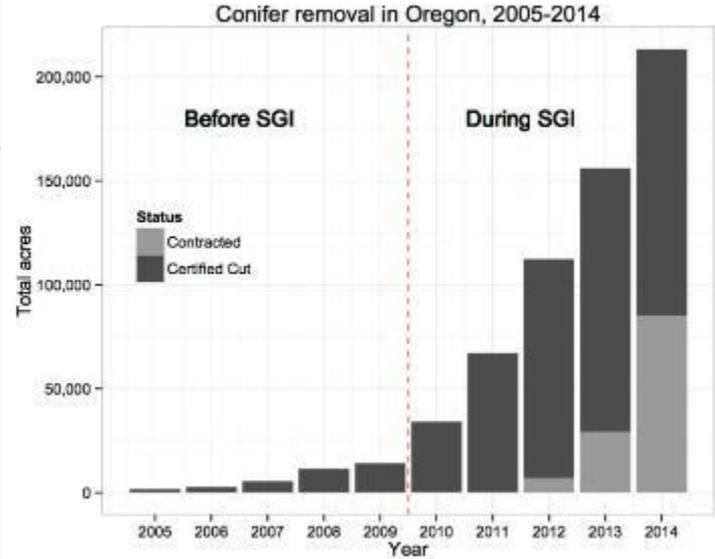
Texas

**Canopy Cover**



# Strategic approach to threat alleviation

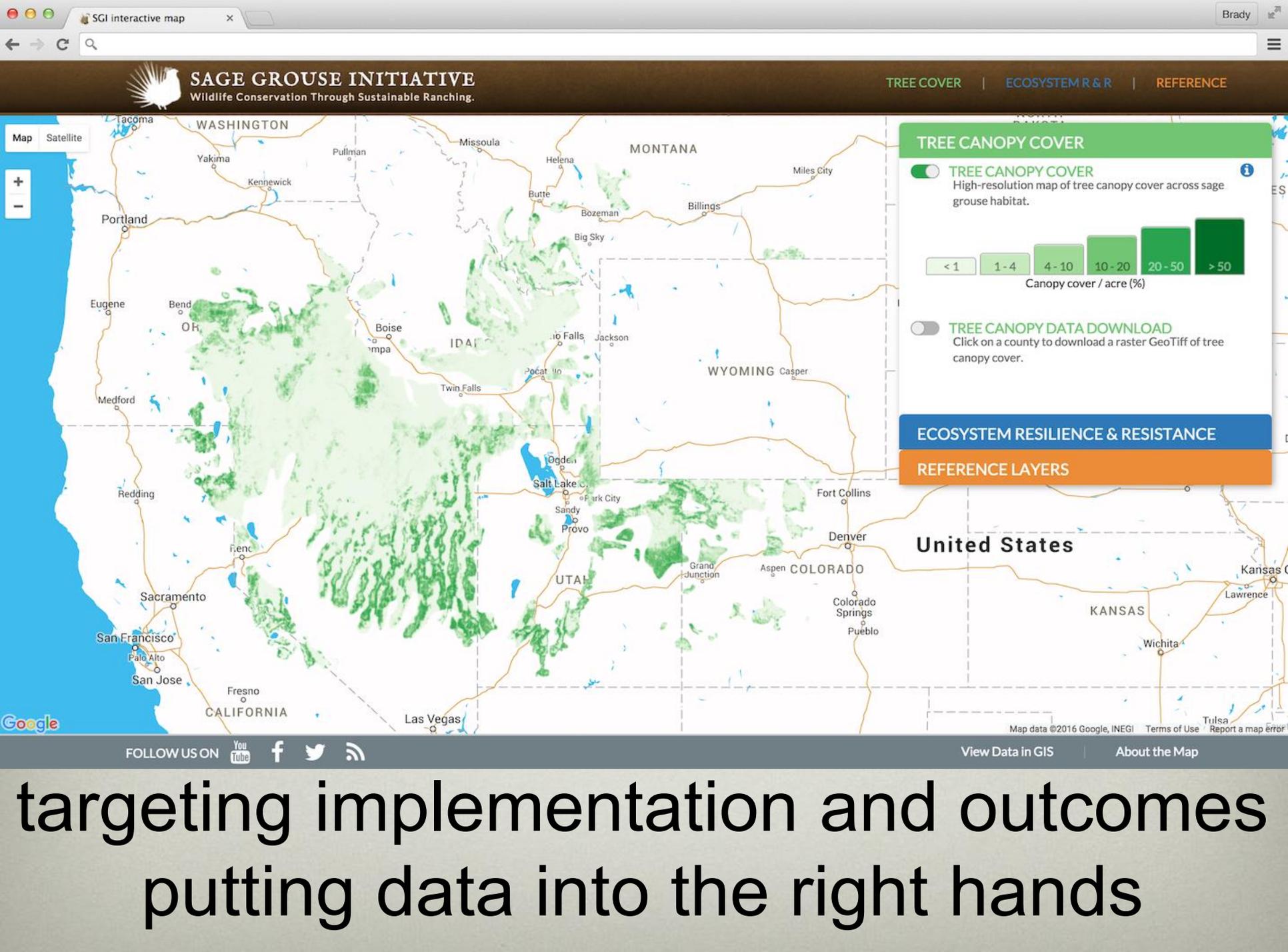
## Oregon Example



### SGI Conifer Removal inside PACs

	% Threat reduced SGI
Population	1.0
Central Oregon	85%
Northern Great Basin	67%
Western Great Basin	52%
Baker, Oregon	41%
<b>TOTAL</b>	<b>68%</b>

In 5 years - 405,241 Acres Treated  
 Highly targeted to prioritized populations -  
 81% in PACs



**TREE CANOPY COVER**

**TREE CANOPY COVER**  
High-resolution map of tree canopy cover across sage grouse habitat.

**TREE CANOPY DATA DOWNLOAD**  
Click on a county to download a raster GeoTiff of tree canopy cover.

**ECOSYSTEM RESILIENCE & RESISTANCE**

**REFERENCE LAYERS**



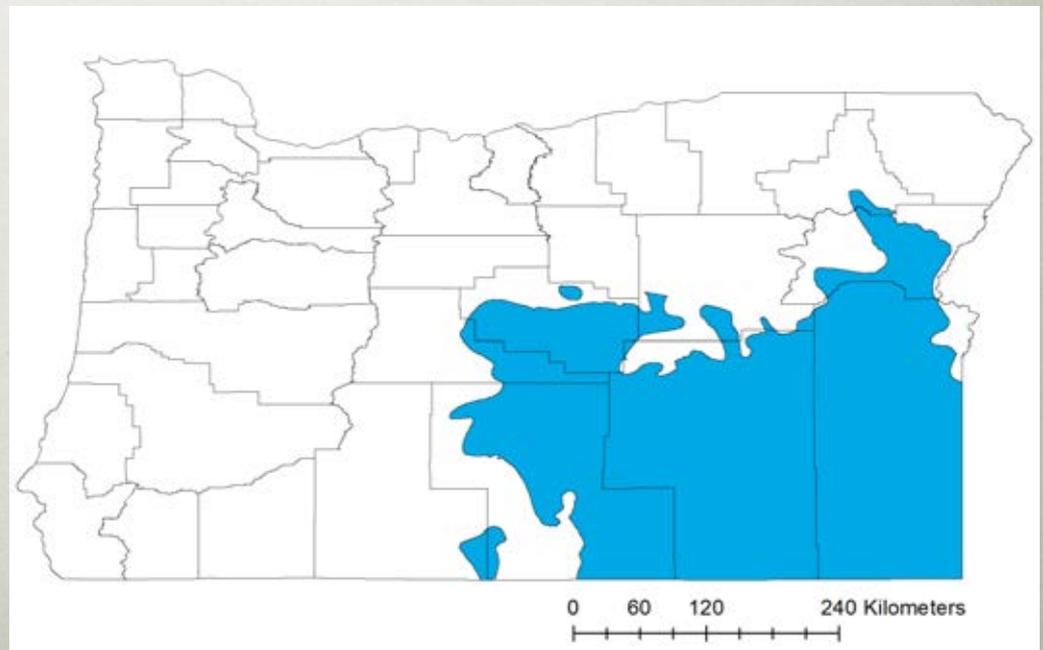
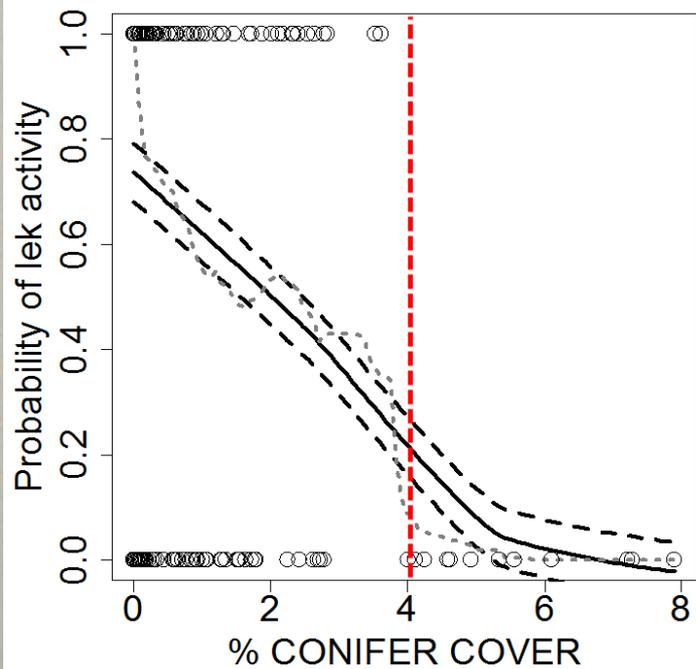
targeting implementation and outcomes  
putting data into the right hands

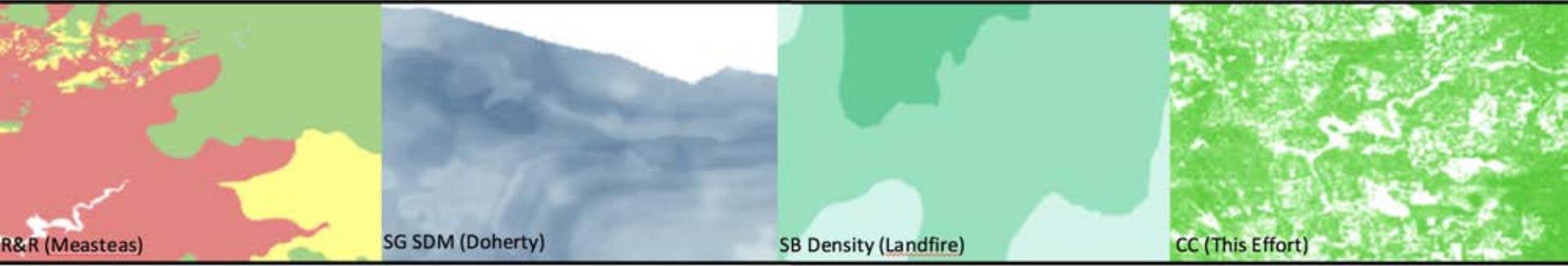
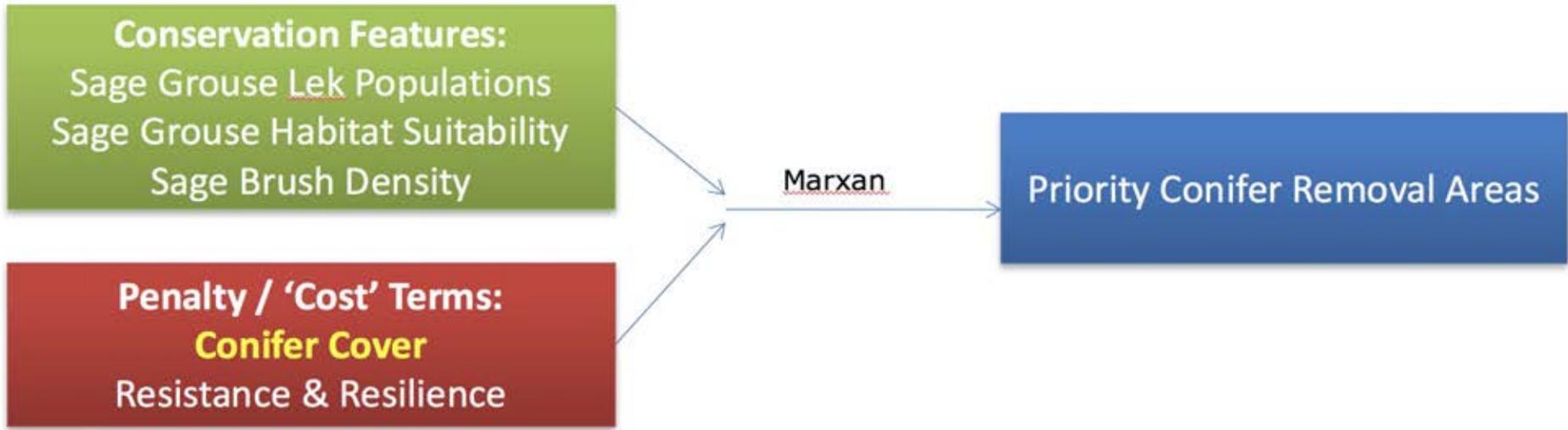


# Prioritizing conifer removal for Sage Grouse conservation

Where to target removal?

- Costly
- Limited Resources
- Most beneficial areas?
- Oregon Case Study





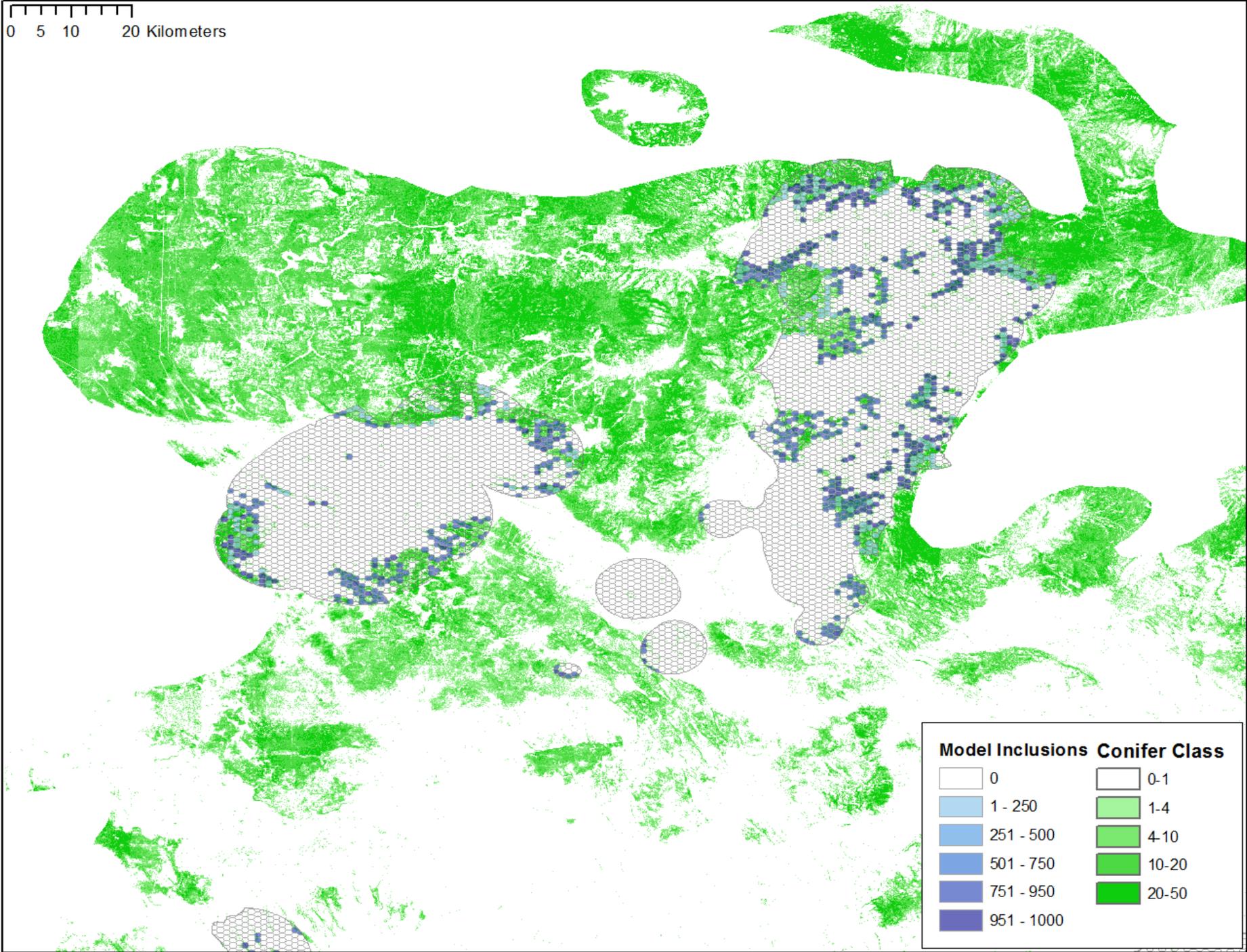
### Objectives:

**I**  
Identify priority conifer removal areas within Sage Grouse PACs

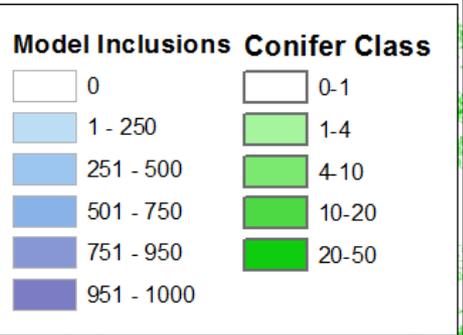
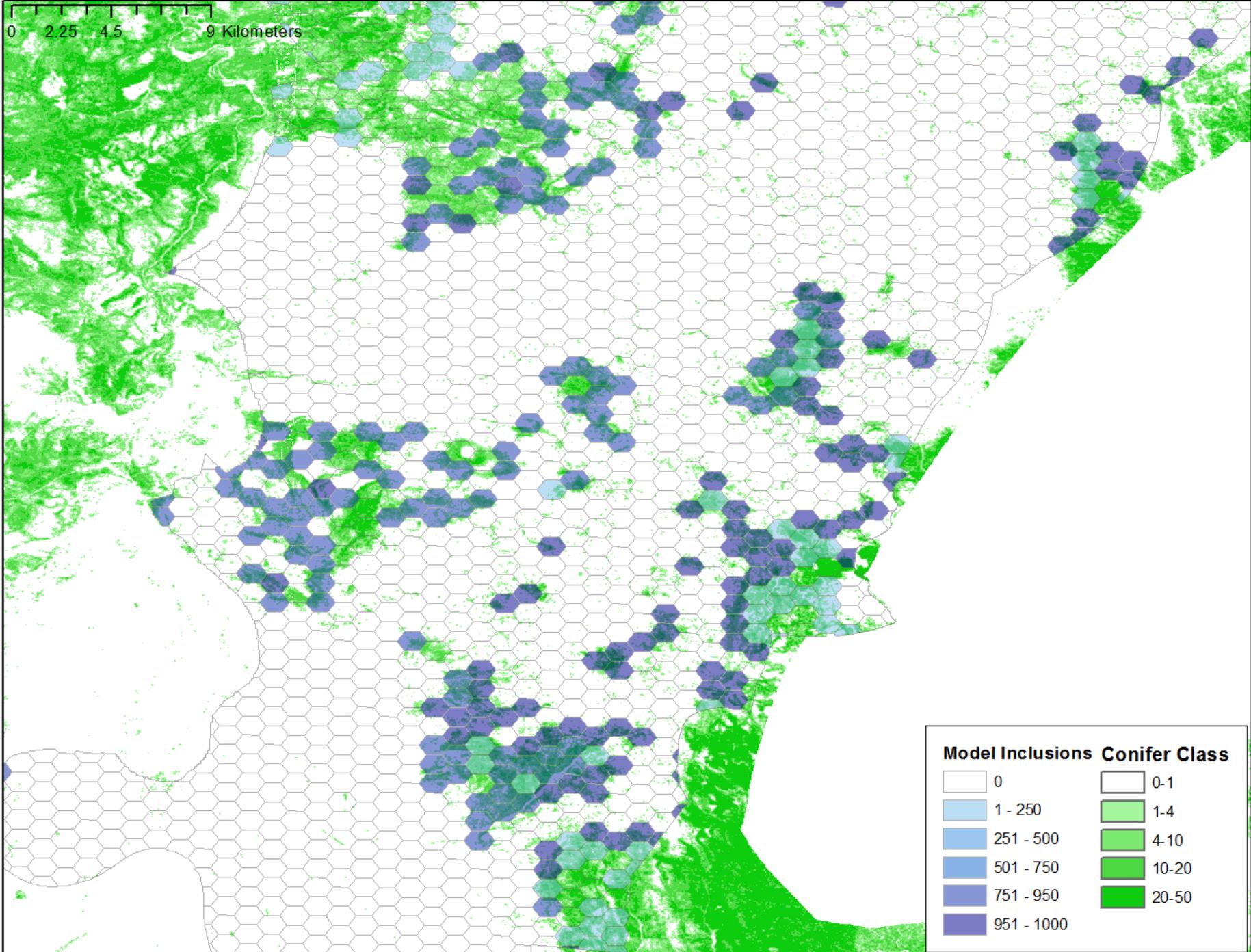
**II**  
Identify priority conifer removal areas between breeding and brooding habitat

**III**  
Identify priority conifer removal areas between Sage Grouse PACs

0 5 10 20 Kilometers



0 2.25 4.5 9 Kilometers



## Thanks !! Funding Sources and Cooperators:

Conifer mapping in the sage grouse range was supported by a grant administered by the Western Association of Fish and Wildlife Agencies (WAFWA) with funding partners including the:

U.S. Fish and Wildlife Service

Bureau of Land Management

National Fish and Wildlife Foundation

Utah Department of Natural Resources - Watershed Restoration Initiative

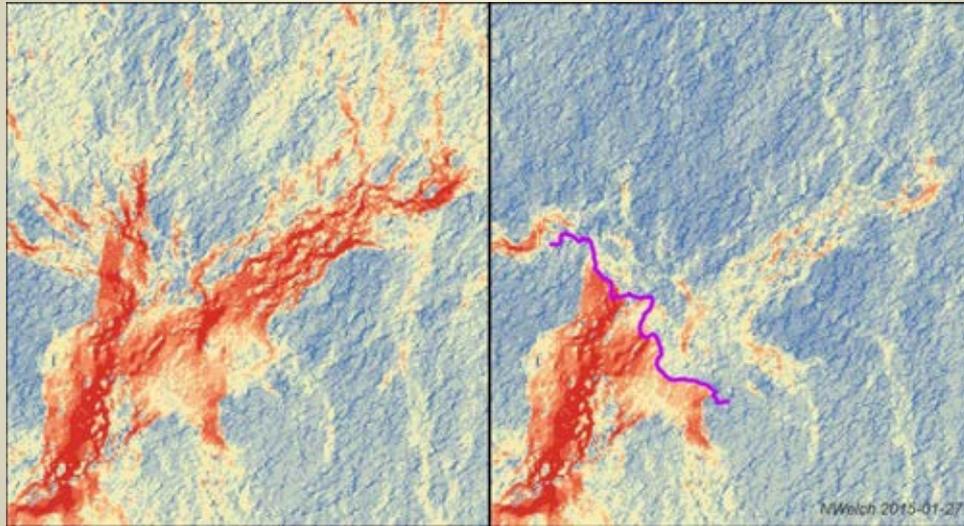
Special Thanks to TNC



Colorado  
State  
University



# Designing a regional network of fuel breaks to protect Greater Sage-Grouse habitat: An experimental approach using Circuitscape



Nathan Welch (ID), Louis Provencher (NV), Bob Unnasch (ID),  
Tanya Anderson (NV) & Brad McRae (North America)

# Idaho and Southwestern Montana Greater Sage-Grouse

Draft  
Land Use Plan Amendment and  
Environmental Impact Statement

Volume II

US Department of the Interior  
Bureau of Land Management

US Department of Agriculture  
Forest Service  
October 2013



BLM  
Forest Service

“Create and maintain effective fuel breaks in **strategic** locations that will modify fire behavior and increase fire suppression effectiveness...”

“Federal firefighters shall ensure close coordination with State firefighters, local fire departments and local expertise (i.e., livestock grazing permittees and road maintenance personnel) to **create the best possible network of strategic fuel breaks** and road access to minimize and reduce the size of a wildfire following ignition...”

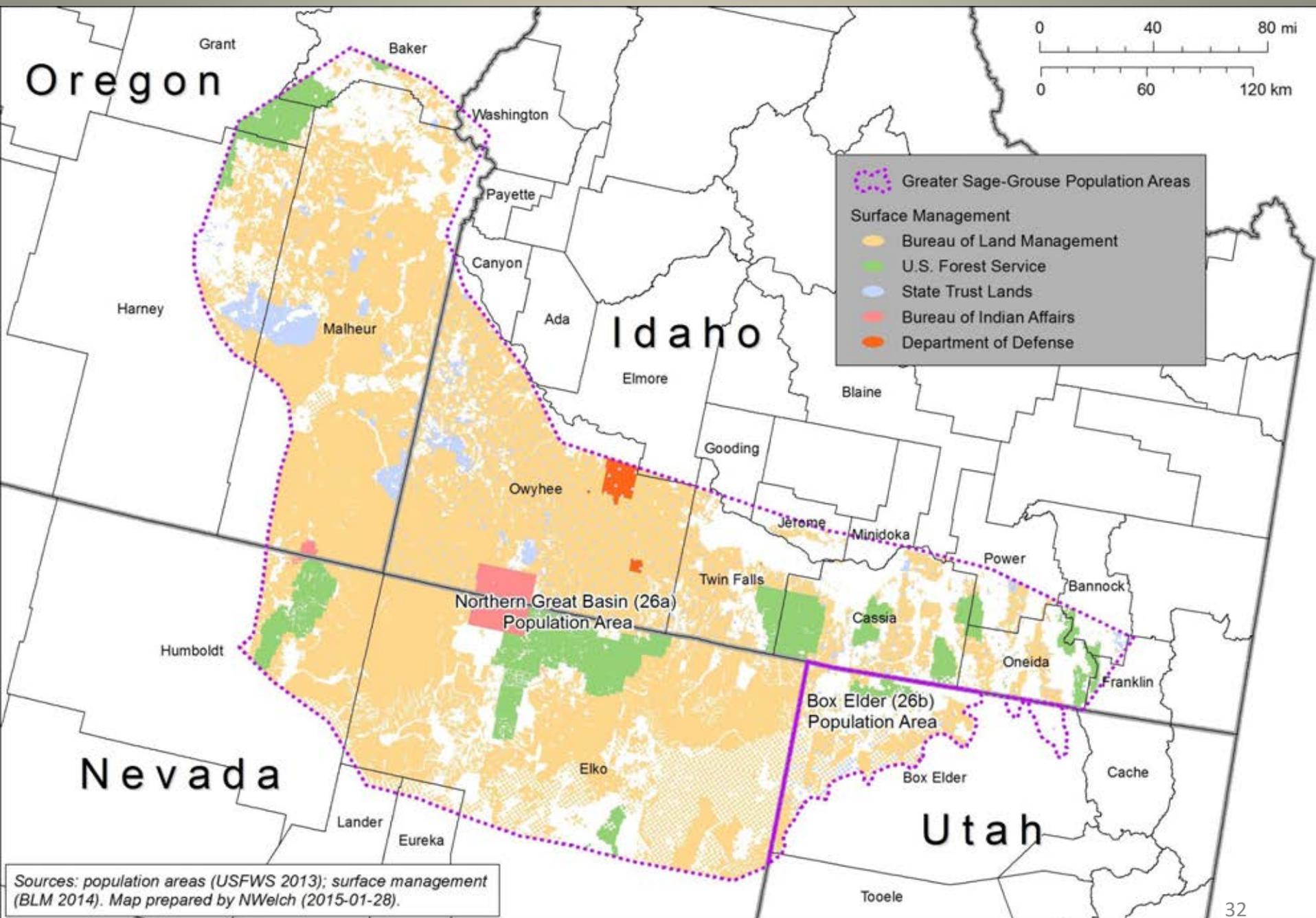


# Response

- Policy documents identify the need for landscape-scale approaches to design and implement fuel treatments to stop or slow fire spread.
  - We developed a GIS protocol for identifying strategic locations for fuel breaks at large spatial extents and simulating potential fuel breaks.
    - We proposed next steps in the refinement of our protocol and devised general recommendations for a regional network of fuel breaks to prevent loss of critical Sage-Grouse habitat.



Ken Miracle



Sources: population areas (USFWS 2013); surface management (BLM 2014). Map prepared by NWelch (2015-01-28).

# Methods

- We simulated *wildfire transmission / fuel break potential* using Circuitscape, which is based on electrical circuit theory.
- The inputs for the model are *sources* where electrical current enters the system (=ignitions), *grounds* where current departs the system (=edge of the landscape), and a resistance surface (=flammability raster) across which the current will flow between sources and grounds.
- We identified “pinch points” that provide connections between areas with high flammability, but where adjacent areas with low flammability could constrict wildfire.
- We installed sample fuel breaks in “pinch point” areas and simulated fuel break behavior by modifying the sources raster to include negative current sources that remove fire from the system.

# A new model of landscape-scale fire connectivity applied to resource and fire management in the Sonoran Desert, USA

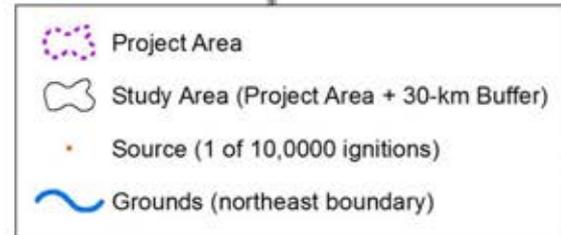
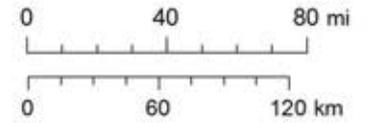
MIRANDA E. GRAY<sup>1,2,3</sup> AND BRETT G. DICKSON<sup>1,2</sup>

<sup>1</sup>*Lab of Landscape Ecology and Conservation Biology, Landscape Conservation Initiative, Northern Arizona University, Flagstaff, Arizona 86011 USA*

<sup>2</sup>*Conservation Science Partners, Truckee, California 96161 USA*

*Abstract.* Understanding where and when on the landscape fire is likely to burn (fire likelihood) and the predicted responses of valued resources (fire effects) will lead to more effective management of wildfire risk in multiple ecosystem types. Fire is a contagious and highly unpredictable process, and an analysis of fire connectivity that incorporates stochasticity may help predict fire likelihood across large extents. We developed a model of fire connectivity based on electrical circuit theory, which is a probabilistic approach to modeling ecological flows. We first parameterized our model to reflect the synergistic influences of fuels, landscape properties, and winds on fire spread in the lower Sonoran Desert of southwestern Arizona, and then defined this landscape as an interconnected network through which to model flow (i.e., fire spread). We interpreted the mapped outputs as fire likelihood and used historical burned area data to evaluate our results. Expected fire effects were characterized based on the degree to which future fire exposure might negatively impact native plant community recovery, taking into account the impact of repeated fire and major vegetation associations. We explored fire effects within habitat for the endangered Sonoran pronghorn antelope and designated wilderness. Model results indicated that fire likelihood was higher in lower elevations, and in areas with lower slopes and topographic roughness. Fire likelihood and effects were predicted to be high in 21% of the currently occupied range of the Sonoran pronghorn and 15% of the additional habitat considered suitable. Across 16 designated wilderness areas, highest predicted fire likelihood and effects fell within low elevation wilderness areas that overlapped large fire perimeters that occurred in 2005. As ongoing changes in climate and land cover are poised to alter the fire regime across extensive and ecologically important areas in the lower Sonoran Desert, an analysis of fire likelihood

Oregon



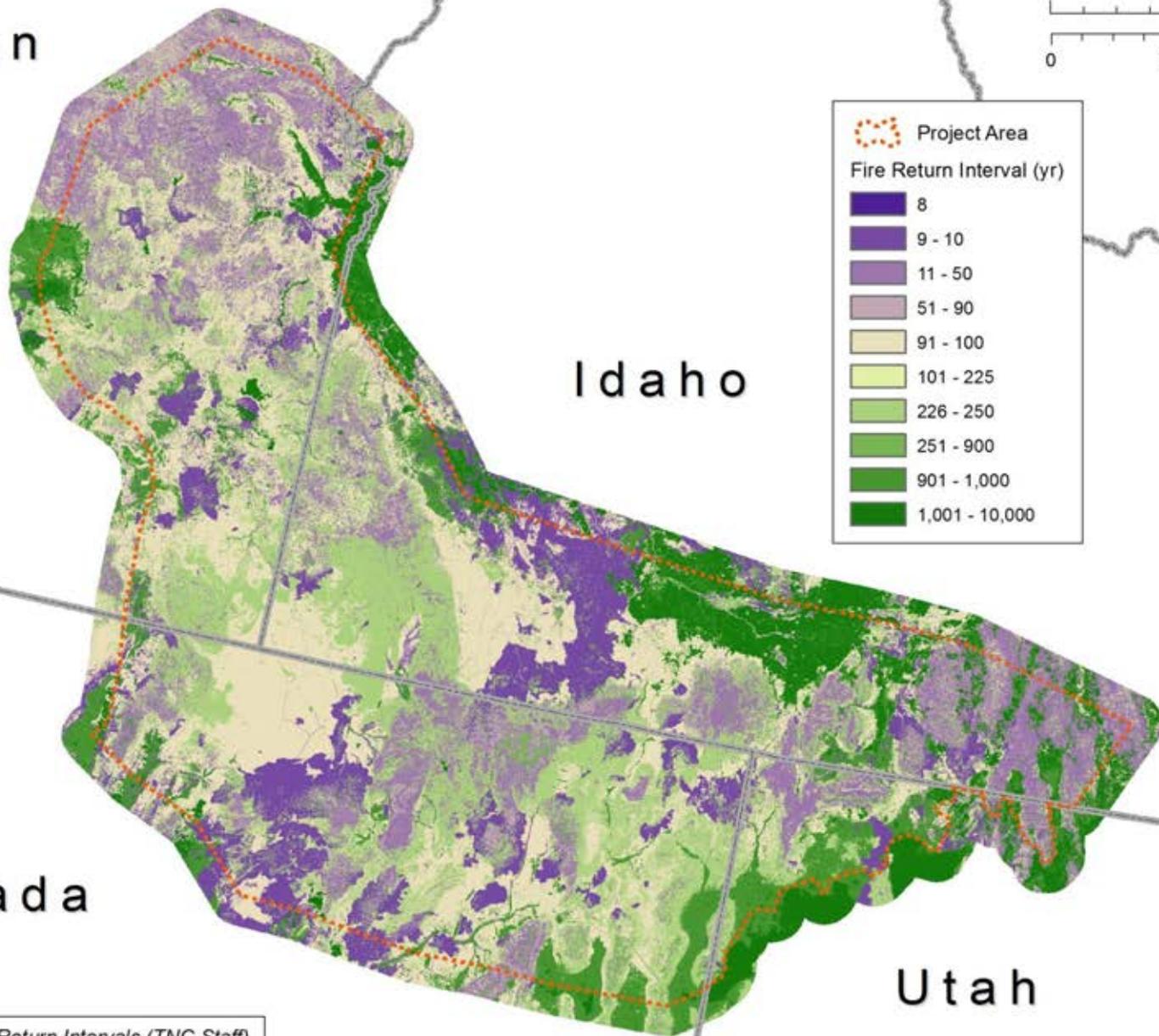
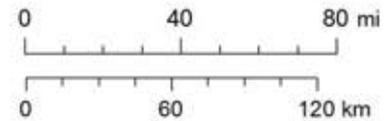
Idaho

Nevada

Utah

# Creating the Resistance Raster

Oregon



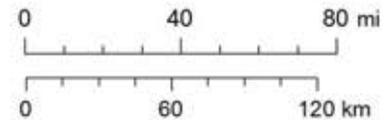
Idaho

Nevada

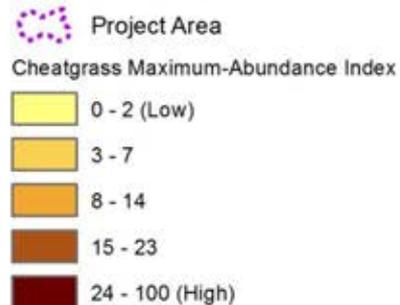
Utah

Source: Estimated Fire Return Intervals (TNC Staff).  
Map prepared by NWelch (2015-01-28).

Oregon



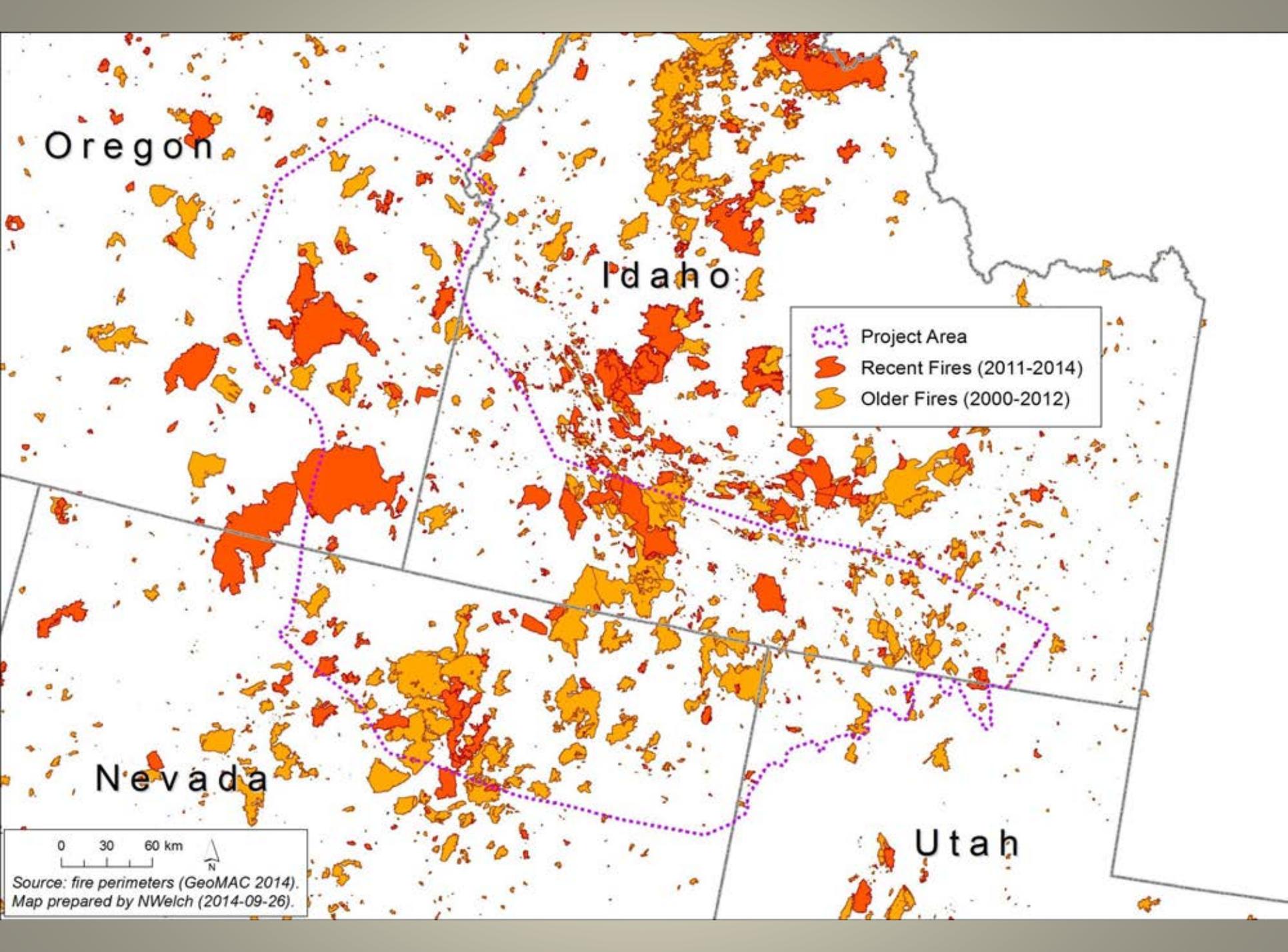
Idaho



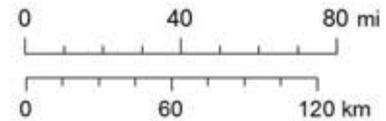
Nevada

Utah

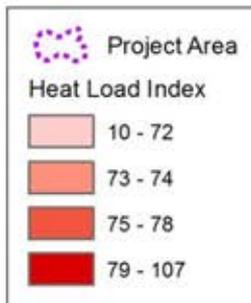
Source: cheatgrass maximum-abundance index derived from USGS data (2011-2013). Map prepared by NWelch (2015-01-28).



Oregon



Idaho

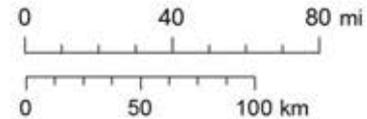


Nevada

Utah

Source: Heat Load Index script (Evans et al. 2014).  
Map prepared by NWelch (2015-01-28).

Oregon



Idaho

 Project Area

Resistance Values (deciles)

 1 - 6 (Lowest Resistance/Most Flammable)

 7 - 15

 16 - 37

 38 - 60

 61 - 75

 76 - 134

 135 - 187

 188 - 300

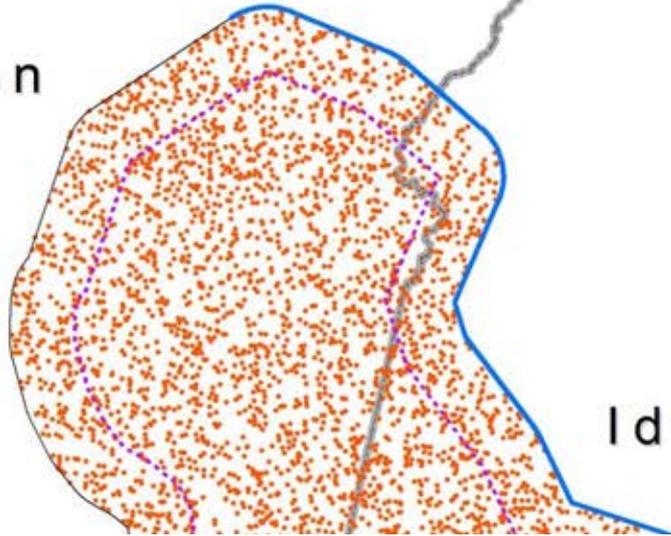
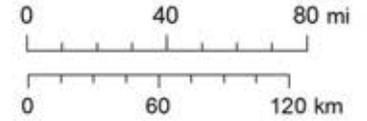
 301 - 1,000

 1,001 - 12,000 (Highest Resistance/Least Flammable)

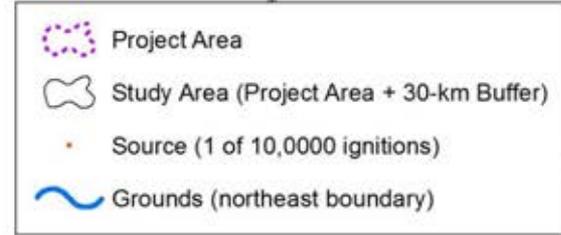
Nevada

Utah

Oregon

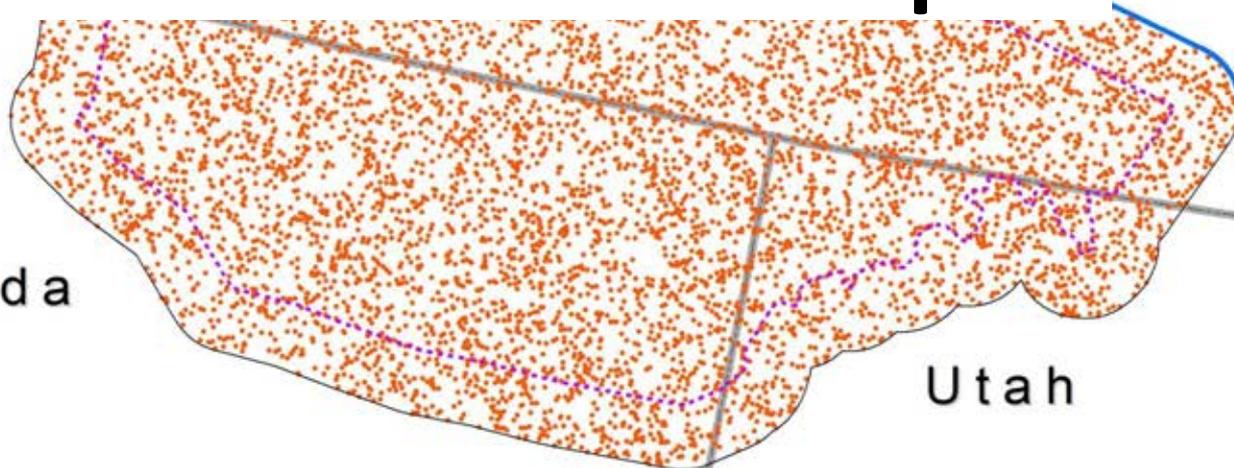


Idaho

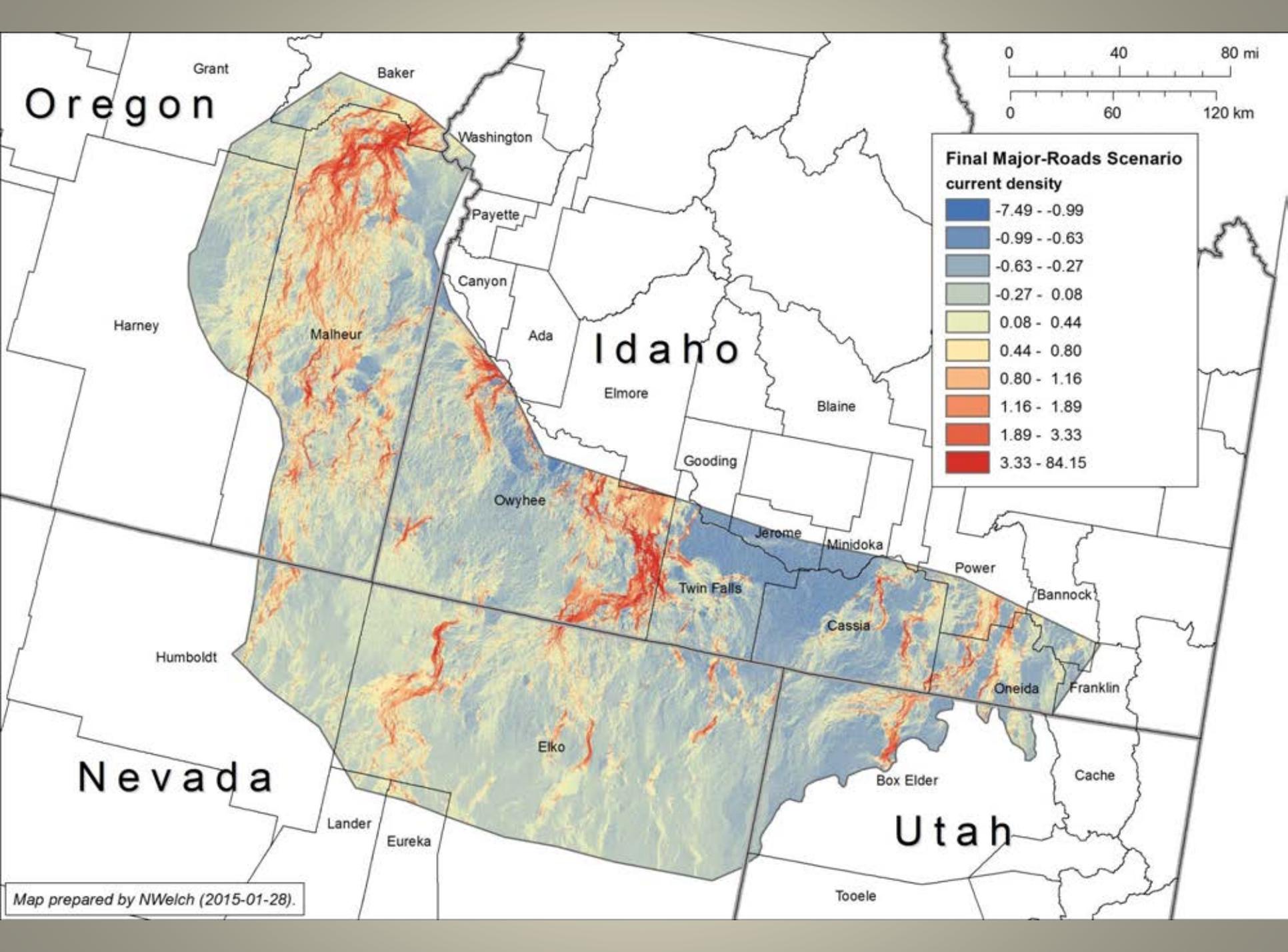


# Run Circuitscape

Nevada



Utah



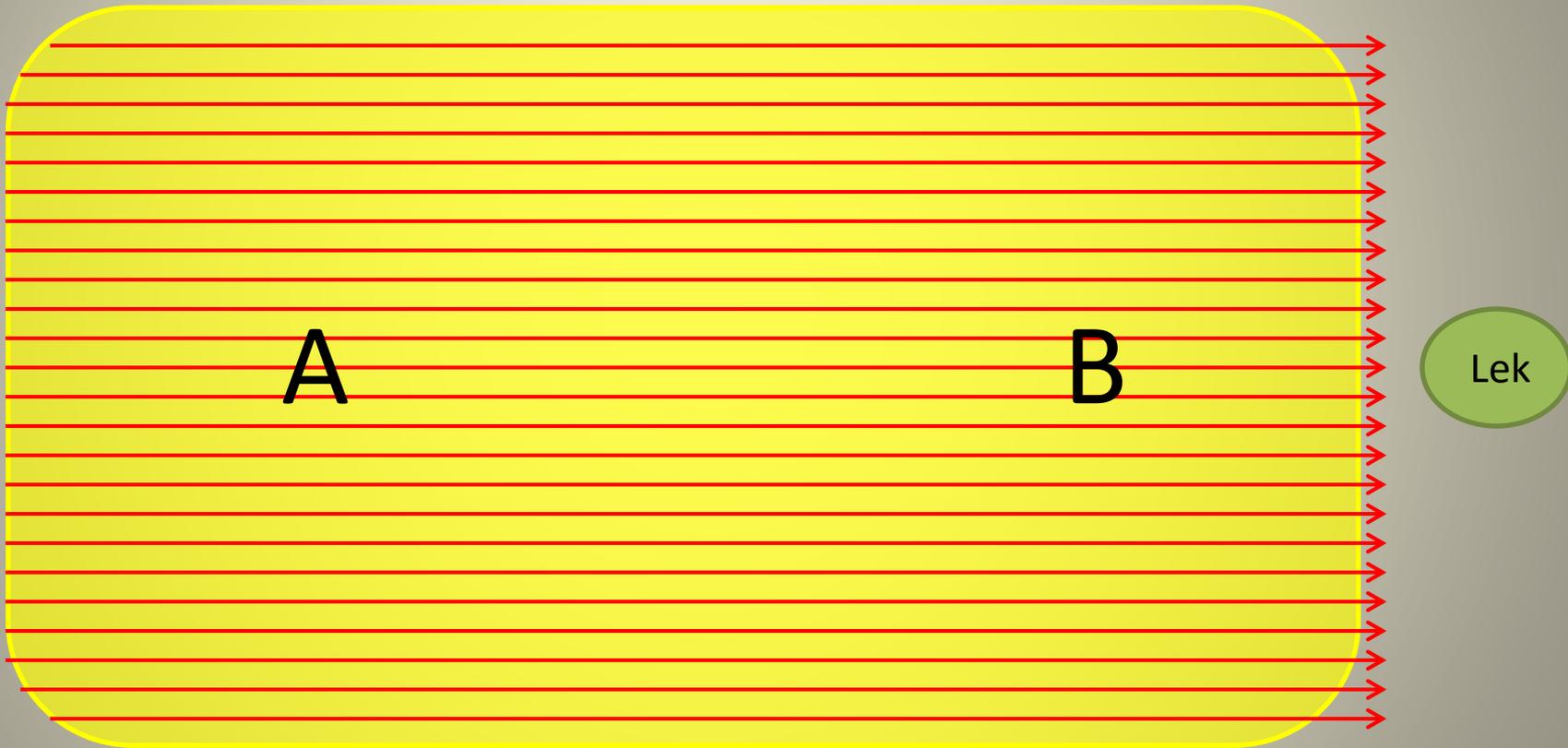
# Interpreting Circuitscape Results

In this landscape, locations A and B have the same *wildfire likelihood*.



Lek

In this landscape, Circuitscape tells us locations A and B have the same current density (= *wildfire transmission* or *fuel break potential*).

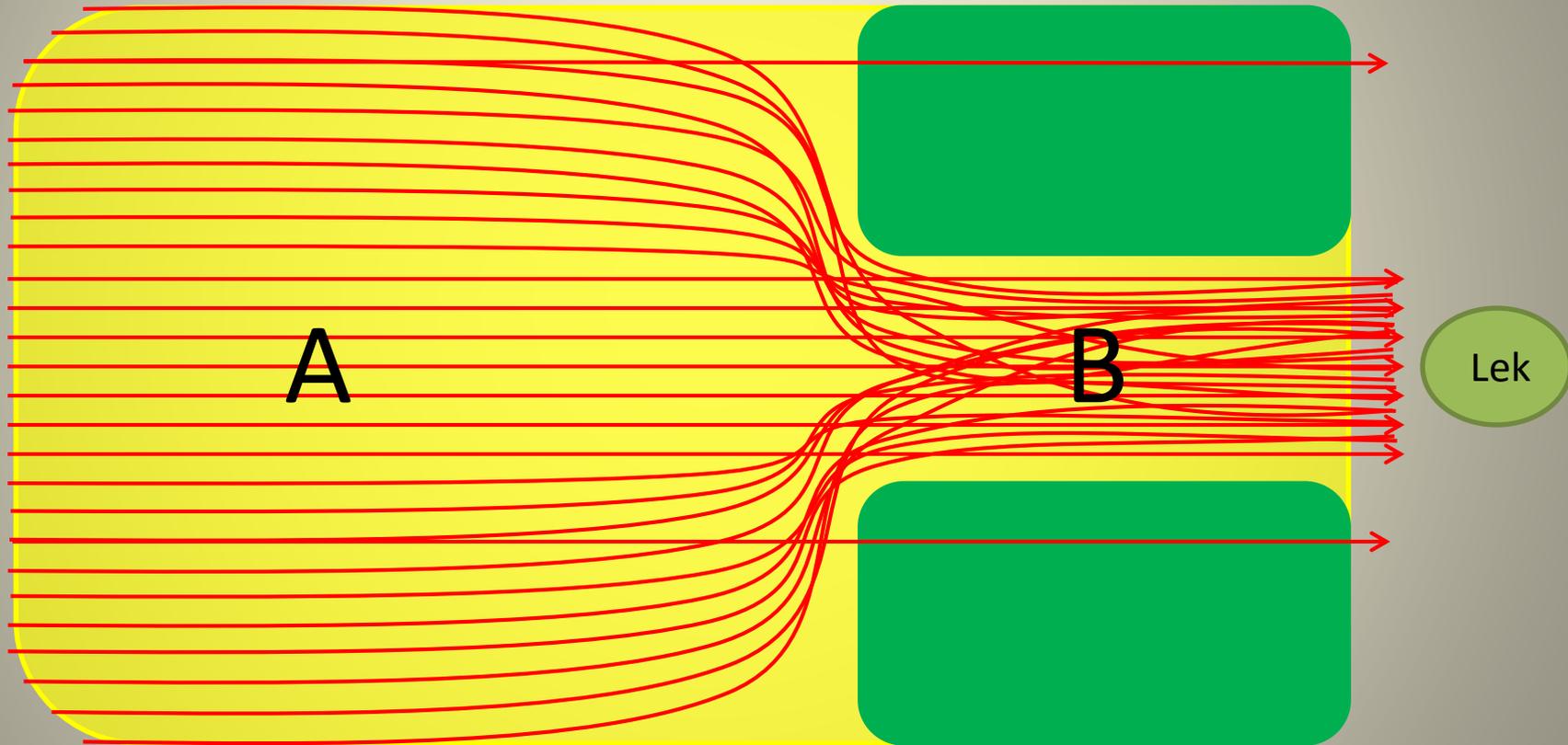


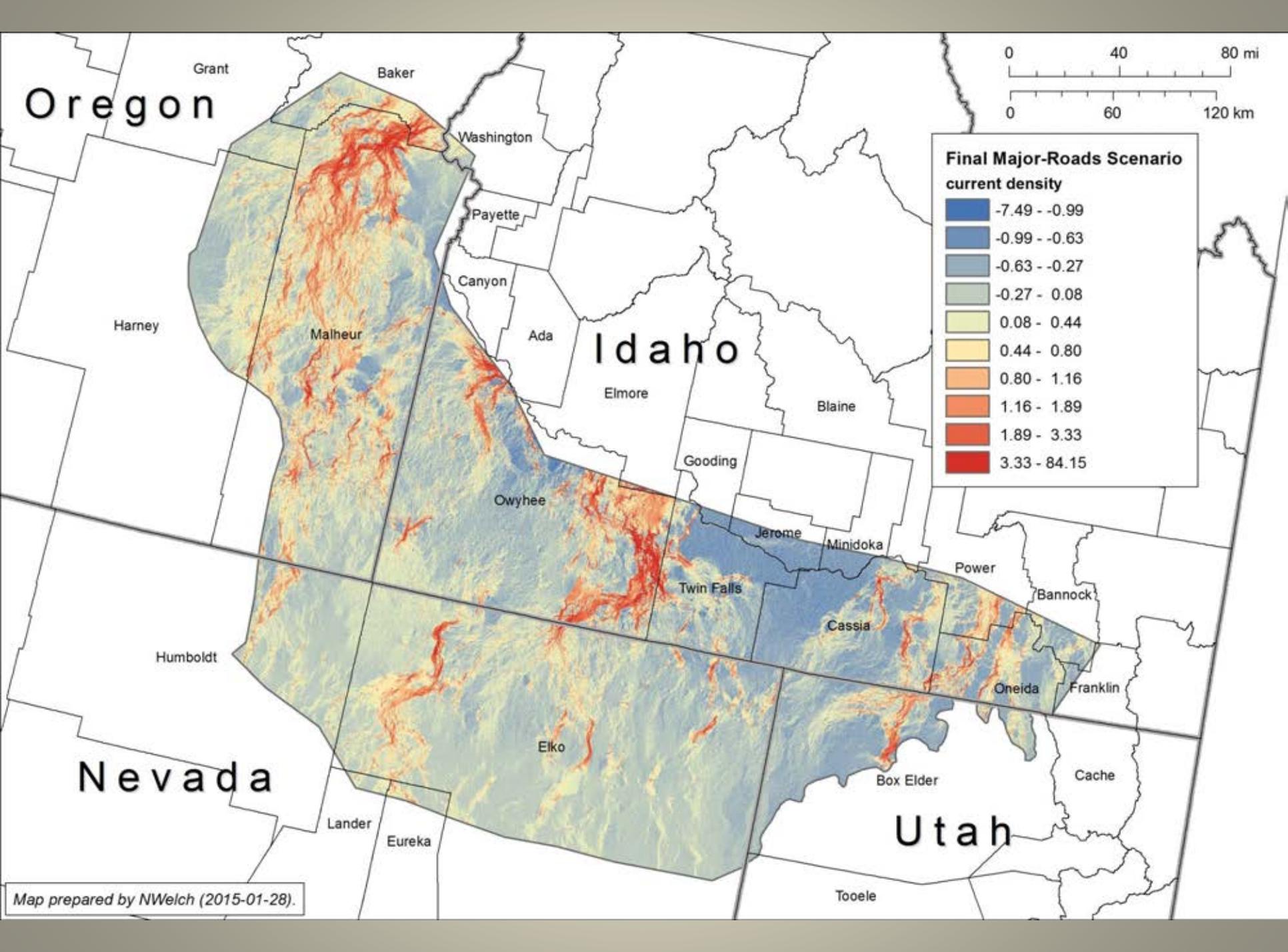
In this new landscape, locations A and B still have roughly the same *wildfire likelihood*.



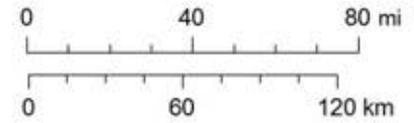
Lek

However, now Circuitscape tells us locations A and B have very different current densities (= *wildfire transmission* or *fuel break potential*). The area surrounding B is a “pinch point” and might be a more efficient place for a fuel break.





Oregon



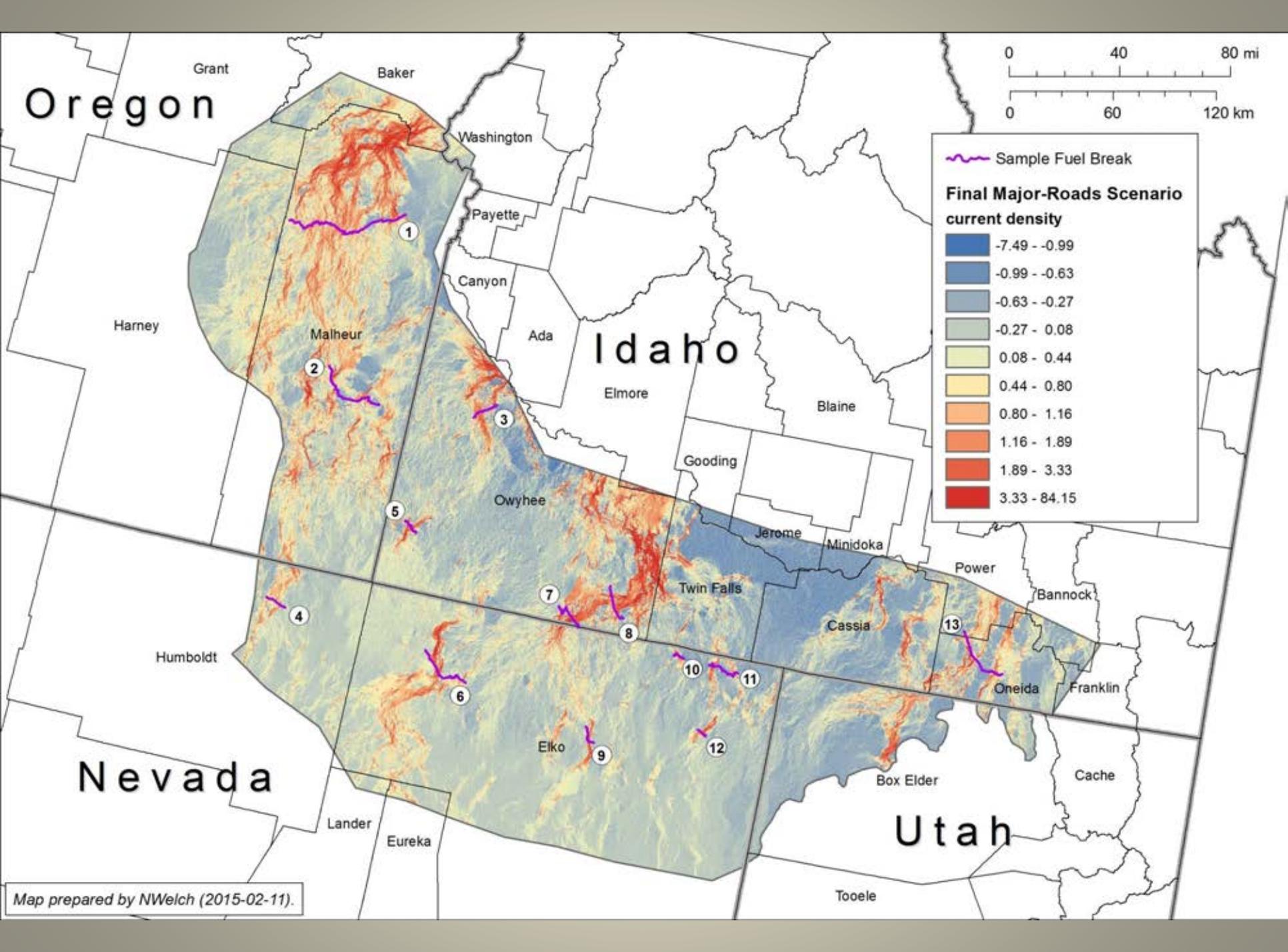
Idaho

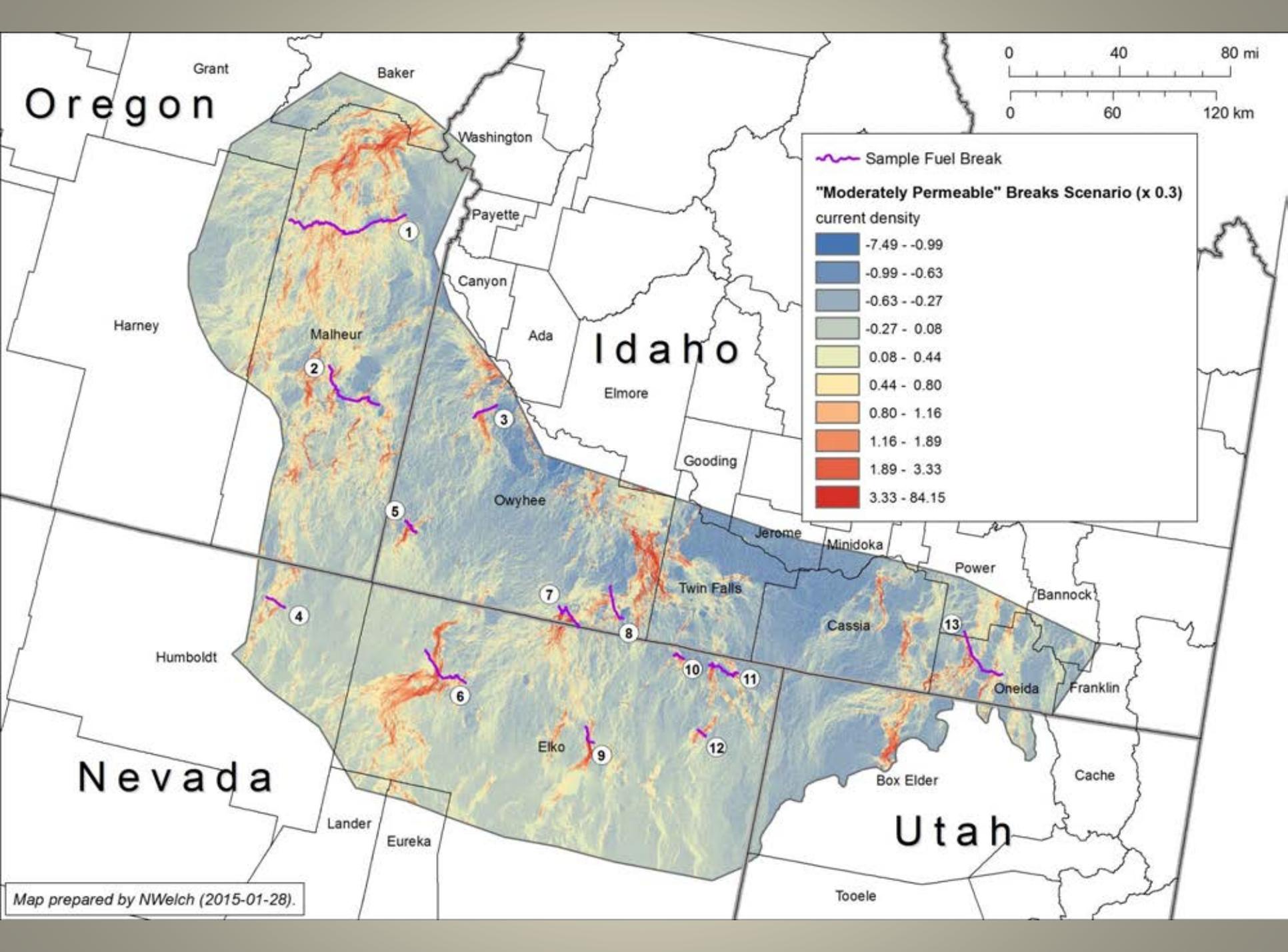


Nevada

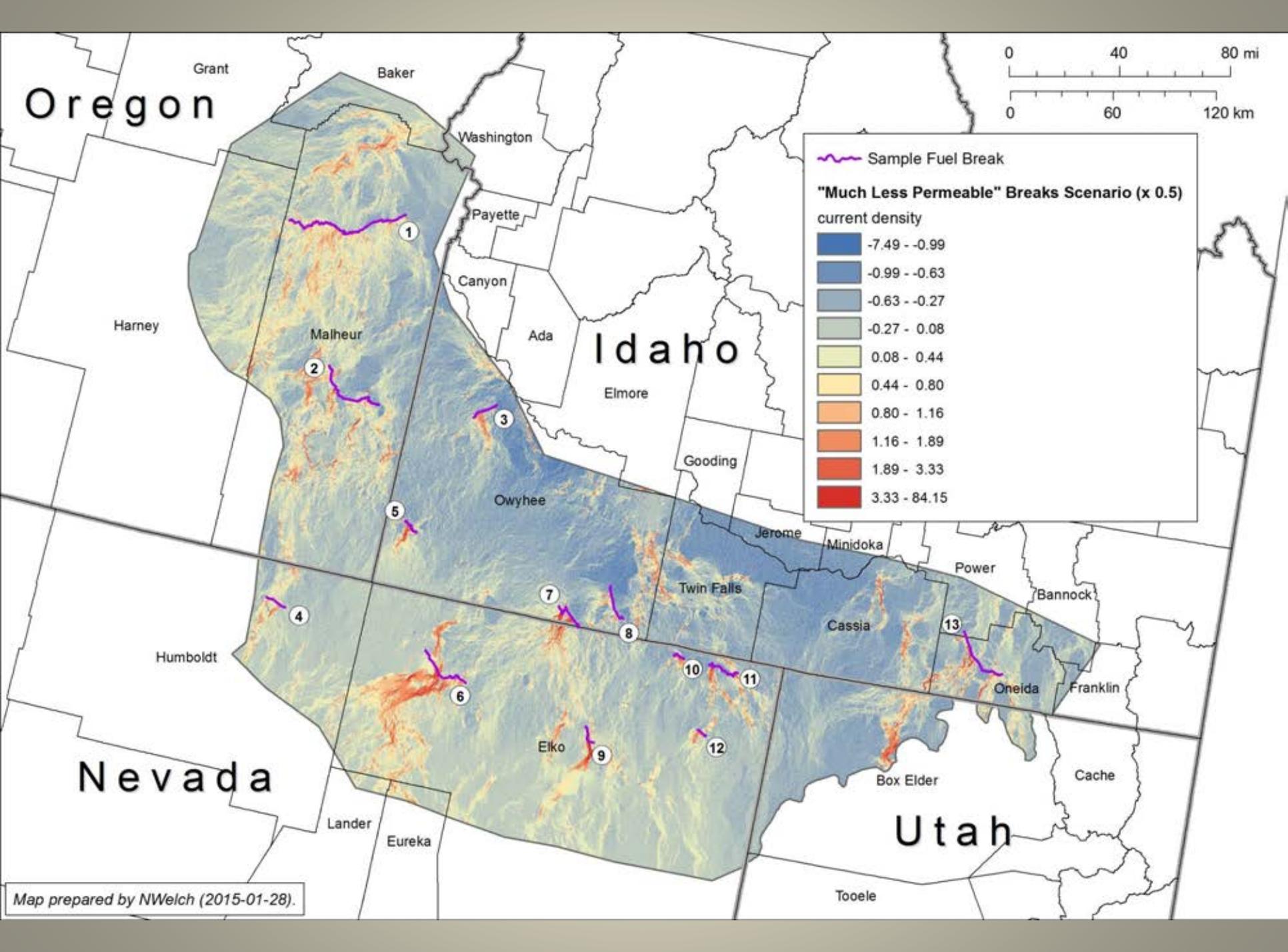
Utah

Sources: Breeding Density Areas (Doherty et al. 2010); major roads (see Figure 10). Map prepared by NWelch (2015-01-28).





Map prepared by NWelch (2015-01-28).



Oregon

Idaho

Nevada

Utah

Grant

Baker

Washington

Payette

Canyon

Ada

Elmore

Gooding

Owyhee

Jerome

Minidoka

Power

Twin Falls

Bannock

Humboldt

Cassia

Oneida

Franklin

Lander

Eureka

Elko

Box Elder

Cache

Tooele

1

2

3

5

4

7

8

6

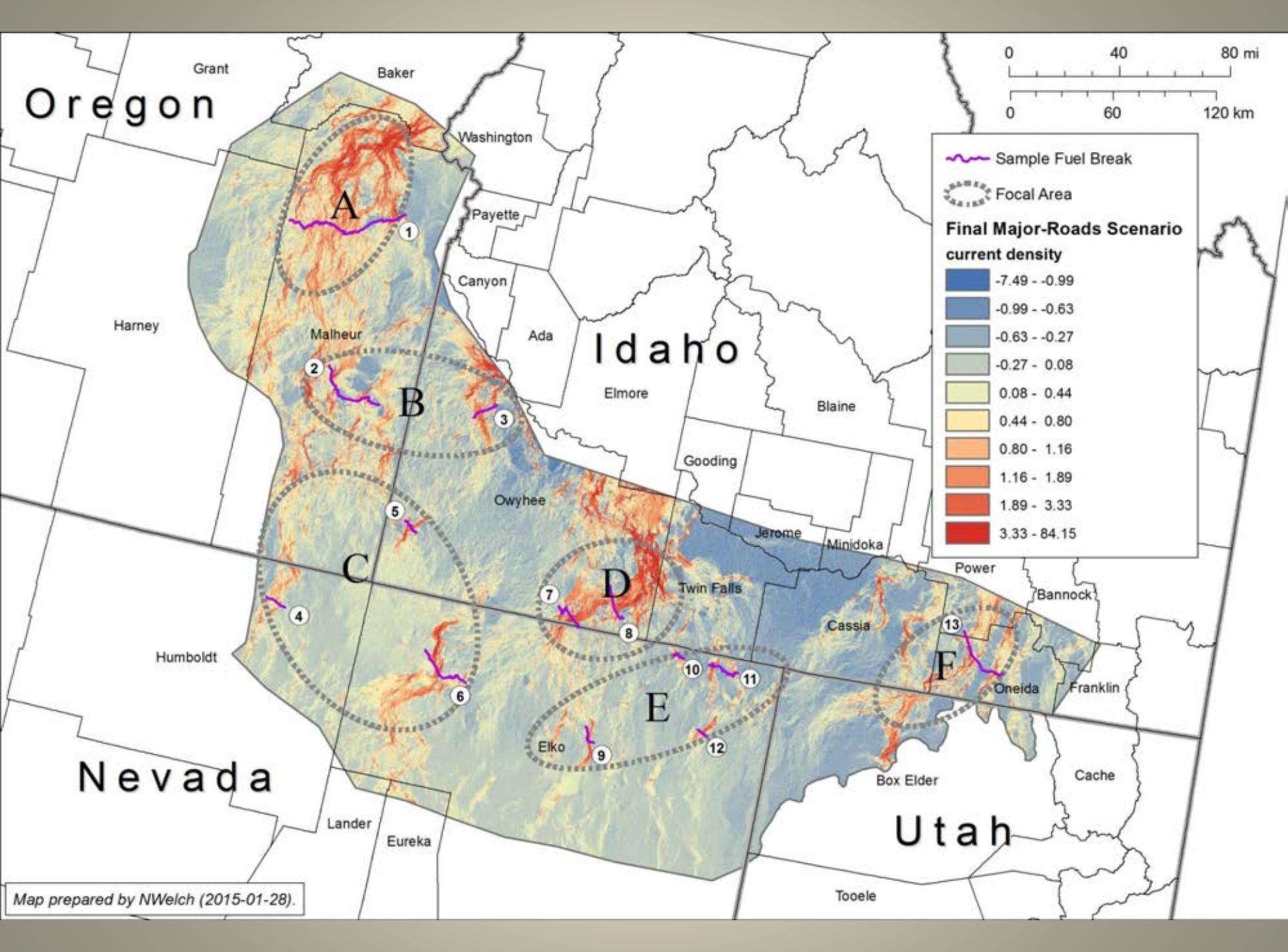
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10

12

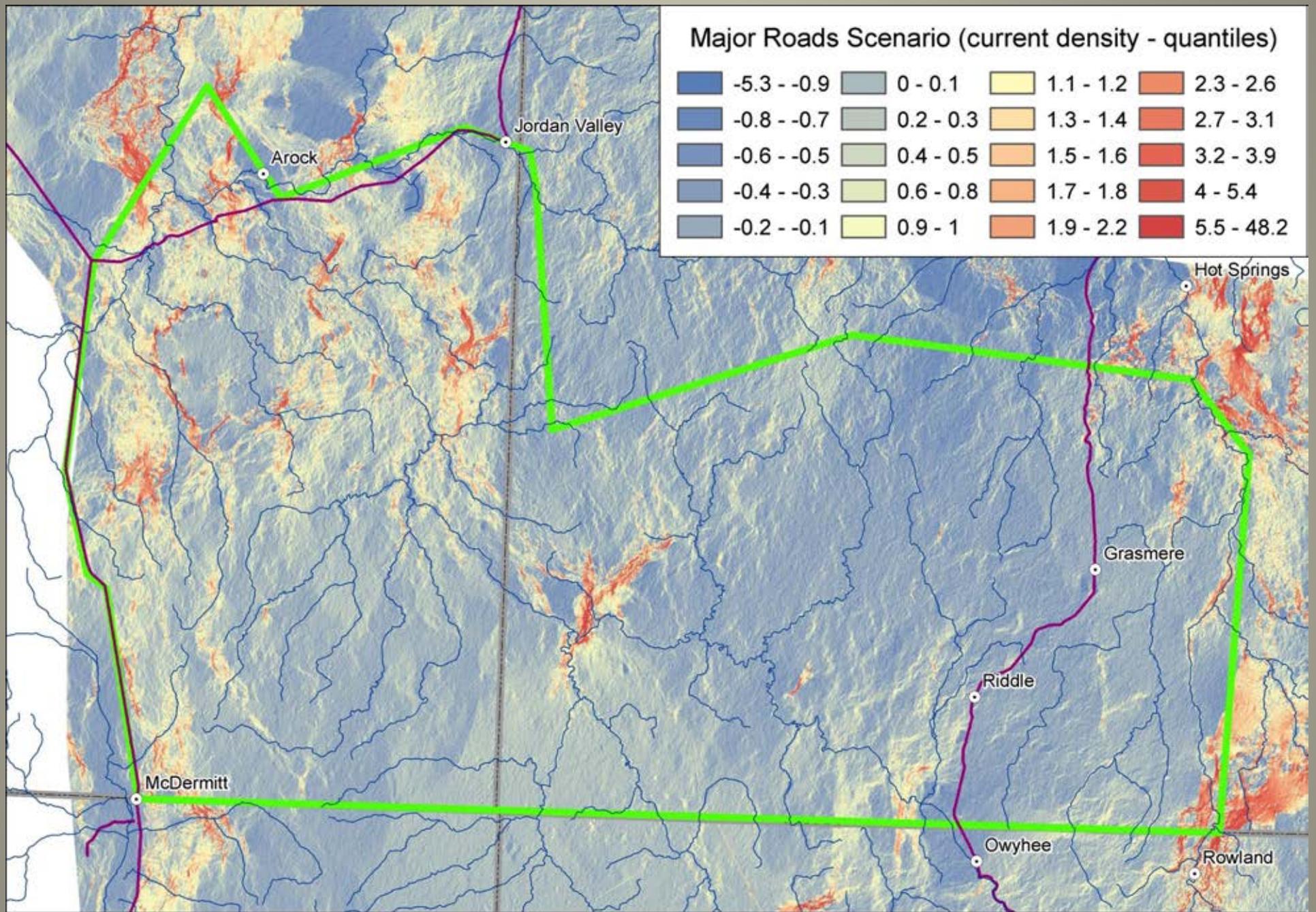
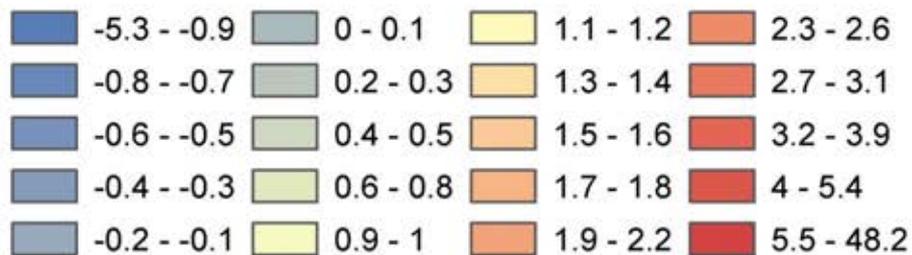
11

13



Map prepared by NWelch (2015-01-28).

# Major Roads Scenario (current density - quantiles)



0 10 20 40 Miles

Tri-State Area (Rough Approximation)

NWelch 2016-02-29

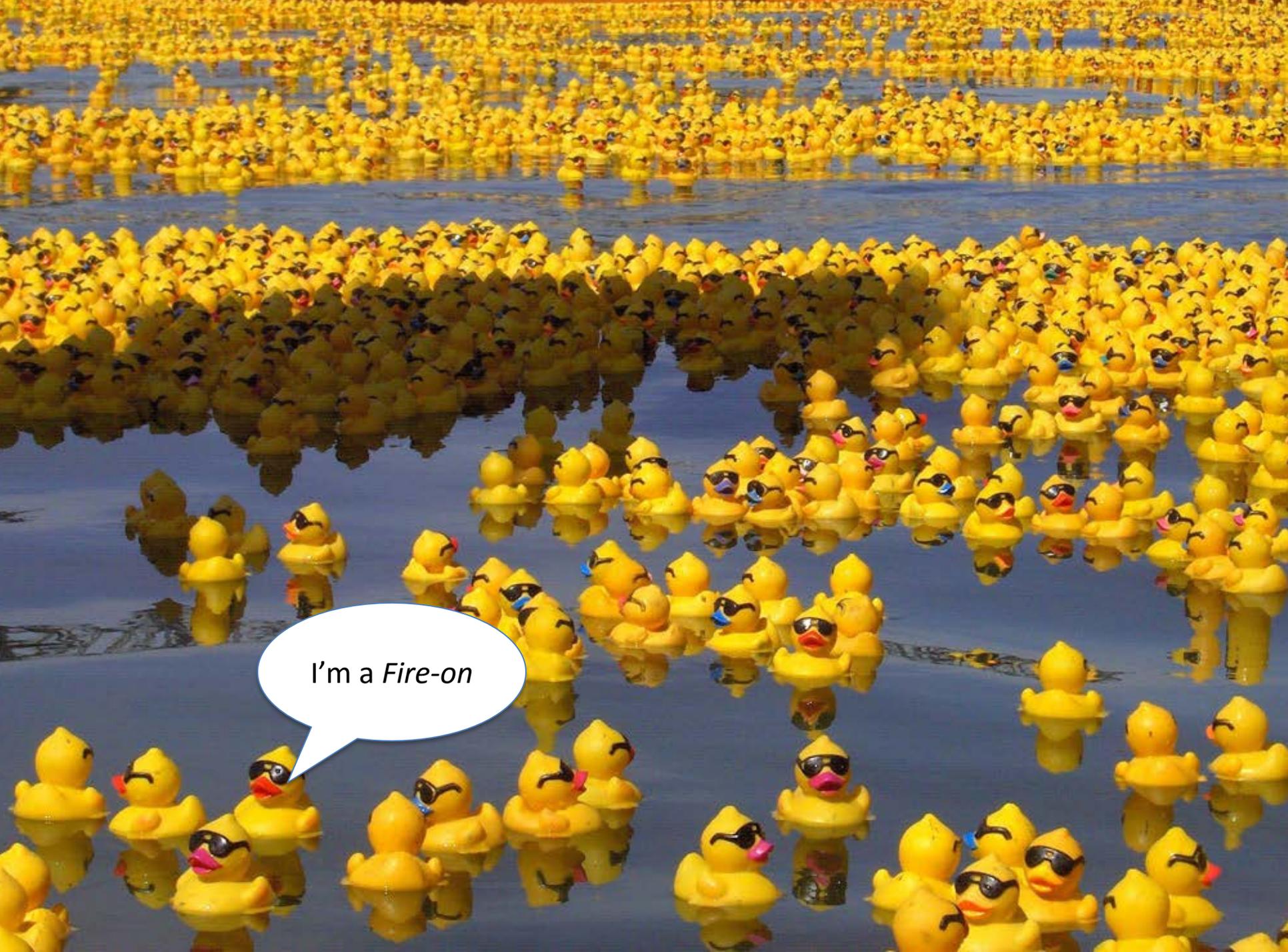
# Next Steps

- Using Circuitscape, we have developed a process to identify strategic locations for fuel breaks at regional scales and to simulate potential fuel breaks with different levels of effectiveness (i.e., permeability). It provides a starting place for land managers to consider in planning efforts. It does not indicate whether a fuel break is possible, practical, or desirable from a local perspective.
- Our report is being shared with public and private land managers as another resource to inform decisions about land and fire management. We intend to pursue a collaboration with fire managers in at least one of the focal geographies we identified.
- We are pursuing opportunities to test and improve our modeling approach and to conduct a rigorous comparison with more sophisticated fire models.

# Acknowledgments

We are grateful for funding from the Western Association of Fish and Wildlife Agencies and, ultimately, to the U.S. Fish and Wildlife Service.

Elaine York (The Nature Conservancy in Utah) and Jay Kerby (The Nature Conservancy in Oregon) helped with local agency workshop coordination and outreach.

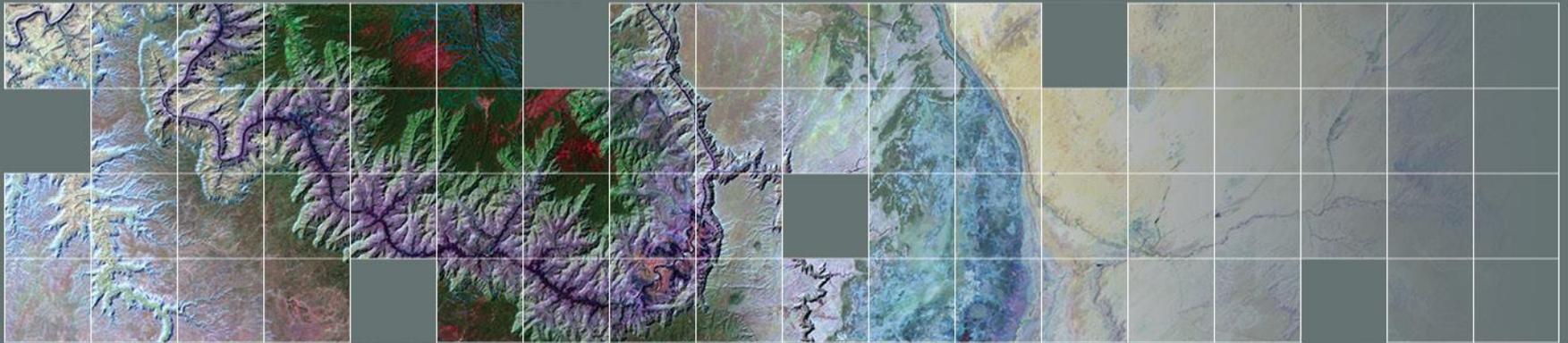


I'm a *Fire-on*

Climate and Land Use Change

**Earth Resources Observation and Science (EROS) Center**

# Characterization of Shrub/Grass Components Across the West with Remote Sensing, New Opportunities for Habitat and Trend Analysis



# Outline and Acknowledgments

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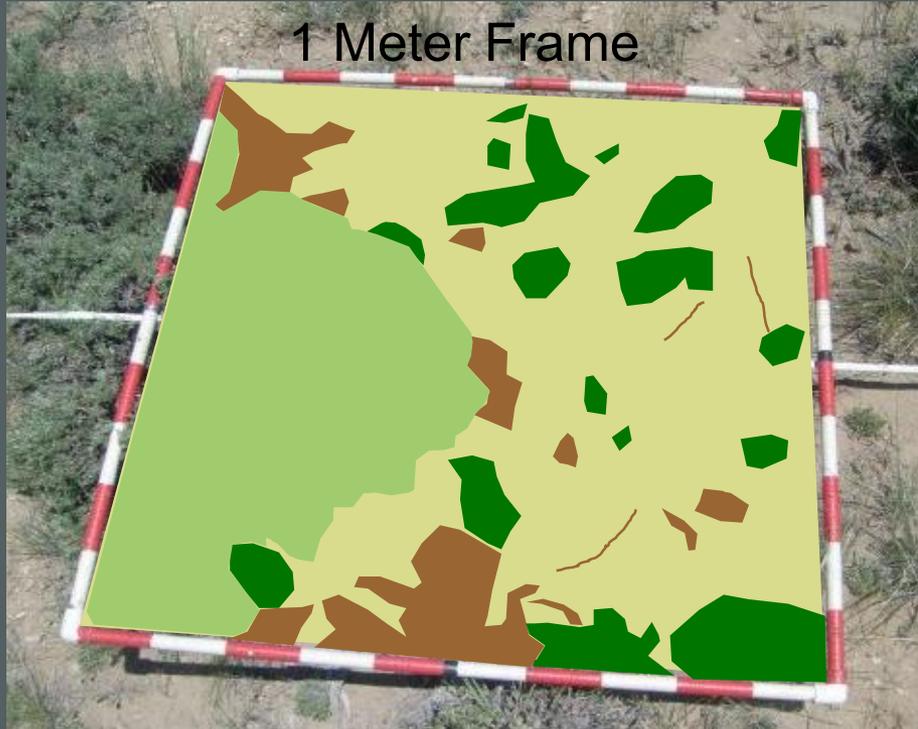
- What are remote sensing components and how are they created?
- What are the current results?
- How can they be used?
- What products are coming?
- Future possibilities?
- How to get them

## Acknowledgements:

- Many individuals doing this work at USGS-EROS, USGS-FRESC and USGS-FORT and BLM, USGS and WAFWA/USFWS for providing funding

# What are fractional vegetation components?

---



## Vegetation Components

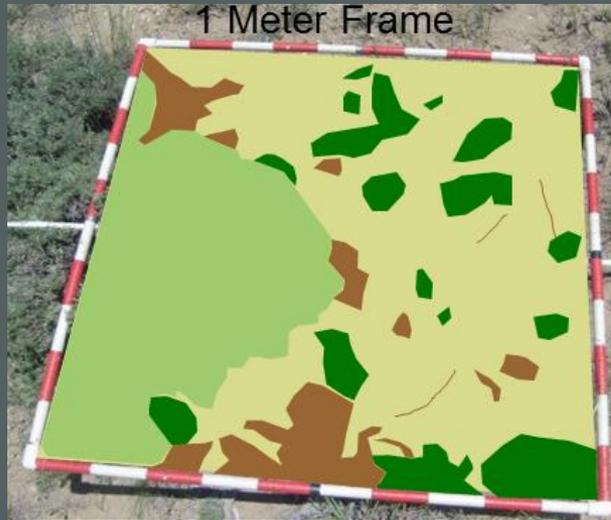
- Sagebrush/shrub - 30%
- Herbaceous - 15%
- Litter - 10%
- Bare ground - 45%

Component proportions are field measured and then extrapolated to satellite imagery pixels in the same way

---

# Fractional components are scaled up from field measurements with 2 scales of satellite imagery using regression tree models

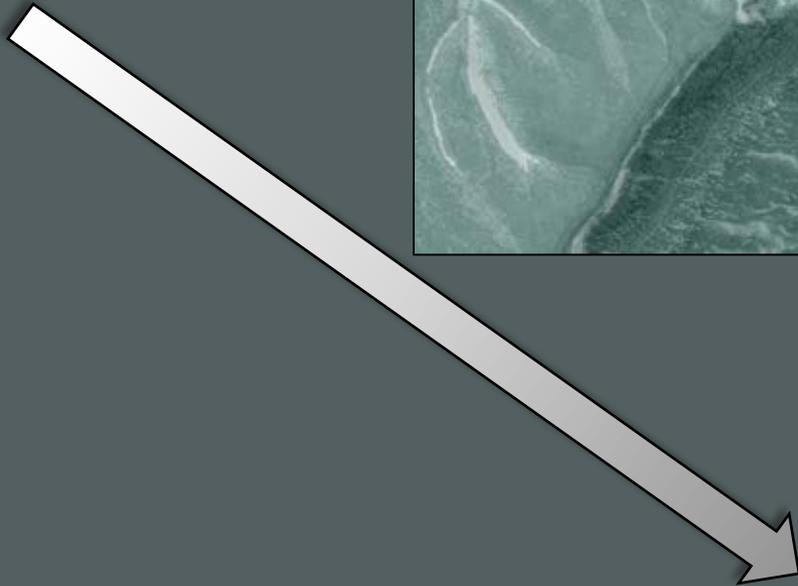
Field Measured Bare Ground



High Resolution Satellite Bare Ground (2.4 meter pixel)



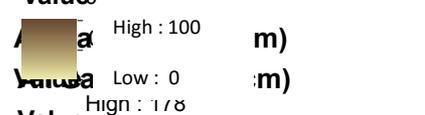
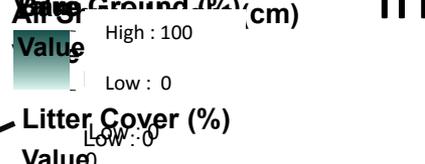
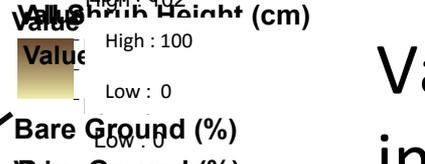
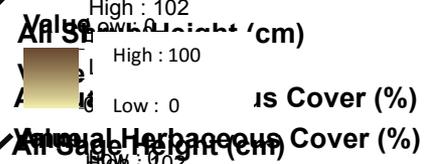
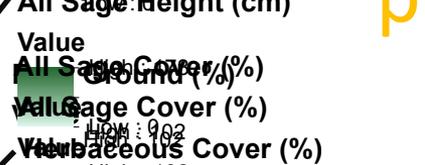
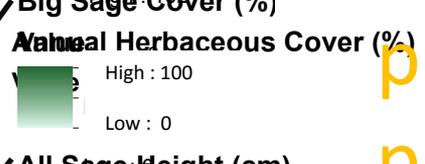
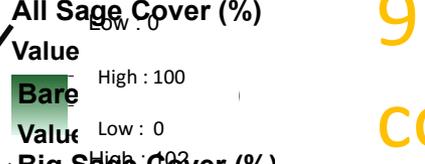
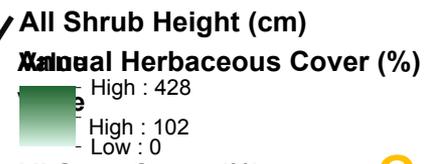
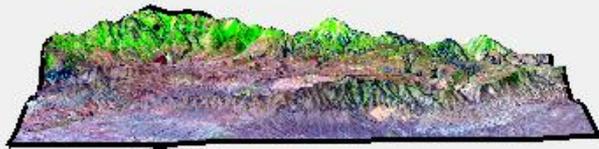
Landsat Bare Ground (30meter pixel)



Products require extensive fieldwork at strategic Worldview 2/3 collects to be successful (about 144 sq. km. each)

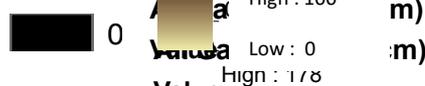
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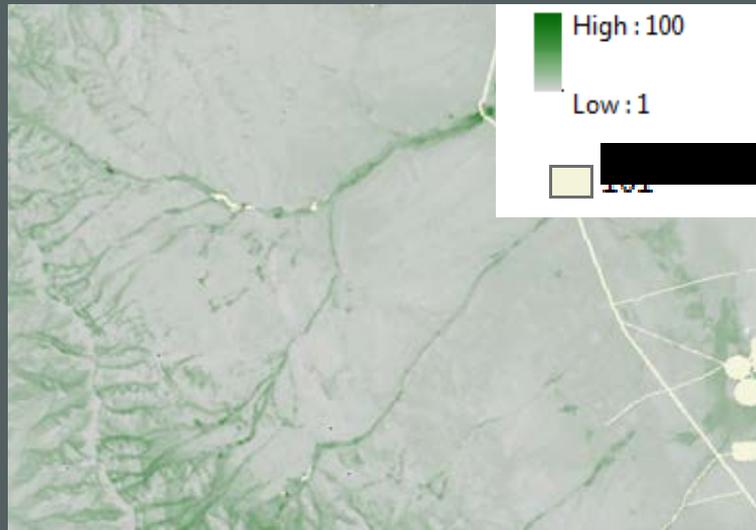
9 Shrub  
 component  
 products are being  
 produced

Values in 1%  
 increments

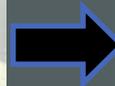
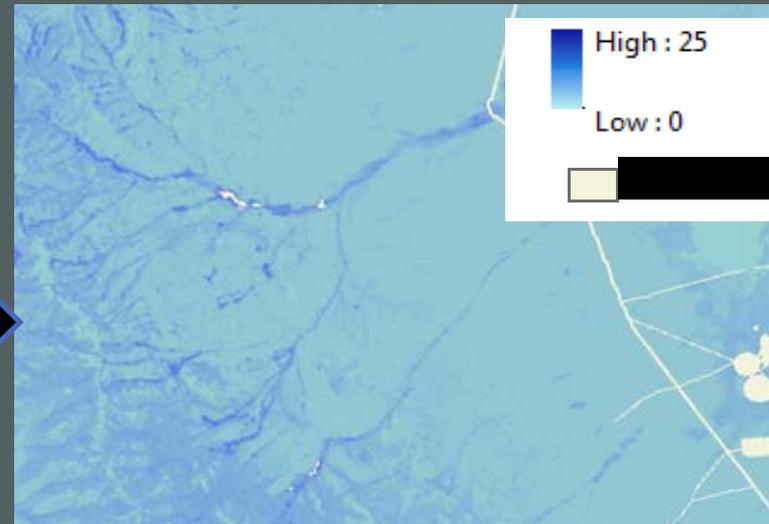


# Validation includes independent validation, cross validation and a spatial absolute error model prediction with all products

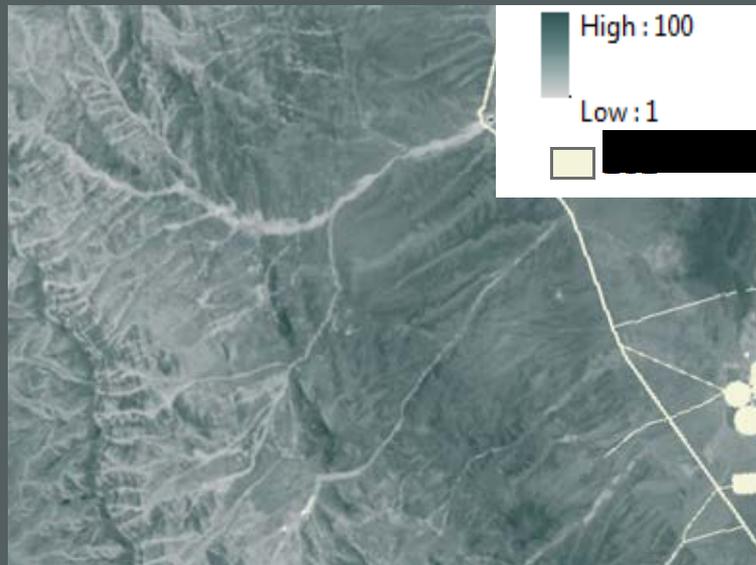
## Shrub Prediction



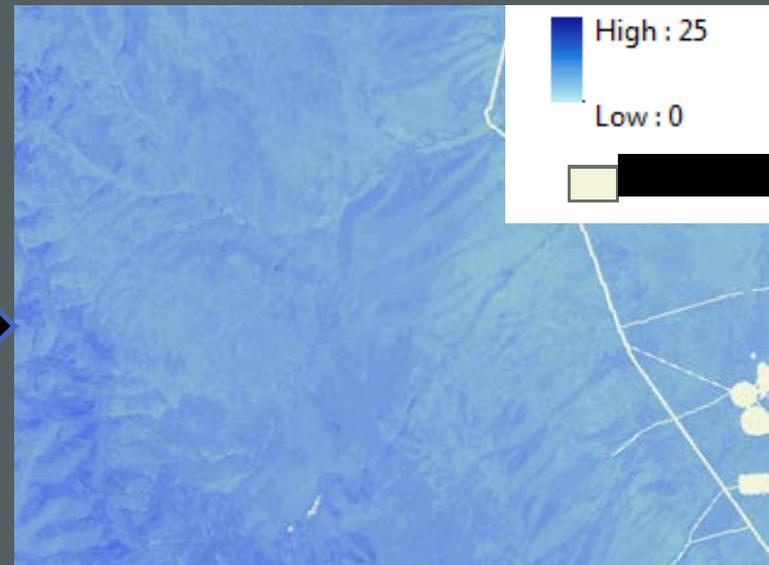
## Shrub Absolute Error



## Bare Ground Prediction

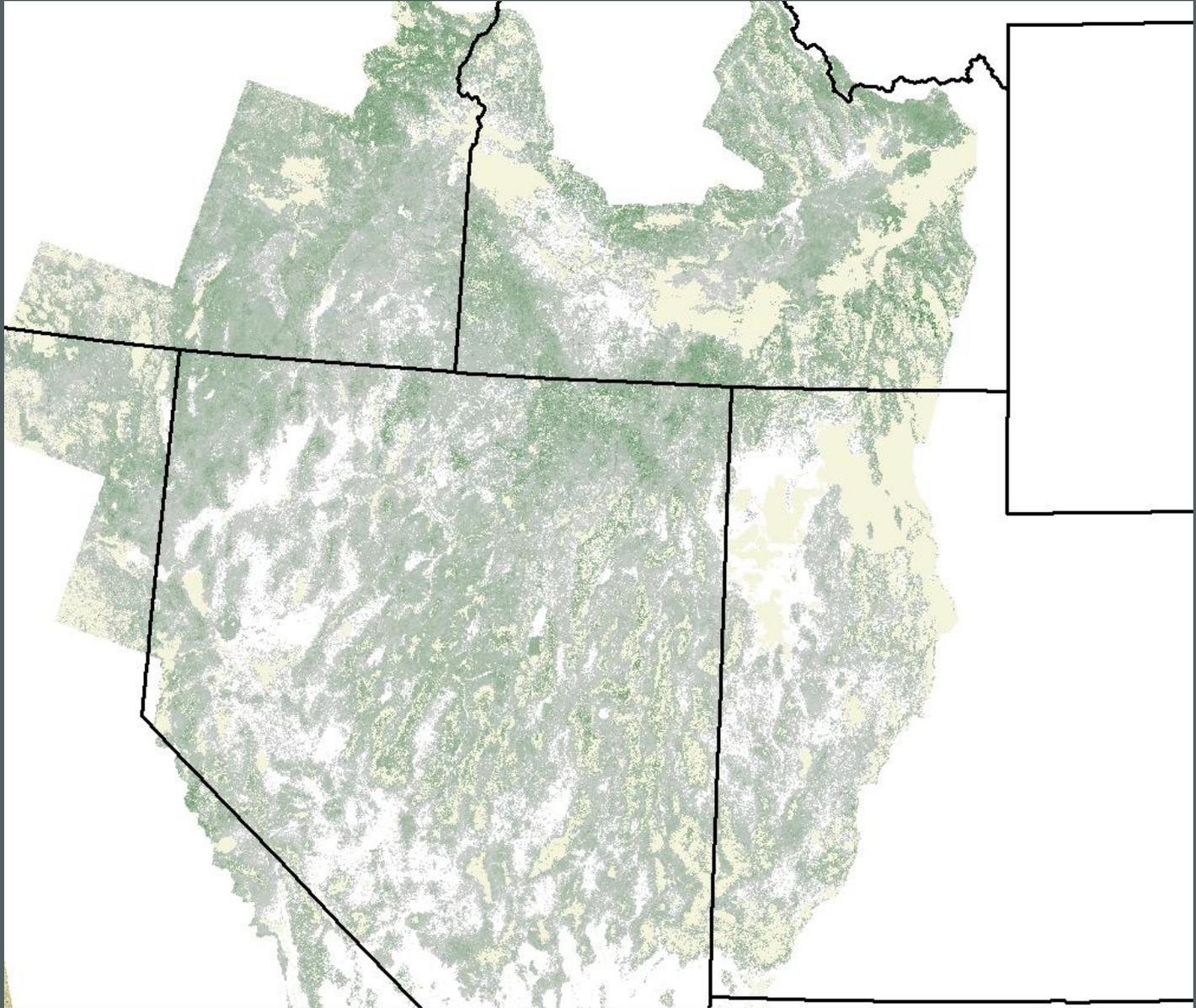


## Bare Ground Absolute Error



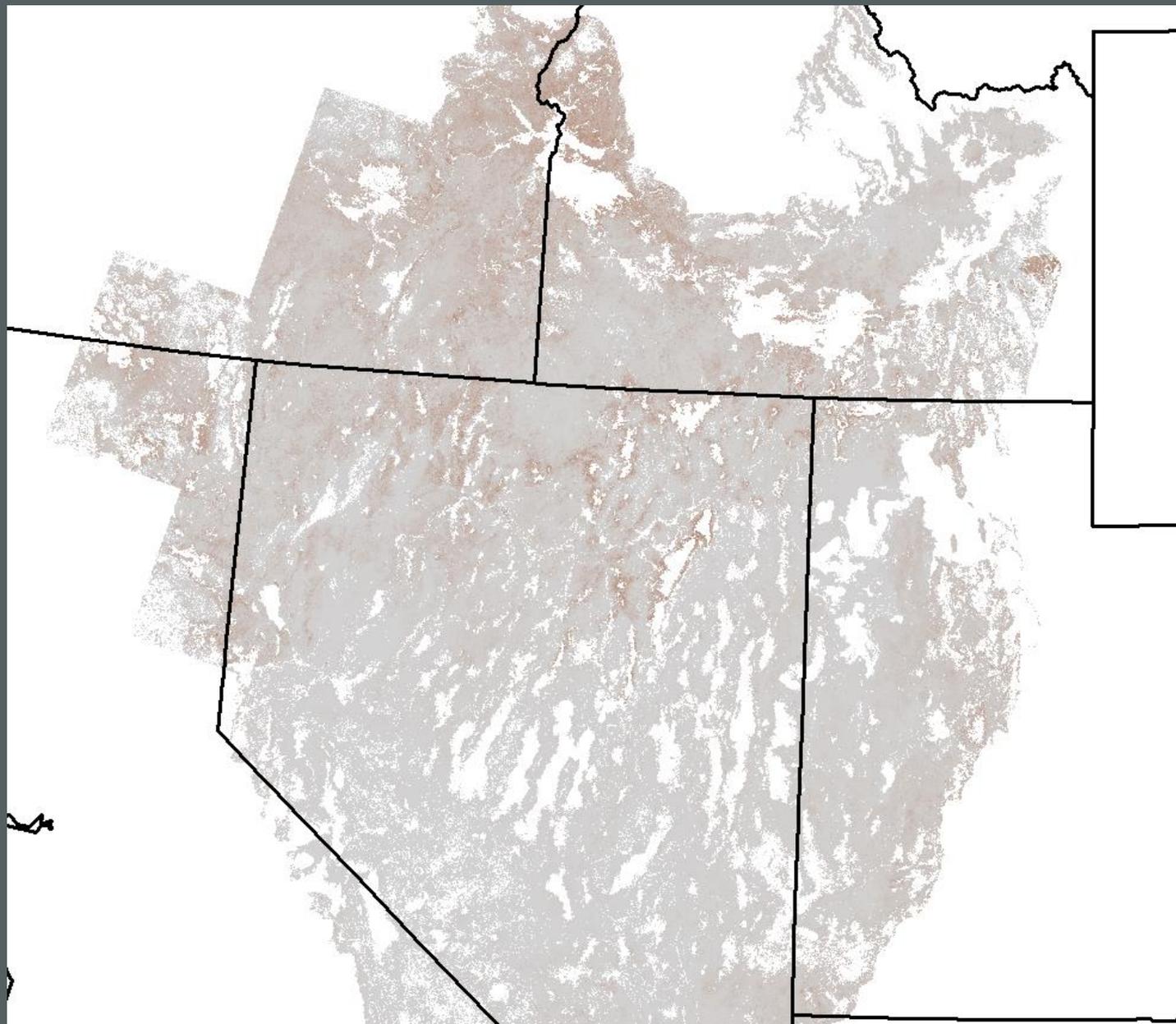
# Great Basin Percent Sagebrush Component

RMSE accuracy is about 6%



# Great Basin Annual Herbaceous Component

RMSE accuracy is about 7%



# The component approach provides maximum flexibility to compile components for endless applications – such as:

---

- **Sage grouse habitat** (Wyoming state-wide seasonal models (Fedy et al., 2014), and new habitat modeling across Great Basin)
  - **Grazing assessment** (Wyoming grazing assessment showing differences in allotments that failed LHS)
  - **Invasives** (used for monitoring cheatgrass growth over Twin Falls Idaho and Winnemucca Nevada)
  - **Climate change** (used to quantify vegetation change in response to climate in Wyoming and Nevada)
  - As well as other applications in **fire fuel analysis, restoration monitoring, other climate impacts**
-

# The component approach allows better quantification and monitoring of change

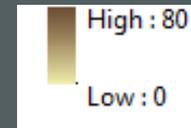


Nevada example  
of quantifying  
cheatgrass  
increase over  
time, 1993-2011

SW of Hot Springs Range

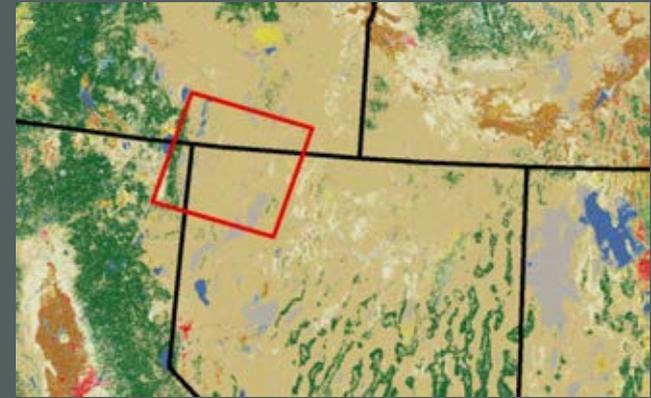
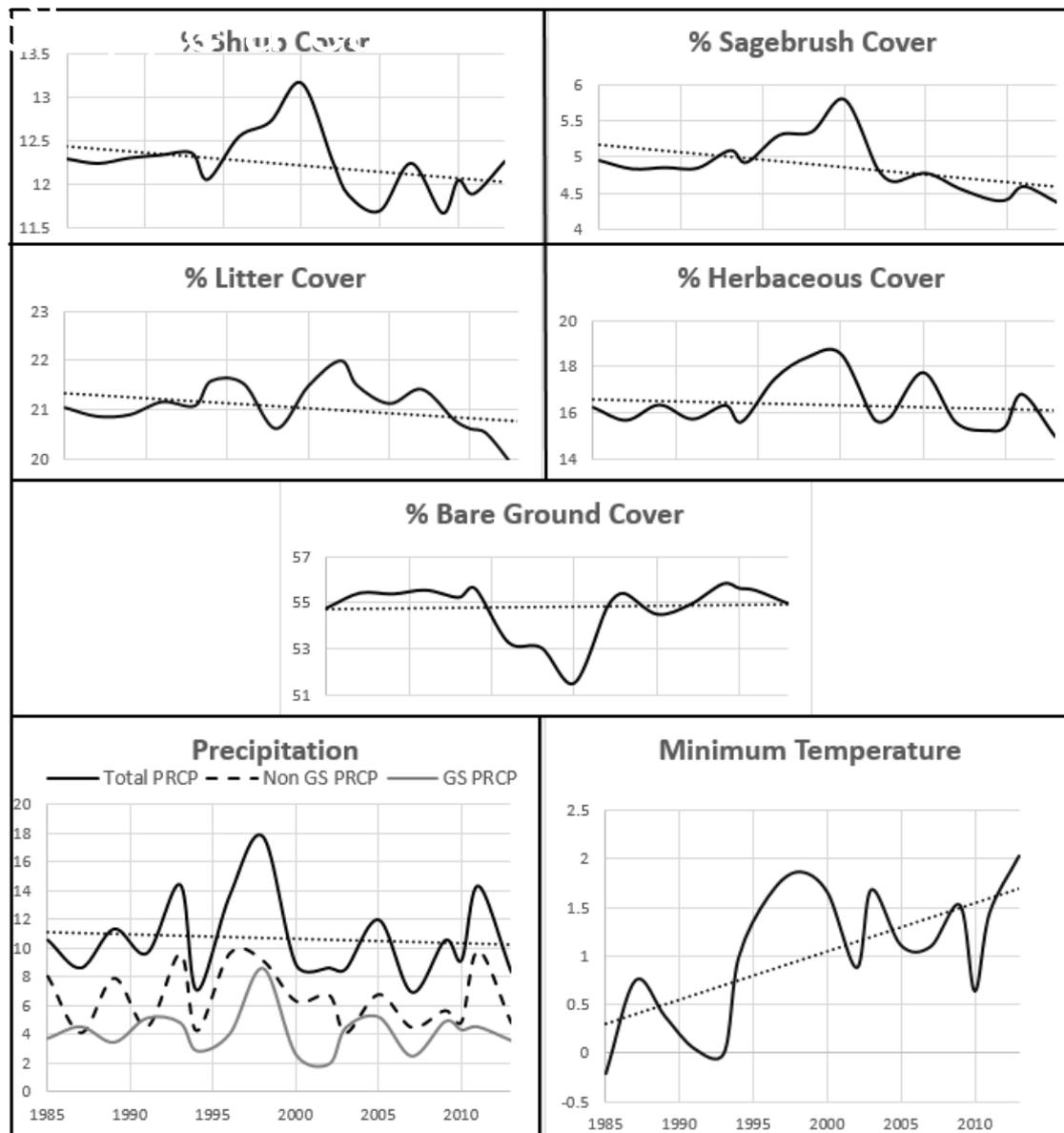


White – masked out  
areas



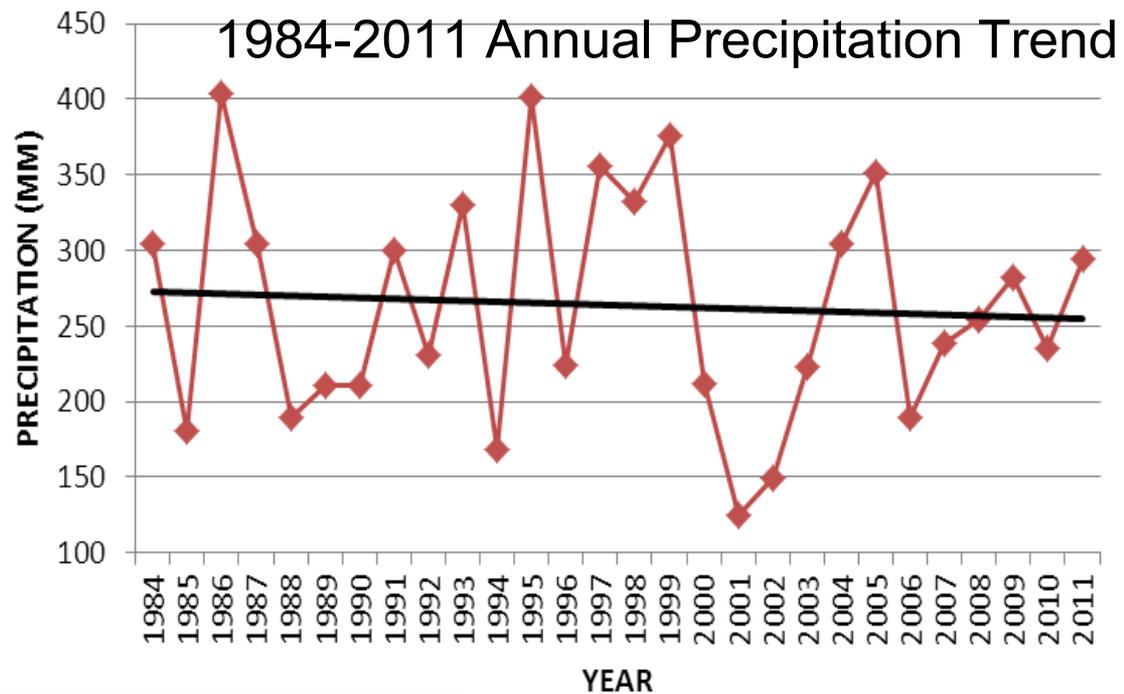
Cheatgrass quantity

The Landsat archive can be used to see components change over time, such as this climate example...

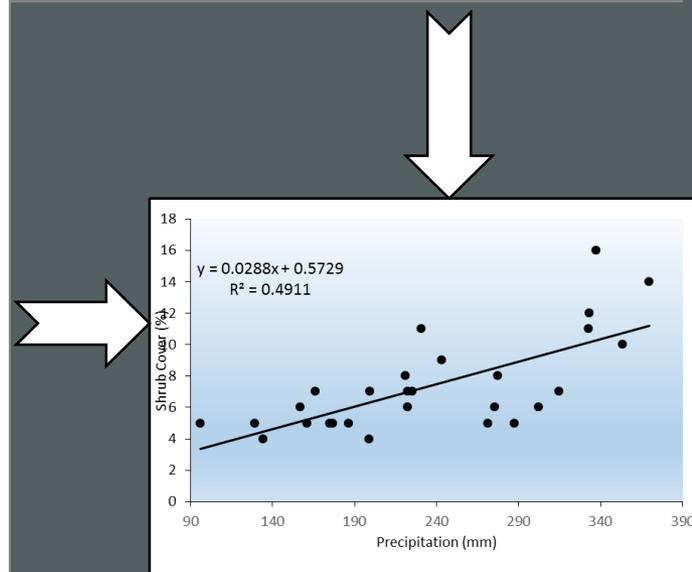
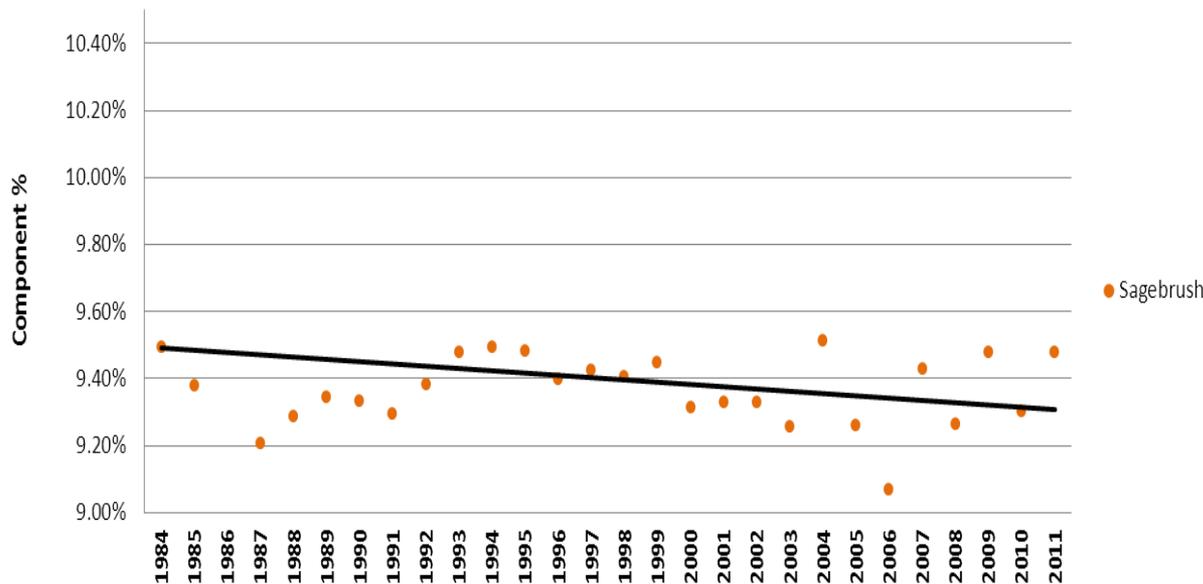


Average yearly value in climate changed pixels for Northwest Nevada/Southeast Oregon, 1985-2014

That historical relationship can then be modeled for each pixel.....

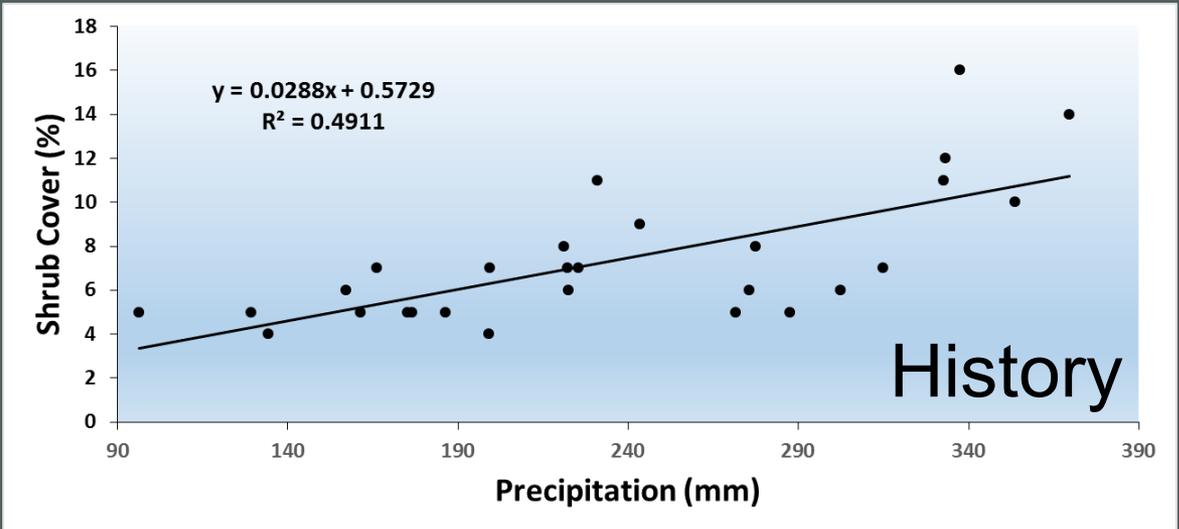


### 1984-2011 Annual Sagebrush Component Trend

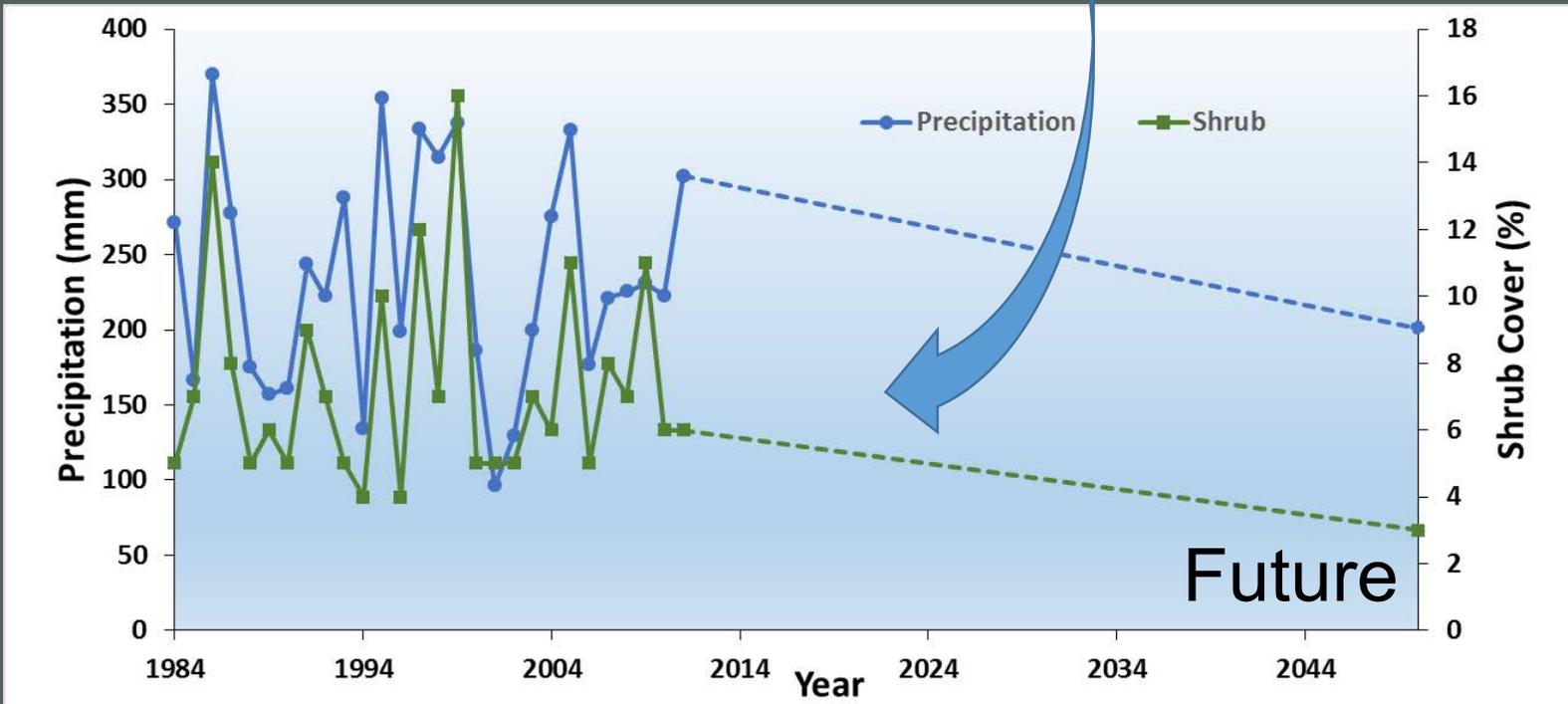


### Linear Regression

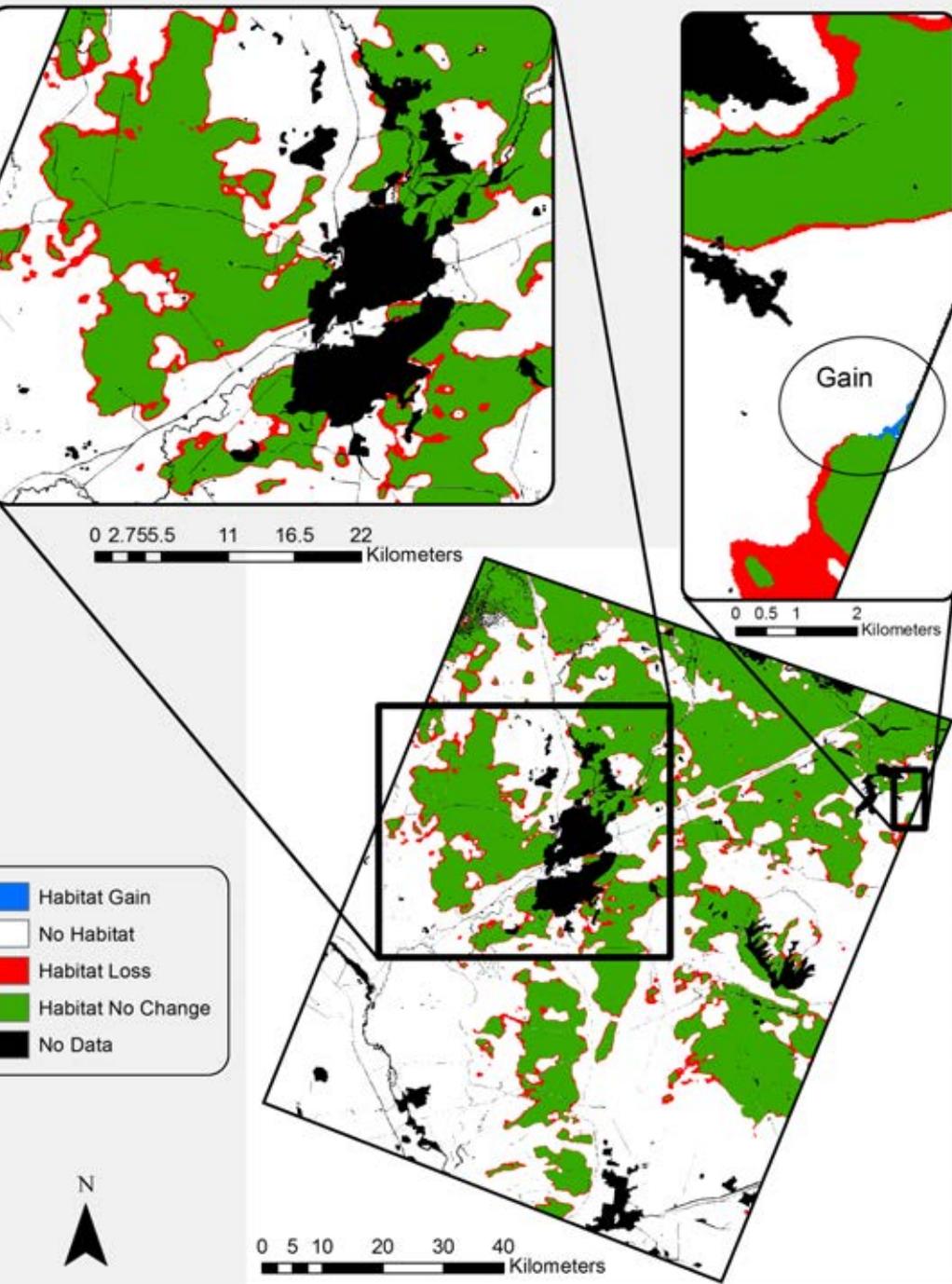
# Each pixel model can then forecasted into the future



Regression between sagebrush cover and annual precipitation for a selected pixel



2050 sagebrush projected cover from projected precipitation slope for a selected pixel



This approach was used to predict the impact of climate change on Sage grouse nesting habitat between 2006 and 2050 – results indicate an 11% overall loss.....

Homer, C, Xian, G., Aldridge, C., Meyer, D., Loveland, T. and M. O'Donnell. 2015. *Forecasting sagebrush ecosystem components and greater sage-grouse habitat for 2050: Learning from past climate patterns and Landsat imagery to predict the future.* *Ecological Indicators*, Vol. 55, 131–145.

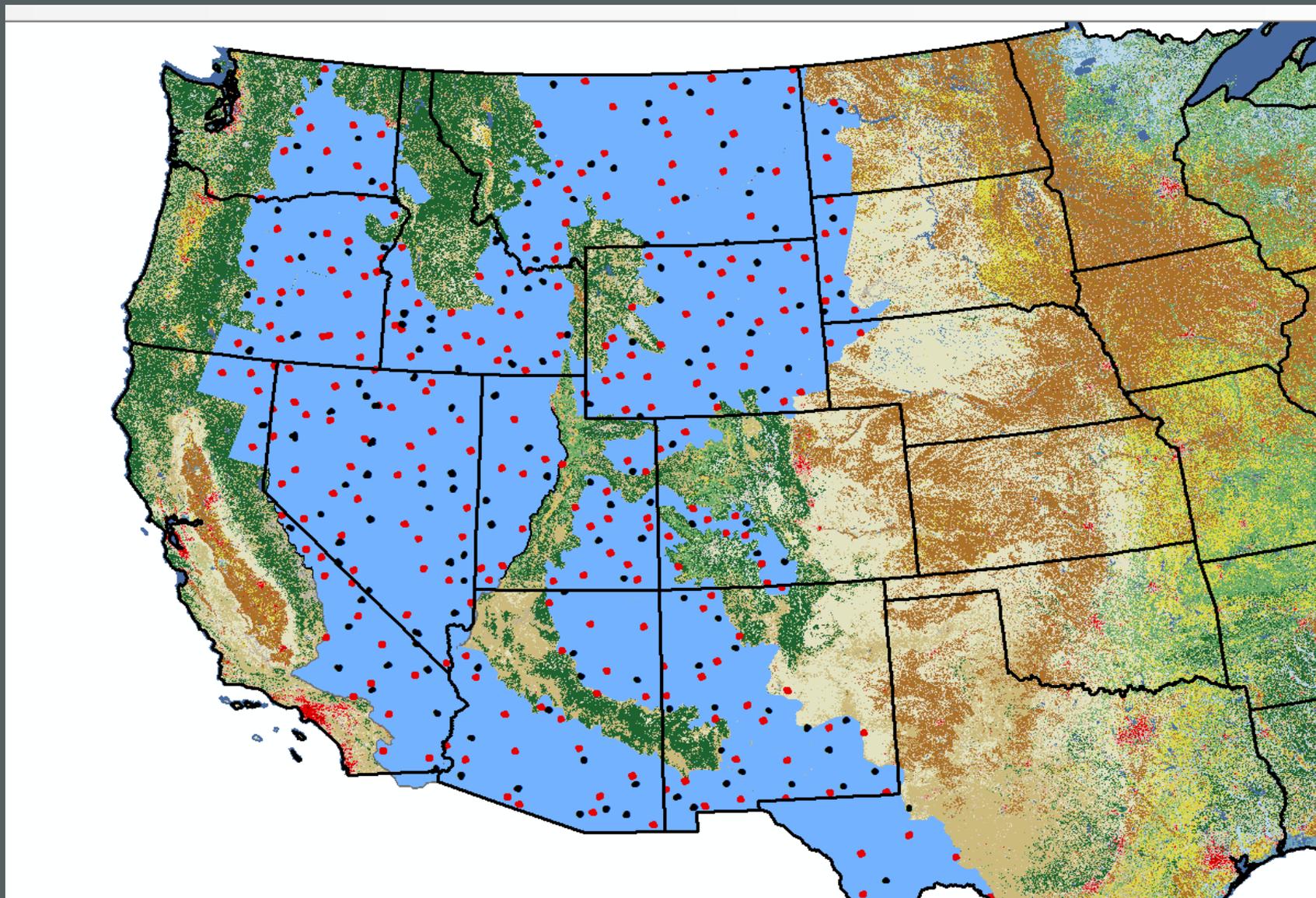
# Research Goals – tell this story about every pixel in the West.....

---

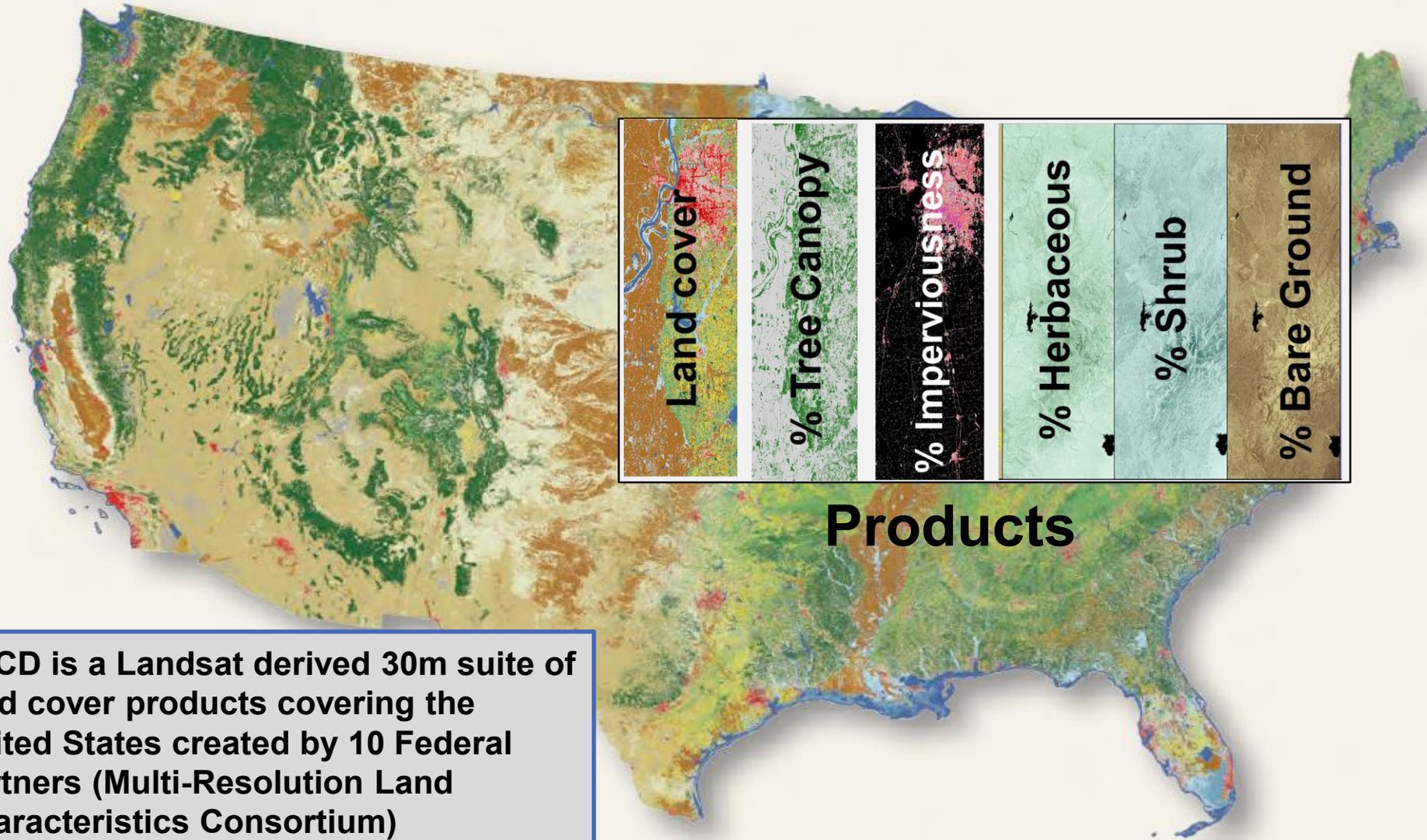
- Characterize it's components
- Score the “intactness” of the pixel against expected site potential
- Determine how much the pixel changed since 1983, and what caused the change?
- How much of that change is climate?
- Knowing the past history, what is the likely future trend for the pixel from climate and other change agents?
- Communicate results with interactive data “maps”

# Total area mapped after 2016 field season

Field sampled high resolution satellite areas in red (189) Independent validation plots in black (1,475)



# The National Land Cover Database



Great Basin components available on the MRLC website [www.mrlc.gov](http://www.mrlc.gov) on April 15th



Environmental  
& Statistical  
Consultants

# Trends in Lek Attendance by Male Greater Sage-Grouse

---

Ryan Nielson  
Lyman McDonald  
Jason Mitchell  
Shay Howlin  
Chad LeBeau

4/4/2016

# An Independent Look

- Trends in peak (max) lek attendance by males 1965 – 2015.



- There have been other analyses.

# An Independent Look

- WEST was asked to



- Recommend an analysis approach.
- Provide an example of the analysis using historic data (1965-2015).

# An Independent Look

- Our recommendations:
  - Keep analysis assumptions to a minimum.
  - Avoid transformation of the data.
  - Follow individual leks through time.



# Analysis Approach

- Lek = 2 or more males in 2 or more years
- Data from larger leks + spatially related satellite leks or activity centers were combined.
  - Clustering analysis combined counts within 1.2-km into lek complexes

# Analysis Approach

- Follow standard of not including portions of lek counts with large strings of zeros.

14, 5, 9, 11, 4, 0, 0, 0, 0, 0, 0, 3, 5,...

- An artifact of the way individual States and biologists treat individual leks and record data.

# Analysis Approach

- Applied a well-developed model that has been peer-reviewed and published
  - Thogmartin et al. (2006, *Condor*)
  - Nielson et al. (2008, *The Auk*)
  - Sauer and Link (2011, *The Auk*)
  - Millsap et al. (2013, *JWM*)
  - Nielson et al. (2014, *JWM*)

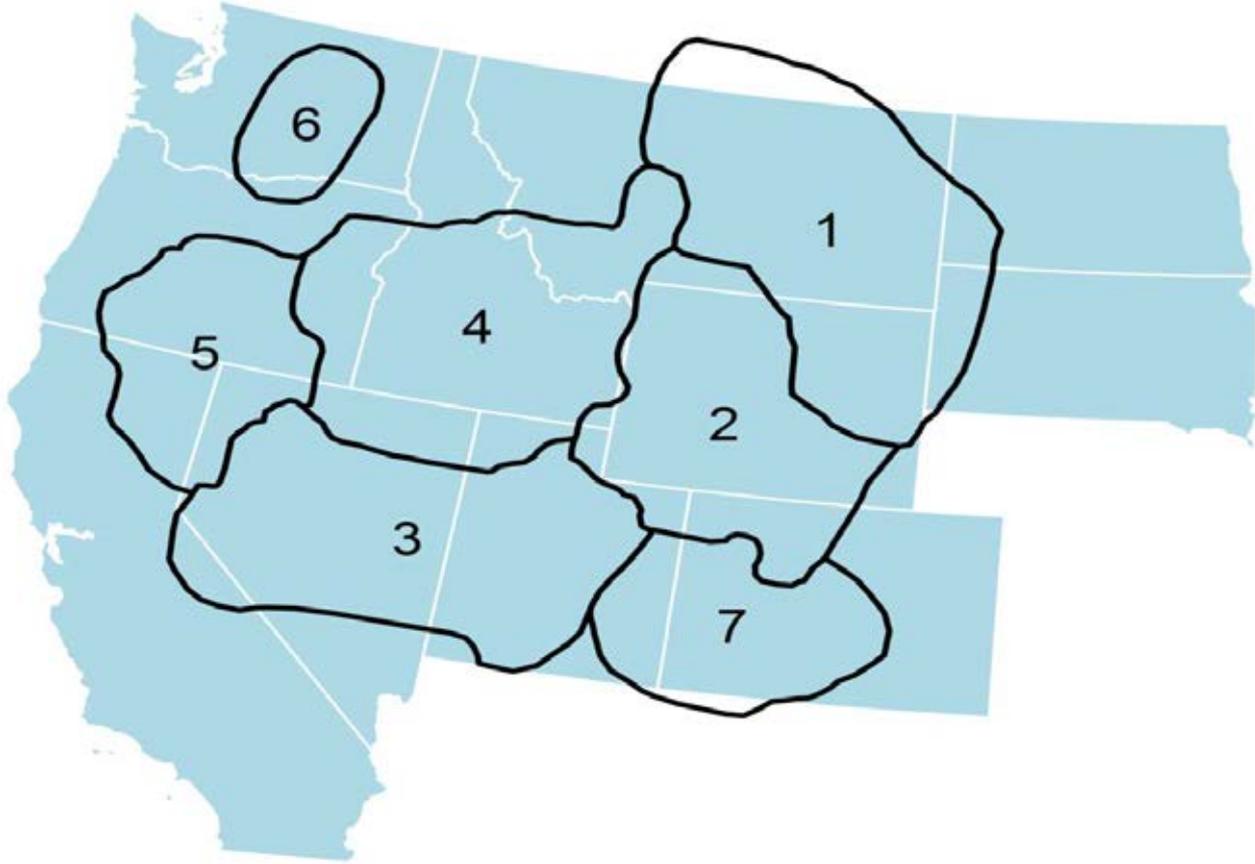


# Analysis Approach

- Bayesian Hierarchical Model
  - Follows individual leks through time.
  - Trends for individual management zones.
  - Overall trend.
  - Analyze entire management zone, core area, and periphery.

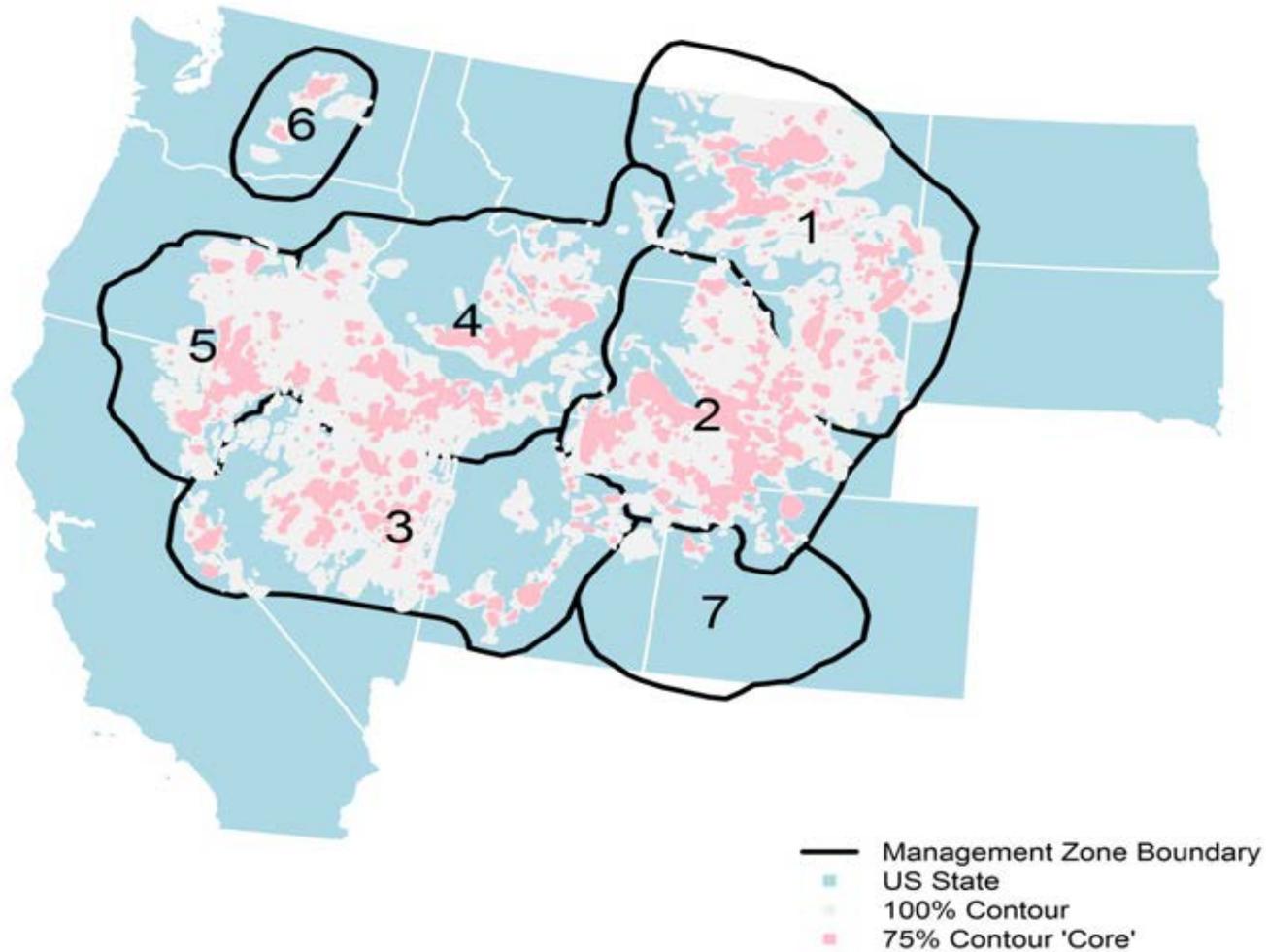


# Management Zones

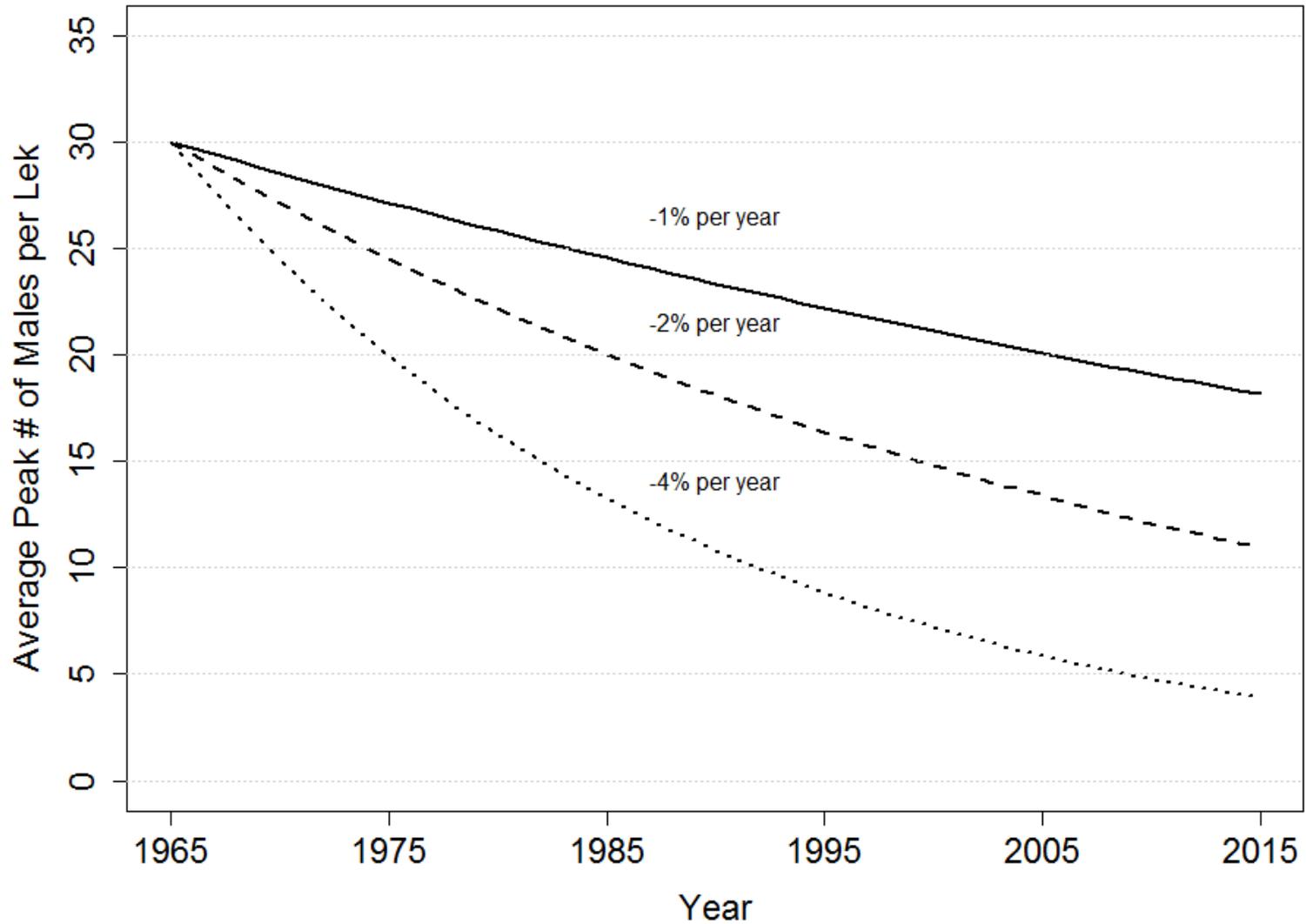


— Management Zone Boundary  
■ US State

# 75% Core Area

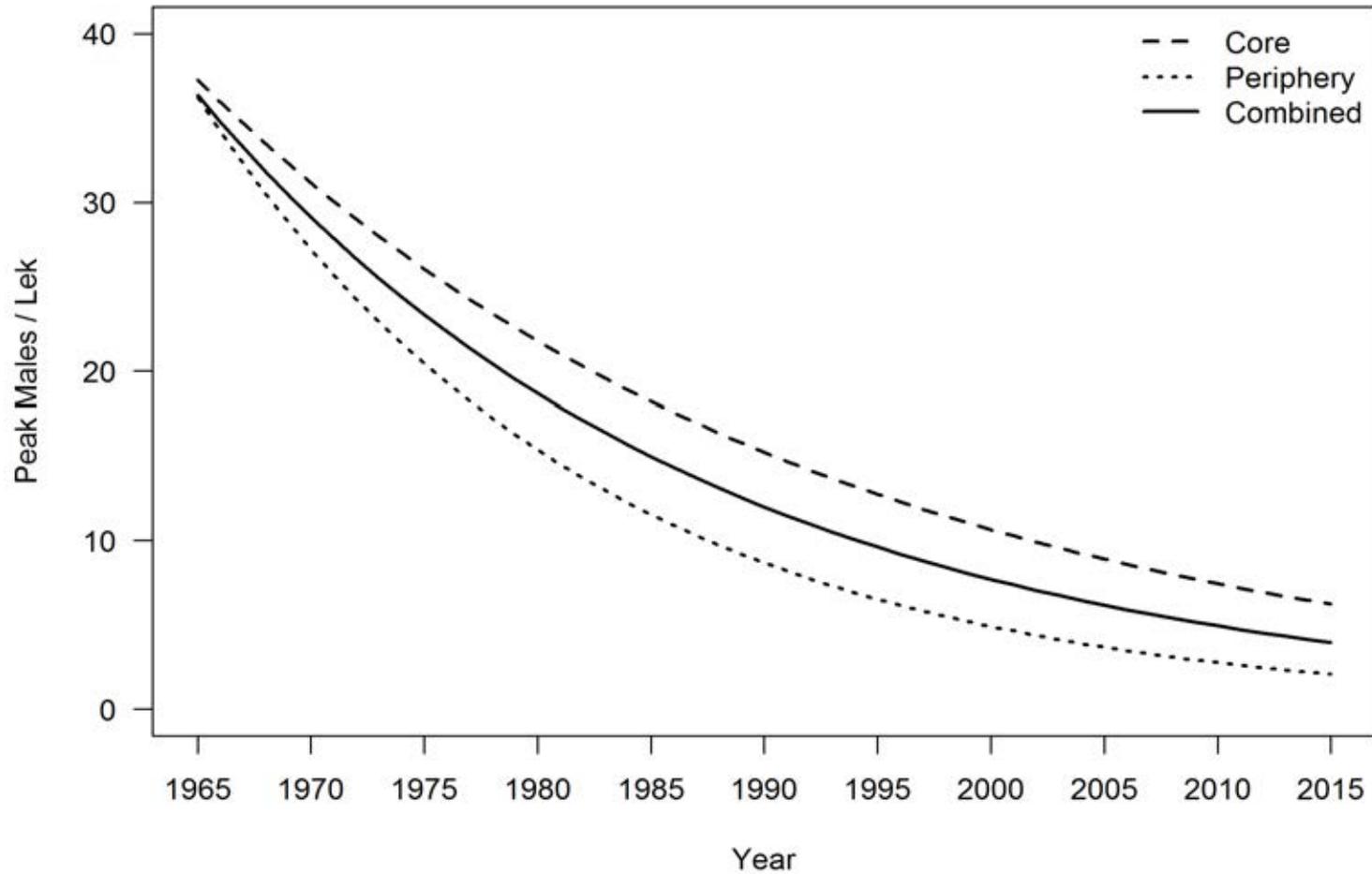


# What is a Trend?

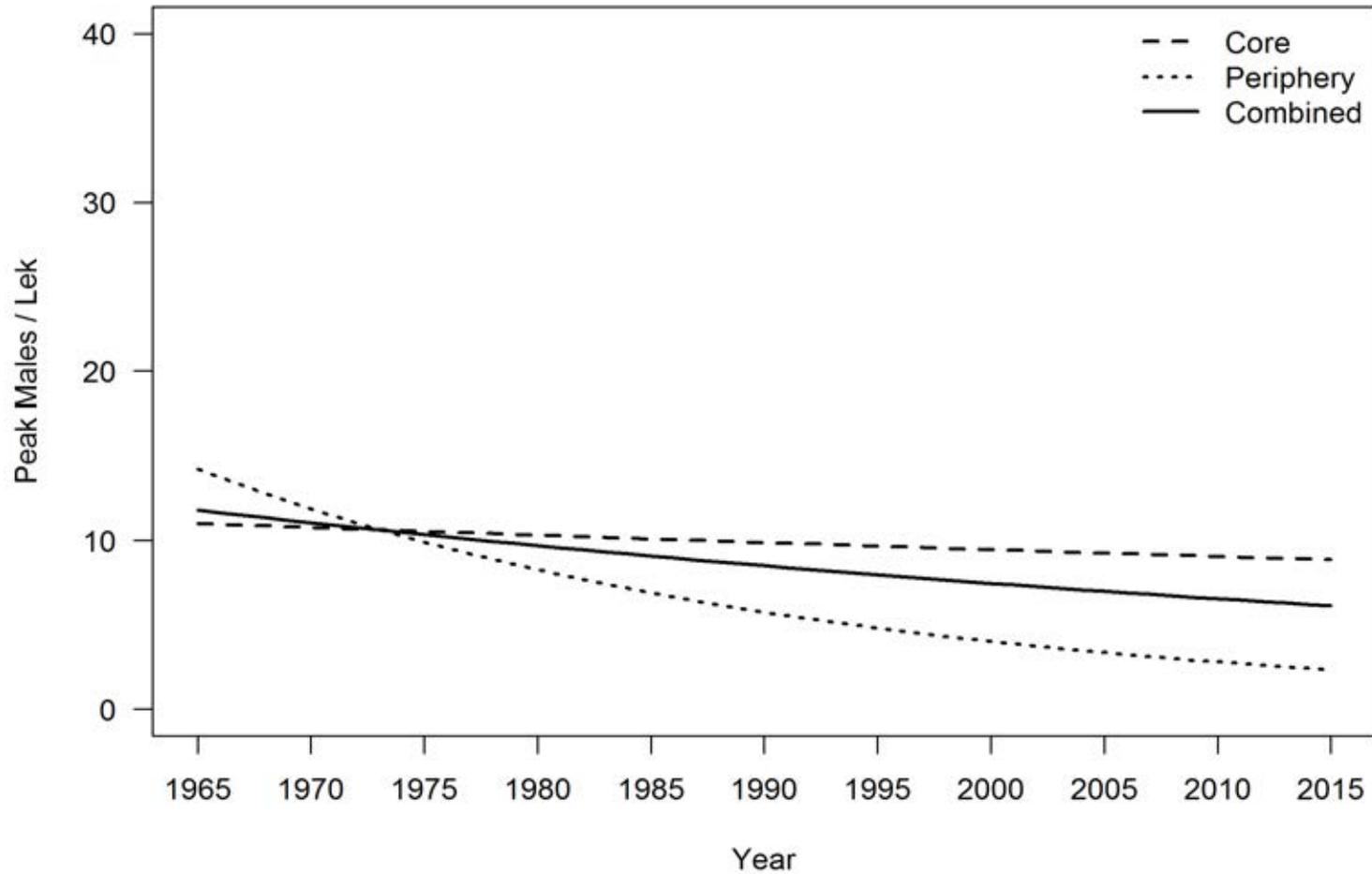


# Results

## Management Zone 1: Great Plains

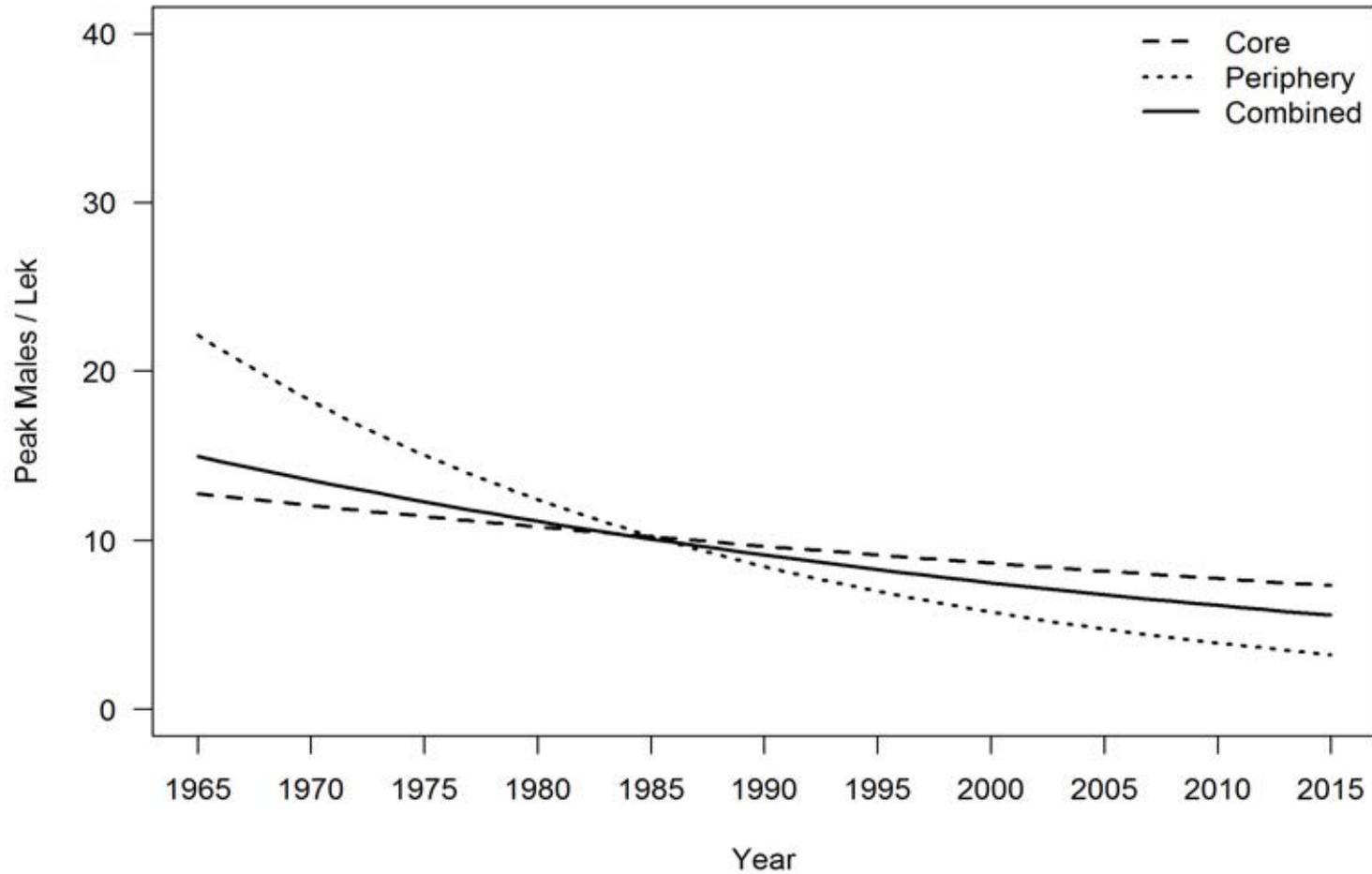


## Management Zone 3: Southern Great Basin



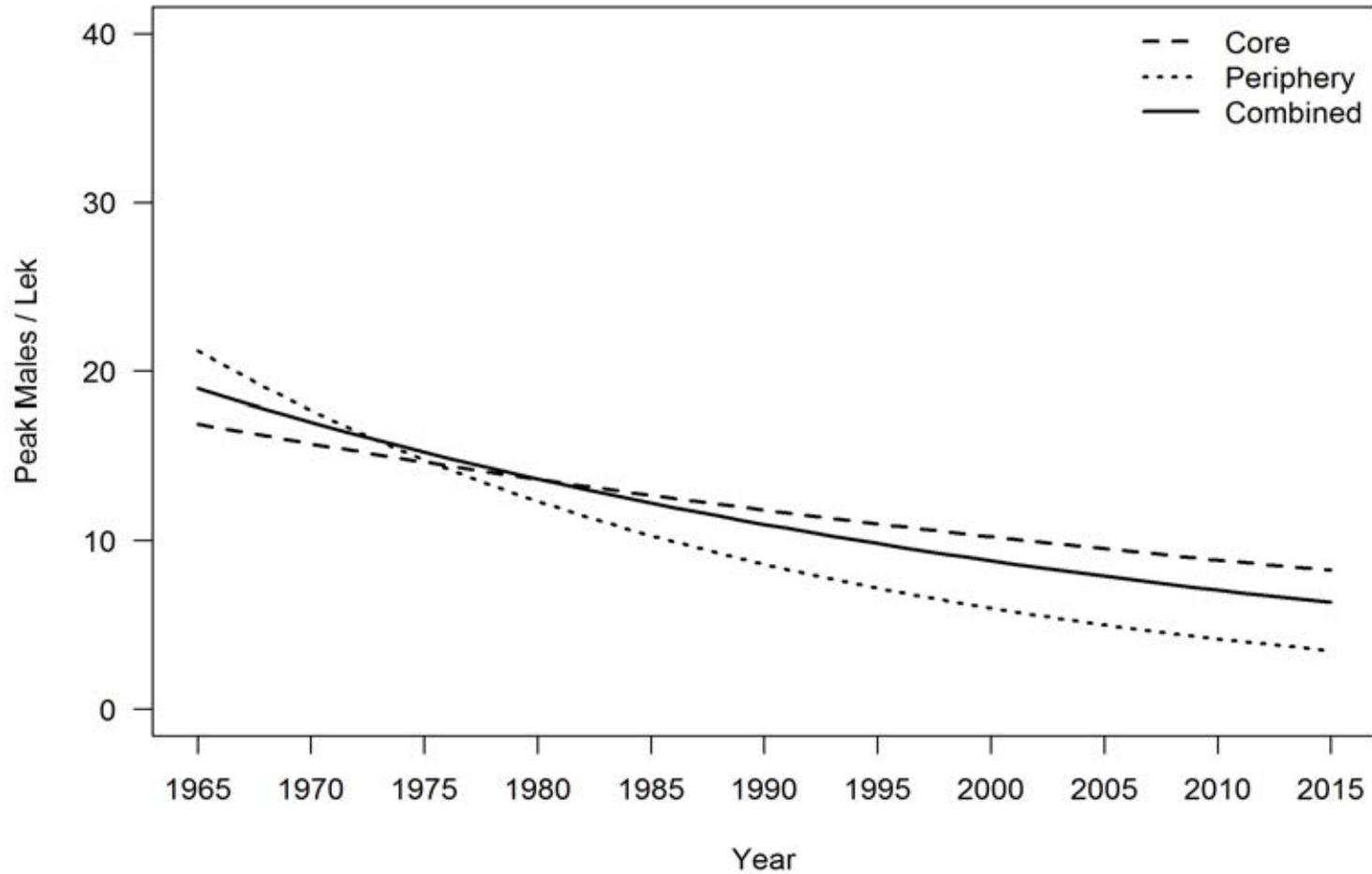
# Results

## Management Zone 4: Snake River Plain



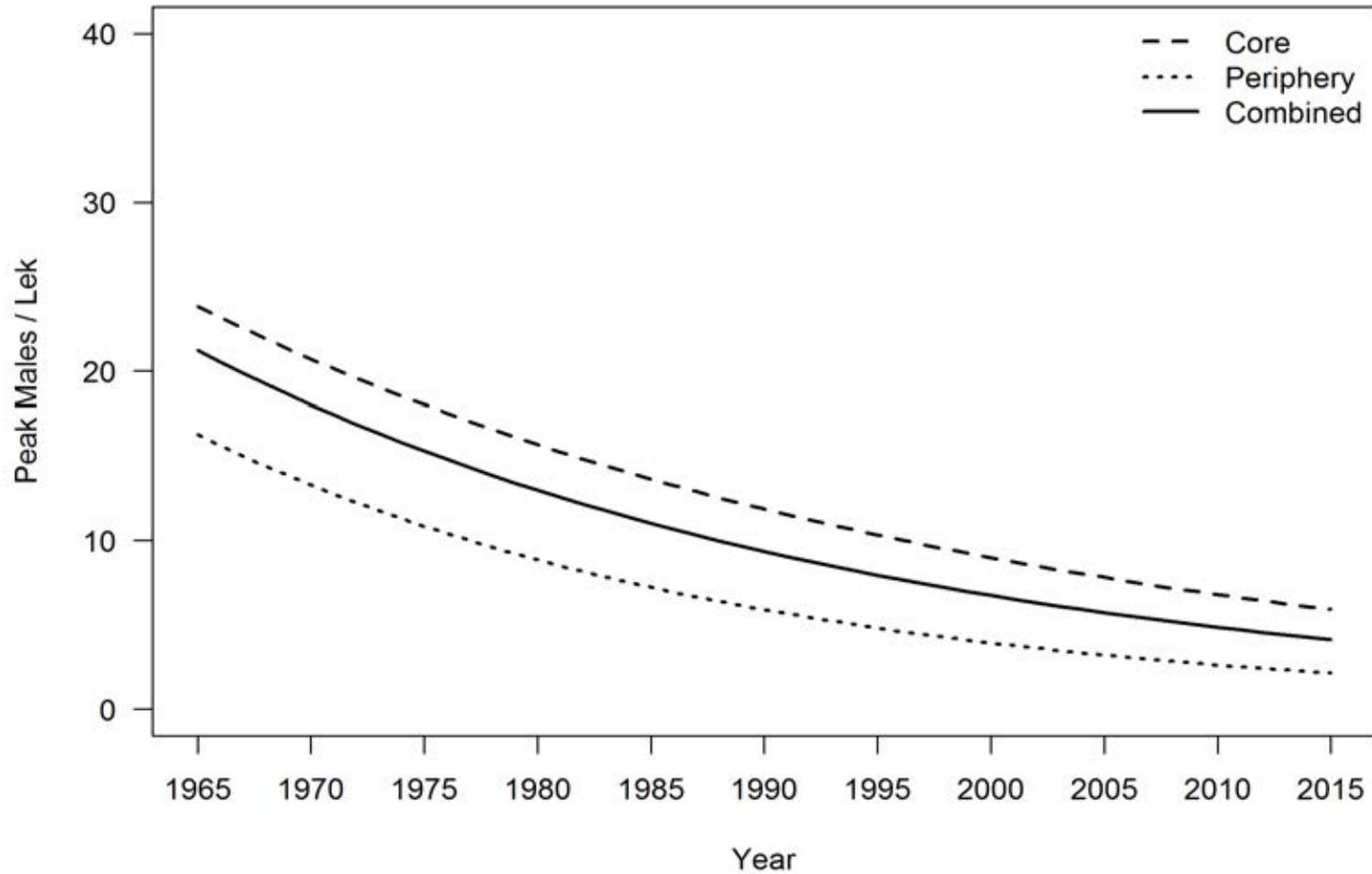
# Results

## Management Zone 5: Northern Great Basin



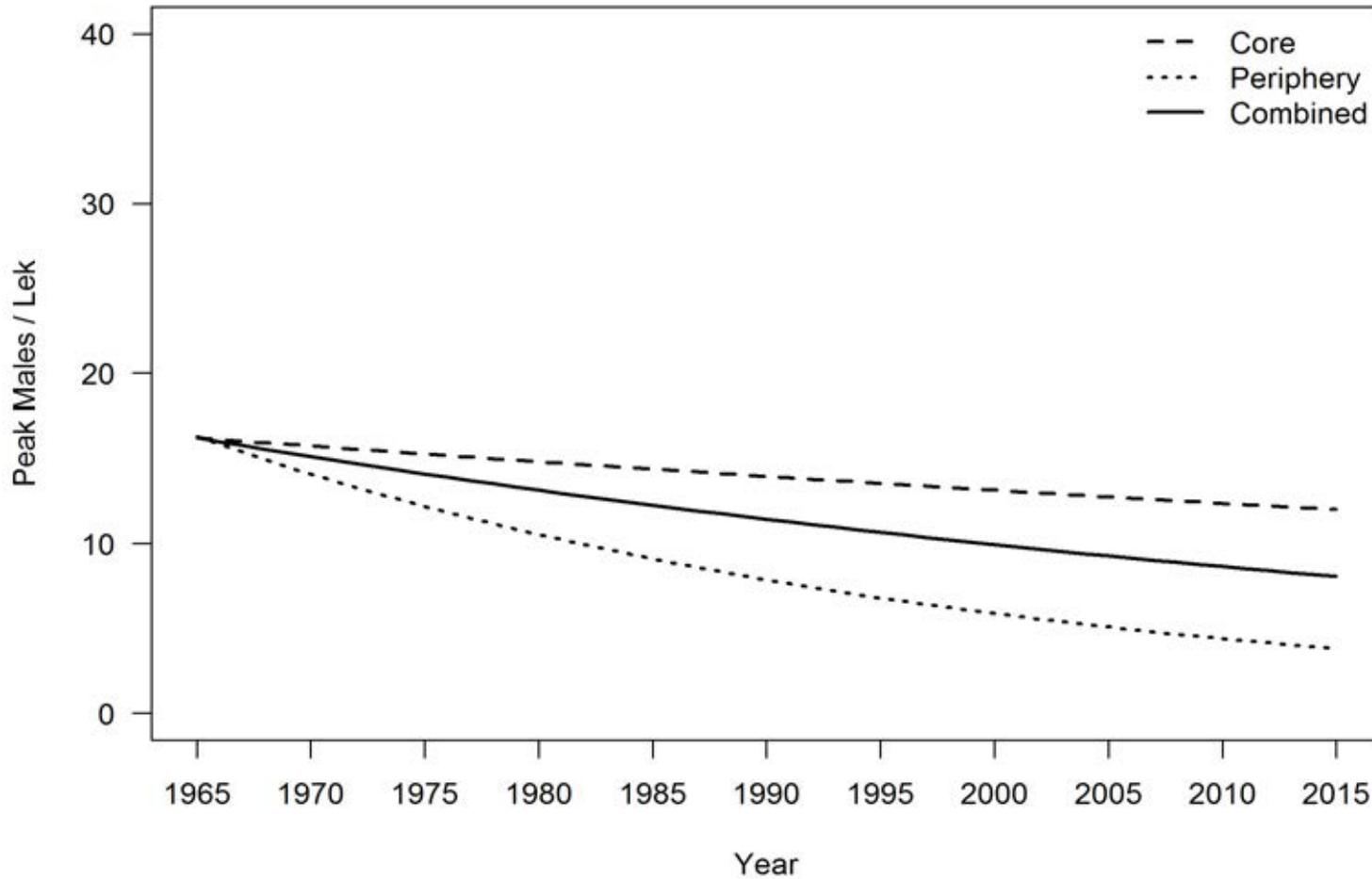
# Results

## Management Zone 6: Columbian Basin



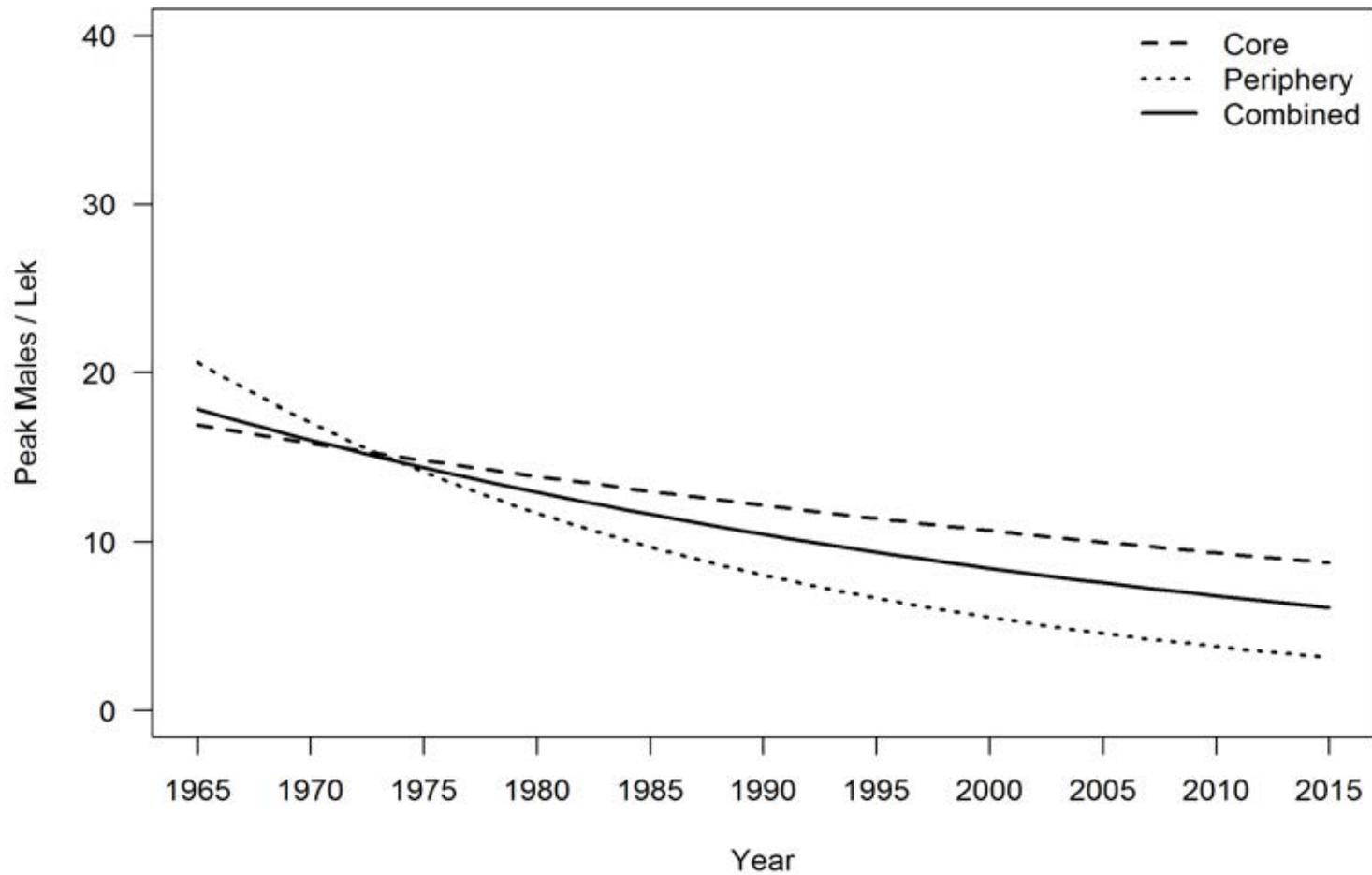
# Results

Management Zone 2 & 7: Wyoming Basin & Colorado Plateau



# Results

## Range-wide

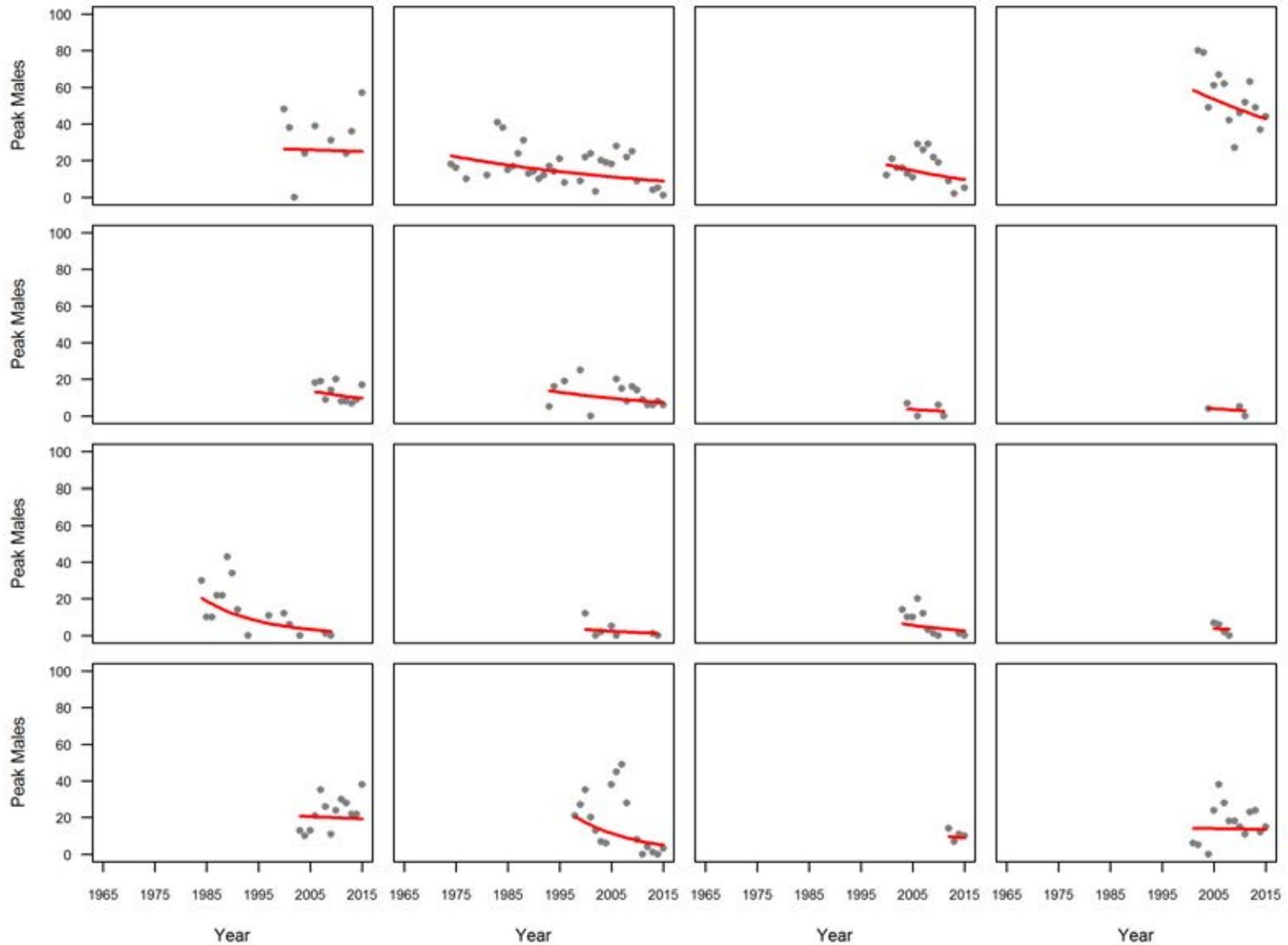


# Results

- Average of a 1.3% decline per year (core area) across the 7 management zones.
- Ignore zones 1 and 6 ... <0.9% decline per year

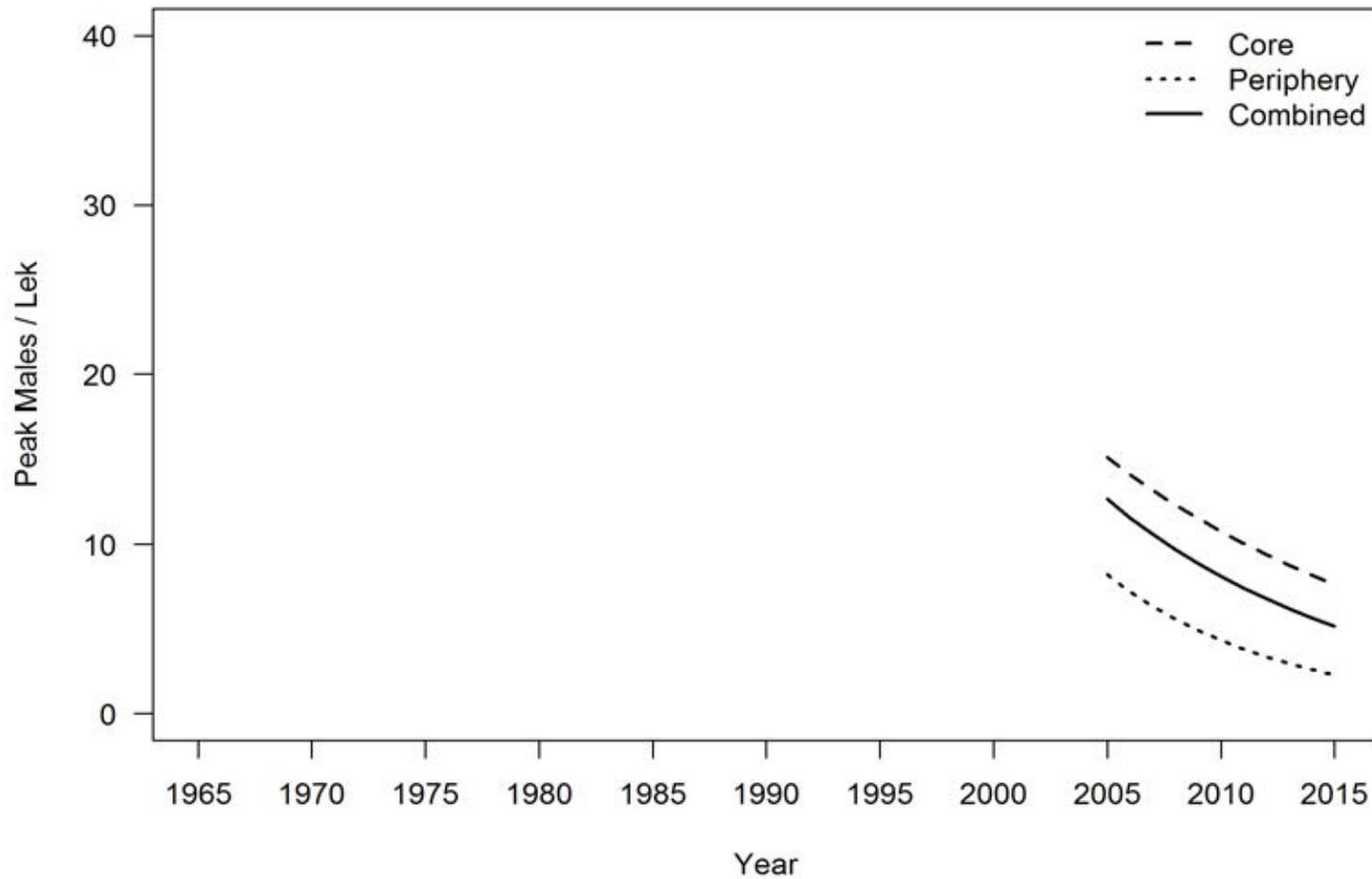


# Results



# Results

## Range-wide



# Analysis Limitations

- Varying survey effort within management zones / states and between years.
  - More consistency 2007 – present.
- Somewhat opportunistic sampling, especially in the early years.
- Early years focused more on larger leks?
- Handling of zeros

14, 5, 9, 11, 4, 0, 0, 0, 0, 0, 0, 0, 0, ...

OR

14, 5, 9, 11, 4, 0, 0, 0, 0, 0, 0, 2, 6, ...

# Analysis Limitations

- Probability of detection.
- Not part of a probability-based sample of leks.
- Rate of change in males on leks may not be the best metric for rate of change on population size.
  - Maybe OK for estimating direction of trends.
  - LPC surveys have seen increases in abundance with decreases in lek size.

# Recommendations

- Use the Bayesian Hierarchical Model described above for retrospective looks.
- Report can be found on the WEST and WAFWA websites.
- Develop a user-friendly analysis tool with a simple dashboard.
  - Requires common storage and filtering of data.

# Future Analyses

- Range-wide population abundance survey during winter/breeding.
- Monitoring efforts and data storage consistent over time and space.
- Develop regional RSFs to identify key landscape characteristics.
- Keep assumptions to a minimum.



[west-inc.com](http://west-inc.com)

Corporate Headquarters

---

415 West 17th Street, Suite 200, Cheyenne, WY 82001

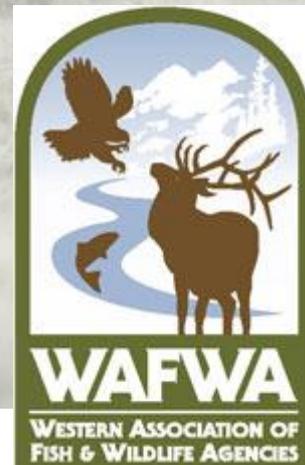
307.634.1756

# IMPROVING POPULATION SIZE AND TREND ESTIMATION IN GREATER SAGE-GROUSE

Paul M. Lukacs

Rebecca McCaffery

J. Josh Nowak



# Objectives:

- Improve sampling design
- Develop an integrated population model
- Design user-friendly software for to implement analyses



# Our approach

- Lek counts
  - Can we re-think the use of lek data to improve abundance estimation?
- Population models
  - Combine multiple sources of information
- Software
  - Capitalize on the power of shared computing and ease of web platforms

# $N$ -Mixture Models

- Male grouse per lek (biological process)
  - $N_{ik} \sim \text{Poisson}(\lambda_{ik})$
- Variation in lek size
  - $-\log(\lambda_{ik}) = \alpha_i + r_i(k - 1) + \varepsilon_i$

# $N$ -Mixture Models

- Lek counts (observed data)
  - $(y_{ijk} | N_{ik}) \sim \text{Bin}(N_{ik}, p_{ijk})$
- Variation in detection probability
  - $\text{logit}(p_{ijk}) = \alpha_{ijk} + \beta_w \times x_{ijkw} + \delta_{ijk}$

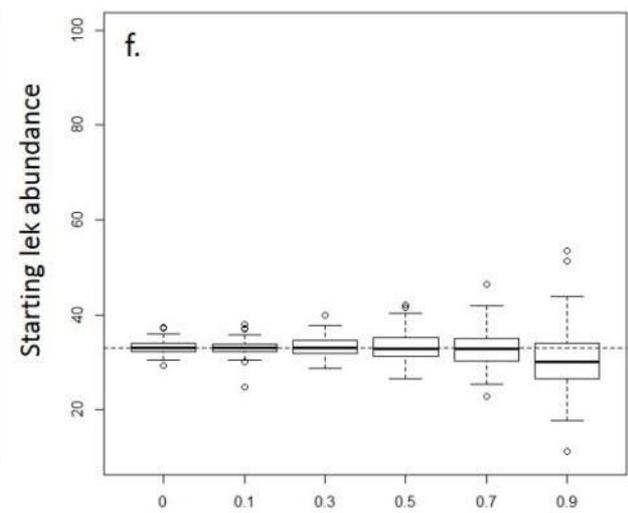
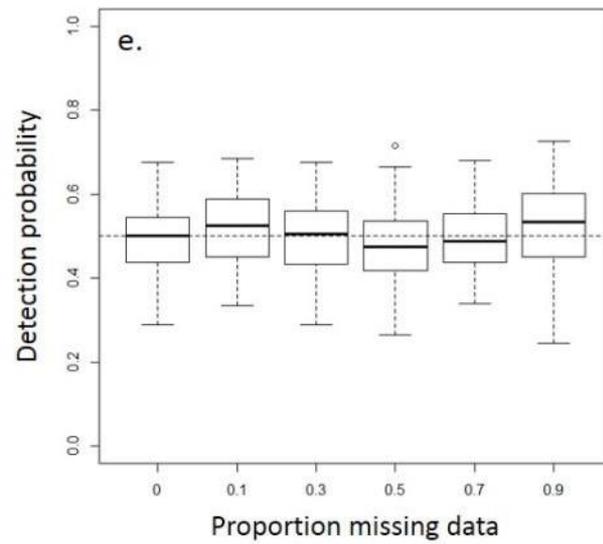
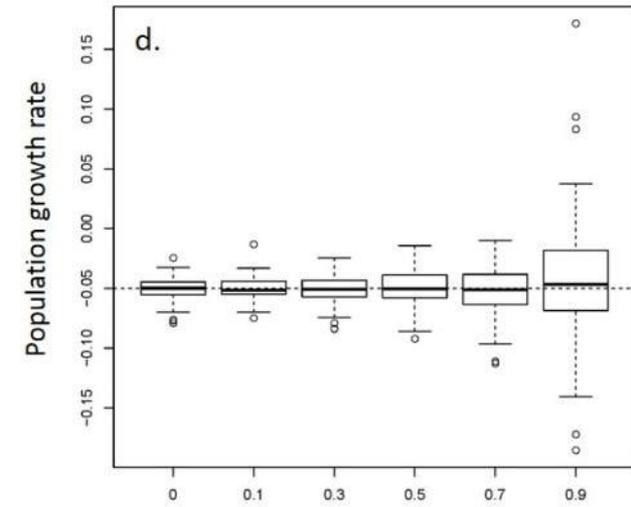
# *N*-Mixture Models

- Key features
  - Allows variation in lek size as a function of environmental features
  - Allows variation in detection as a function of observer or lek-specific characteristics

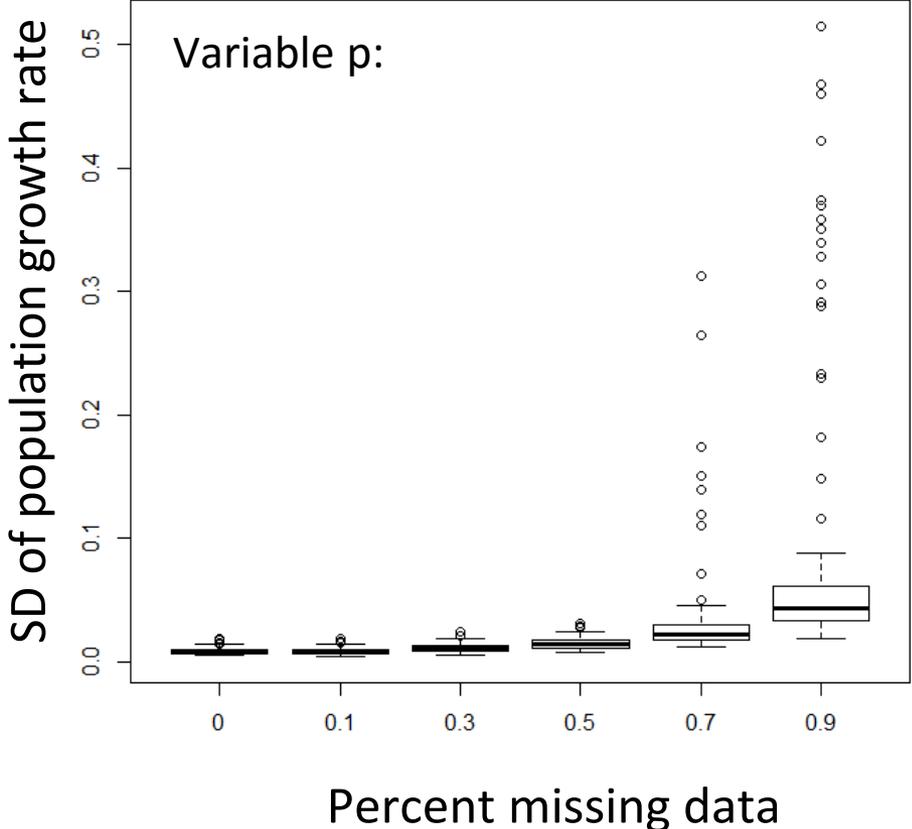
# *N*-Mixture Models

- Do *N*-mixture models adequately estimate abundance from lek count data?
- If they work, how frequently do we have to sample leks?

# Results-simulation



Precision:

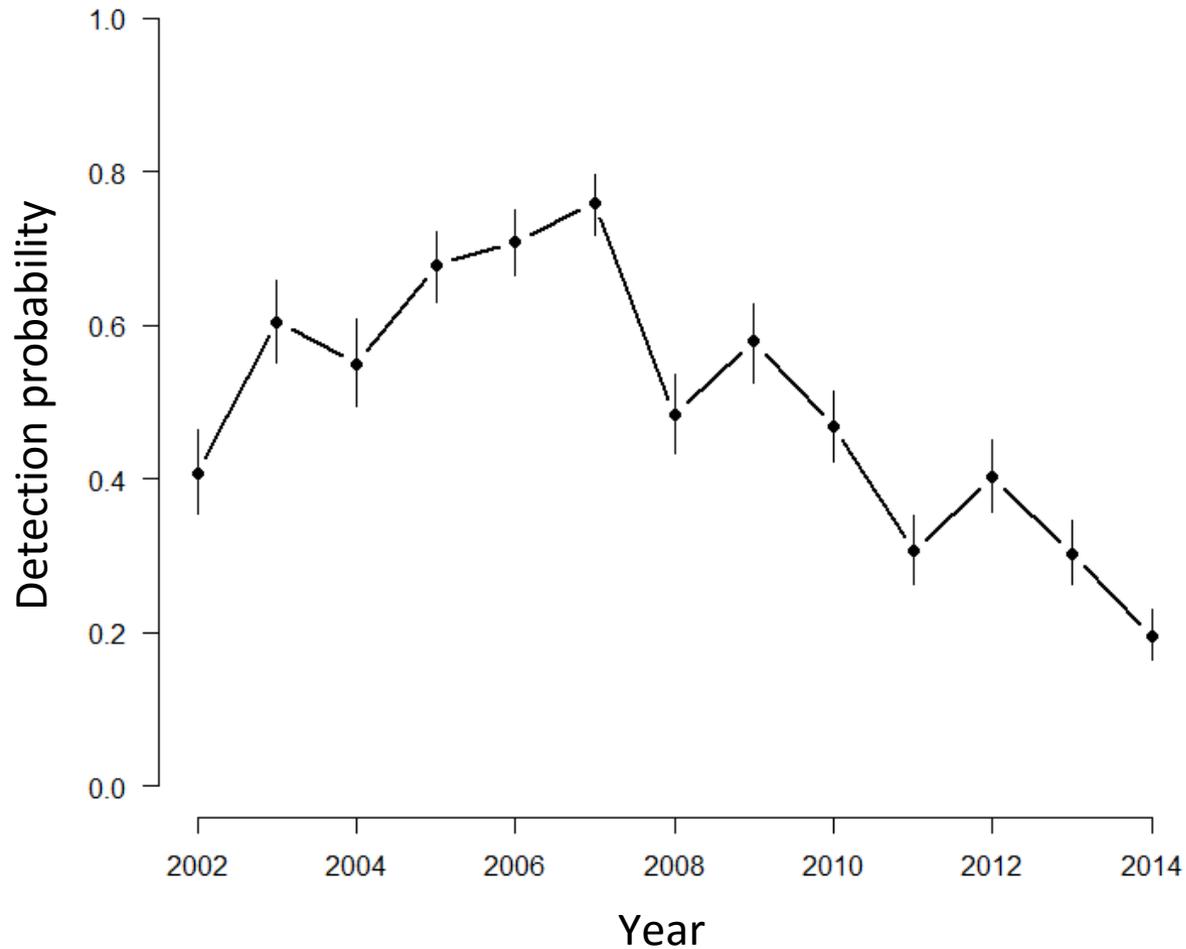


# Case Study - Montana

- Lek counts from 2002-2014
- Multiple counts per lek (at some leks)
- Not all leks surveyed in all years

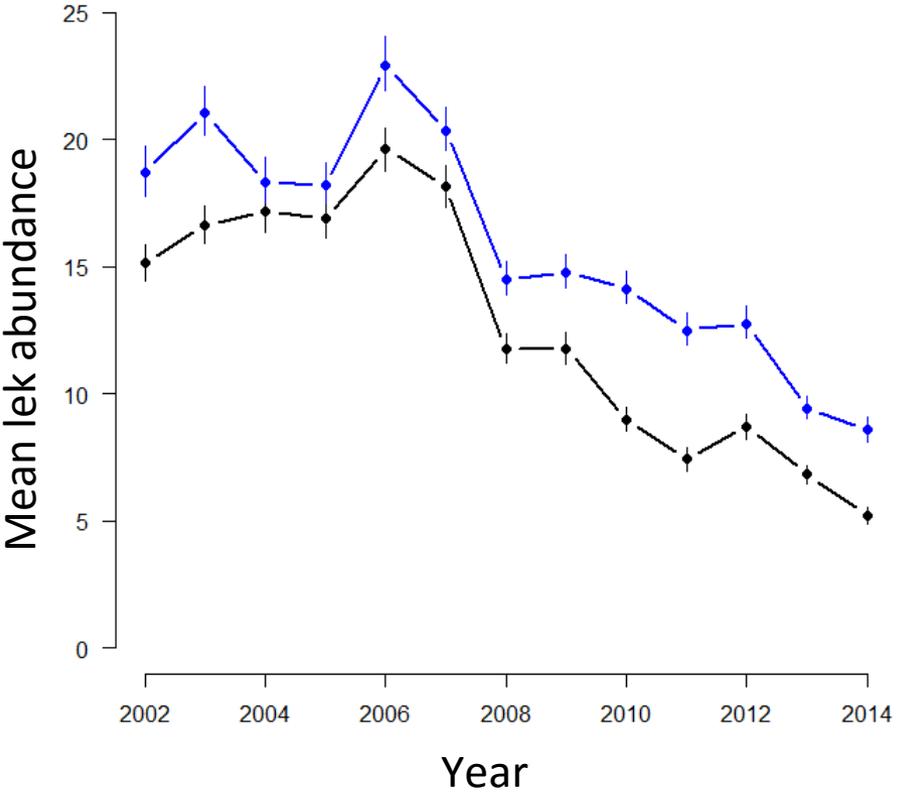
# Variation in detection probability over time

Where population growth rate is explicitly included in the model

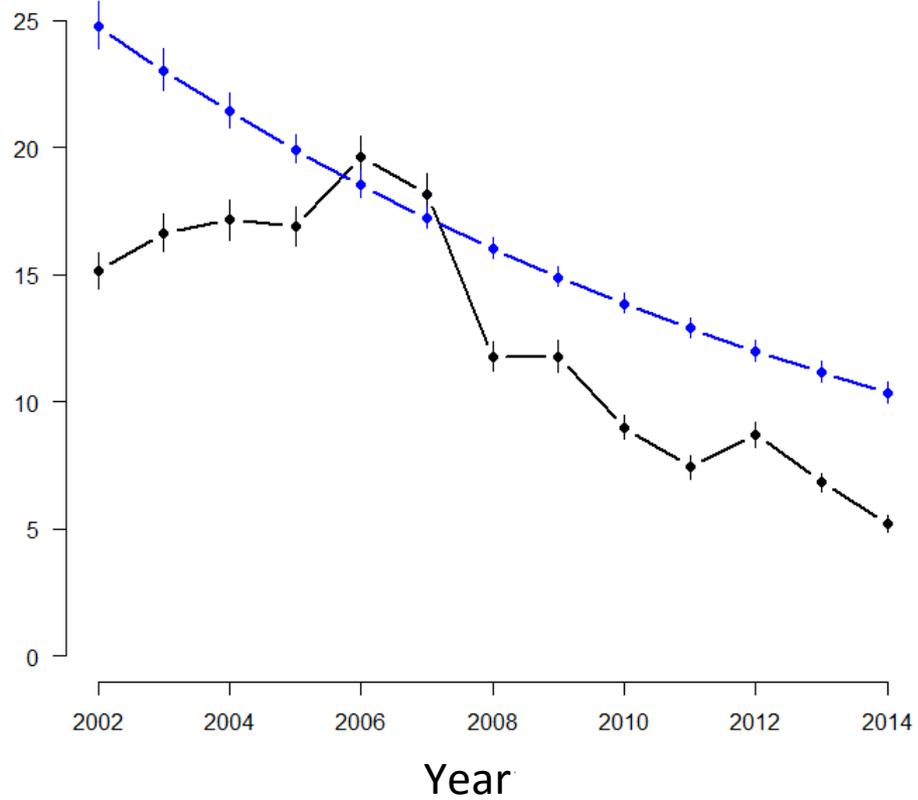


# Case study: State of Montana 2002-2014:

### a. Mean annual lek size



### b. Population trend explicitly included in model



— *N*-mixture model estimate

— High male count

# $N$ -mixture model

- Summary
  - Useful for improving estimation from lek counts
  - Includes the detection probability
  - Guides sampling design

# Integrated Population model

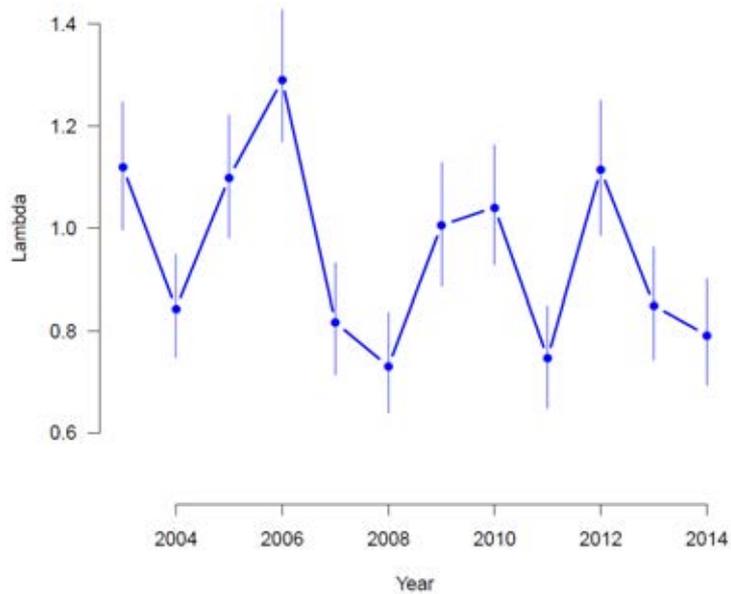
- Combine multiple sources of information
  - Lek counts
  - Survival
  - Recruitment
  - Sex ratio

# IPM insights

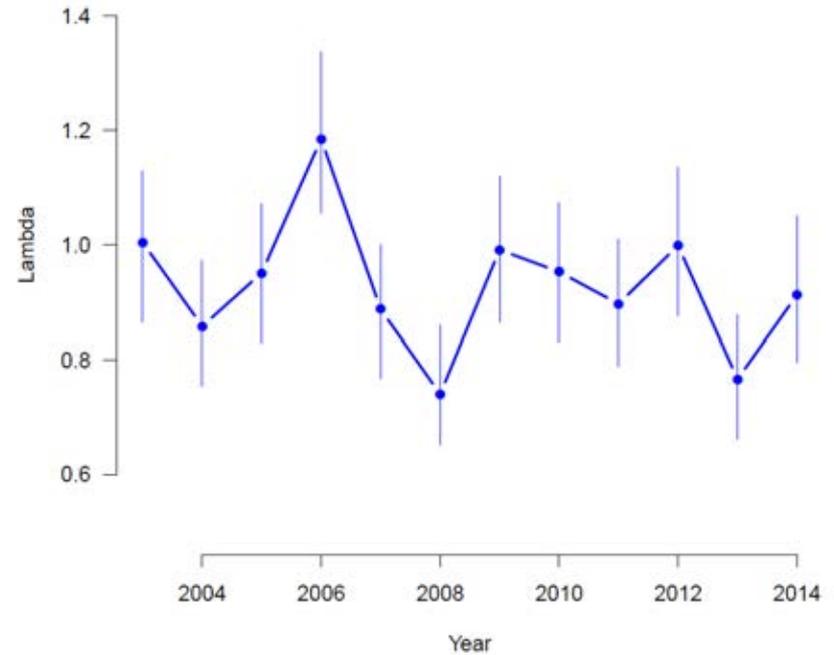
- Lek counts may overstate variation in abundance
- Absence of sex ratio estimates is limiting inference

# Population Growth Rate ( $\lambda$ )

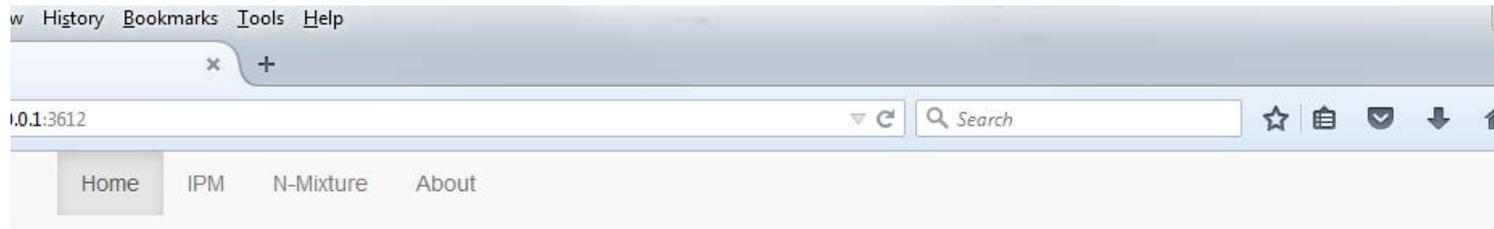
Raw Lek Counts



*N*-mixture Estimates



# Software



## Welcome to PopR!

Welcome to PopR, the software that helps you explore data, run analyses and generate reports. This version of the software was created for the analysis of Greater Sage-grouse population data at the University of Montana (2015). Use the navigation bar at the top of this page to move among the various analyses.

---

PopR Version 1.0  
Maintained by Josh Nowak & Paul Lukacs  
Wildlife Biology Program  
University of Montana

# PopR

Search

Home IPM N-Mixture About

## Sage Grouse IPM

Database: GRSGdatabase.RData

State / Years 2002:2017 / Constant Juvenile Survival / Constant Recruitment / Constant Adult Survival /

Setup Raw Data Plots Table Report

### Define Species & IPM Database

Species: Sage Grouse Database: GRSGdatabase.RData

### Define Space & Time

Analysis State: Montana Analysis Years: 1980 to 2020 (2002 to 2017 selected)

### Demographic Variation

Recruitment: Constant Juvenile Survival: Constant Adult Survival: Constant

### MCMC Controls

Burnin Length: 15,000 MCMC Iterations: 25,000 Thinning Rate: 2

# PopR

Home IPM **N-Mixture** About

## Sage Grouse N-Mixture - In beta!

Setup Raw Data Plots Table Report

### Define Species & Lek Count Database

Species

Sage Grouse

Database

lekCountData.RData

### Define Space & Time

Analysis State

Montana

Analysis Years



### MCMC Controls

Burnin Length



MCMC Iterations



Thinning Rate



Fit Model

# PopR

## Sage Grouse IPM

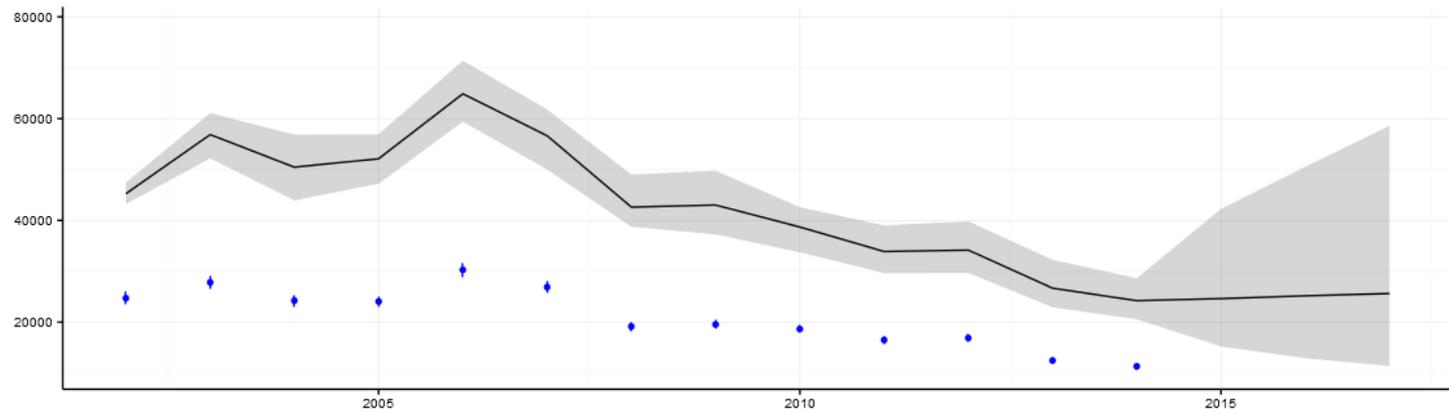
Database: GRSGdatabase.RData

State / Years 2002:2017 / Time Varying Juvenile Survival / Time Varying Recruitment / Time Varying Adult Survival /

Model run 1 successful!

[Setup](#) [Raw Data](#) [Plots](#) [Table](#) [Report](#)

### Population Size



Show field data

Add CI

# IPM

- Summary
  - Model provides framework to consider data collection
  - Guides synthesis of multiple sources of data
  - PopR provides a workflow to simplify the modelling process

# Summary

- Sampling Design
  - Better to survey more leks less frequently
  - Visit leks you do survey more than once per year and record the data in a database
- Population Models
  - Reduce sampling variation in population trajectory
  - Demonstrate need for sex ratio estimates
- PopR
  - Easy to use, web-based software

# Questions?

