



Mark Twain National Forest

Ecological Forecasting

Using NASA Earth Observations to Classify Ground
Cover Types in the Mark Twain National Forest

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Road Map



- ▶ Project Partners
- ▶ Mark Twain National Forest
 - ▶ History
 - ▶ Current restoration efforts
 - ▶ Community Concerns
 - ▶ Study Period
 - ▶ Study Objectives
 - ▶ Satellites & Sensors
- ▶ Methodology
- ▶ Results & Conclusions
- ▶ Errors & Uncertainties
- ▶ Future Work

Project Partners



▶ **USDA, US Forest Service**
Mark Twain National Forest
(MTNF)

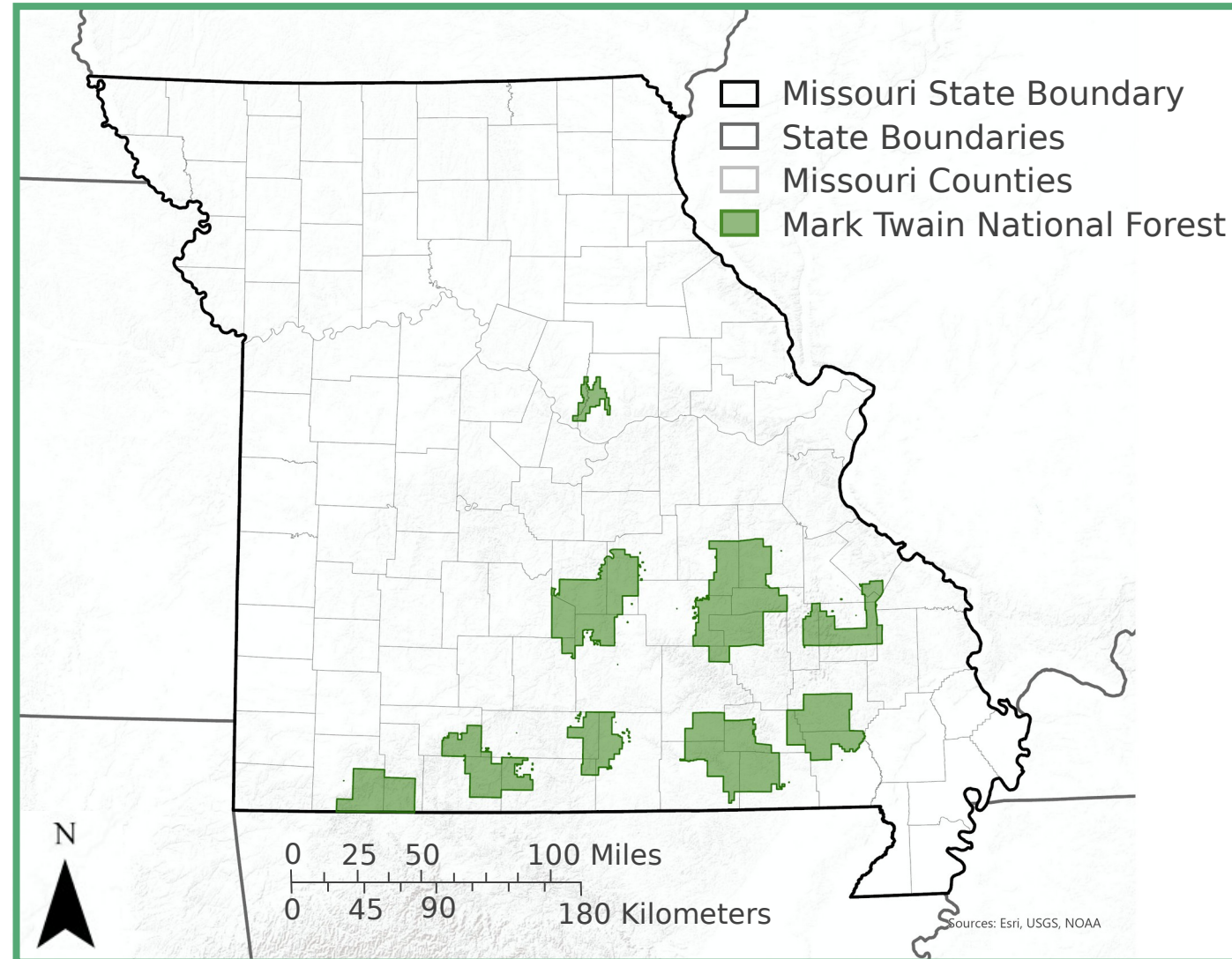
▶ **USDA, US Forest Service**
Geospatial Technology
and Applications Center



Mark Twain National Forest



- ▶ 1.5 million acres
- ▶ Diverse landscapes
 - ▶ Shortleaf pine-oak woodlands
 - ▶ Glades
- ▶ Native species
 - ▶ 750 native animal species
 - ▶ 2000+ native plant species



Mark Twain National Forest - Historical



- ▶ Logging & fire suppression
 - ▶ late 1800s - early 1900s
- ▶ Only 10% of historic pine-oak woodlands remain today

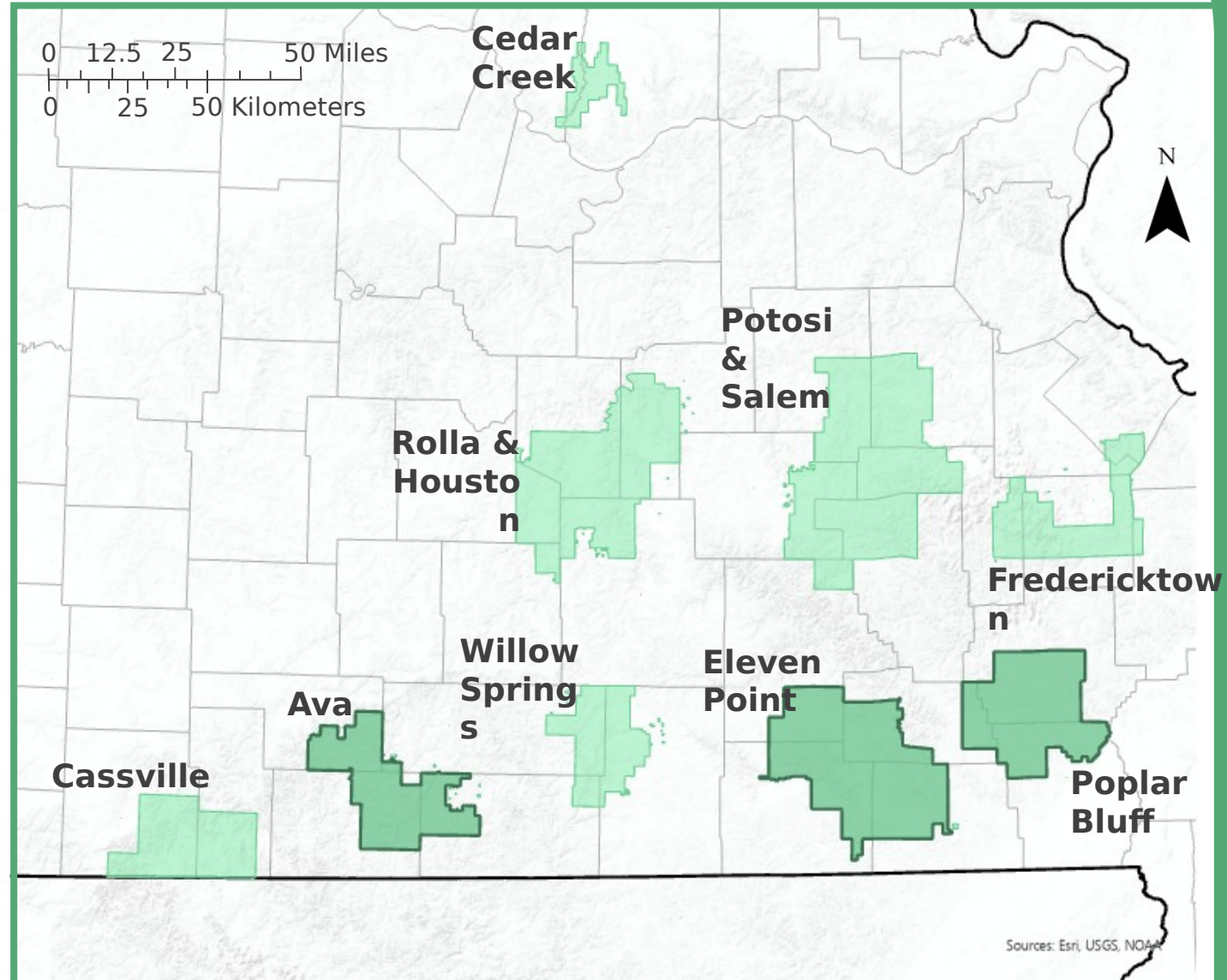


Mark Twain National Forest

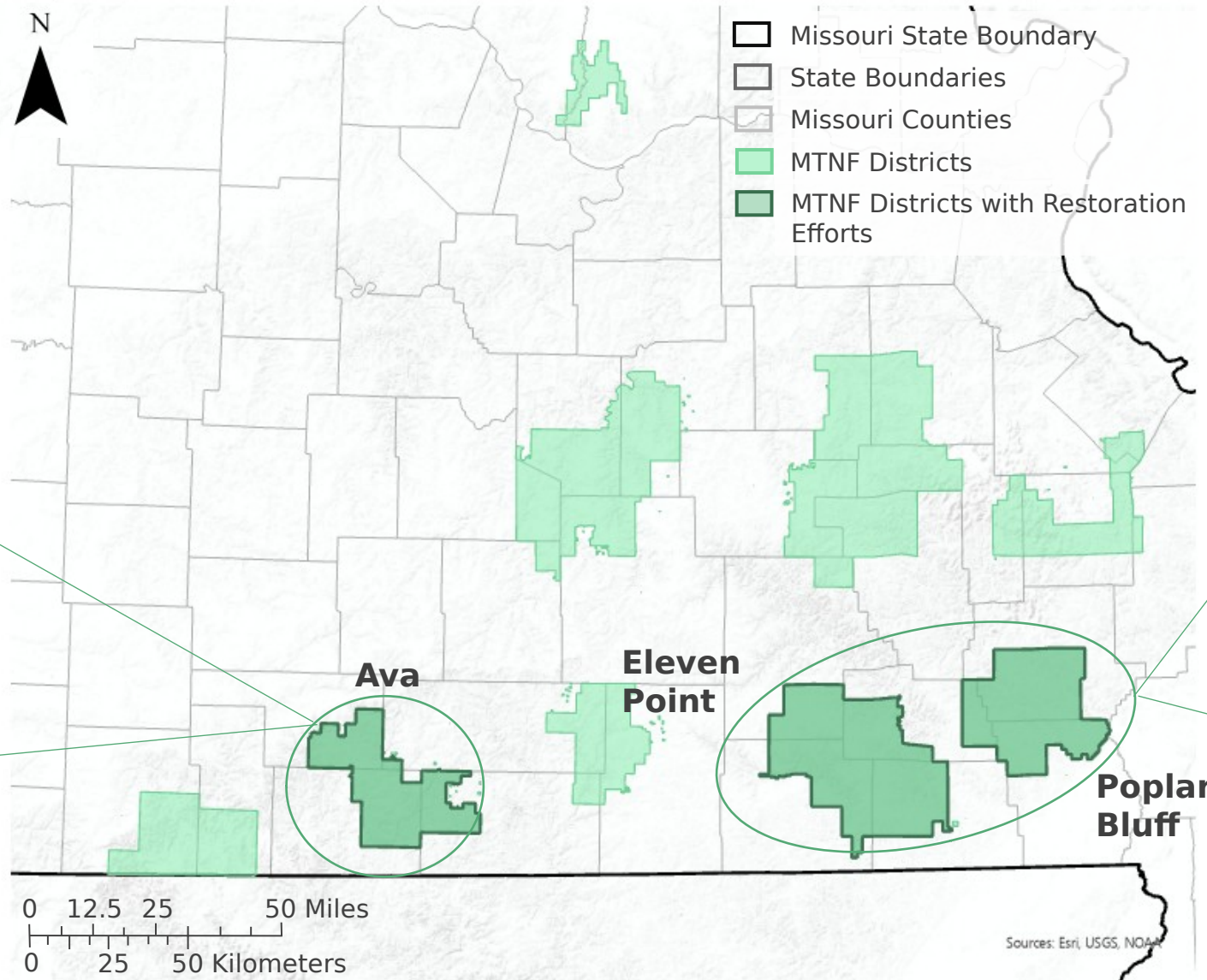


- ▶ 9 areas, 11 Ranger District
- ▶ Eleven Point & Poplar Bluff districts
 - ▶ Collaborative Forest Landscape Restoration Project (CFLRP, 2012)
- ▶ Ava district
 - ▶ Glade restoration

- Missouri State Boundary
- State Boundaries
- Missouri Counties
- MTNF Districts
- MTNF Districts with Restoration



Community Concerns



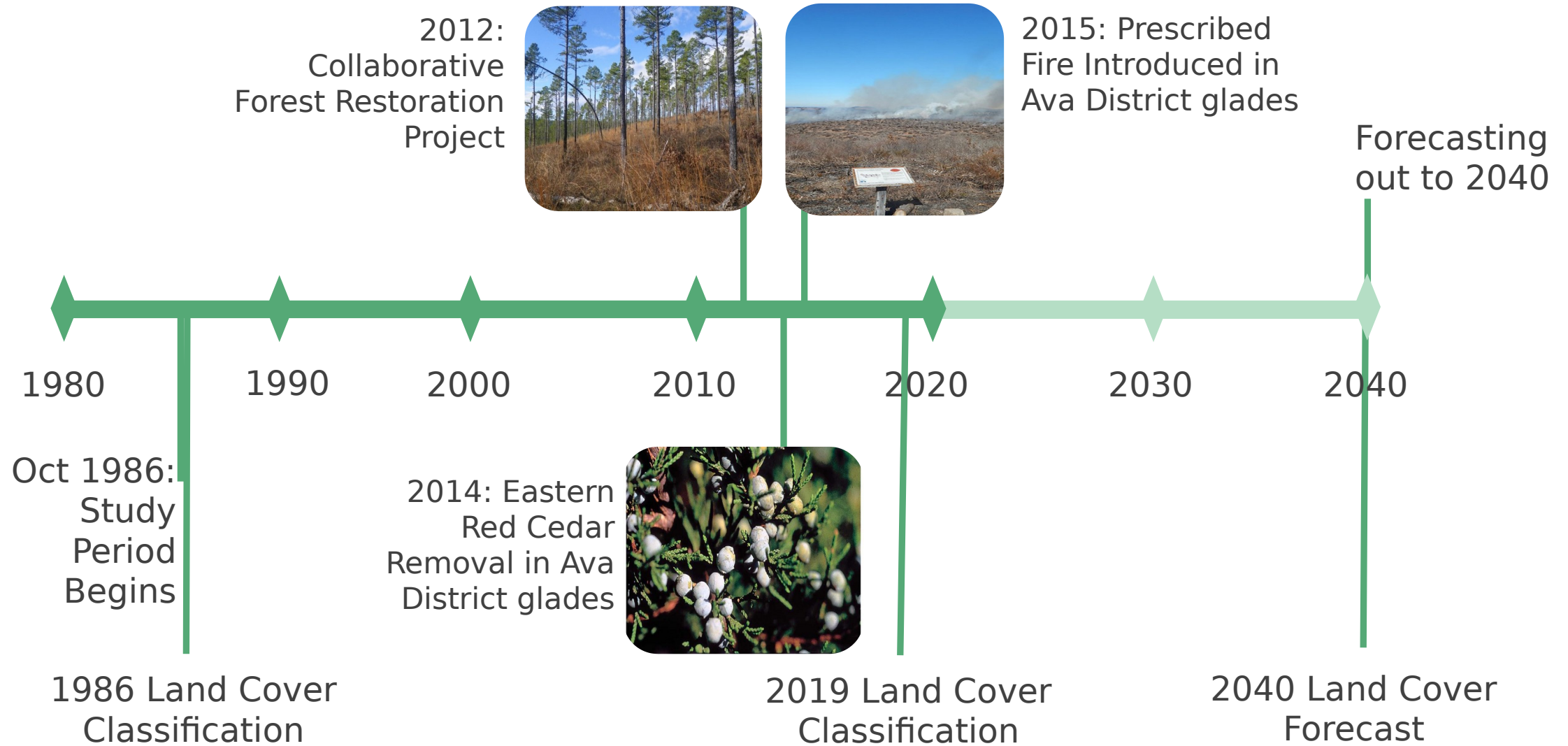
Glade Restoration



Shortleaf Pine-Oak Woodland Restoration



Study Period



Objectives



▶ **Classify**

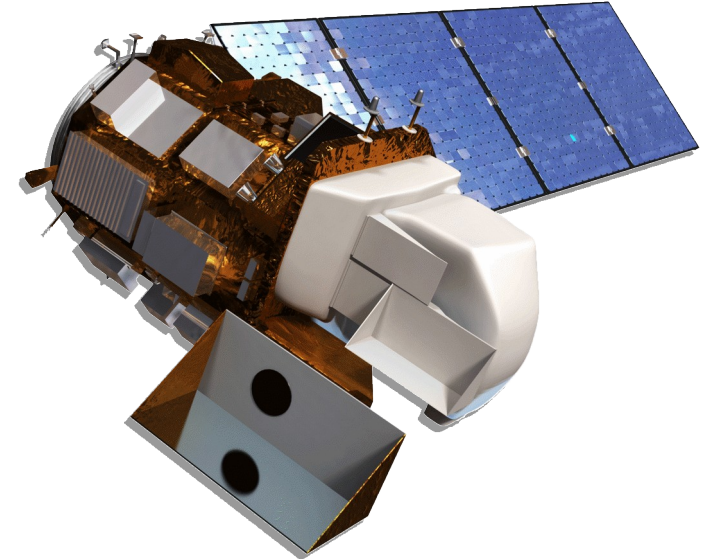
- ▶ Create a land cover type analysis of MTNF that can be used to assist with species-level classifications



▶ **Forecast**

- ▶ Forecast out to the year 2040 to determine changes in land cover type based on current management practices

Satellite and Sensors

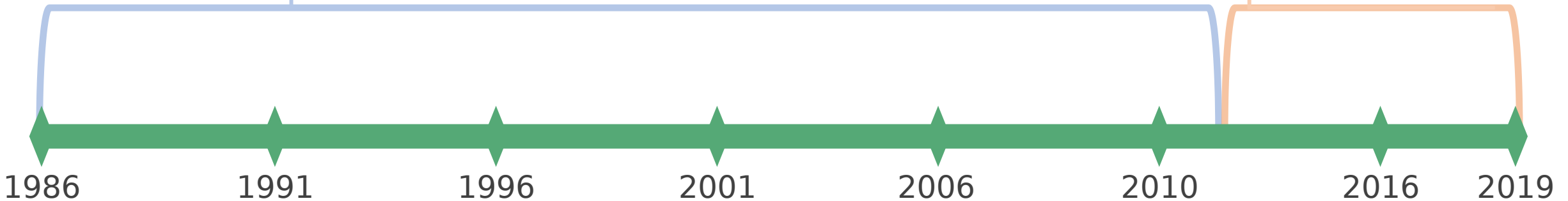


Landsat 5 TM

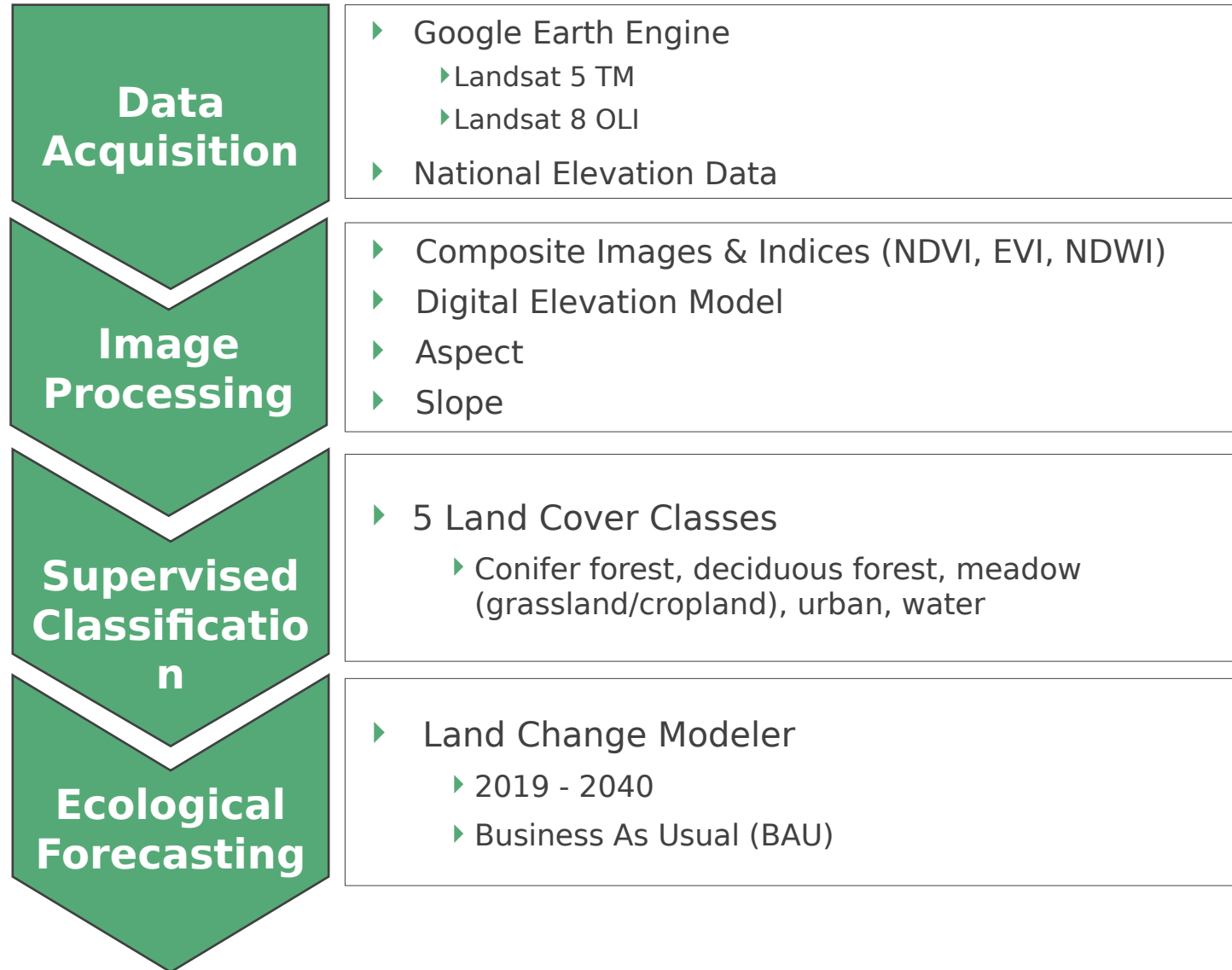
Thematic Mapper

Landsat 8 OLI

Operational Land Imager



Methods



Methodology: Image Processing



National Elevation Data

- ▶ Mosaicked DEM
- ▶ Calculated slope/aspect

Google Earth Engine

- ▶ Filtered Landsat images
- ▶ Applied cloud/snow masks
- ▶ Calculated derivatives
- ▶ Clipped & exported

ArcGIS Pro

- ▶ Mosaicked composite images
- ▶ Resampled to DEM's resolution (10m)
- ▶ Extracted all layers by mask to unify extents and number of columns/rows

Greyscale Digital Elevation Model

False-Color Slope-Aspect Model

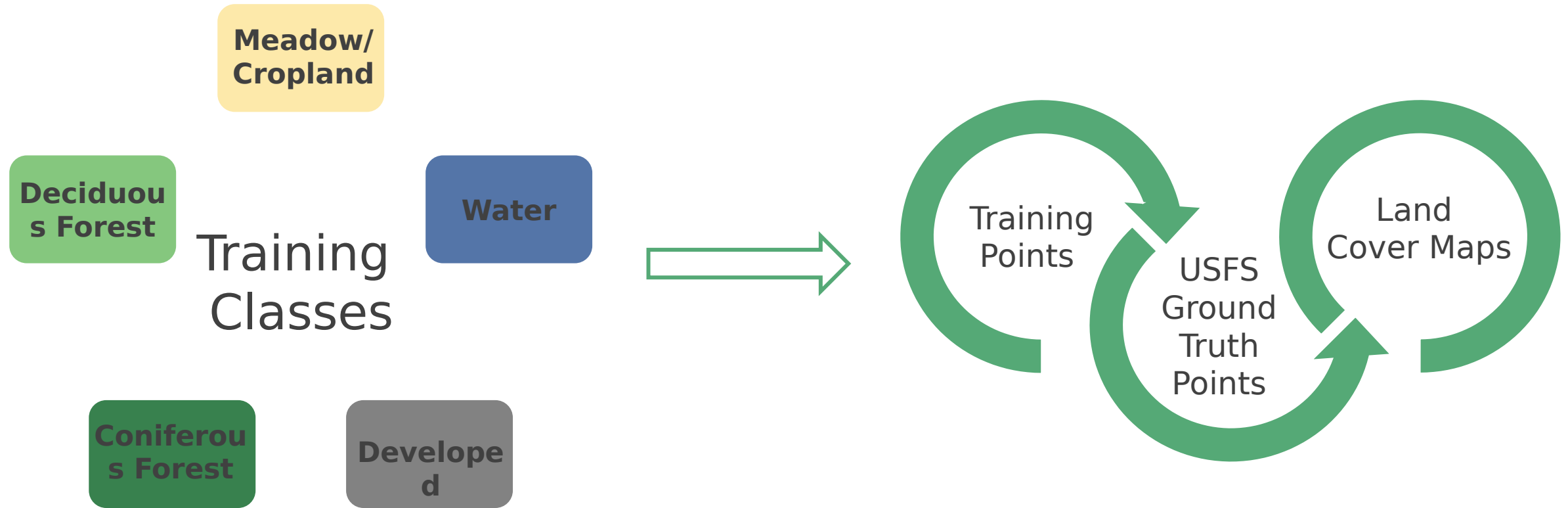
Real-Color Landsat 5 Imagery, Winter 2001

False-Color NDVI, Winter 2001

Methodology: Supervised Classification



► ArcPro Supervised Classification



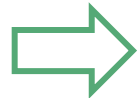
Methodology: Species Modeling



► ArcPro Forest-Based Classification & Regression

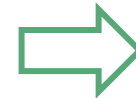
Variable to Predict

- Shortleaf Pine & Eastern Red Cedar Presence Points
 - Training polygons
 - In-situ data



Explanatory Training Rasters

- 2018 NAIP imagery
- Conifer Classification
- Elevation
- Aspect
- Slope
- Slope-Aspect



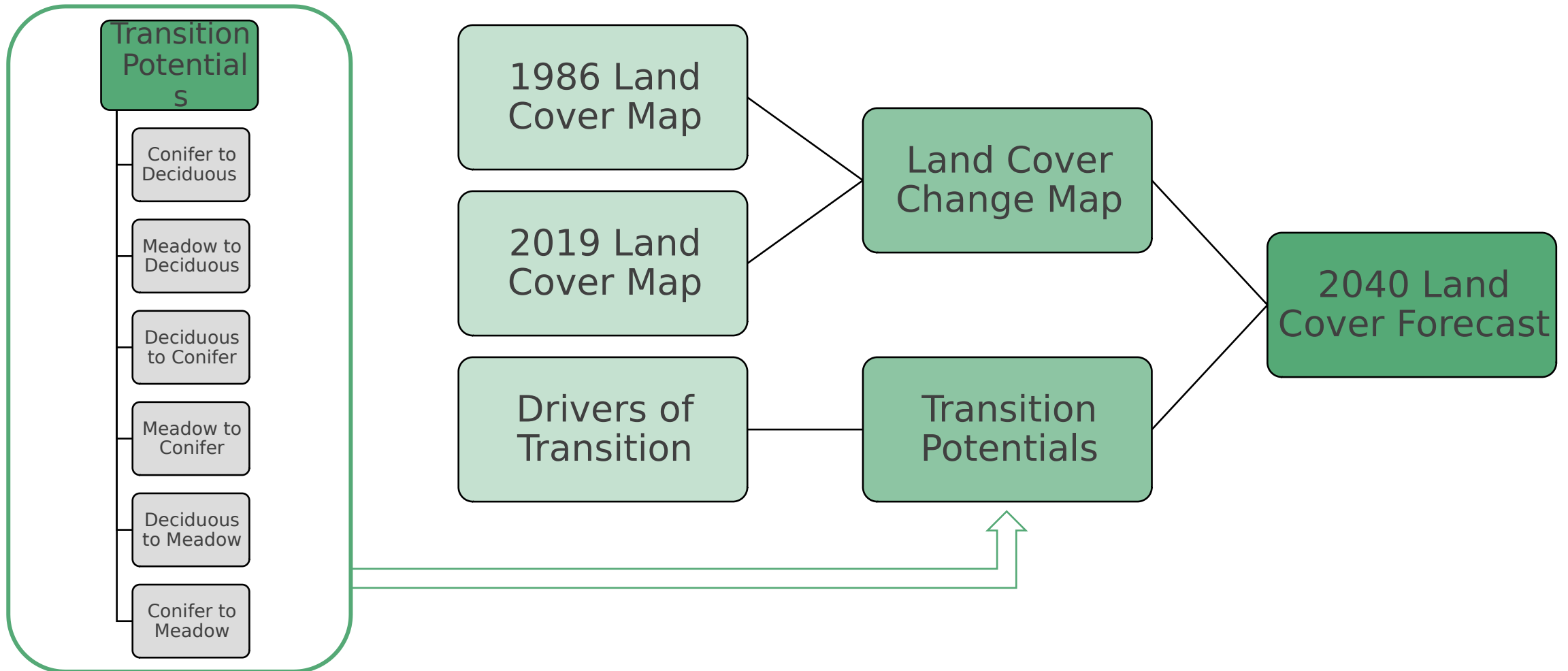
Training/Running Models

- Shortleaf Pine models
- Eastern Red Cedar models

Methodology: Ecological Forecasting



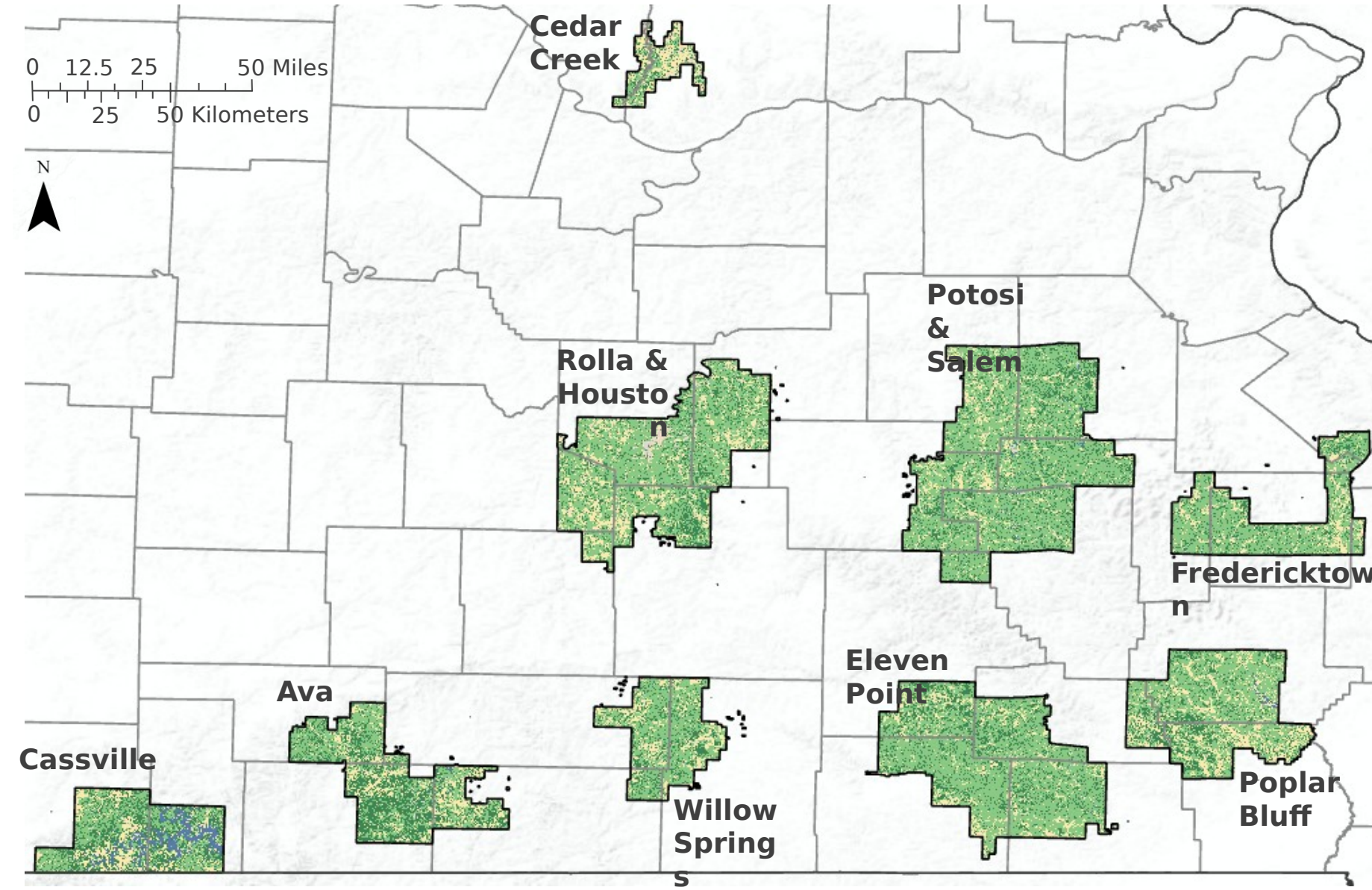
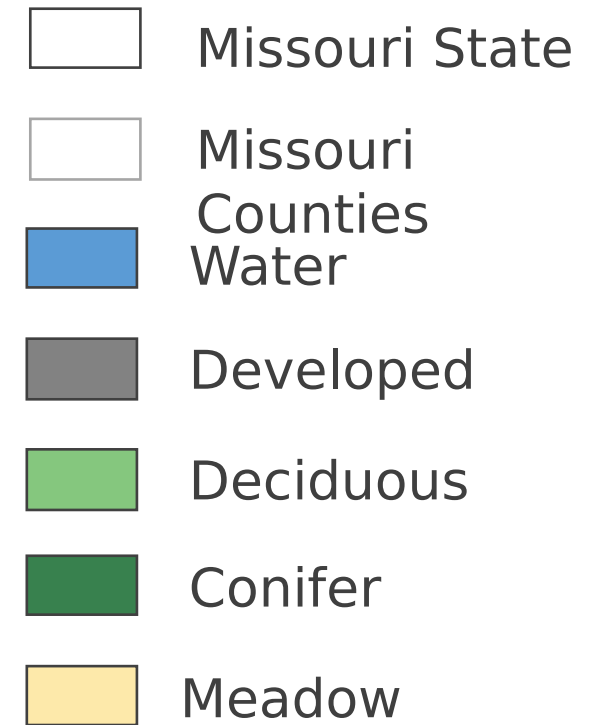
► Idrisi TerrSet Land Change Modeler



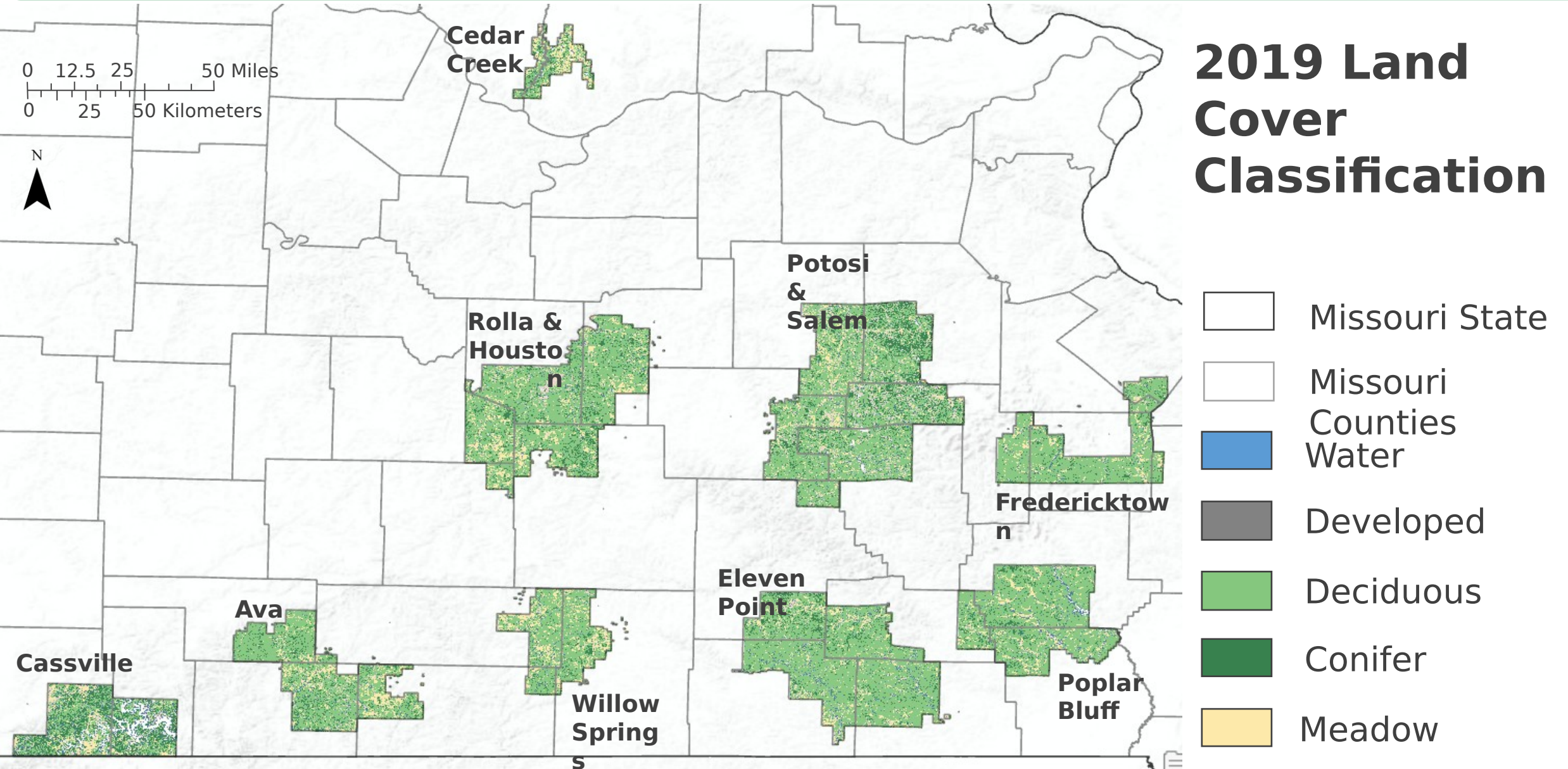
Results and Conclusions



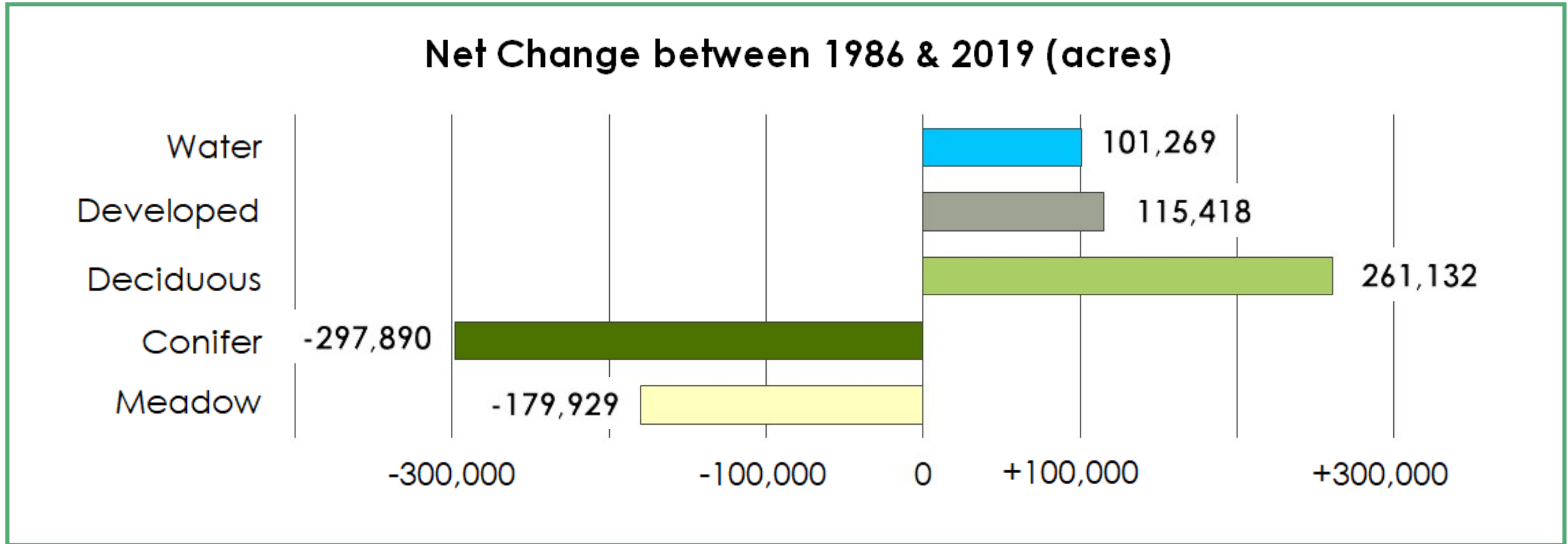
1986 Land Cover Classification



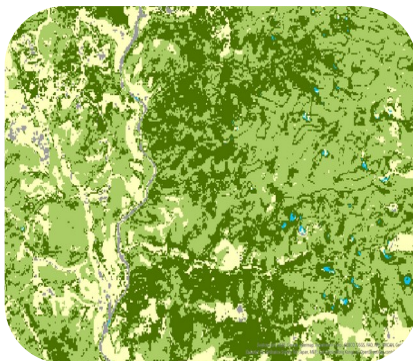
Results and Conclusions



Results and Conclusions



1986 supervised classification



2019 supervised classification

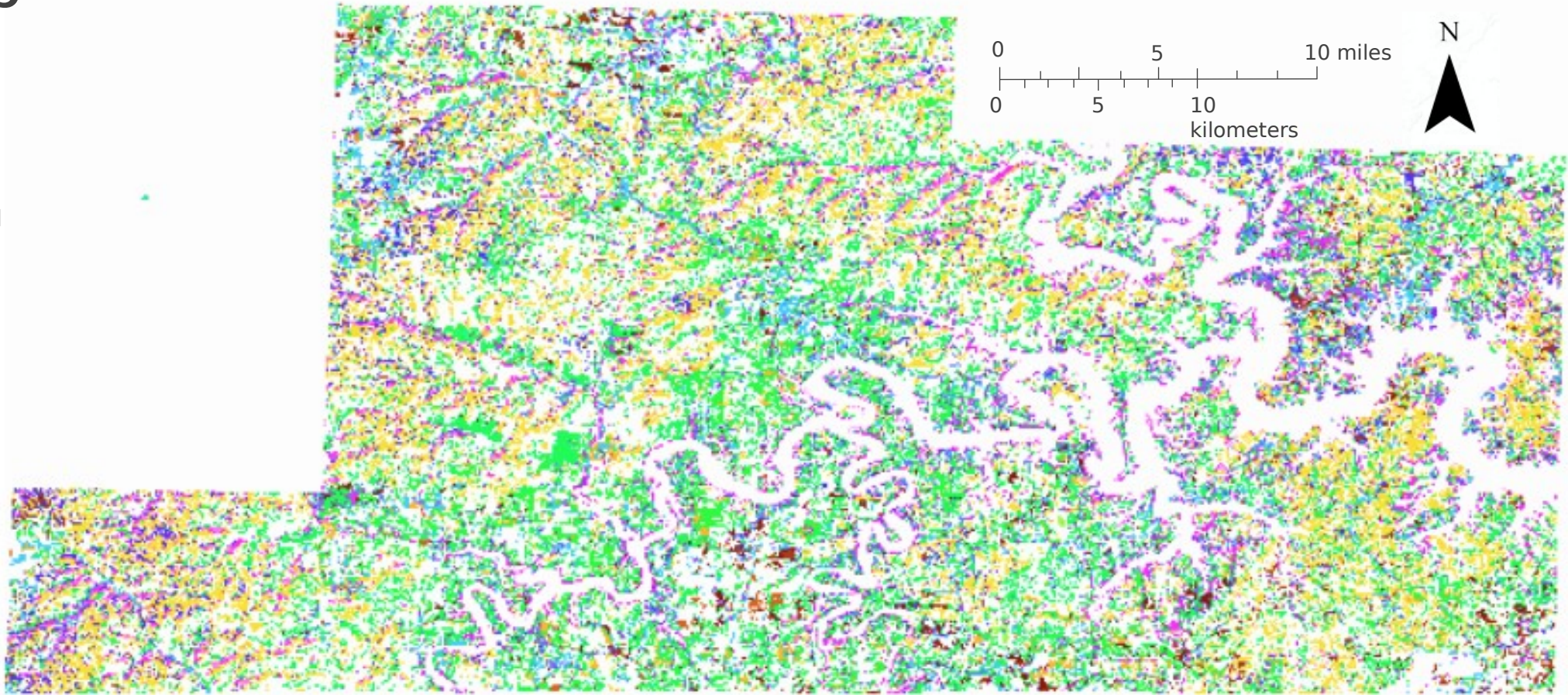


Results and Conclusions



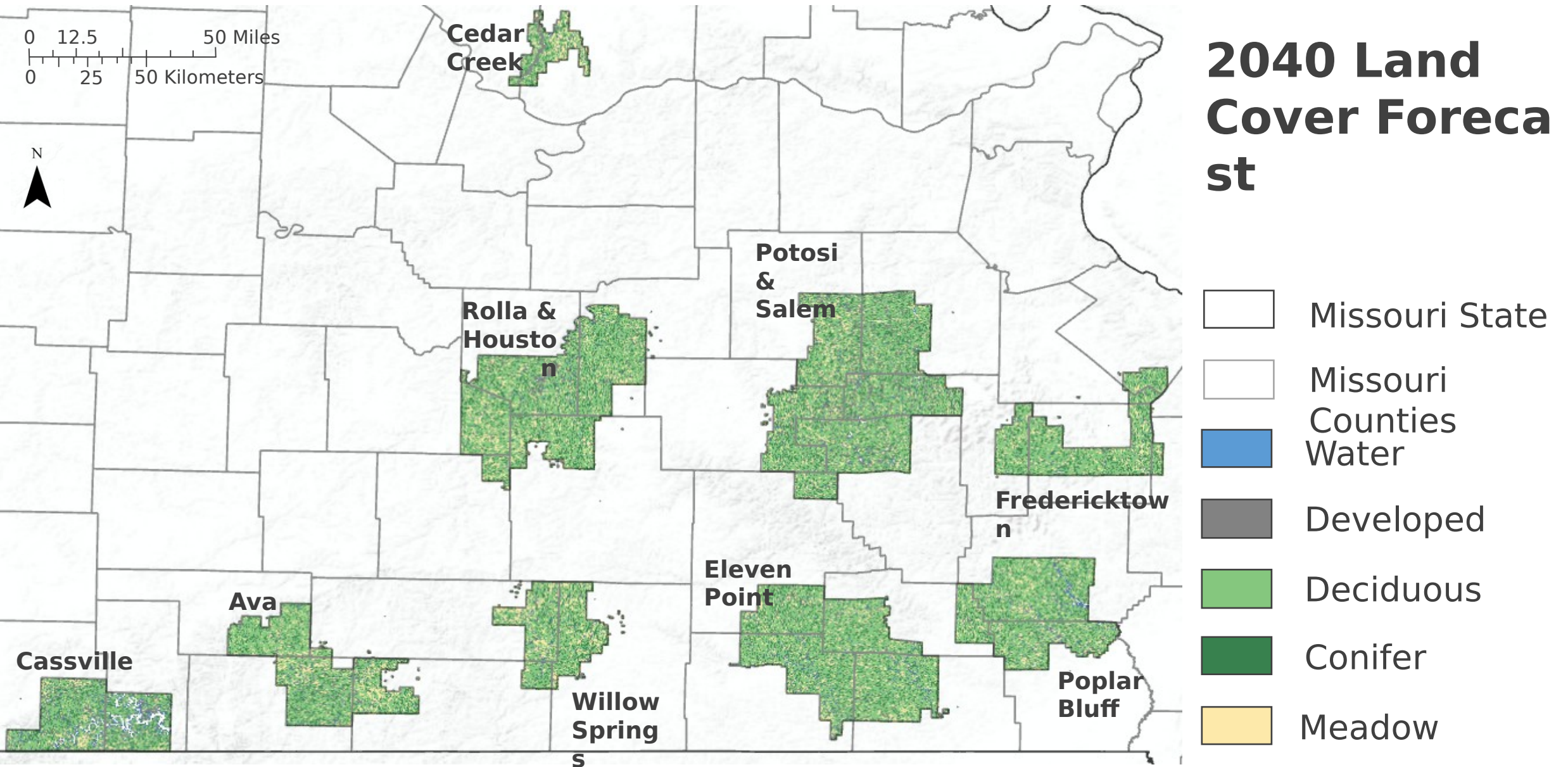
Land Cover Change, 1986-2019

- Developed to Water
- Deciduous to Water
- Conifer to Water
- Meadow to Water
- Water to Developed
- Deciduous to Developed
- Conifer to Developed
- Meadow to Developed
- Water to Deciduous
- Developed to Deciduous
- Conifer to Deciduous
- Meadow to Deciduous
- Water to Conifer
- Developed to Conifer
- Deciduous to Conifer
- Meadow to Conifer
- Water to Meadow
- Developed to Meadow
- Deciduous to Meadow
- Conifer to Meadow

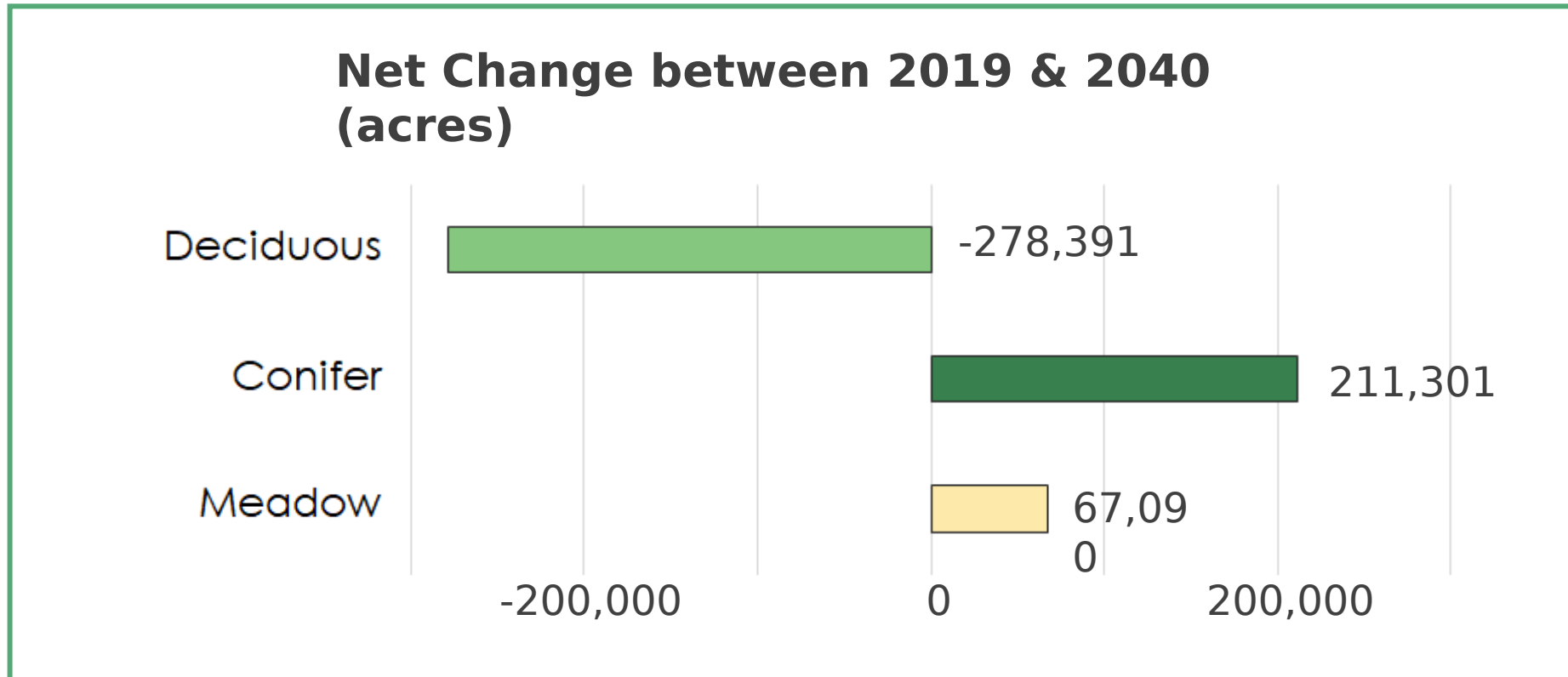


Land Cover Change 1986-2019 in
Cassville Ranger District

Results and Conclusions



Results and Conclusions

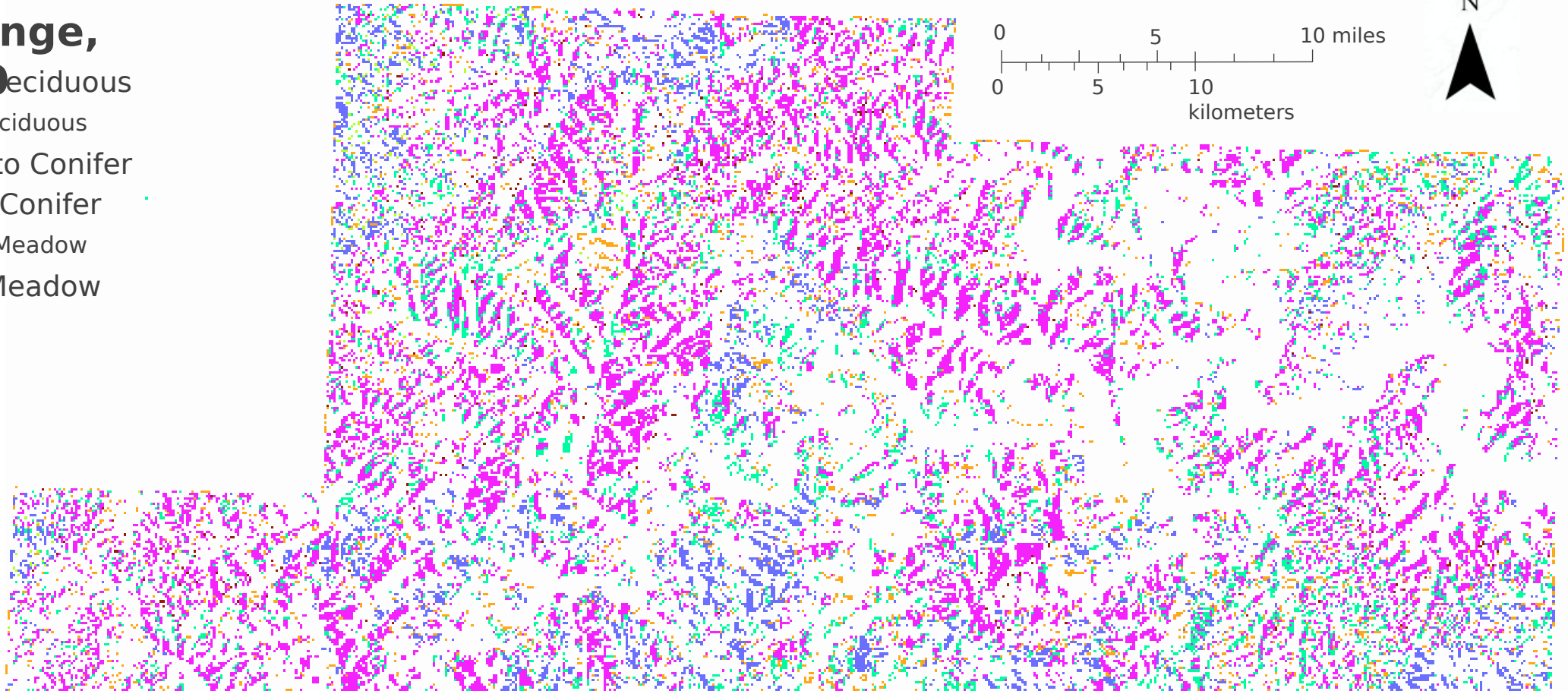


Results and Conclusions



Forecasted Land Cover Change, 2019-2040

- Conifer to Deciduous
- Meadow to Deciduous
- Deciduous to Conifer
- Meadow to Conifer
- Deciduous to Meadow
- Conifer to Meadow



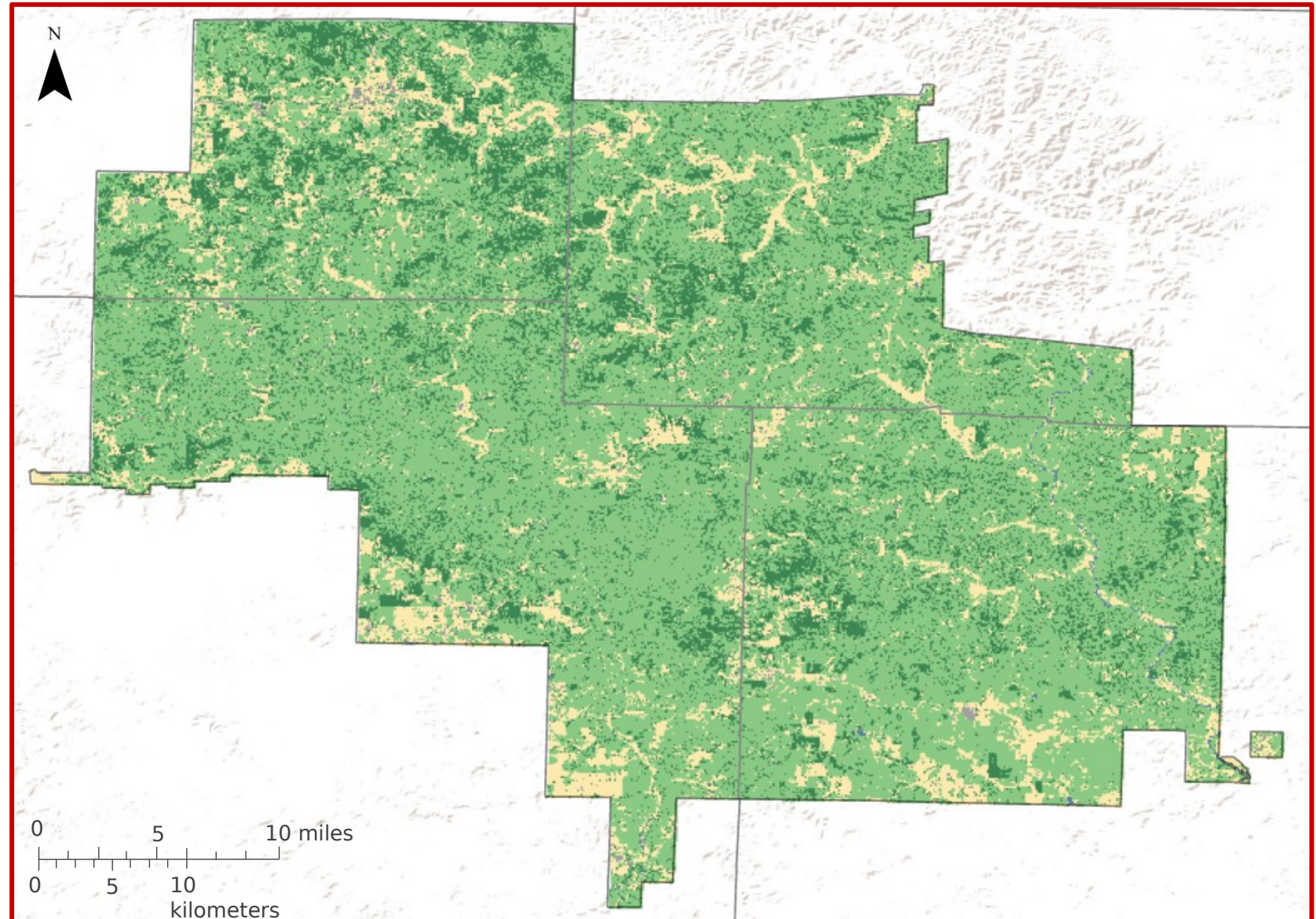
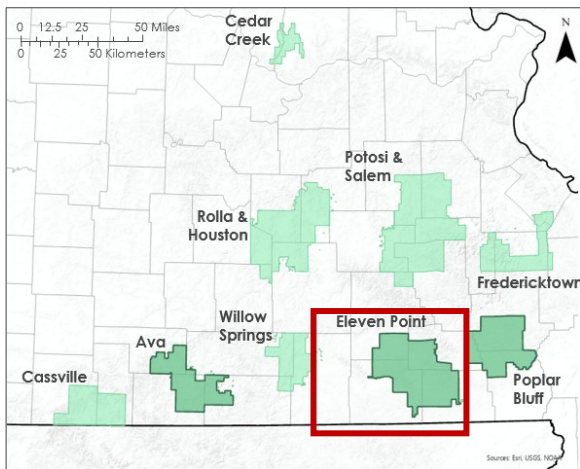
Land Cover Forecast 2019-2040 in
Cassville Ranger District

Results and Conclusions



Eleven Point Ranger District:

1986 Land Cover Classification

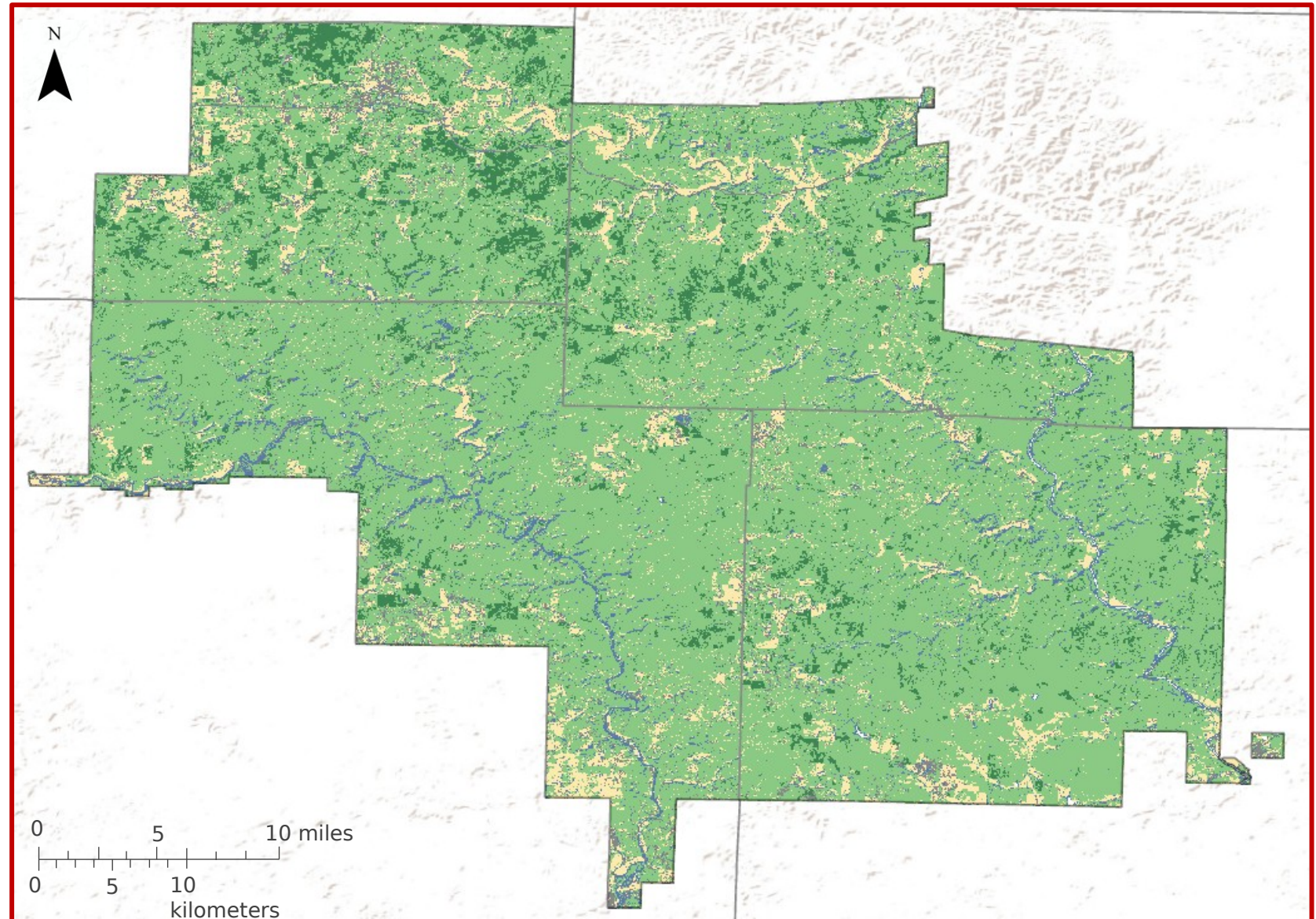
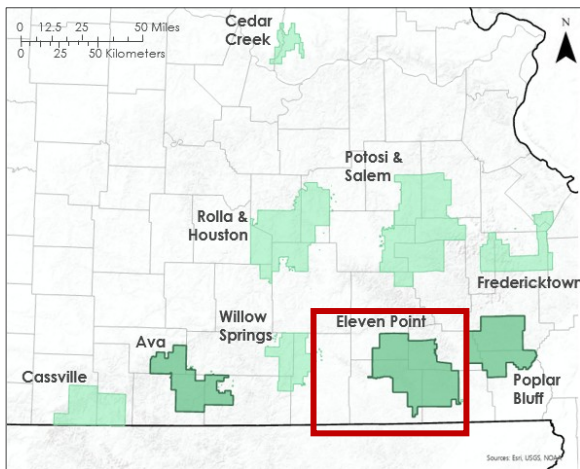


Results and Conclusions



Eleven Point Ranger District:

2019 Land Cover Classification

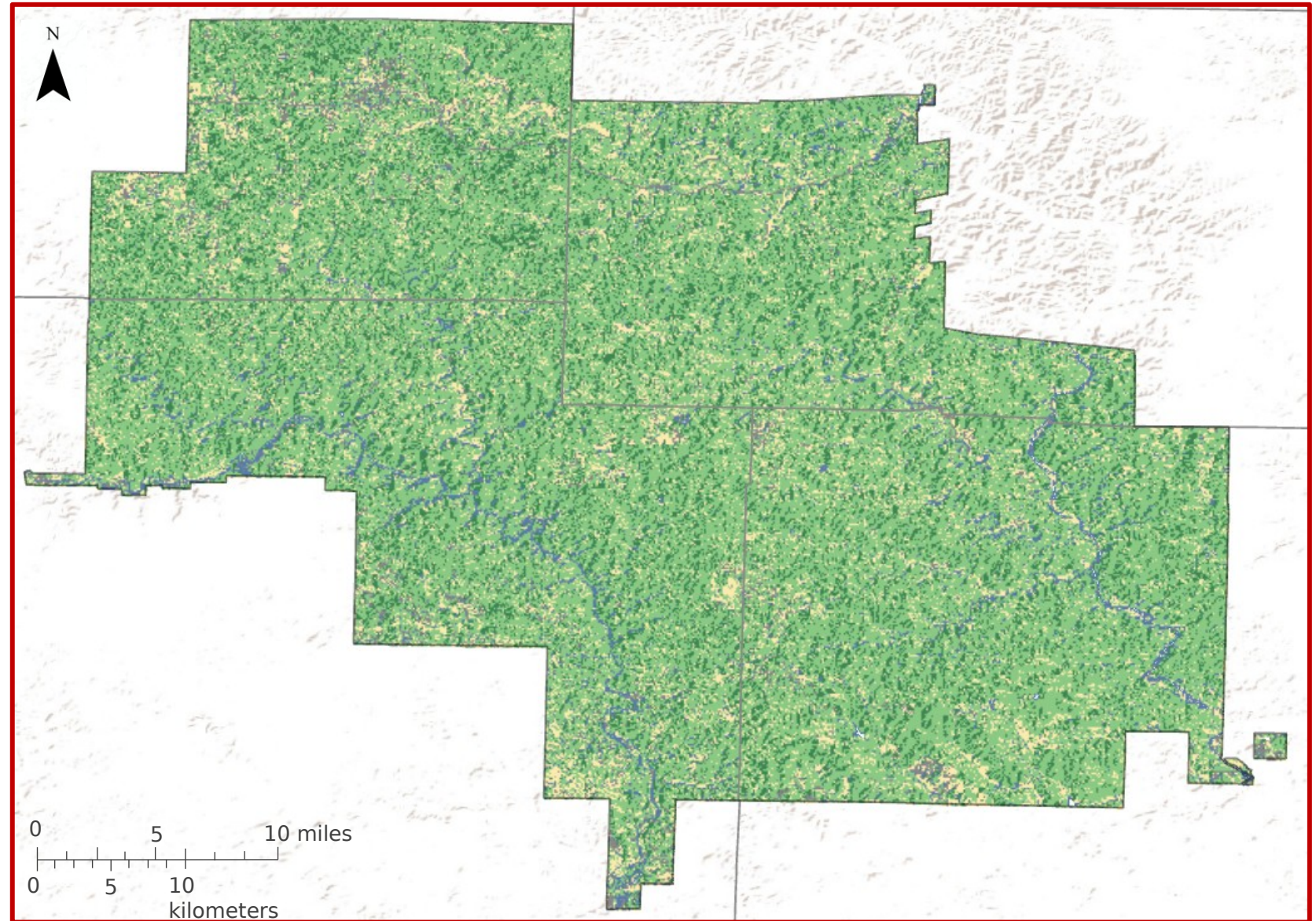
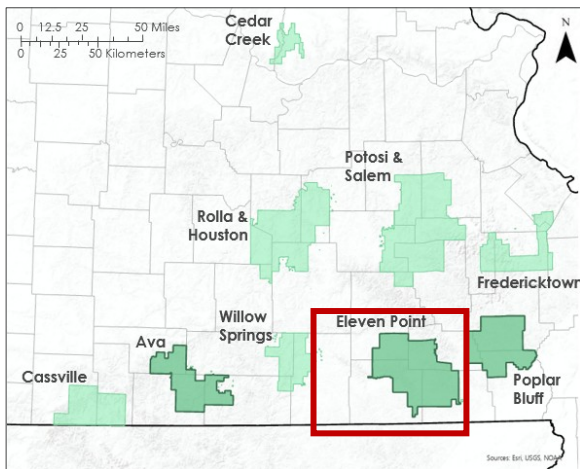


Results and Conclusions



Eleven Point Ranger District:

2040 Land Cover Forecast

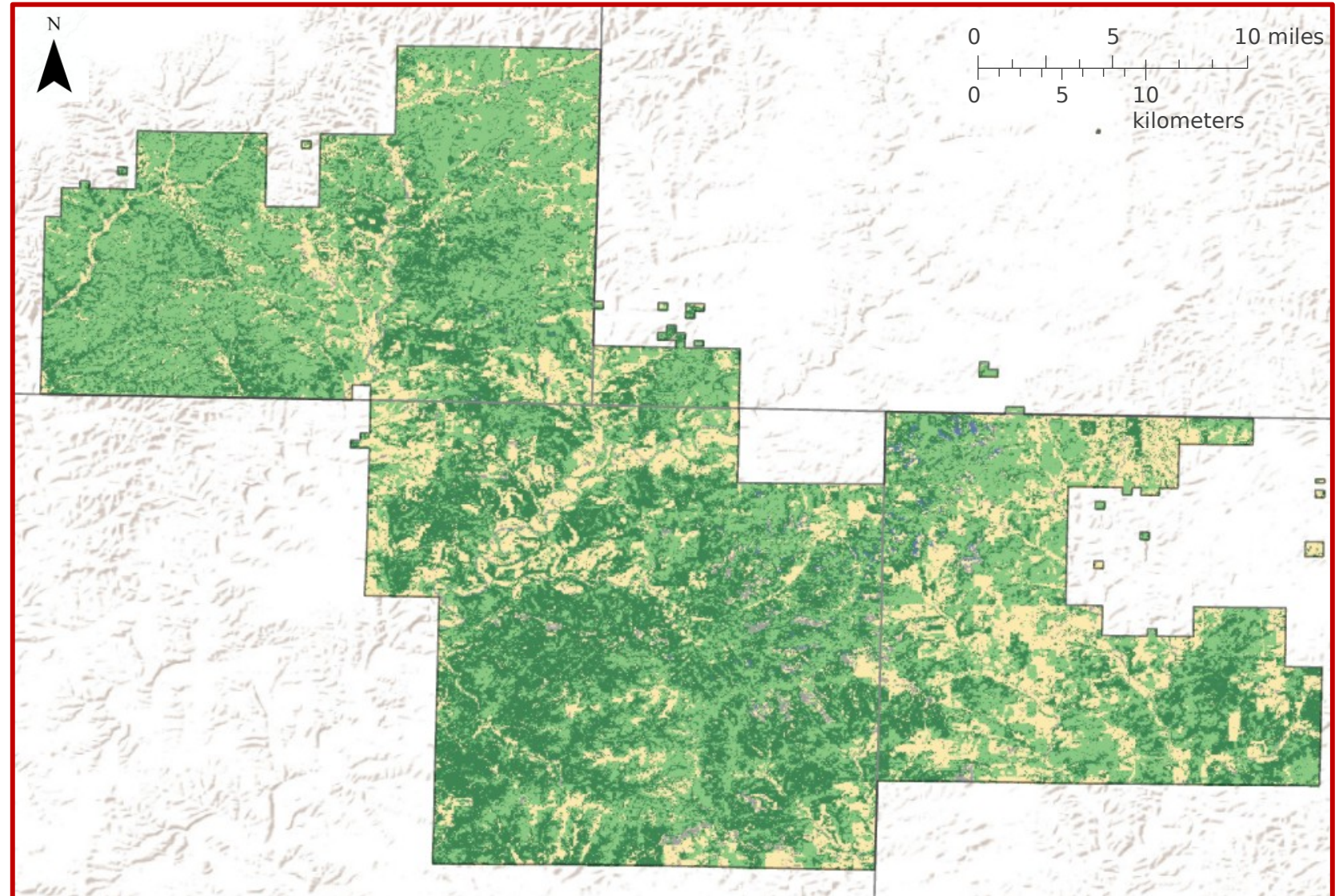
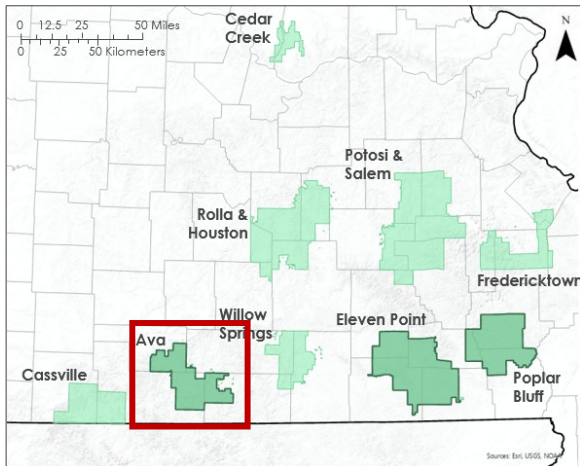


Results and Conclusions



Ava Ranger District:

1986 Land Cover Classification

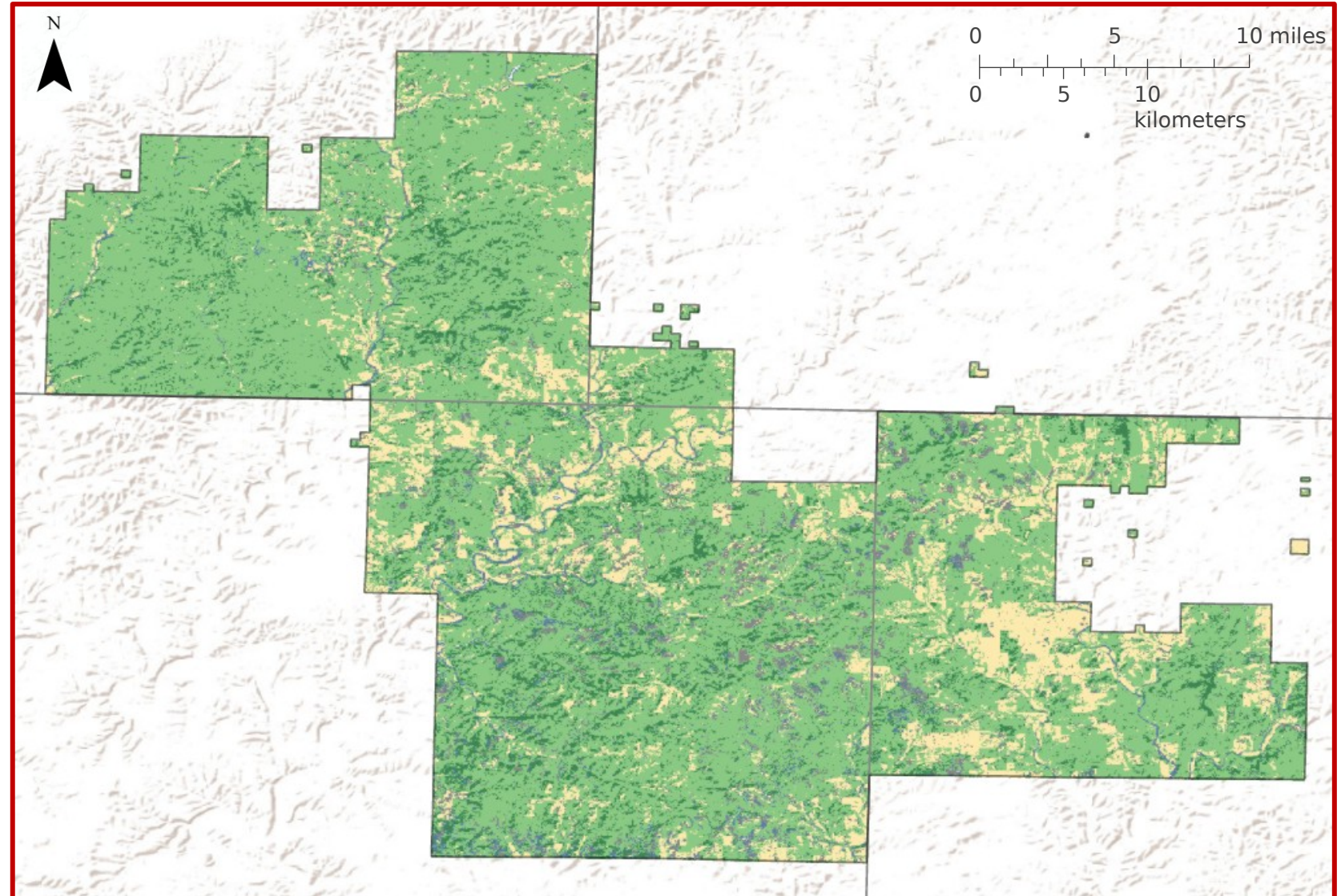
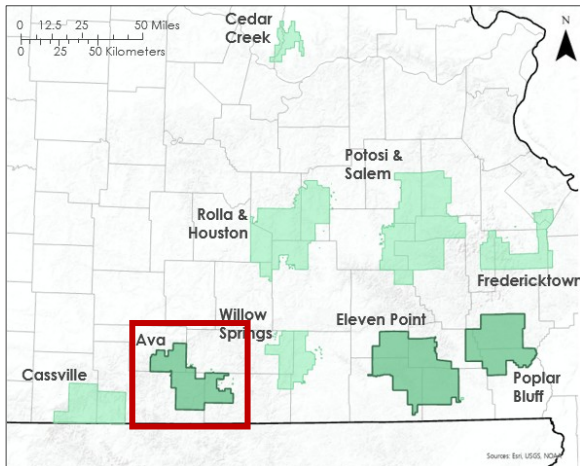


Results and Conclusions



Ava Ranger District:

2019 Land Cover Classification

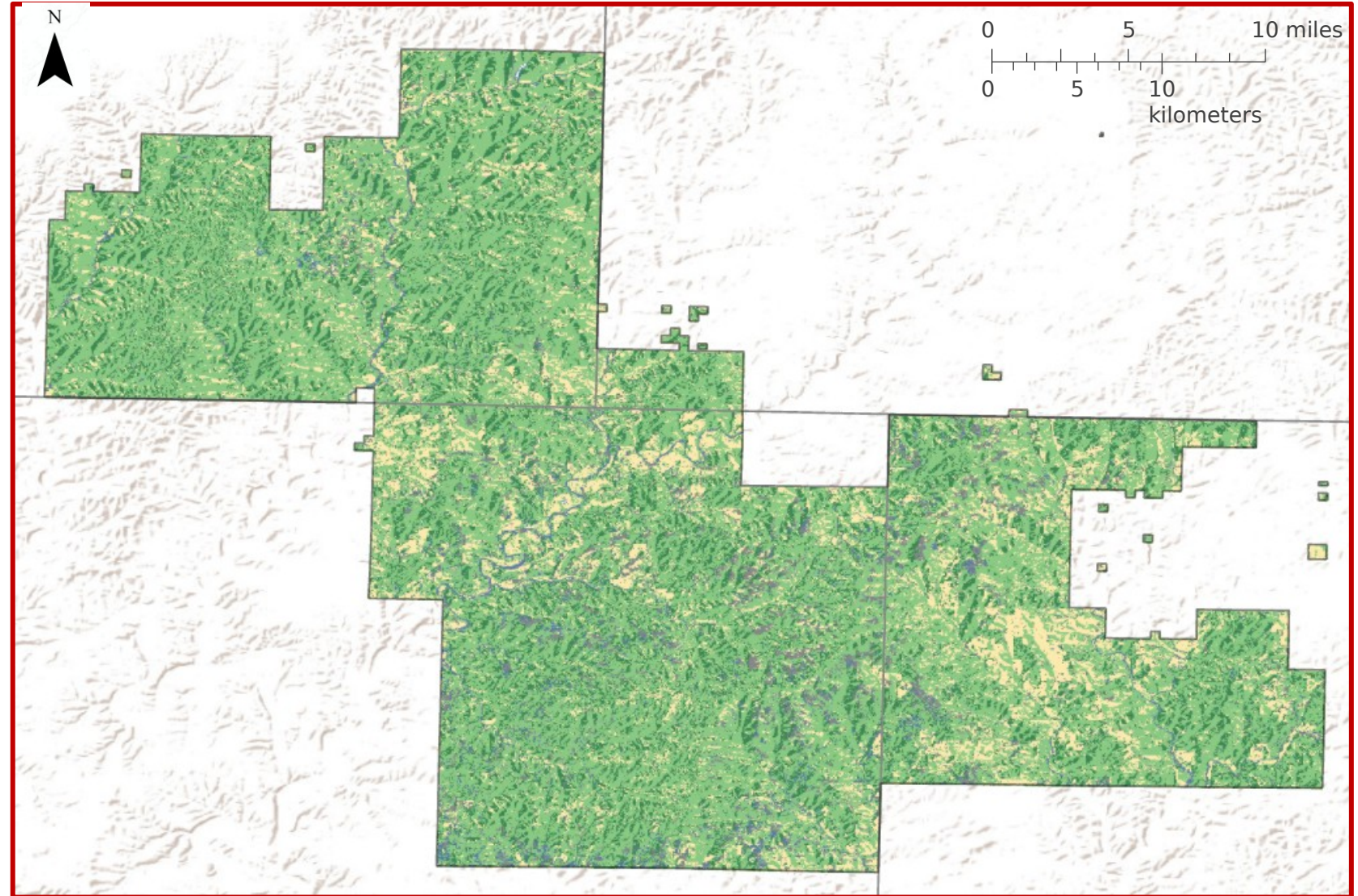
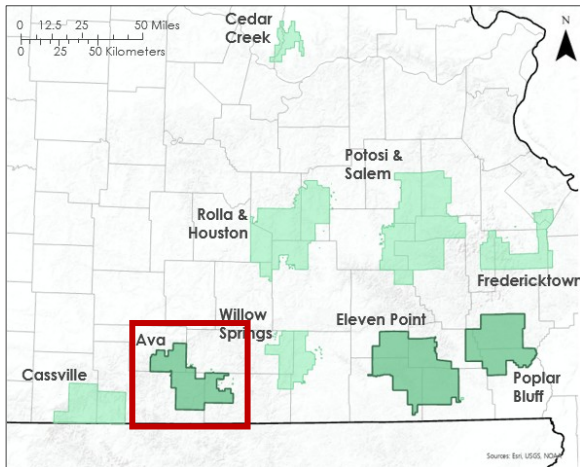


Results and Conclusions



Ava Ranger District:

2040 Land Cover Forecast

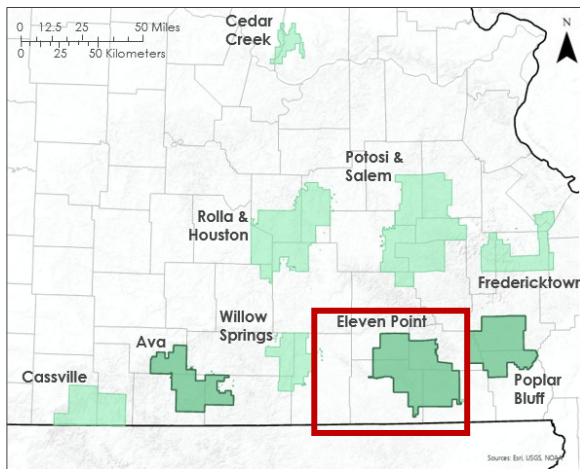
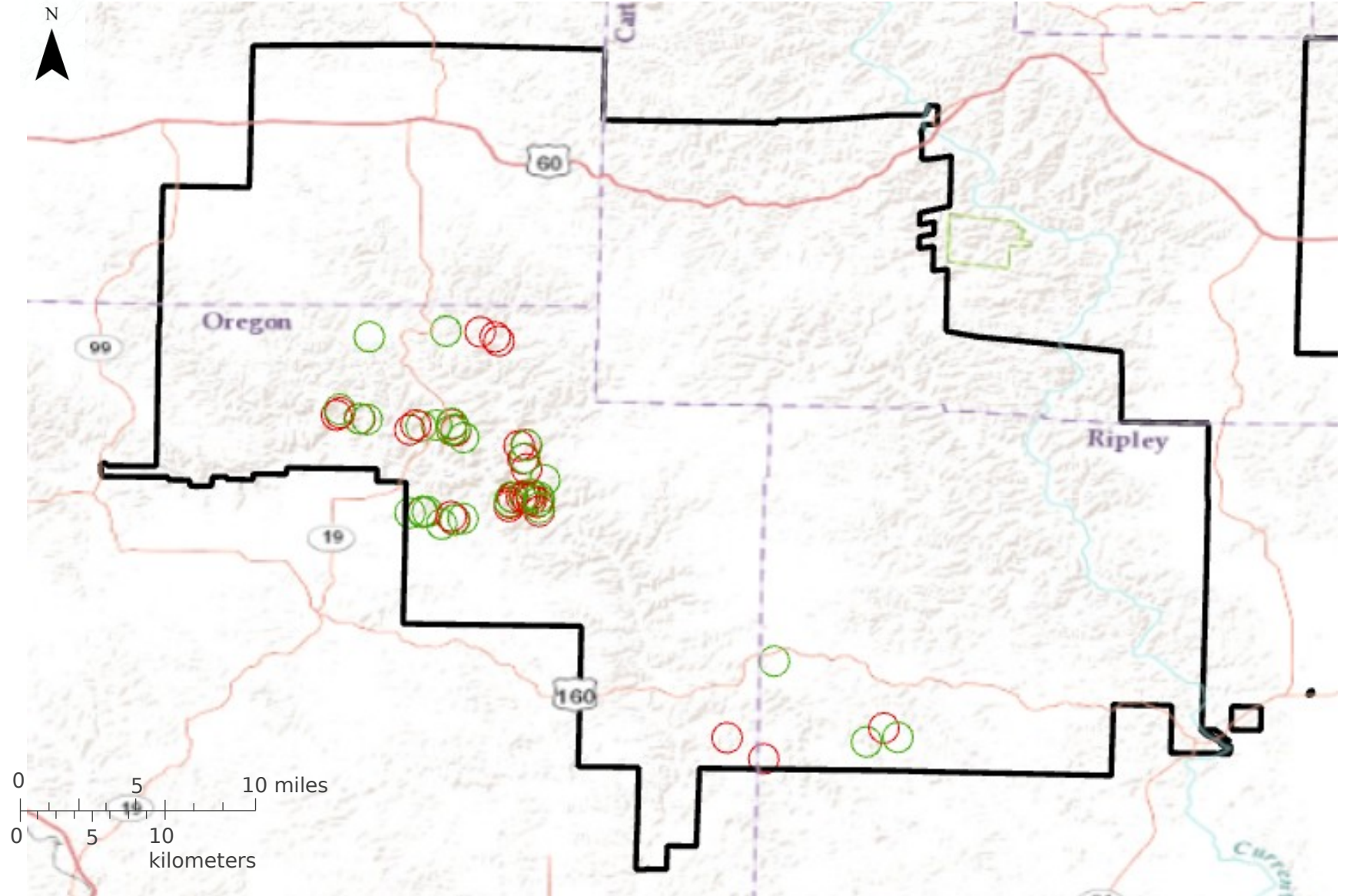


Results and Conclusions



Species Modeling





In-Situ data:
Shortleaf Pine &
Eastern Red Cedar
ground-truthed data

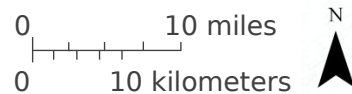
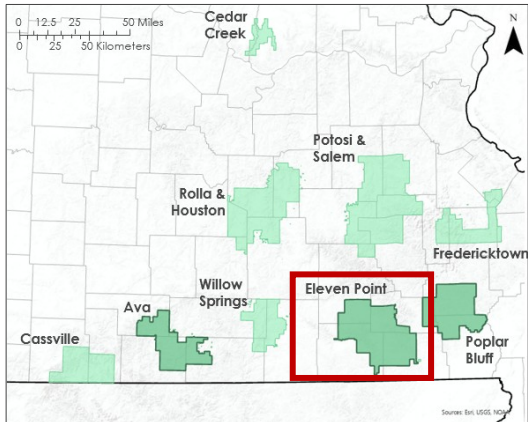
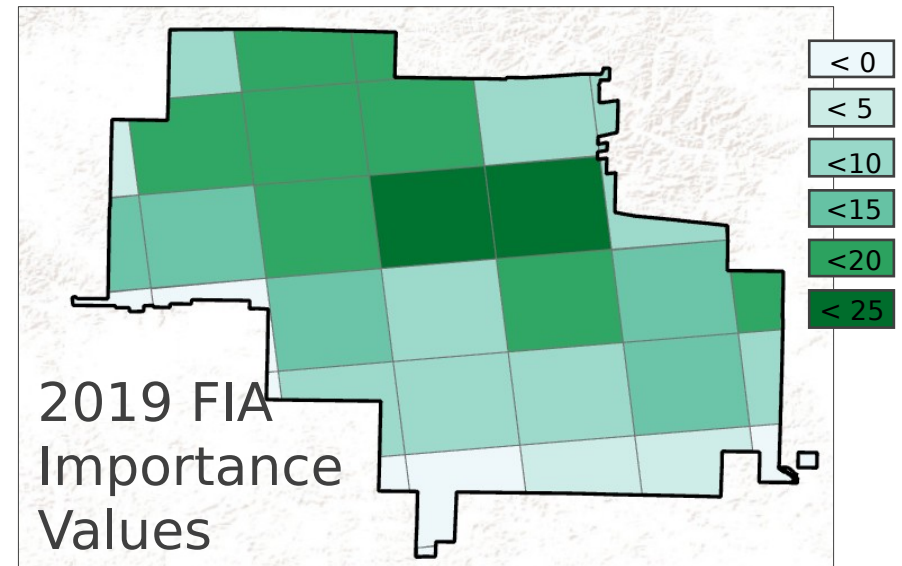
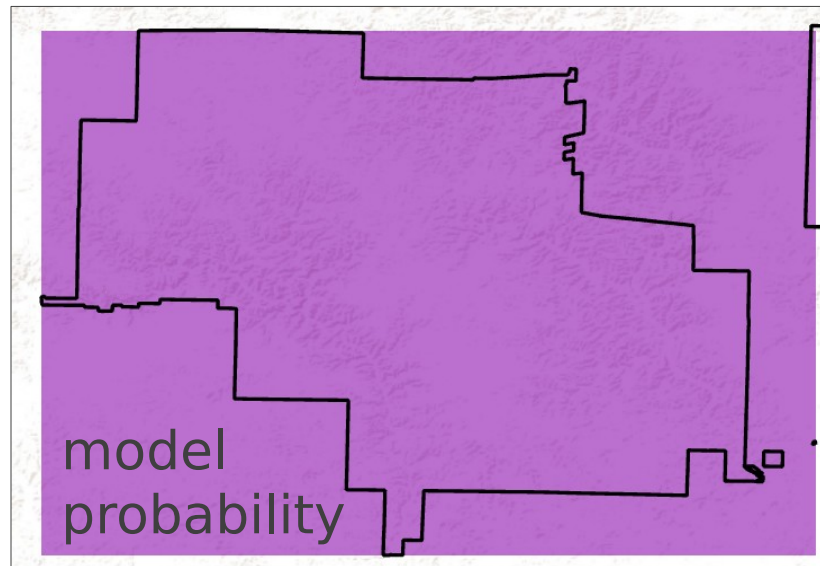
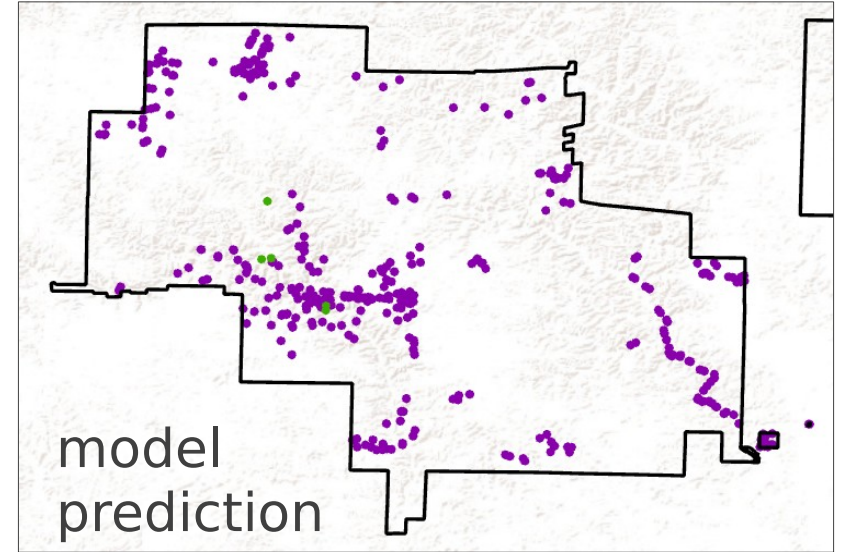
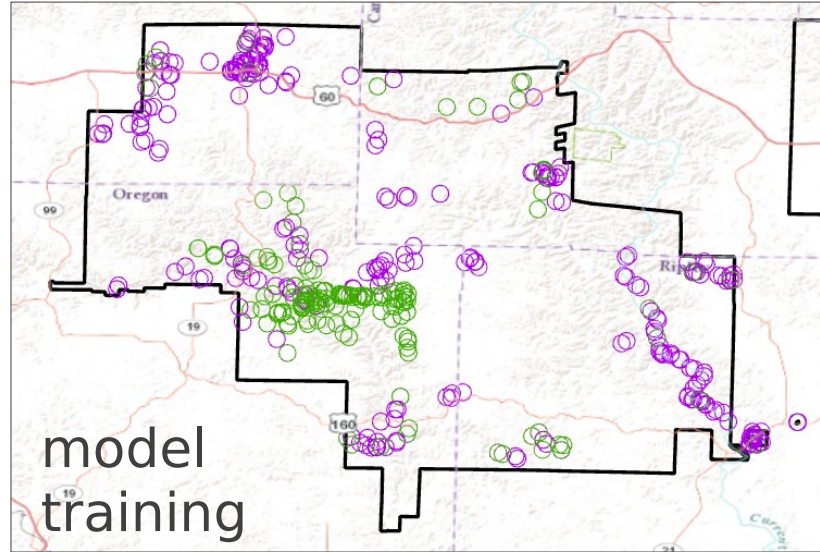


Results and Conclusions



Shortleaf Pine Species Modeling





-  Not present, training
-  Not present, modeling
-  Pine present, training
-  Pine present, modeling

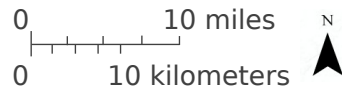
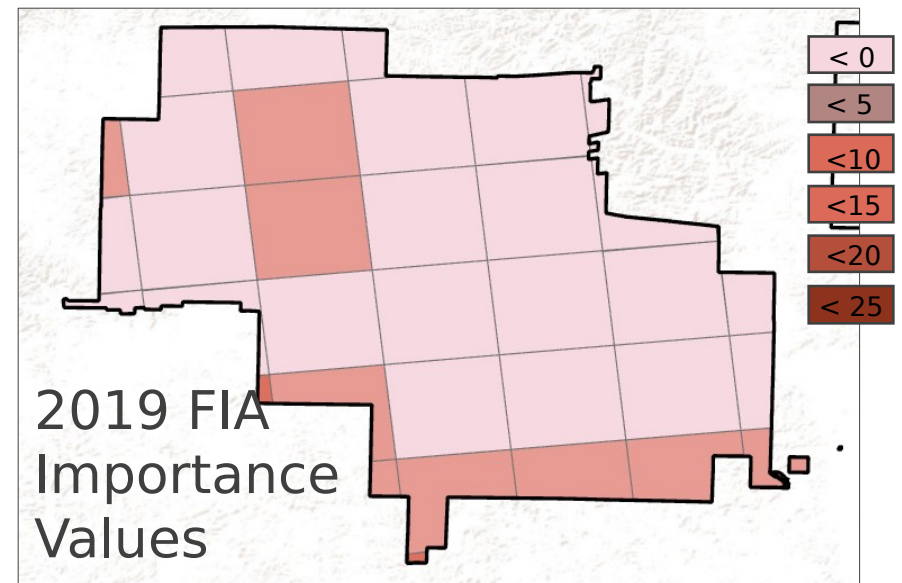
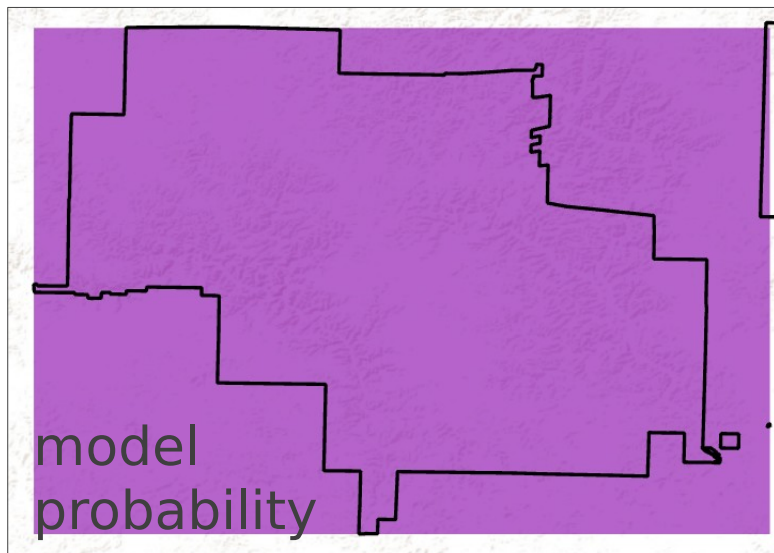
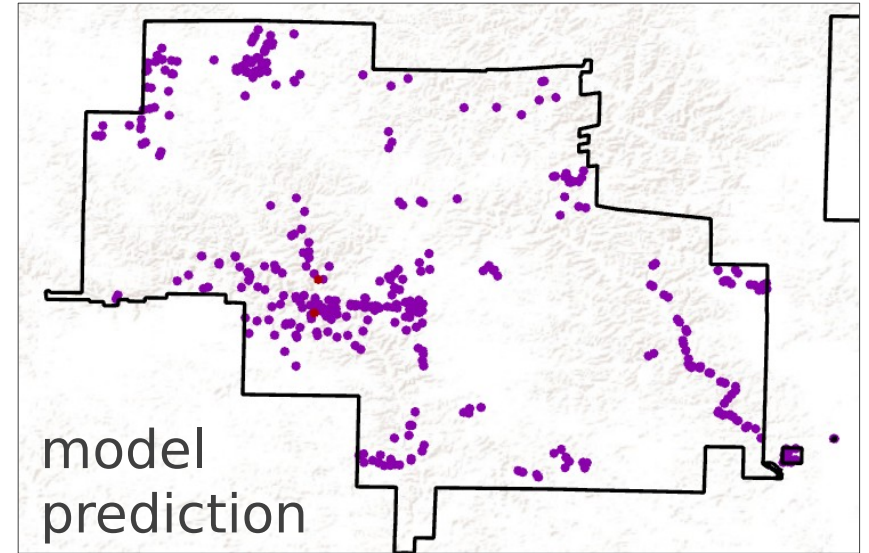
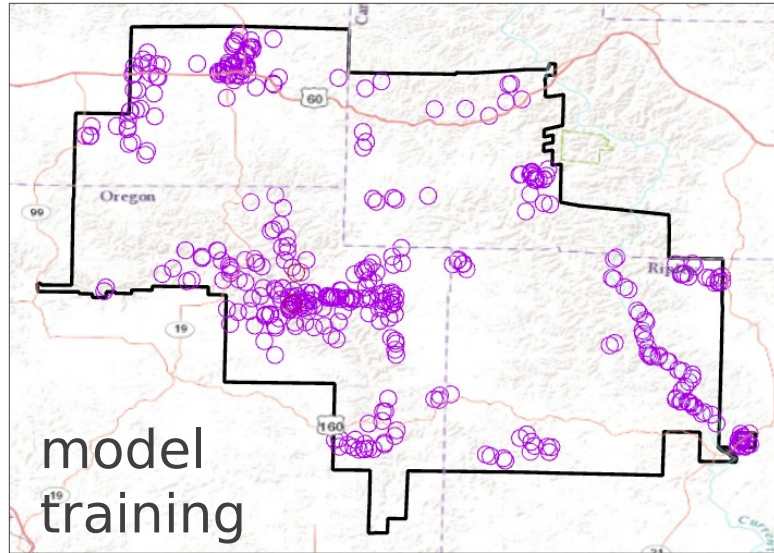
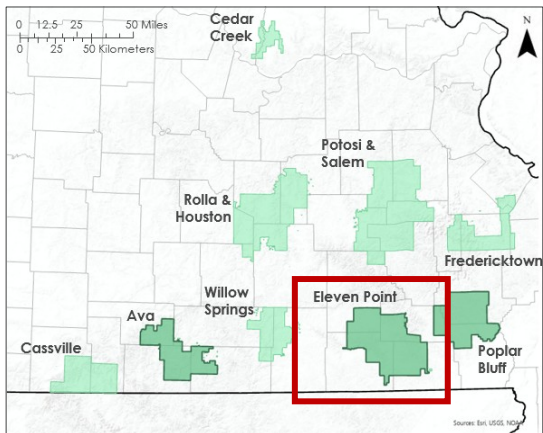


Results and Conclusions

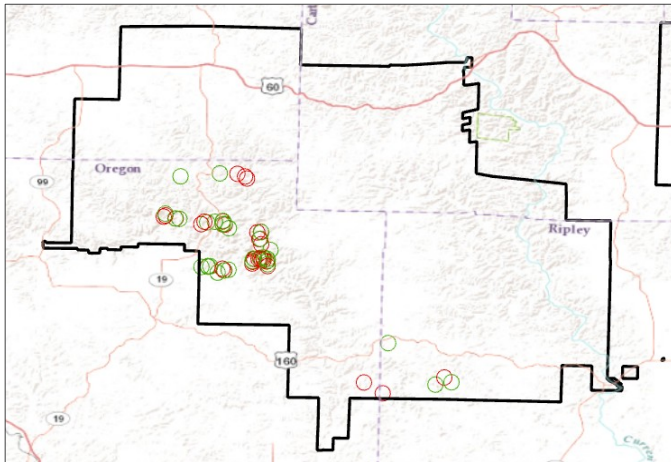
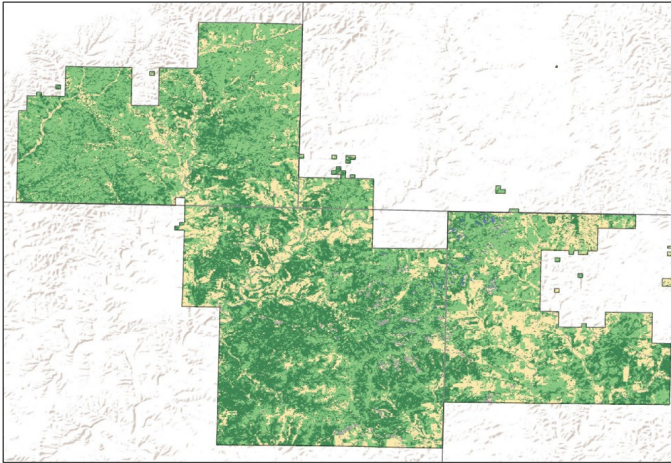


Eastern Red Cedar Species Modeling

-  Not present, training
-  Not present, modeling
-  Cedar present, training
-  Cedar present, modeling



Results and Conclusions



- ▶ Between 1986 and 2019
 - ▶ Loss of conifer forest and meadow/grasslands
 - ▶ Increase in hardwood deciduous
 - ▶ Greatest class conversion was from conifer/grassland to deciduous
 - ▶ Increase in water cover (2019 record floods)
- ▶ 2040 Forecast
 - ▶ Current management practices could promote conifer forest and meadow/grassland revival
- ▶ More data is needed for stronger prediction models, especially species-level statistics

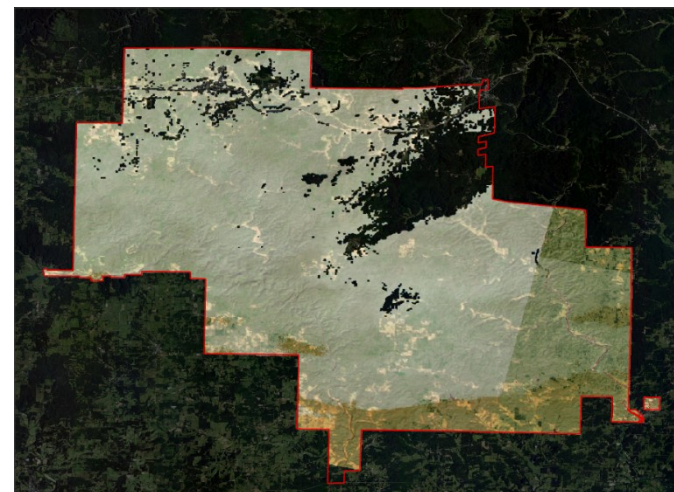
Errors and Uncertainties



- ▶ Training & validation data
 - ▶ In-situ data not usable for species distribution
 - ▶ Water and developed land cover training points impacted by snow mask
- ▶ Landsat
 - ▶ Coarse spatial resolution hides detail
 - ▶ Large study area means we dealt with different swaths
 - ▶ Low image quality made years ineligible



2019 snow mask issues



2016 Imagery concerns

Future Work



- ▶ Incorporate high-resolution aerial imagery into classification (NAIP, DOQ)
- ▶ Expand number of classes to be identified
- ▶ Incorporate disturbances into forecasting model

ACKNOWLEDGEMENTS

DEVELOP

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