

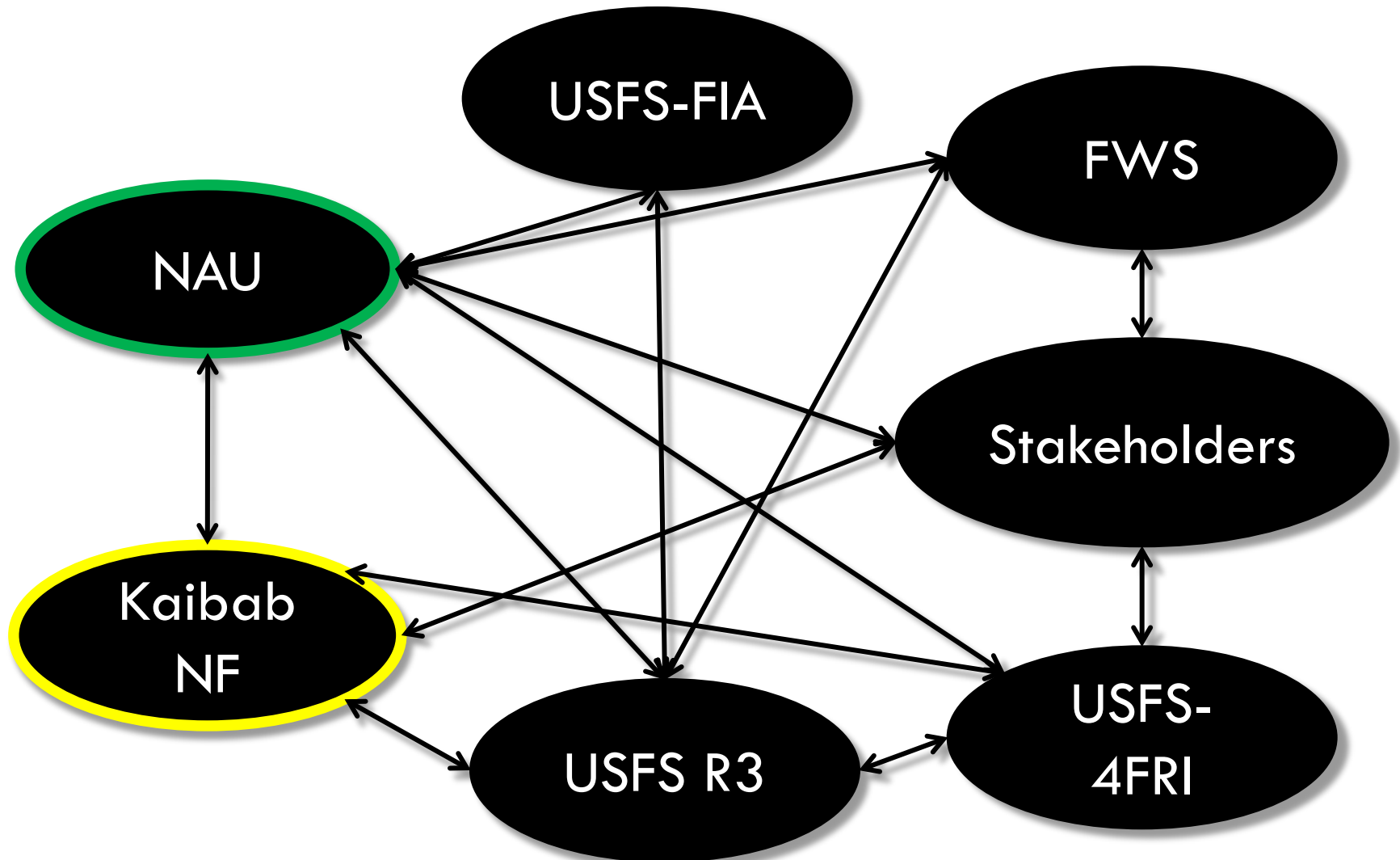
# LANDSCAPE SCALE MONITORING OF FOREST TREATMENTS AND DISTURBANCE

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# Collaborative Partnerships

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# Previous assessments

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## Statewide Strategy for Restoring Arizona's Forests

### The Kaibab Forest Health Focus

Collaborative Prioritization of Landscapes and Restoration Treatments on the Kaibab National Forest

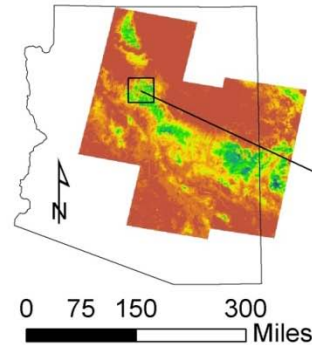
Final Report

## Analysis of Small-Diameter Wood Supply in Northern Arizona

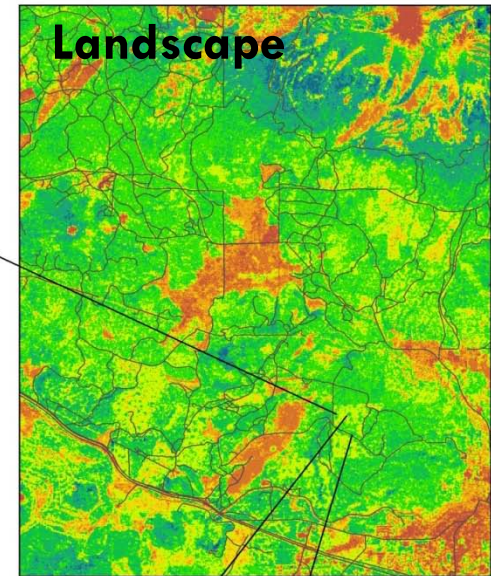
May 2007–February 2008



## Region



## Landscape

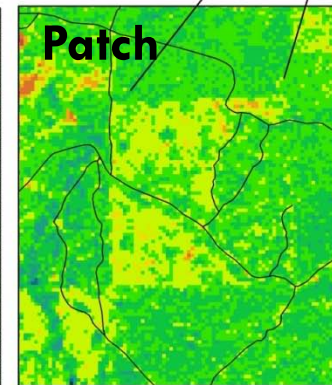


Aerial photograph of restoration treatment near Flagstaff, AZ



0.5 0.25 0 0.5 Miles

## Patch



Volume (ft<sup>3</sup>/ac)



— Roads



# Disturbance

4



Fire



Urbanization



Insects & Disease



Silviculture



Wind



Drought

# Kaibab NF Monitoring

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Need for landscape-scale, up-to-date and repeatable forest data complementary to:

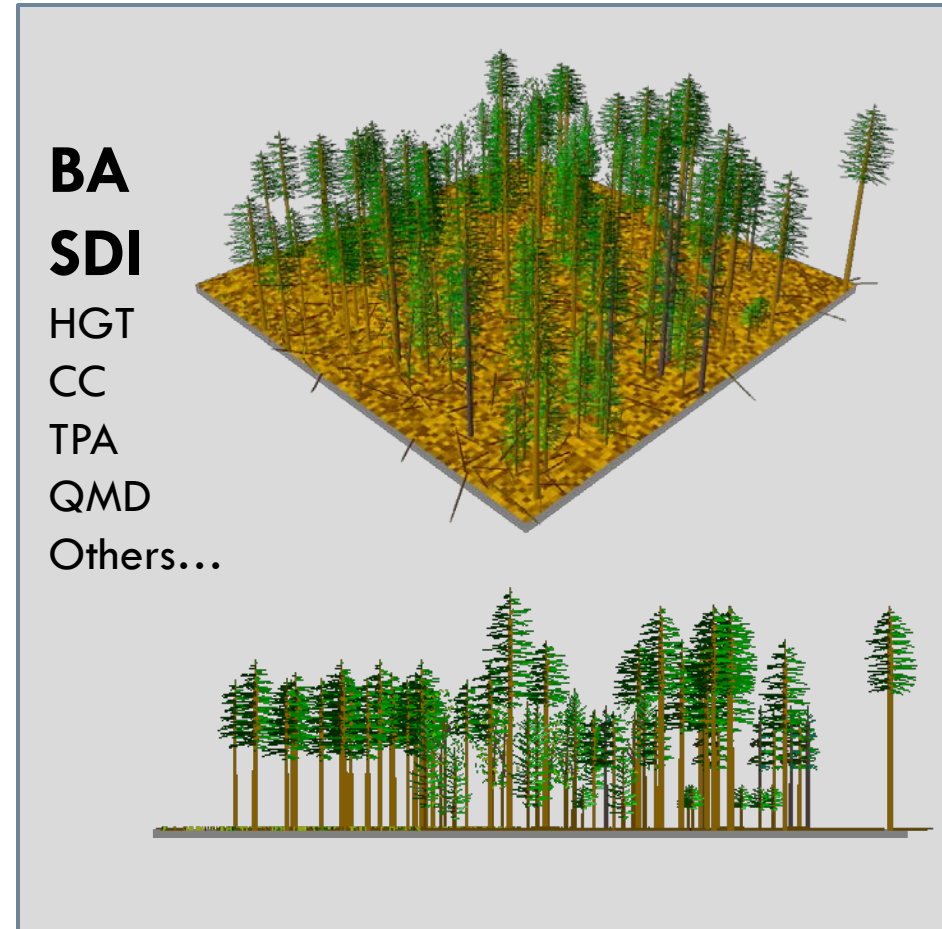
- ❑ Monitoring planned and unplanned disturbance
  - ❑ Assessing changes wildlife habitat
  - ❑ Mitigating fire hazard and risk
- 
- ❑ Biomass & forest carbon assessment
  - ❑ Other planning objectives

# Objectives

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## Model & map forest structure

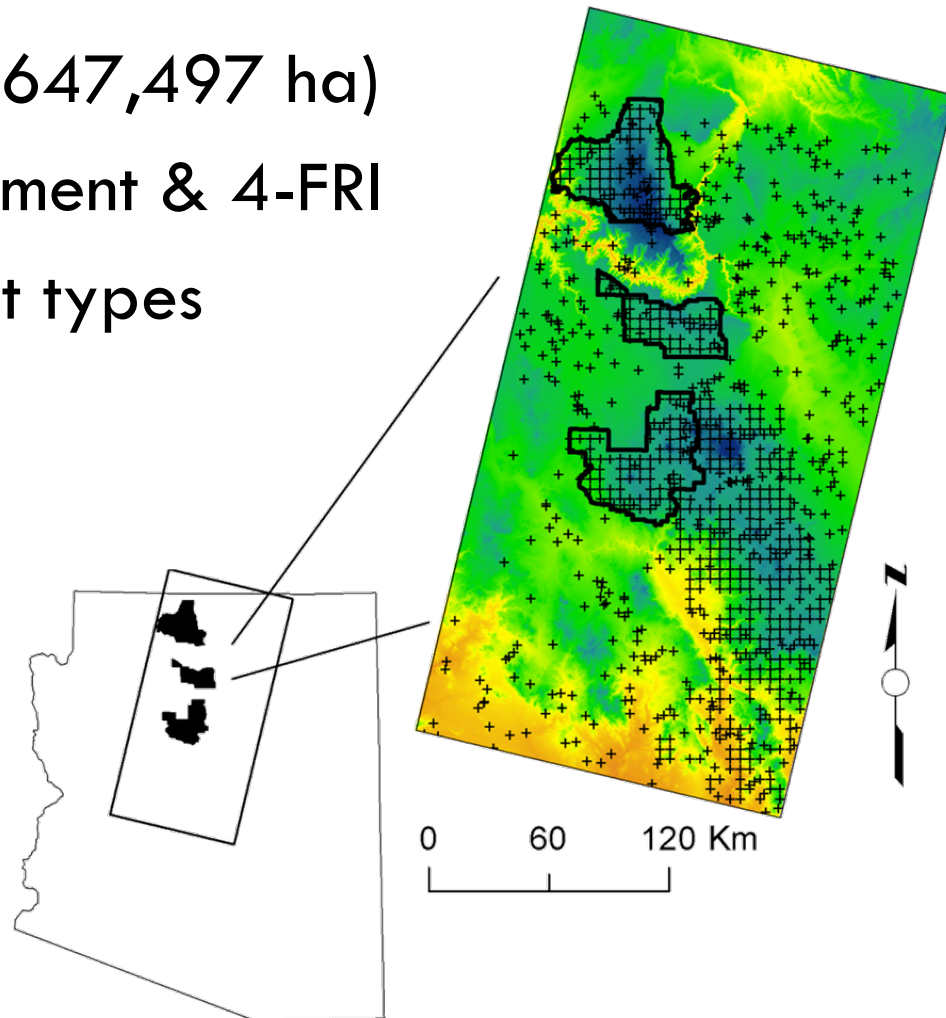
- ☐ Inexpensive
- ☐ Validated
- ☐ Consistent/repeatable



# Study Area – Kaibab NF

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- ❑ 1.6 million acres (647,497 ha)
- ❑ Ongoing management & 4-FRI
- ❑ Three major forest types

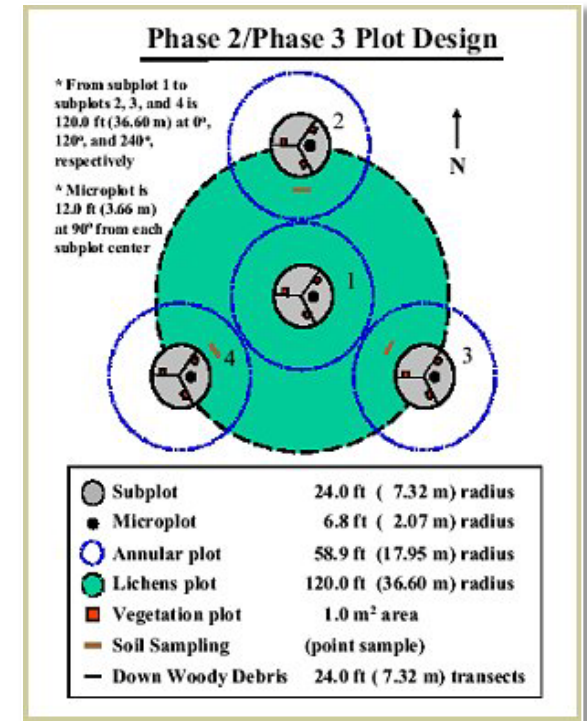


# Methods – reference data

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## USFS Forest Inventory and Analysis (FIA) plots

- Measure 10% of state's forest per year
- $n = 648$  plots (2001 – 2009)
- Monitor forest status and trends
- FVS compatible



~1 acre of forest land



# Methods – remotely sensed data

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## Landsat TM (2006 & 2010)

- ▣ 6 spectral bands
- ▣ 2 dates (leaf on/off)

## Spectral Derivatives

- ▣ NDVI
- ▣ NDVI<sub>c</sub>

## Digital Elevation Model

- ▣ Elevation
- ▣ Terrain

### 39 Predictor Variables

#### Leaf-on

TM1

TM2

TM3

TM4

TM5

TM7

Brightness

Greenness

Wetness

NDVI<sub>on</sub>

NDVI<sub>c</sub><sub>on</sub>

NDVI<sub>4</sub><sub>on</sub>

PCA1

PCA2

PCA3

#### Leaf-off

TM1

TM2

TM3

TM4

TM5

TM7

Brightness

Greenness

Wetness

NDVI<sub>off</sub>

NDVI<sub>c</sub><sub>off</sub>

NDVI<sub>4</sub><sub>off</sub>

PCA1

PCA2

PCA3

#### DEM

Elevation

Slope

Aspect (trasp)

Roughness

CTI

#### Others

NDVI<sub>ratio</sub>

# Methods – correction + modeling

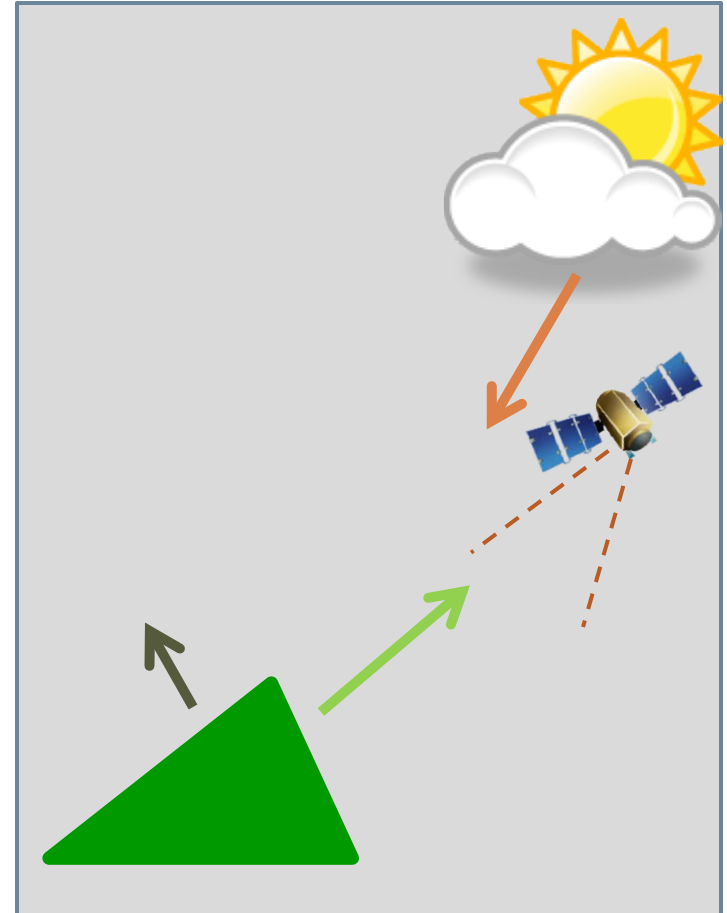
10

## Image correction:

- ▣ Uncorrected Landsat TM
- ▣ Image normalization (MAD)
- ▣ Atmospheric correction (FLAASH)
- ▣ Terrain correction (C-correction)

## Modeling:

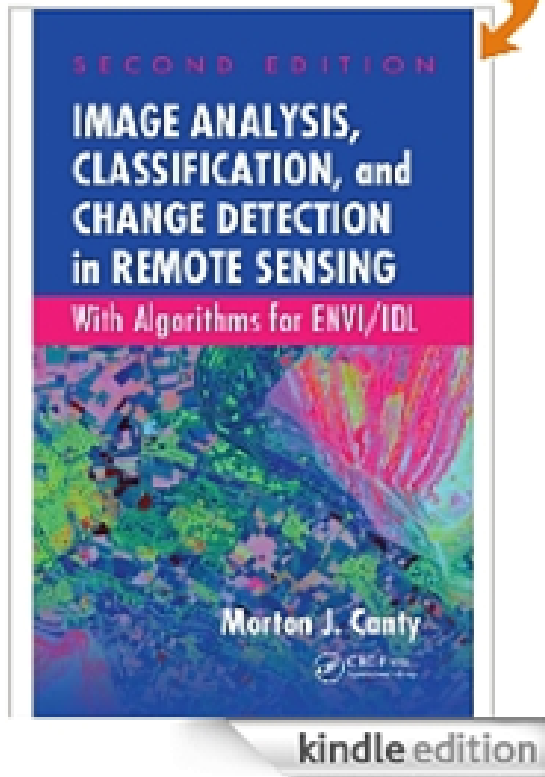
- ▣ Random Forest (regression)



# Literature & Tools

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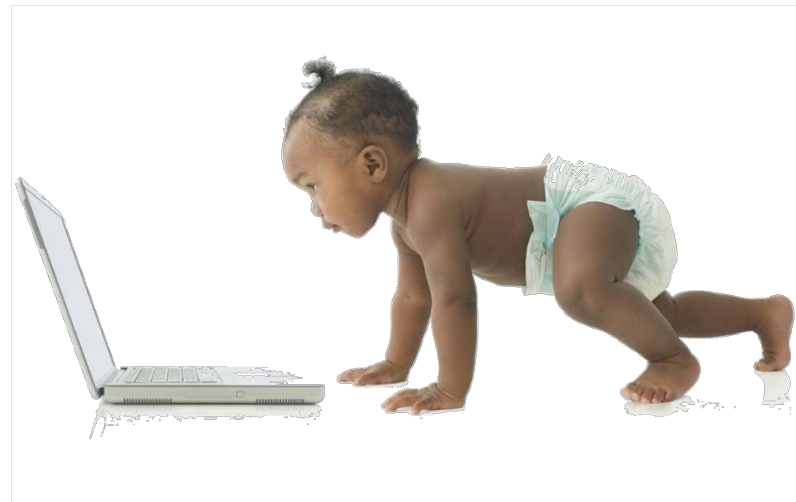
Click to **LOOK INSIDE!**



## Multispectral Image Analysis

File	Spectral	Spatial	Change	Help
<input type="text" value="Upload"/> <input type="button" value="Go"/>	<input type="text" value="PCA"/> <input type="button" value="Go"/>	<input type="text" value="Fourier"/> <input type="button" value="Go"/>	<input type="text" value="IR-MAD"/> <input type="button" value="Go"/>	<input type="text" value="Overview"/> <input type="button" value="Go"/>

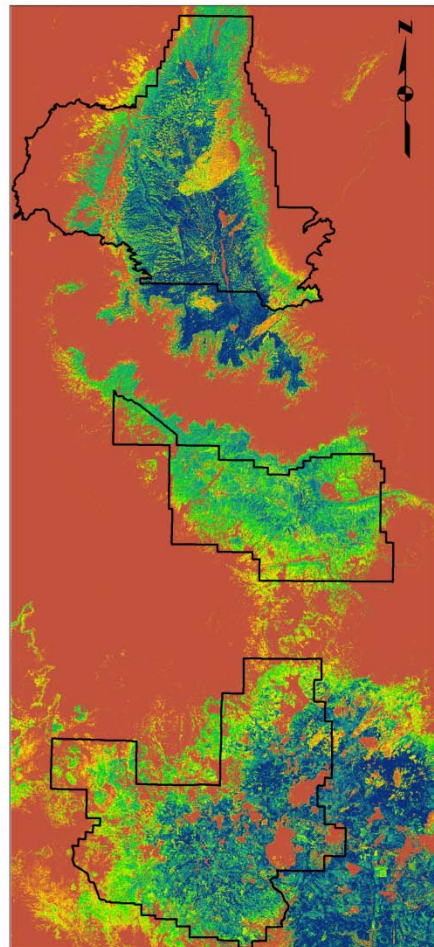
powered by Google App Engine



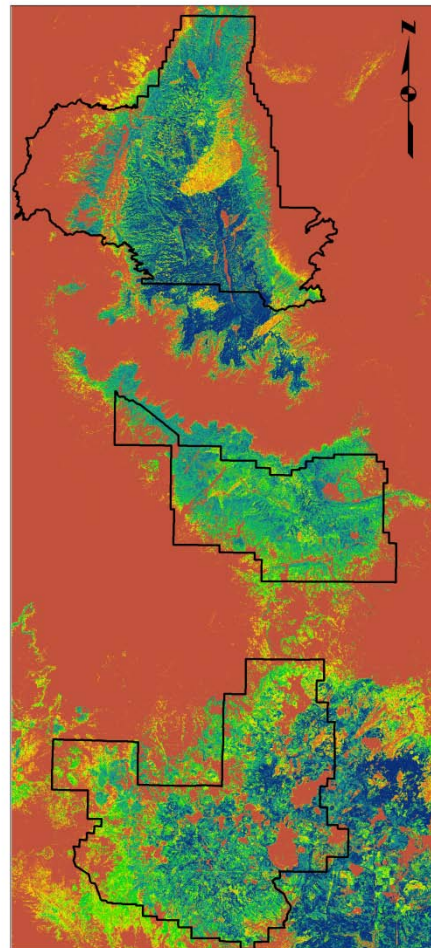
# Results – outputs

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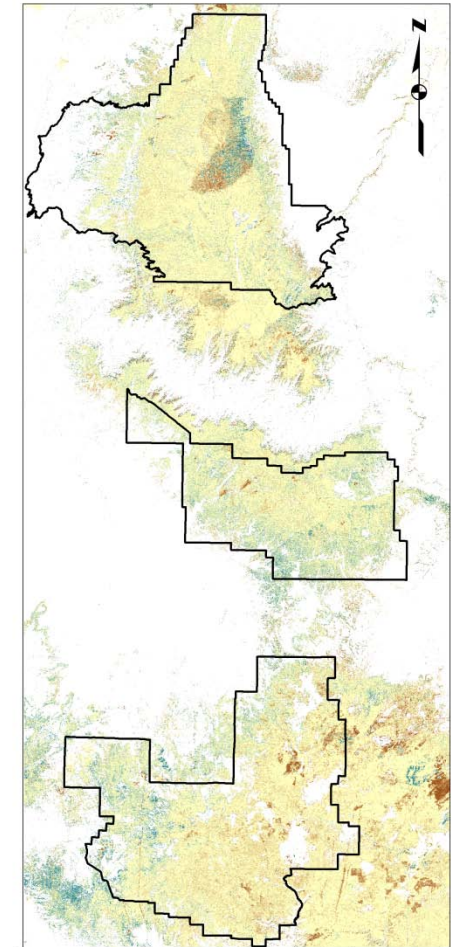
2006



2010



Change (%)



Change (%)

-127 - -76
-75 - -43
-42 - -10
-9 - 22
23 - 55
56 - 87
88 - 127

Basal area

240

0

0 50 100 Km

0 50 100 Km

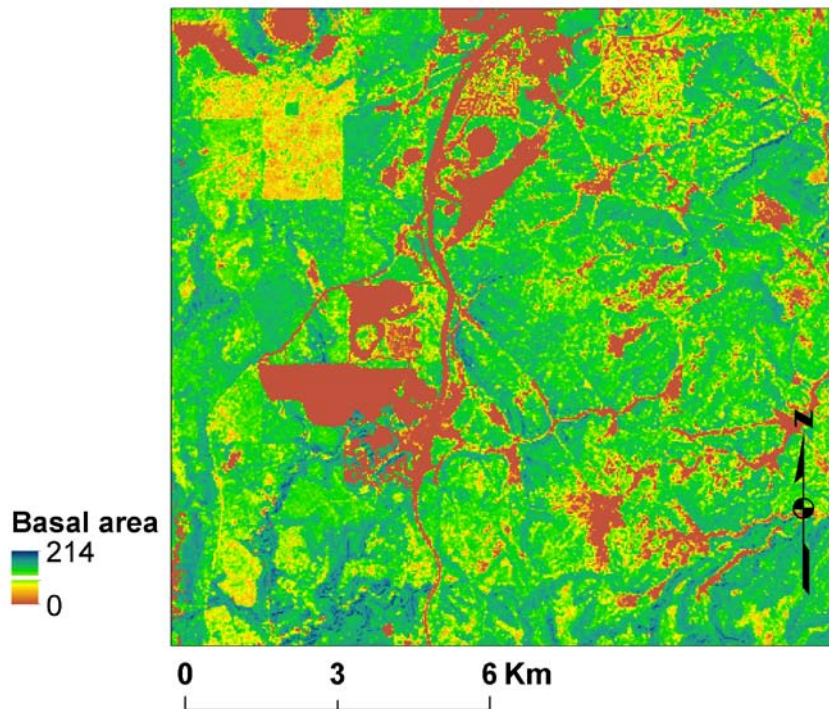
0 50 100 Km



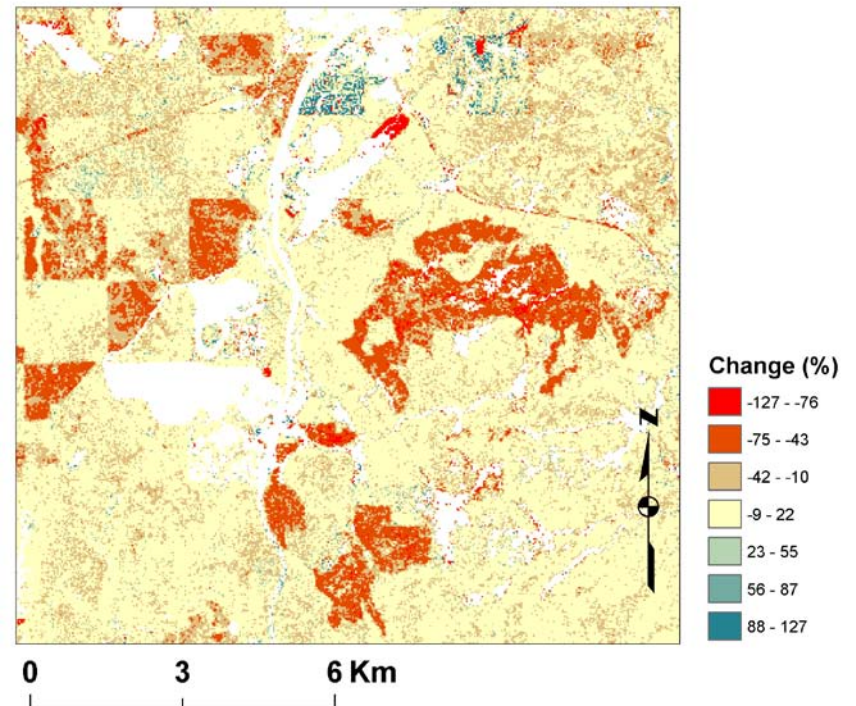
# Results – outputs

13

2006



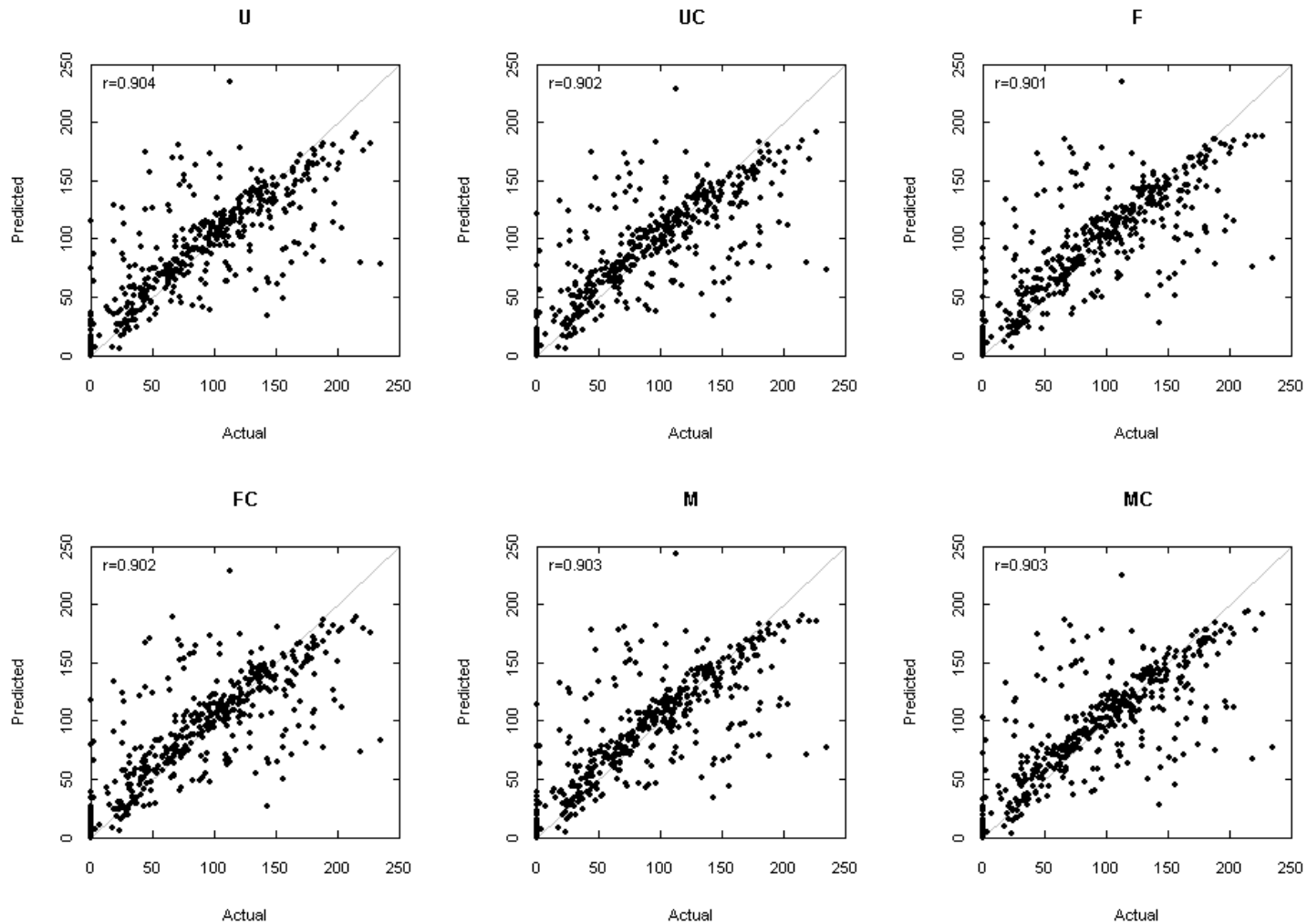
2010



# Results - Validation

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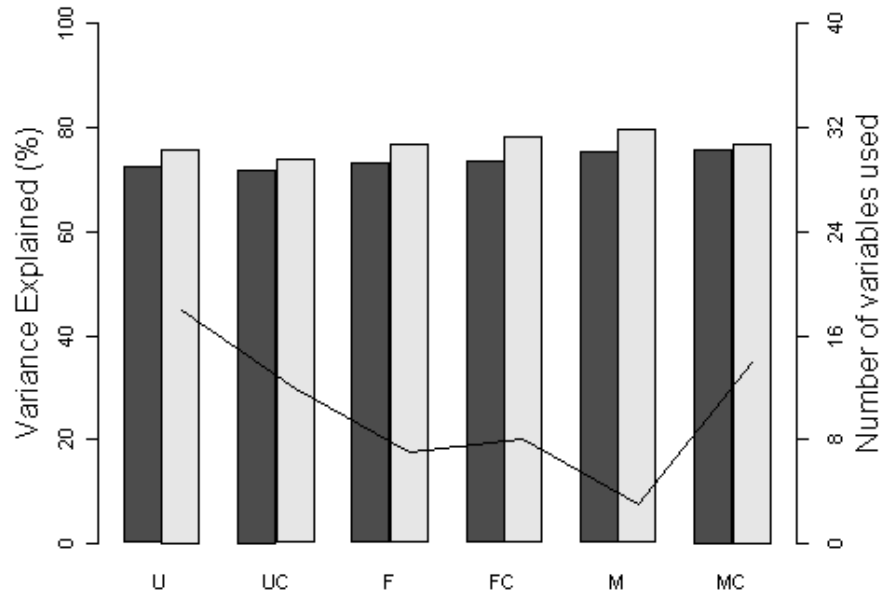
## Basal Area – Predicted vs. Actual



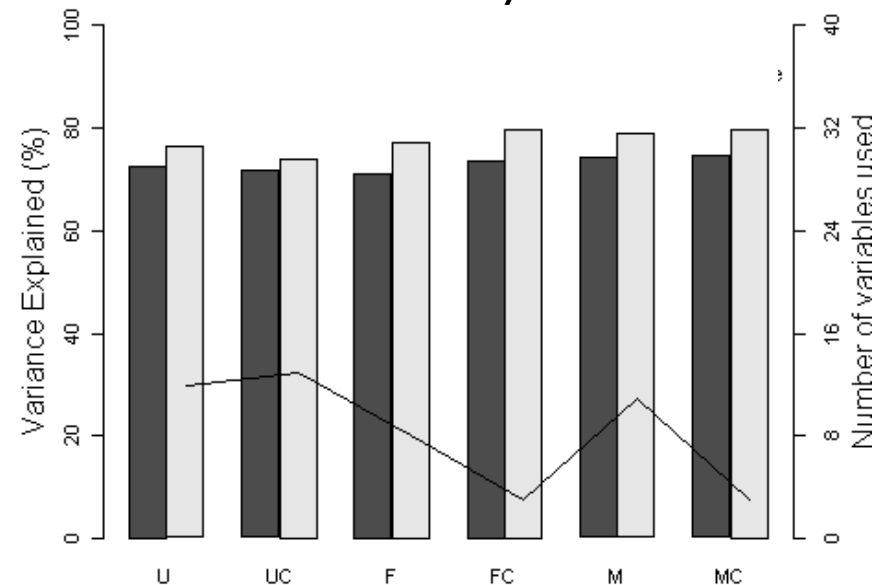
# Results - Validation

15

Basal area



Stand Density Index



All predictors



Best subset



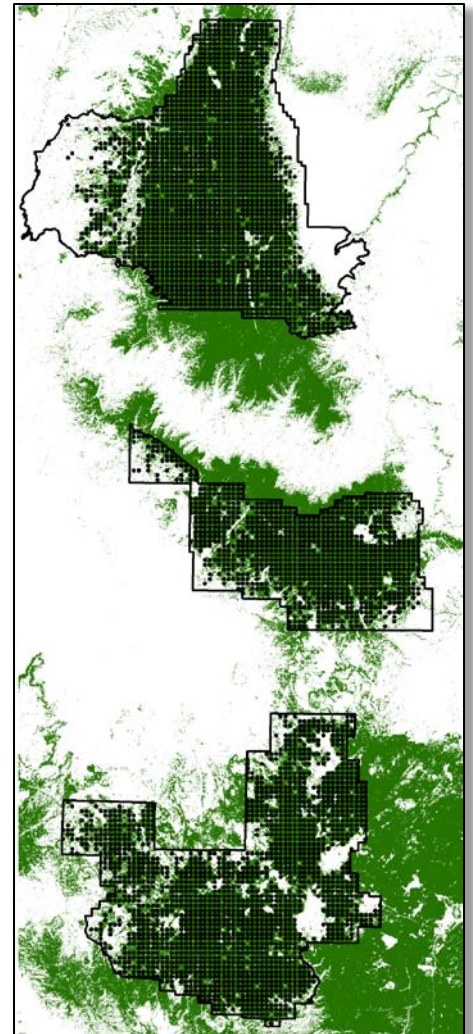
Number of predictors

# Results – Consistency

16

## Compare 2006 and 2010 basal area

- ❑ 1km x 1km points ( $n = 4622$ )
- ❑ Pearson correlation coefficients
- ❑ Kruskal-Wallis One Way ANOVA on Ranks

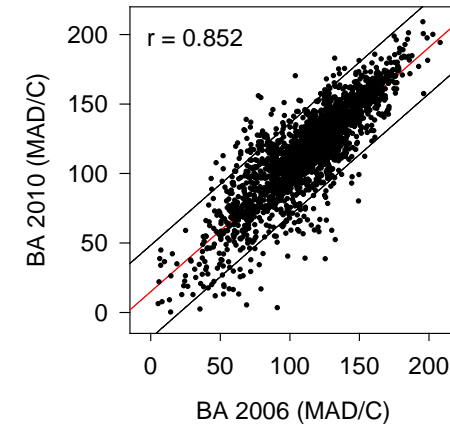
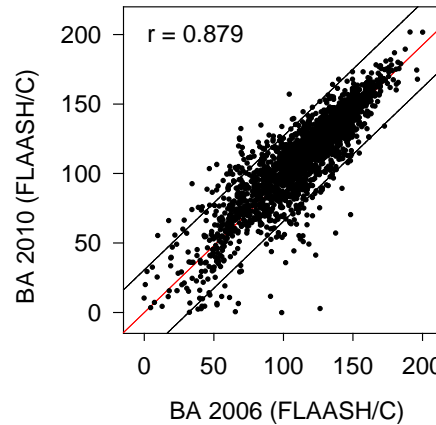
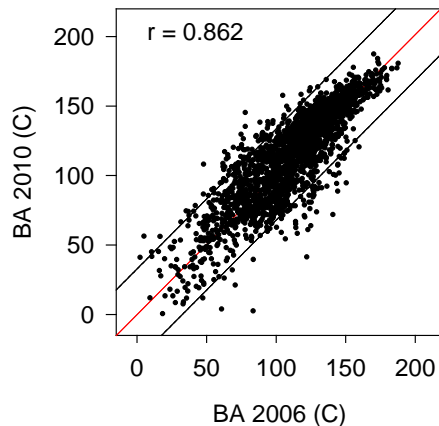
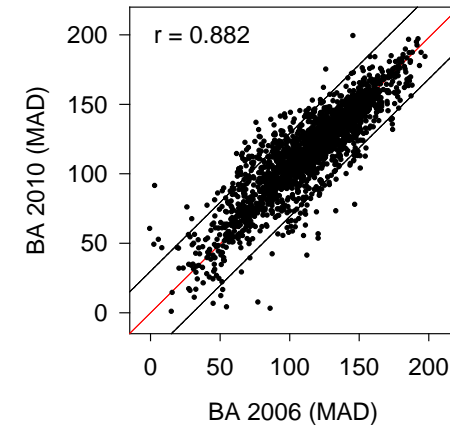
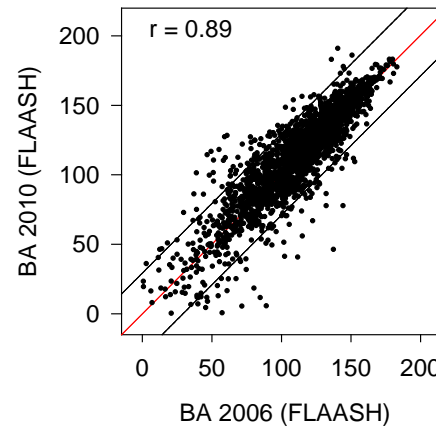
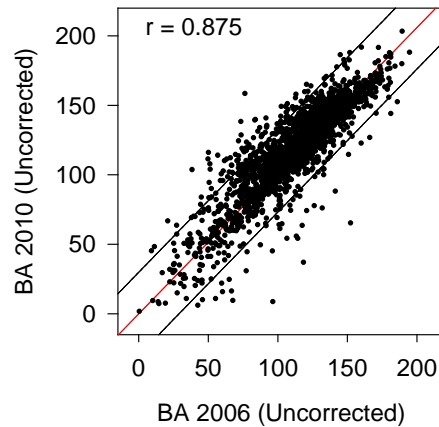




# Results – Consistency

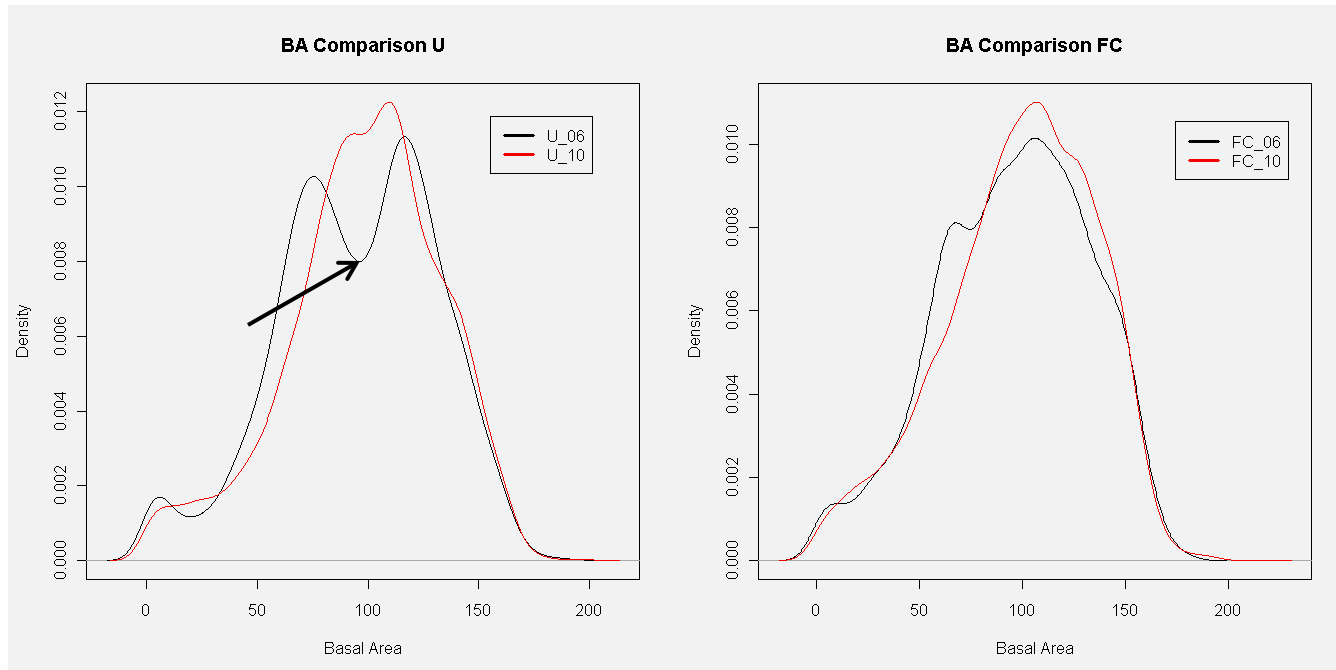
17

Between years for each correction technique (Basal area)



# Results - Consistency

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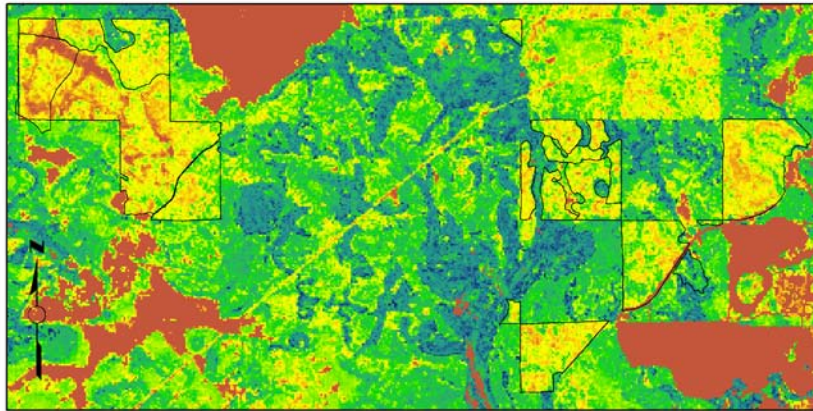
2006 basal area,  $H = 33.927$  ( $P = <0.001$ )

2010 basal area,  $H = 26.090$  ( $P = <0.001$ )

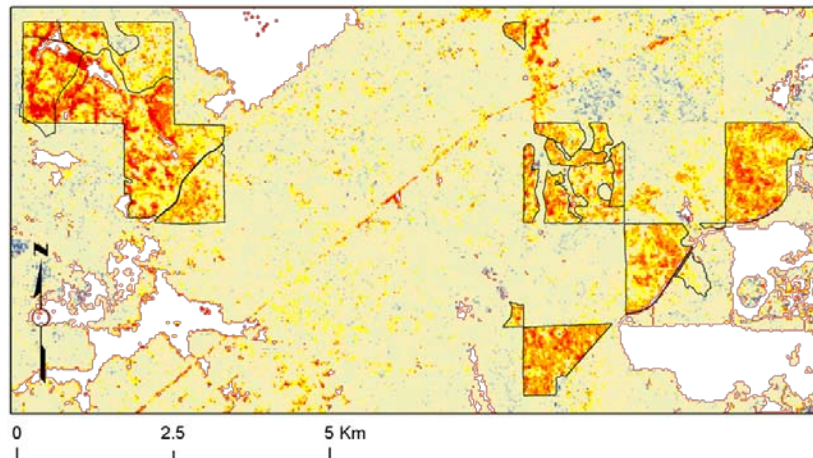
# Monitoring applications

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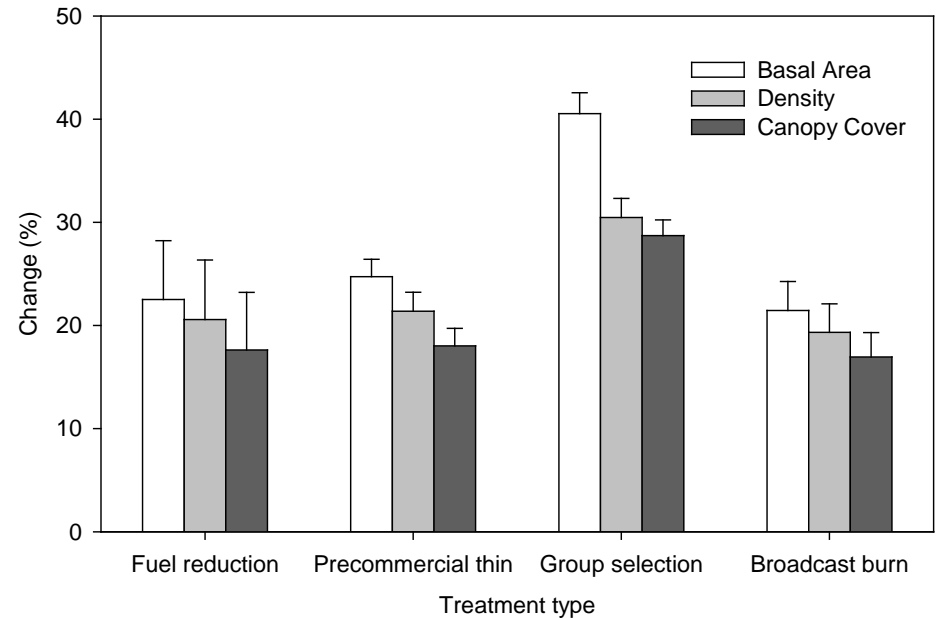
Stand density index (SDI)



SDI change (%)



Treatment types 2006 - 2010



# Conclusions

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- Terrain and atmospheric corrections important
- We are likely to witness large and small disturbance events in the future
- Forest structure data are consistent & sensitive to a variety of disturbance factors
- The outputs support a range on of landscape scale analyses



# Acknowledgments

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- Kaibab National Forest
- USFS Forest Inventory and Analysis program, Ogden UT
- USFS Region 3 Office
- US Fish & Wildlife Service