



Landscape-Level Forest Biomass and Residue Estimation

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FORESTRY AND
CONSERVATION**
Where Ideas Take Flight

Forest Biomass



< Slide 1 of 30 >

Biomass

Modeling

Validation

Residue

Forest Biomass



OR



< Slide 2 of 30 >

Biomass

Modeling

Validation

Residue

Forest Biomass

-  **Ecologically Available Biomass**
-  **Technically Available Biomass**
-  **Economically Available Biomass**
-  **Biomass Stocks**

< Slide 3 of 30 >

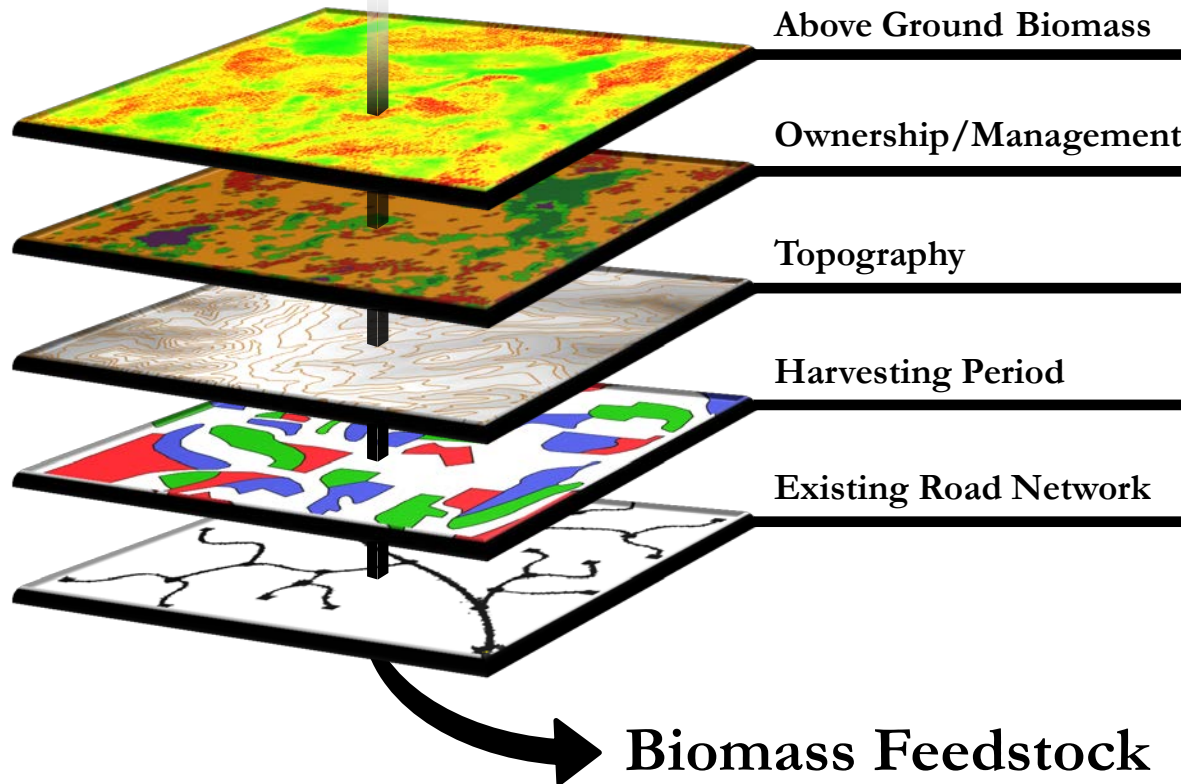
Biomass

Modeling

Validation

Residue

Forest Biomass



< Slide 4 of 30 >

Biomass

Modeling

Validation

Residue

Forest Biomass

-  **Estimate Above Ground Biomass**
-  **Estimate merchantable stock**
-  **For large landscape with stand-level detail**

< Slide 5 of 30 >

Biomass

Modeling

Validation

Residue

Estimating AGB

- Classical methods are expensive
- Remote sensing as an alternative
 - Use high resolution imagery for stand level detail to address management related questions
 - Link with field data to estimate forest characteristics based on imagery attributes

< Slide 6 of 30 >

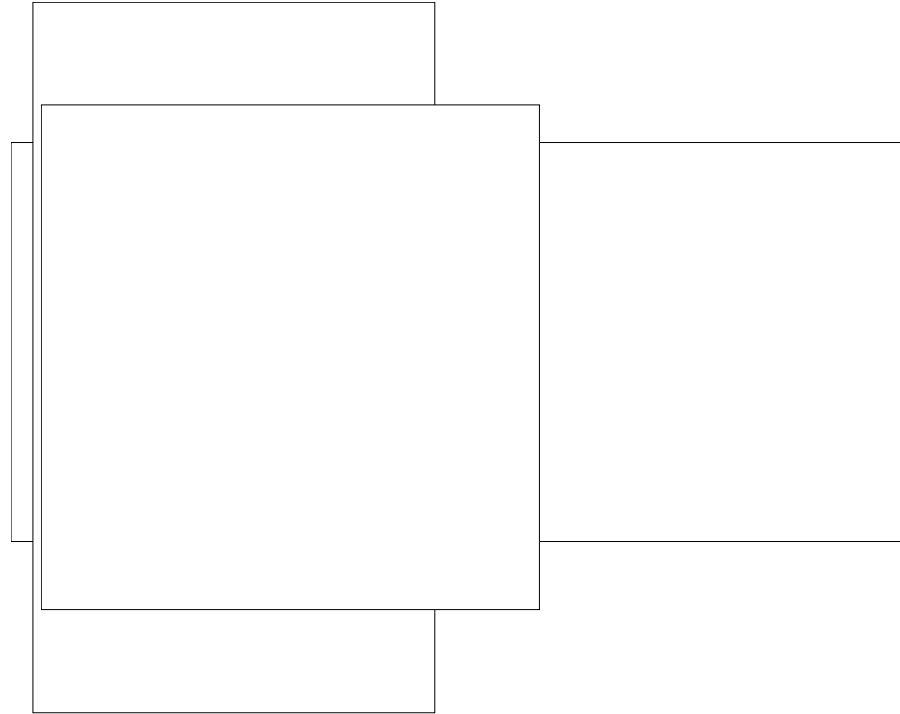
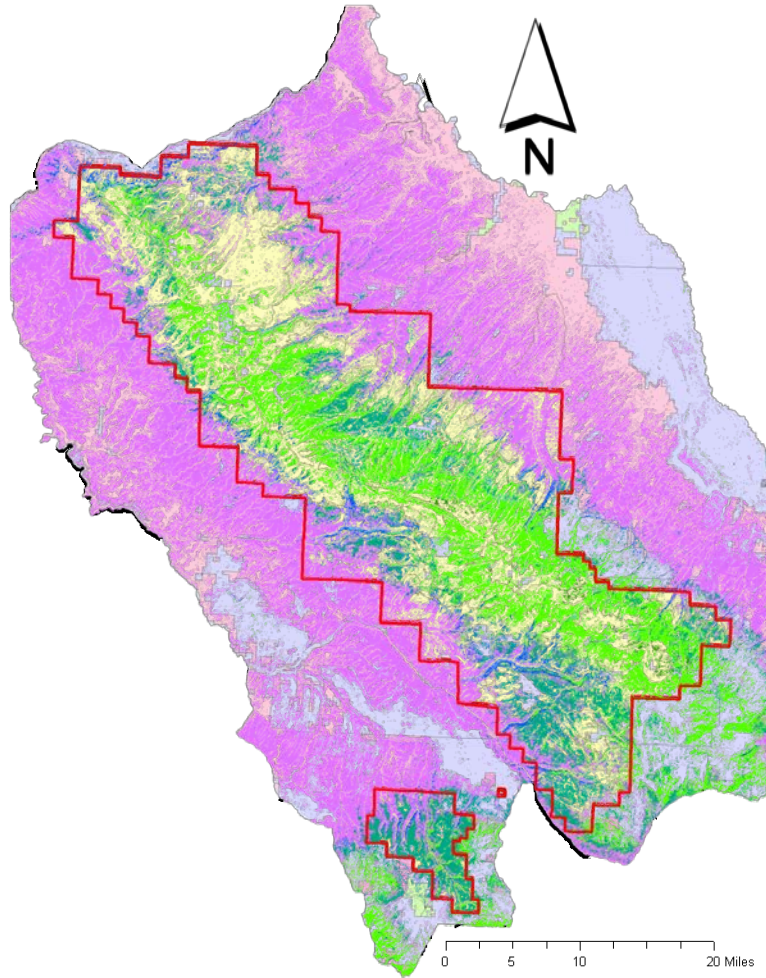
Biomass

Modeling

Validation

Residue

The Uncompahgre



< Slide 7 of 30 >

Biomass

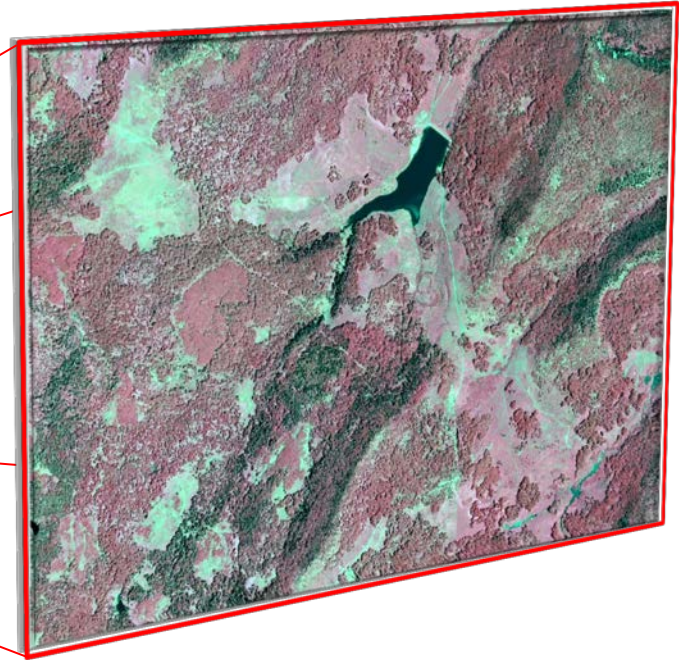
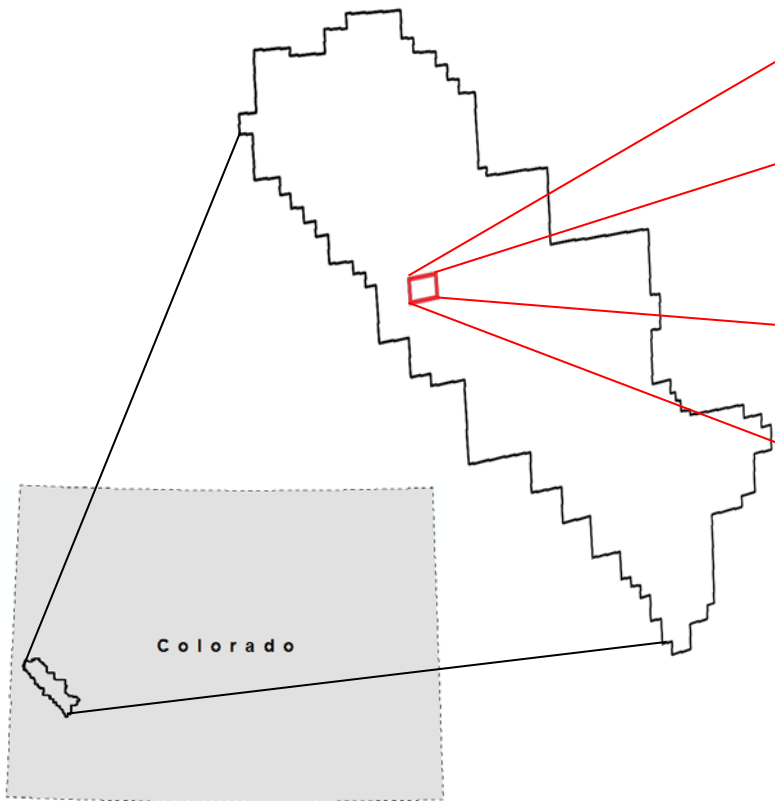
Modeling

Validation

Residue

The Uncompahgre

The Uncompahgre Plateau National Forest



Area Subset

NAIP Color Infrared

Modeling AGB



0 0.5 1 2 Miles

< Slide 9 of 30 >

Biomass

Modeling

Validation



Residue

Modeling AGB

Probabilistic Classification Model

-  Polytomous Logistic Regression

Forest Characteristics Model

-  Use existing field data
-  Find a relationship between field data, texture, and probabilistic outputs

< Slide 10 of 30 >

Biomass

Modeling

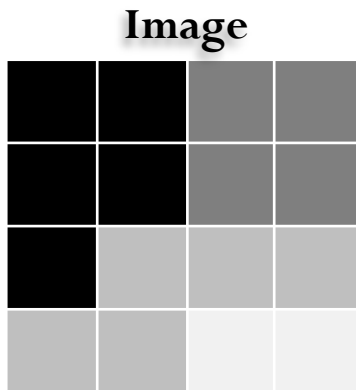
Validation

Residue

Modeling AGB

Texture

Gray Level Co-Occurrence Matrix (GLCM)



Values

0	→0	→1	→1
0	→0	→1	→1
0	→2	→2	→2
2	→2	→3	→3

Framework (East)

	0	1	2	3
0	2	2	1	0
1	0	2	0	0
2	0	0	3	1
3	0	0	0	1

Modeling AGB

Texture

Gray Level Co-Occurrence Matrix (GLCM)

East Matrix				+	Transpose West				=	Symmetrical (Horizontal)			
2	2	1	0		2	0	0	0		4	2	1	0
0	2	0	0		2	2	0	0		2	4	0	0
0	0	3	1		1	0	3	0		1	0	6	1
0	0	0	1		0	0	1	1		0	0	1	2

Modeling AGB

Texture

Gray Level Co-Occurrence Matrix (GLCM)

Symmetrical
(Horizontal)

4	2	1	0
2	4	0	0
1	0	6	1
0	0	1	2

Normalization

$$P_{i,j} = \frac{V_{i,j}}{\sum_{i,j=0}^{N-1} V_{i,j}}$$

Normalized

0.2	0.1	0.05	0
0.1	0.2	0	0
0.05	0	0.3	0.05
0	0	0.05	0.2

< Slide 13 of 30 >

Biomass

Modeling

Validation

Residue

Modeling AGB

Stage 1 Modeling

- **Response:**
Species Group

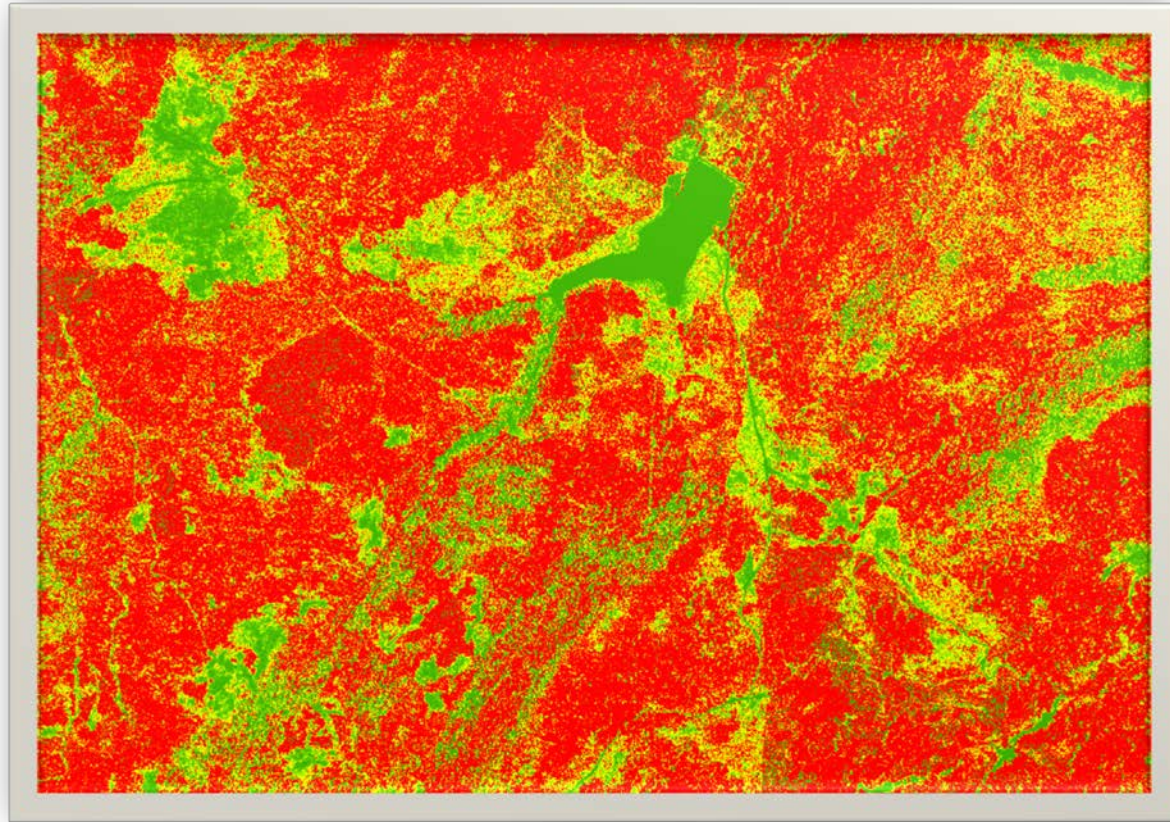
- **Independent variables:**

~~Training~~ data

~~Principle Component Analysis~~
Horizontal Homogeneity

~~GLCMs~~
Vertical and Horizontal Correlation

Modeling AGB



High : 100
Low : 0

< Slide 15 of 30 >

Biomass

Modeling

Validation

Residue

Modeling AGB

Stage 2 – Forest Characteristics

Response:

Summarized Field Data for AGB, BAA and TPA

Independent variables:

Principle Component Analysis

GLCMs

< Slide 16 of 30 >

Biomass

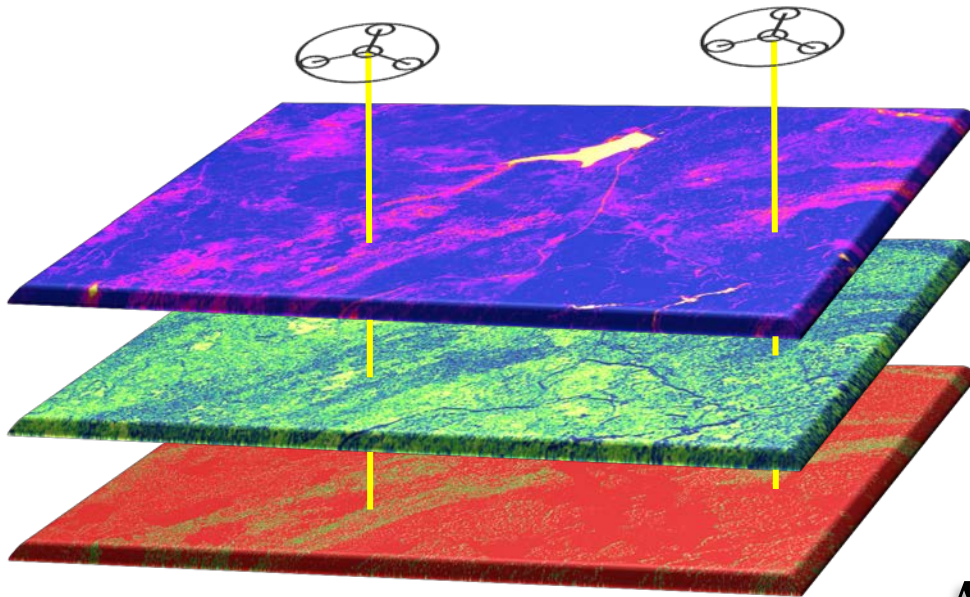
Modeling

Validation

Residue

Modeling AGB

Aspen



PCA Band 3

Horizontal Correlation

Shadow Probability

Aspen AGB, BAA & TPA

$R^2 = 0.69 - 0.78$

< Slide 17 of 30 >

Biomass

Modeling

Validation

Residue

Modeling AGB

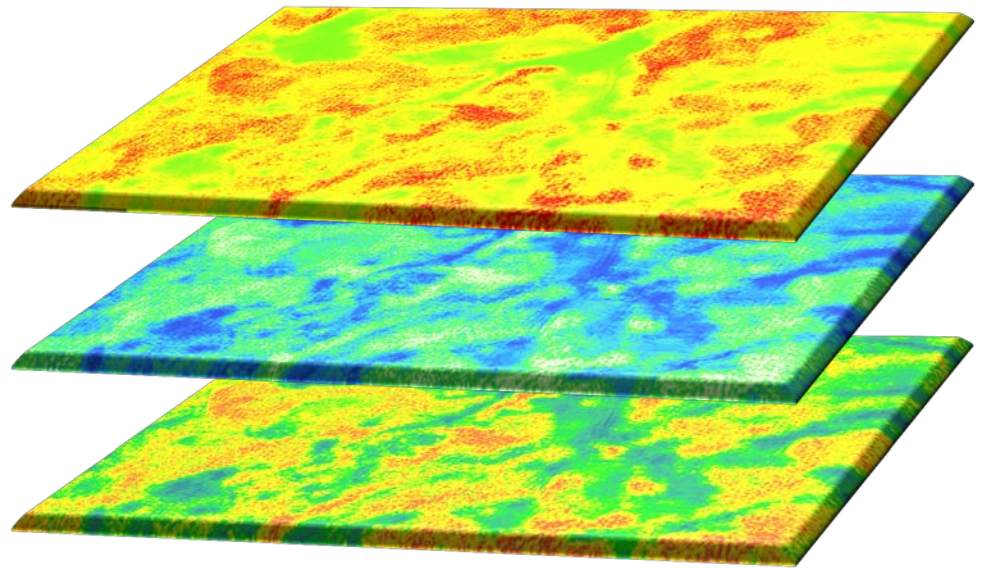
Combine Stage 1 & 2

Probabilistic
Outputs

$$AGB_i = \alpha + \beta_{ij}X_j$$

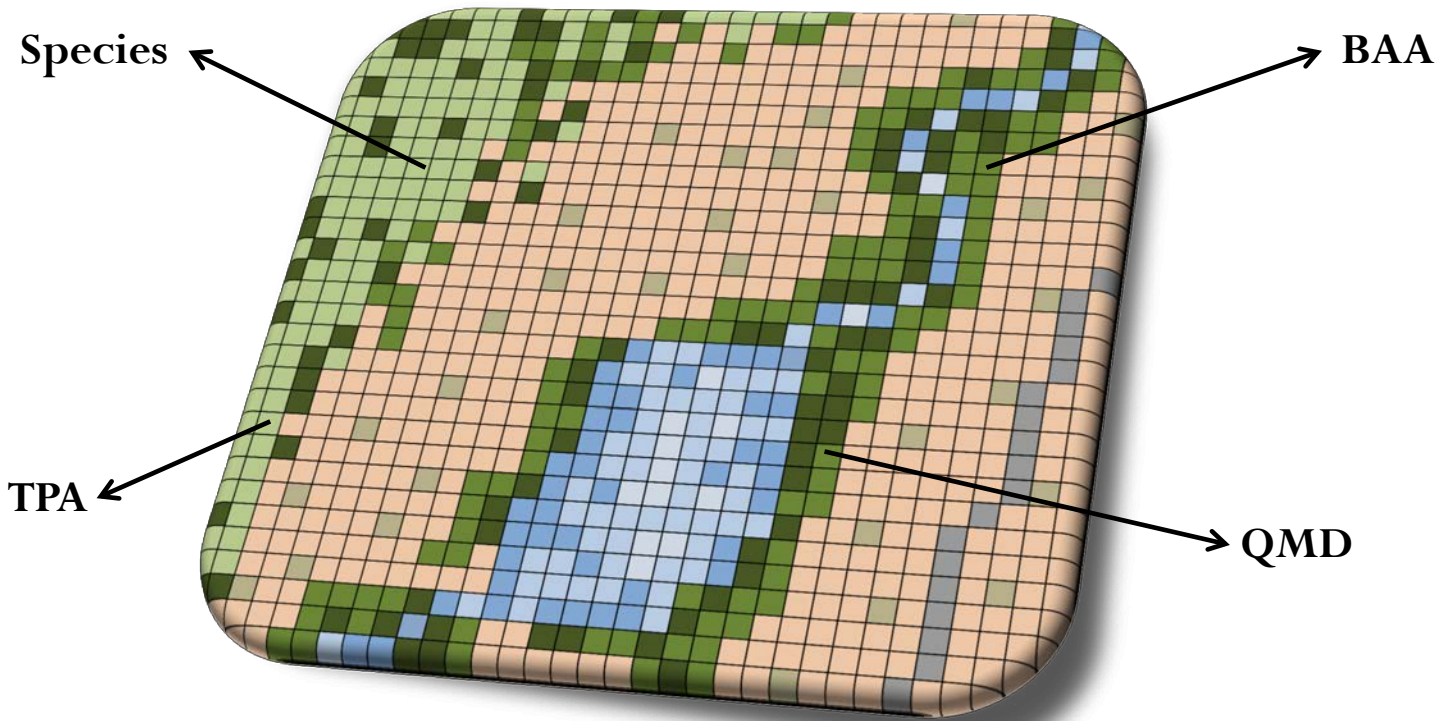
$$BAA_i = \alpha + \beta_{ij}X_j$$

$$TPA = \alpha + \beta_{ij}X_j$$



Validation

Land Cover Classification

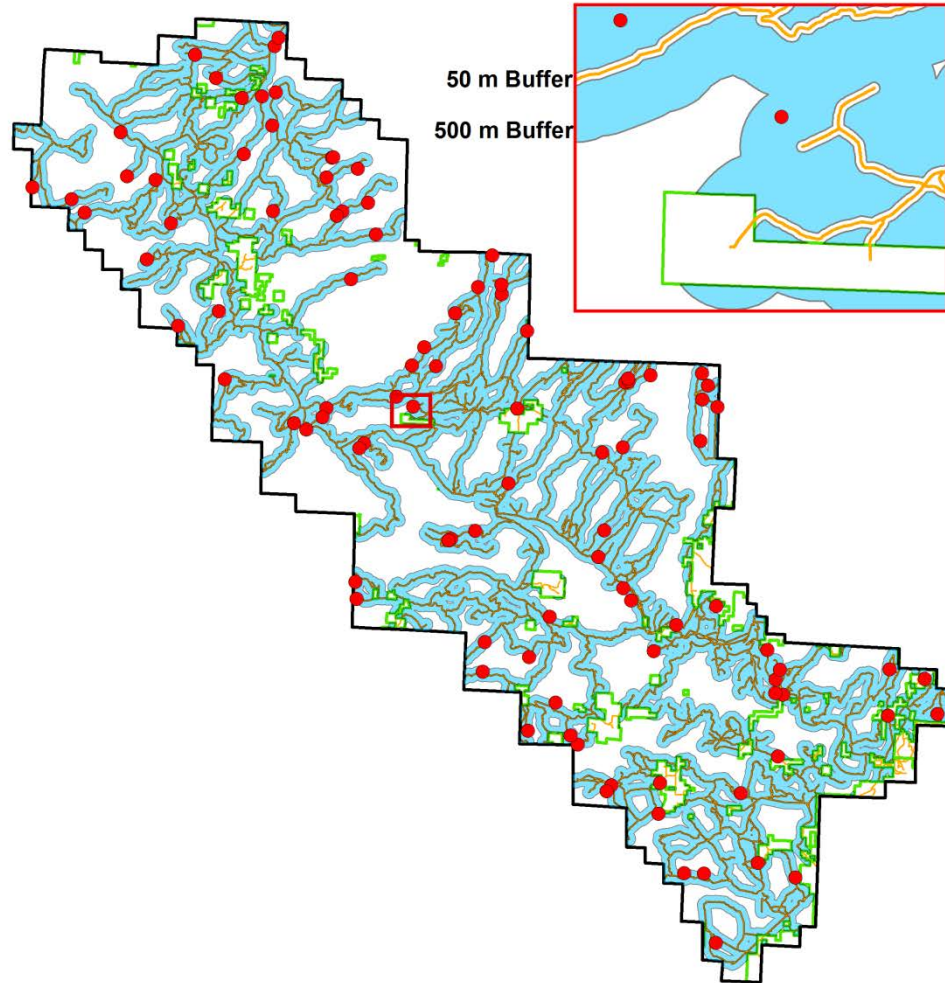


Validation



-  **Spatially Distributed Sample**
-  **Optimal Sample Intensity**
-  **Consistency**

Validation



< Slide 21 of 30 >

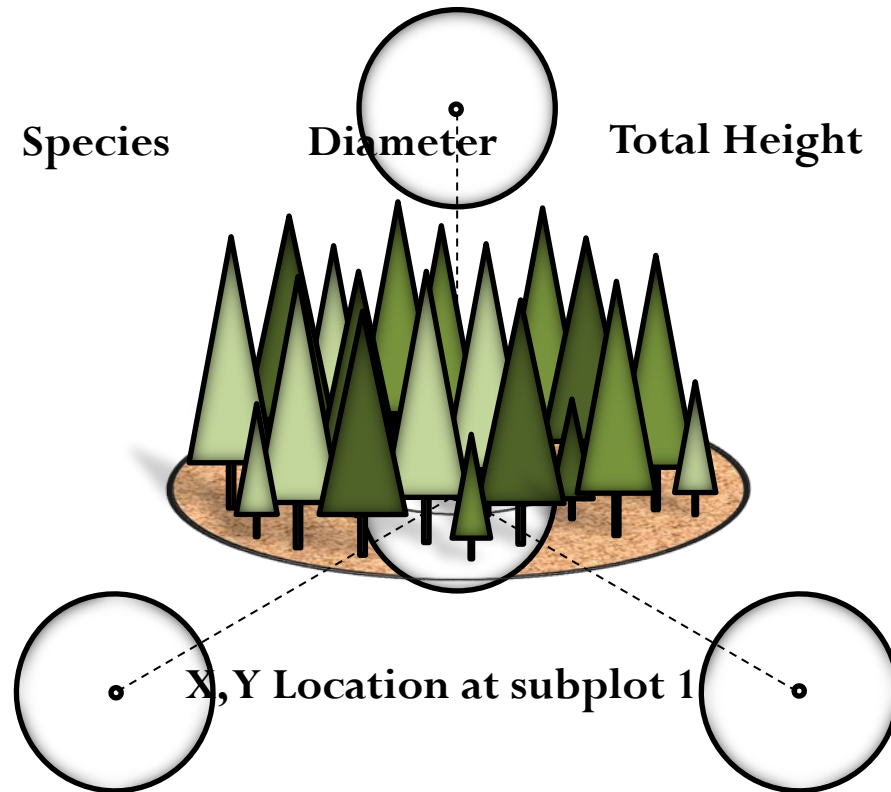
Biomass

Modeling

Validation

Residue

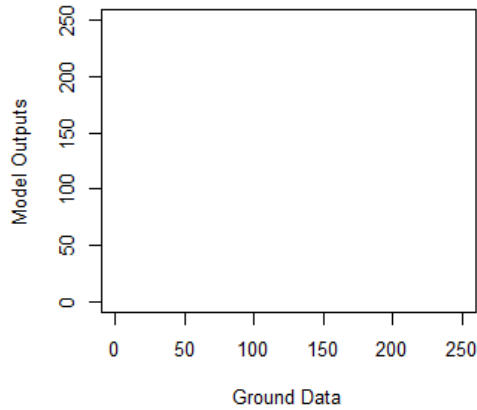
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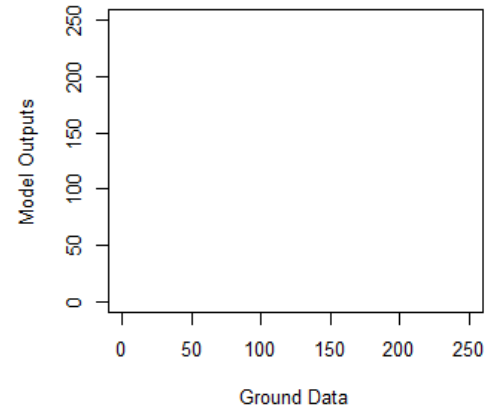
Validation



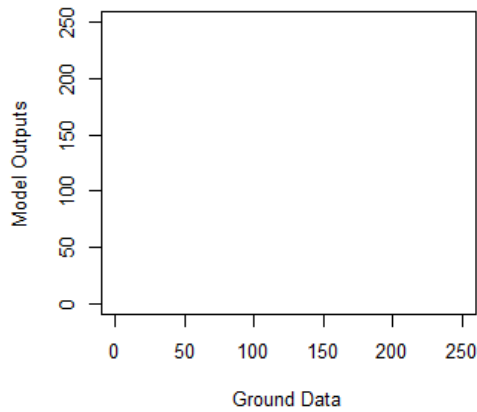
Aspen



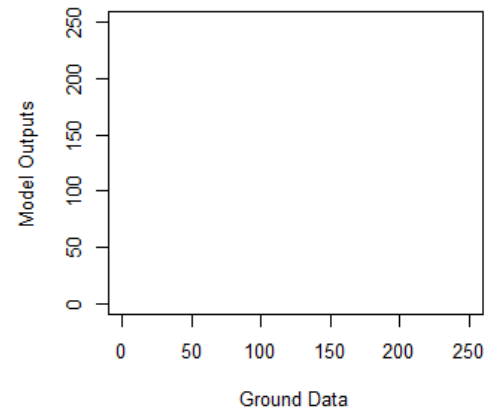
Pine



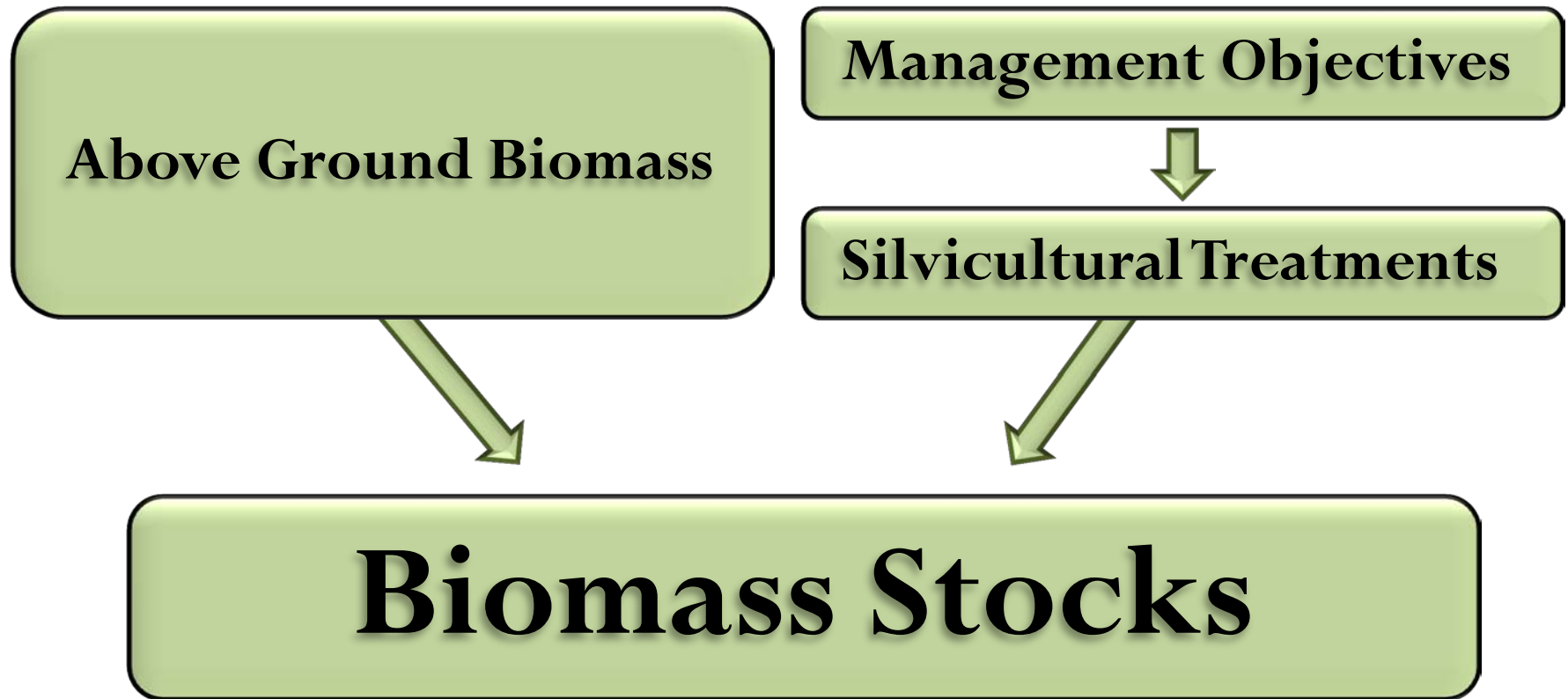
Pinyon/Juniper



Spruce/Fir



Treatment Residues



$$A_{bio} = (T - m)$$

$$R_{bio} = r(T - m)$$

T = total biomass

m = merchantable stock

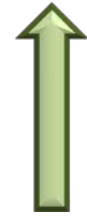
Recoverable Residues

r = % recoverable of available Available Residues




Treatment Residues

$$\text{Biomass Stocks} = \text{Total AGB} - \text{Merchantable Stock} - \text{Retention}$$



Treatment Residues

-  **Regional Sense of Merch**
-  **Estimate Merch for Field Data**
-  **Categorize by Characteristics**

< Slide 27 of 30 >

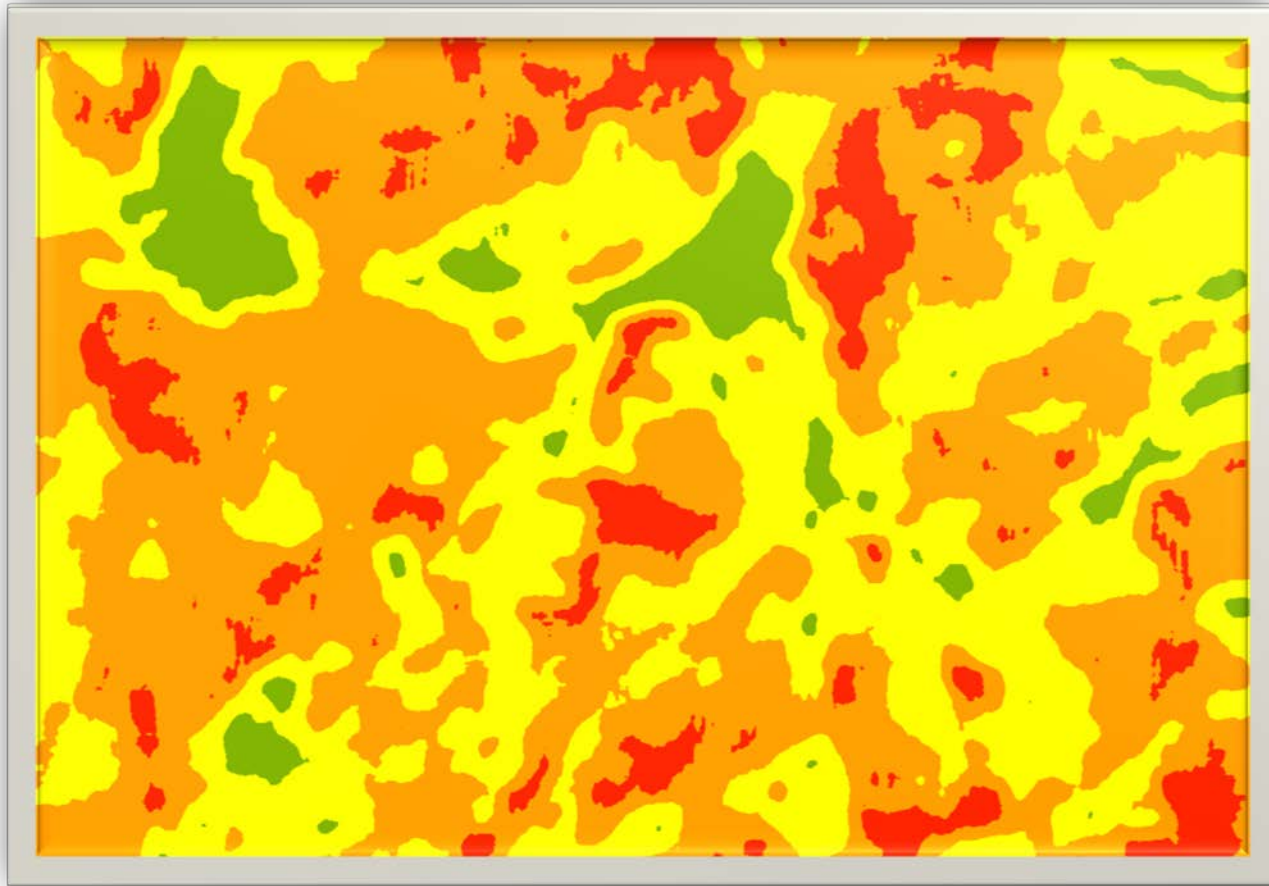
Biomass

Modeling

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Residue

Treatment Residues



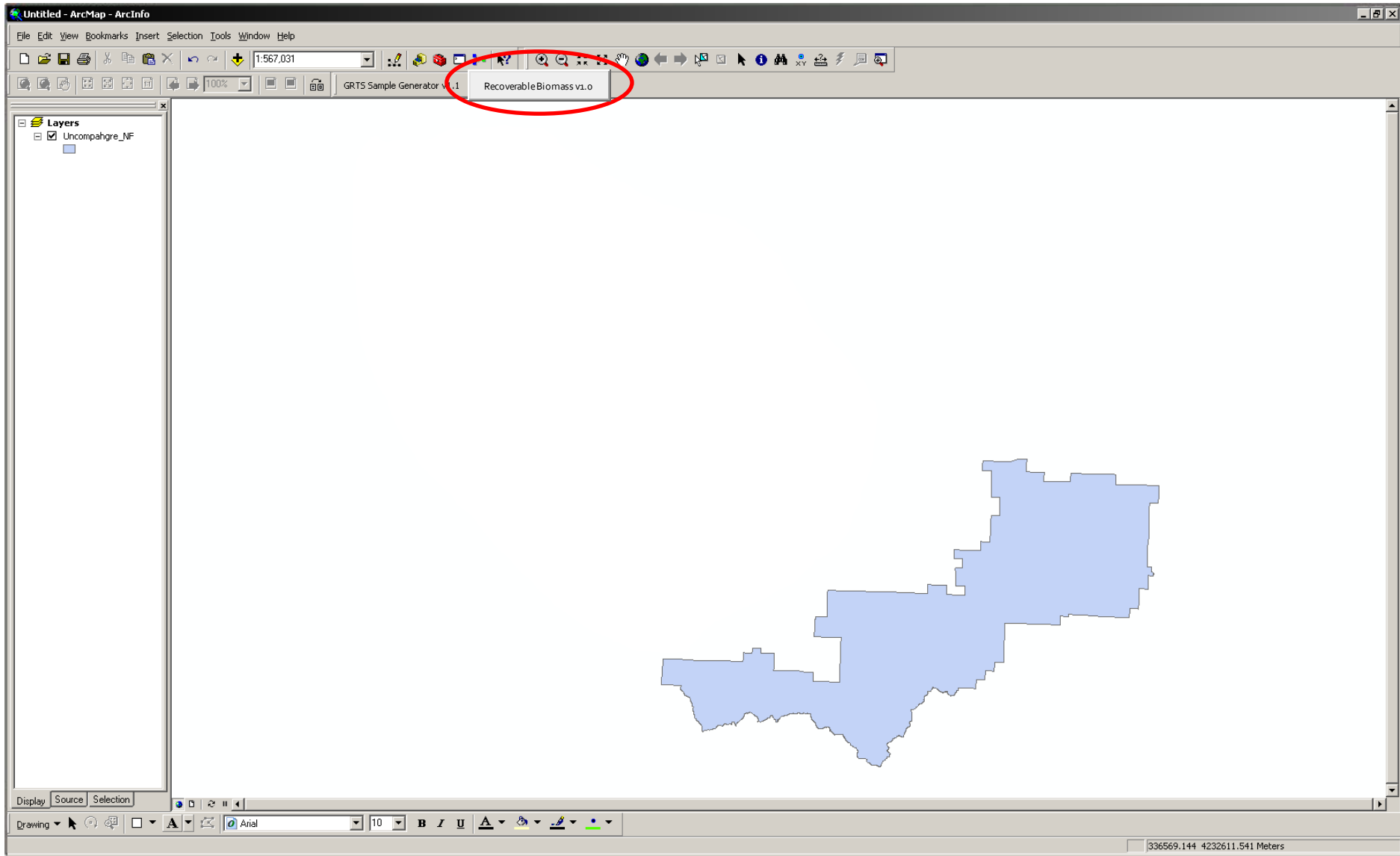
< Slide 28 of 30 >

Biomass

Modeling

Validation

Residue





Acknowledgements

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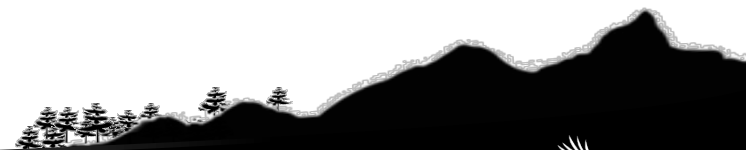
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