



# LiDAR Classification and Vegetation Analysis

Yuba River RMT Meeting  
Sacramento, CA

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# Watershed Sciences

- Mapping
  - Discrete Return LiDAR
  - Waveform LiDAR
  - Thermal Infrared Imagery
  - Airborne Digital Imagery
  - SoNAR
  - Hyperspectral
- Analysis
  - Hydraulic Modeling
  - Water Quality Modeling
  - GIS Feature Extraction
  - Forest Inventory/Fuels
  - Habitat Assessments
  - Visualization



# Vegetation Research Affiliations

**Precision Forestry Cooperative – University of Washington/USFS PNW Research Laboratory, Seattle, WA**

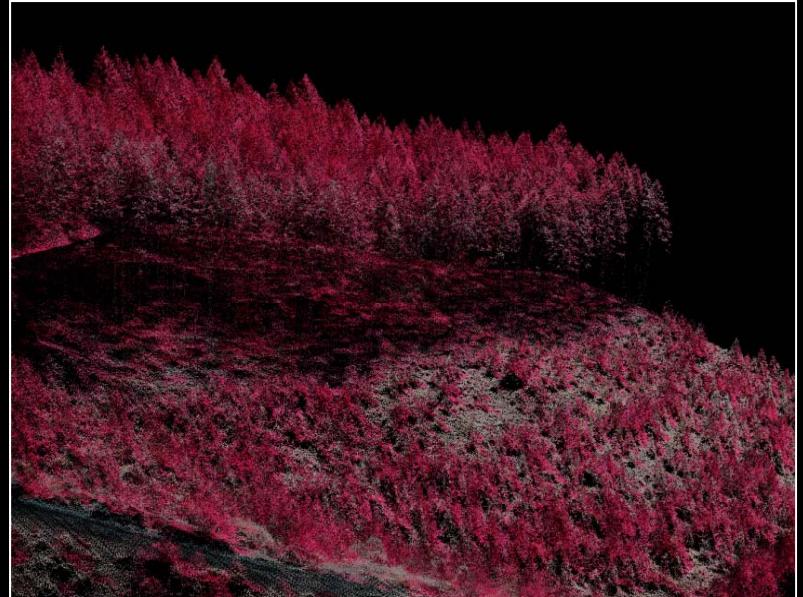
**Oregon State University/USFS PNW Forest Sciences Laboratory, Corvallis, OR**

**Rocky Mountain Research Station, Moscow, ID**

**US Forest Service Research Lab, Portland, OR**

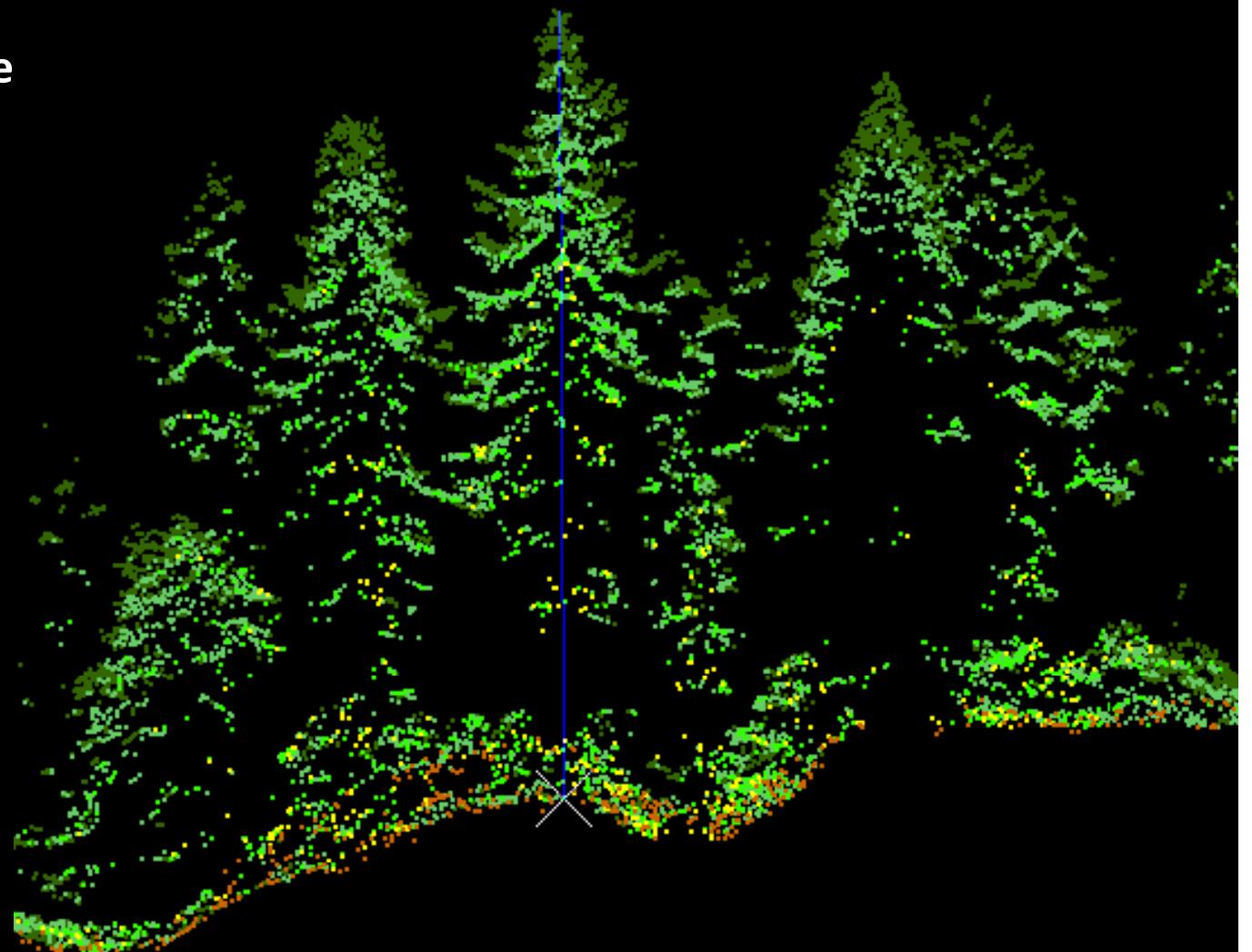
**Panther Creek LiDAR Research, BLM**

**Private Industry**

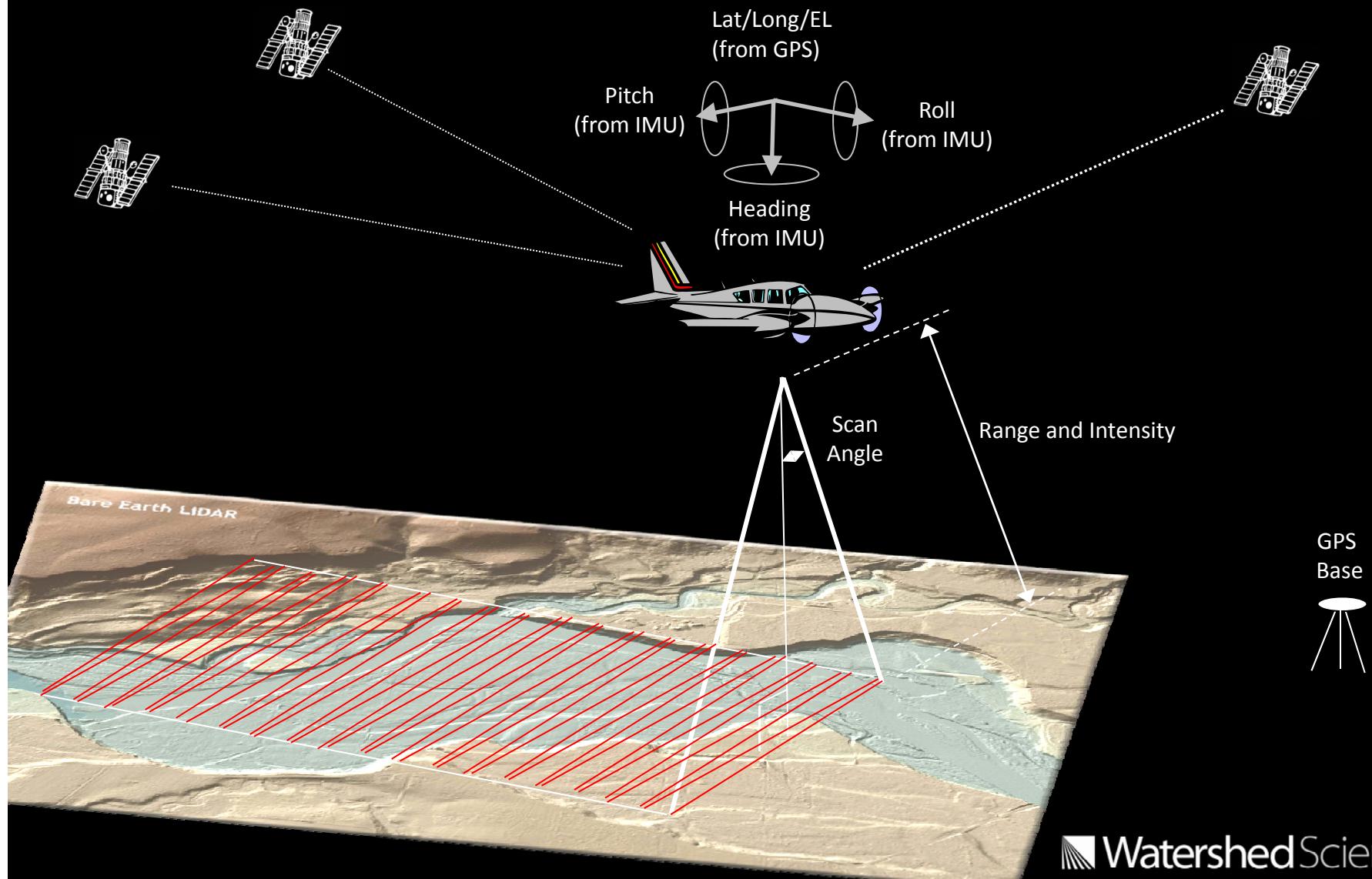


# Light Detection and Ranging (LiDAR)

In its most basic form, LiDAR Data are just points



# Airborne LIDAR systems employ technologies that include...



# LiDAR Systems/Hardware

Airborne Platforms



Airborne LiDAR Systems



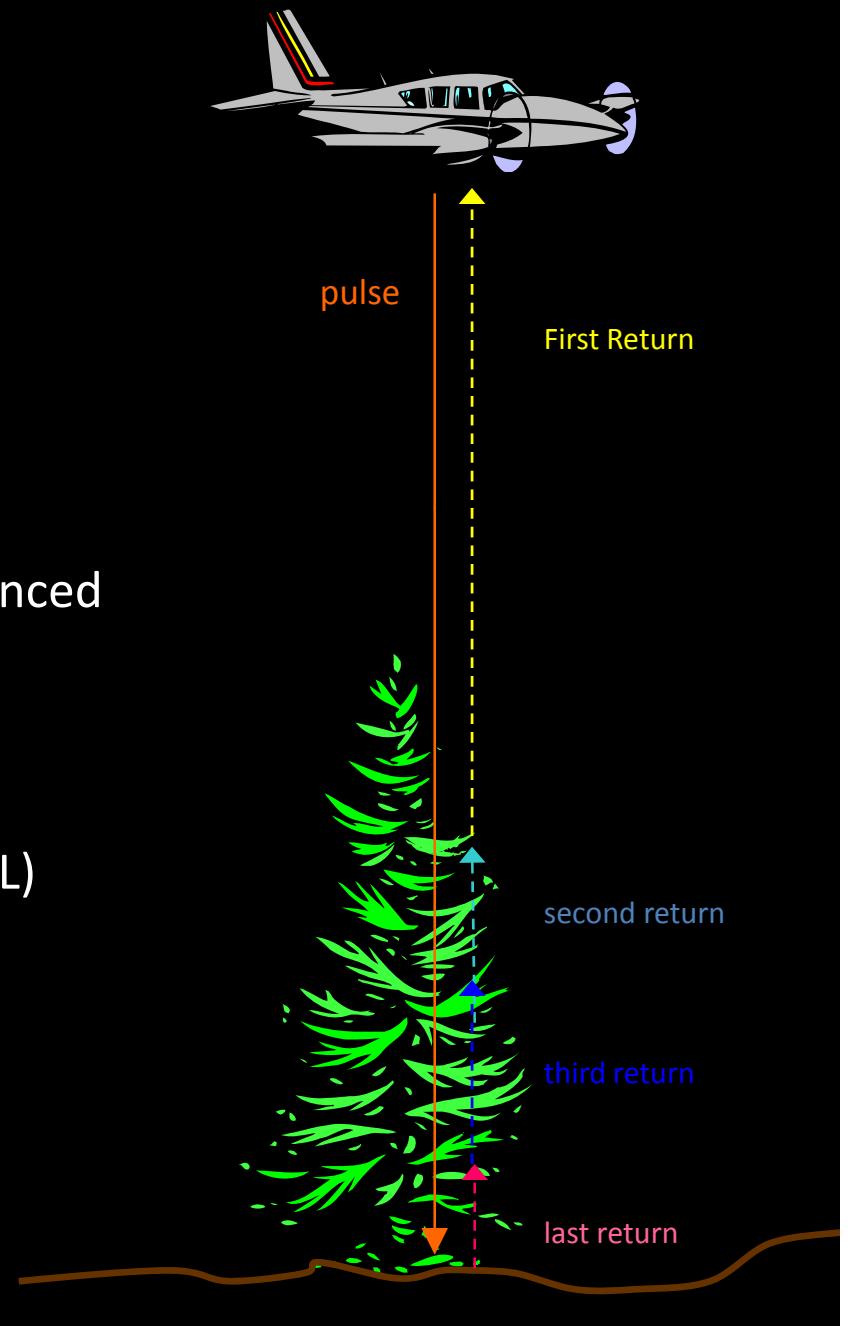
Ground GPS Systems



# Airborne LiDAR Concepts

small footprint, discrete return system

- Up to 200,000 pulses per Sec (200 KHz)
- Up to 4 returns per pulse
- Each LiDAR return is individually geo-referenced
- Records intensity of backscatter
- Sub-meter footprint (~22 cm @ 1000 m AGL)



# In its most basic form, LiDAR Data are just points

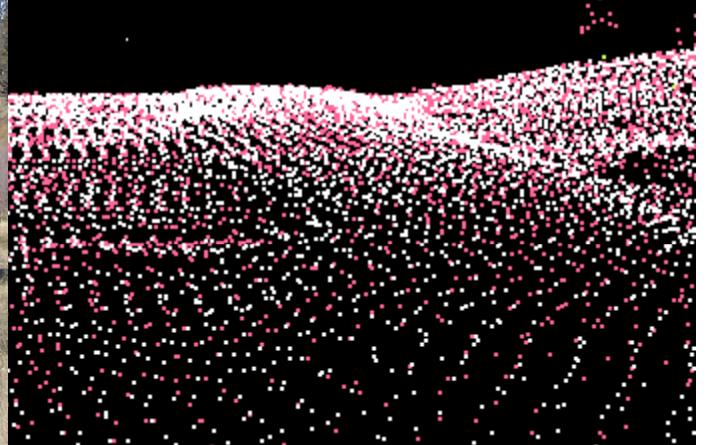
*Ponderosa Pine and Juniper*



Multiple Laser Returns  
are Apparent

*First Return*  
*Second Return*  
*Third Return*  
*Fourth Return*  
*Ground Points*

Penetration  
↓



## Going from Points to Surfaces... Modeling Data

- Data clouds are massive
- TINs from data clouds
- GRIDs from TINs (Interpolated Surface)
- GRIDS are smaller and easier to work with

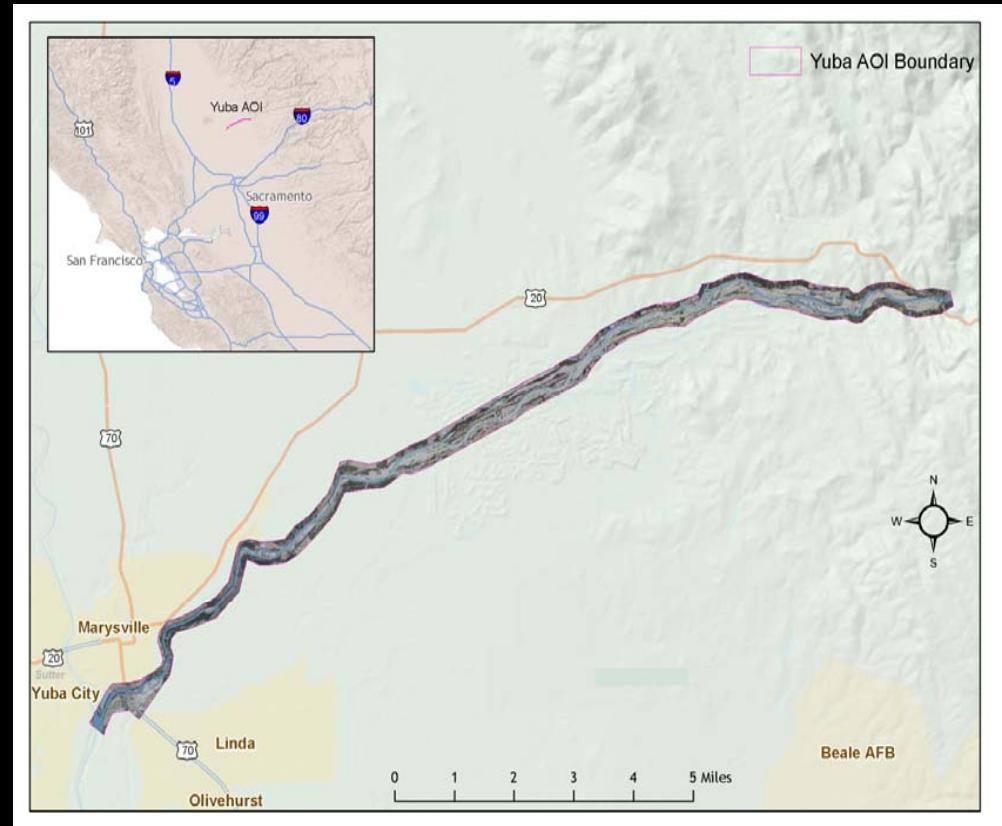


All Returns  
Colored by Intensity

Dayville, OR

# Yuba River Project Objectives:

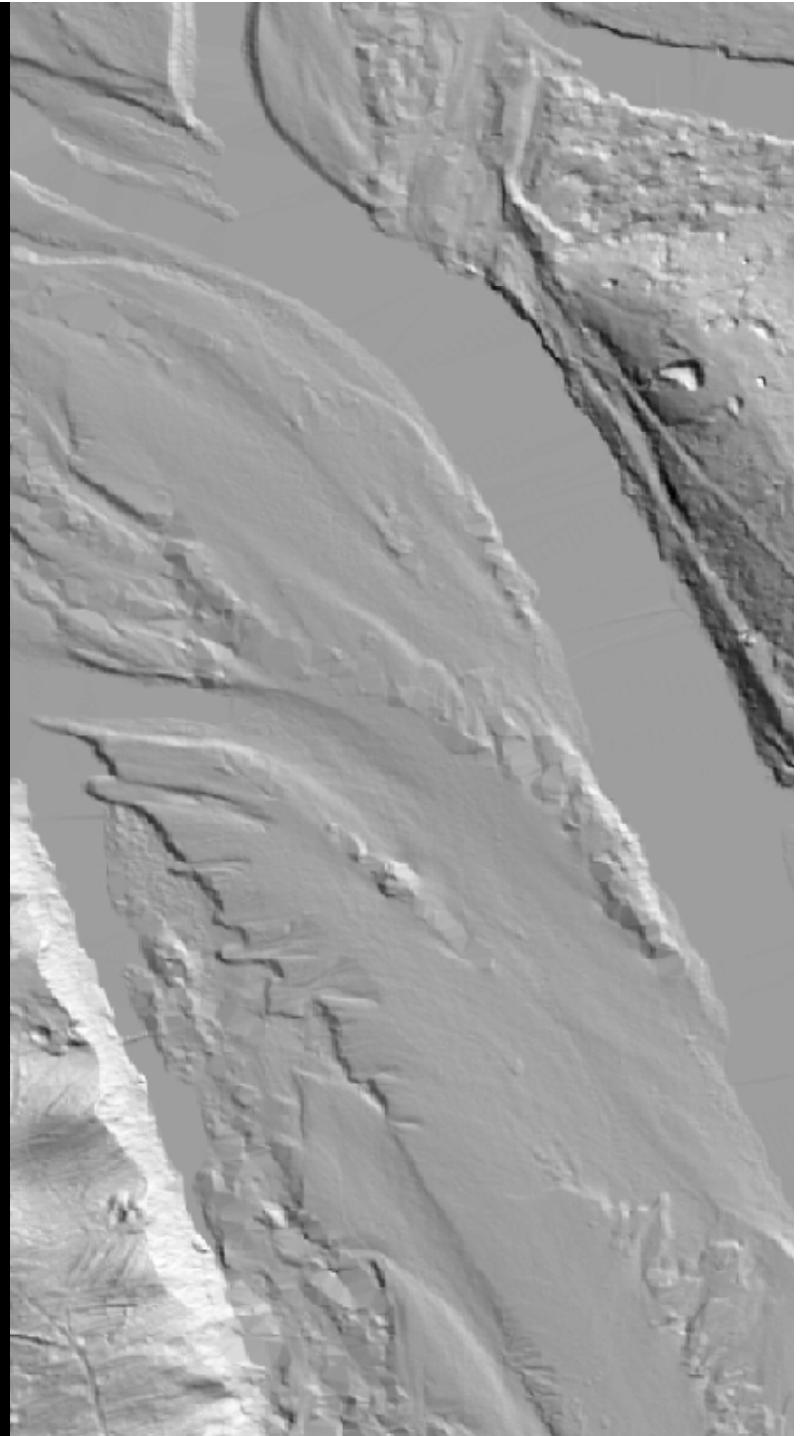
- Removal of artifacts in existing LiDAR that was not collected or calibrated by WSI.
  - Reclassification of ground and vegetation pts
  - Creation of water surface elev. model
- Vegetation Surface Model
- NDVI from 2009 NAIP Imagery
- Derive Vegetation Metrics
- Classify Vegetation Types



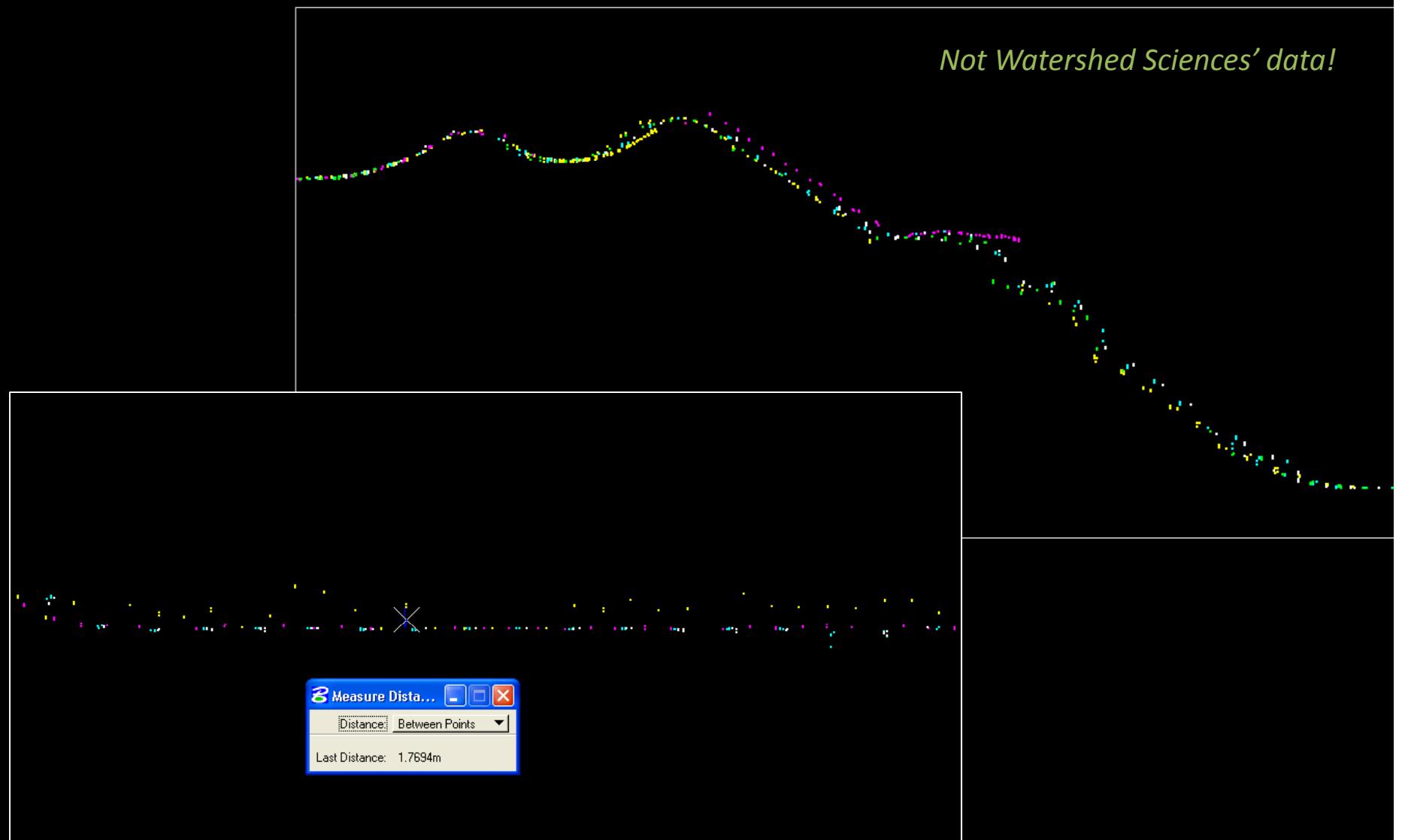
*Existing LiDAR Provided to WSI by Yuba River RMT and UC Davis.*

# Ground Classification

- WSI Techniques:
  - Automated Ground Classification
  - Manual Review and Edits
- Existing Data Issues:
  - Very Poor Calibration and Offsets
  - Conditioning of Points

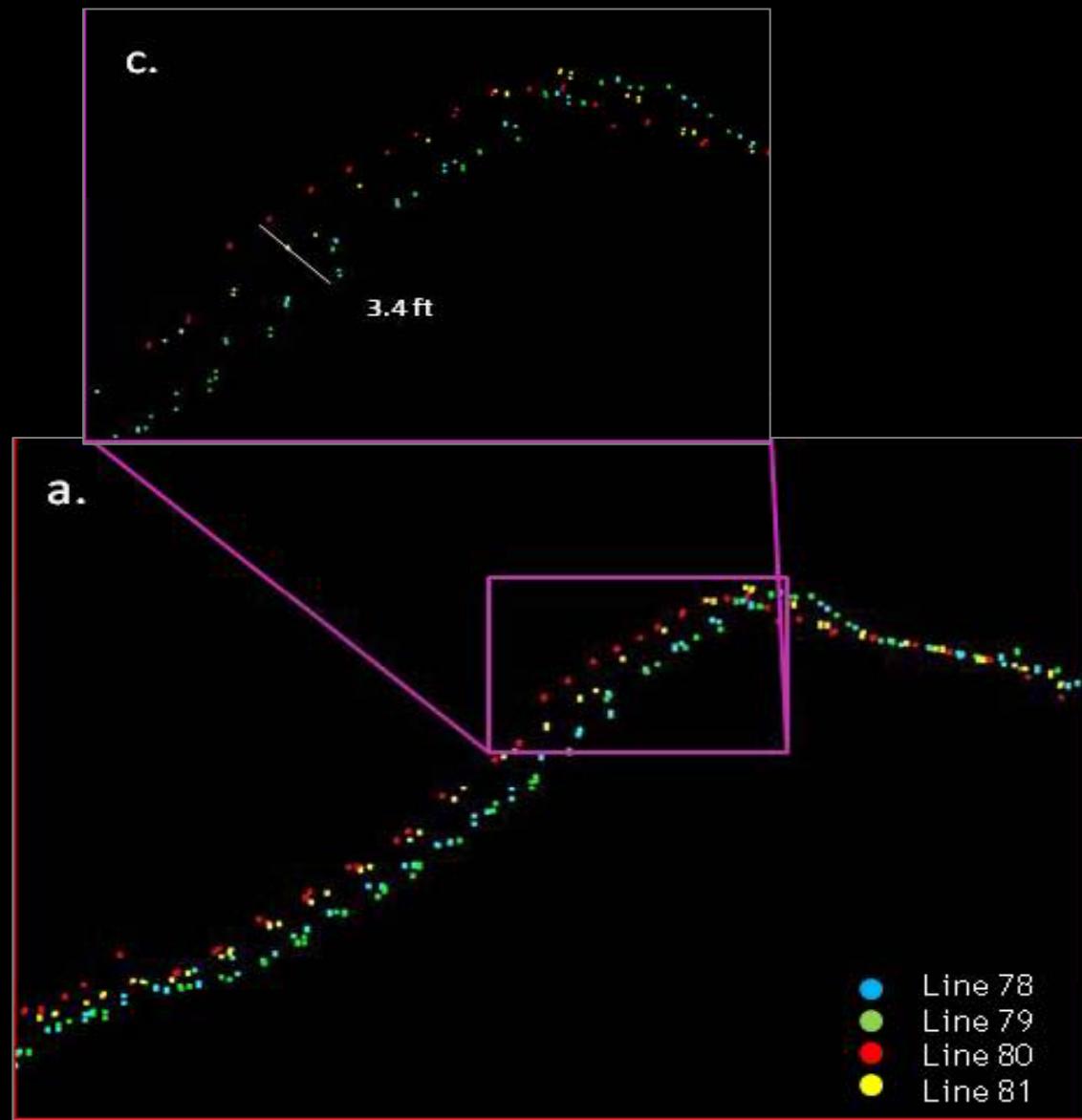


# Localized Offset Errors - Yuba River Data

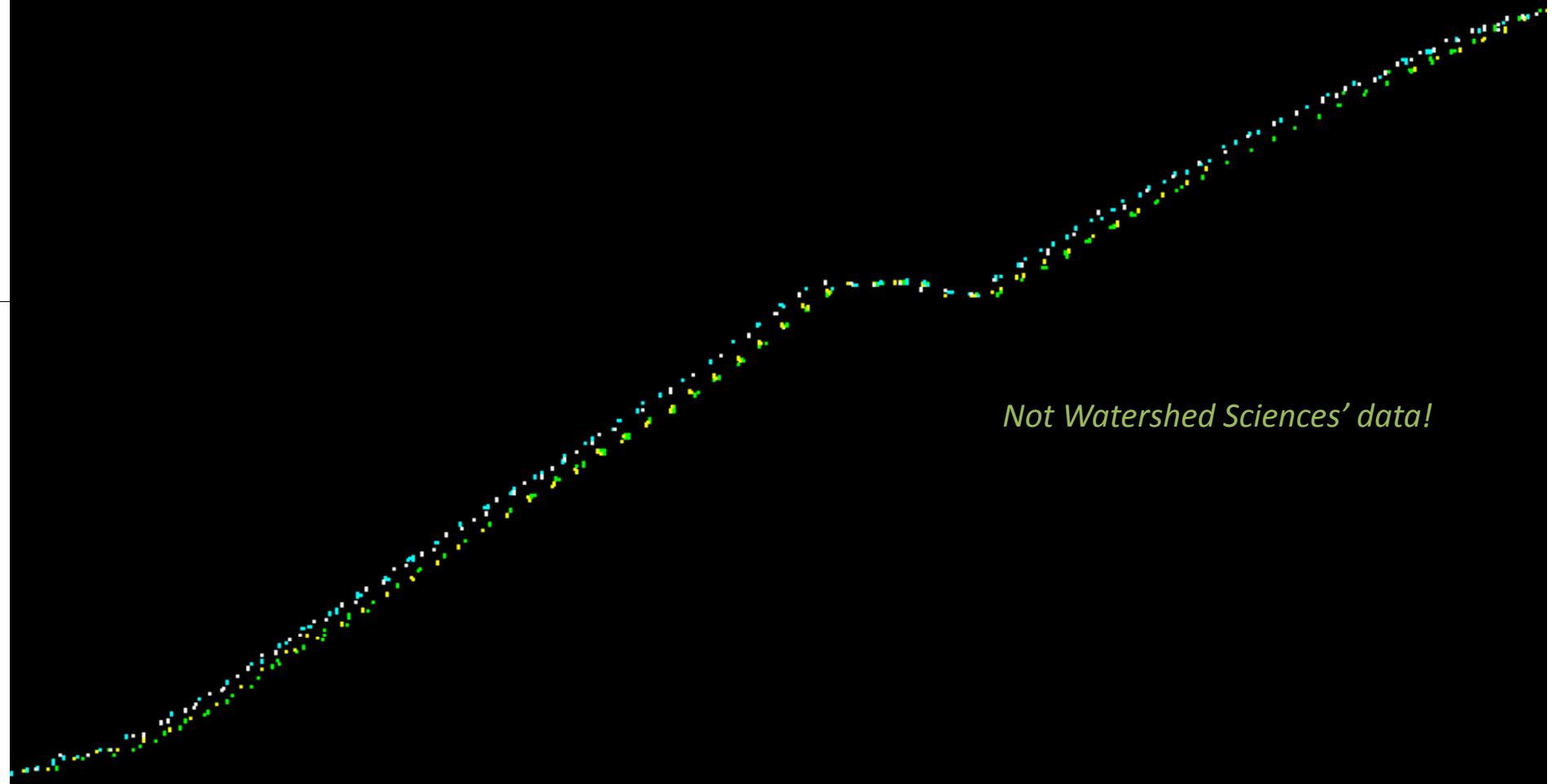


# Relative Accuracy: Another Example

*Not Watershed Sciences' data!*



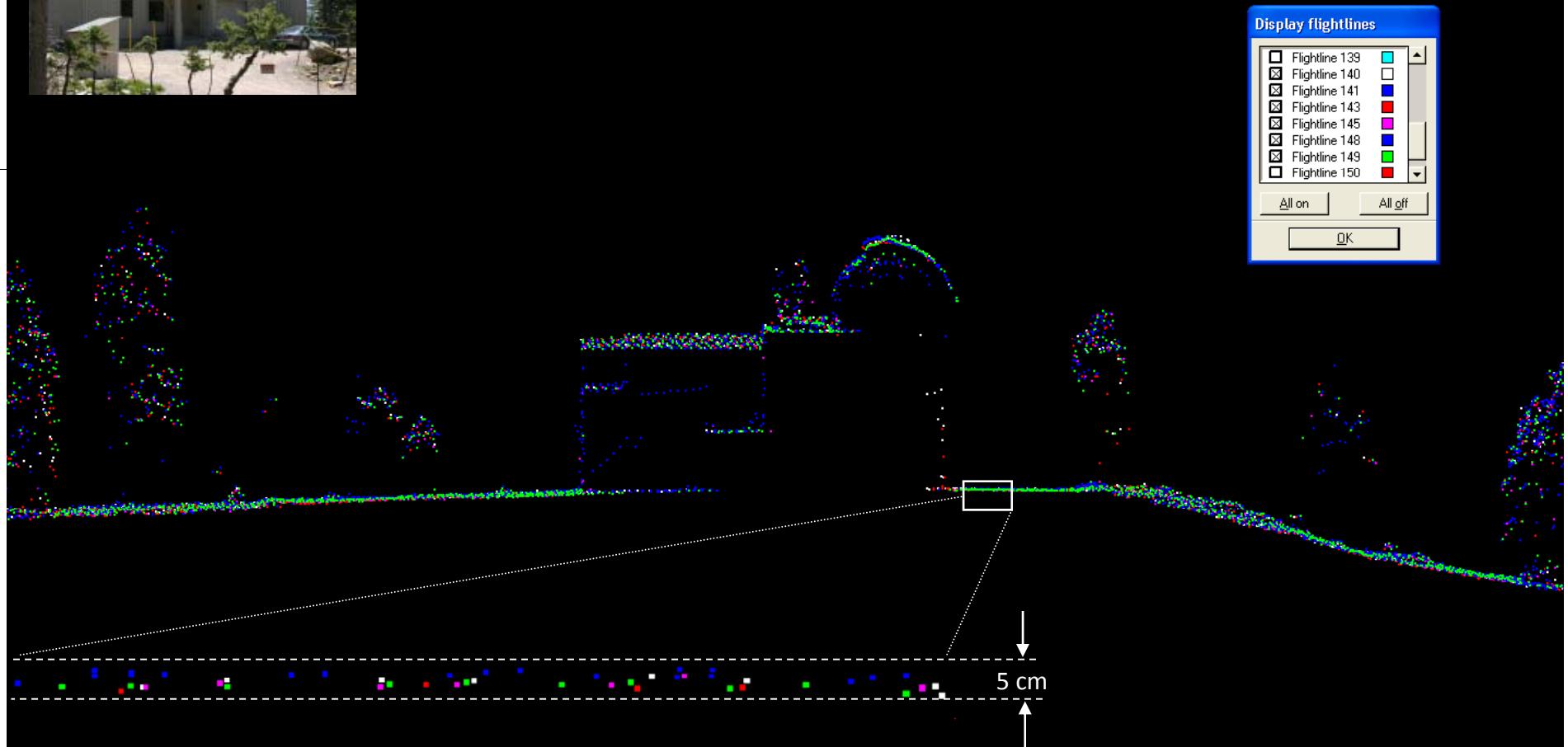
# Existing Data: Hillslope to Road Offset





# Relative Accuracy Example

- A measure of system calibration
- Measured as the divergence of points from different flight lines



# Hydro-Flattened Water Surface

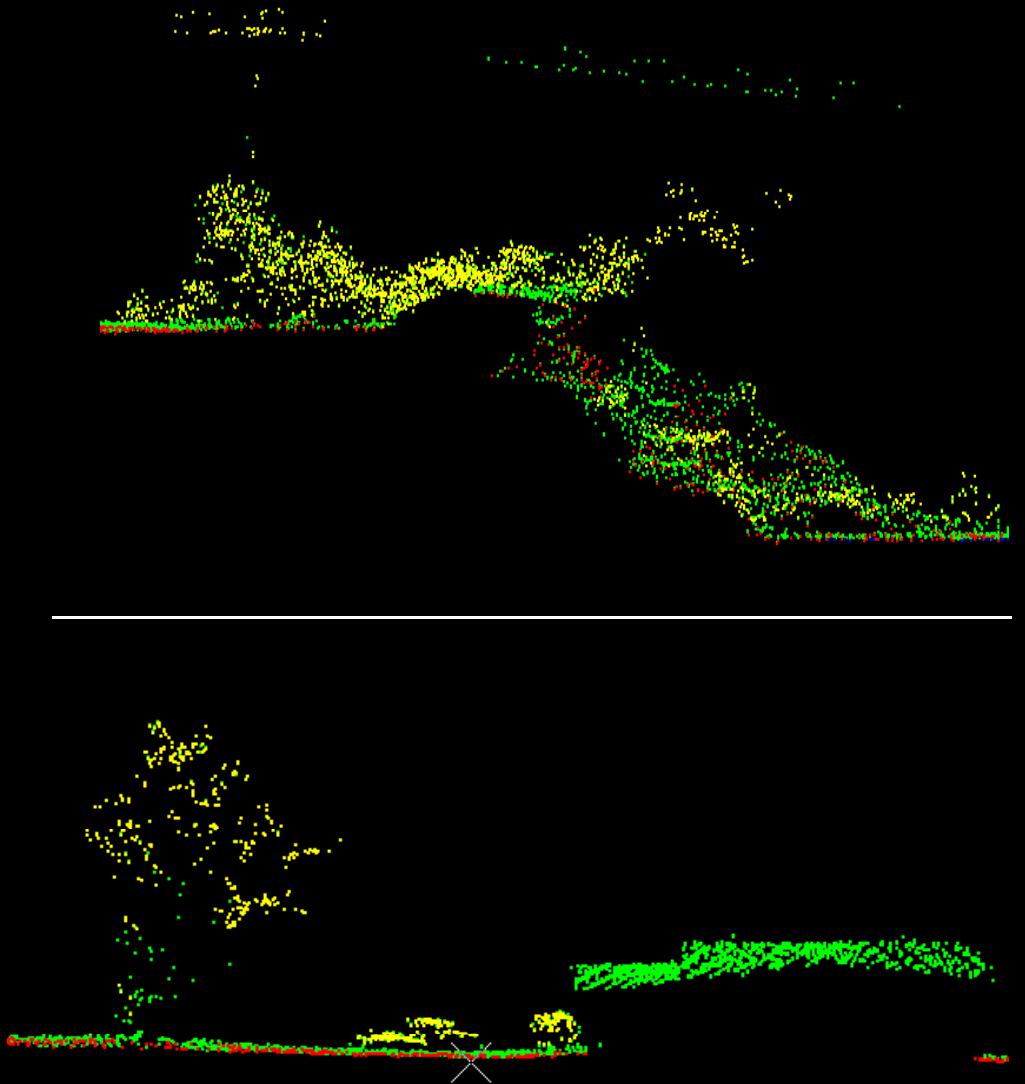
- Water's edge break line created using Lidar-grammetry.
- Breaklines enforced in the ground classified returns to create a true water surface.
- Breaklines used to re-class water points.



# Vegetation Point Classification

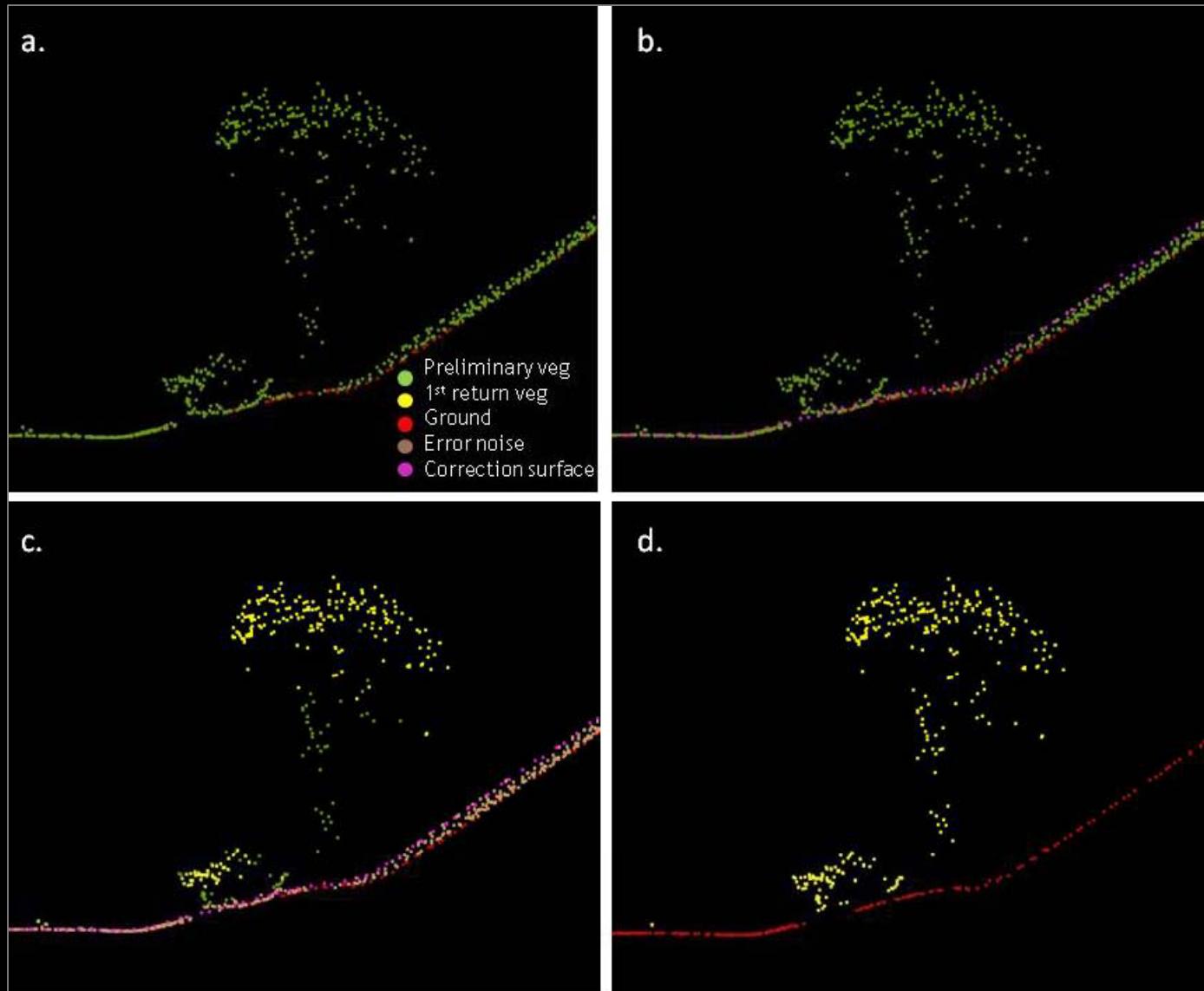
## Workflow:

1. Man-made structures automated reclassification with manual review.
2. Correction surface was developed to account for localized misalignments.
3. Removal of noise points and secondary returns.



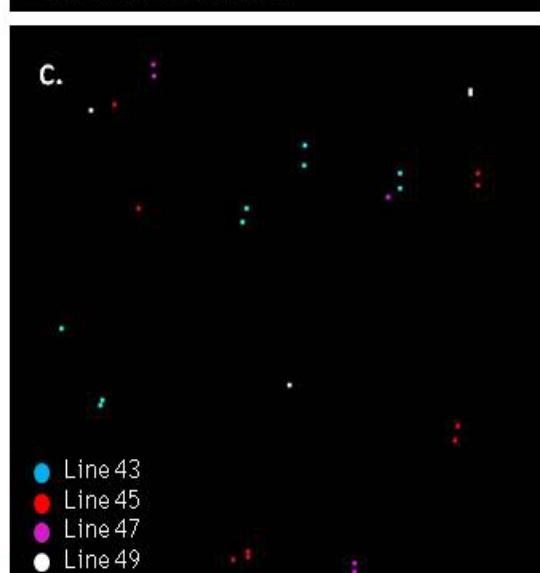
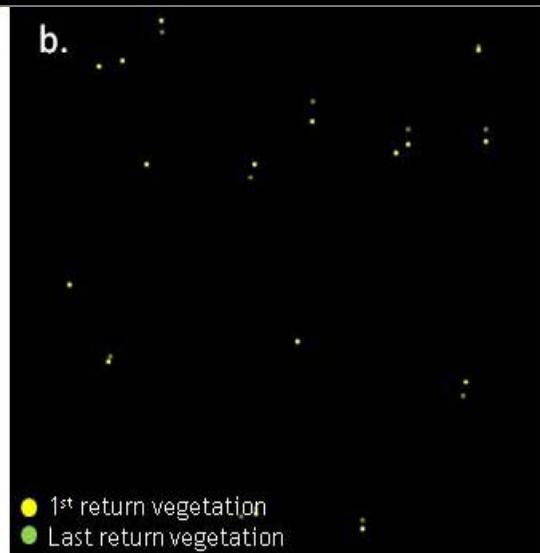
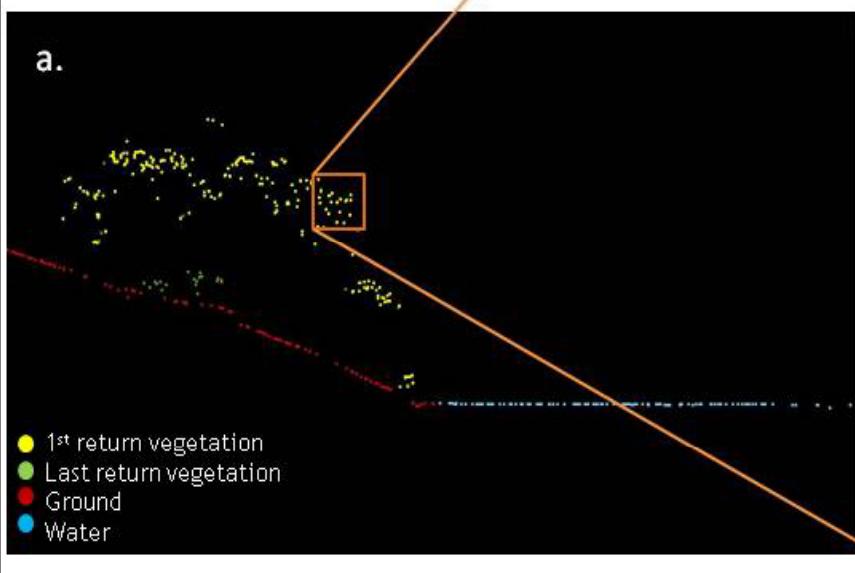
# Correction Surface

## Vegetation Point Classification



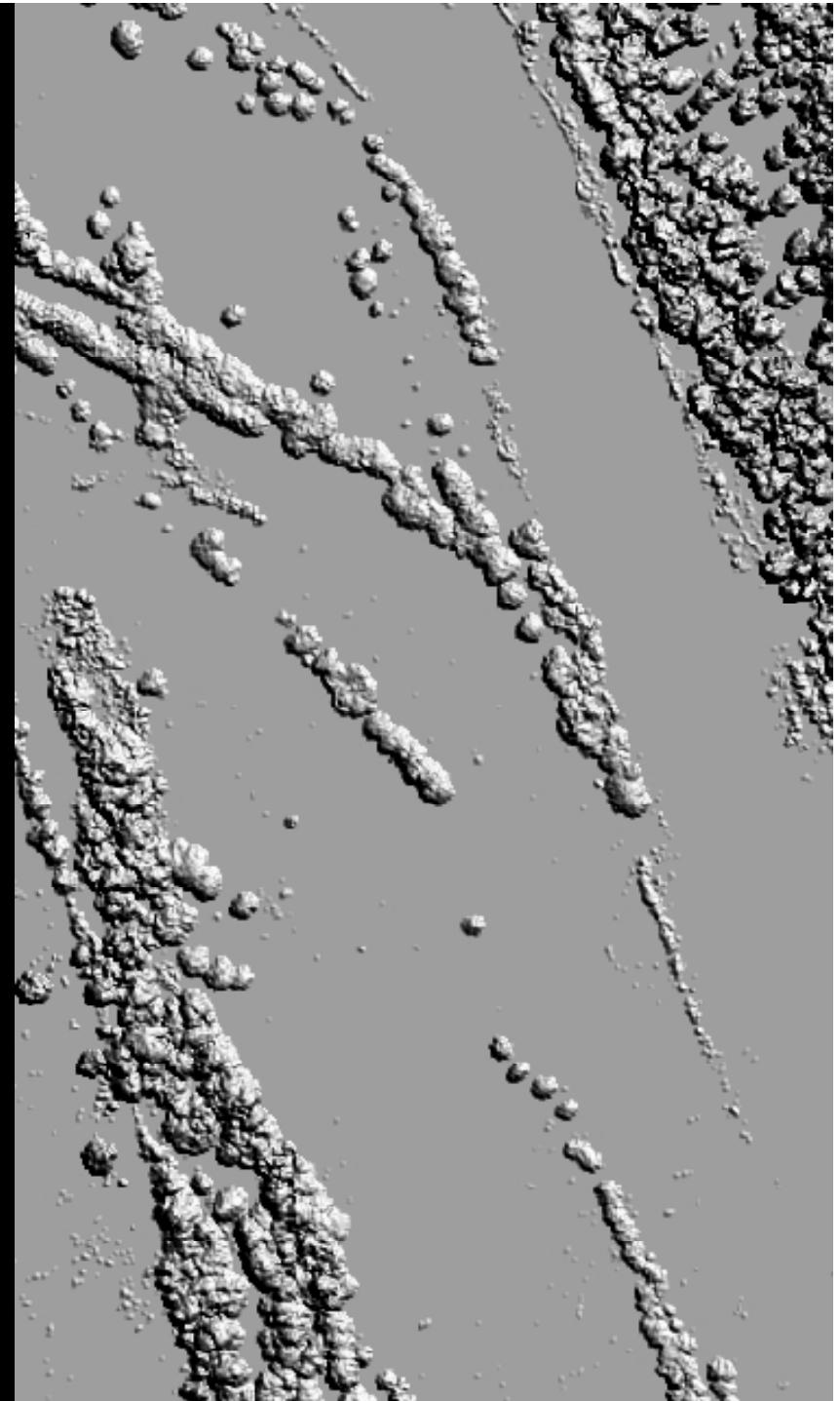
# Removal of Duplicate Points

## Vegetation Point Classification



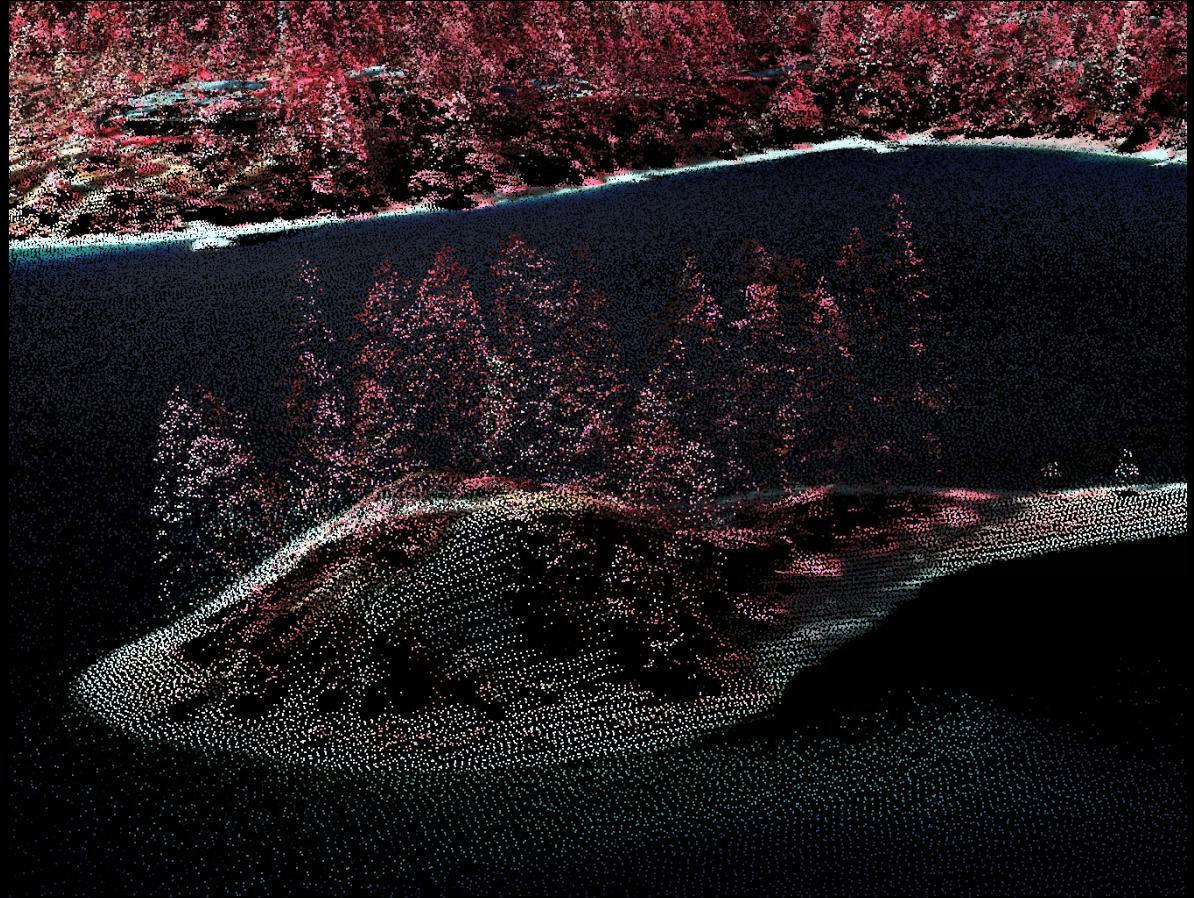
# Vegetation Height Model

DEM Created from the vegetation classified points normalized to the ground model



# Vegetation Characterization

LiDAR point cloud provides the basis for deriving vegetation metrics to characterize structure at the stand or tree approximate scale.



Swan Lake; Flathead Lake, MT

# Stand Type Delineation Workflow:

1. Assemble data stack: 8.9 meter (29 ft) spatial resolution raster layers derived from LiDAR point cloud.
2. Principal Component Analysis: Selection of layers that account for the variability in the data strata .
3. Segmentation from PCA Data Strata: Multiple Methods Available...
  - Unsupervised using ISODATA algorithms.
  - Object-oriented classification using rules-based analysis.
5. Aggregate to Final Classes: Final LiDAR based stand types and height classes.
6. Accuracy Assessment: Using tree-plot data, calculate user, producer and overall accuracies and kappa statistics for each segmentation.

# Common Vegetation Metrics:

PCA selection of data strata can vary depending on the land cover and analysis objectives.

- Vegetation Height (P90): Height at which 90% of LiDAR returns fall below.
- Stem Density: # of local maxima per cell. Relative measure of density between forest stands.
- Standard Deviation of Height: Std deviation of local maxima per cell.
- Canopy Cover: % total returns over returns above a specified threshold.
- Canopy Height Model: Point elevations normalize to ground elevations.
- LiDAR Intensities: Normalized 1<sup>st</sup> return intensities.



# Automated Data Strata Sampling

WSI LiDAR Feature Extraction Tool: In-house tool developed to generate vegetation metrics and other feature classifications. Capable of generating over 114 metrics/data strata.

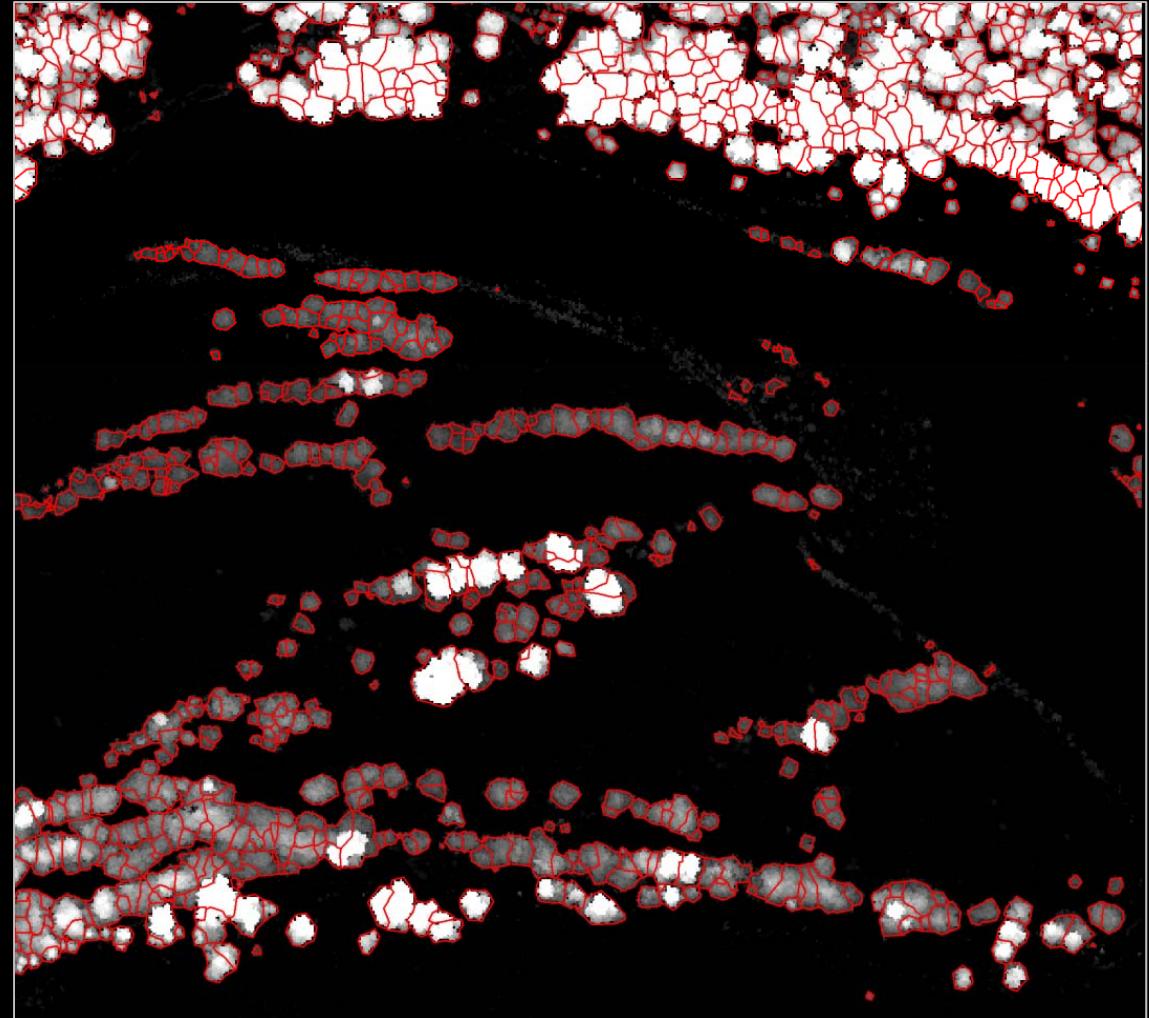
USFS “Fusion” Model: Developed at Pacific Northwest Research Station, Seattle. Capable of generating 100+ LiDAR metrics/data strata.



# Tree Approximate Segmentation

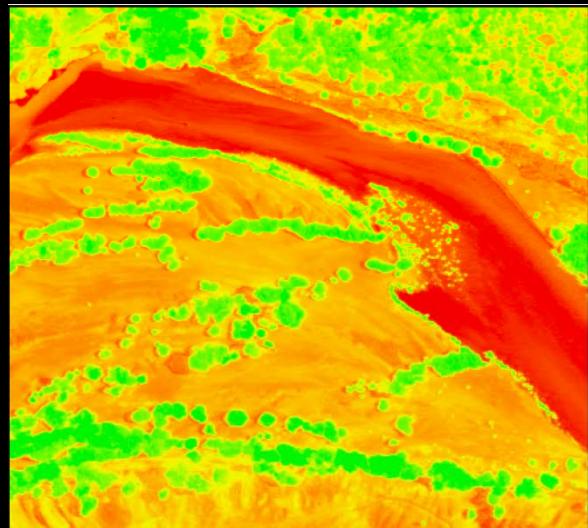
Inverted Normalized Vegetation Height Model

- Low pass filter
- Watershed Delineation

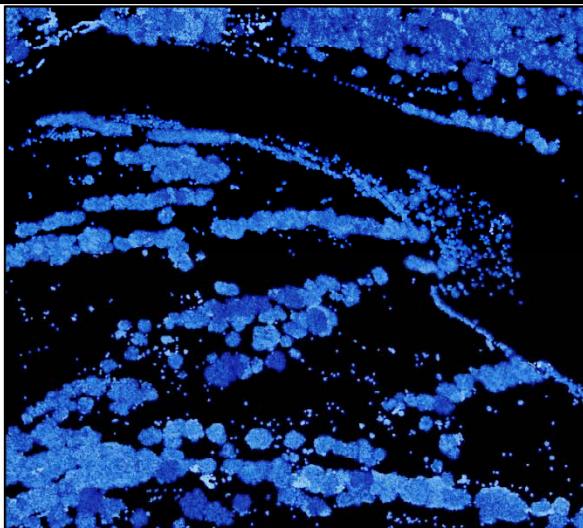


*Tree polygons over intensity image*

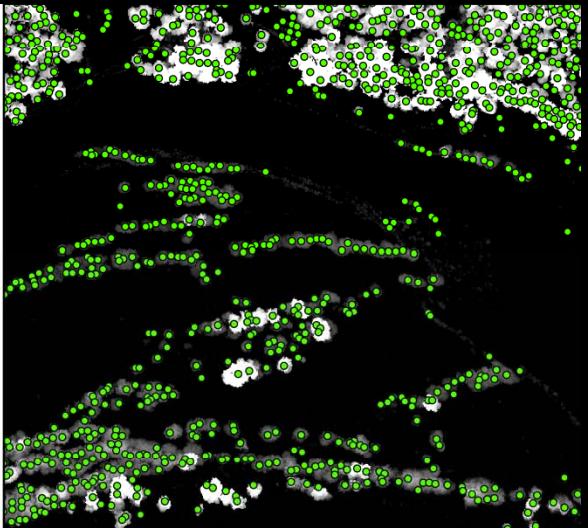
## Other Base Data Layers



NDVI



LiDAR Intensities

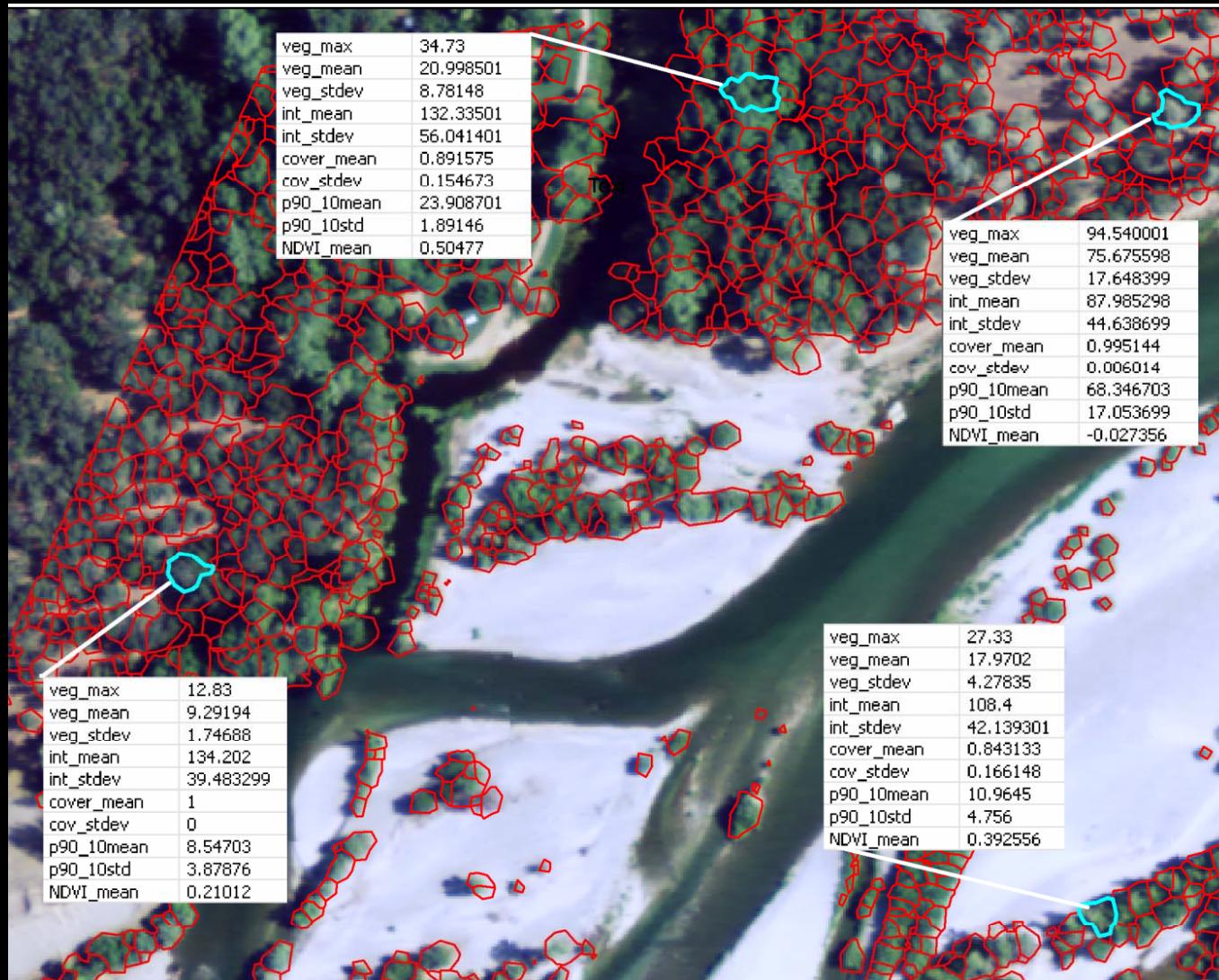


Tree Crowns

# Primary Data Stack



# Statistics per Tree Segmentation



# Individual Tree Metrics: Height

Individual tree height is a critical variable in forest biomass, carbon stocks, and growth and site productivity.

DBH is not measured directly, but highly correlated w/ LiDAR derived tree height and crown width

Individual Height Accuracies (Anderson et. al.):

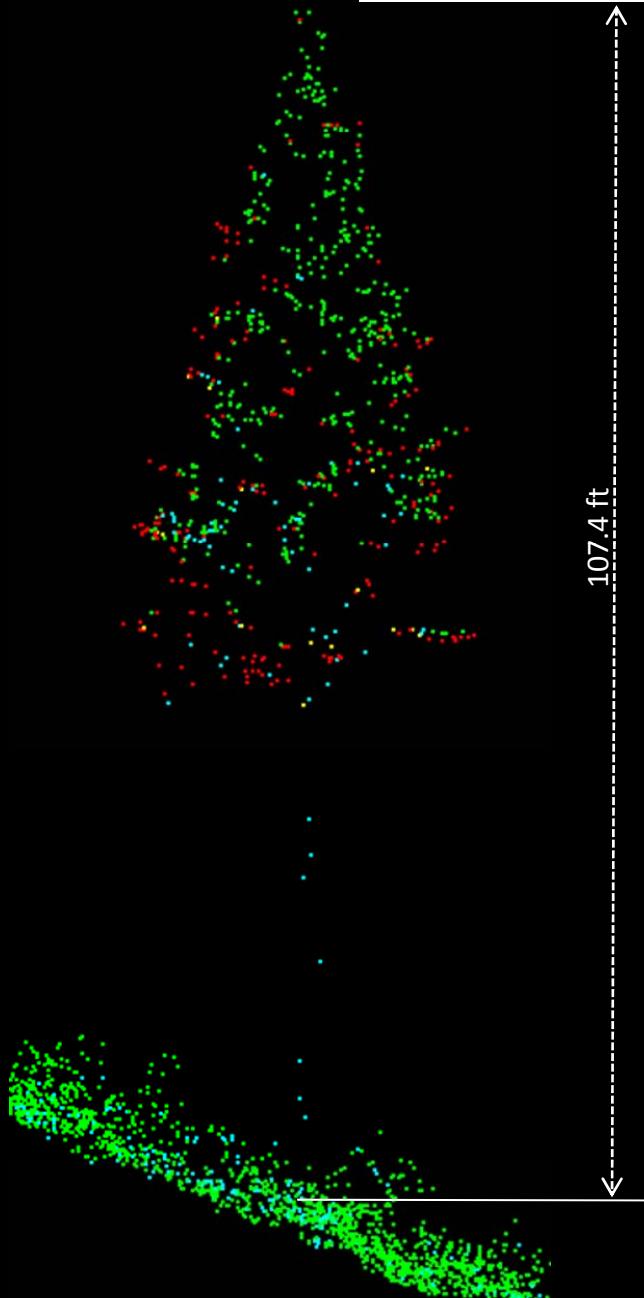
LiDAR @ 6 pulses/sq m:

*Ponderosa Pine:*  $-0.43 \pm 0.13 \text{ m}$

*Douglas Fir:*  $-1.05 \pm 0.41 \text{ m}$

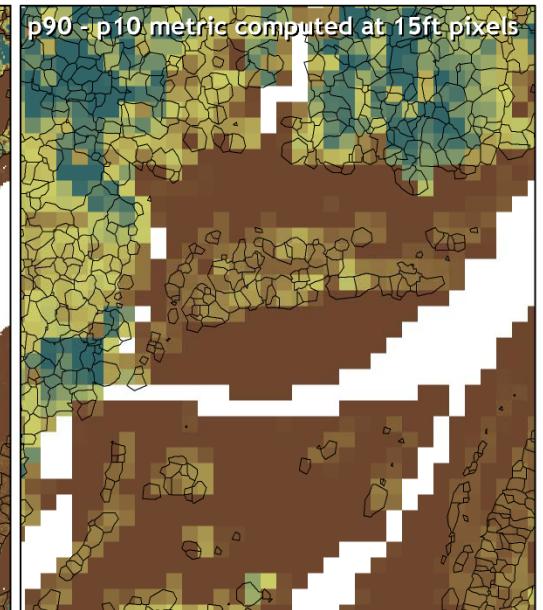
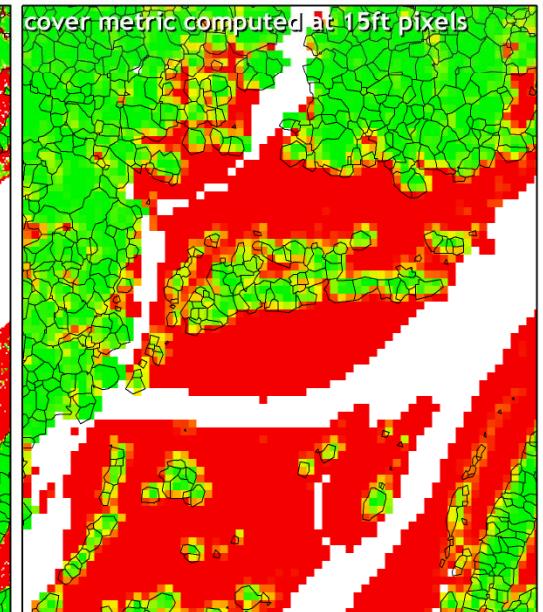
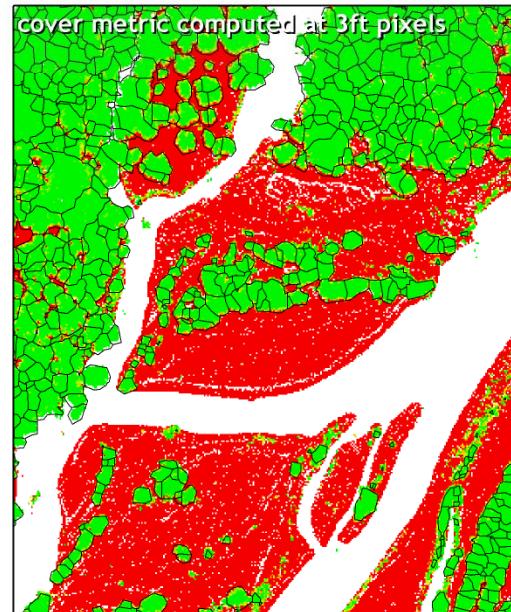
Field Techniques:  $-0.27 \pm 0.27 \text{ m}$

Digital Terrain Accuracy Directly Impacts on Individual Tree Height Measurements.



# Stand Level Classifications Influence of Spatial Scale

Spatial scale of analysis influences metric values



# Vegetation Classification Analysis

## Follow-On

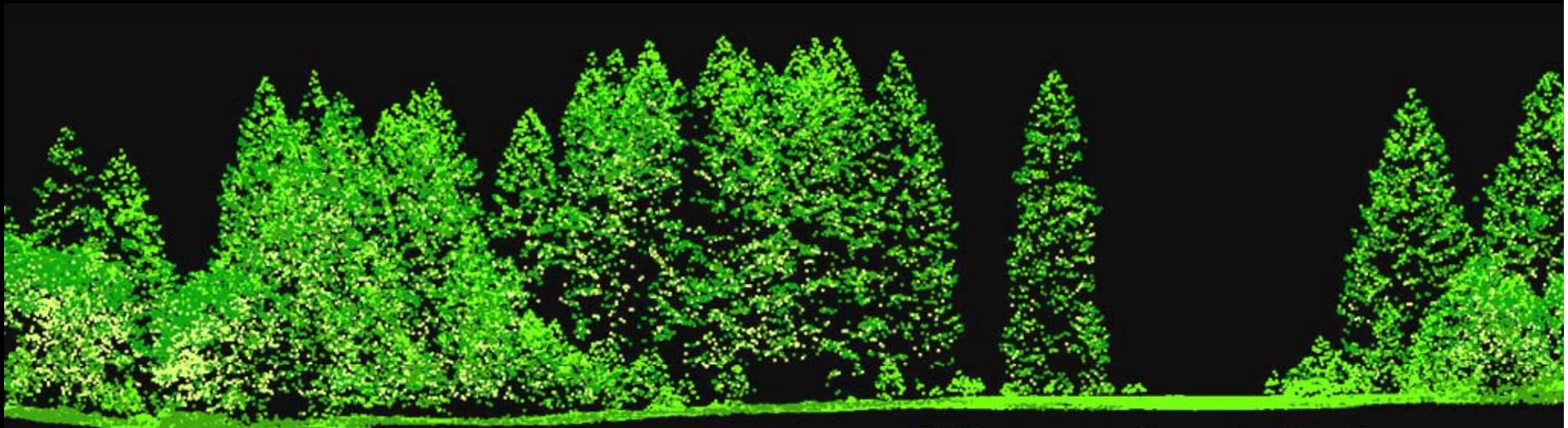
### **The Next Step:**

- Rule Based Segmentation of Vegetation Classification
- Define Appropriate Output Scale (end product)

### **Data Needs:**

- Definition of Vegetation Classes
- Plot/Survey Data (seed classification model)

# Thank you



*Prepared by* **Watershed Sciences**