

# Using UAV Derived Imagery in Combination with Existing LiDAR to Map Plot-Level Forest Characteristics in Michigan



contour  
geographic



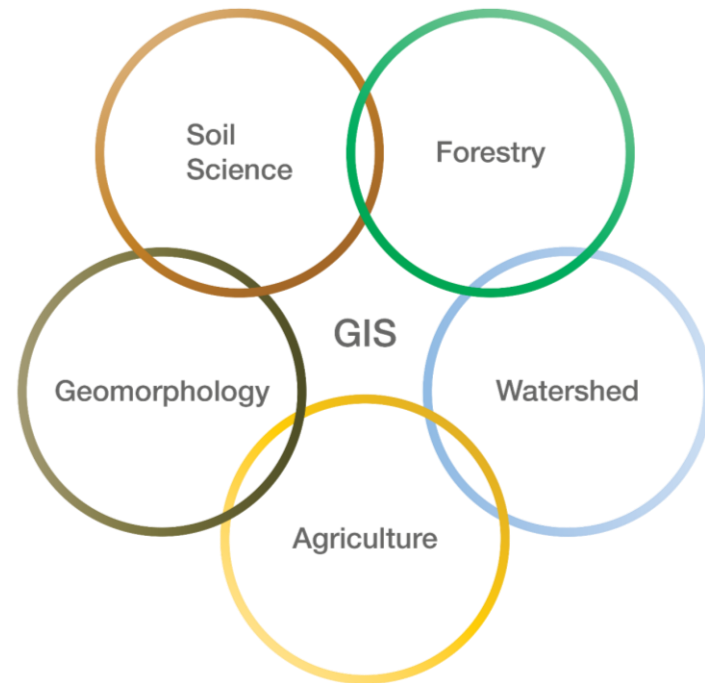
**Trevor Hobbs**  
Soil Geomorphologist





# contour geographic

- Applied geomorphology
- UAV mapping/GIS
- Web and print cartography
- Research
- Training/workshops





# Past case studies- UAVs for detecting erosion in coastal dunes / mapping Pitcher's Thistle



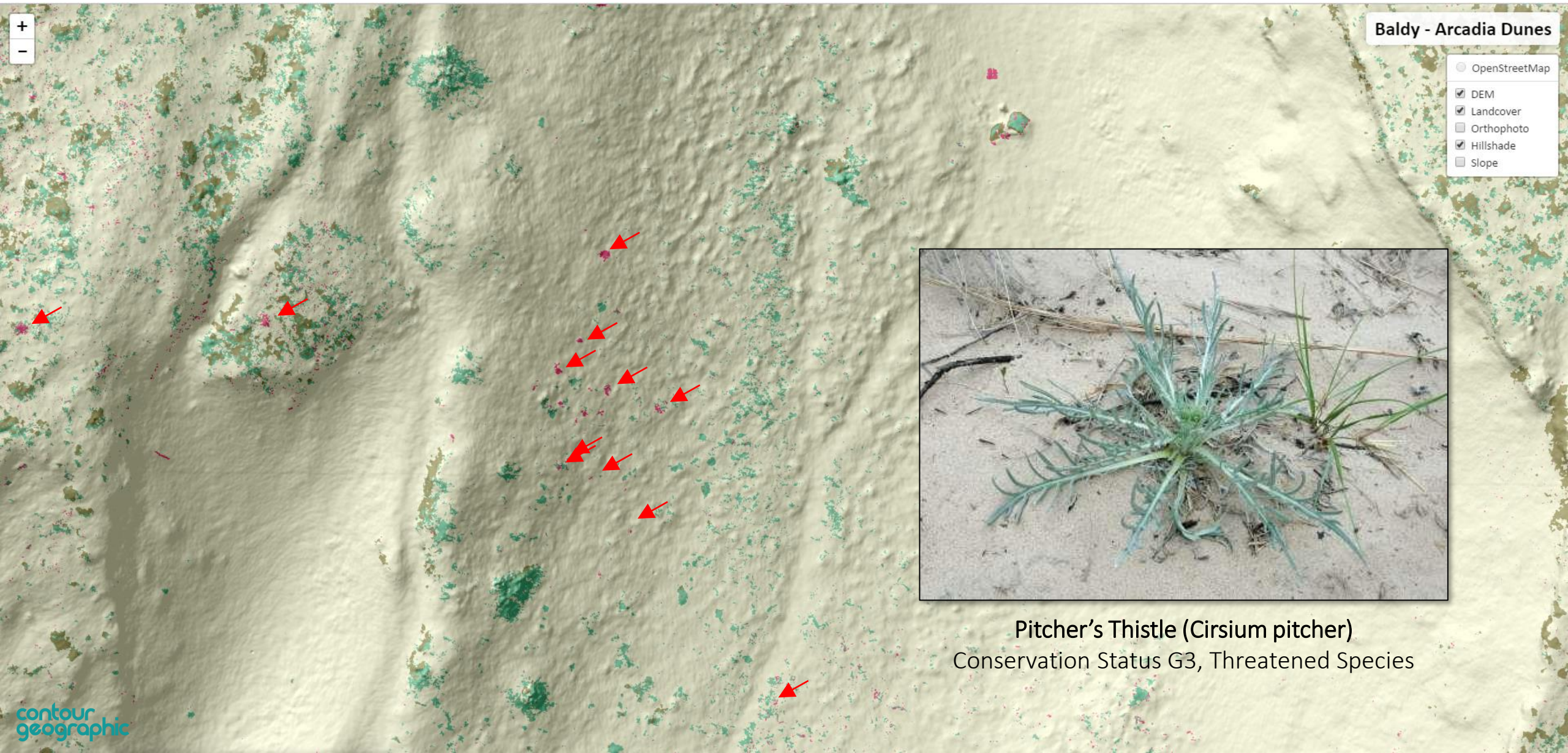


# Past case studies- UAVs for detecting erosion in coastal dunes / mapping Pitcher's Thistle



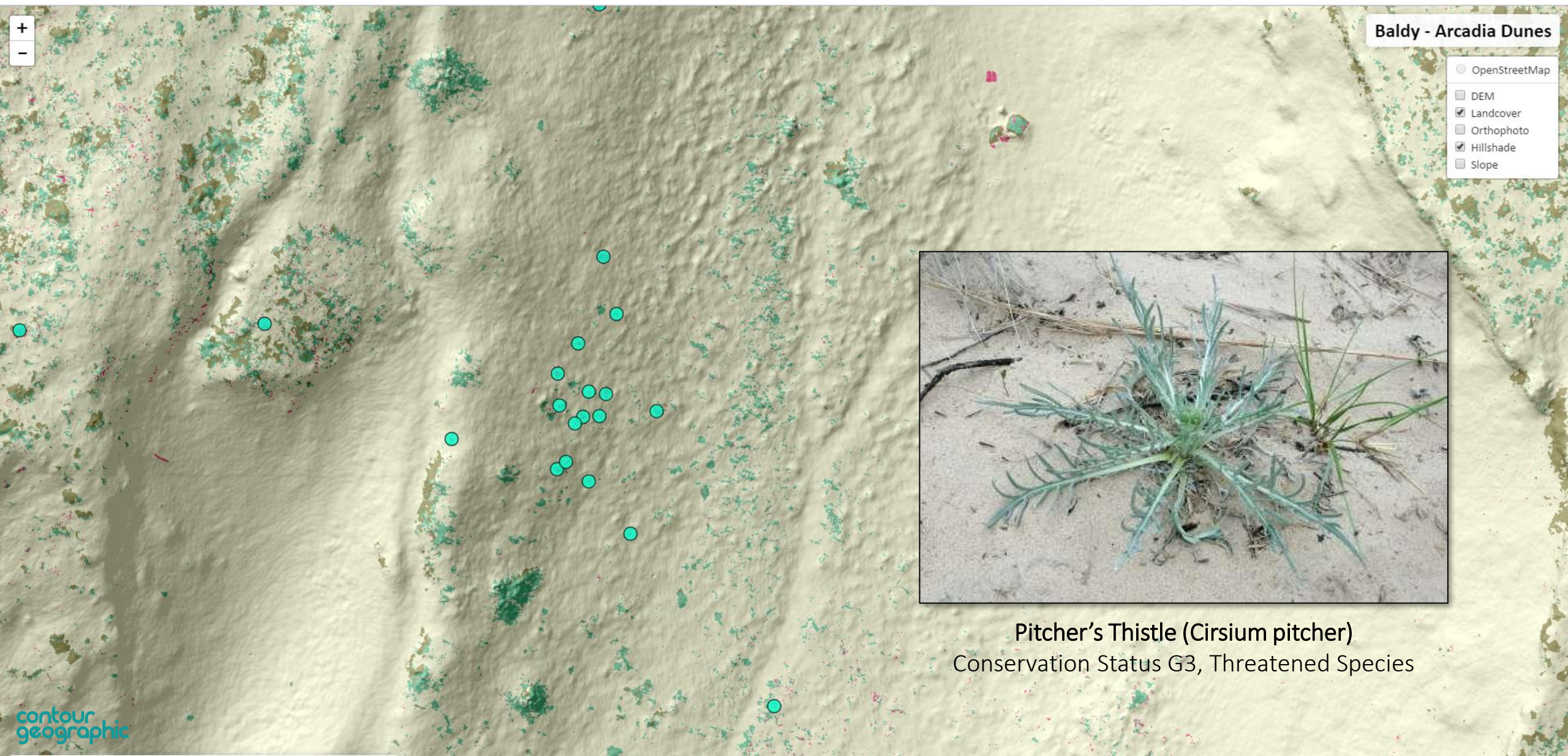


# Past case studies- UAVs for detecting erosion in coastal dunes / mapping Pitcher's Thistle



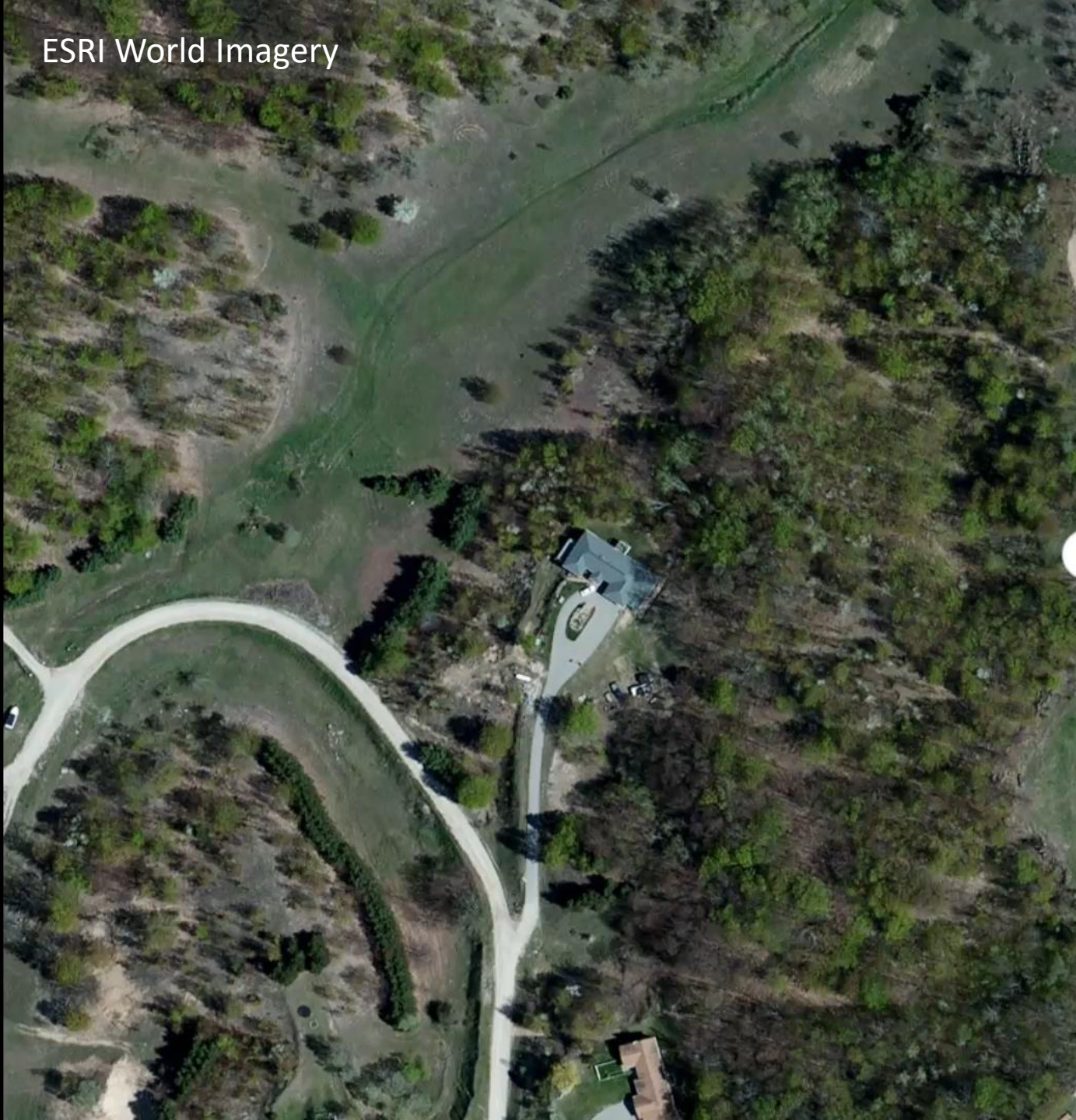


# Past case studies- UAVs for detecting erosion in coastal dunes / mapping Pitcher's Thistle

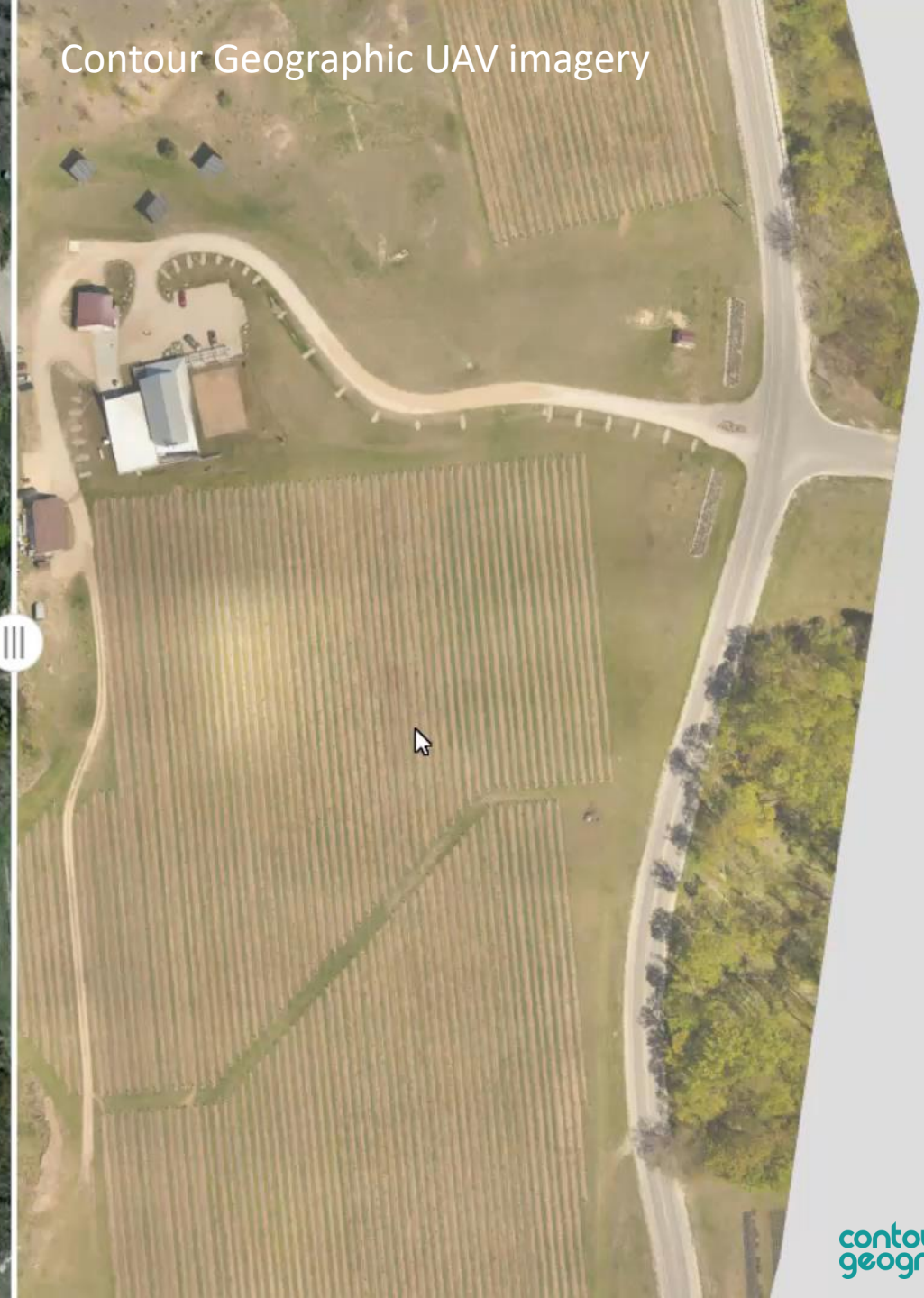




ESRI World Imagery



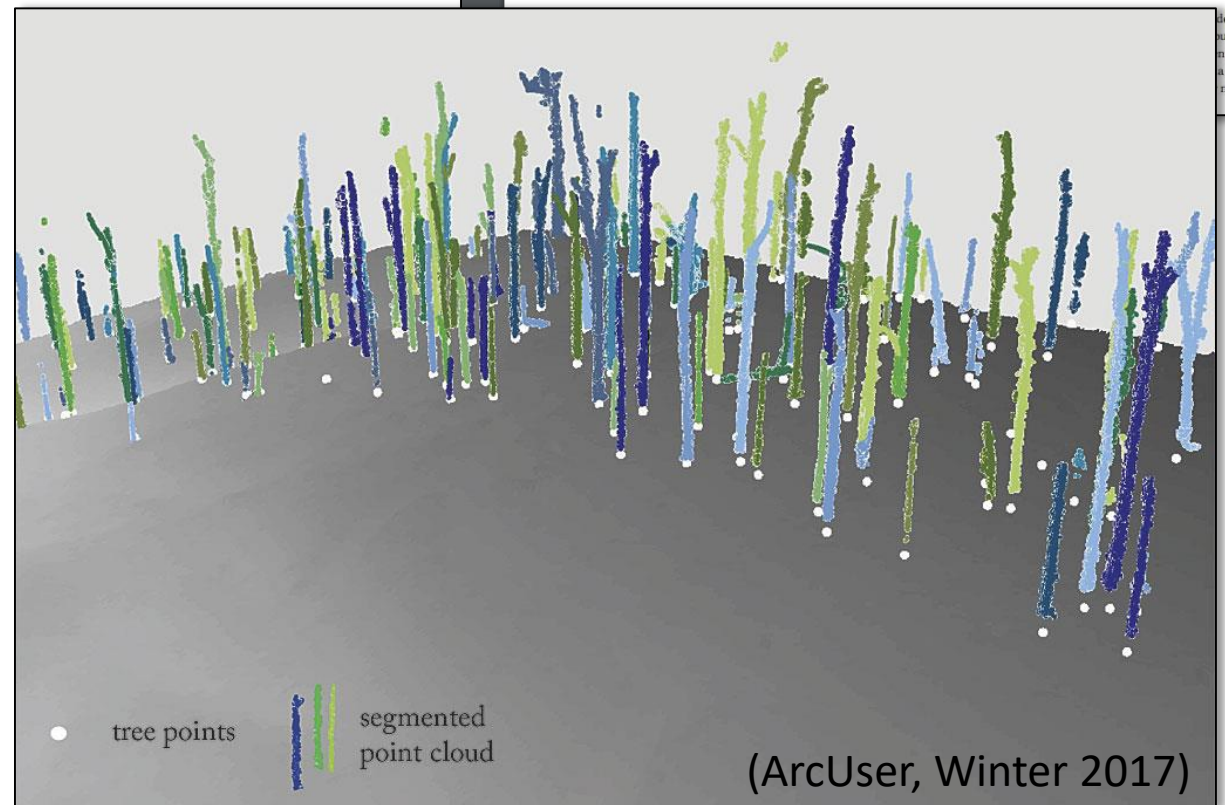
Contour Geographic UAV imagery





# Recent work by others using UAVs for Forestry...

- Post-harvest / post-storm damage change assessment
- Developed algorithms for mapping individual tree stems



(ArcUser, Winter 2017)



# Recent work by others using UAVs for Forestry...

- Comparing UAV imagery to LiDAR
- Techniques for capturing bare earth surfaces under forest canopies using oblique ground photos + UAV photos



*forests*



Article

## Assessment of Forest Structure Using Two UAV Techniques: A Comparison of Airborne Laser Scanning and Structure from Motion (SfM) Point Clouds

Luke Wallace <sup>1,2,\*</sup>, Arko Lucieer <sup>1</sup>, Zbyněk Malenovský <sup>1,3</sup>, Darren Turner <sup>1</sup> and Petr Vopěnka <sup>4</sup>



*remote sensing*



Article

## Assessment of Image-Based Point Cloud Products to Generate a Bare Earth Surface and Estimate Canopy Heights in a Woodland Ecosystem

Jennifer L. R. Jensen <sup>1,\*</sup> and Adam J. Mathews <sup>2</sup>

Received: 4 November 2015; Accepted: 31 December 2015; Published: 8 January 2016

Academic Editors: Lars T. Waser and Prasad S. Thenkabail





# Questions...

- Are UAV's useful for forest inventory and mapping? If so, what kinds of data products are possible to generate, and how can they be used?
- With all of the new LiDAR coverage in Michigan, how can that data be used to make up for where UAV imagery falls short (or vice versa)?
- Can quality data products be made with a basic (consumer-grade) UAV?



# Background- LiDAR vs. UAV/structure from motion (SfM) photogrammetry

## LIDAR

- Active sensor (laser)
- Penetrates forest canopy
- Ideal for mapping forest density
- Large area acquisition

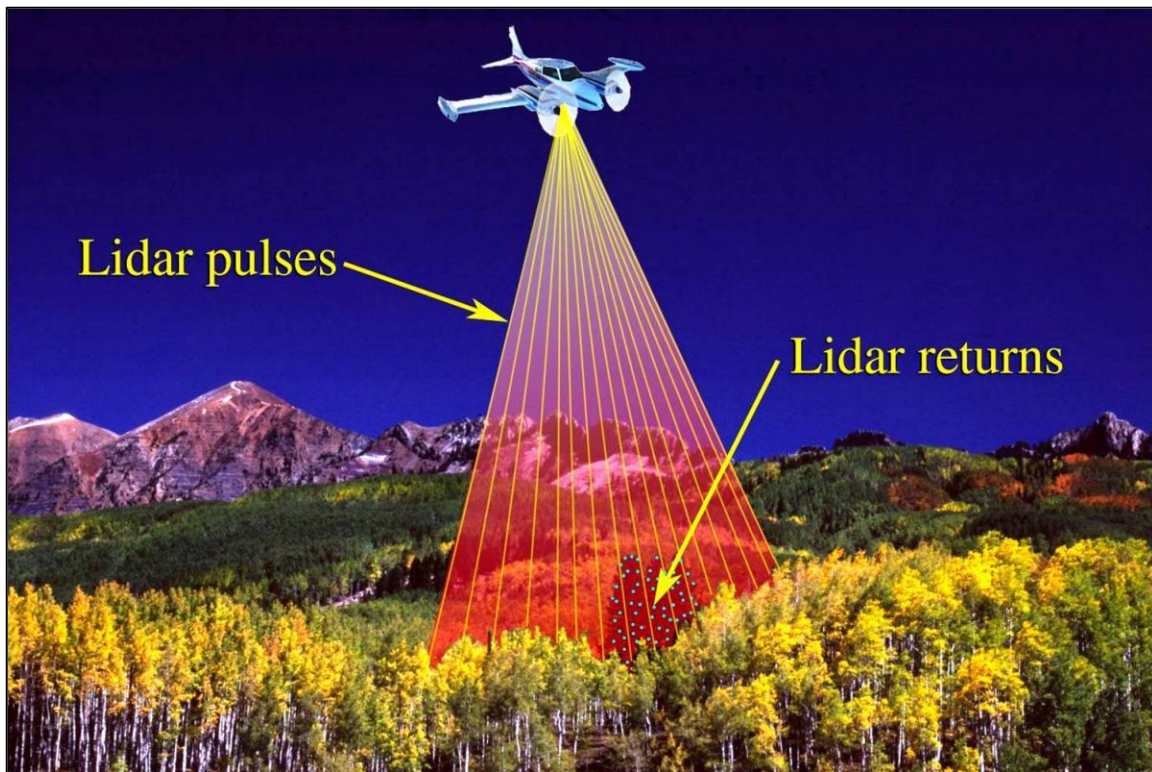
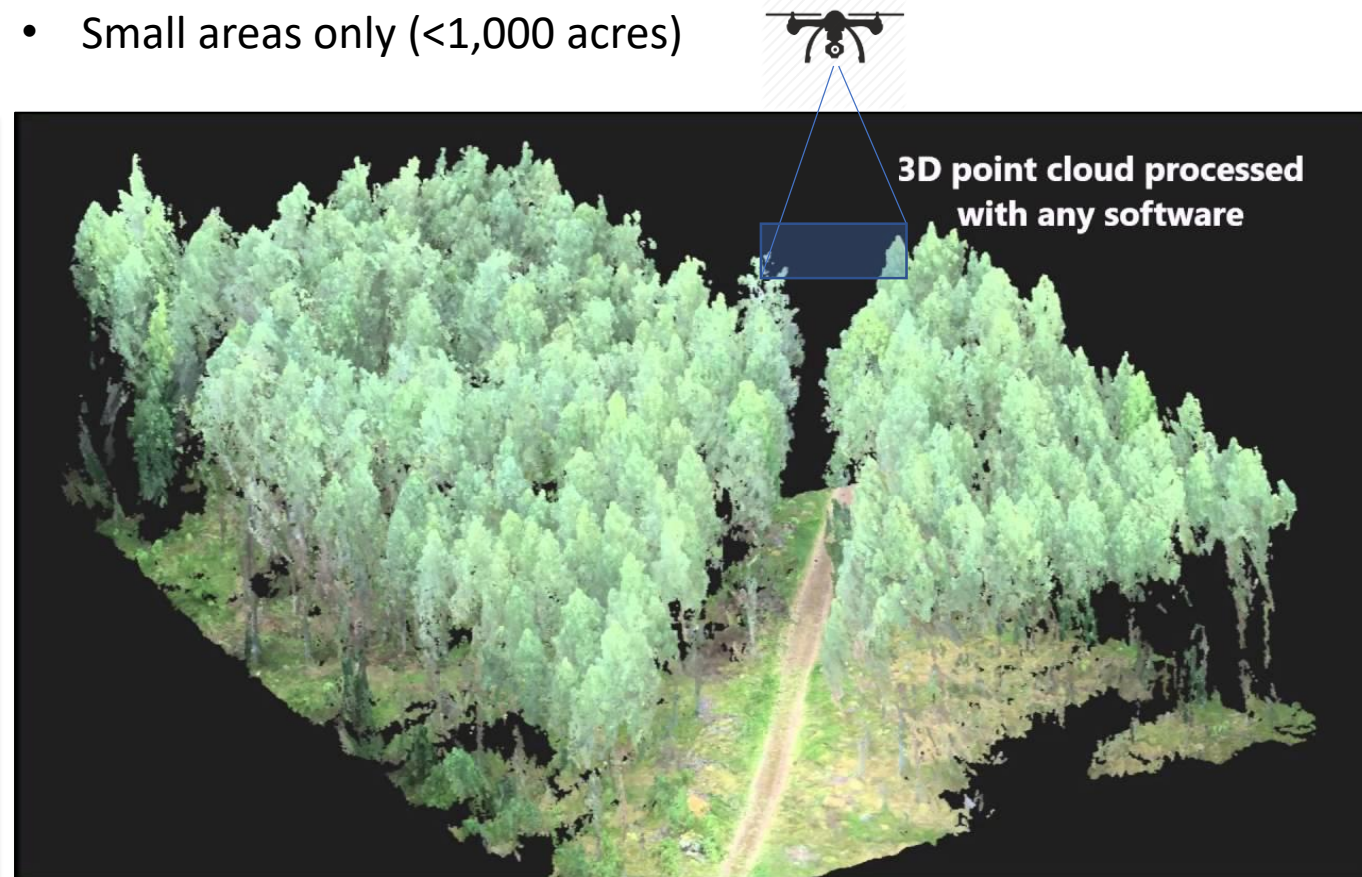


Image from VCGI Lidar <http://vcgi.vermont.gov/lidar>

## UAV

- Passive sensor (photo)
- Does not penetrate forest canopy
- Ideal for mapping canopy/object surfaces
- Small areas only (<1,000 acres)

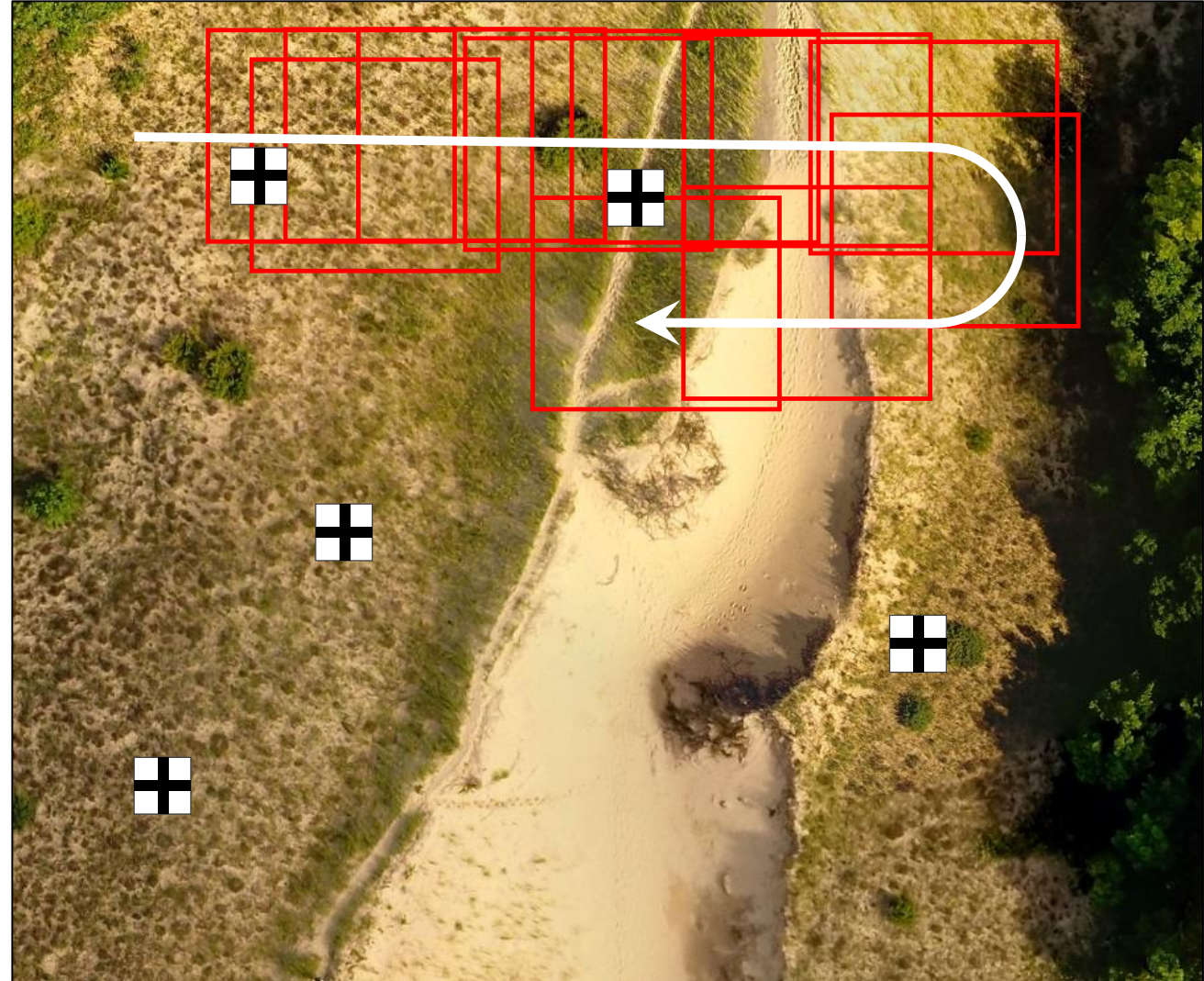




# Background- UAVs and Photogrammetry

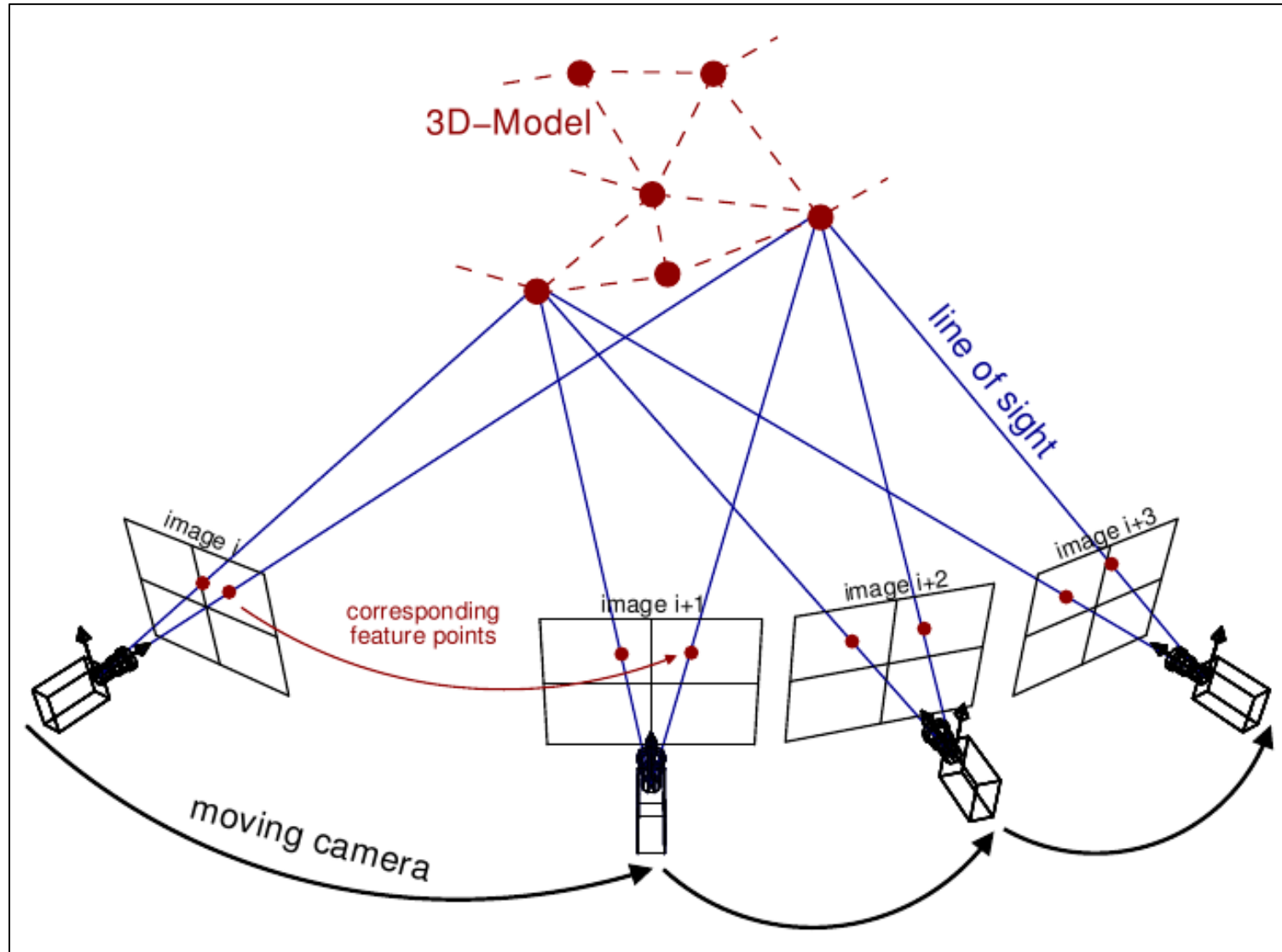
## TYPICAL WORKFLOW

- Set up GPS base station to log data and transmit RTK messages to UAV and roving GPS
- Layout/survey ground control points.
- Set up flight plan to capture a series of overlapping images, such that every landscape feature appears in at least 2-3 images (60-80% frontlap/sidelap).
- UAV contains on-board camera, GPS, and Inertial Measurement Unit to record the location and 3D orientation of each image.





# Background- UAV Image Processing

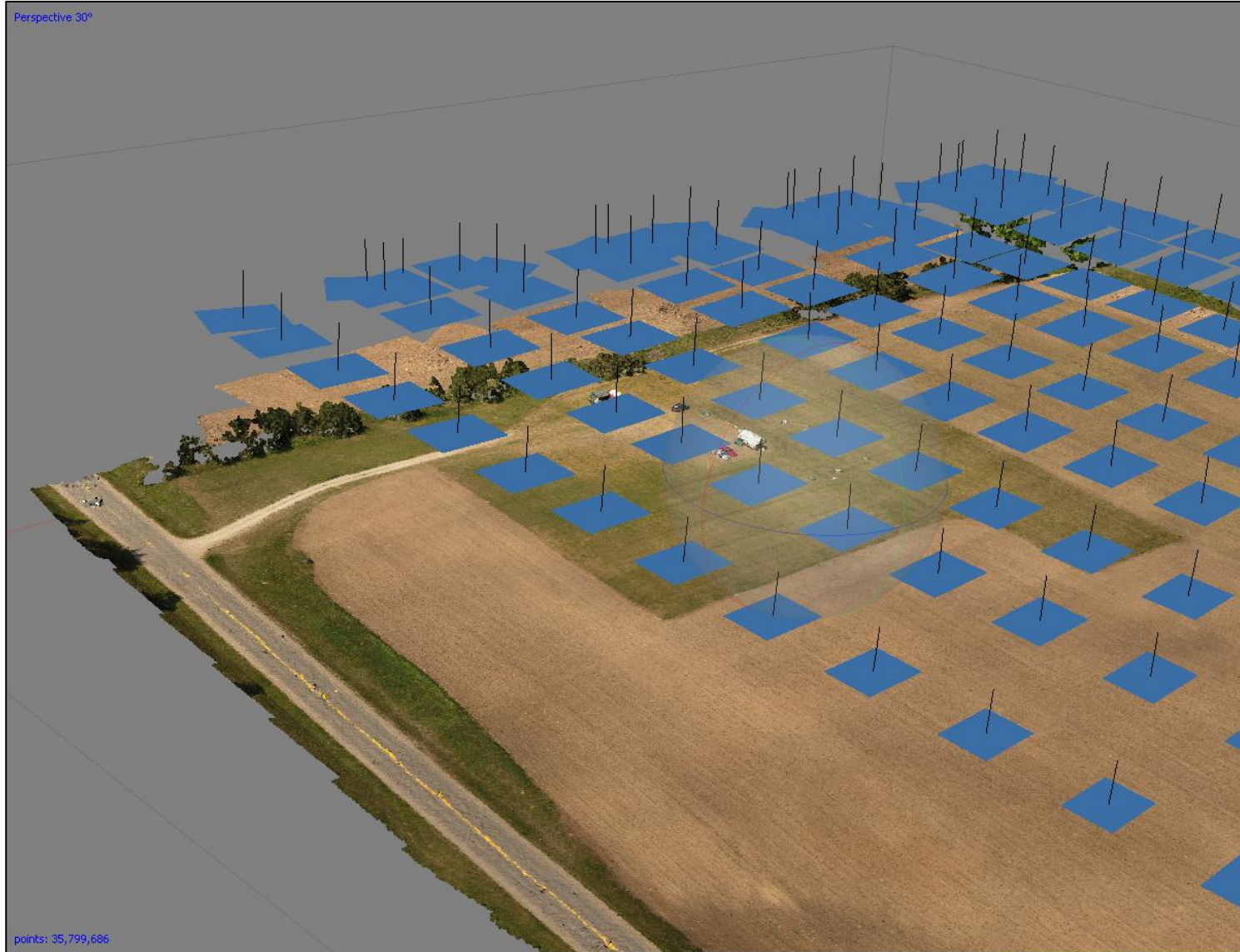


## Structure From Motion (or SfM) photogrammetry...

- Similar to traditional stereo photography principals- determining object geometry based on parallax, but...



# Background- UAV Image Processing

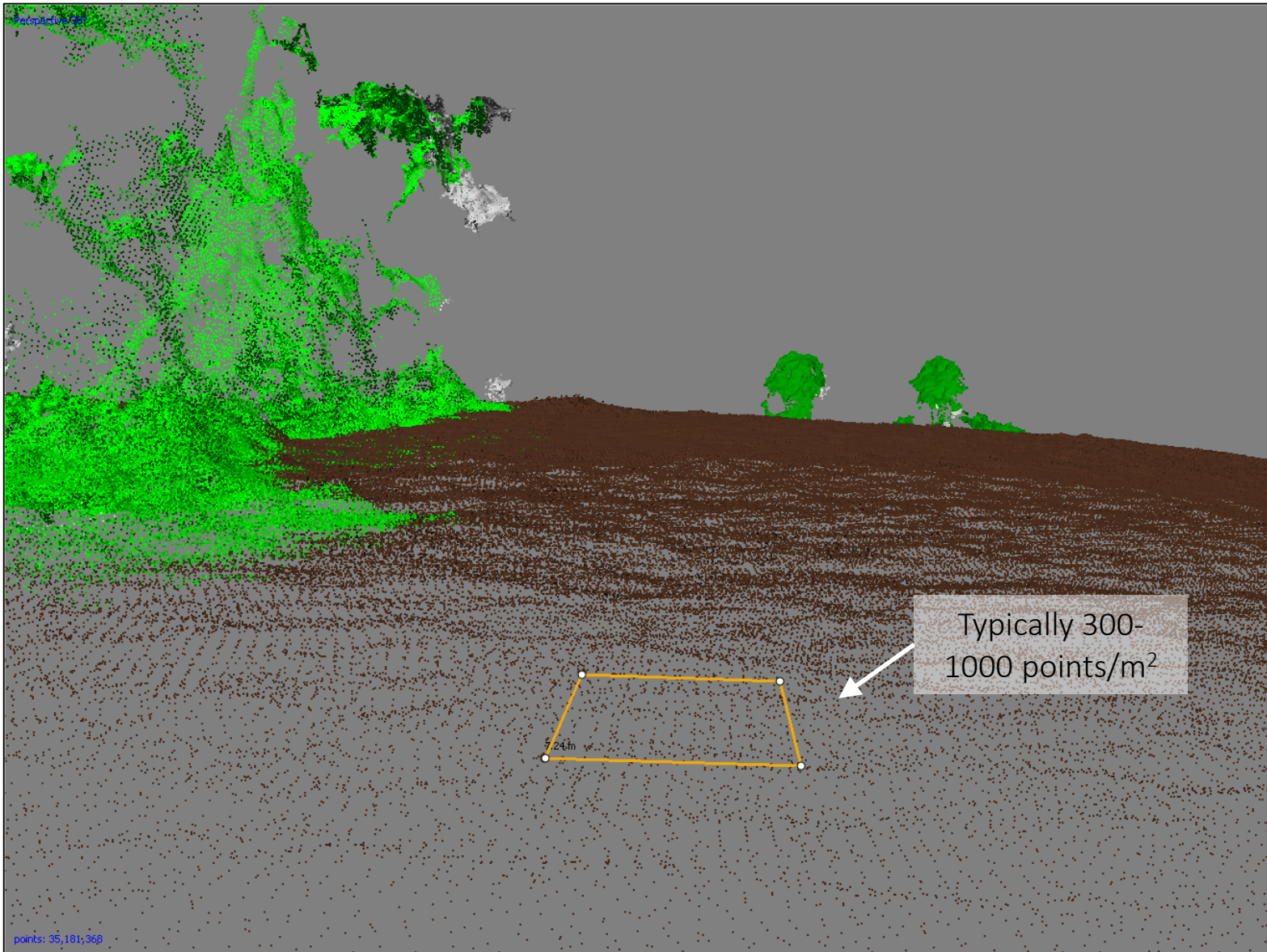


## Structure From Motion (or SfM) photogrammetry...

- Similar to traditional stereo photography principals- determining object geometry based on parallax, but...
- In SfM- original camera positions are “solved” based on relative positions of corresponding feature points in adjacent photos.
- Photo-processing algorithms incorporate lens specifications (f-stop, radial distortion, etc.) and GPS locations to narrow search for matching pixels.



# Background- UAV Resulting Point Cloud

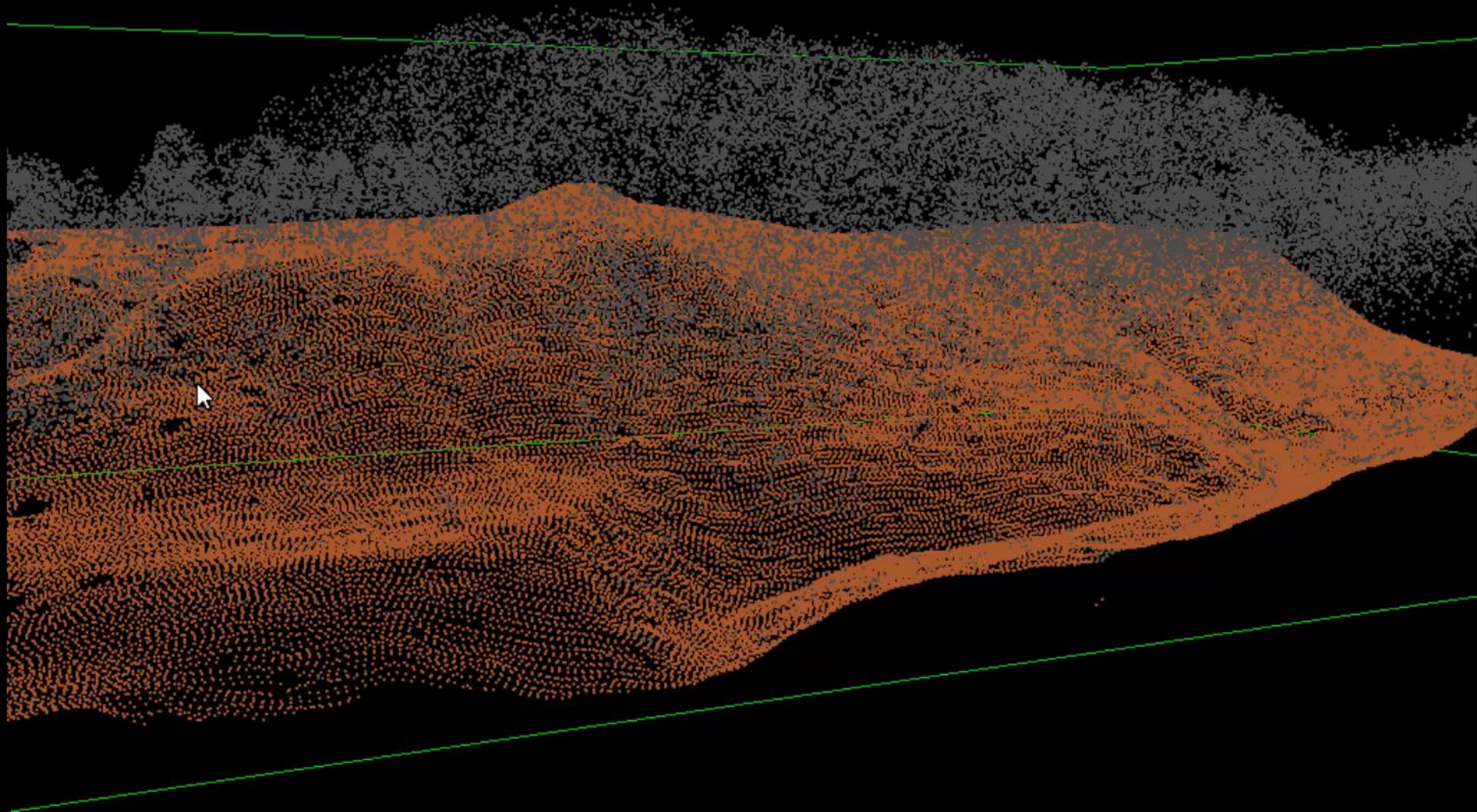


- Each point representing the x-y-z coordinates of successfully aligned photo pixels.
- Can be classified according to ASPRS standards (.LAS) Format.
  - Examples:
    - “Ground”
    - “Vegetation”
    - “Buildings”
- Point densities are orders of magnitude higher than LiDAR data



... In Contrast- LiDAR Point Cloud

Typically 5-20  
points/m<sup>2</sup>





# Challenges with using SfM/photo UAVs for mapping forests...

- Trees are in the way of the ground!
- Getting a good bare earth model is difficult, especially during leaf-on conditions.
- DEM is important if/when tree or canopy height models are needed. Typically, a bare earth DEM is needed to compute tree heights.
- Getting good ground control points (GPS) under canopy takes considerable field time.





# Challenges with using SfM/photo UAVs for mapping forests...

- Shadows!
- Even at solar noon (time of shortest shadows), it is difficult to discern tree from shadow on sunny days





# Challenges with using SfM/photo UAVs for mapping forests...

- Must maintain line of sight with UAV (FAA regulations)!
- Need an adjacent open field for base camp and visual contact

## Ideal Forest Type/Setting

- Non-contiguous forests
- High value forests (hardwoods)





# Case study at Twin Lakes Forest

~20 acres

0 30 m





# Case study at Twin Lakes Forest



*Trillium grandiflorum* - Trillium



*Viola canadensis* - Canada Violet



# Case study at Twin Lakes Forest



*Sanguinaria canadensis* - Bloodroot



*Arisaema tropylium* - Jack-in-the-Pulpit



# Case study at Twin Lakes Forest



*Caulophyllum thalictroides*- Blue Cohosh



Typical view along the trail







# Approach - Hardware

**DJI Phantom 4**



## On-Board Camera Specs

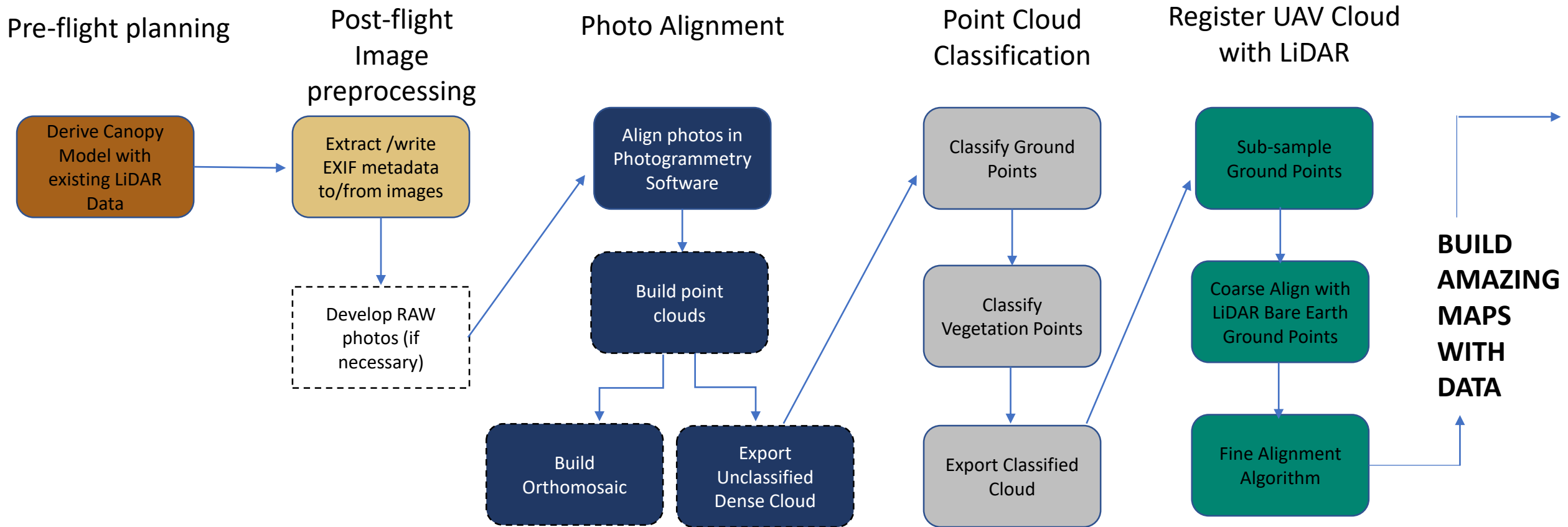
- FOV 94° 20 mm (35 mm format equivalent) f/2.8 focus at  $\infty$
- Image size 4000 x 3000 pixels
- Effective pixels: 12.4 M
- Max flight time 28 minutes (per battery)

## Setup

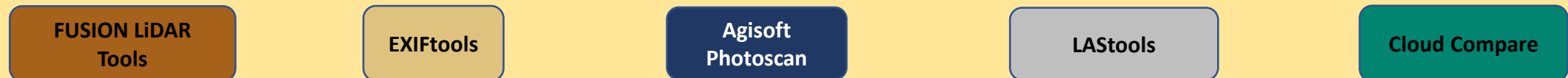
- Shoot in RAW format (DNG)
- Captured images during Leaf-Off (Spring 2017)
- Captured images during bright overcast (good lighting, but no shadows)
- Flight speed 4 m/sec (to minimize motion blur)



# WORKFLOW



## SOFTWARE COCKTAIL





# WORKFLOW

## Pre-flight planning

Derive Canopy  
Model with  
existing LiDAR  
Data

- Locate suitable base camp
- Desired marker placement
- Desired flight altitude/ground sampling distance

## SOFTWARE COCKTAIL

FUSION LiDAR  
Tools



Derive Canopy  
Model with  
existing LiDAR  
Data

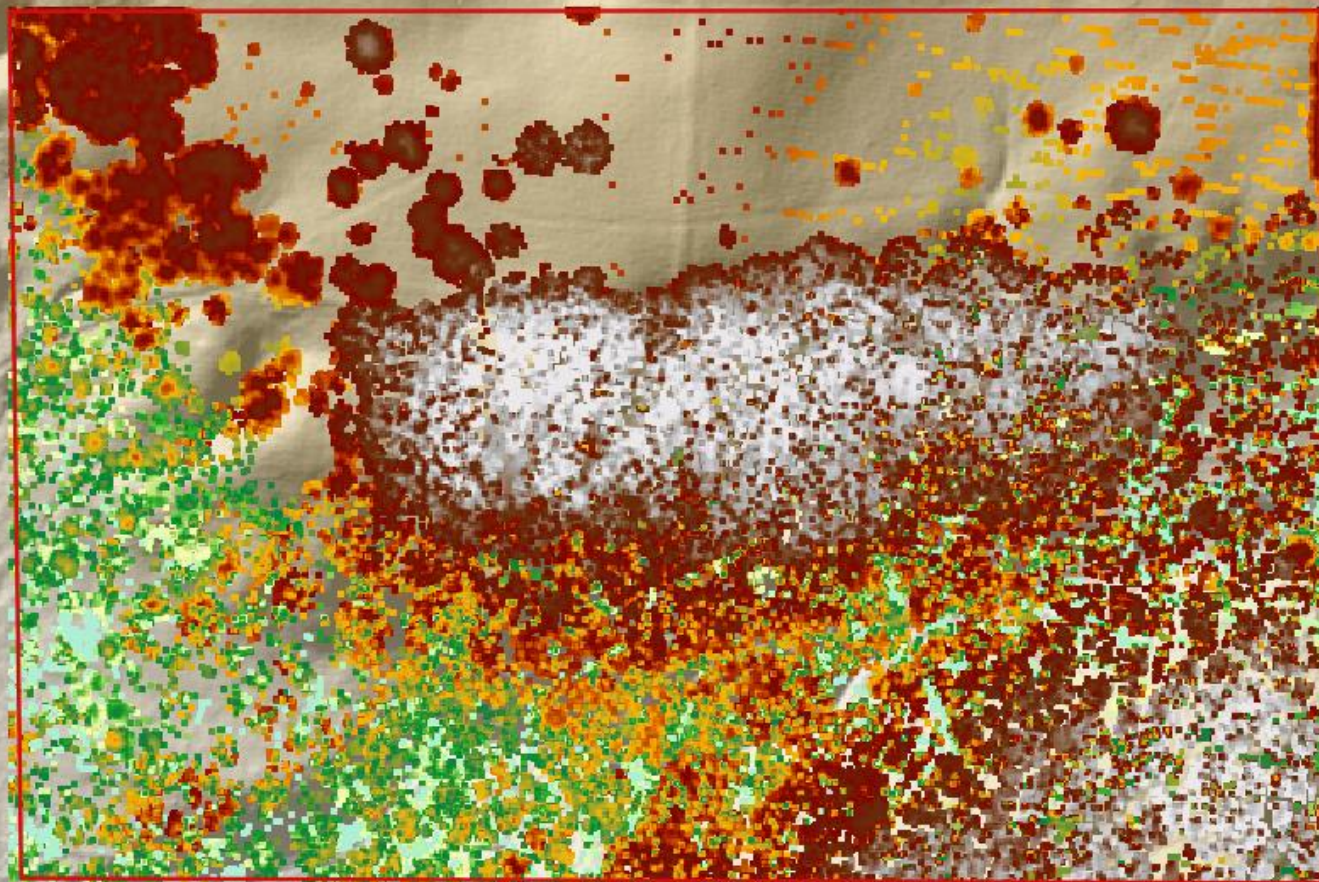
0 30  
m





Derive Canopy  
Model with  
existing LiDAR  
Data

0 30  
m

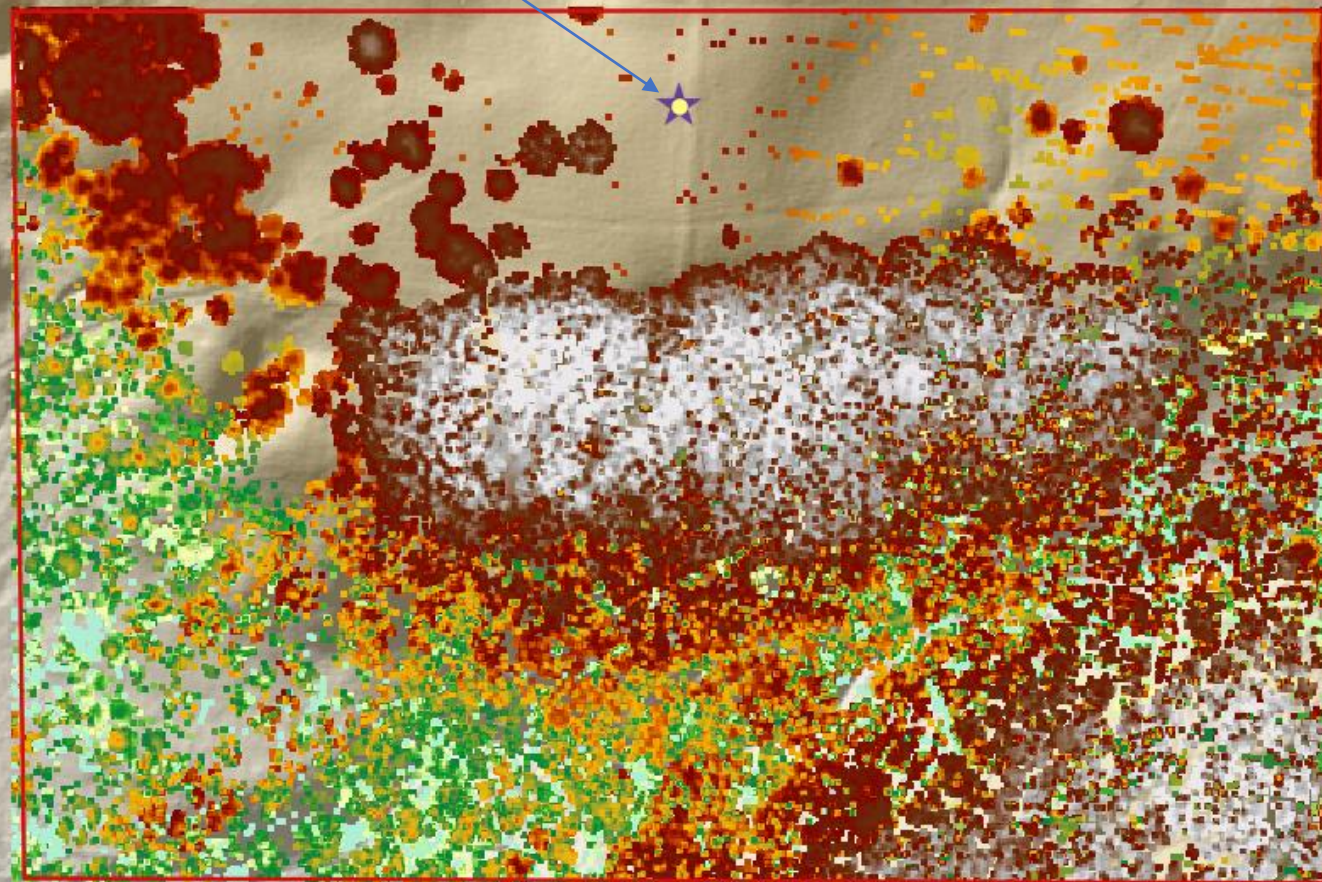




Derive Canopy  
Model with  
existing LiDAR  
Data

Locate Suitable Base Camp

0 30  
m

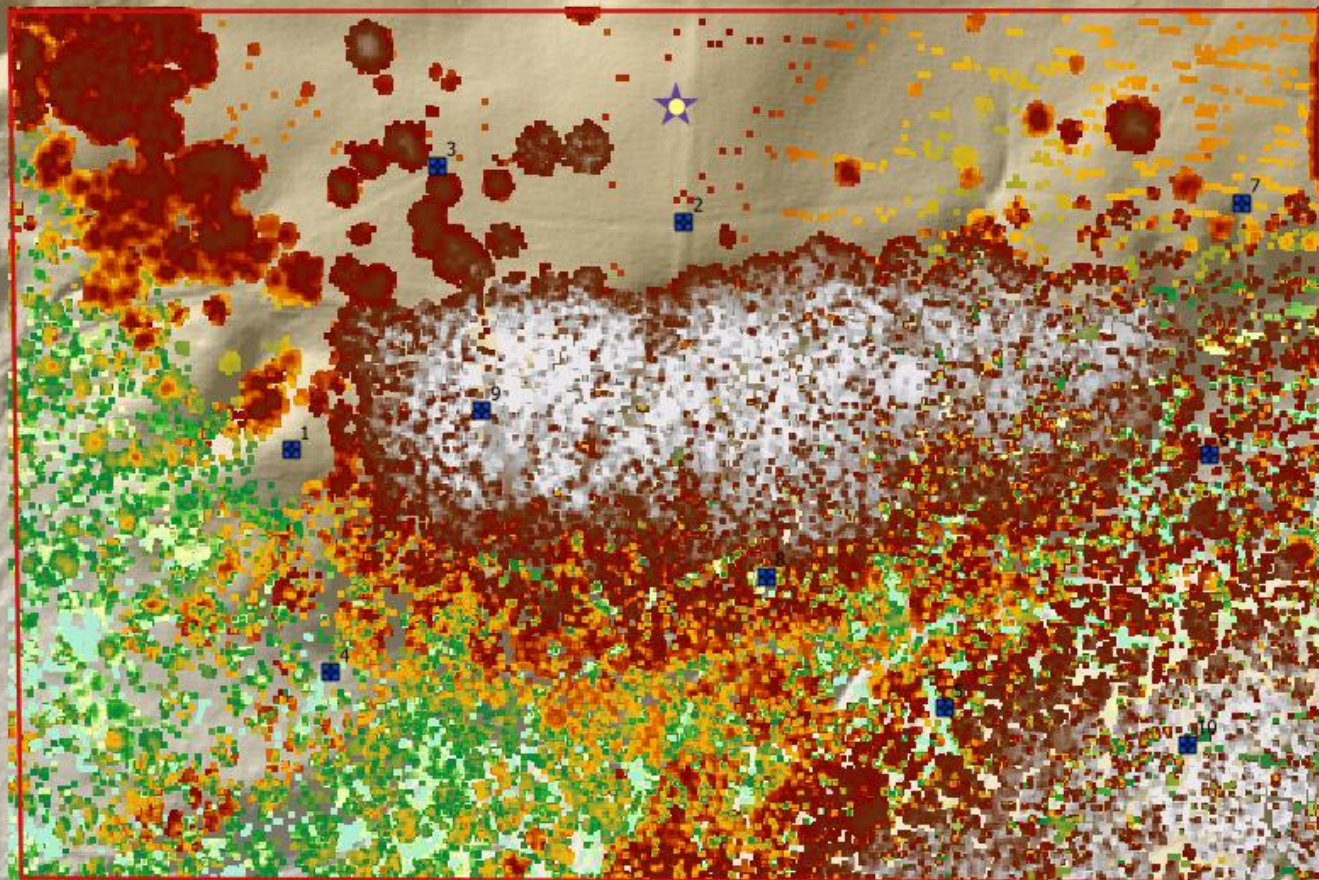




Derive Canopy  
Model with  
existing LiDAR  
Data

Desired Marker placement

0 30  
m



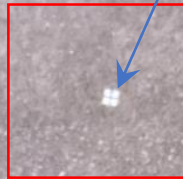


# Ground Control Point Placement

10 Ground Markers were placed throughout the study area in areas with...

- Low/no canopy density
- Adjacent to distinct topographic features

GCP positions were **NOT** collected by GPS – simply used for visual / photo alignment process...

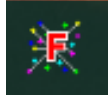








# WORKFLOW



## Pre-flight planning

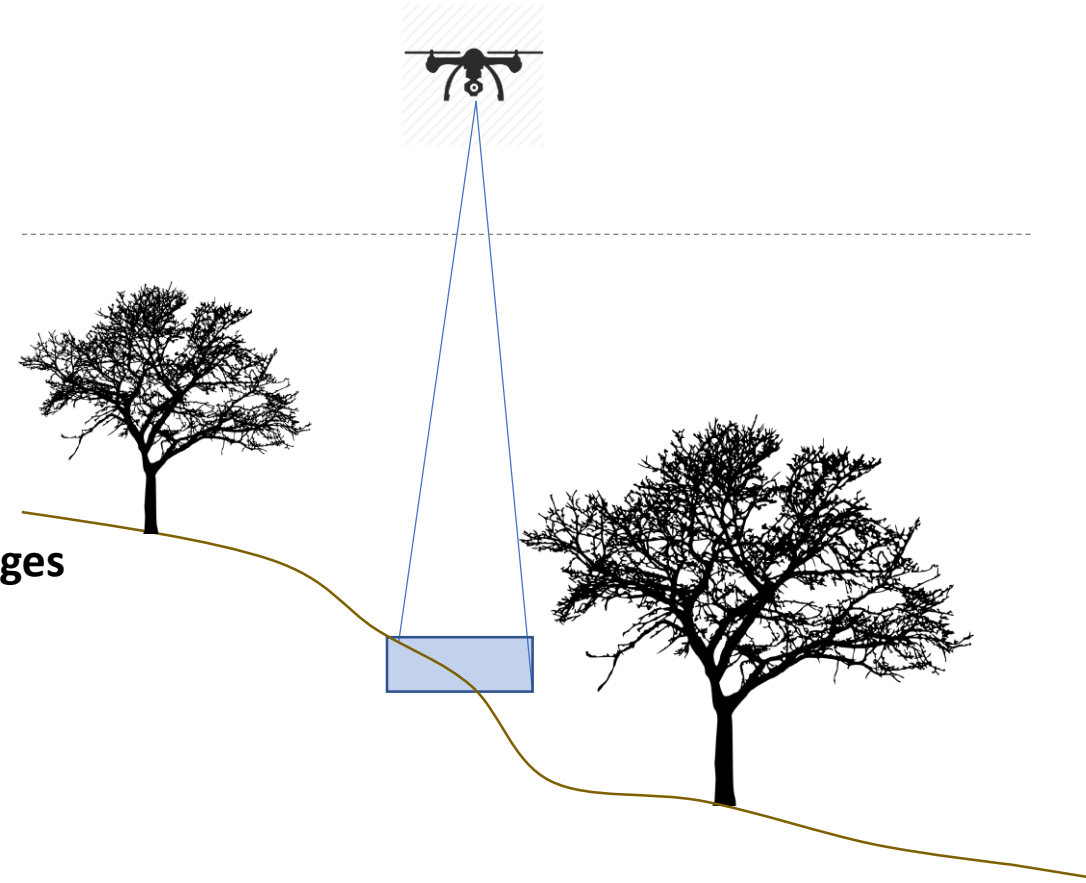
Derive Canopy  
Model with  
existing LiDAR  
Data

Locate suitable base camp

Desired marker placement

**Desired flight altitude/ground sampling distance**

- Safe height (avoid trees)
- Ensuring enough overlap of canopy in images
- Ensuring enough ground detail



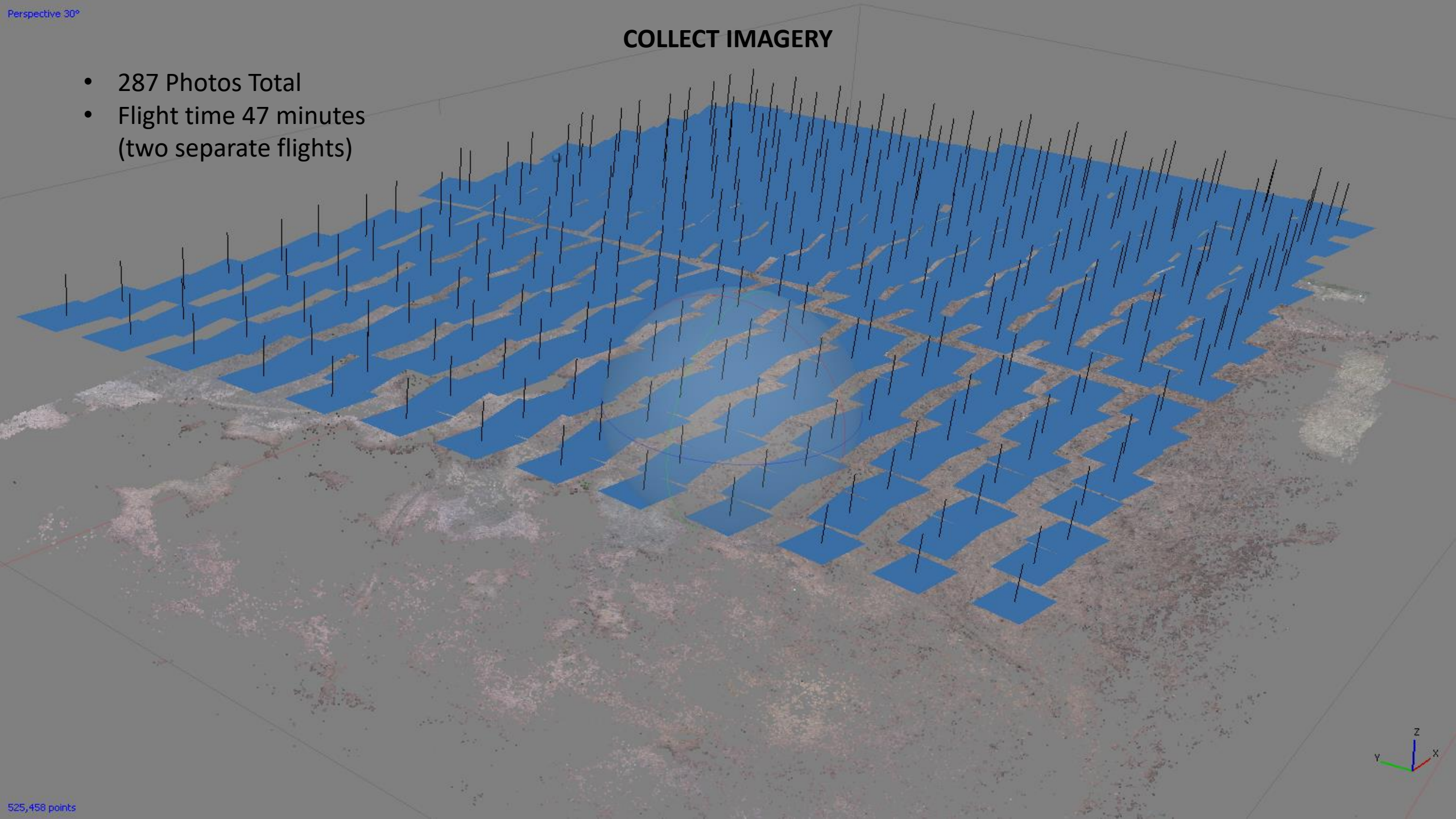
## SOFTWARE COCKTAIL

FUSION LiDAR  
Tools



## COLLECT IMAGERY

- 287 Photos Total
- Flight time 47 minutes  
(two separate flights)





# WORKFLOW

**ExifTool by Phil Harvey**  
**Read, Write and Edit Meta Information!**

## Pre-flight planning

Derive Canopy  
Model with  
existing LiDAR  
Data

(collect Imagery)

## Post-flight Image preprocessing

Extract /write  
EXIF metadata  
to/from images

- Translate photo GPS locations to desired coordinate system (**same as LiDAR, if possible**)
- Extract Pitch, Yaw, Roll, etc.

Develop RAW  
photos (if  
necessary)

- RAW vs. JPEG? (Highest signal-to-noise ratio is desired- most of the time, RAW is best!)

# SOFTWARE COCKTAIL

FUSION LiDAR  
Tools

EXIFtool







# WORKFLOW

## Pre-flight planning

Derive Canopy  
Model with  
existing LiDAR  
Data

## Post-flight Image preprocessing

Extract /write  
EXIF metadata  
to/from images

Develop RAW  
photos (if  
necessary)

## Photo Alignment

Align photos in  
Photogrammetry  
Software

Build point clouds

**Agisoft**

### Alternatives to Agisoft Photoscan

- Pix4D
- nFrames
- Micmac
- COLMAP

## SOFTWARE COCKTAIL

**FUSION LiDAR  
Tools**

**EXIFtools**

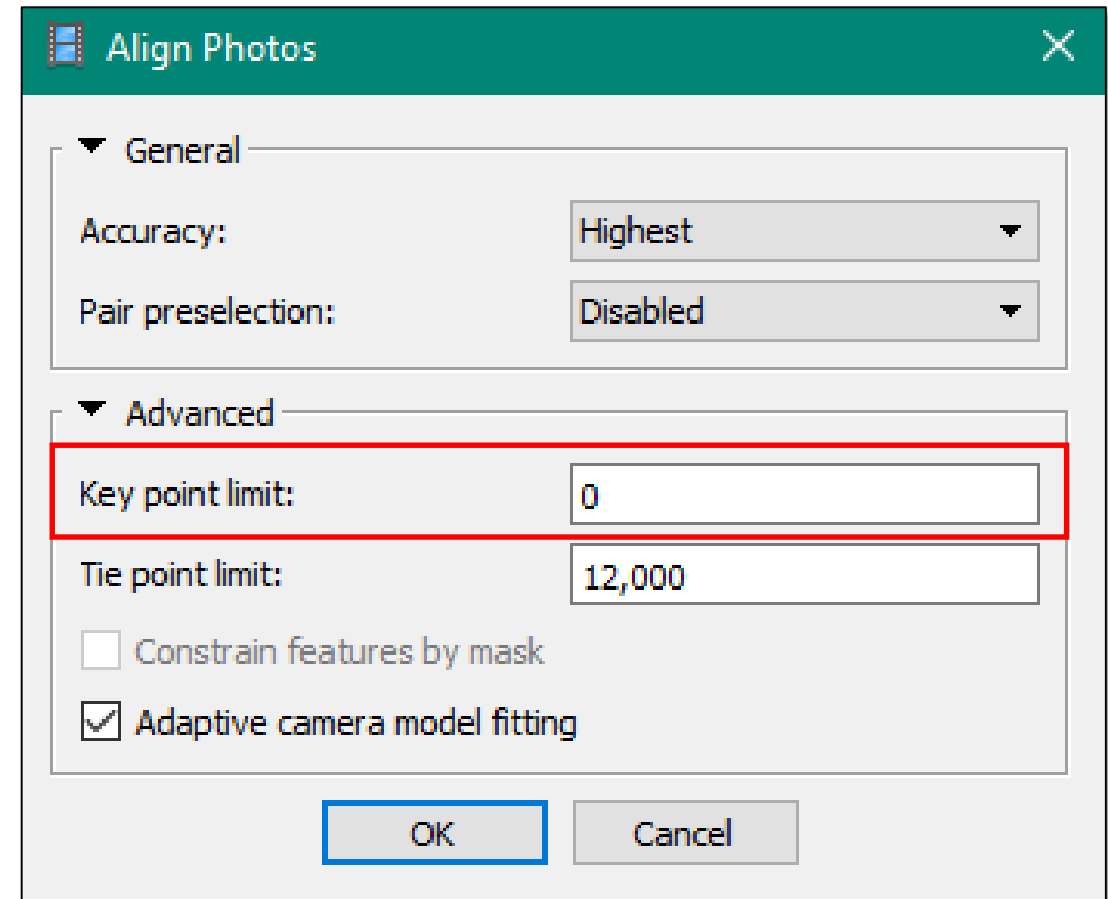
**Agisoft  
Photoscan**



# Agisoft Photoscan – photogrammetric software

## Basic workflow

- Set desired coordinate system
- Add Photos
- Import EXIF metadata (speeds up image registration)
- **Align photos**
- **Can take several hours to days for ~300 photos**

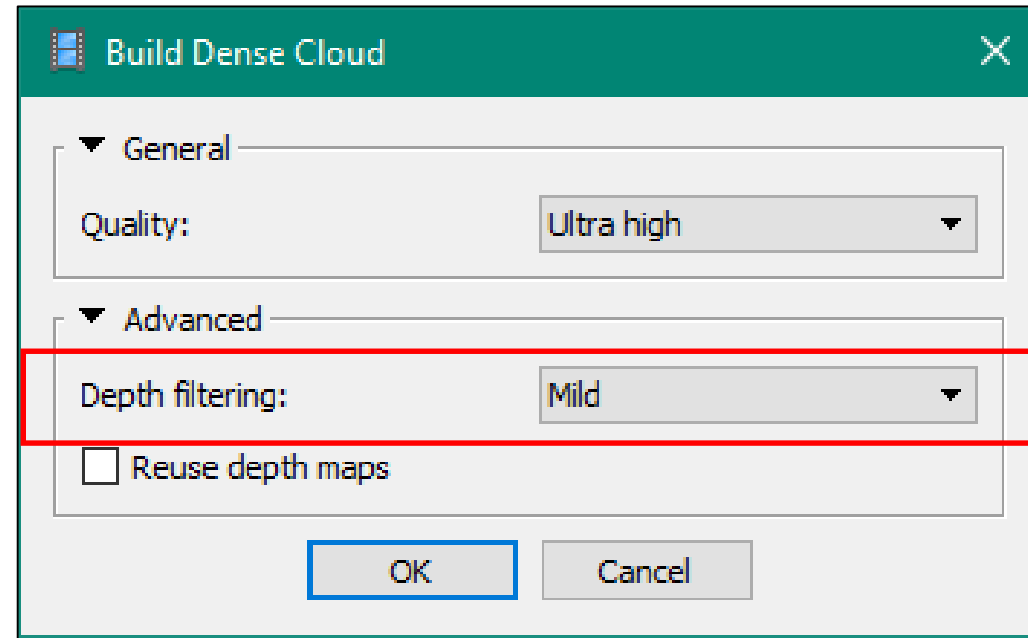




# Agisoft Photoscan – photogrammetric software

## Basic workflow

- Align Photos
- **Build Point Clouds (Sparse→Dense)**
  - Setting depth filtering to mild ensures that the structure of trees are detected, yet minimizes “below ground” noise



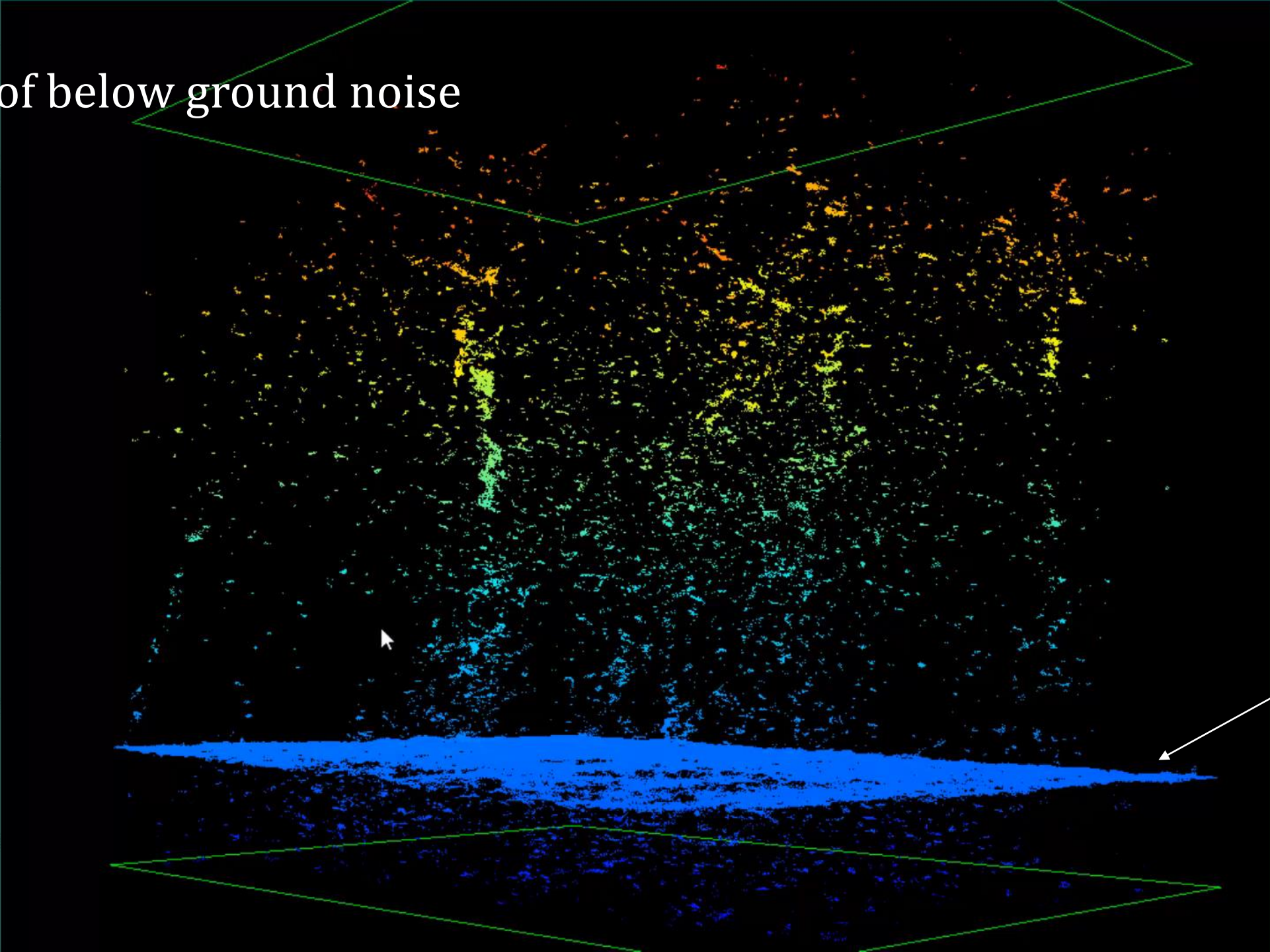


# Example of below ground noise

Trees

Noise

Ground





# WORKFLOW

## Pre-flight planning

Derive Canopy  
Model with  
existing LiDAR  
Data

## Post-flight Image preprocessing

Extract /write  
EXIF metadata  
to/from images

Develop RAW  
photos (if  
necessary)

## Photo Alignment

Align photos in  
Photogrammetry  
Software

Build point clouds

Build  
Orthomosaic

Export  
Unclassified  
Dense Cloud

# SOFTWARE COCKTAIL

**FUSION LiDAR  
Tools**

**EXIFtools**

**Agisoft  
Photoscan**



# WORKFLOW

## Pre-flight planning

Derive Canopy  
Model with  
existing LiDAR  
Data

## Post-flight Image preprocessing

Extract /write  
EXIF metadata  
to/from images

Develop RAW  
photos (if  
necessary)

## Photo Alignment

Align photos in  
Photogrammetry  
Software

Build point  
clouds

Build  
Orthomosaic

Export  
Unclassified  
Dense Cloud

## Point Cloud Classification

Classify Ground  
Points

Classify  
Vegetation Points

Export Classified  
Cloud

**LAStools**  
**rapidlasso**  
*fast tools to catch reality*

# SOFTWARE COCKTAIL

**FUSION LiDAR  
Tools**

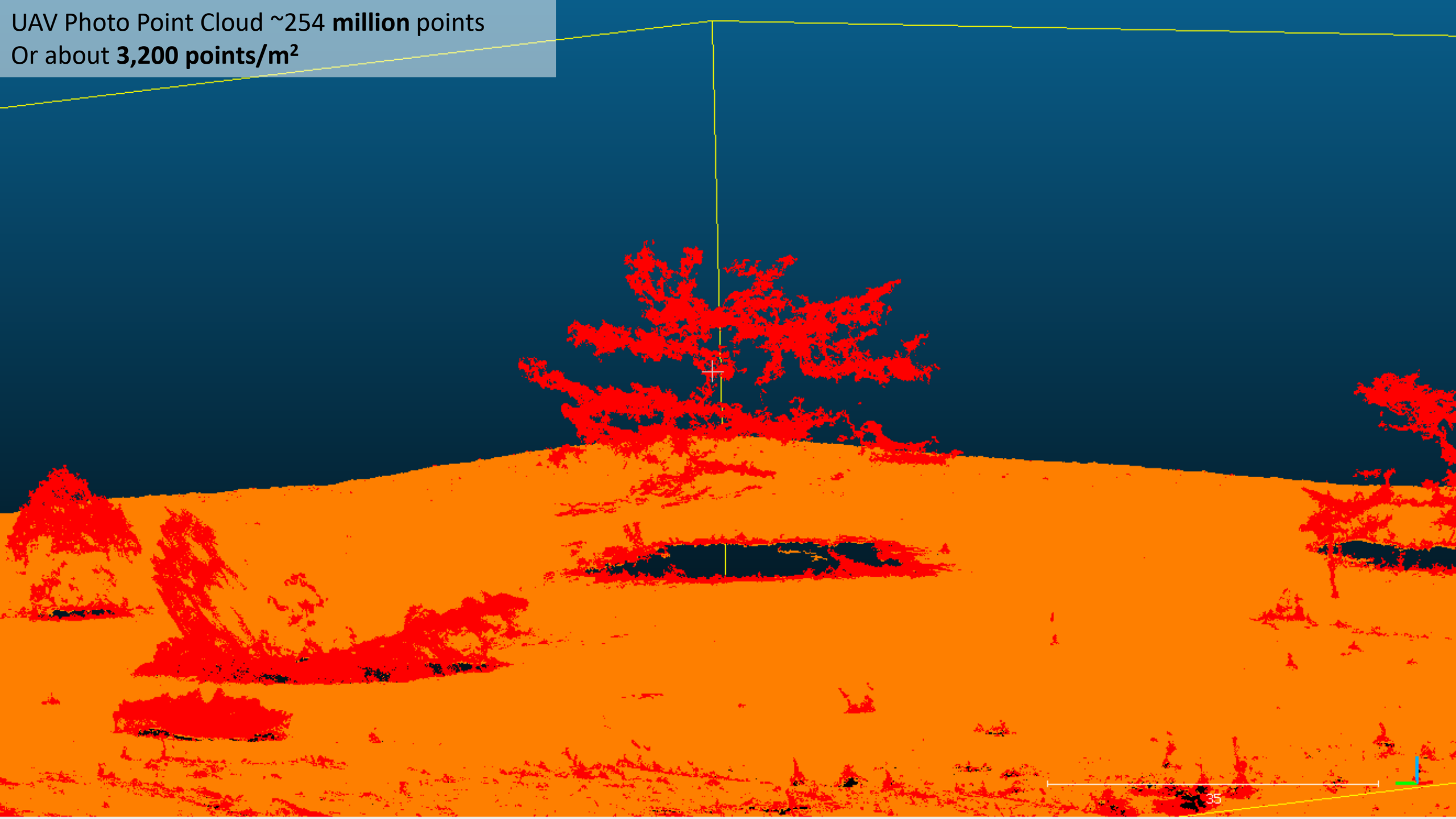
**EXIFtools**

**Agisoft  
Photoscan**

**LAStools**

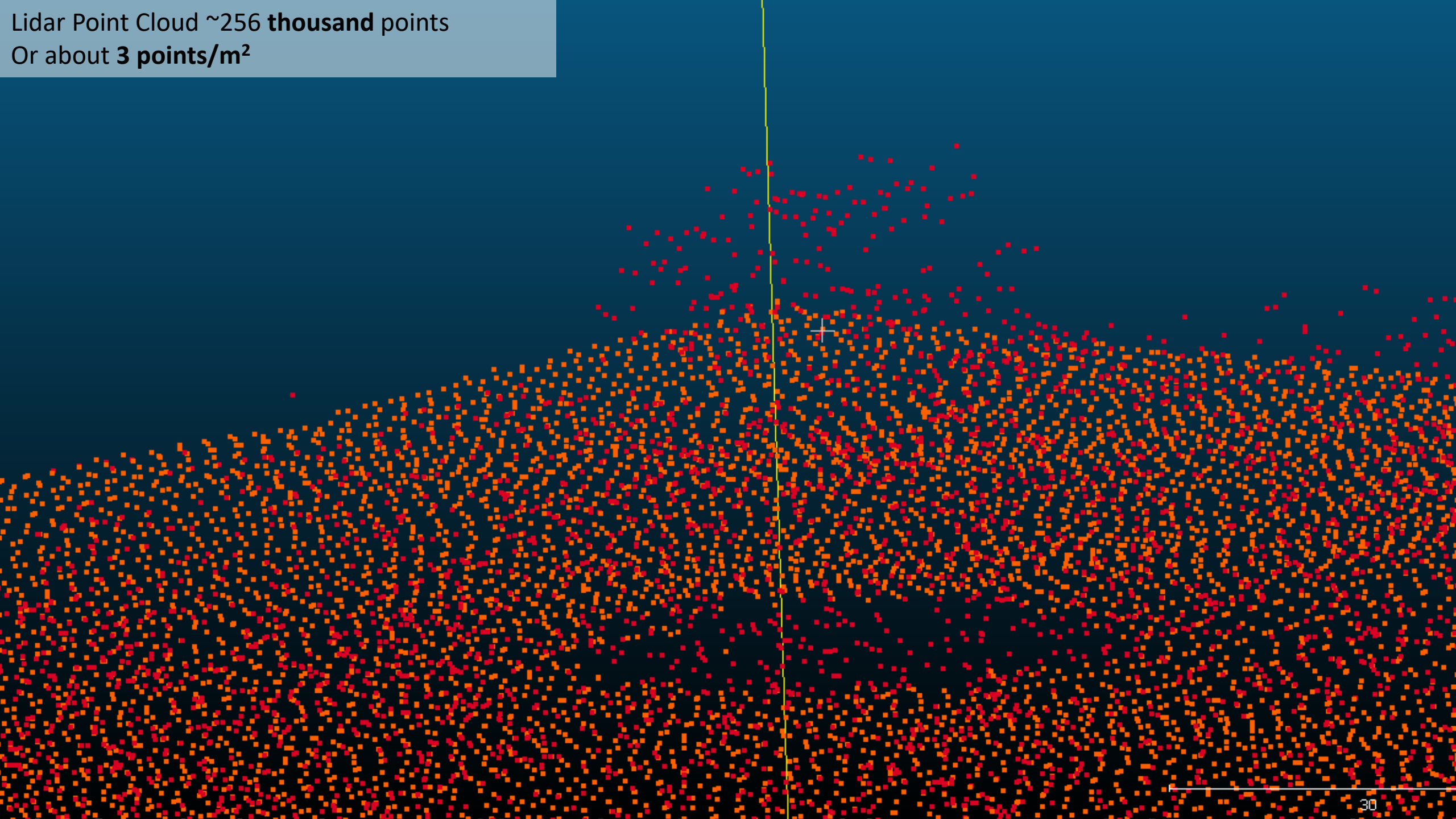


UAV Photo Point Cloud ~254 **million** points  
Or about **3,200 points/m<sup>2</sup>**



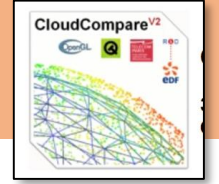


Lidar Point Cloud ~256 **thousand** points  
Or about **3 points/m<sup>2</sup>**





# WORKFLOW



## Register UAV Cloud with LiDAR

Sub-sample Ground Points

Coarse Align with LiDAR Bare Earth Ground Points

Fine Alignment Algorithm

## Point Cloud Classification

Classify Ground Points

Classify Vegetation Points

Export Classified Cloud

## Photo Alignment

Align photos in Photogrammetry Software

Build point clouds

Build Orthomosaic

Export Unclassified Dense Cloud

## Post-flight Image preprocessing

Extract /write EXIF metadata to/from images

Develop RAW photos (if necessary)

## Pre-flight planning

Derive Canopy Model with existing LiDAR Data

# SOFTWARE COCKTAIL

FUSION LiDAR Tools

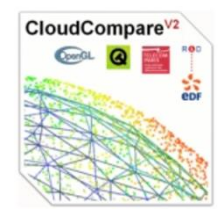
EXIFtools

Agisoft Photoscan

LAStools

Cloud Compare





**CloudCompare**

3D point cloud and mesh processing software  
Open Source Project

**LiDAR bare earth point cloud**

**UAV Photo point cloud**

Drastic  
Elevation  
Distortion  
(no GCPs)

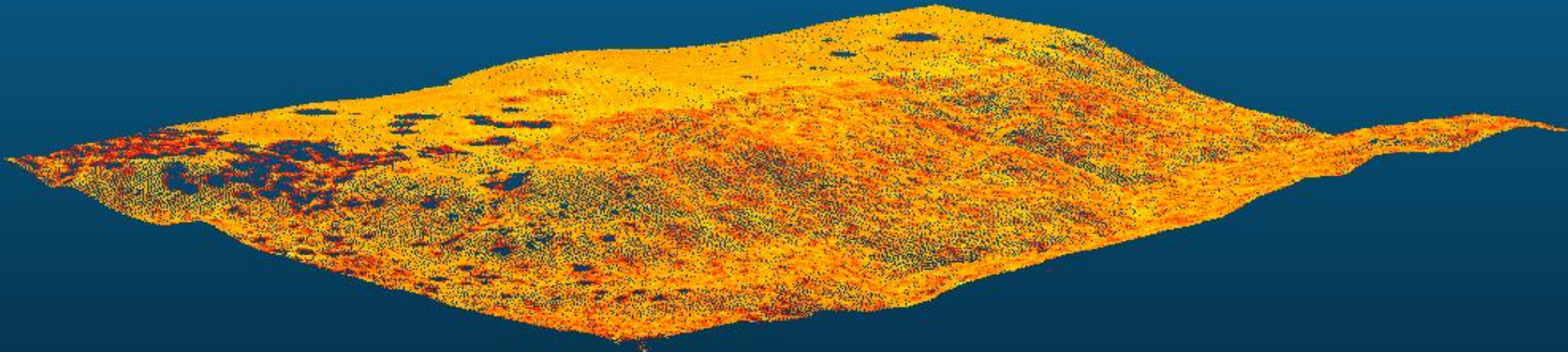
500





default point size - +

LiDAR bare earth point cloud



UAV Photo point cloud



Scale Z  
units down





[Rotation/Translation mode]

Rotation XYZ

☐ Tx ☐ Ty ☒ Tz

Register info

Final RMS: 2.45924 (computed on 1000000 points)

Transformation matrix

1.001	-0.003	-0.001	1.051
0.003	1.001	-0.015	-0.948
0.001	0.015	1.001	-10.009
0.000	0.000	0.000	1.000

Scale: 1.00129 (already integrated in above matrix!)

Theoretical overlap: 100%

This report has been output to Console (F8)

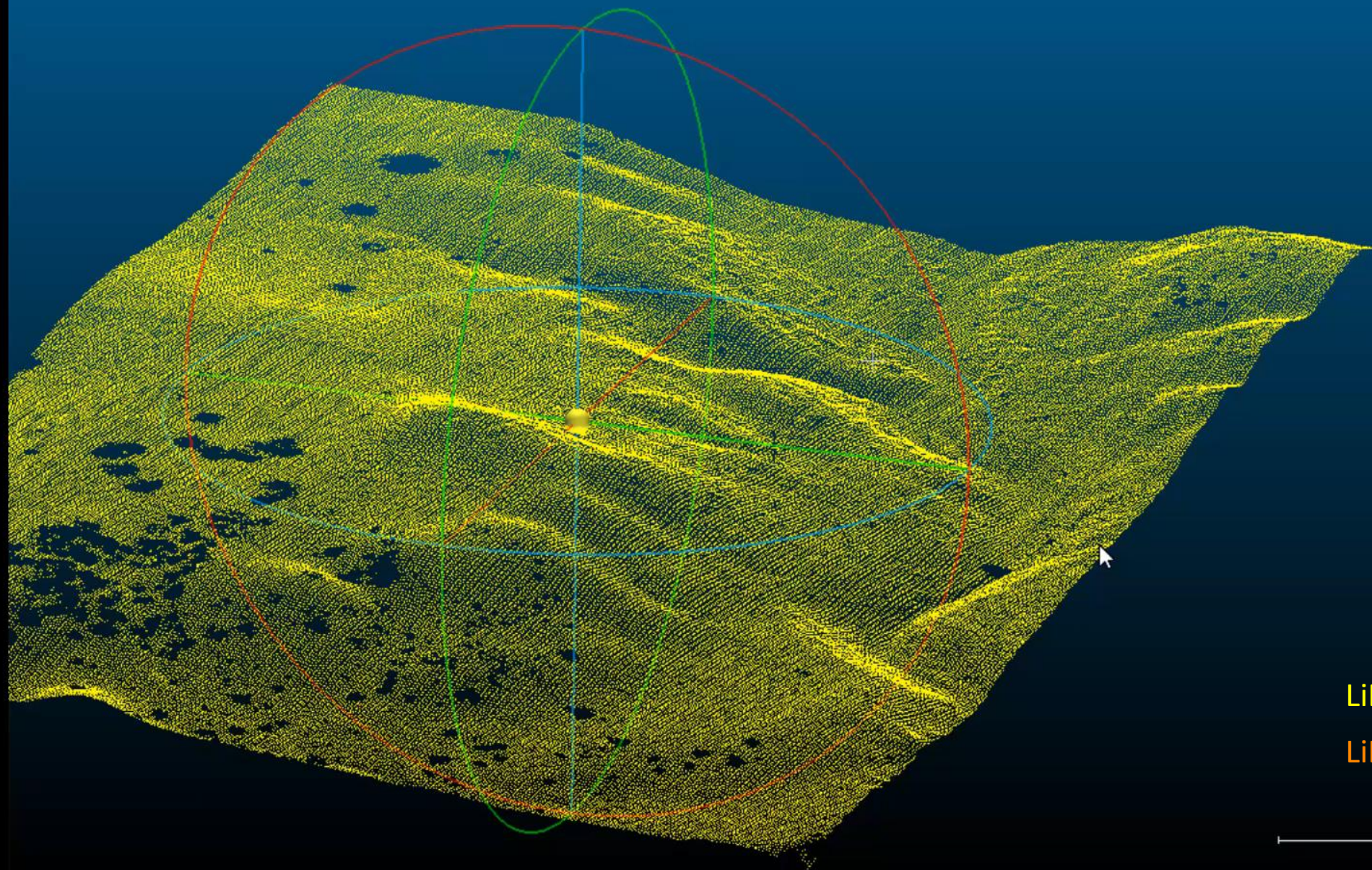
OK

Apply final transformation to the entire dataset (trees included)



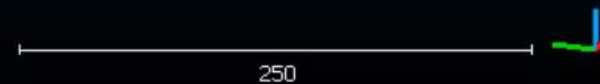
Photo Cloud Ground Points

Photo Cloud Vegetation Points



LiDAR Bare Earth Cloud

LiDAR Cloud Vegetation





# WORKFLOW

## Pre-flight planning

Derive Canopy  
Model with  
existing LiDAR  
Data

## Post-flight Image preprocessing

Extract /write  
EXIF metadata  
to/from images

Develop RAW  
photos (if  
necessary)

## Photo Alignment

Align photos in  
Photogrammetry  
Software

Build point  
clouds

Build  
Orthomosaic

Export  
Unclassified  
Dense Cloud

## Point Cloud Classification

Classify Ground  
Points

Classify  
Vegetation Points

Export Classified  
Cloud

## Register UAV Cloud with LiDAR

Sub-sample  
Ground Points

Coarse Align with  
LiDAR Bare Earth  
Ground Points

Fine Alignment  
Algorithm

**BUILD  
AMAZING  
MAPS  
WITH  
DATA**

# SOFTWARE COCKTAIL

**FUSION LiDAR  
Tools**

**EXIFtools**

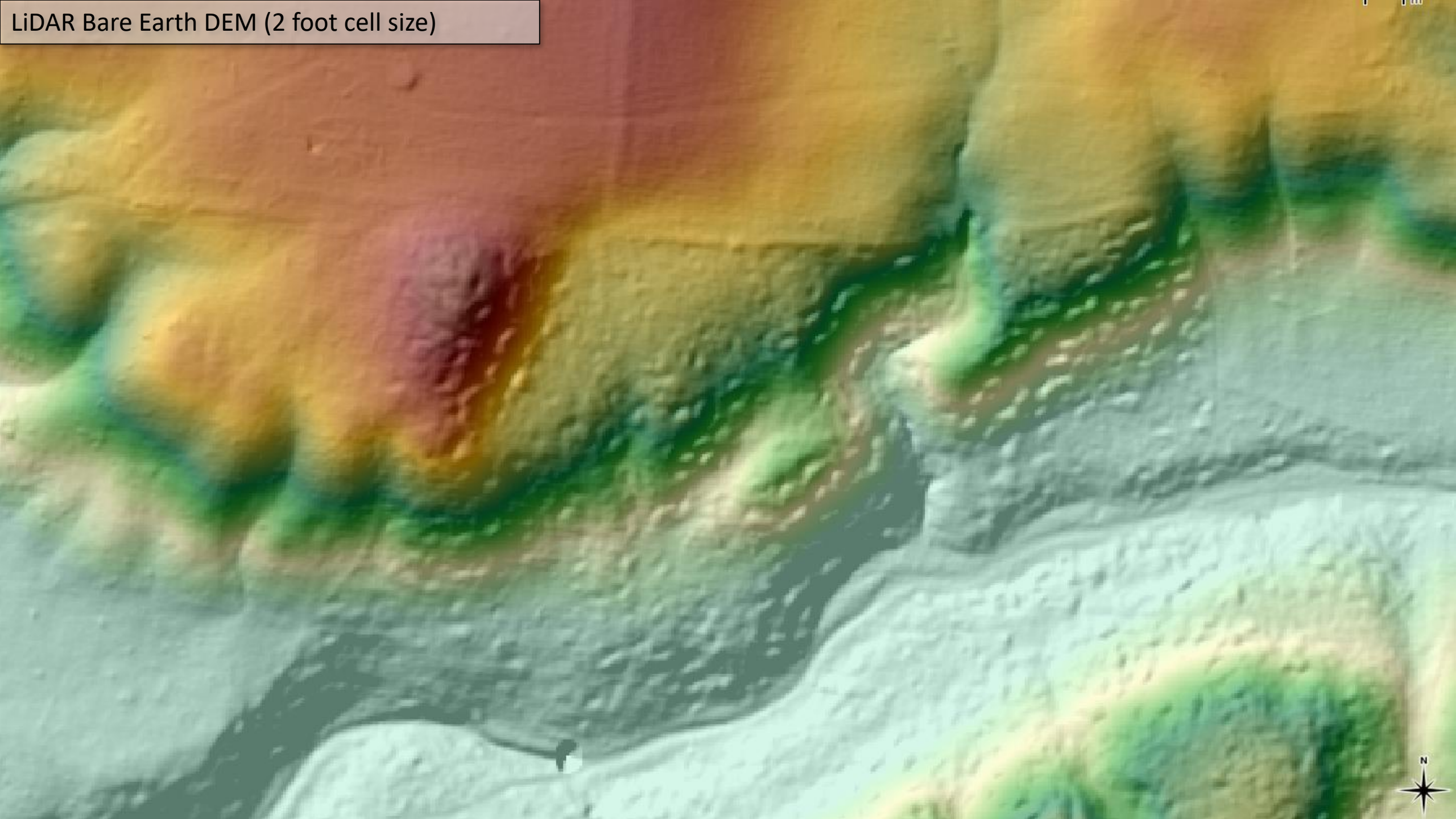
**Agisoft  
Photoscan**

**LAStools**

**Cloud Compare**

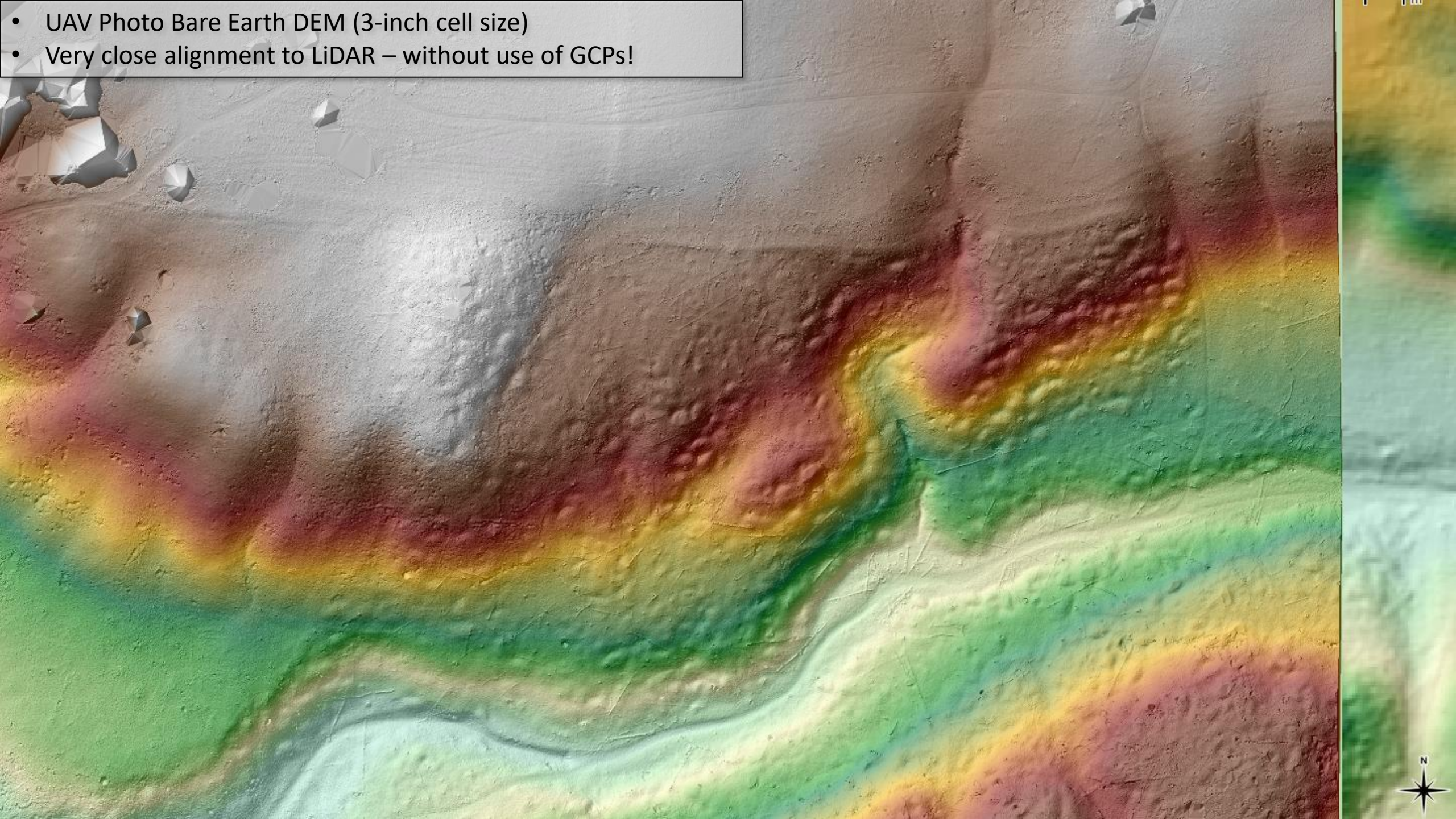


LiDAR Bare Earth DEM (2 foot cell size)



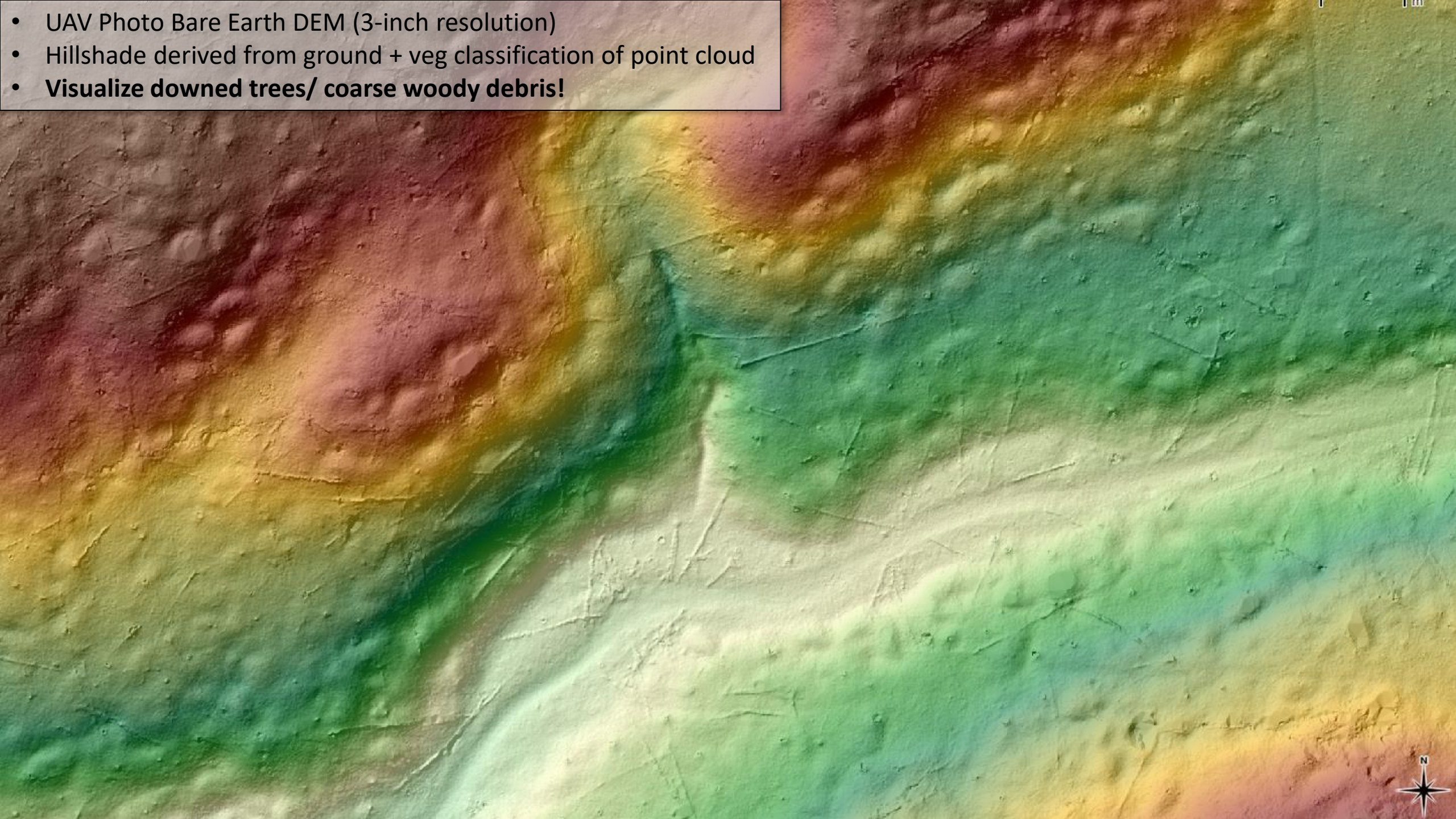


- UAV Photo Bare Earth DEM (3-inch cell size)
- Very close alignment to LiDAR – without use of GCPs!



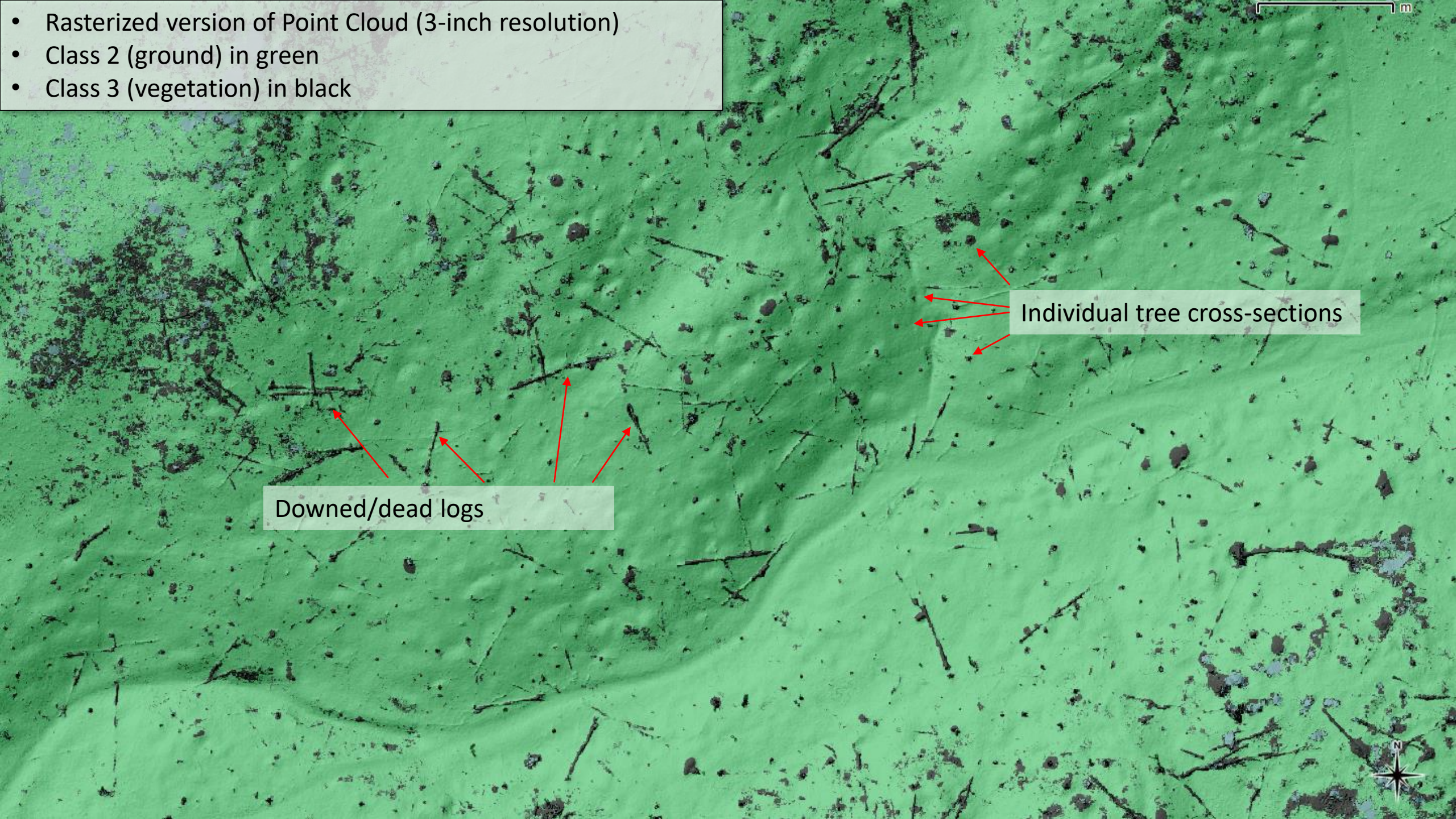


- UAV Photo Bare Earth DEM (3-inch resolution)
- Hillshade derived from ground + veg classification of point cloud
- **Visualize downed trees/ coarse woody debris!**





- Rasterized version of Point Cloud (3-inch resolution)
- Class 2 (ground) in green
- Class 3 (vegetation) in black



Individual tree cross-sections

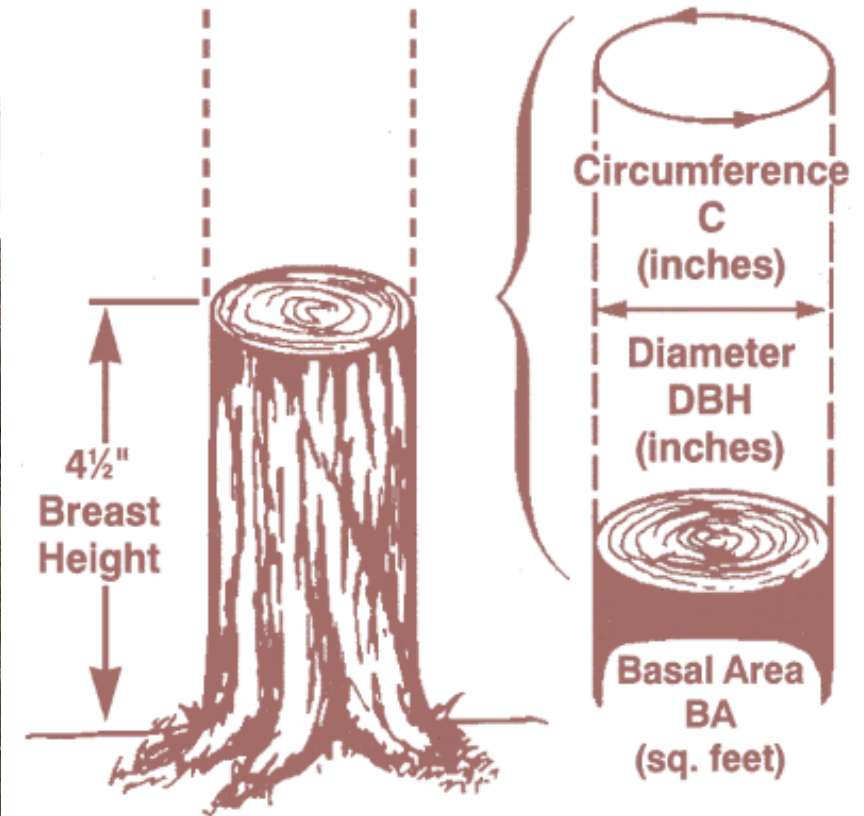
Downed/dead logs





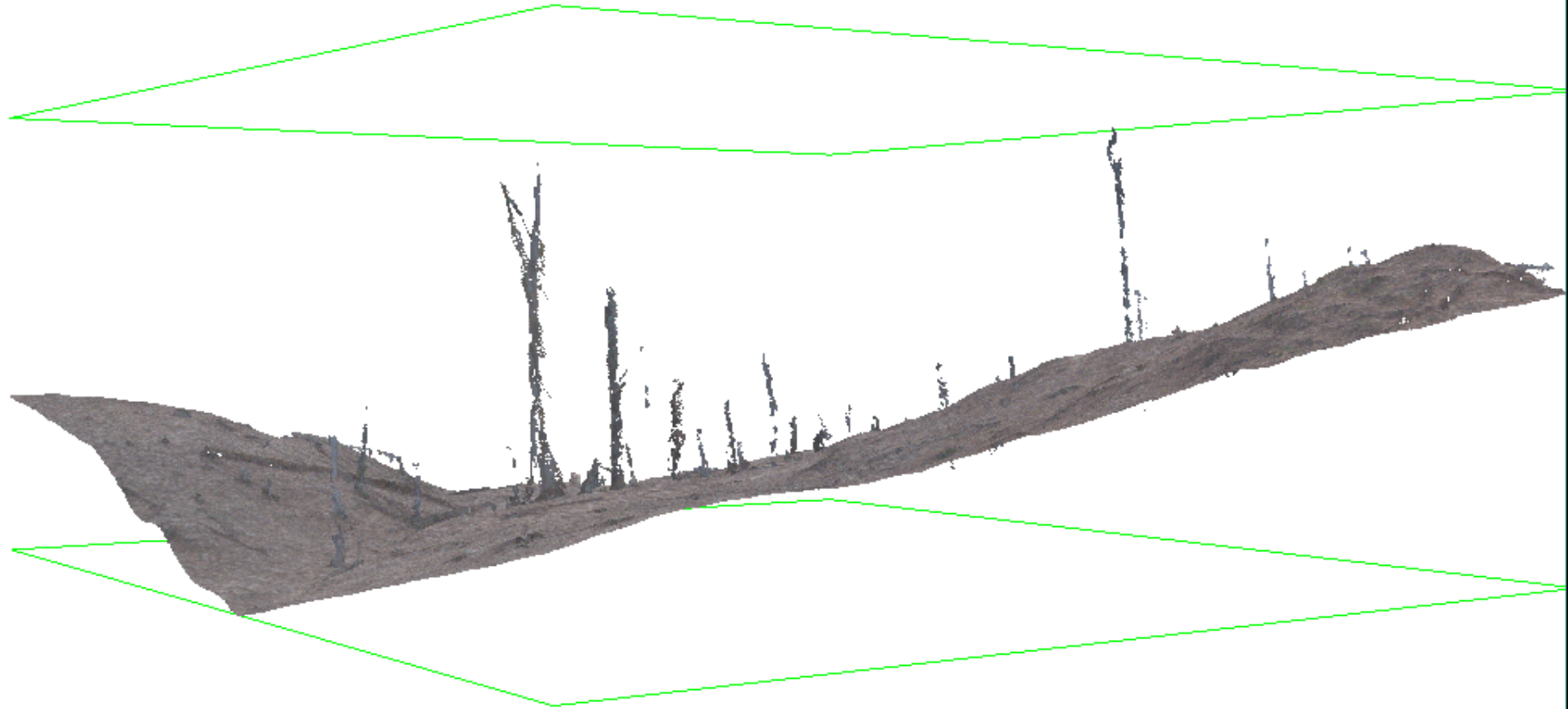
# Measuring Basal Area

- Basal area an important forest inventory measure.
- Used to estimate tree height and wood volume.
- Used in Forestry, Ecology, Timber valuation, etc.
- Typically estimated in the field on a sample of trees, then extrapolated to the entire forest stand.





Using **LAS height** command to subtract ground elevations and obtain normalized stem heights

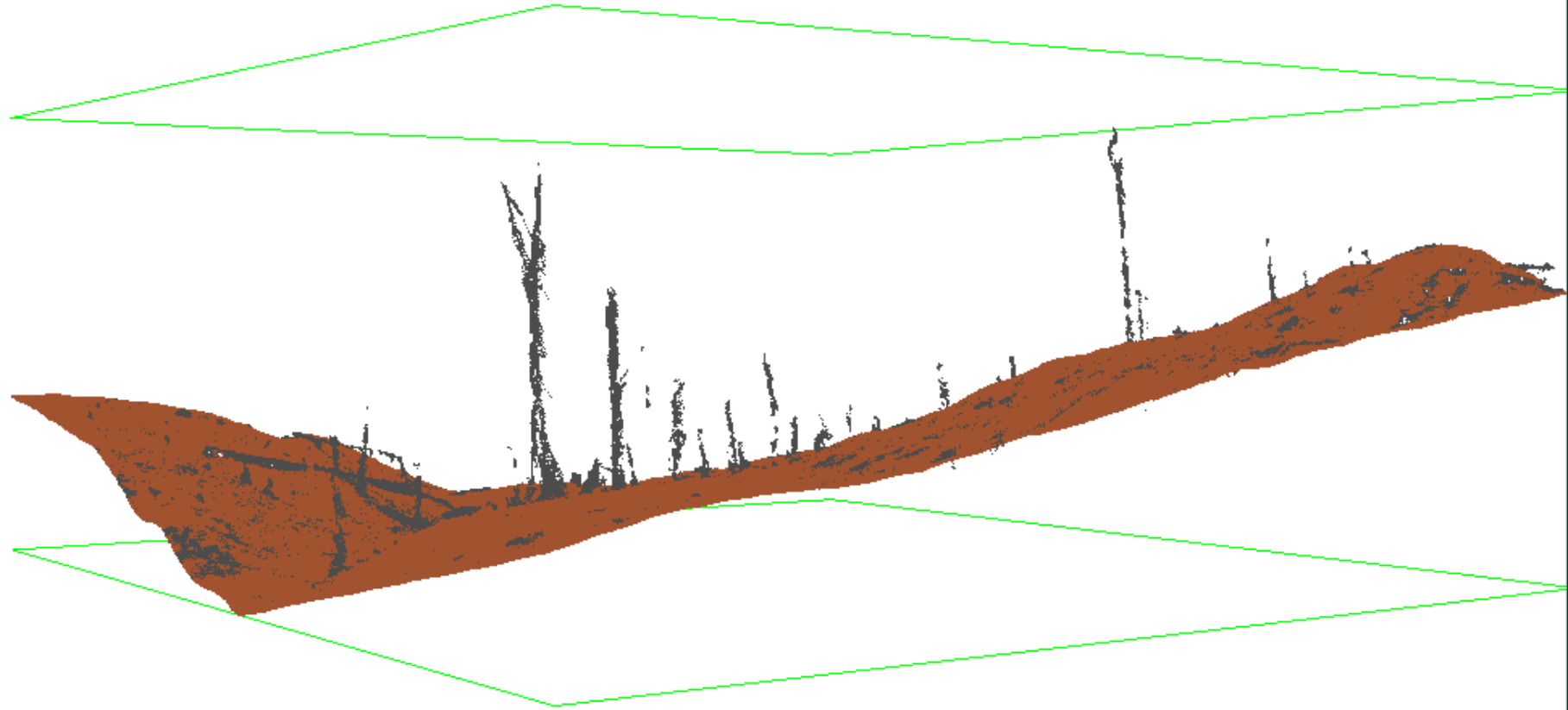


(UAV Photo cloud plot showing tree stems and terrain)



Using **LAS height** command to subtract ground elevations and obtain normalized stem heights

■ Trees  
■ Ground

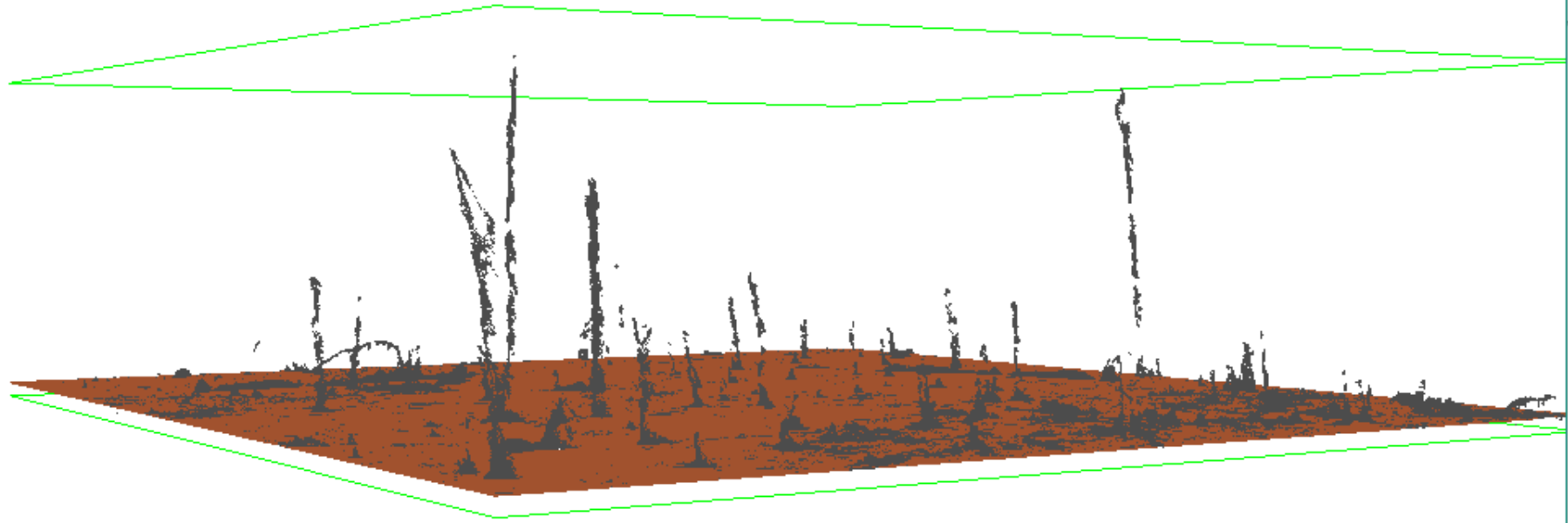


(UAV Photo cloud plot showing tree stems and terrain)



Using **LAS height** command to subtract ground elevations and obtain normalized stem heights

■ Trees  
■ Ground

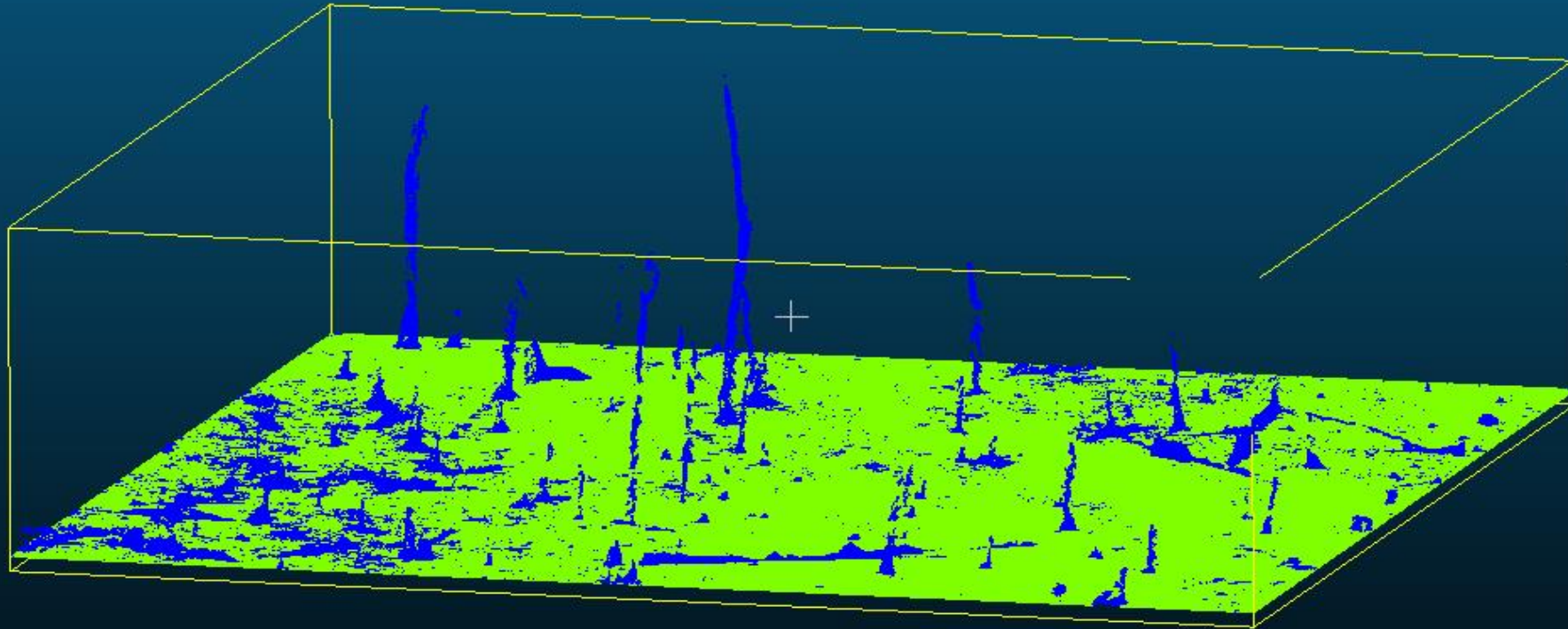


(UAV Photo cloud plot after height normalization)



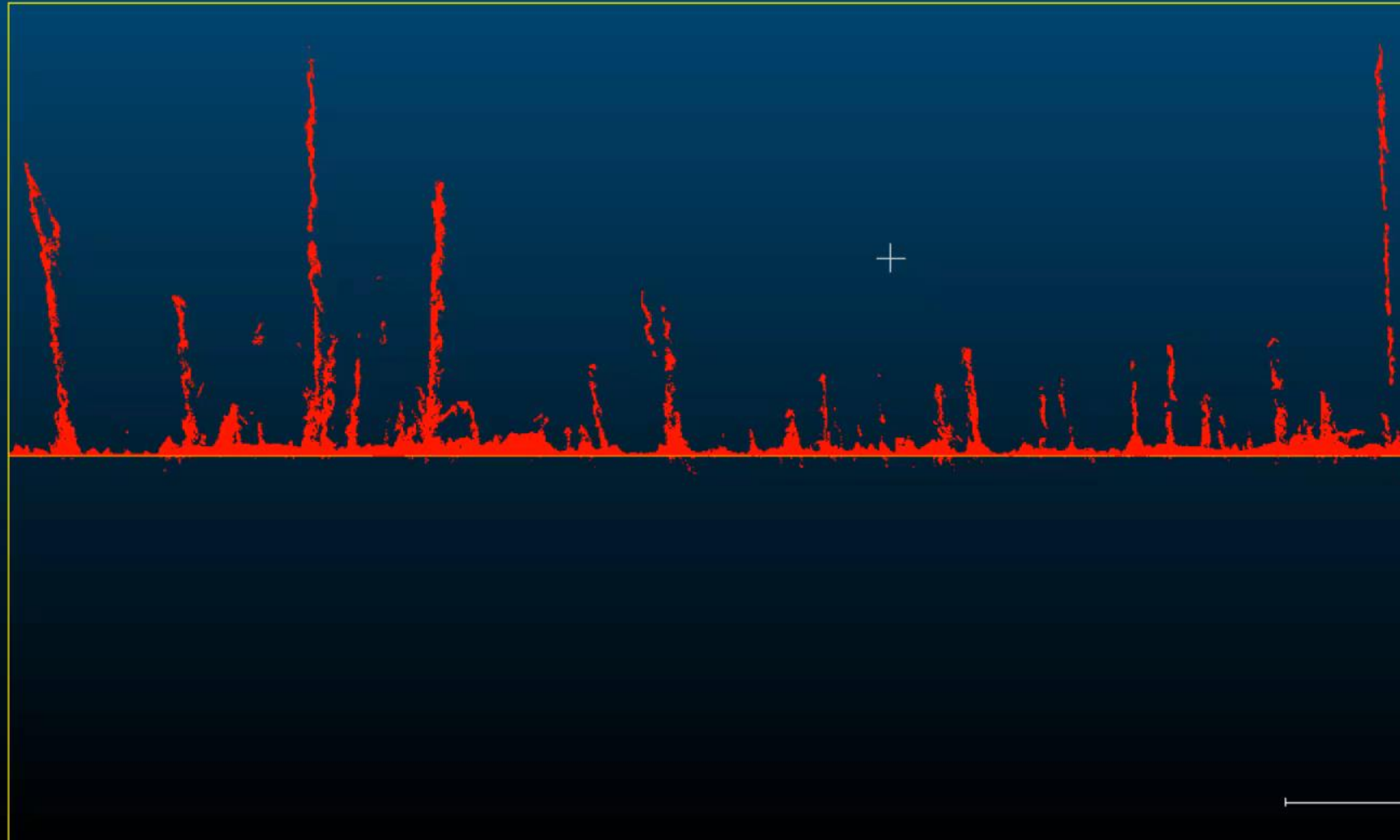
default point size - +

Slicing tree plots at different heights to get a direct measurement of basal area!





Same plot data- side view



Box thickness

X 173.11994934

Y 182.61996460

Z 105.69765472

advanced

Contour


Slices




Shift box

-X +X -Y +Y -Z +Z





Extract contours at  
any given “slice”  
(height)


☐ 

Box thickness



X  

Y  



Z  







advanced

Contour

Slices

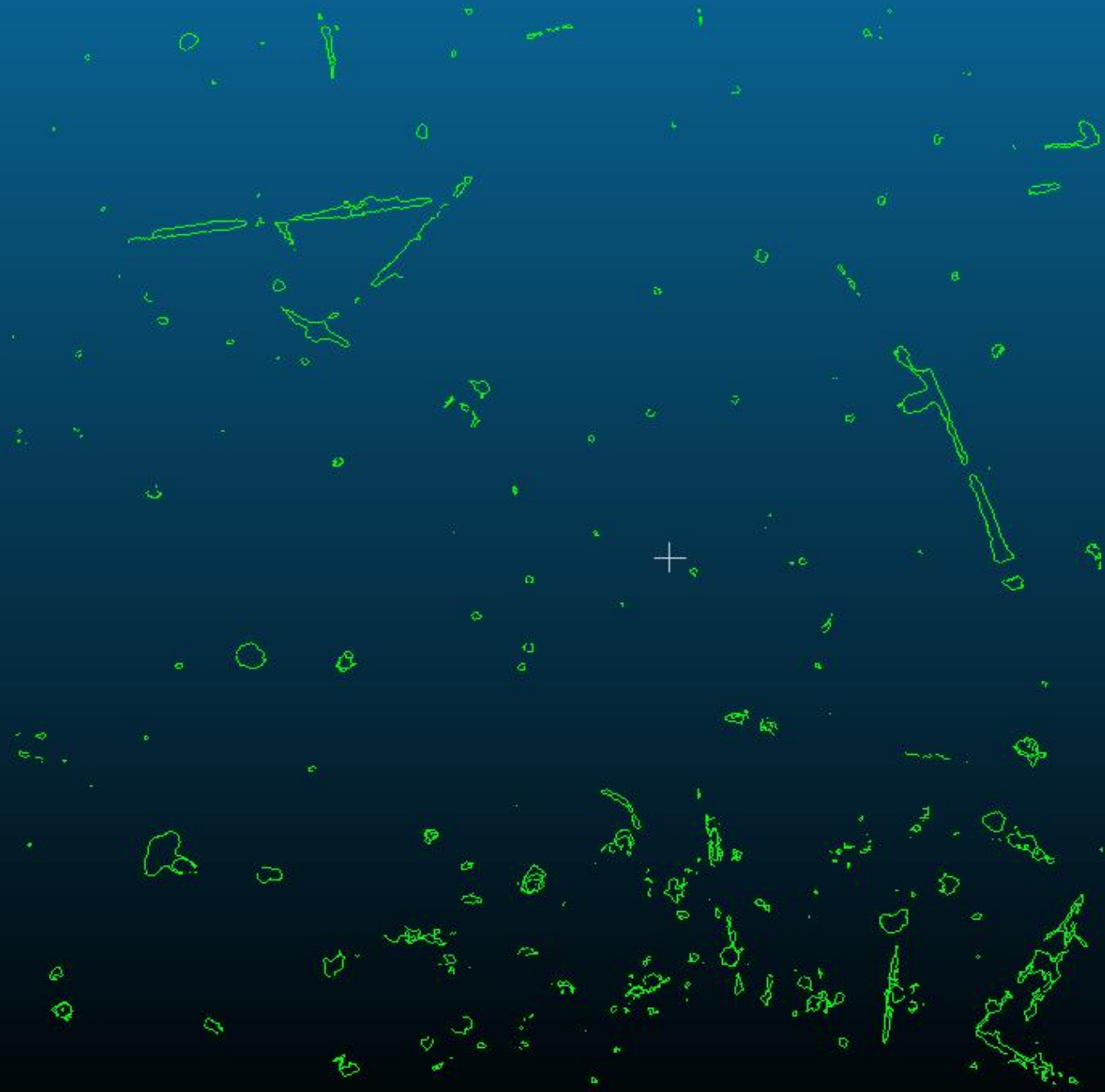







Shift box

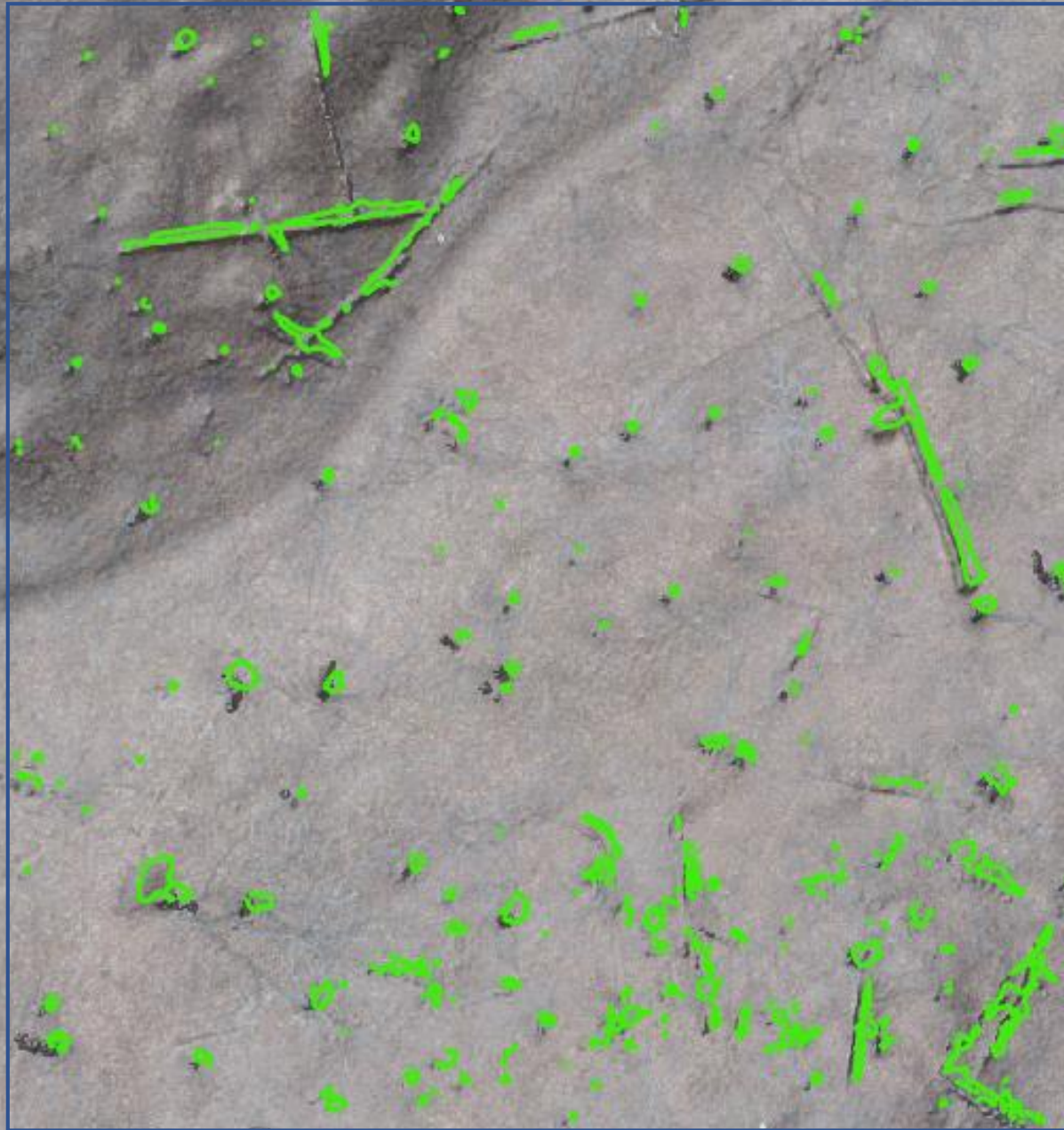


default point size - +

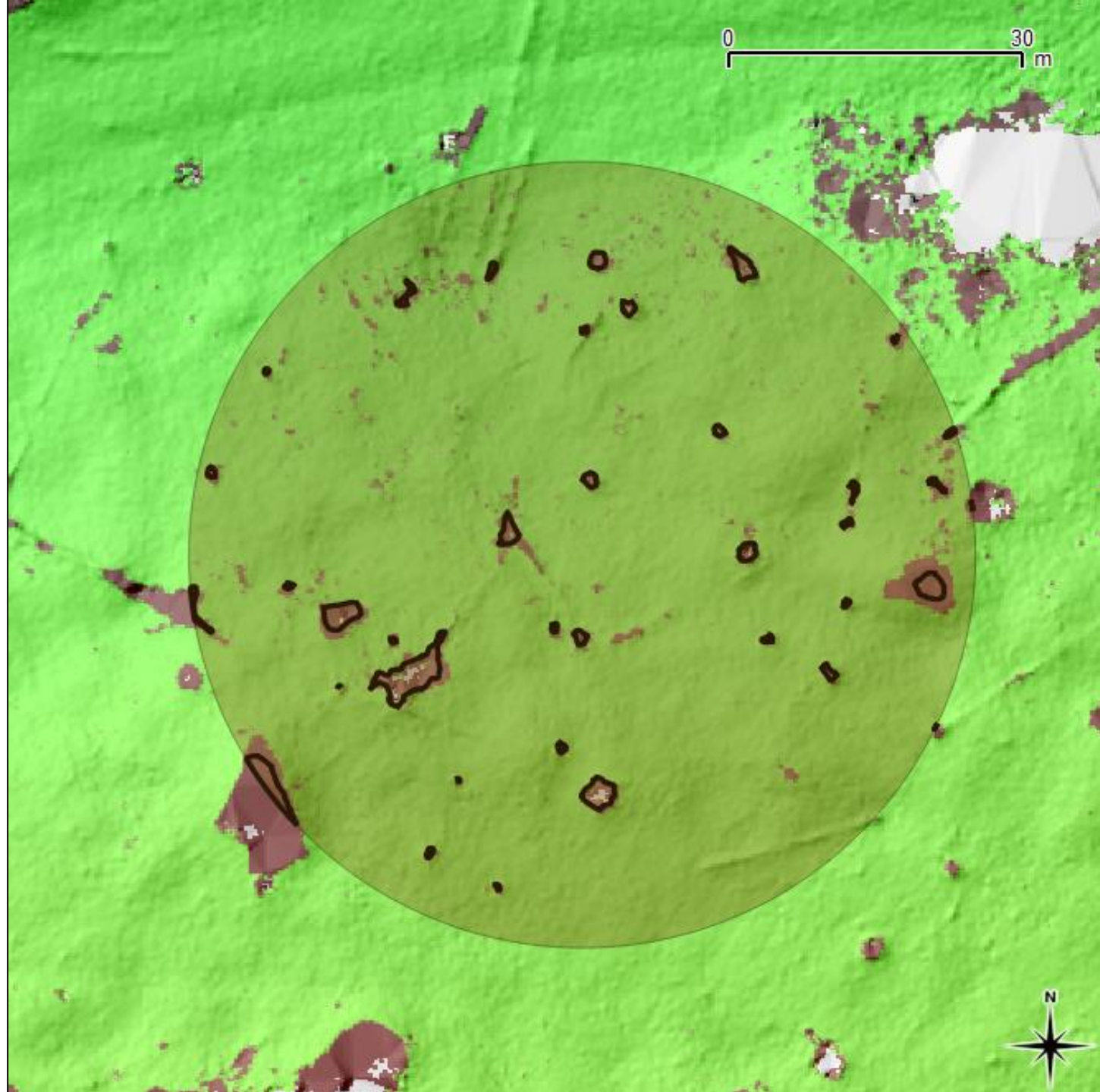
Extract contours at  
any given "slice"  
(height) → export  
to shapefile



- Repair line geometry/topology
- Sort by line length to separate downed wood logs from live tree cross sections
- Calculate basal area for entire forest area







## Potential Benefits to Foresters...

- More precise measurement of Basal Area (vs. prism estimates)?
- Quick assessment of an entire forest stand (vs. a sample)
- Classification/mapping of coarse woody debris/snags (habitat value)
- Assessing forest change (with repeat measurements)



# Challenges with this workflow...

- UAV-derived photo point clouds of forests are messy!

Applying common point cloud processing algorithms (i.e., classifying vegetation) across large or structurally diverse forests is cumbersome and produces unpredictable results

- Considerable time-investment in data processing/manipulation...

Relying on open-source tools/toggling between several different software programs slows efficiency

- Photo alignment and processing is computationally expensive!

Even on a robust computer workstation

- Is it really faster/better than measuring 20 acres of trees by hand?

# Conclusions

Are UAV’s useful for forest inventory and mapping? **YES!**

If so, what kinds of data products are possible to generate, and how can they be used?

Data Product	Use
Orthophoto	<ul style="list-style-type: none"><li>• Detailed areal assessment</li><li>• Documenting existing conditions</li><li>• Change assessment</li></ul>
Digital Elevation Model	<ul style="list-style-type: none"><li>• Hydro – soil – erosion analysis</li><li>• Skid trail layout/design</li><li>• Soil disturbance regime</li></ul>
Classified Point Cloud	<ul style="list-style-type: none"><li>• Stem count</li><li>• DBH for entire forested stand</li><li>• Coarse woody debris mapping</li><li>• Snag analysis</li></ul>



# Conclusions

- With all of the new LiDAR coverage in Michigan, how can that data be used to make up for where UAV imagery falls short (and vice versa)?

UAV photos can be aligned to LiDAR cloud, thereby eliminating the investment (money and field time) in high accuracy ground control point surveying.

UAV photos **add value** to existing LiDAR datasets by increasing point density → expand use beyond original intent (bare earth model)

- What can be done with basic (consumer-grade) UAVs? **A lot, but...**

The better the UAV, the less time you'll spend post-processing images and data





Questions?

Thank You

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