



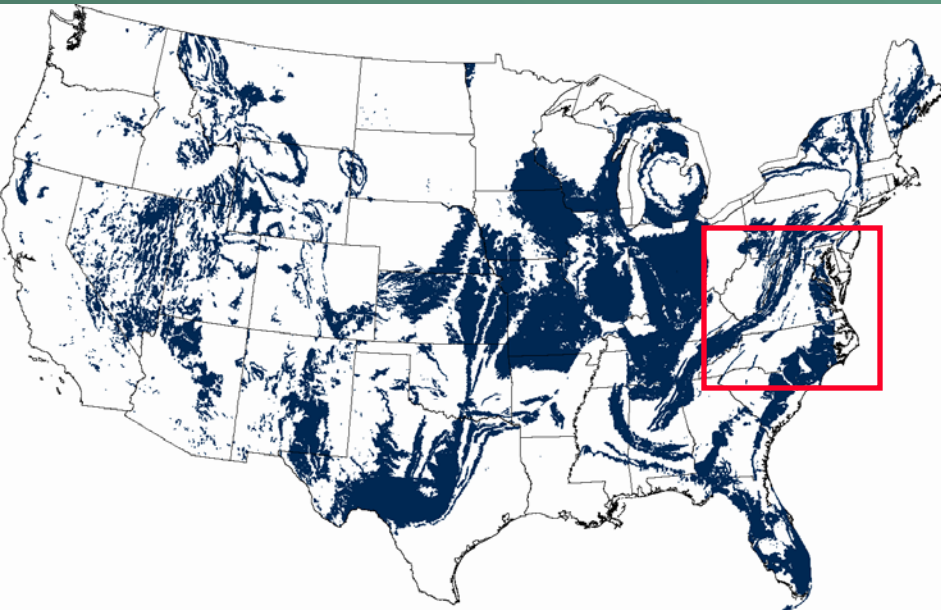
# An evaluation of automated GIS tools for delineating karst sinkholes and closed depressions from 1-meter LiDAR-derived digital elevation data

*Daniel H. Doctor<sup>1</sup> and John A. Young<sup>2</sup>*  
*U.S. Geological Survey*

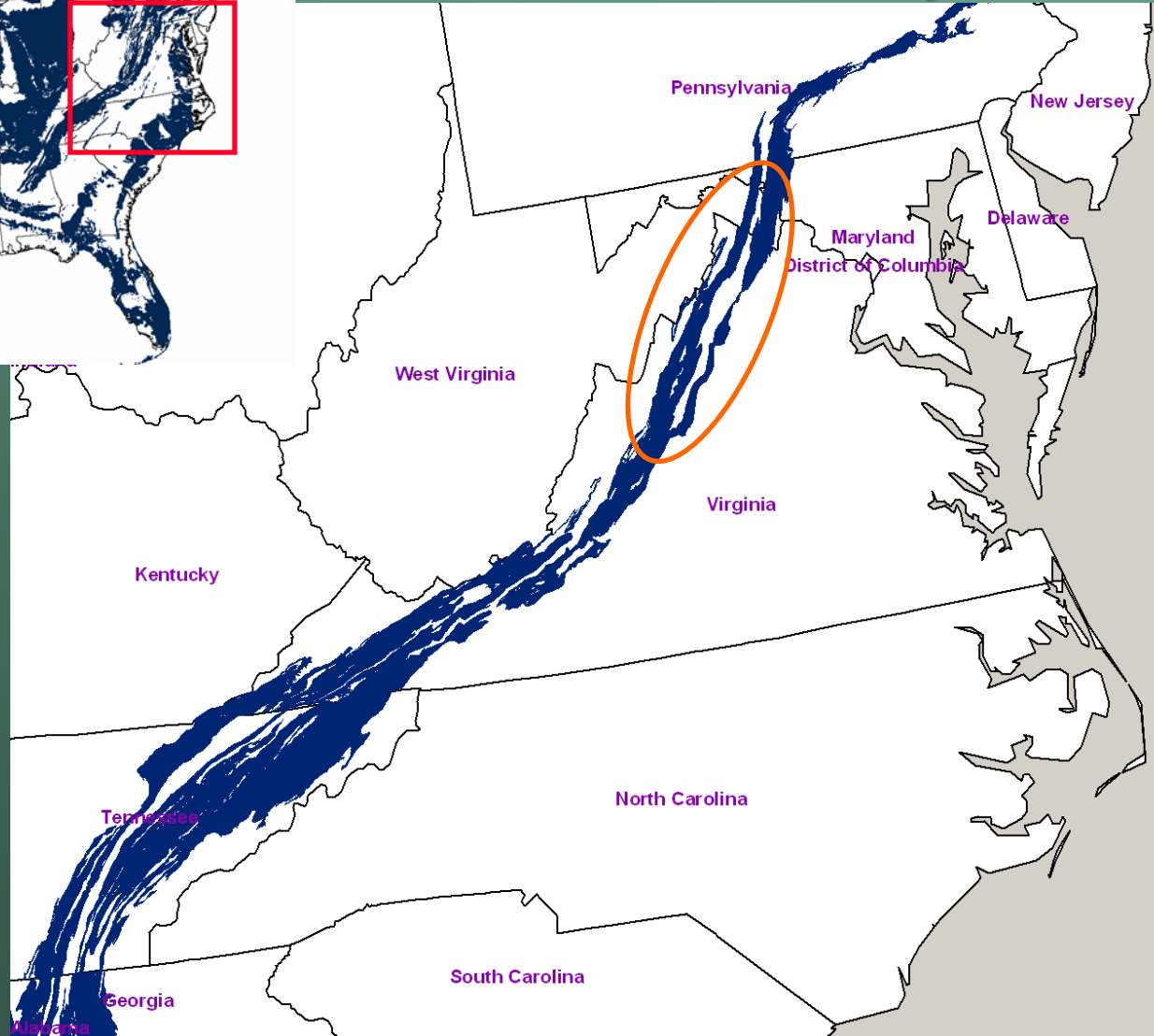
<sup>1</sup> Eastern Geology and Paleoclimate Science Center, Reston, Virginia

<sup>2</sup> Leetown Science Center, West Virginia U.S. Geological Survey

# Karst in the United States

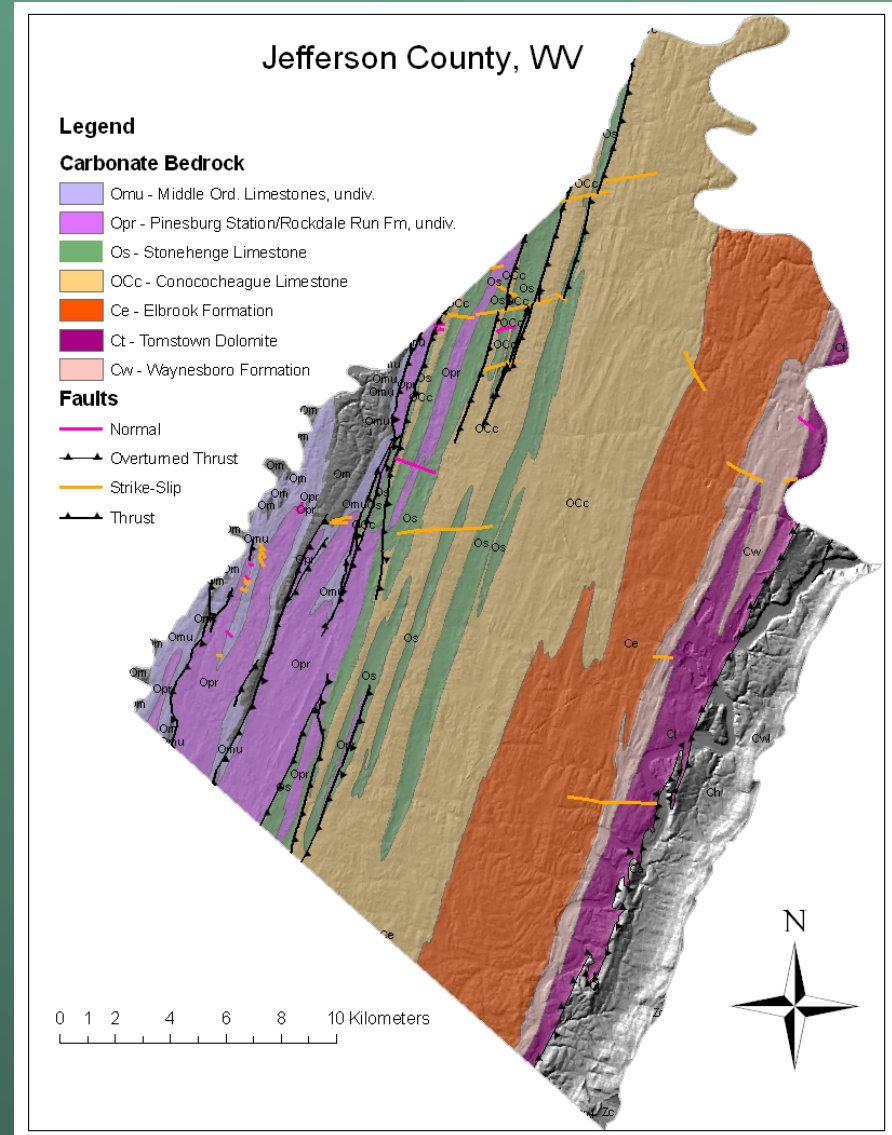
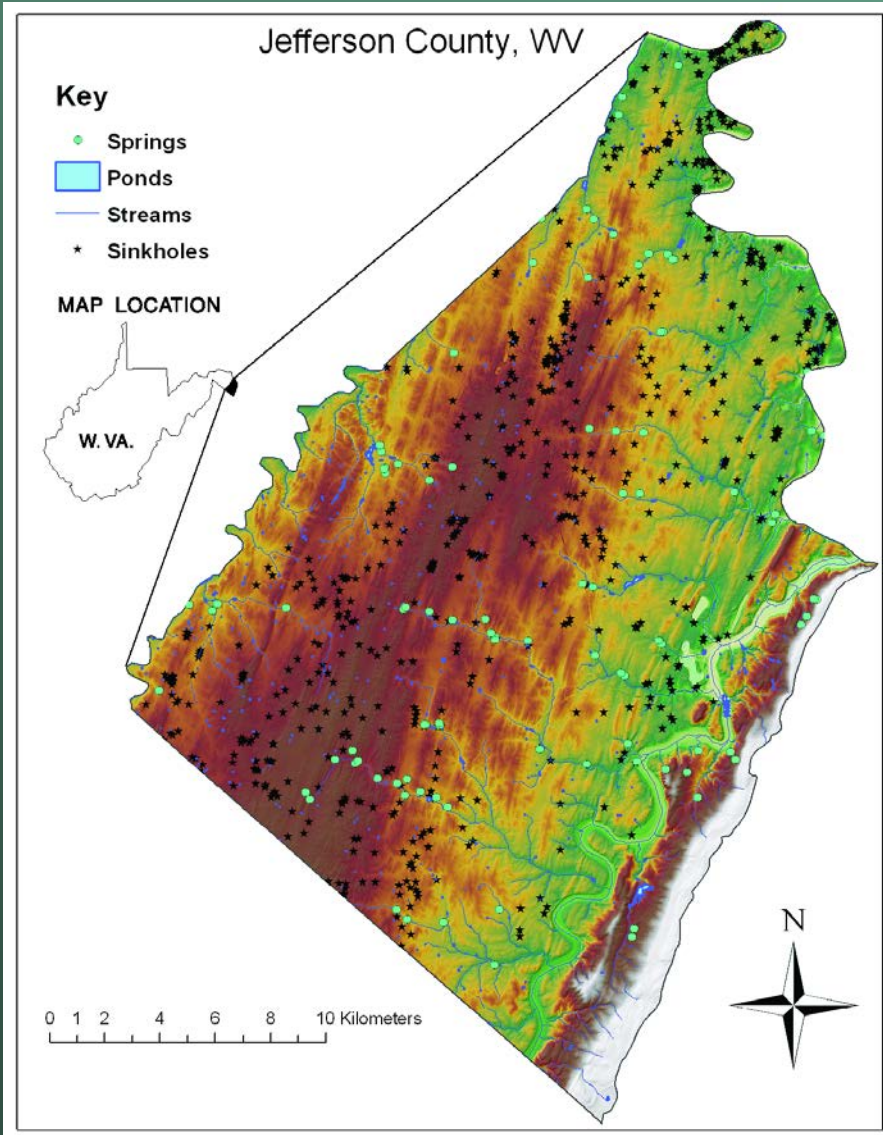


## Karst in the Appalachian Great Valley

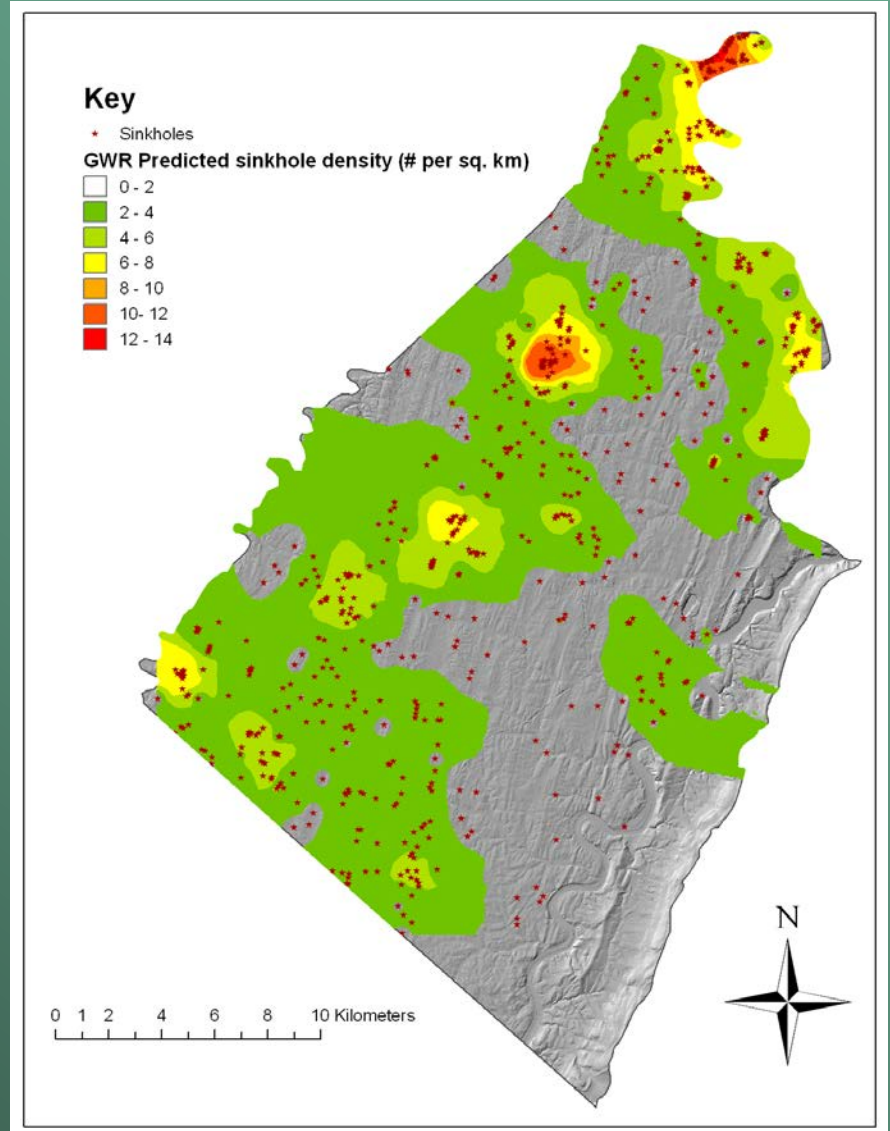
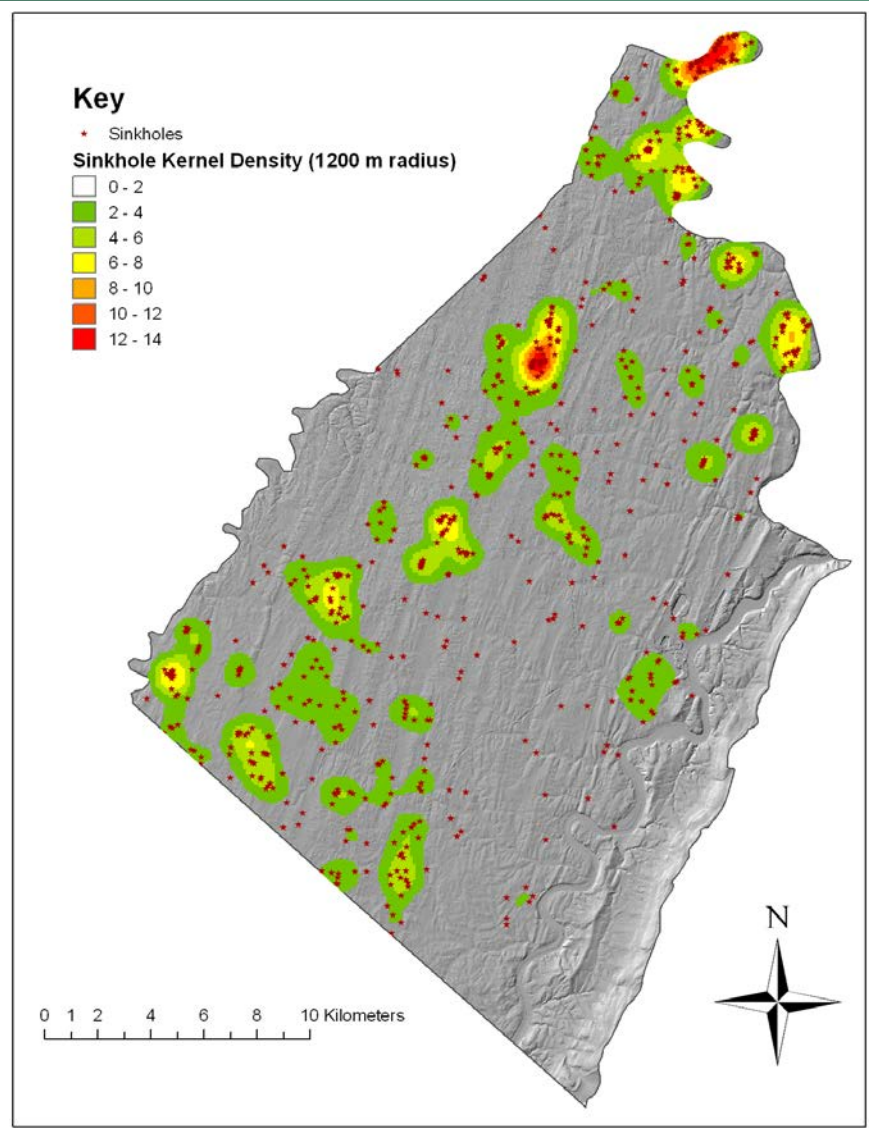




# Sinkhole susceptibility mapping



# Sinkhole susceptibility mapping



# Sinkhole susceptibility mapping

## GOAL:

Construct maps of relative sinkhole susceptibility by relating locations of known sinkholes to underlying hydrogeologic factors that influence sinkhole formation

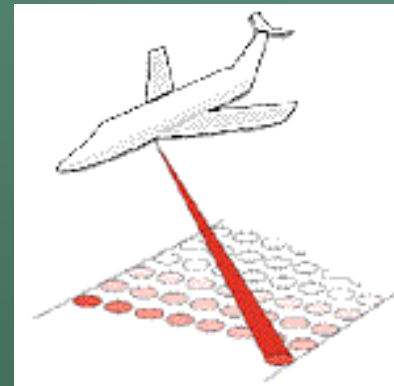
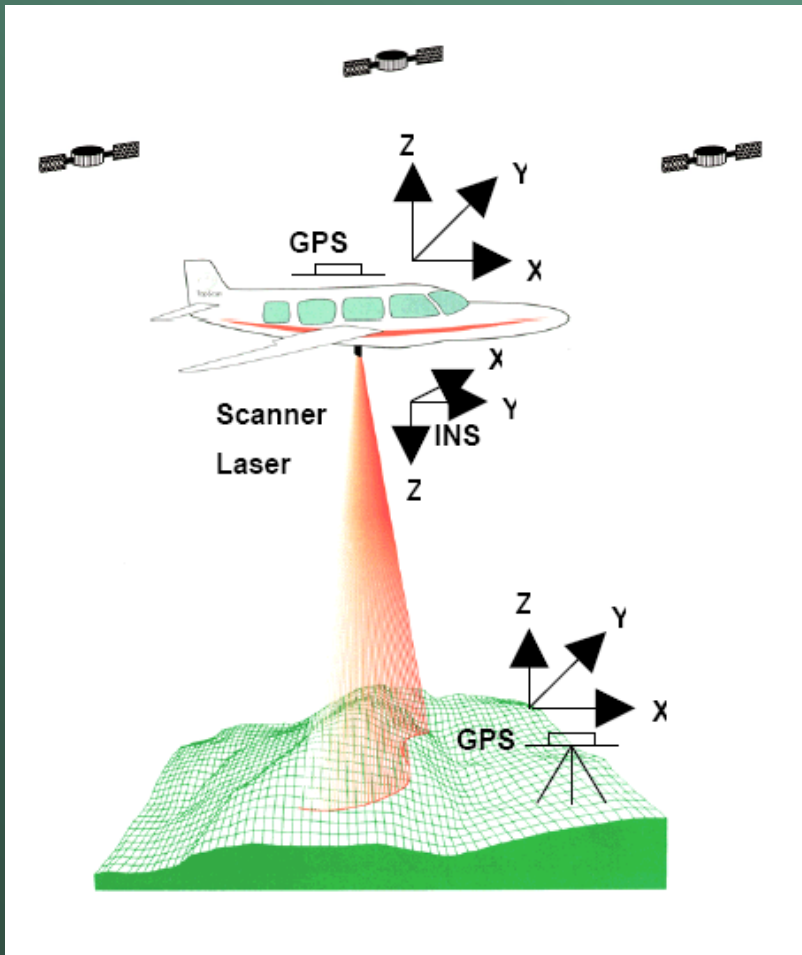
## NEED:

- Accurate geologic information
  - ✓ field mapping
- Precise location, shape, and hydrologic information of closed depressions
  - ✓ field mapping (but tedious)
- A rapid, reliable method for mapping closed depressions  
(LIDAR?)



# What is LiDAR?

“Light Detection and Ranging” or “light radar”



# 1m resolution aerial NAIP imagery

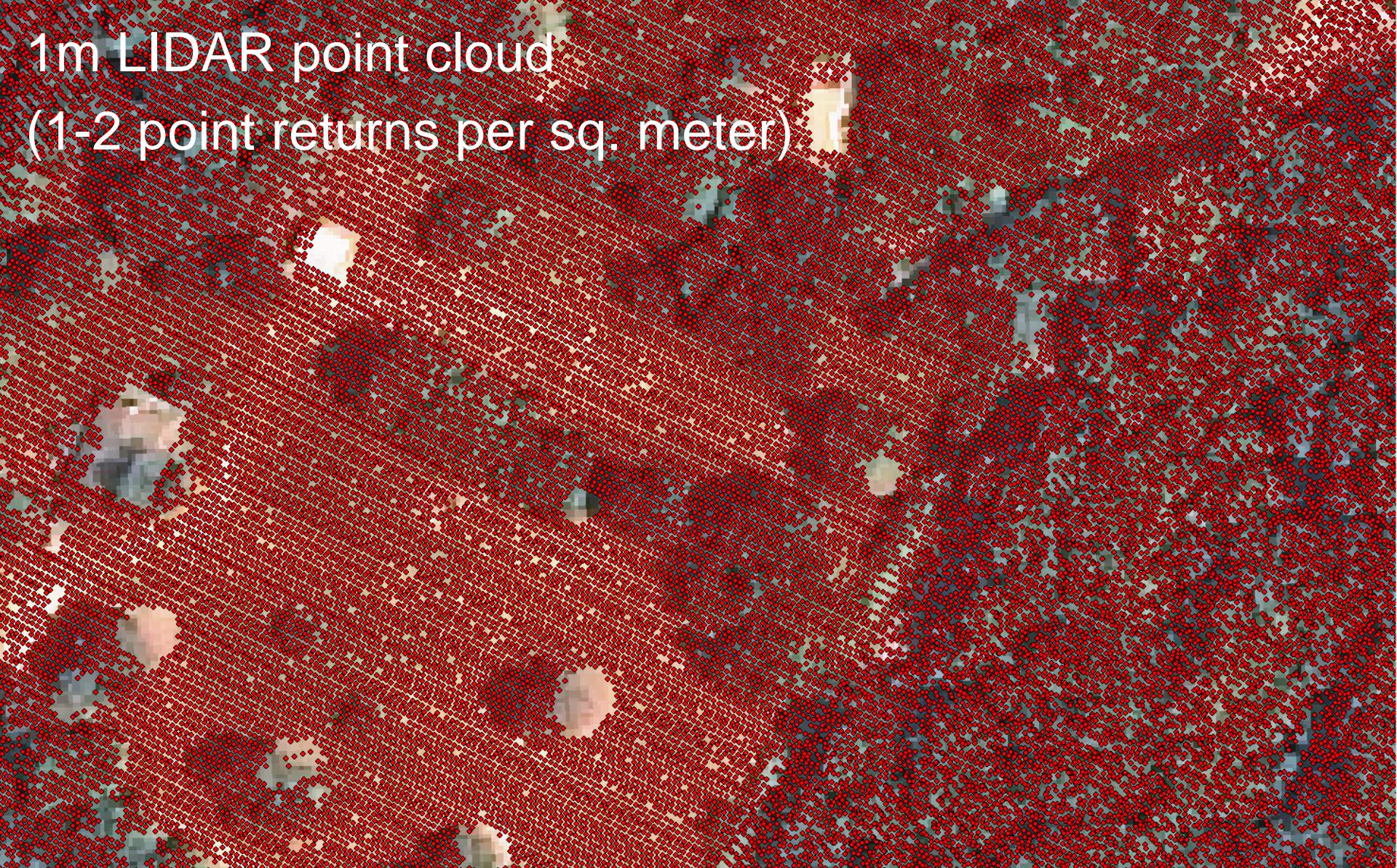


on))

1:636 | UTM (NAD83) - ( 763778.975, 4327360.550, 202.614 m ) | 39° 03' 19.8497" N, 77° 57' 6.0442" W



1m LIDAR point cloud  
(1-2 point returns per sq. meter)



1:636 | UTM (NAD83) - ( 763560.961, 4327401.091, 214.015 m ) | 39° 03' 21.3999" N, 77° 57' 15.0458" W



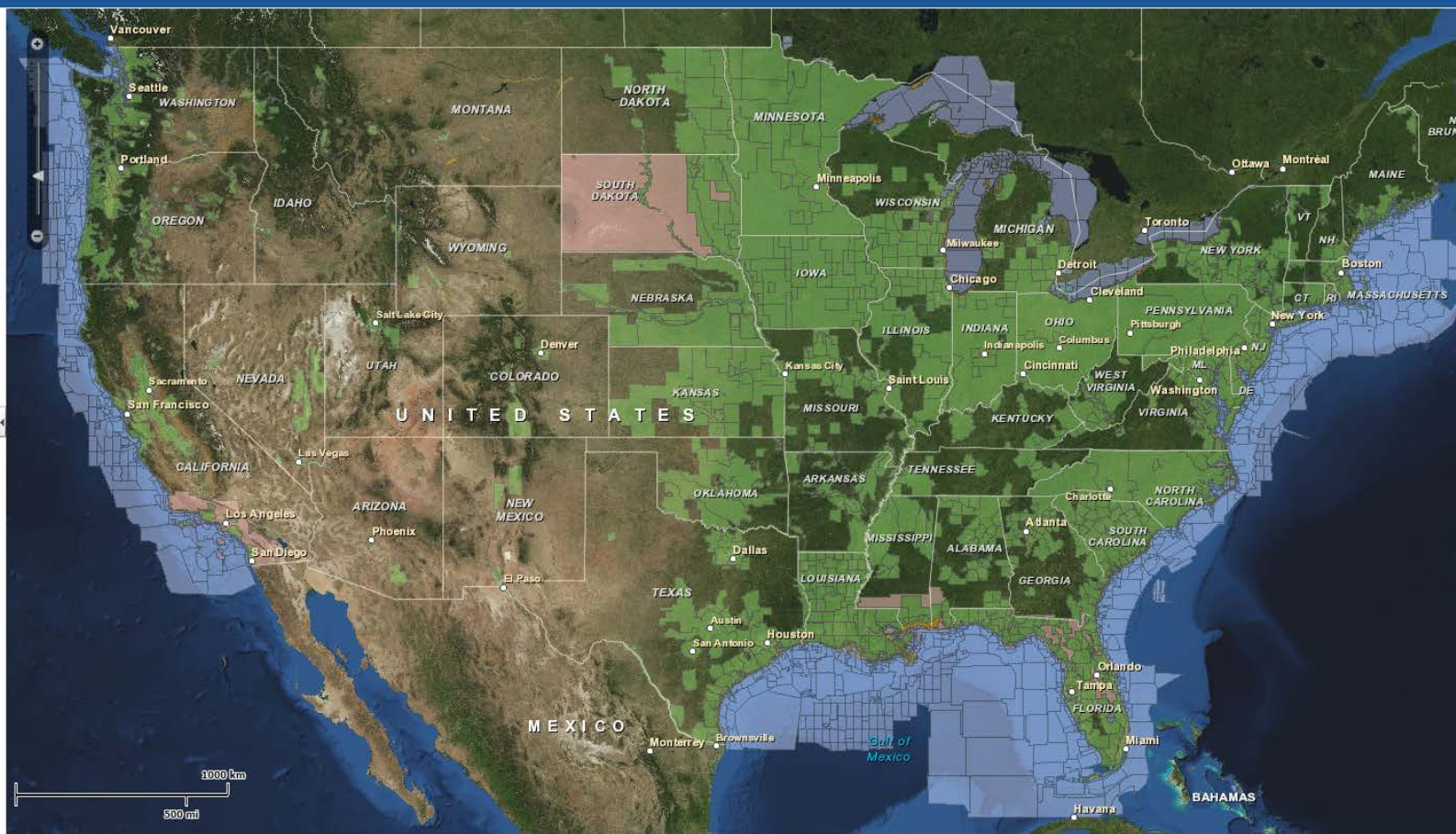
Select State/Territory ▾  
 Select County/Island ▾



Instructions    FAQ  
 Download Inventory    Metadata  
 Map Service    More Information

- Data Type**
- Topographic Lidar
  - Topobathy Shoreline Lidar
  - IfSAR Data
  - Bathymetric Lidar
  - NOAA Hydrographic Surveys
  - Other Bathymetric Surveys
  - USACE Dredge Surveys
  - Trackline Bathymetry
  - Multibeam Bathymetry

\*Data inventory current as of November 2012



Topographic    Bathymetric

Print Report

# National Lidar coverage (as of November, 2012)



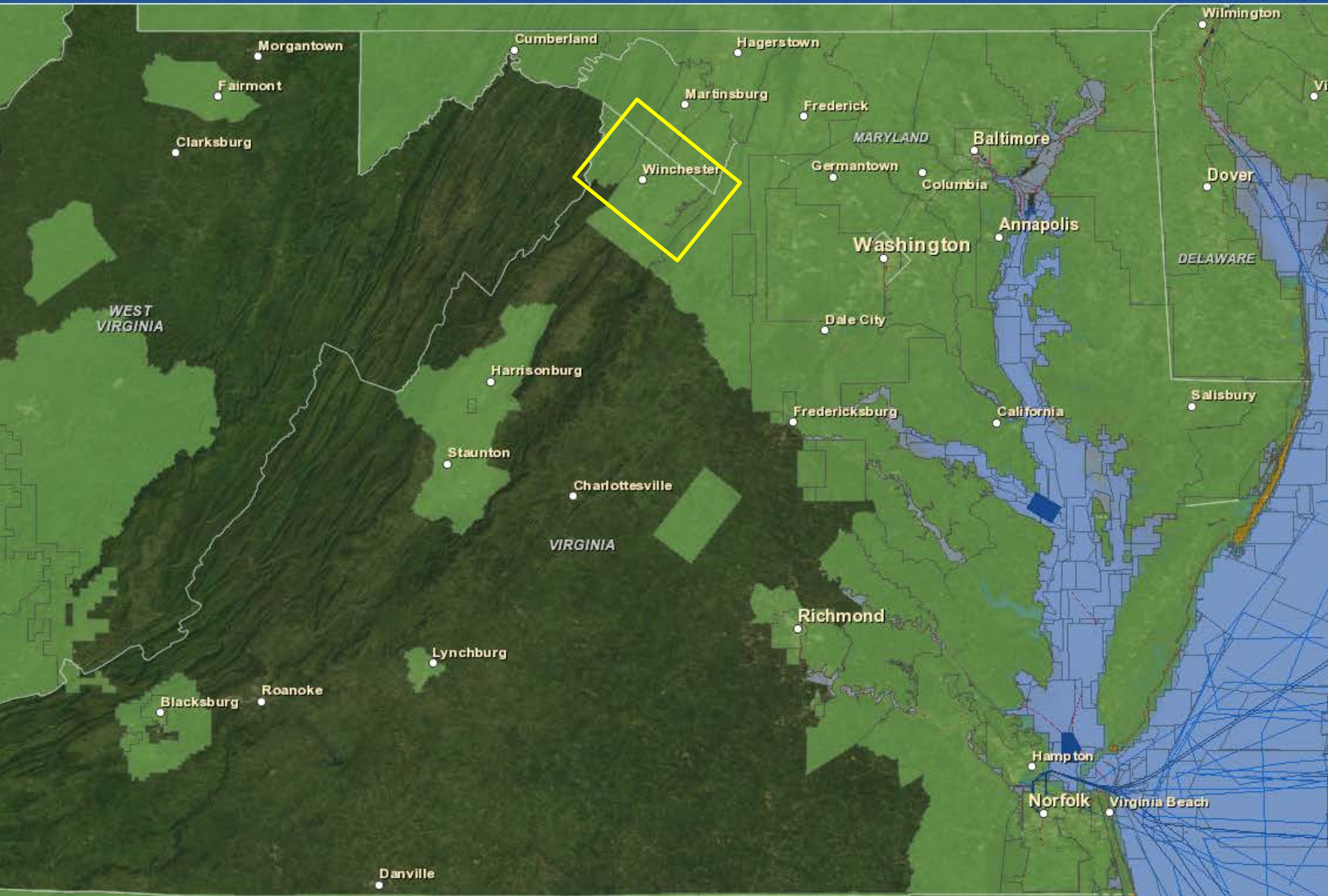
OTHER LINKS:

- [http://en.wikipedia.org/wiki/National\\_Lidar\\_Dataset\\_\(United\\_States\)](http://en.wikipedia.org/wiki/National_Lidar_Dataset_(United_States))
- <http://www.opentopography.org/>





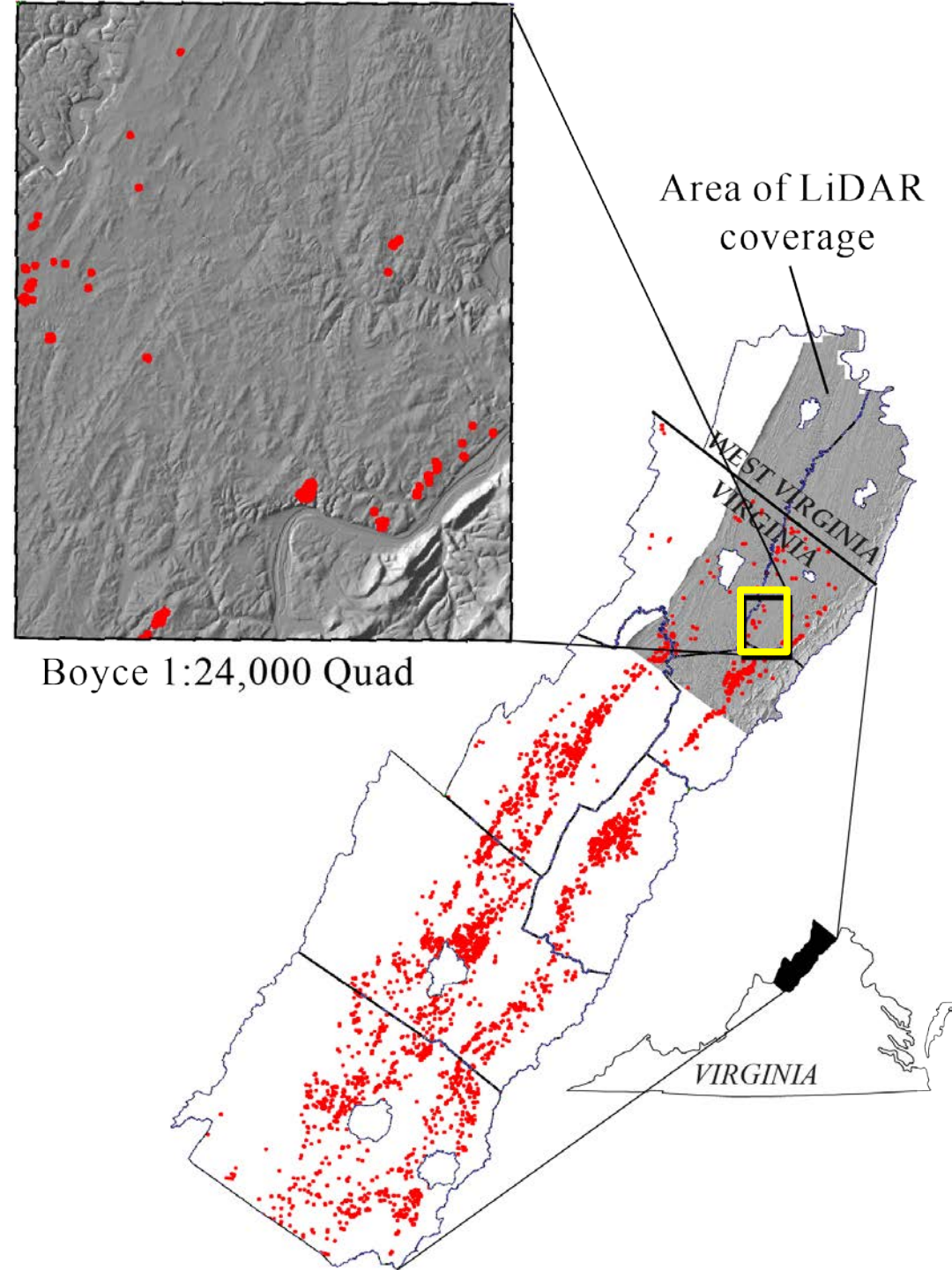
FEM



# LIDAR coverage of northern Shenandoah Valley (2012)

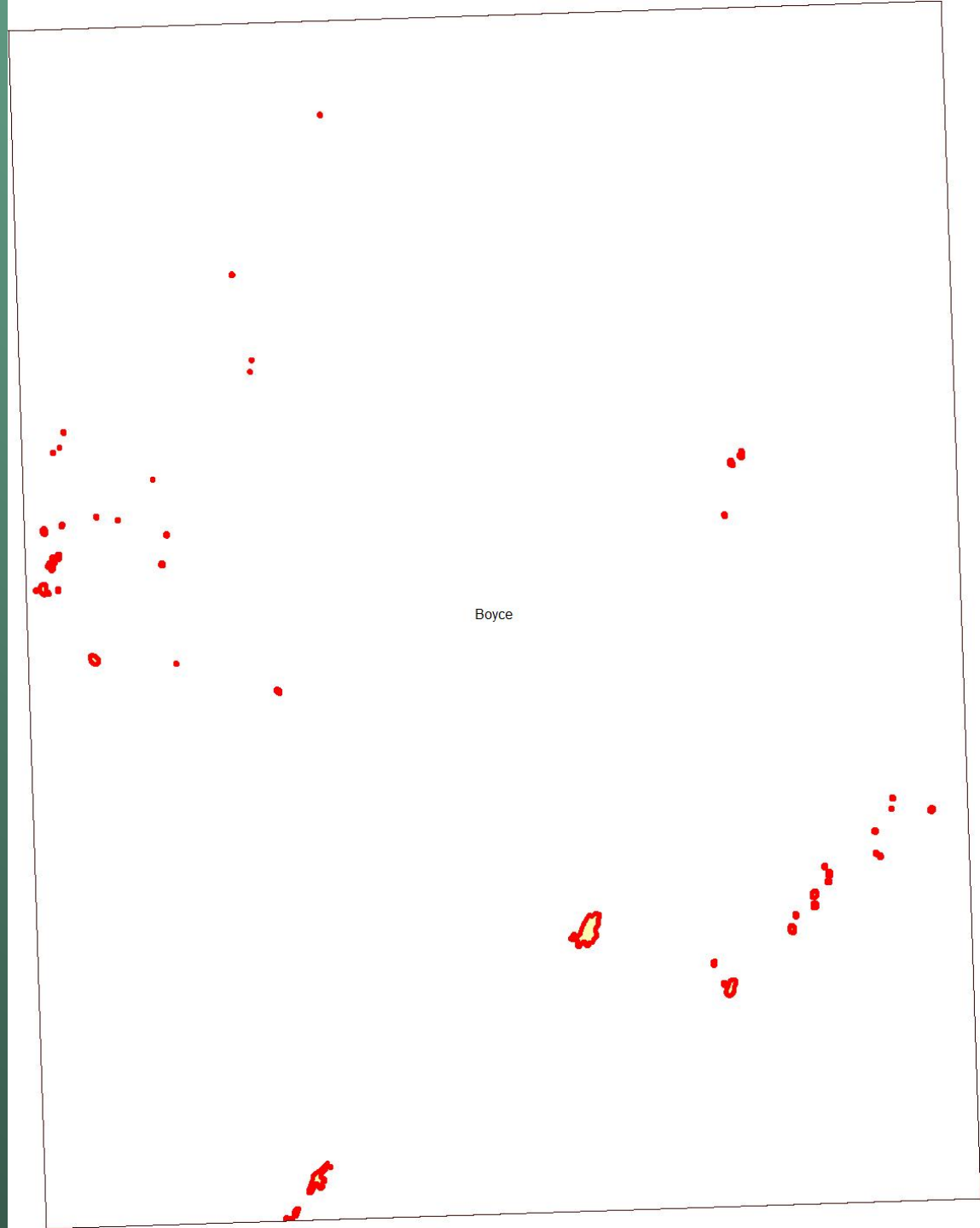
Red dots are closed depressions identified from aerial stereophotos in VA-DMME dataset (by D. Hubbard)

Boyce 1:24k quad in yellow





Red dots are closed depressions in VA-DMME dataset (by D. Hubbard)

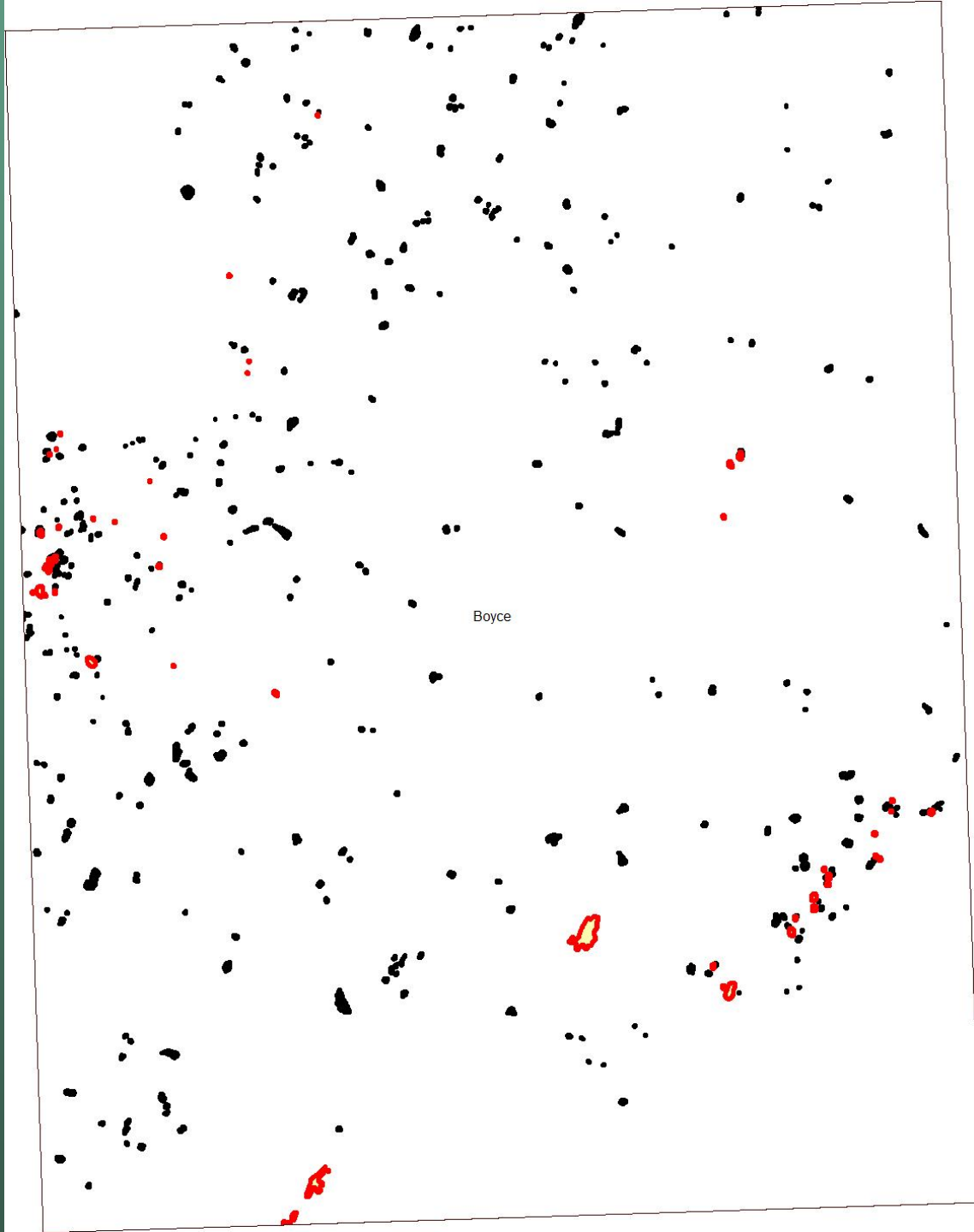




Red dots are closed depressions in VA-DMME dataset  
(by D. Hubbard)

Black dots are closed depressions manually delineated from aerial imagery in concert with LIDAR hillshade

*Is there an easier way?*



# AUTOMATING DETECTION OF CLOSED DEPRESSIONS

## WORKFLOW:

Sub-region



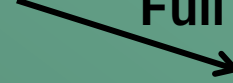
### Manually create closed depression dataset

- Optimize LIDAR imagery for digitization
- Combine with aerial imagery when digitizing

### Field-check questionable manual data



Full region



### Use GIS tools to “fill” depressions in elevation model based on a flow routing algorithm

- Remove artifacts
- Remove “dams” at roads and driveways by adding culverts to recondition original DEM
- Remove false depressions in streams and near structures



### Use validated manual dataset to refine depth and shape thresholds for retaining depressions

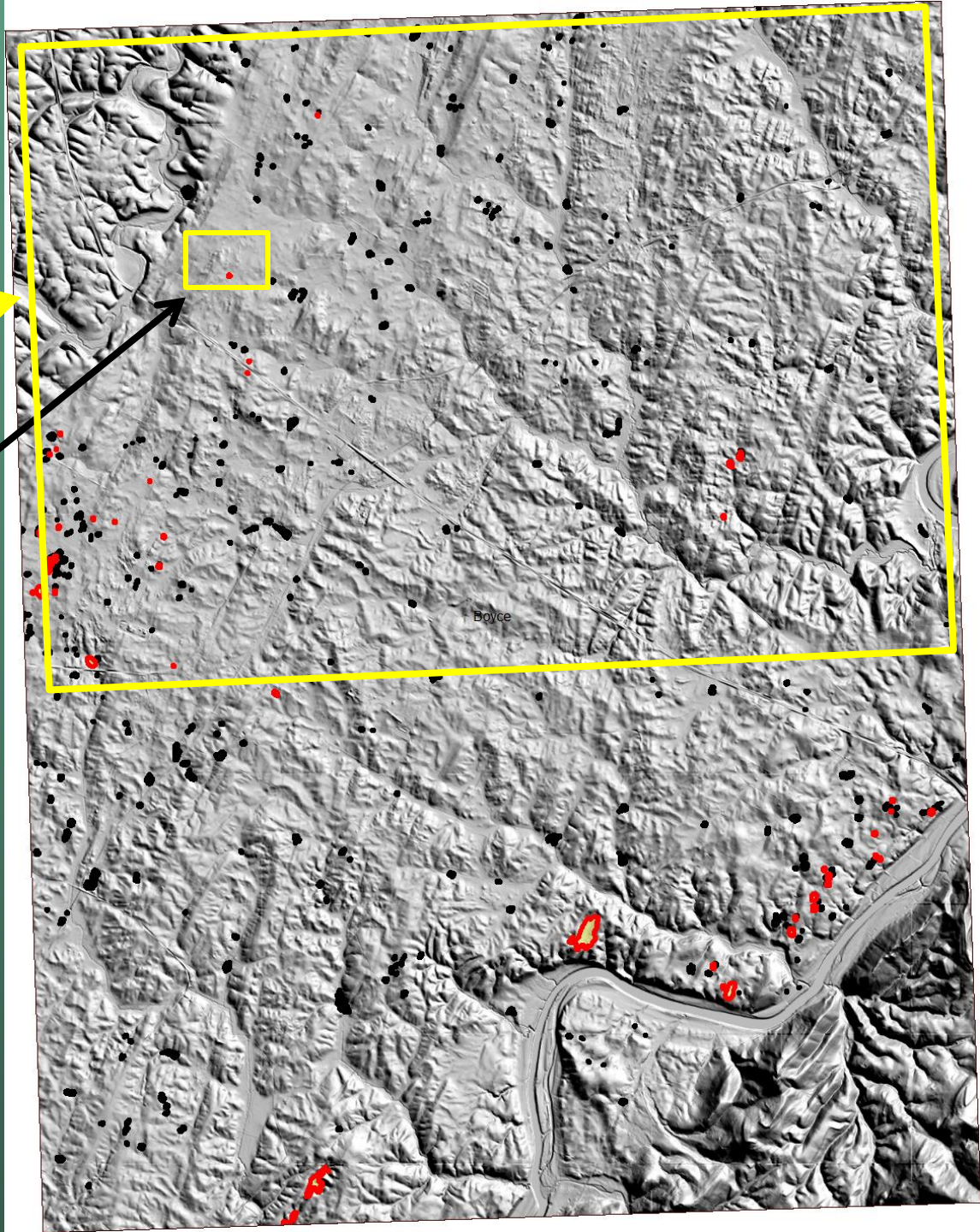


Evaluate final data



Region used for analysis

Region shown in following slides





# Manual digitization of depressions: Optimizing imagery



Look like depressions,  
but where are the edges?



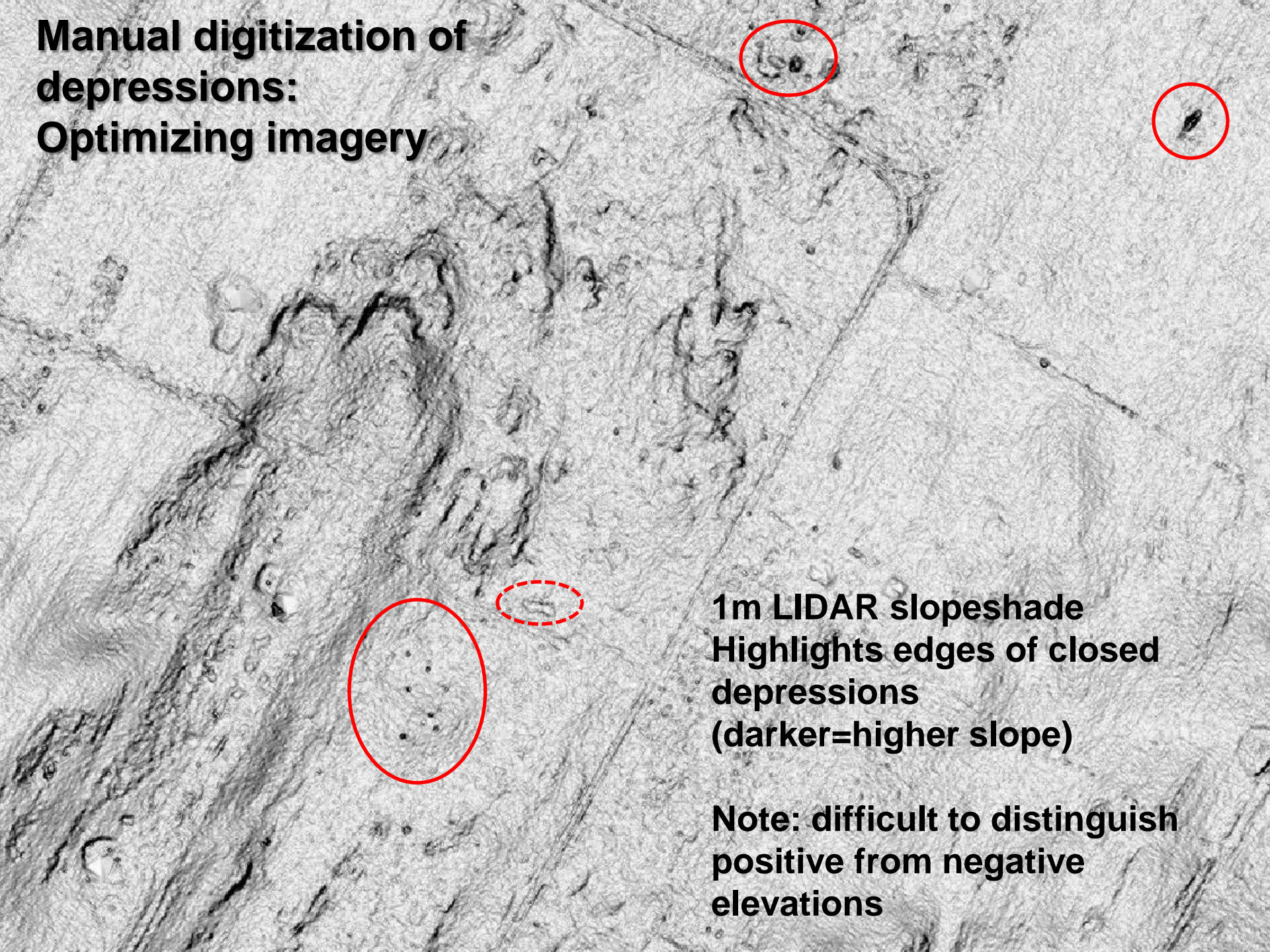
Hill or depression?



True features or artifacts?



**Manual digitization of  
depressions:  
Optimizing imagery**



**1m LIDAR slopeshade  
Highlights edges of closed  
depressions  
(darker=higher slope)**

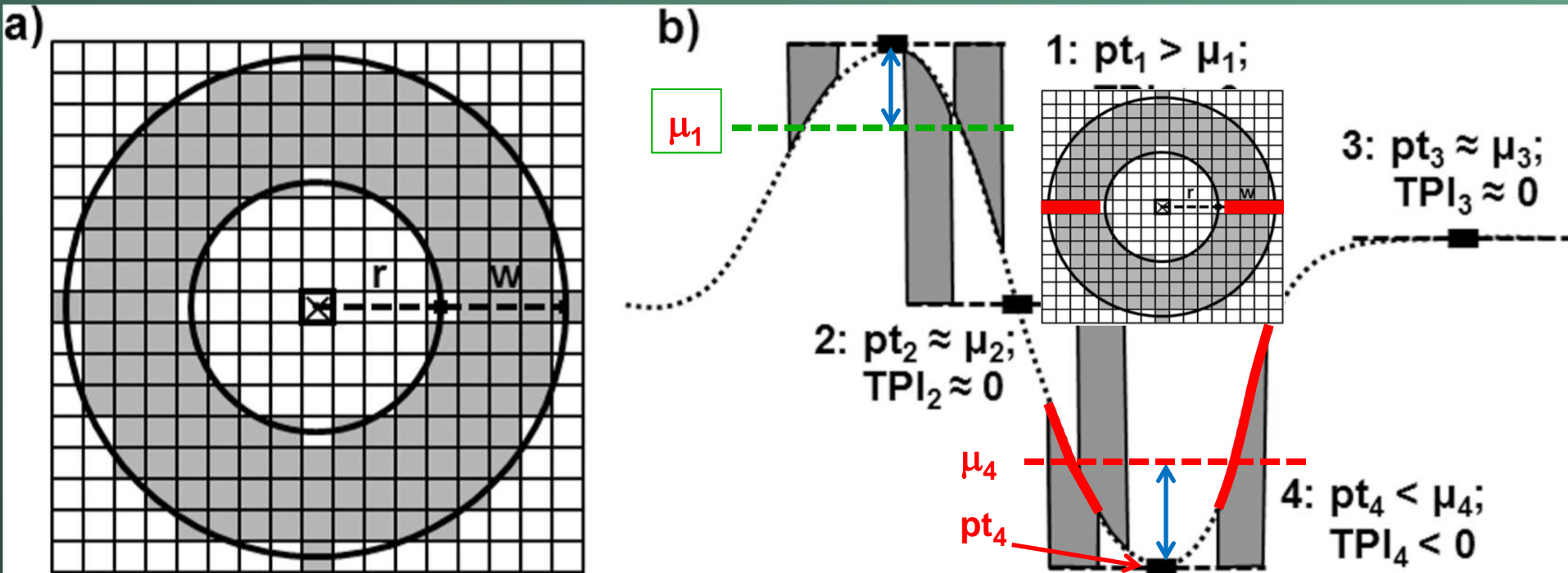
**Note: difficult to distinguish  
positive from negative  
elevations**





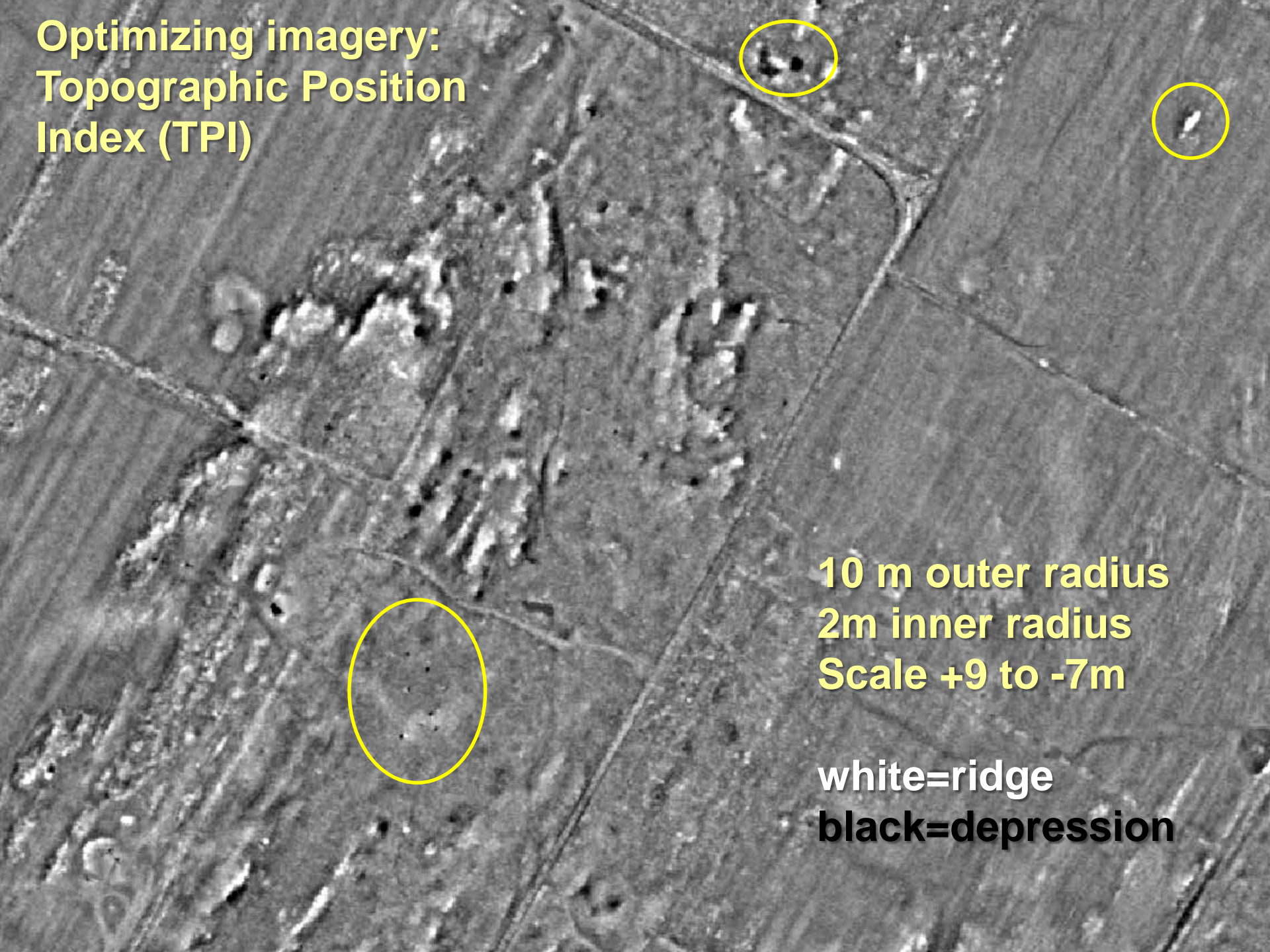
# Topographic Position Index (TPI):

- An elevation dataset derived from a moving window calculation on the original DEM
- Mean elevation of the new dataset is  $\sim 0$
- New elevations are locally positive (high) or negative (lows) with respect to the localized mean of a ring of cells surrounding the target cell





**Optimizing imagery:  
Topographic Position  
Index (TPI)**

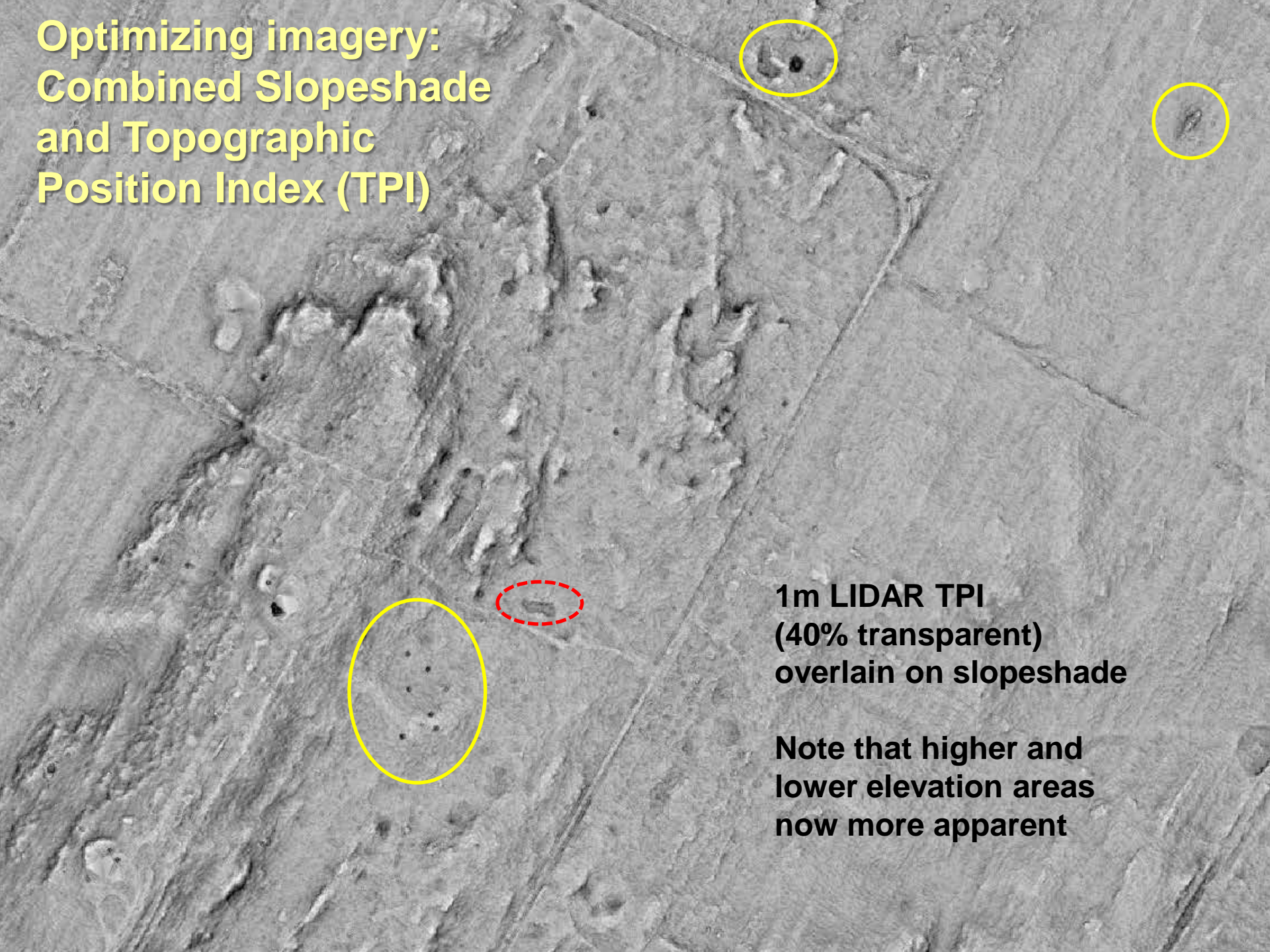


**10 m outer radius  
2m inner radius  
Scale +9 to -7m**

**white=ridge  
black=depression**



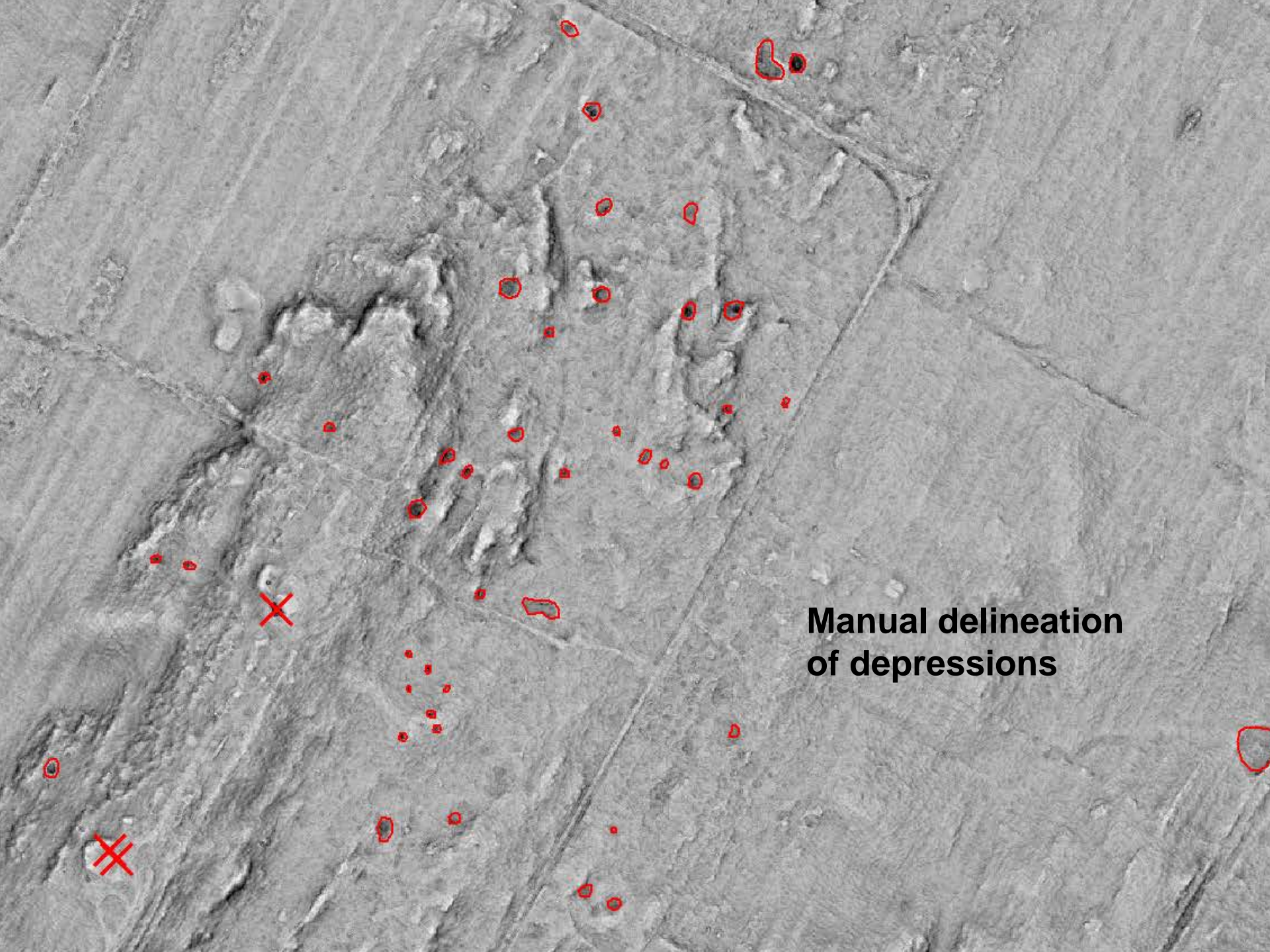
# Optimizing imagery: Combined Slopeshade and Topographic Position Index (TPI)



**1m LIDAR TPI  
(40% transparent)  
overlay on slopeshade**

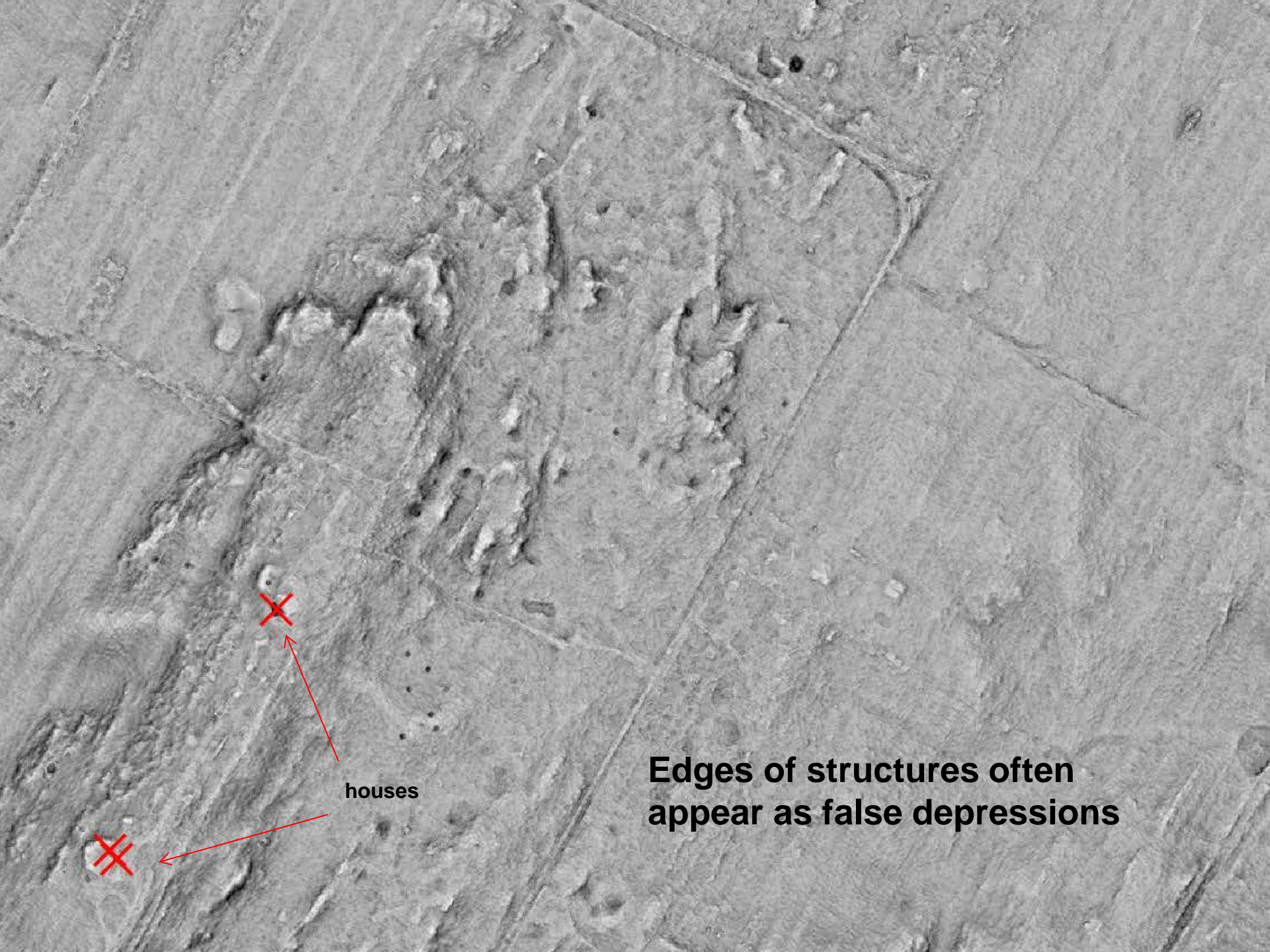
**Note that higher and  
lower elevation areas  
now more apparent**





**Manual delineation  
of depressions**

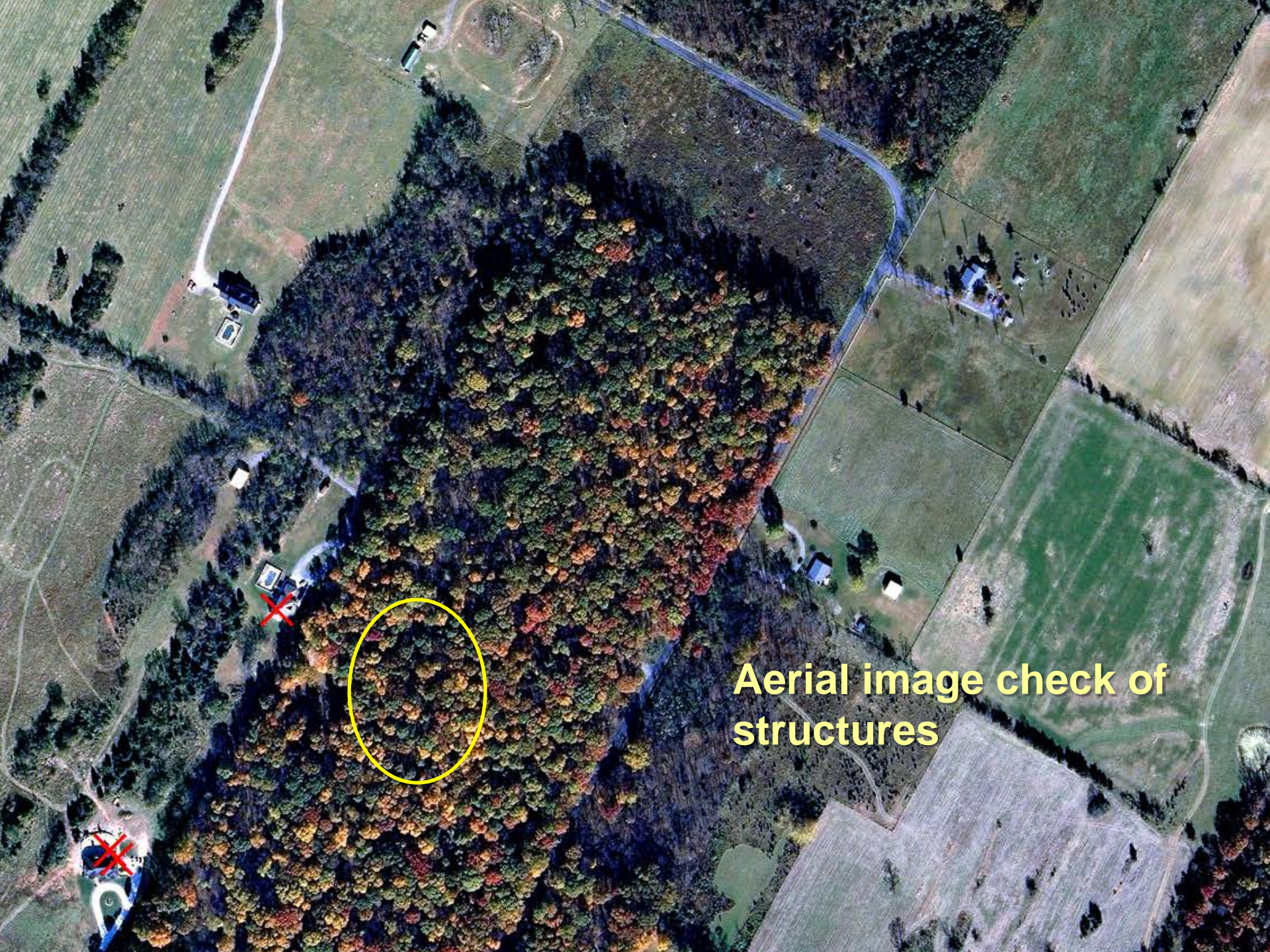




houses

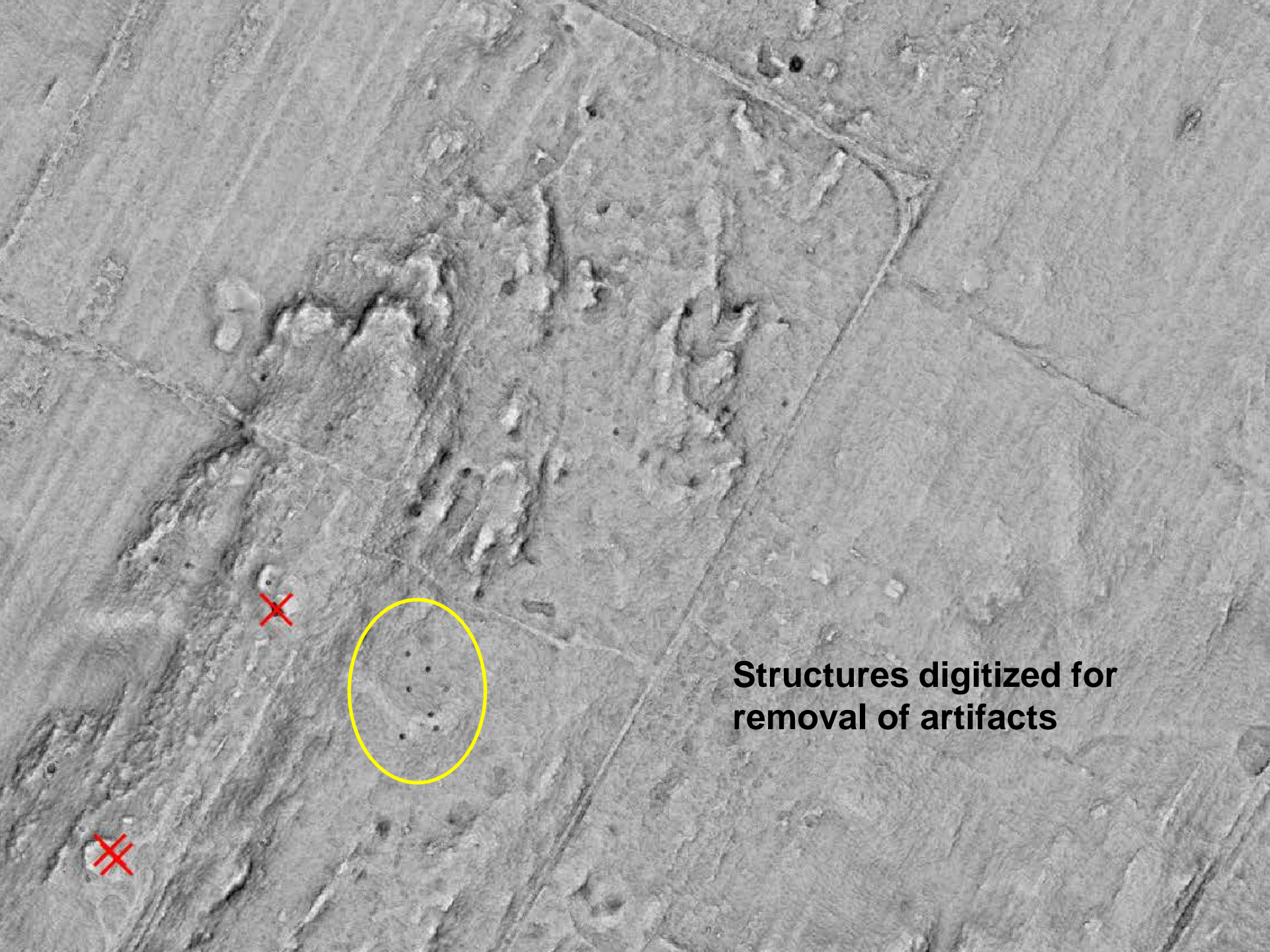
**Edges of structures often  
appear as false depressions**





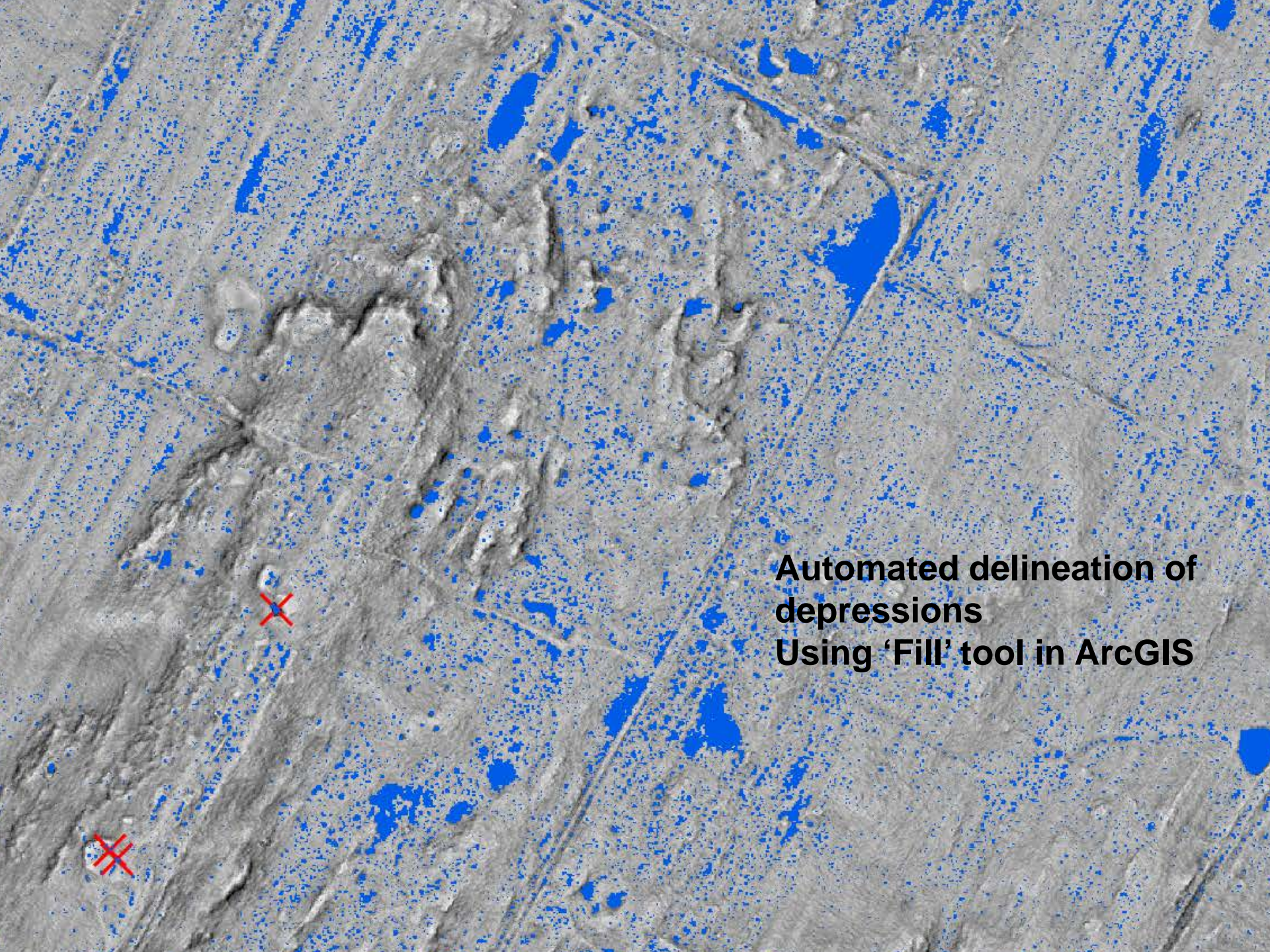
**Aerial image check of structures**





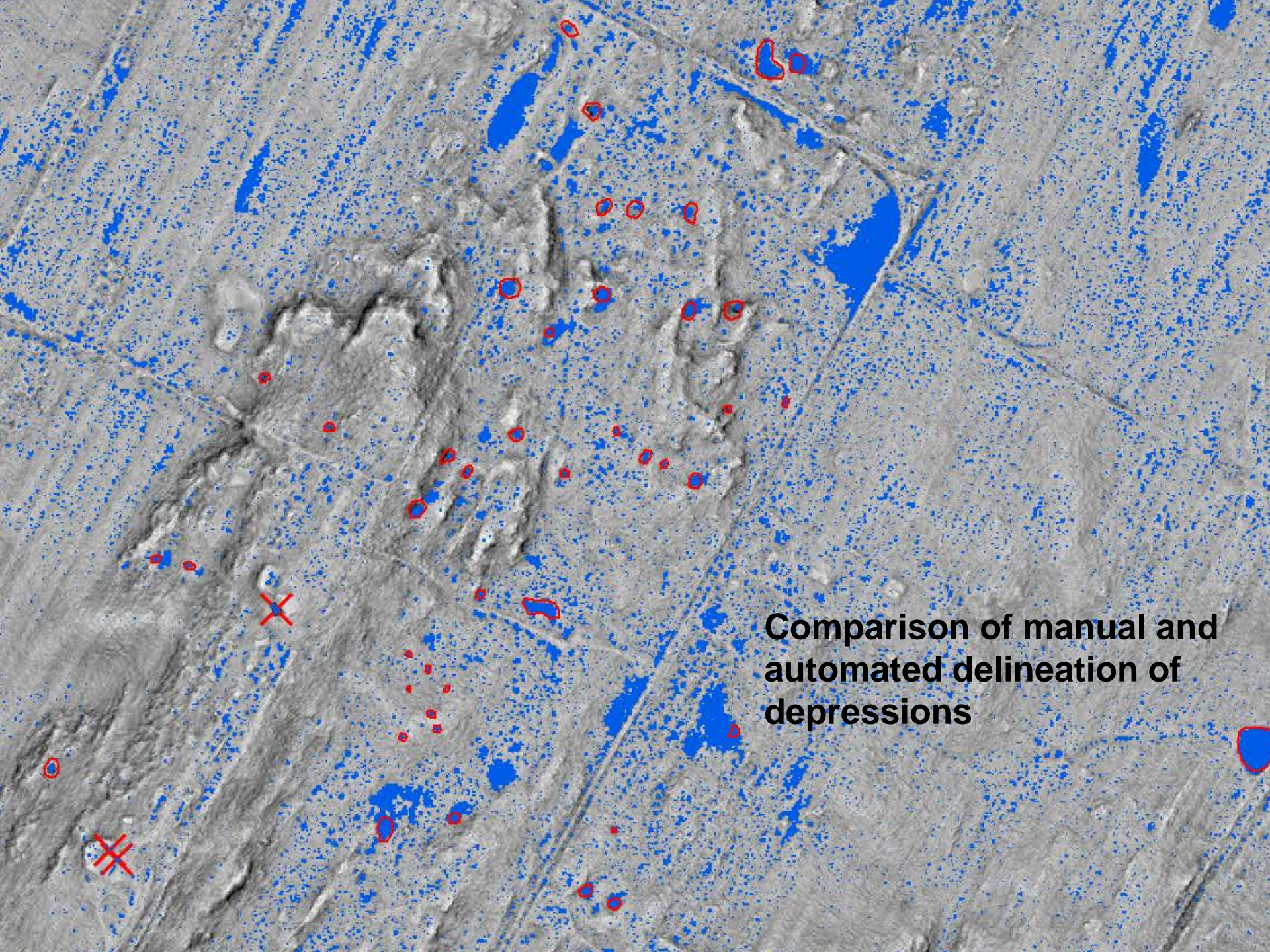
**Structures digitized for  
removal of artifacts**





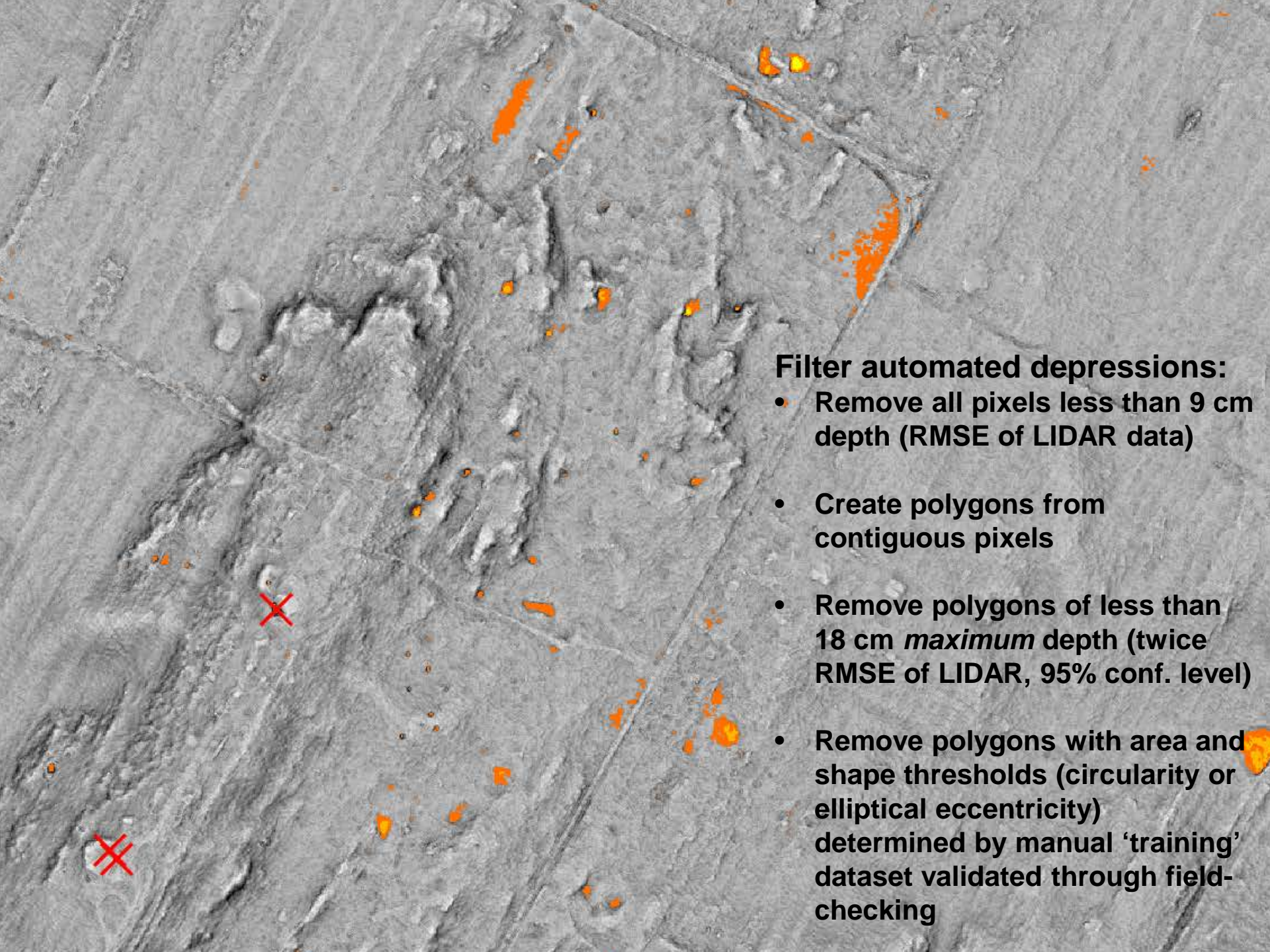
**Automated delineation of  
depressions  
Using 'Fill' tool in ArcGIS**





**Comparison of manual and automated delineation of depressions**

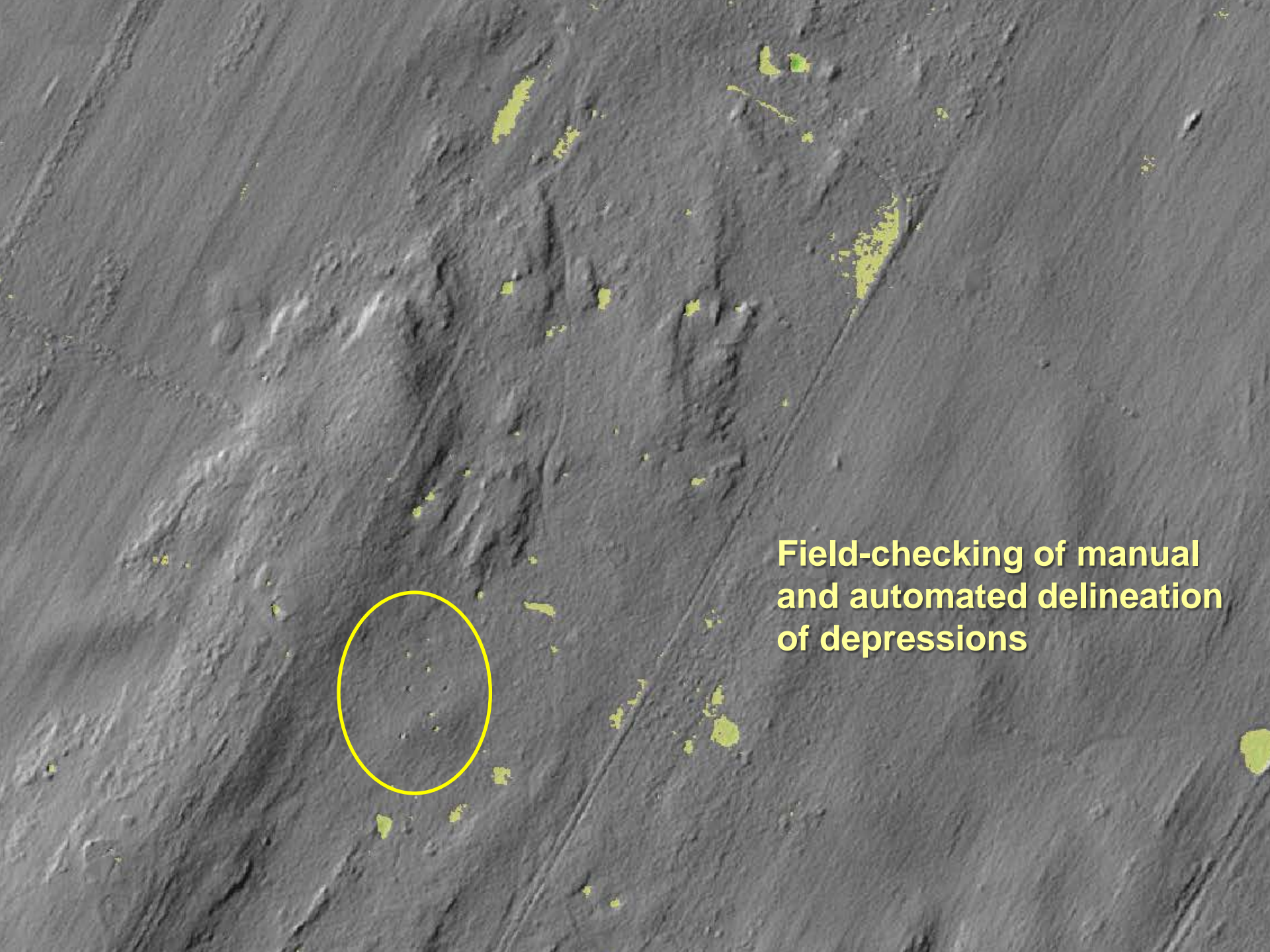




### **Filter automated depressions:**

- **Remove all pixels less than 9 cm depth (RMSE of LIDAR data)**
- **Create polygons from contiguous pixels**
- **Remove polygons of less than 18 cm *maximum* depth (twice RMSE of LIDAR, 95% conf. level)**
- **Remove polygons with area and shape thresholds (circularity or elliptical eccentricity) determined by manual 'training' dataset validated through field-checking**

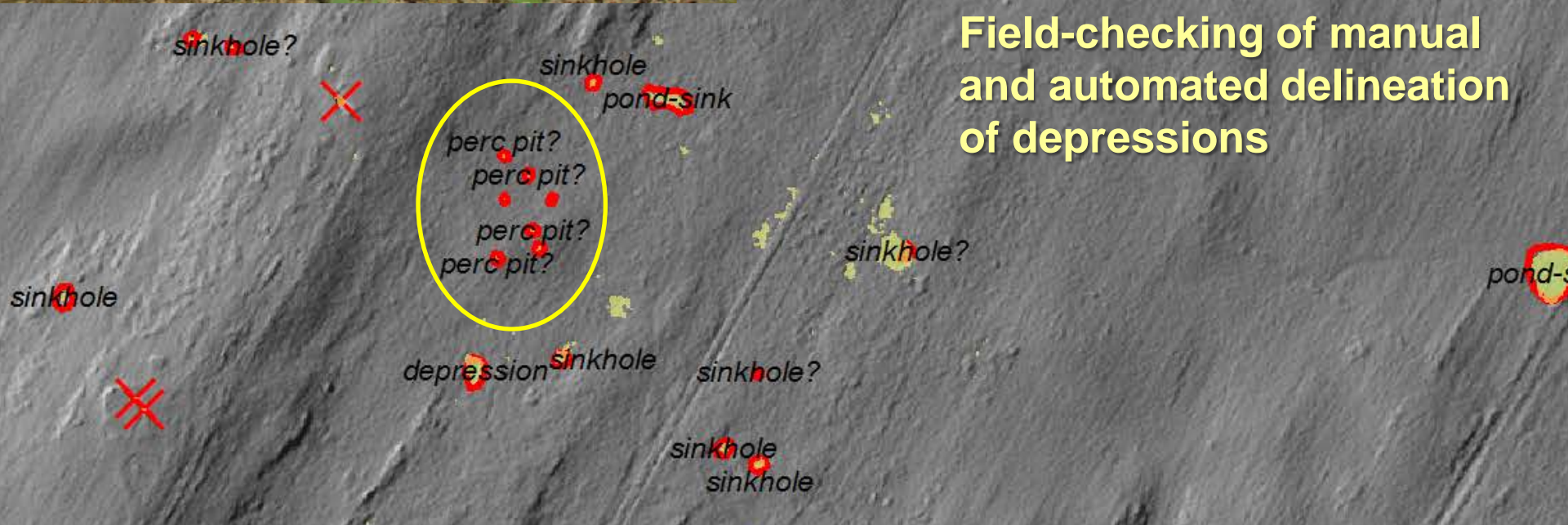




**Field-checking of manual  
and automated delineation  
of depressions**



True depressions, but manmade

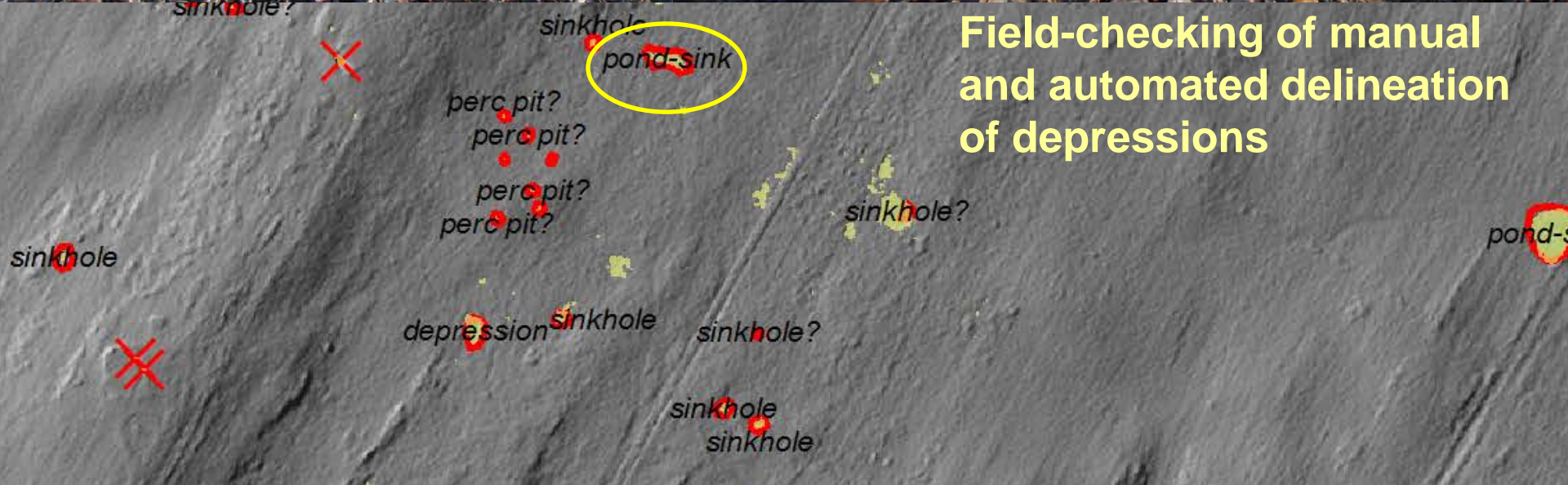


Field-checking of manual and automated delineation of depressions





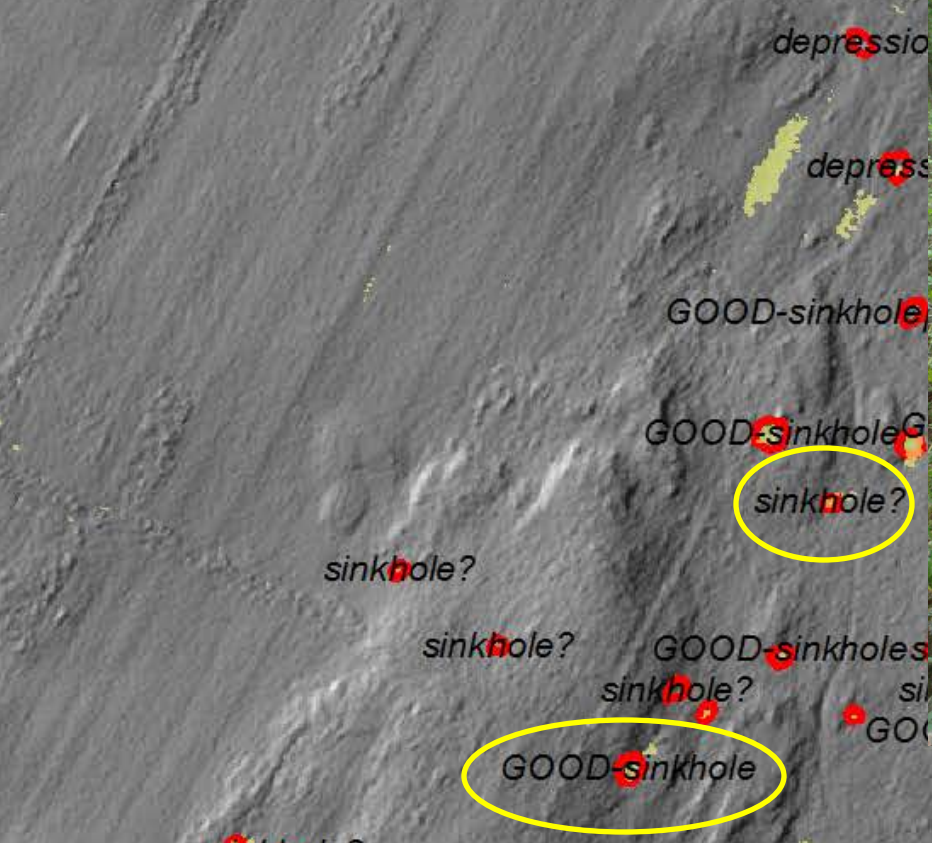
True depression, easy to miss  
Not visible in LIDAR hillshade



Field-checking of manual  
and automated delineation  
of depressions



Log creates artificial closed depression in DEM



True depression, easy to miss



Field-checking of manual and automated delineation of depressions

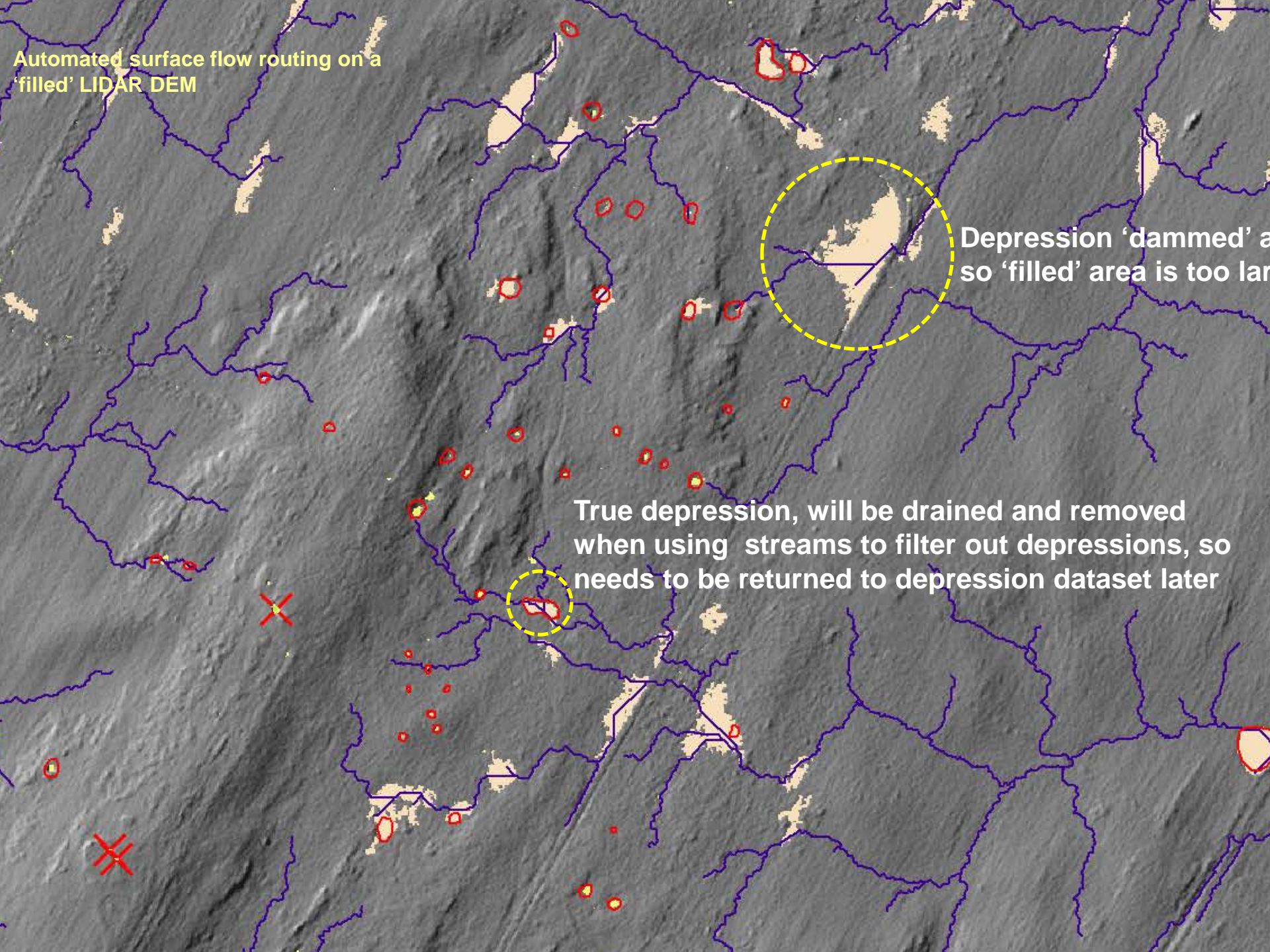




Automated surface flow routing on a  
'filled' LIDAR DEM

Depression 'dammed' and  
so 'filled' area is too large

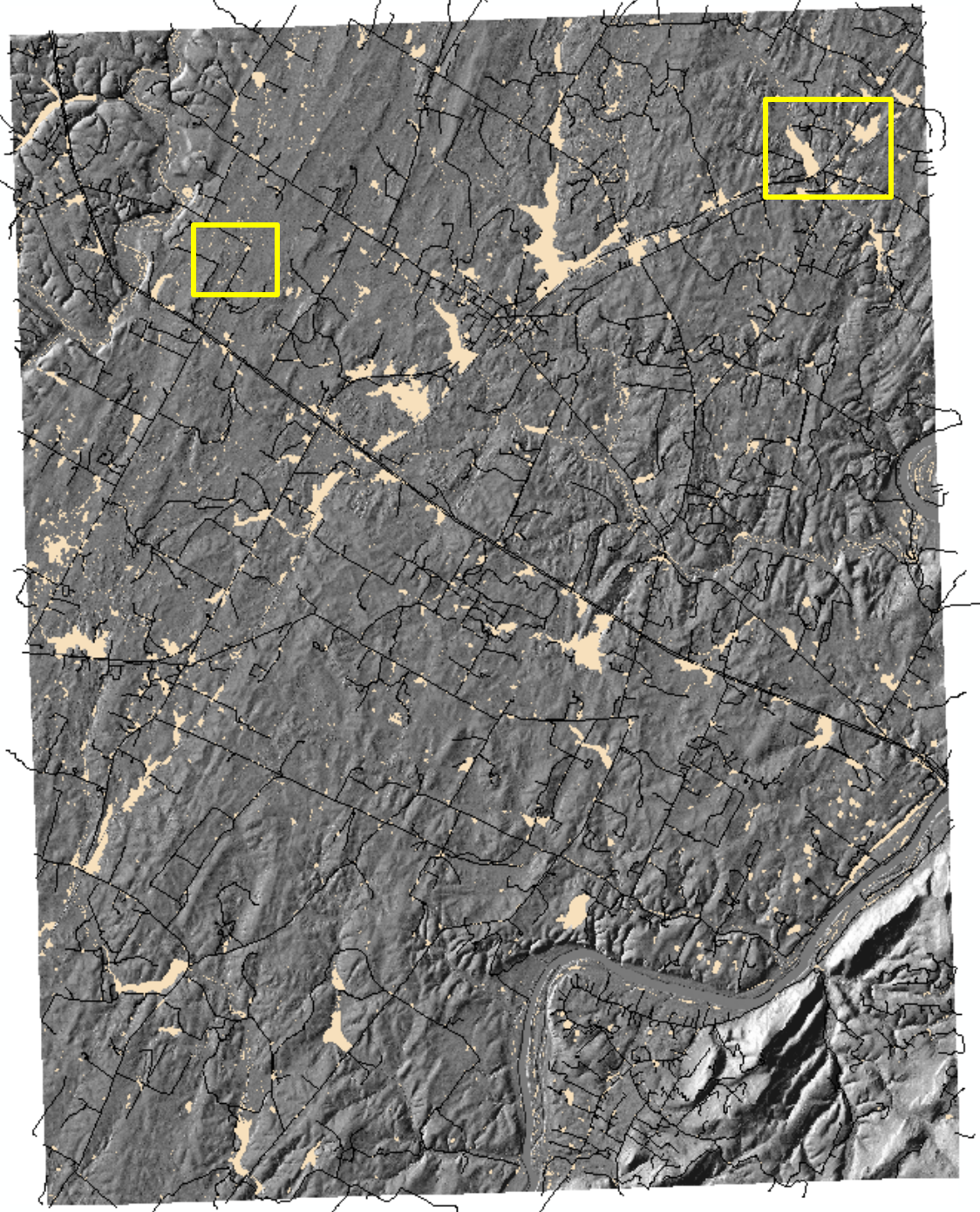
True depression, will be drained and removed  
when using streams to filter out depressions, so  
needs to be returned to depression dataset later





**Automated surface flow routing on a 'filled' LIDAR DEM**

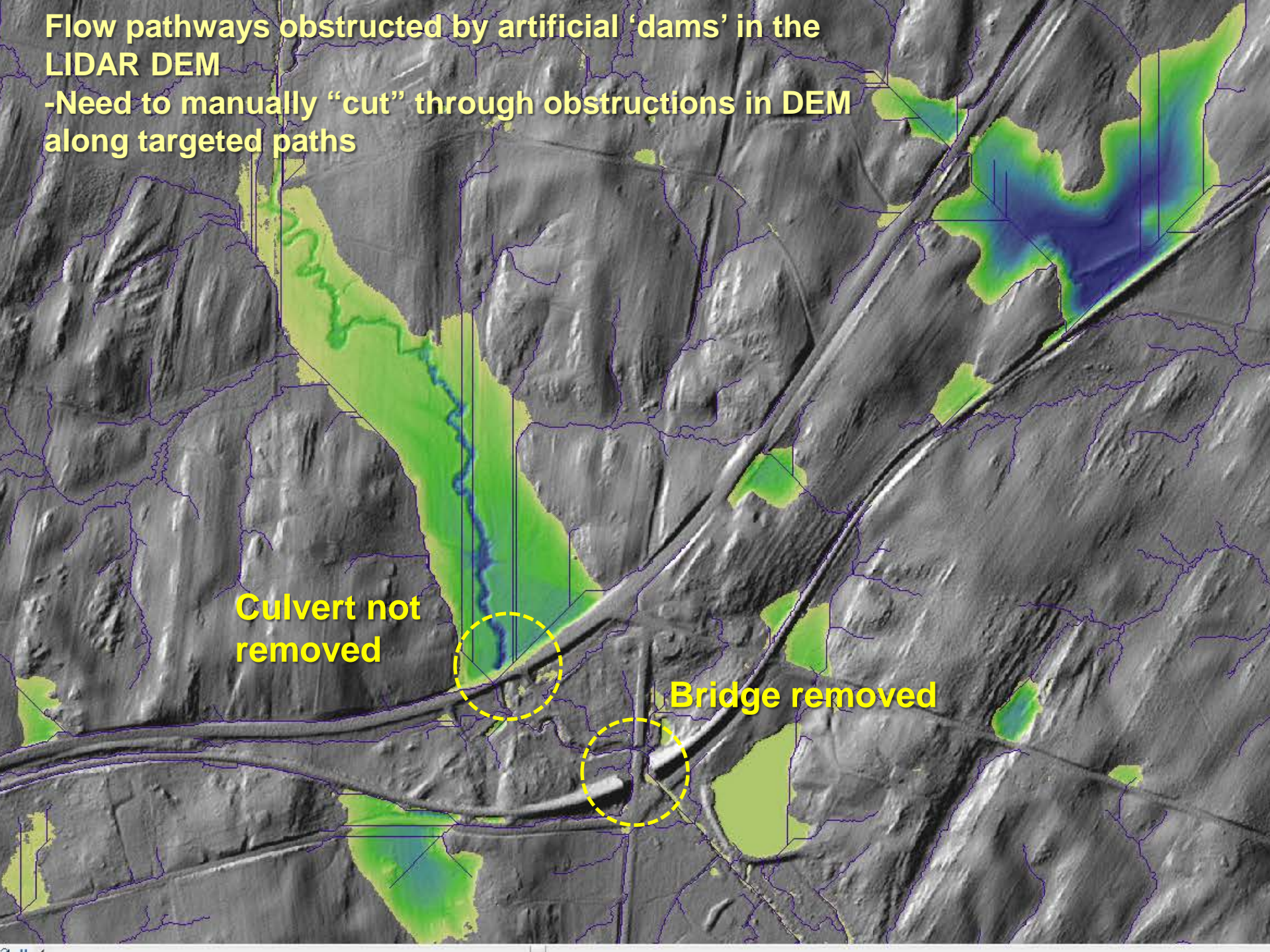
**NOTE that largest (artificial) depressions are 'dammed' against roads**





**Flow pathways obstructed by artificial 'dams' in the LIDAR DEM**

**-Need to manually "cut" through obstructions in DEM along targeted paths**

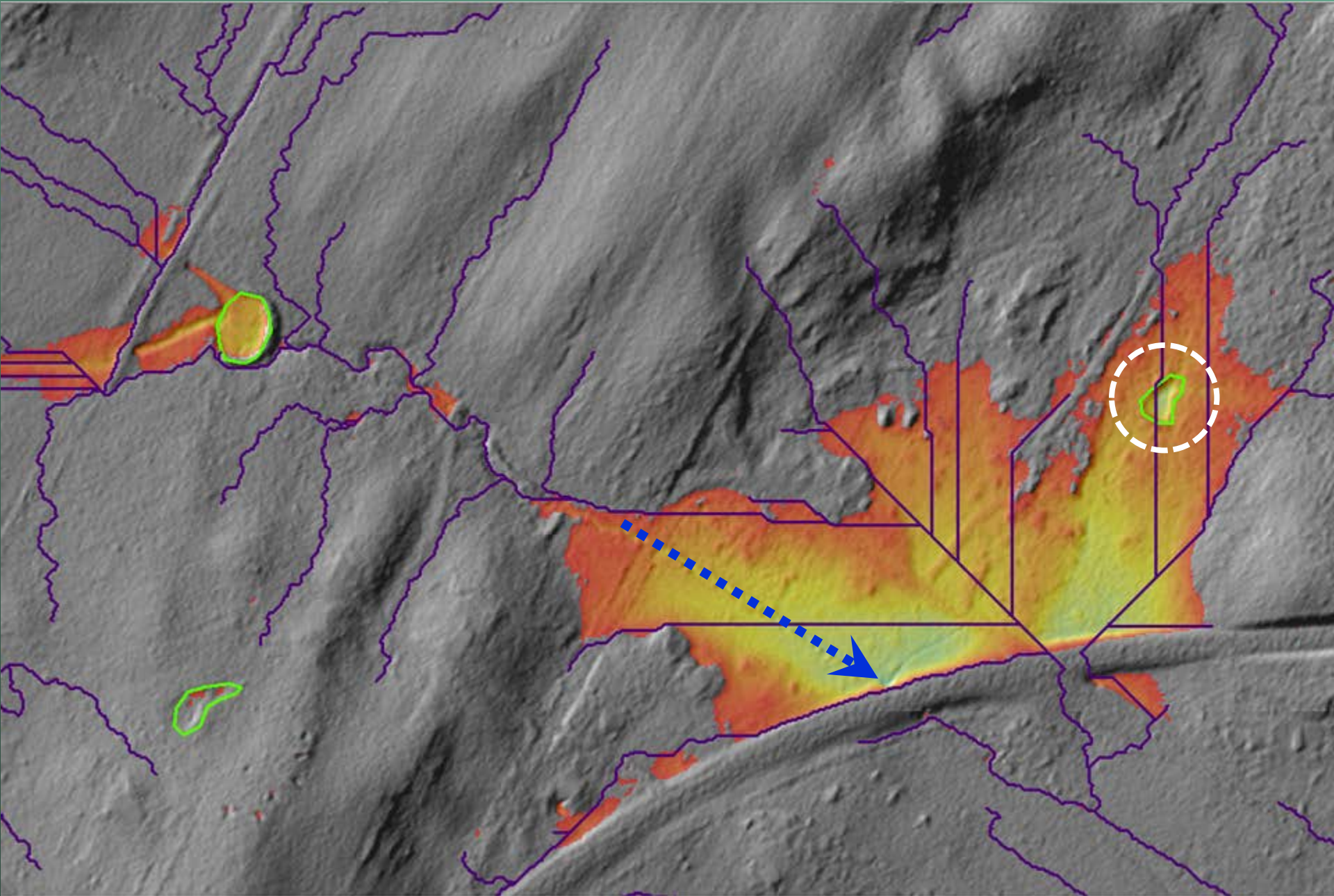


**Culvert not removed**

**Bridge removed**

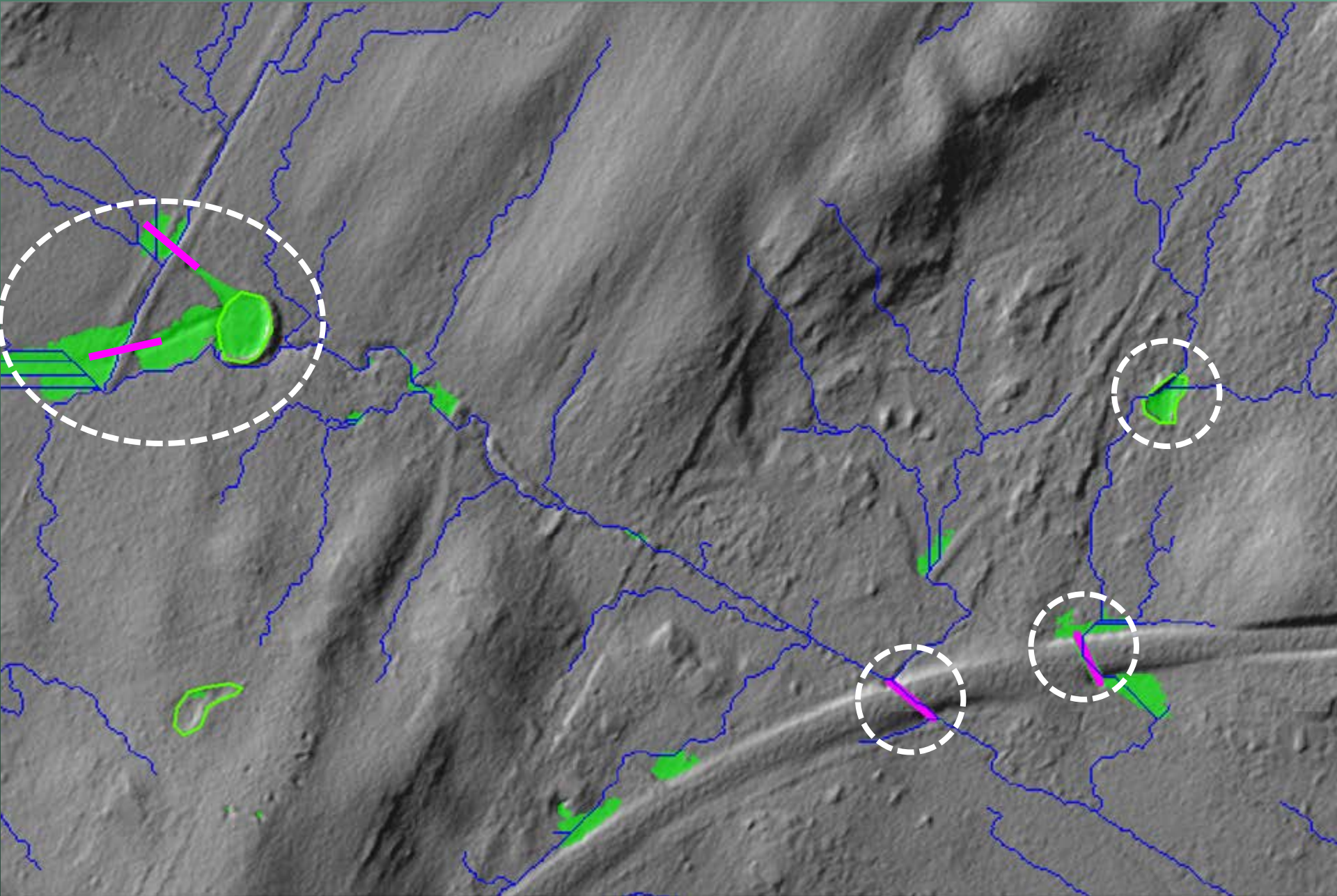


**Problem areas of nested depressions require multiple iterations to 'drain' artificially dammed depressions**





**Problem areas of nested depressions require multiple iterations to 'drain' artificially dammed depressions**



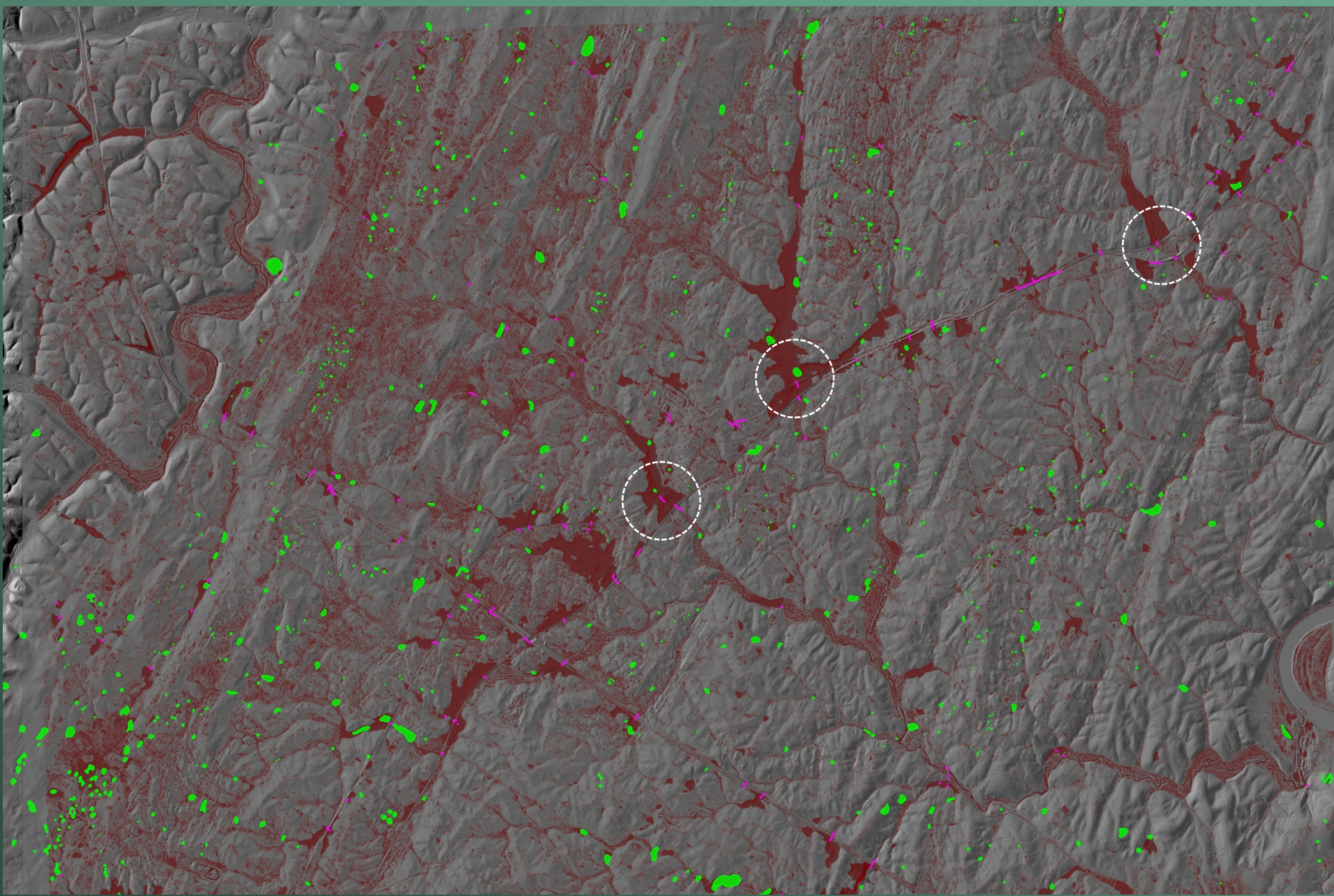


# CULVERTS: Need to be mapped along roads and driveways



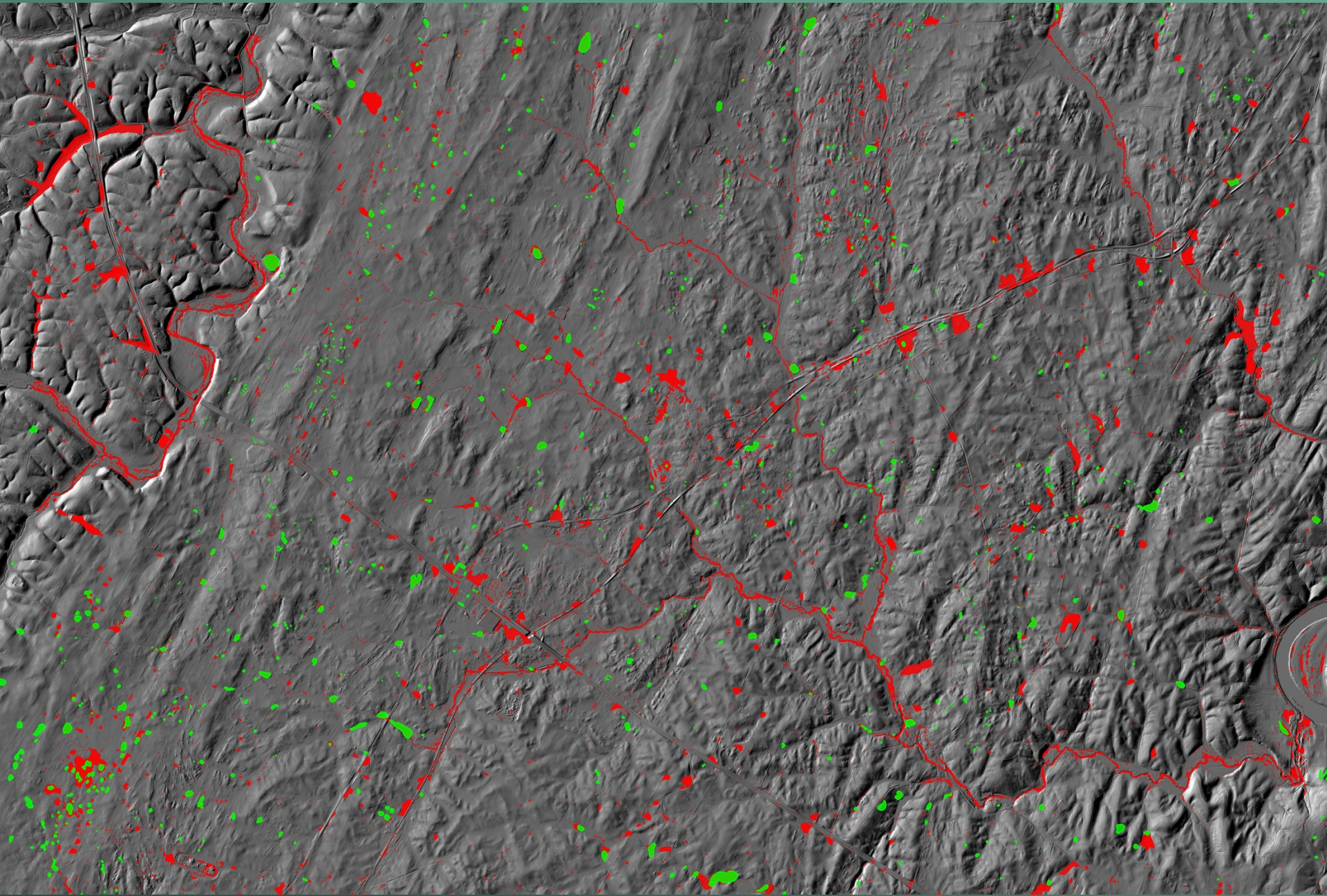


“Filled” LIDAR DEM in red, manual sinks in green, culverts in pink



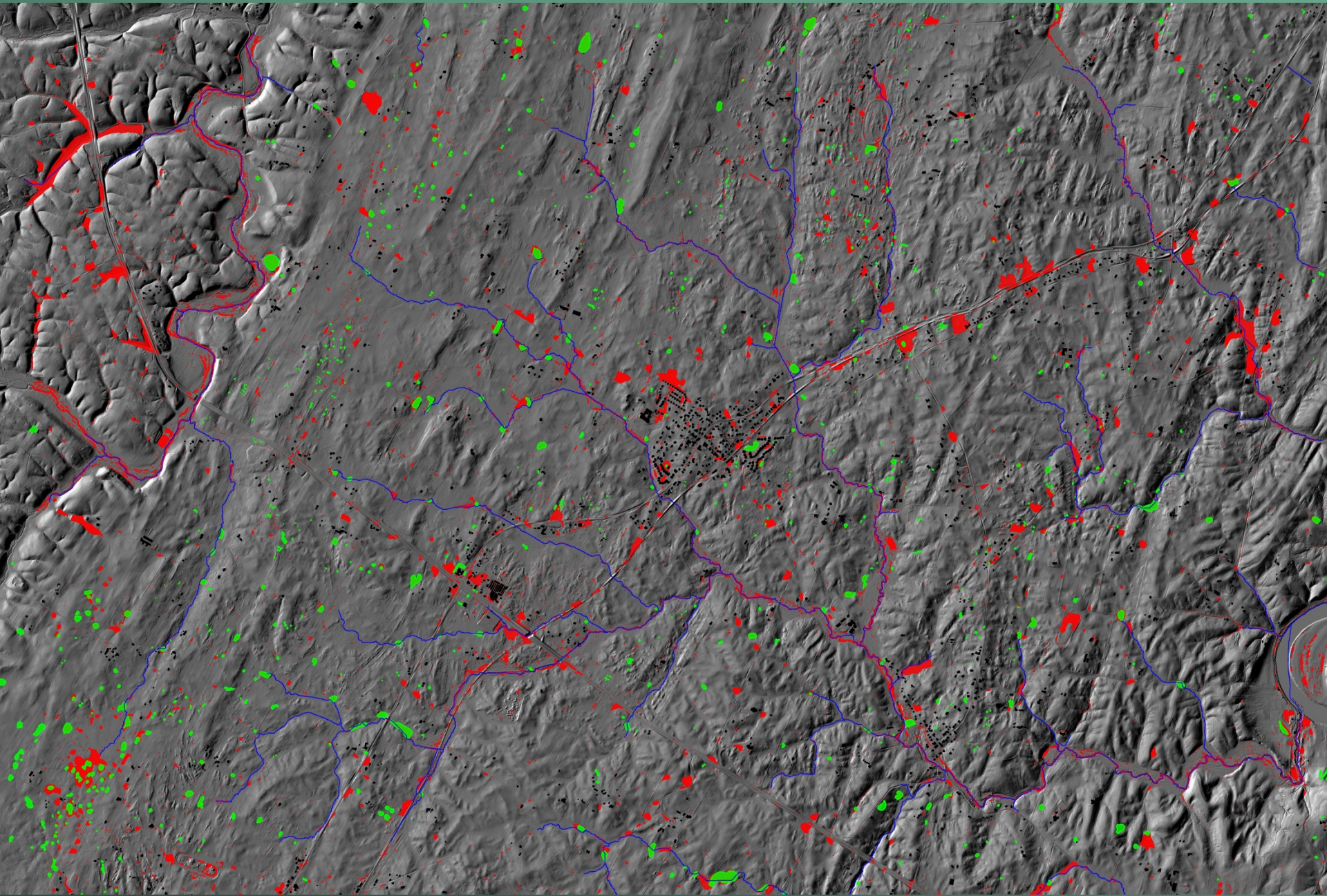


**“Filled” sinks after draining, with depth, area and shape thresholds applied**



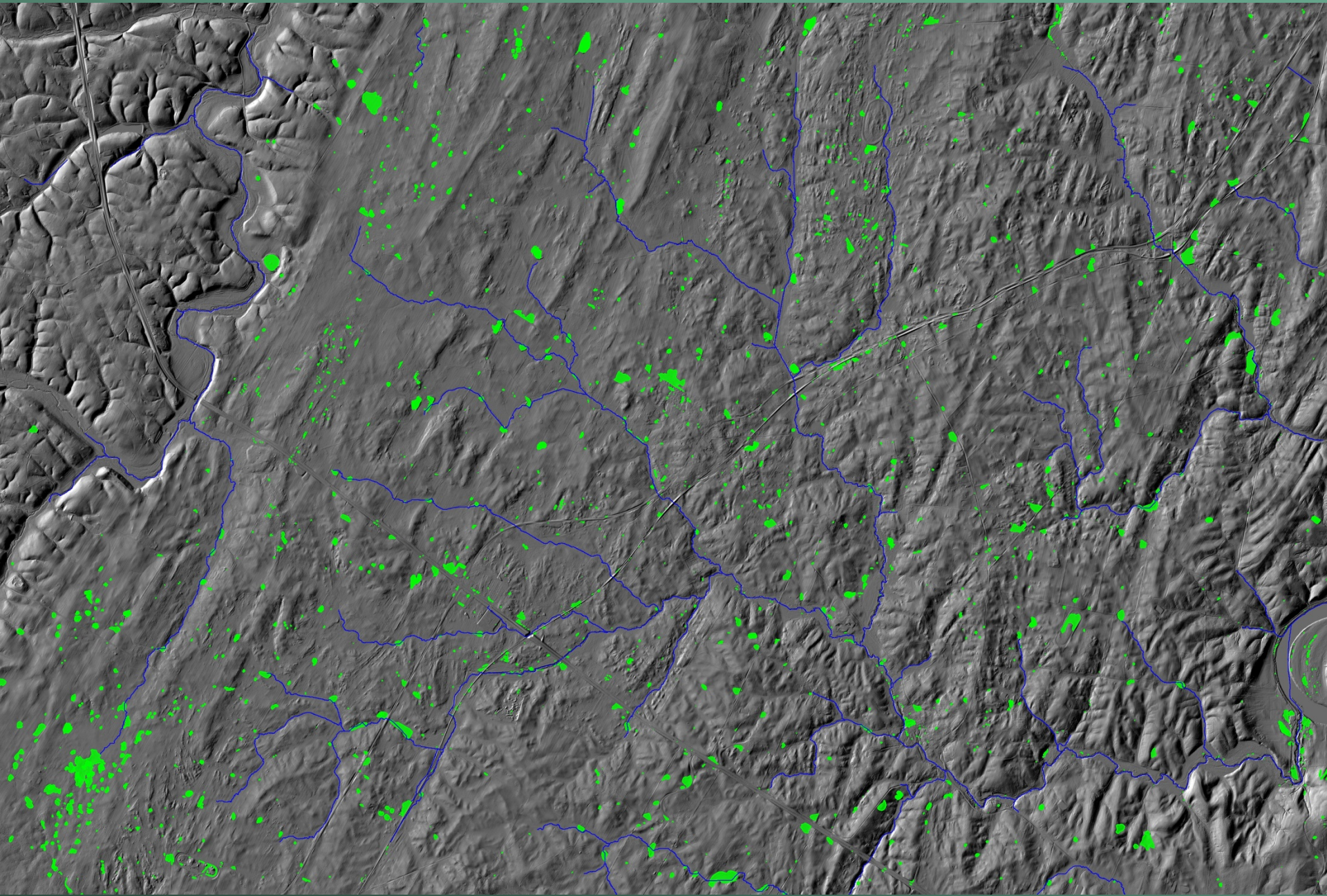


**Filter out additional sinks using 2 m buffer distance from streams and structures**



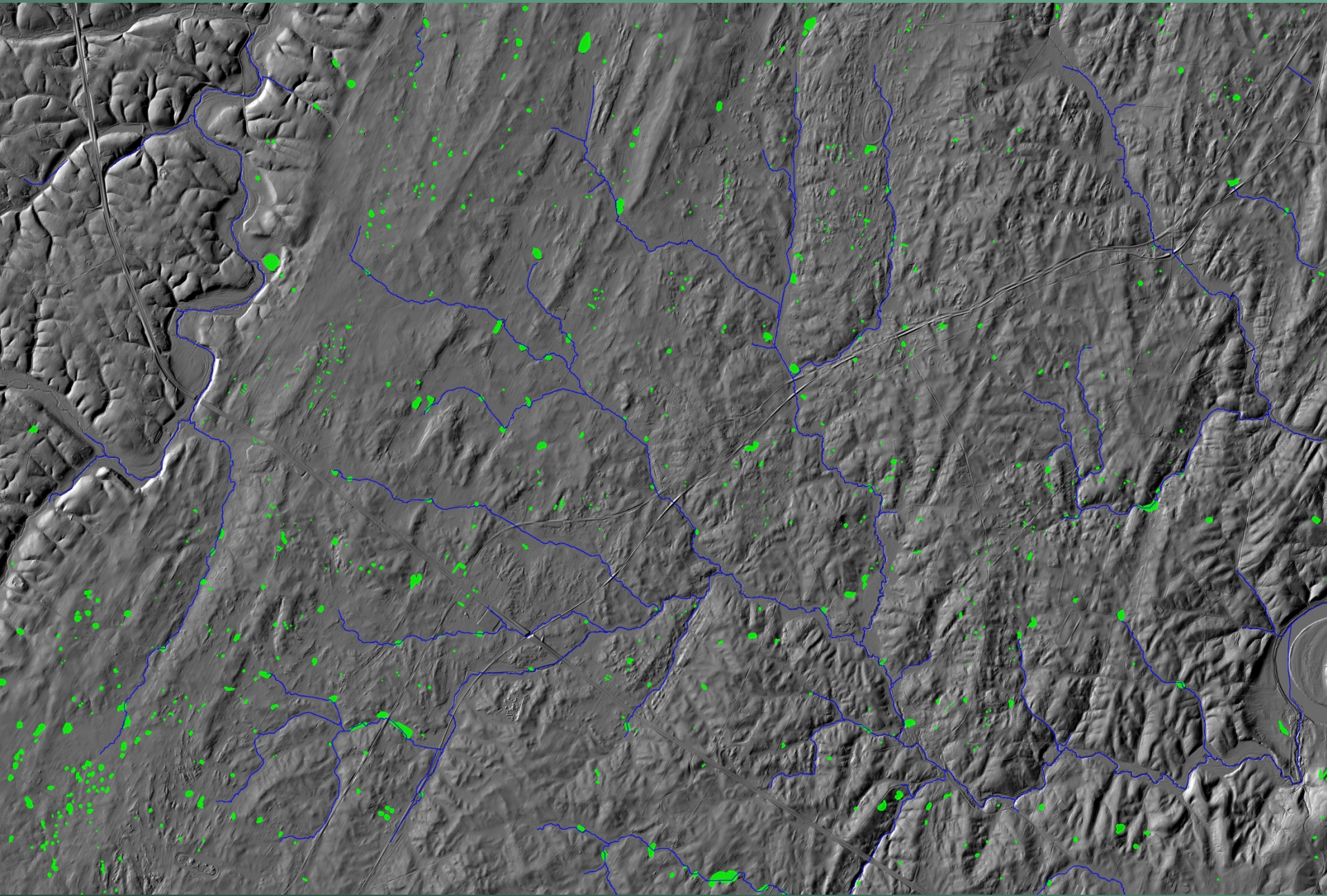


**Final dataset for carbonate regions (depressions in western shales removed)**



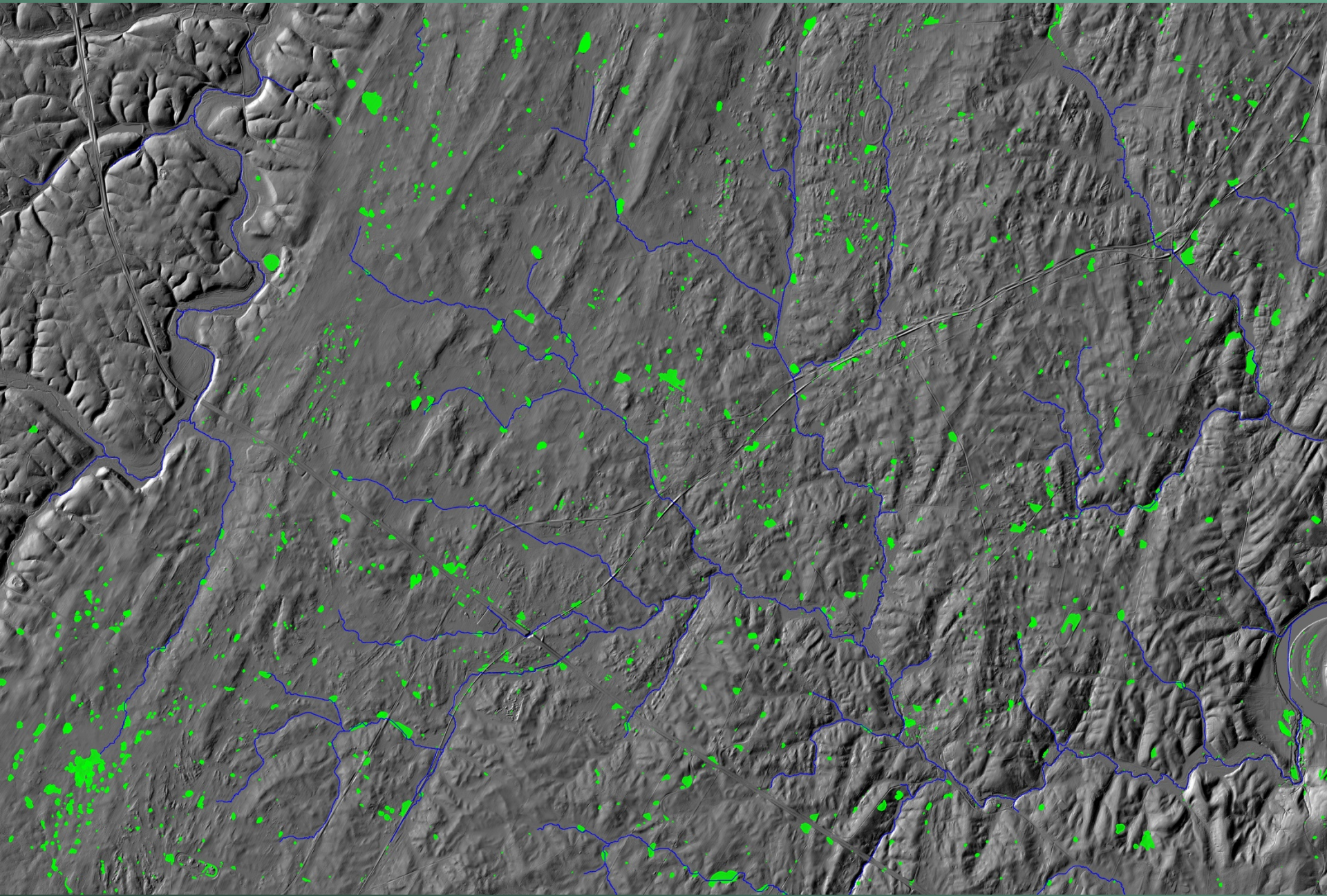


# Initial manually digitized data





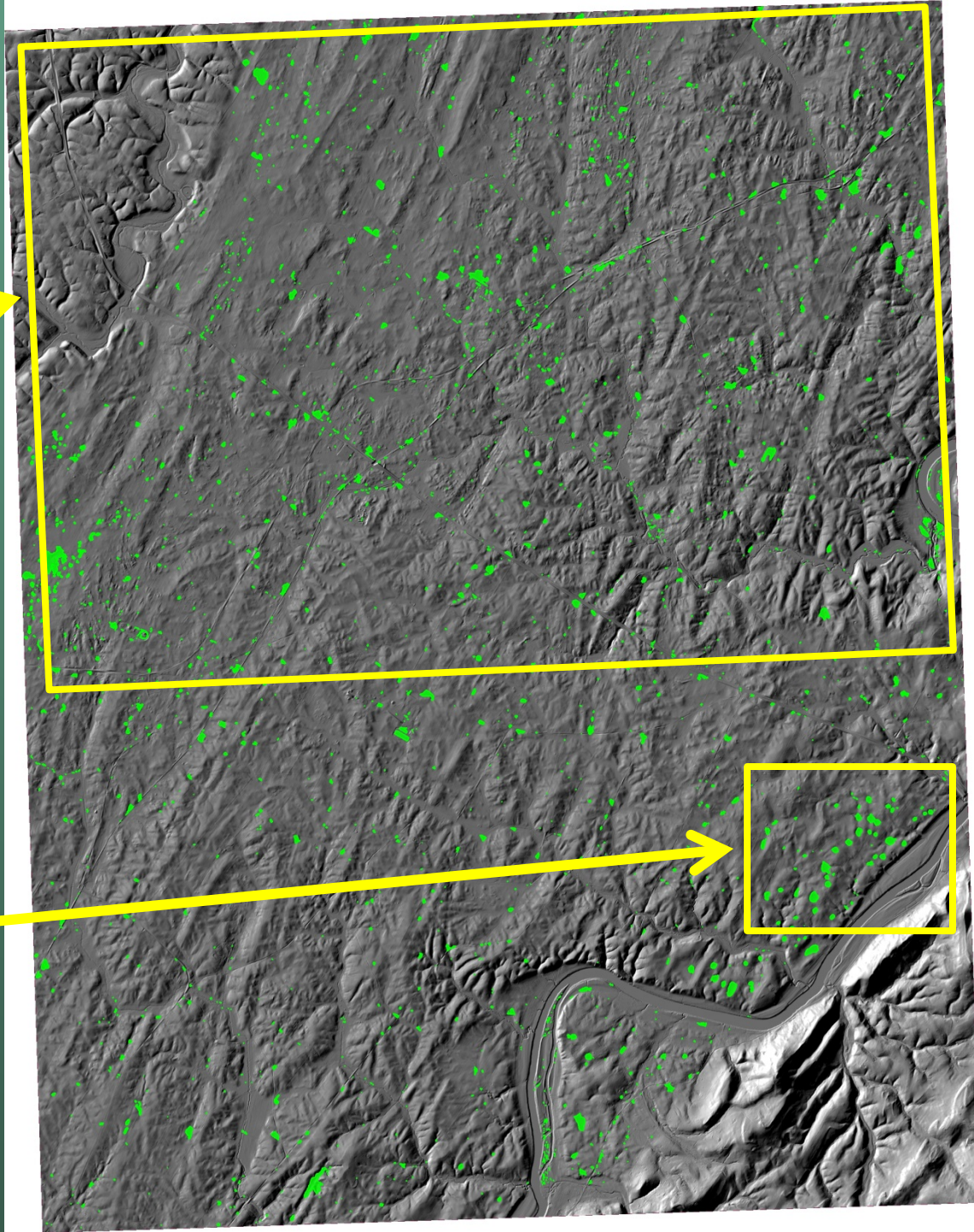
**Final dataset: approximately twice as many depressions as manually outlined**



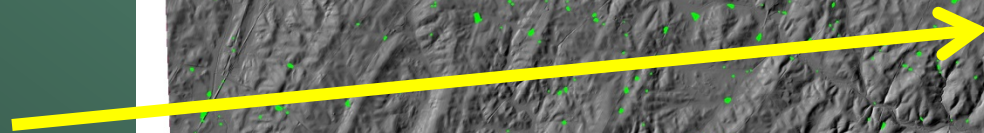


# DATA VALIDATION:

Region used for  
analysis

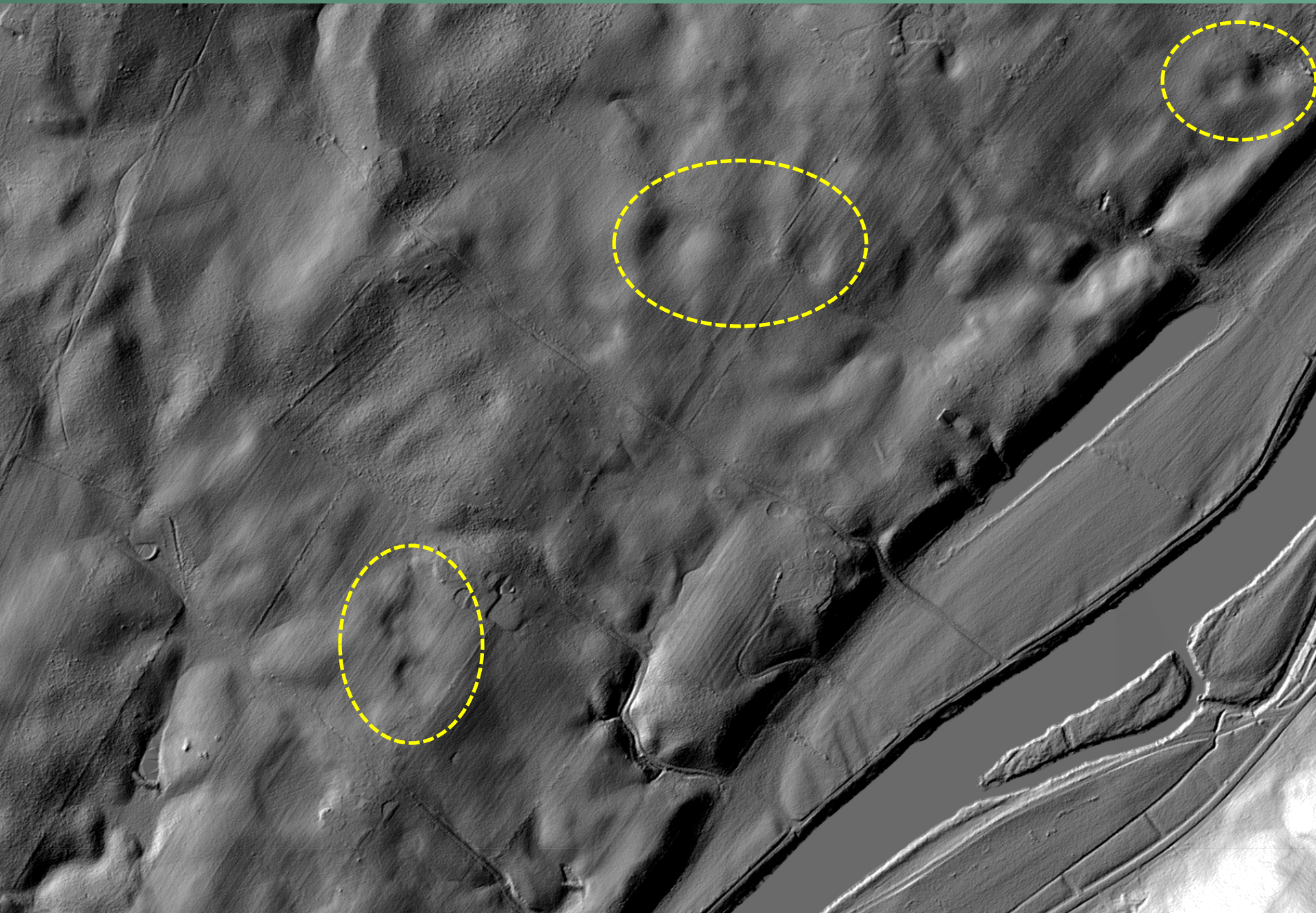


Region shown in  
following slides



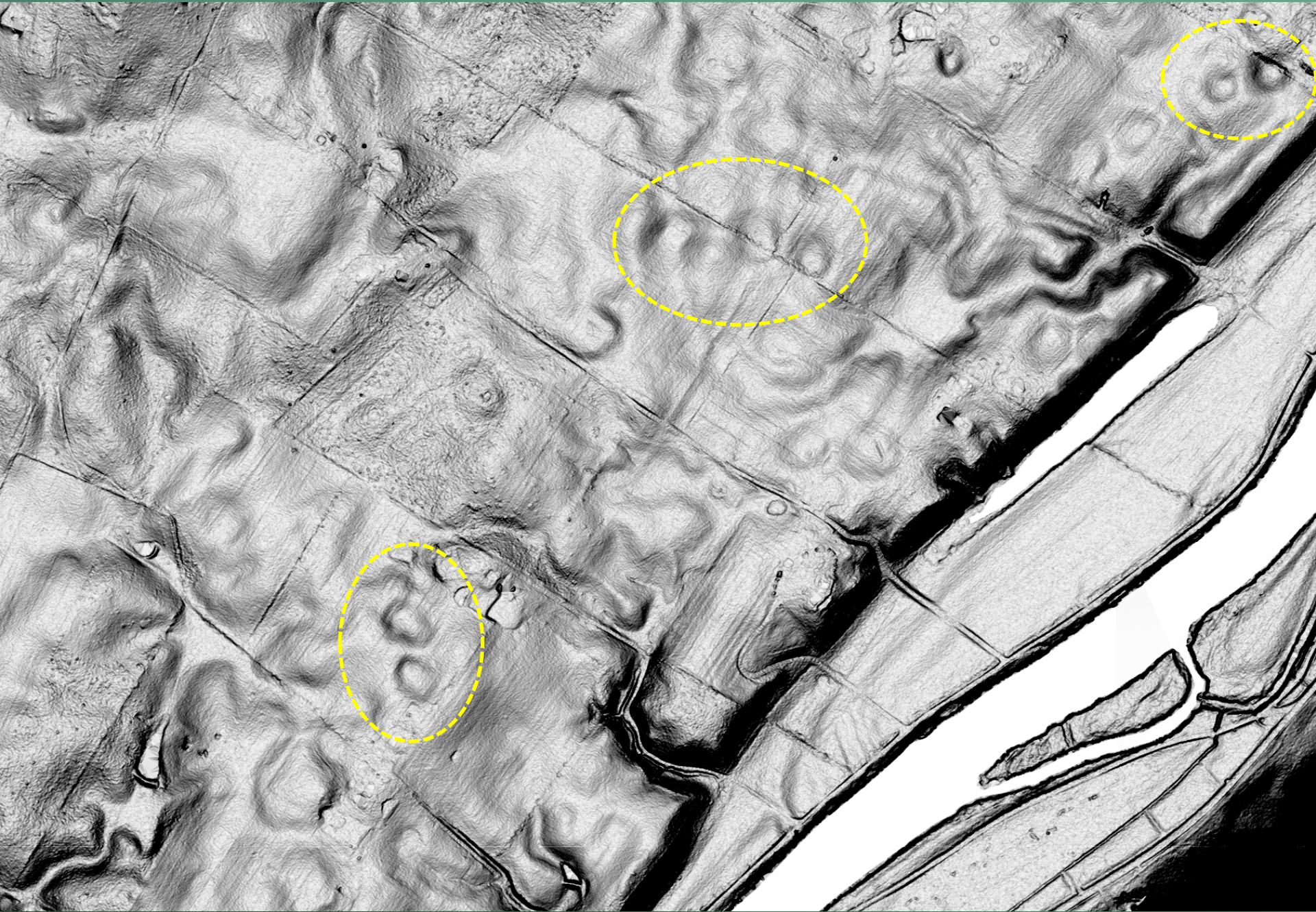


# Hillshade of LIDAR



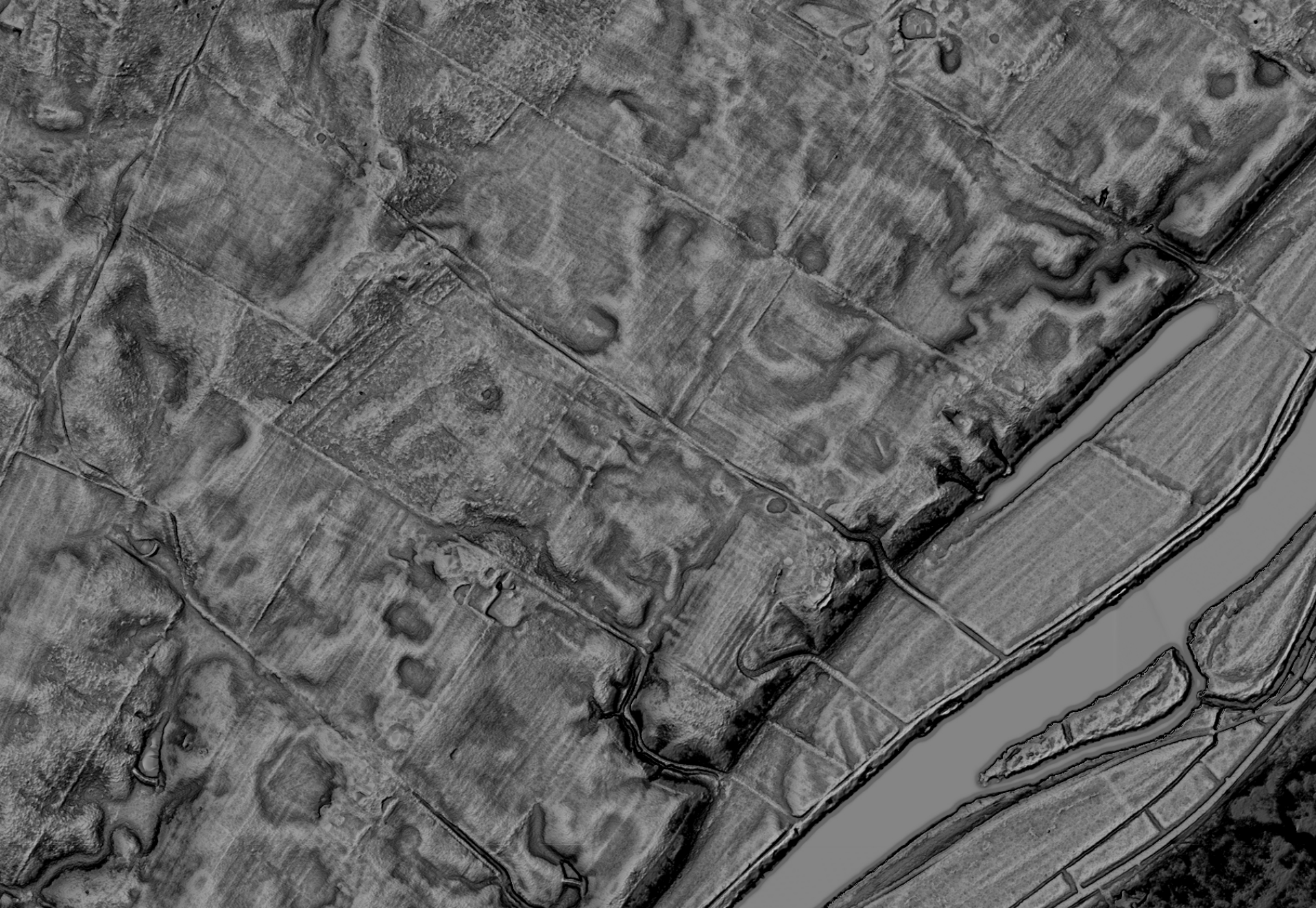


# Slopesshade of LIDAR



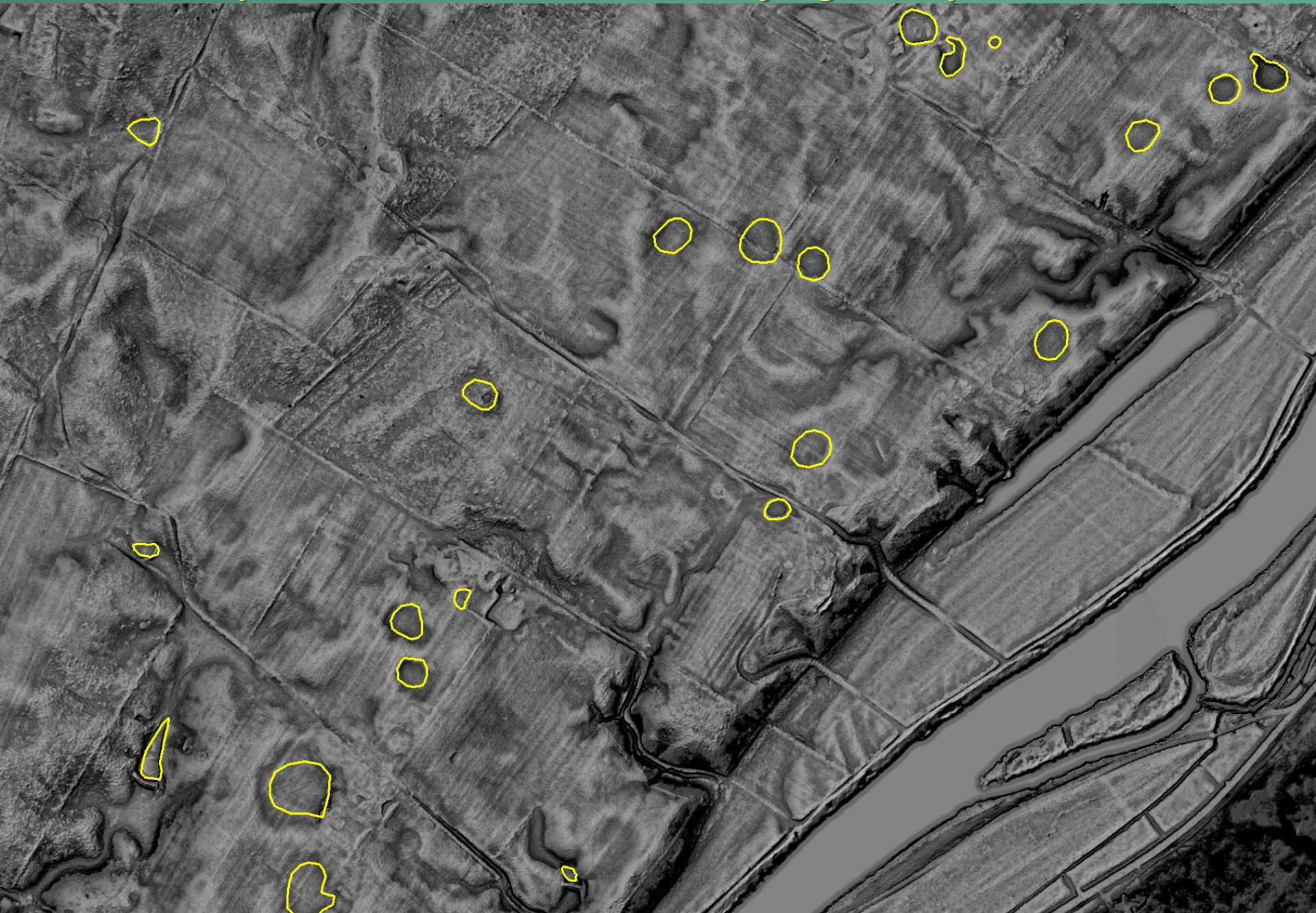


Combined slopeshade and TPI (2m inner, 10 m outer radius) of LIDAR DEM



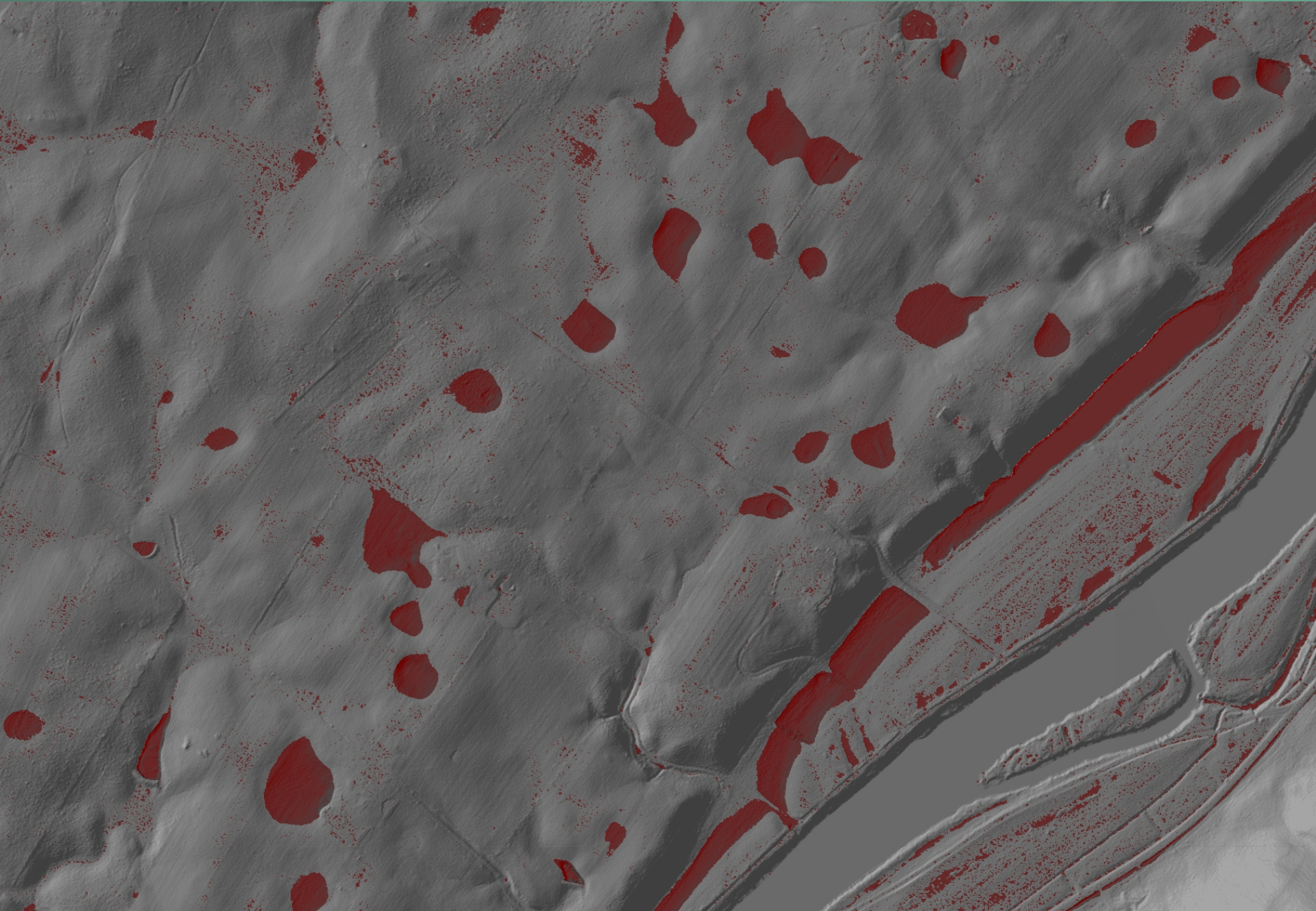


# Combined slopeshade and TPI used to manually digitize depressions



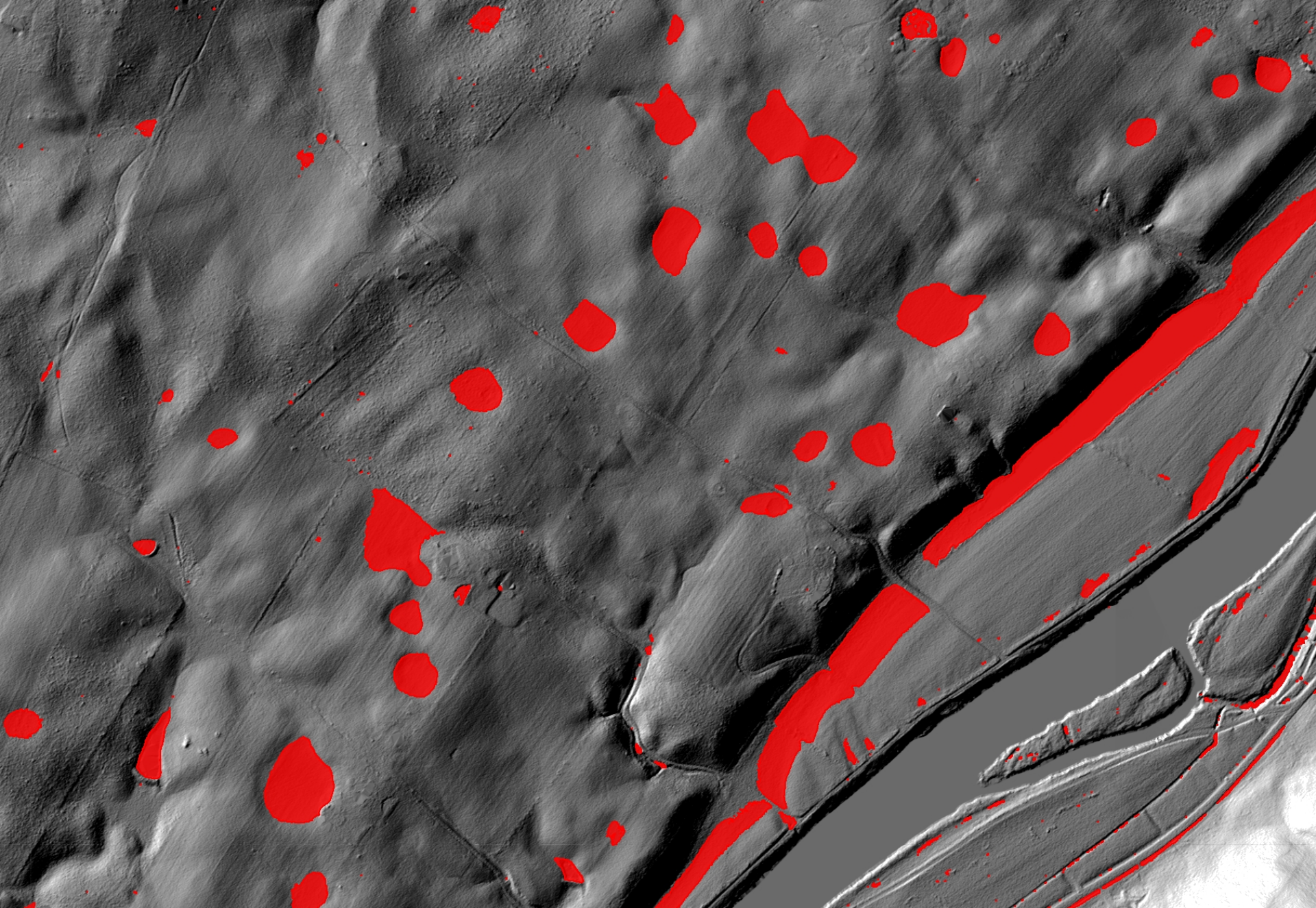


# “Filled” LIDAR DEM



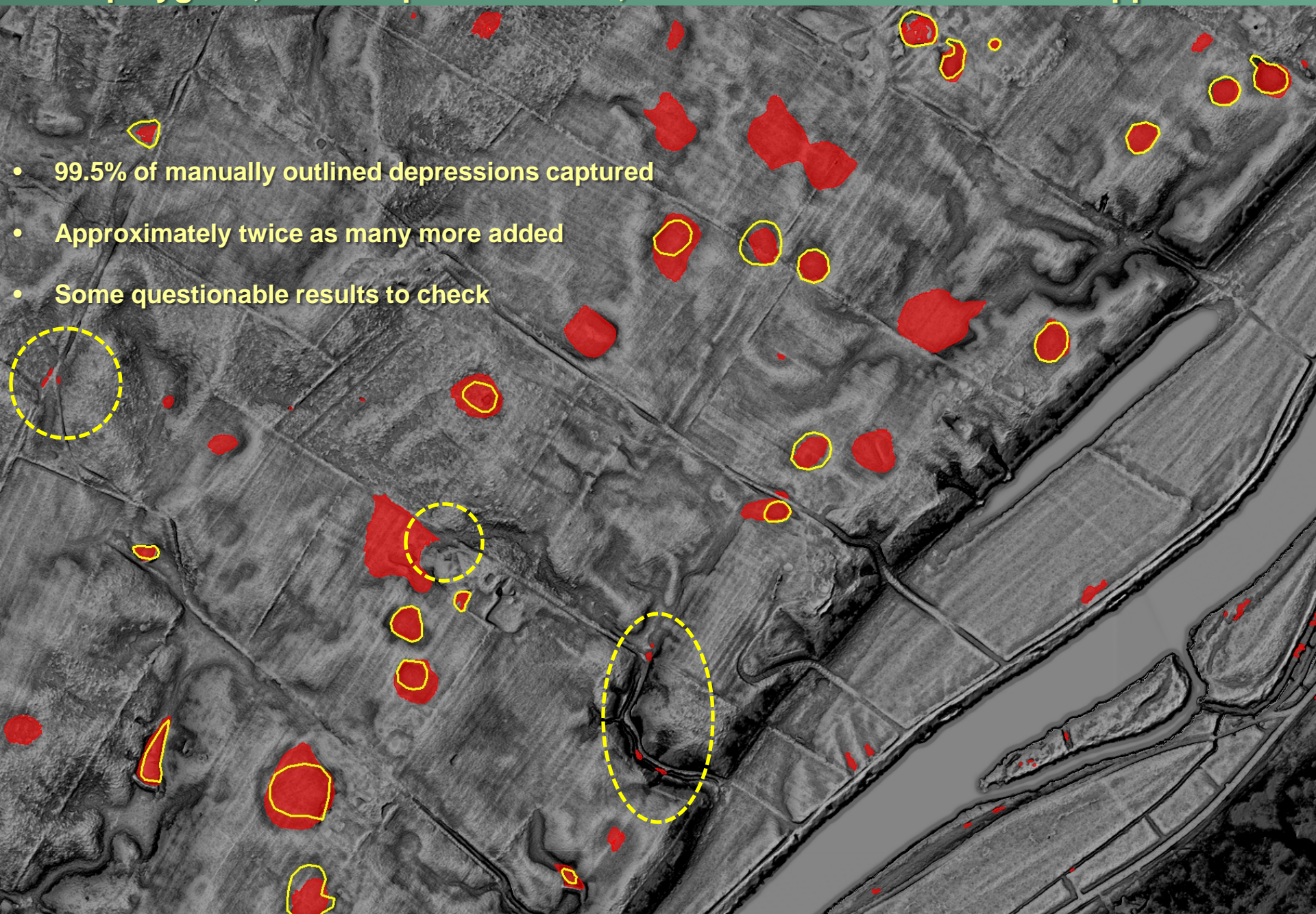


**Polymons extracted from 'filled' DEM, with depth and area thresholds applied**





# Final polygons, with shape thresholds, stream and structure buffers applied



- 99.5% of manually outlined depressions captured
- Approximately twice as many more added
- Some questionable results to check



# CONCLUSIONS:

- Automated detection of closed depressions is possible, but not perfect!
- Reconditioning of DEM is necessary to obtain valid results
- Mapping of culverts for appropriate flow routing is very important
- Field-checking and some manual revisions of final data is still necessary

