

# Processing UAV and lidar point clouds in GRASS GIS

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July, 2016

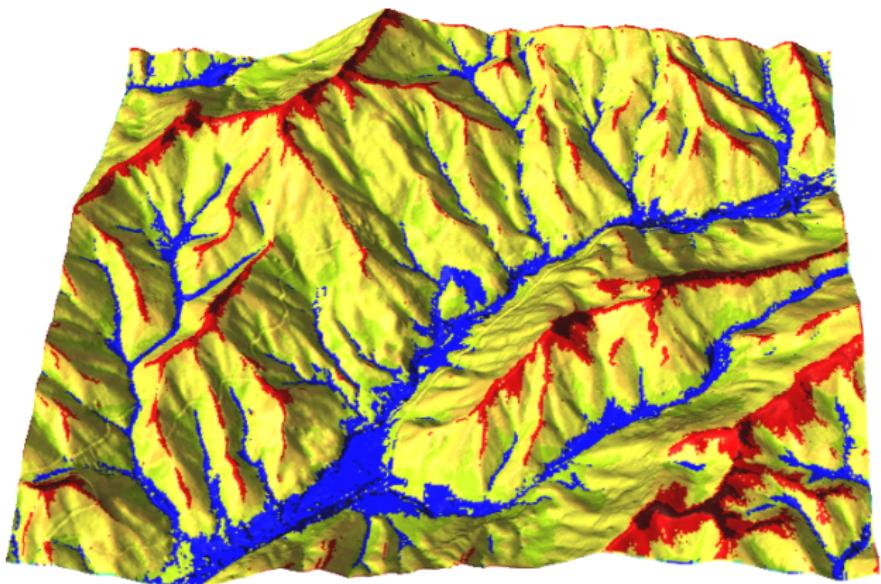


available at

[wenzeslaus.github.io/grass-lidar-talks](https://wenzeslaus.github.io/grass-lidar-talks)

# Landforms

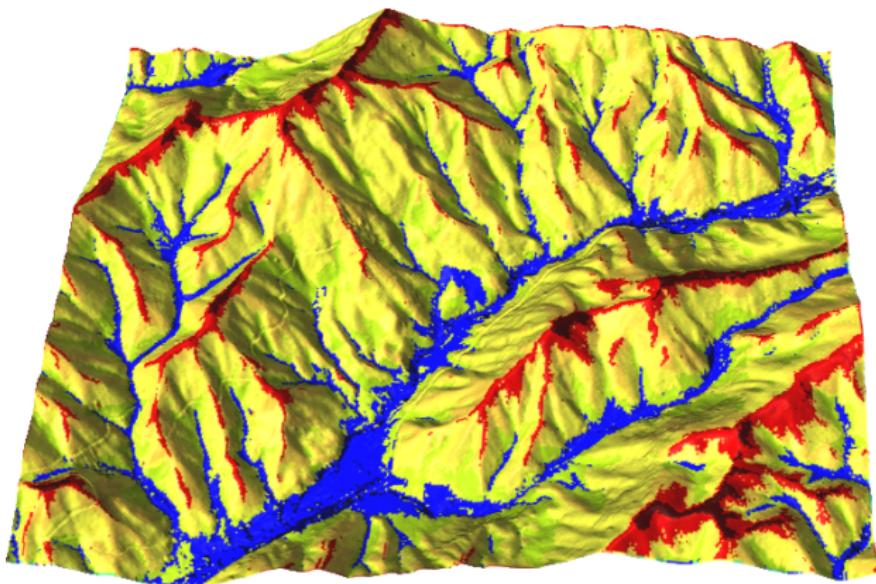
- ▶ *r.geomorphon*
  - ▶ new landform classification approach
  - ▶ by Jasiewicz & Stepinski



# Landforms

- ▶ *r.geomorphon*
- ▶ geomorphons - a new approach to classification of landform<sup>1</sup>

<sup>1</sup> Jasiewicz, J., Stepinski, T., 2013, Geomorphons - a pattern recognition approach to classification and mapping of landforms, *Geomorphology*



# Free, libre and open source

## Scripts and code I'm writing

- ▶ review
- ▶ re-usable
  - ▶ by other people
  - ▶ by future myself

## Software I'm using

- ▶ driven by needs of users
- ▶ longevity
  - ▶ learn now, use forever
  - ▶ GRASS GIS: over 30 years of development



Open Science Logo, Greg Emmerich,  
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# GRASS GIS

- ▶ all in one
  - ▶ hydrology modeling, image segmentation, point clustering, ...
- ▶ from small laptops to supercomputers
  - ▶ Raspberry Pi, Windows, Mac, GNU/Linux, FreeBSD, IBM AIX
- ▶ learn now, use forever
  - ▶ over 30 years of development and interface refinement
- ▶ used by
  - ▶ US Oak Ridge National Laboratory, Edmund Mach Foundation, JRC, ...

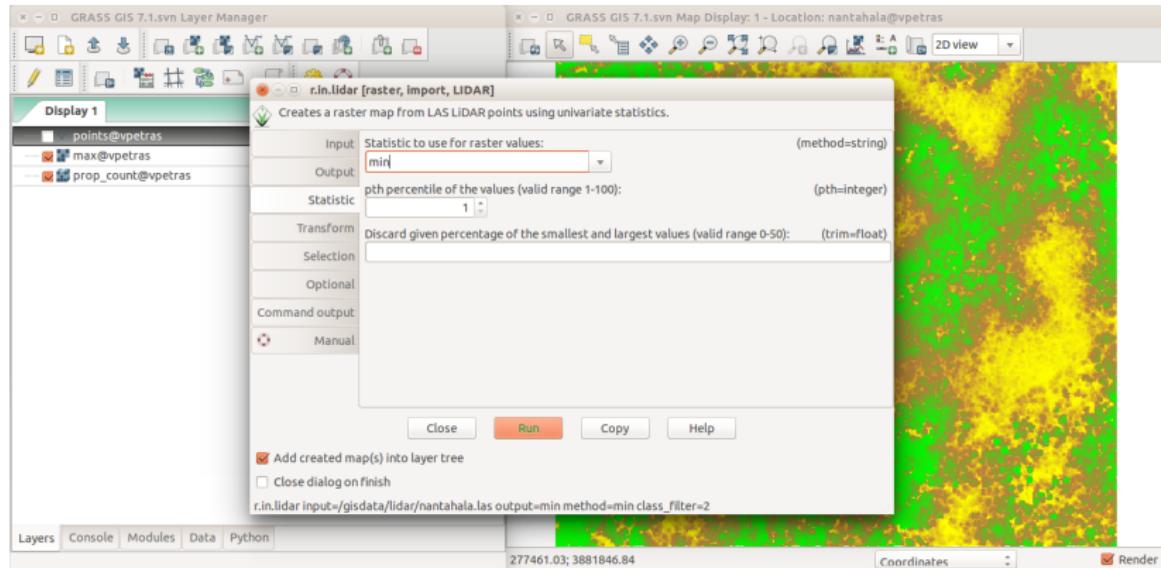


**GRASS** GIS

latest release 7.0.4

Sunday, May 1, 2016

# GUI



# Python and command line interfaces

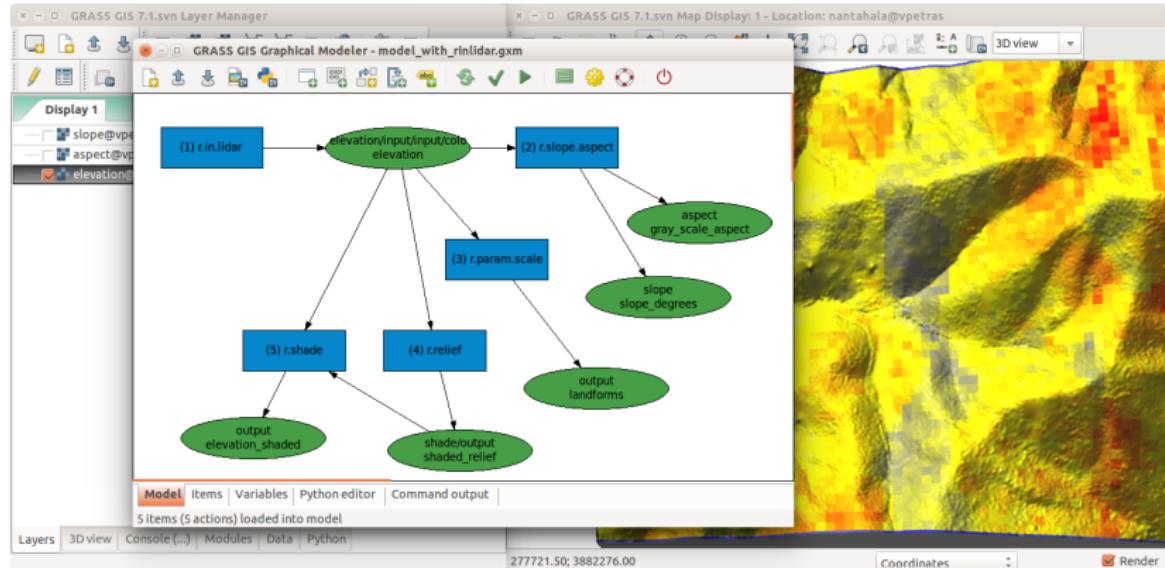
Documentation, Command Line (Shell, Bash, cmd.exe):

```
r.in.lidar input=points.las \
    output=elevation -e
```

Python:

```
from grass.script import run_command
run_command('r.in.lidar',
            input="points.las",
            output="elevation",
            flags='e')
```

# Graphical Modeler



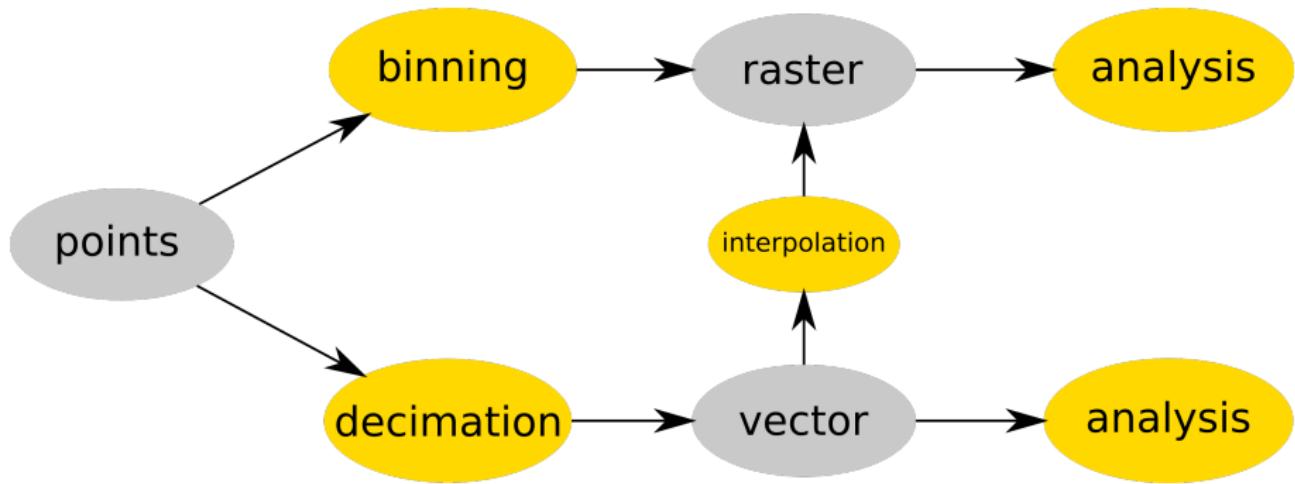
# Points

- ▶ collected by lidar
- ▶ generated by Structure from Motion (SfM) from UAV imagery



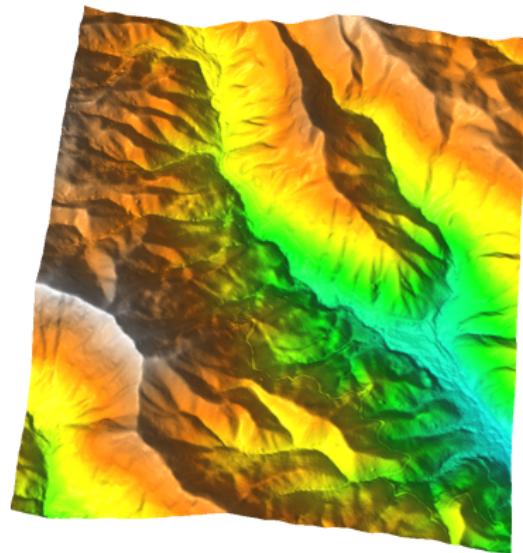
surface interpolated from points and visualized in GRASS GIS

# Workflow overview



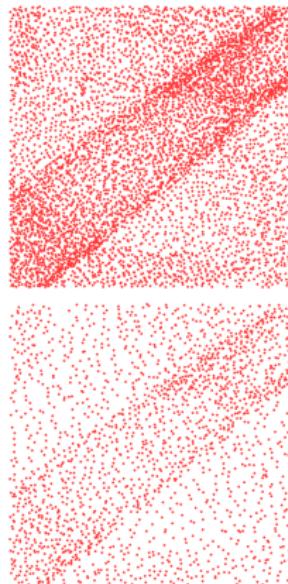
# Surface interpolation

- ▶ *v.surf.idw*
  - ▶ Inverse Distance squared Weighting
- ▶ *v.surf.bspline*
  - ▶ Bicubic or bilinear Spline interpolation with Tykhonov regularization
- ▶ *v.surf.rst*
  - ▶ Regularized Spline with Tension
  - ▶ *v.surf.rst.mp* (experimental)
    - ▶ 2 millions of points in 11 minutes



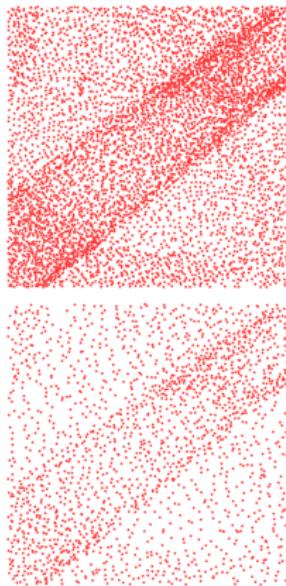
# Import and decimation

- ▶ *v.in.lidar*
  - ▶ libLAS
  - ▶ LAS/LAZ to GRASS GIS native vector
  - ▶ data stored in GRASS GIS database
- ▶ decimation  $\approx$  thinning  $\approx$  sampling
  - ▶ count-based decimation (skips points)
  - ▶ grid-based experimental, others needed?
  - ▶ fast count-based as good as more advanced decimations



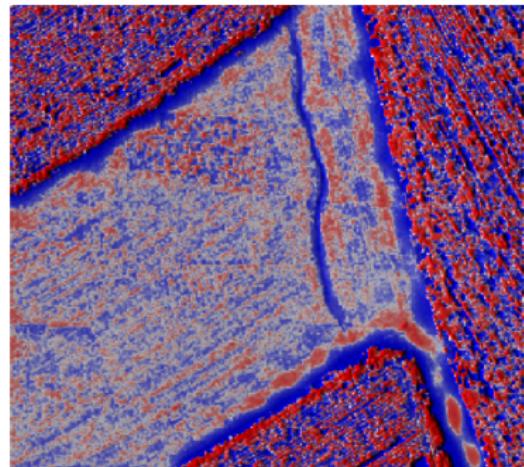
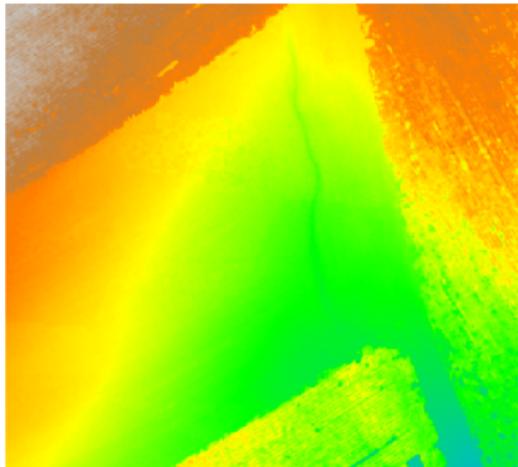
# Decimation

- ▶ *v.in.lidar*
  - ▶ filtering same as in *r.in.lidar*
- ▶ often more points than we need  
(research shows, Singh et al. 2015, Petras et al. 2016)
- ▶ interpolation, clustering, ... are costly
- ▶ decimation  $\approx$  sampling
  - ▶ fast count-based as effective as more advanced decimation



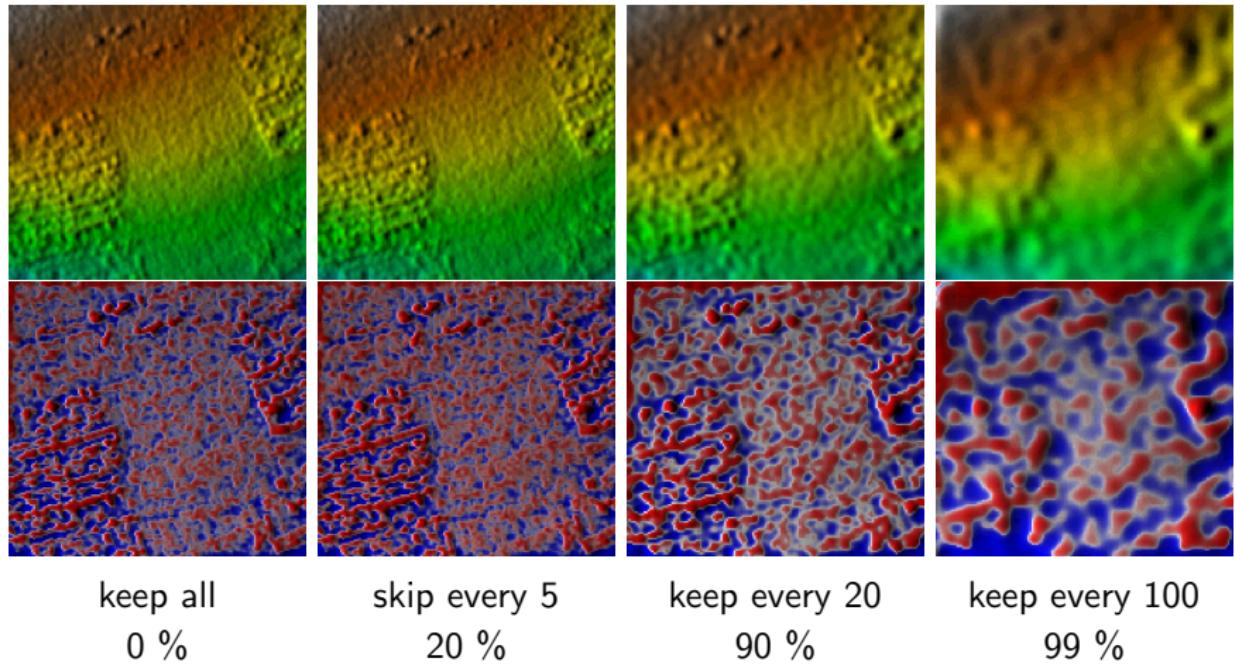
## Local relief model (LRM)

- ▶ `r.local.relief` (micro-topography, features other than trend)

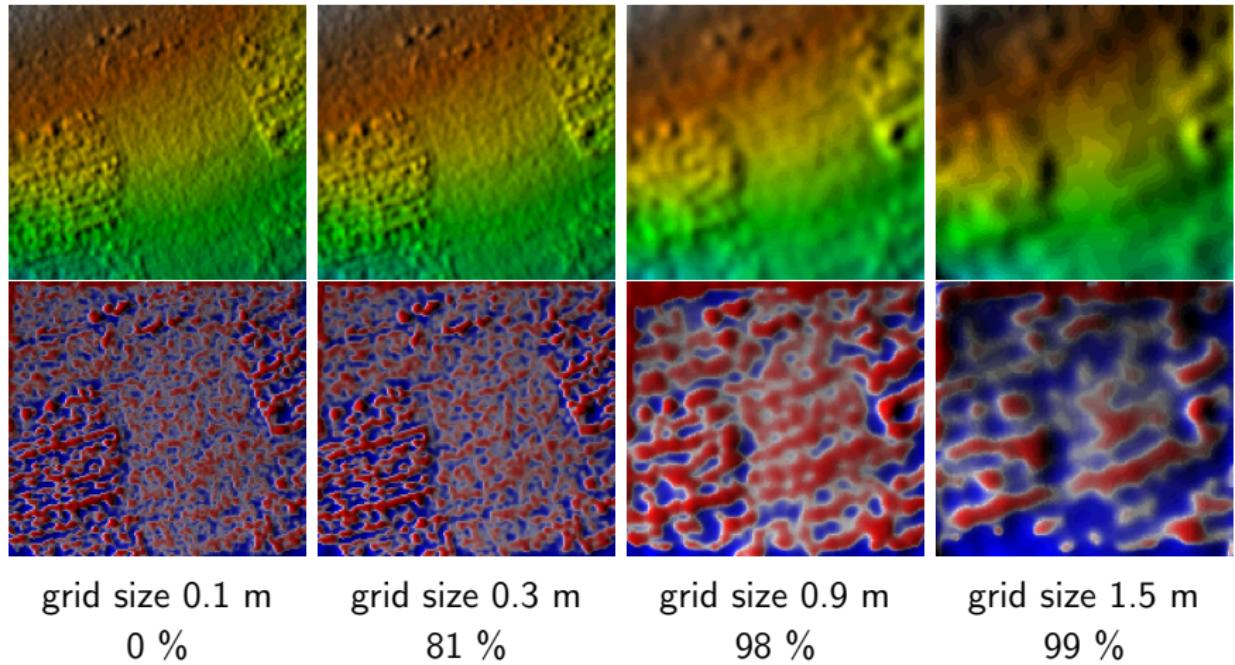


30-60cm wide, 30cm deep, 60m long gully (resolution 30cm)

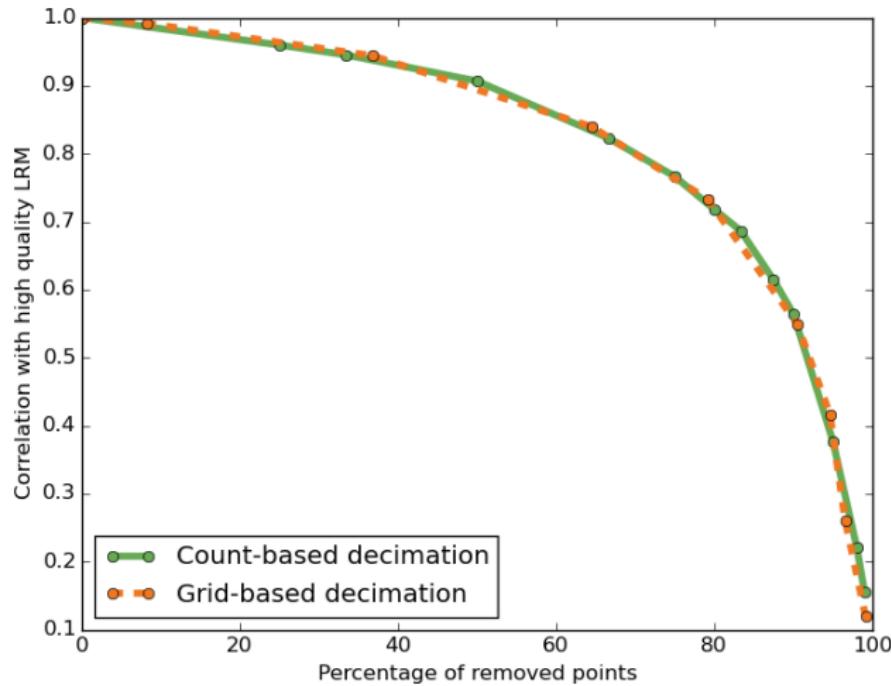
# Count-based decimation influence on interpolated elevation



# Influence of grid-based decimation resolution

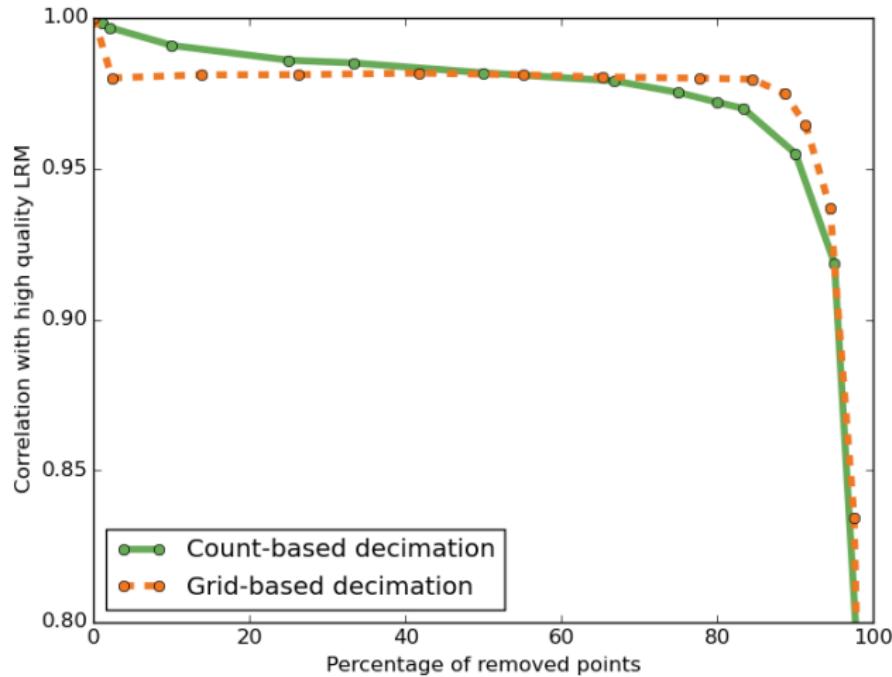


# Decimation



interpolations and local relief model computations at resolution 0.5 m

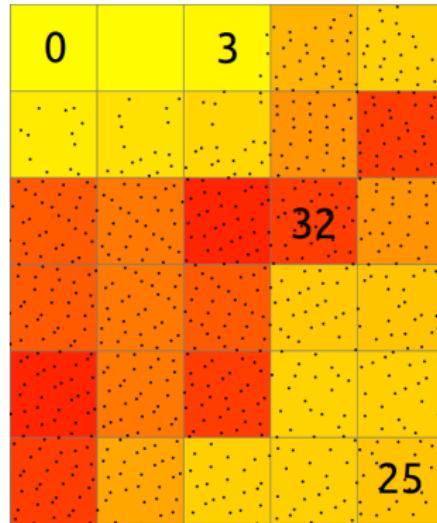
# Decimation



interpolations and local relief model computations at resolution 0.5 m

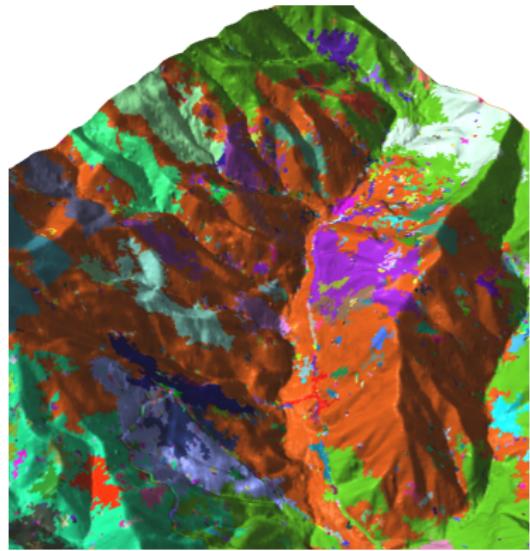
# Binning points to raster

- ▶ *r.in.lidar*
- ▶ import and analysis
- ▶ statistics of point counts,  
height and intensity
  - ▶ n, min, max, sum
  - ▶ mean, range,  
skewness, ...



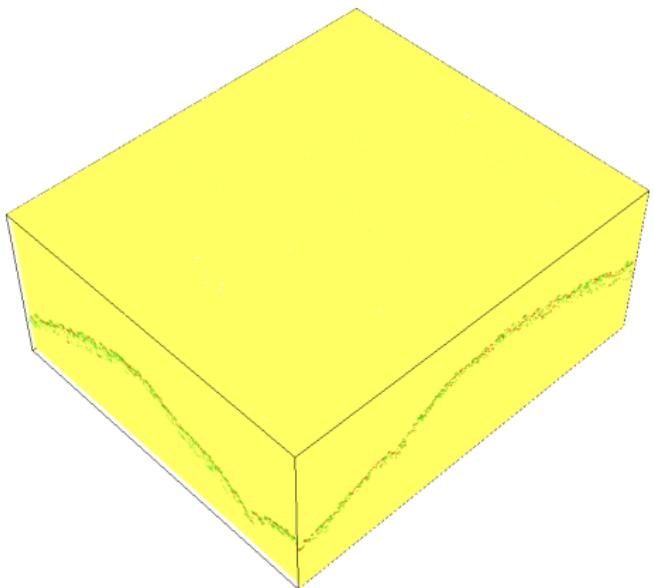
# Rastersize early

- ▶ many algorithms are raster-based
  - ▶ a lot of data with continuous nature
  - ▶ natural spatial index
- ▶ example:
  1. count of ground points
  2. count of non-ground points
  3. used as image bands
  4. segmentation using *i.segment*



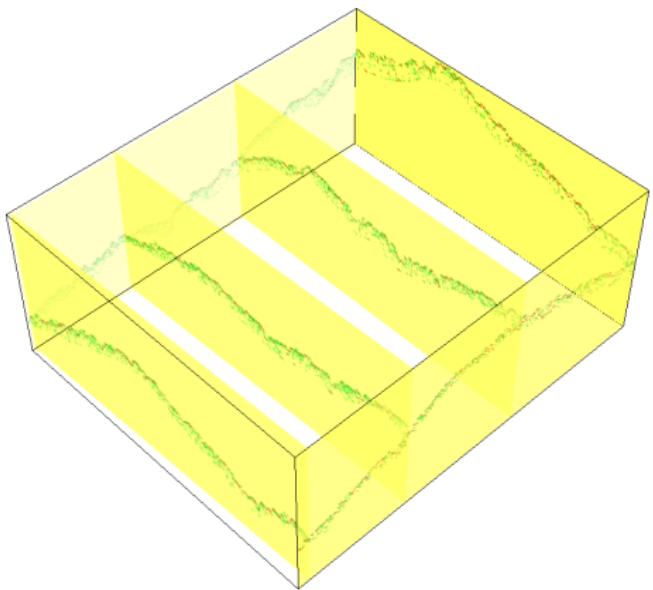
# 3D raster

- ▶ stacked 2D rasters
- ▶ challenging to visualize
- ▶ same principles as in 2D
  - ▶ e.g. 3D raster map algebra



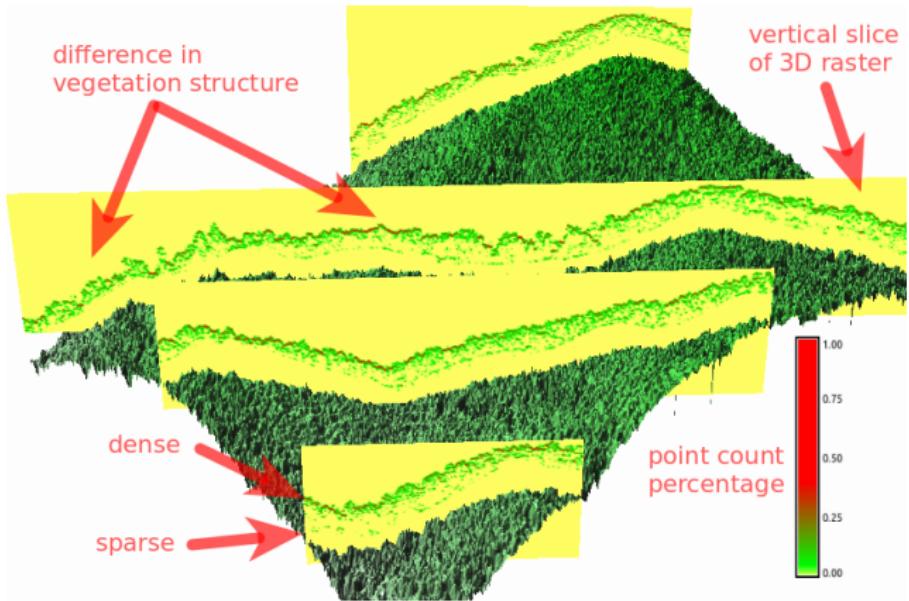
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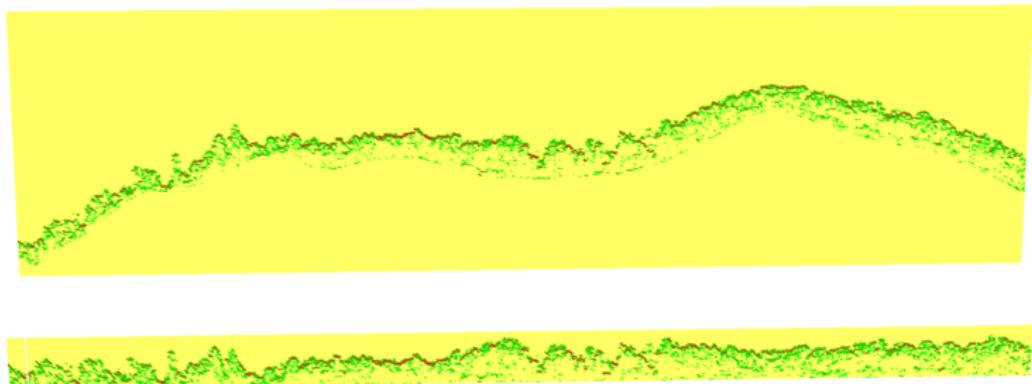


# Binning points to 3D raster

- ▶ *r3.in.lidar*
- ▶ proportional count
  - ▶ count per 3D cell relative to the count per vertical column
- ▶ intensity can be used instead of count



## Point heights reduced to surface

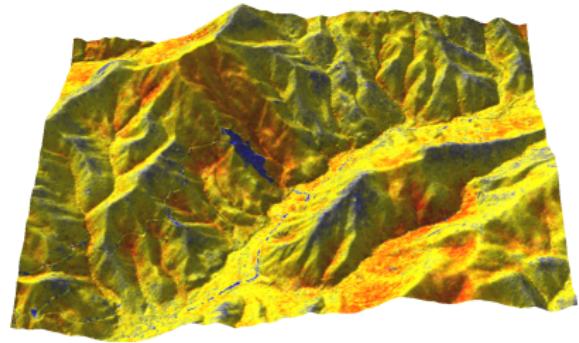


- ▶ `r3.in.lidar`, option `base_raster`
- ▶ height reduced by 2D raster values
- ▶ similarly also for 2D binning: height above a surface, top of the canopy, ...

# Trade-offs

## Raster processing

- ▶ high memory (RAM) usage
  - fast
- ▶ low memory usage (high I/O) – slow



visualization: range from binning on interpolated surface

## Vector processing

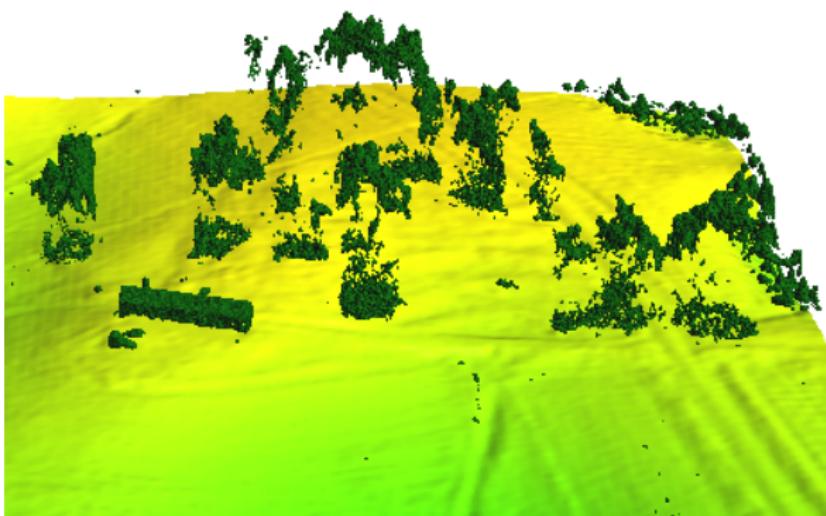
- ▶ slower than raster
  - ▶ e.g., interpolation much slowed than binning
- ▶ hard to make general statements

example: binning with base elevation subtraction:  
 $\approx 1000$  files,  $> 9$  billion points

$\approx 3$  hours,  $\approx 10$  GB of memory (in-memory mode)

# Ground detection

- ▶ *v.lidar.edgedetection*,  
*v.lidar.growing*,  
*v.lidar.correction*
  - ▶ by Brovelli, Cannata, Antolin & Moreno
- ▶ *v.lidar.mcc*
  - ▶ multiscale curvature based classification algorithm
  - ▶ by Blumentrath, according to Evans & Hudak
- ▶ PDAL filters.ground
  - ▶ currently in *v.in.pdal*
  - ▶ progressive morphological filter by Zhang
  - ▶ provided by PCL



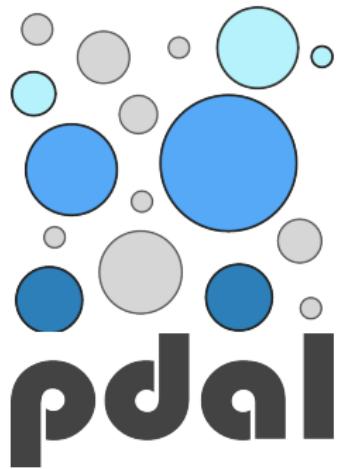
# Current state of integration with PDAL

## PDAL

- ▶ Point Data Abstraction Library
- ▶ format conversions
- ▶ processing, filtering

## Experimental integration

- ▶ *v.in.pdal*
  - ▶ next: *r.in.pdal*, *r3.in.pdal*
- ▶ runs PDAL filters during import
  - ▶ filters are followed by GRASS processing

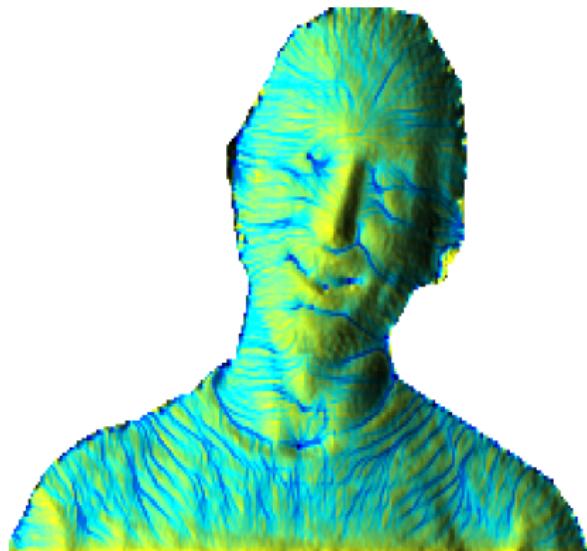


# Using other open source projects

## *r.in.kinect*

- ▶ scans using Kinect
- ▶ OpenKinect libfreenect2
- ▶ Point Cloud Library (PCL)
- ▶ GRASS GIS libraries
  - ▶ C API
  - ▶ raster processing
  - ▶ regularized spline with tension interpolation

used in  
Tangible Landscape



## Summary

- ▶ rasterize early
- ▶ GRASS modules can work with large data
  - ▶ sometimes a special flag is needed
  - ▶ if not, report a bug
- ▶ 3D rasters, PDAL integration



Get GRASS GIS 7.3 development version at  
[grass.osgeo.org/download](http://grass.osgeo.org/download)

GRASS user mailing list  
[lists.osgeo.org/listinfo/grass-user](http://lists.osgeo.org/listinfo/grass-user)

Paper and slides available at  
[wenzeslaus.github.io/grass-lidar-talks](http://wenzeslaus.github.io/grass-lidar-talks)



# Acknowledgements

## Software

Presented functionality is work done by Vaclav Petras, Markus Metz, and the GRASS development team.

Thanks to users for feedback and testing, especially to Doug Newcomb, Markus Neteler, Laura Belica, and William Hargrove.



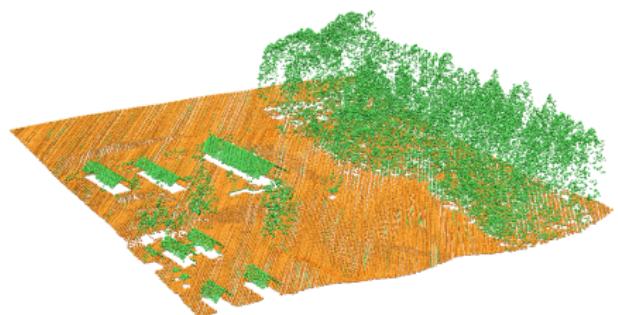
# Acknowledgements

## Datasets

Lidar and UAV Structure from Motion (SfM) data for GIS595/MEA792: UAV/lidar Data Analytics course

Nantahala NF, NC: Forest Leaf Structure, Terrain and Hydrophysiology. Obtained from OpenTopography.

<http://dx.doi.org/10.5069/G9HT2M76>



# Acknowledgements

## Presentation software

Slides were created in L<sup>A</sup>T<sub>E</sub>X using the BEAMER *class*.