

# Application of laser scanning (lidar) data for land cover classification

Scientific Research Centre of the  
Slovenian Academy of Sciences and Arts

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**"Always start your presentation with a joke, but be careful not to offend anyone! Don't mention religion, politics, race, age, money, technology, men, women, children, plants, animals, food...."**



# Introduction

- What is lidar and how does it work
- What information does it provide
- How to process lidar data
- Land cover classification from lidar and opt data
- Step by step procedure
- Advantages and limitations



# What is lidar

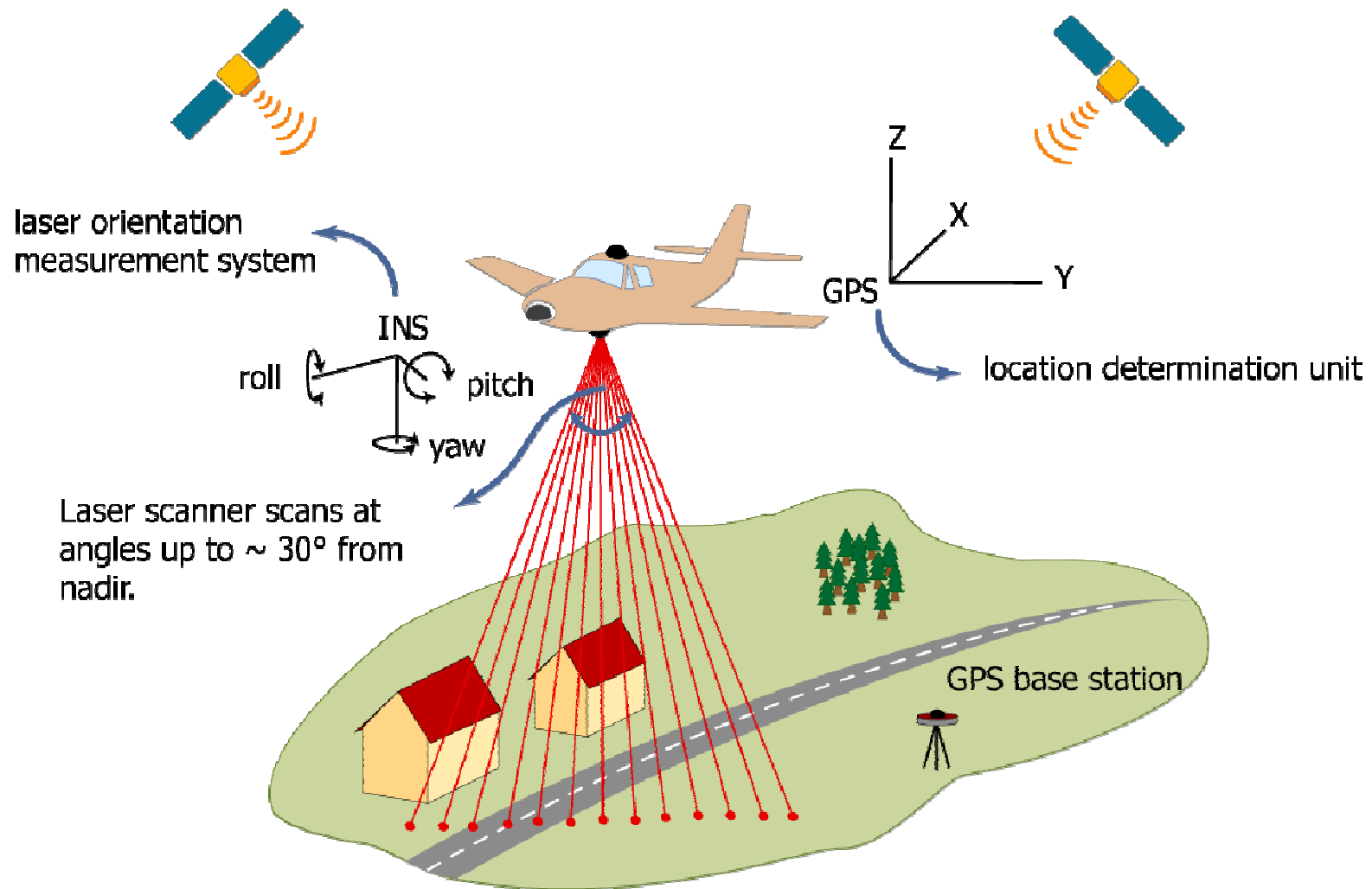
- Lidar is an active instrument, that emits short laser pulses and observes their return – measures the distance and reflection intensity
- Light Detection And Ranging or Laser Imaging Detection And Ranging
- 30 year old technology that became cost effective recently
- Currently the most accurate method of 3D data acquisition



# Laser scanning applications

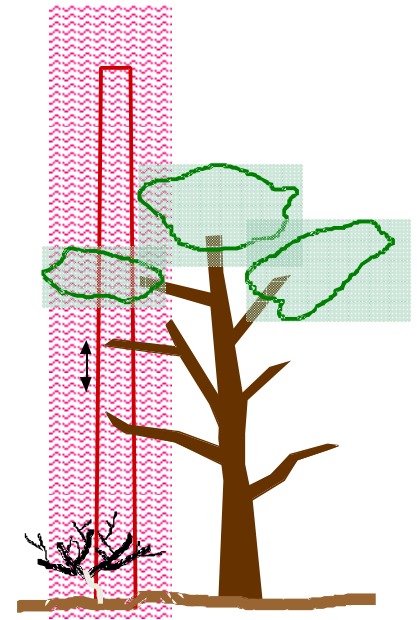
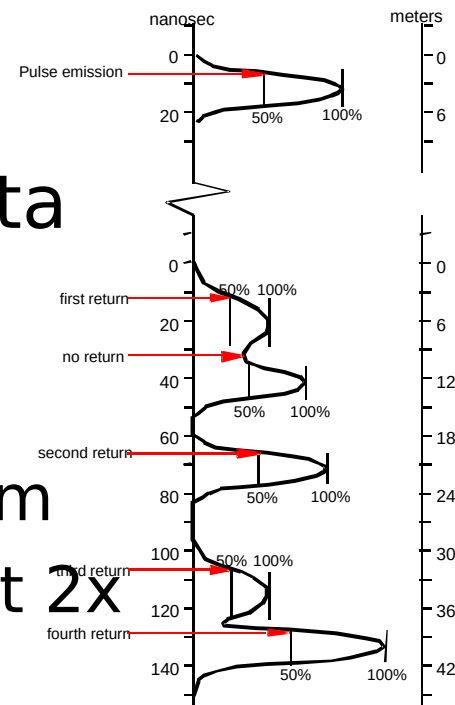
- 3D visualisation
- archaeology
- architecture and facade measuring
- archiving: historical, legal
- as-build surveying
- atmospheric / aerosols research
- (3D) city modelling
- digital factory
- forest management
- forensics
- geomorphology, hydrology, glaciology
- infrastructure and communications
- interface checking
- medical imaging / medical applications
- military
- mining / open pit modelling
- movie industry
- monitoring and civil engineering
- power line + poles measurement
- preservation
- process automation and robotics
- profiles, volumes, area calculation
- quality control / quality assurance
- rapid prototyping
- reverse engineering
- rock face analysis
- topography
- tunnel surveying
- urban planning
- virtual reality and simulations

# How does it work



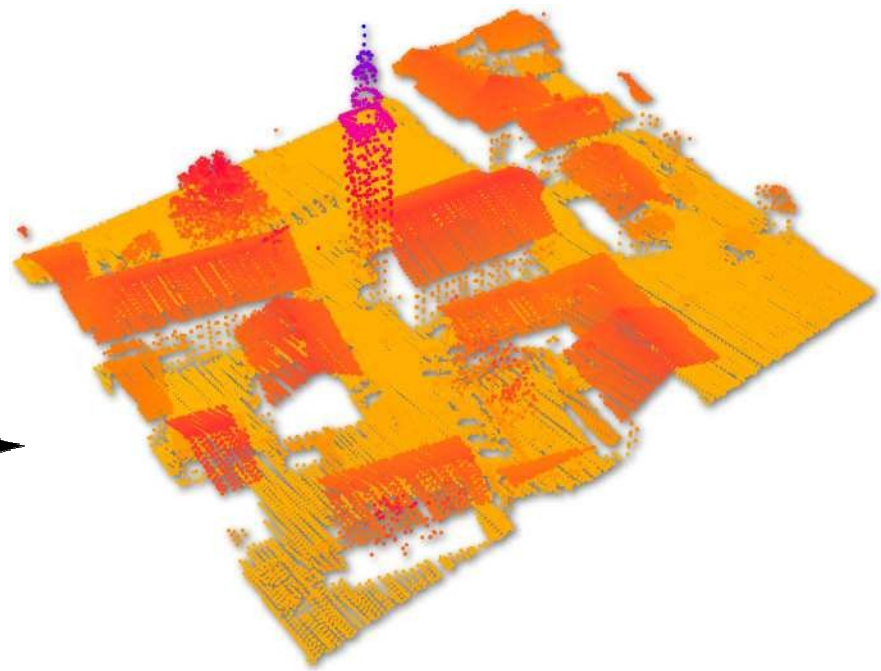
# Lidar measurements

- Multiple return values
- Positional data and intensity data
- Remarkably large data files (huge!)
- Accuracy
  - Vertical RMSE at 10 cm
  - Horizontal accuracy at 2x the footprint size
- Lidar can see through (beside) vegetation

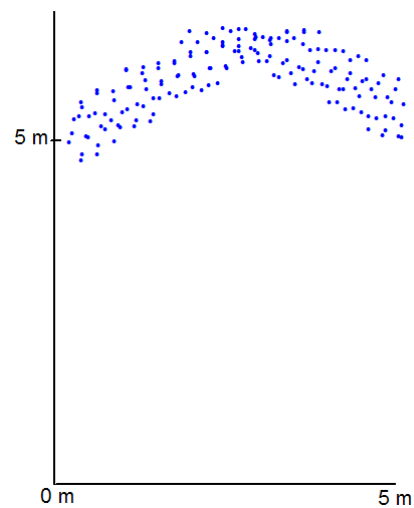
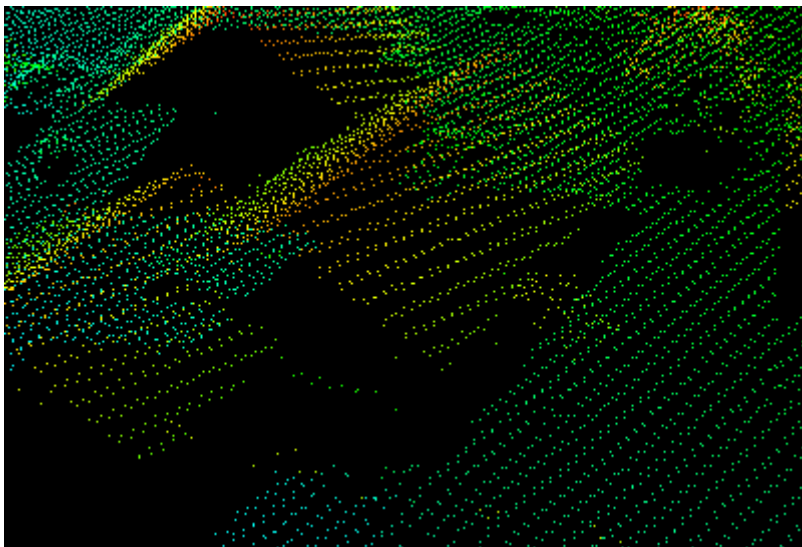
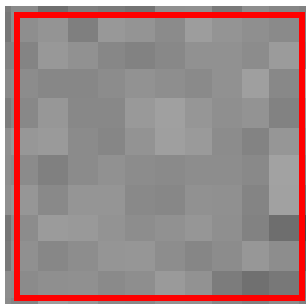


# What results does it produce

X	Y	Z	intensity	echo no.
389838,44	126050,22	476,88	11	1
389838,45	126049,95	452,19	17	2
389838,49	126051,21	452,15	18	3
389838,32	126054,99	468,47	10	1
389838,31	126055,10	469,56	14	1
389838,34	126055,85	469,25	19	1
389838,44	126050,13	452,22	13	3
389838,48	126051,39	452,18	40	3
389838,30	126055,27	469,62	11	1
389838,35	126056,63	469,34	14	1
389837,72	126049,74	452,45	55	3
389837,74	126050,35	452,47	22	2
389837,77	126051,04	452,30	27	2
389837,79	126051,65	452,33	28	2
389837,81	126052,32	452,22	52	3
389837,84	126052,98	452,14	26	3
389837,86	126053,62	452,09	41	2
389837,88	126054,24	452,10	45	2
389837,91	126054,90	452,03	26	3
389837,93	126055,54	452,00	25	3
389837,96	126056,22	451,88	23	3
389837,98	126056,85	451,86	24	3
389838,04	126058,63	452,05	18	3
389838,06	126059,22	452,14	31	2
...	...	...	...	...

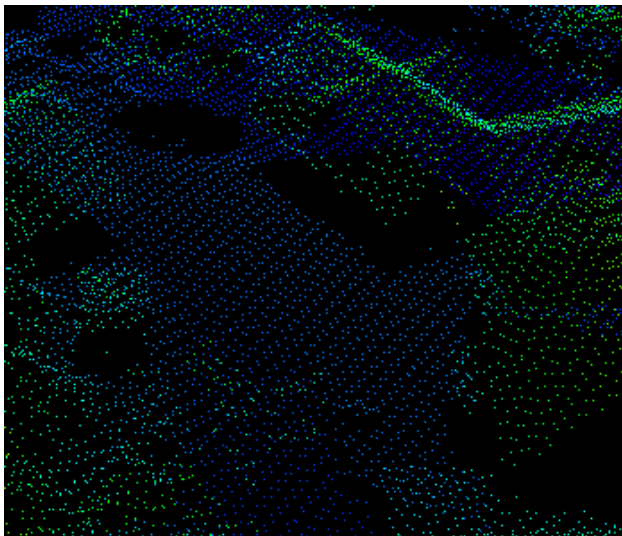
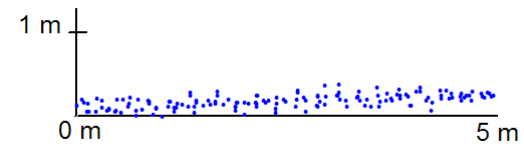


# Buildings



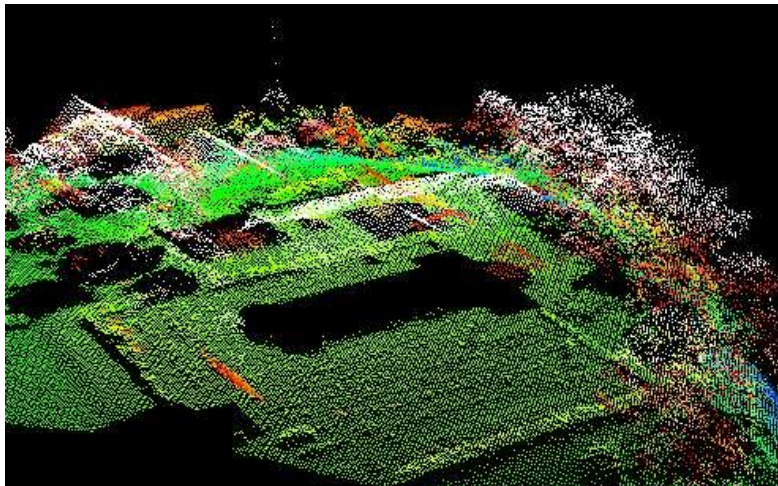
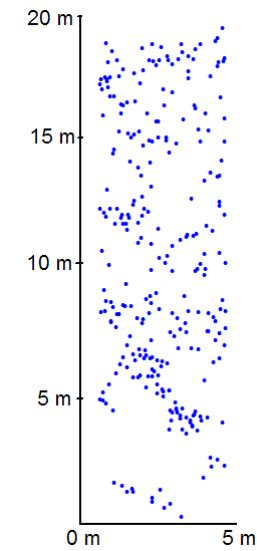
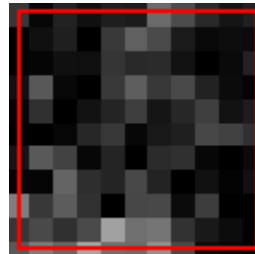
Minimum:	612.14
Maximum:	614.09
Range:	1.95
Sum:	100,583.43
Mean:	613.314
Variance:	0.229595
Standard Deviation:	0.479161

# Roads



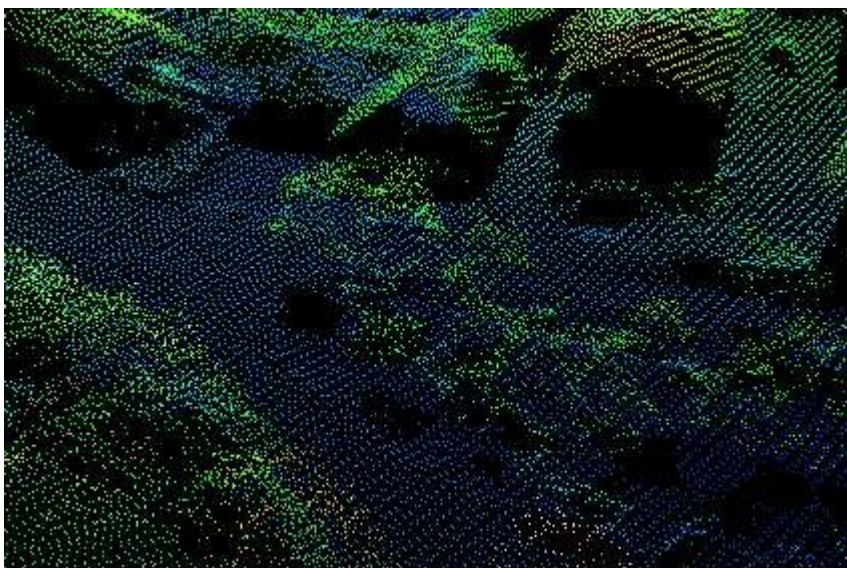
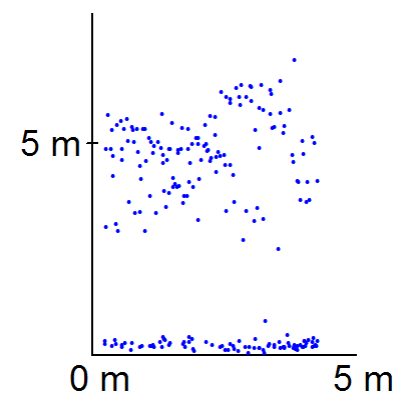
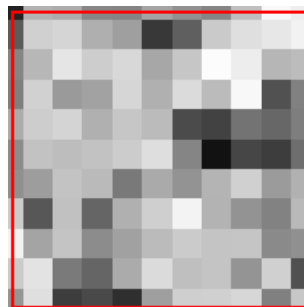
Minimum:	602.91
Maximum:	603.29
Range:	0.38
Sum:	90,463.36
Mean:	603.089
Variance:	0.0061338
Standard Deviation:	0.0783186

# High vegetation



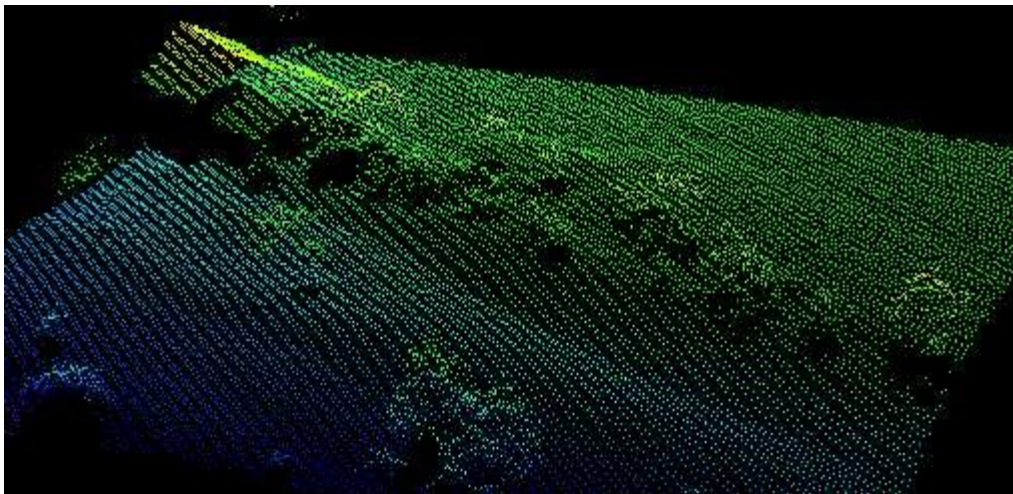
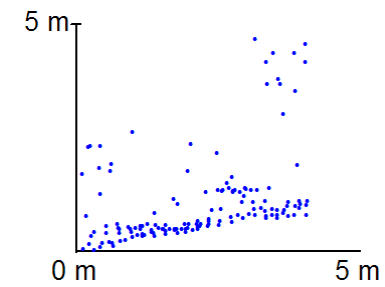
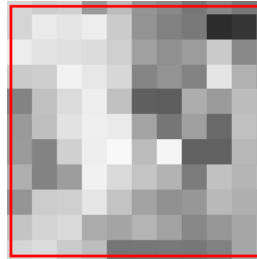
Minimum:	609.03
Maximum:	628.31
Range:	19.28
Sum:	175,262.44
Mean:	619.302
Variance:	26.8657
Standard Deviation:	5.18321

# Low vegetation



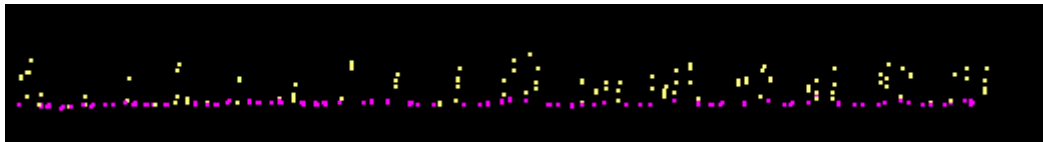
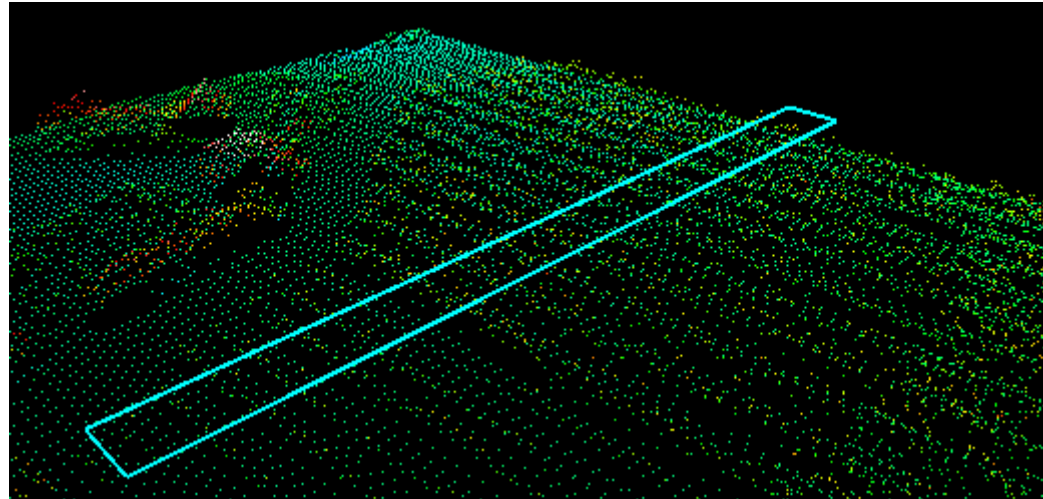
Minimum:	602.59
Maximum:	609.46
Range:	6.87
Sum:	132,613.72
Mean:	605.542
Variance:	5.28777
Standard Deviation:	2.29951

# Bushes

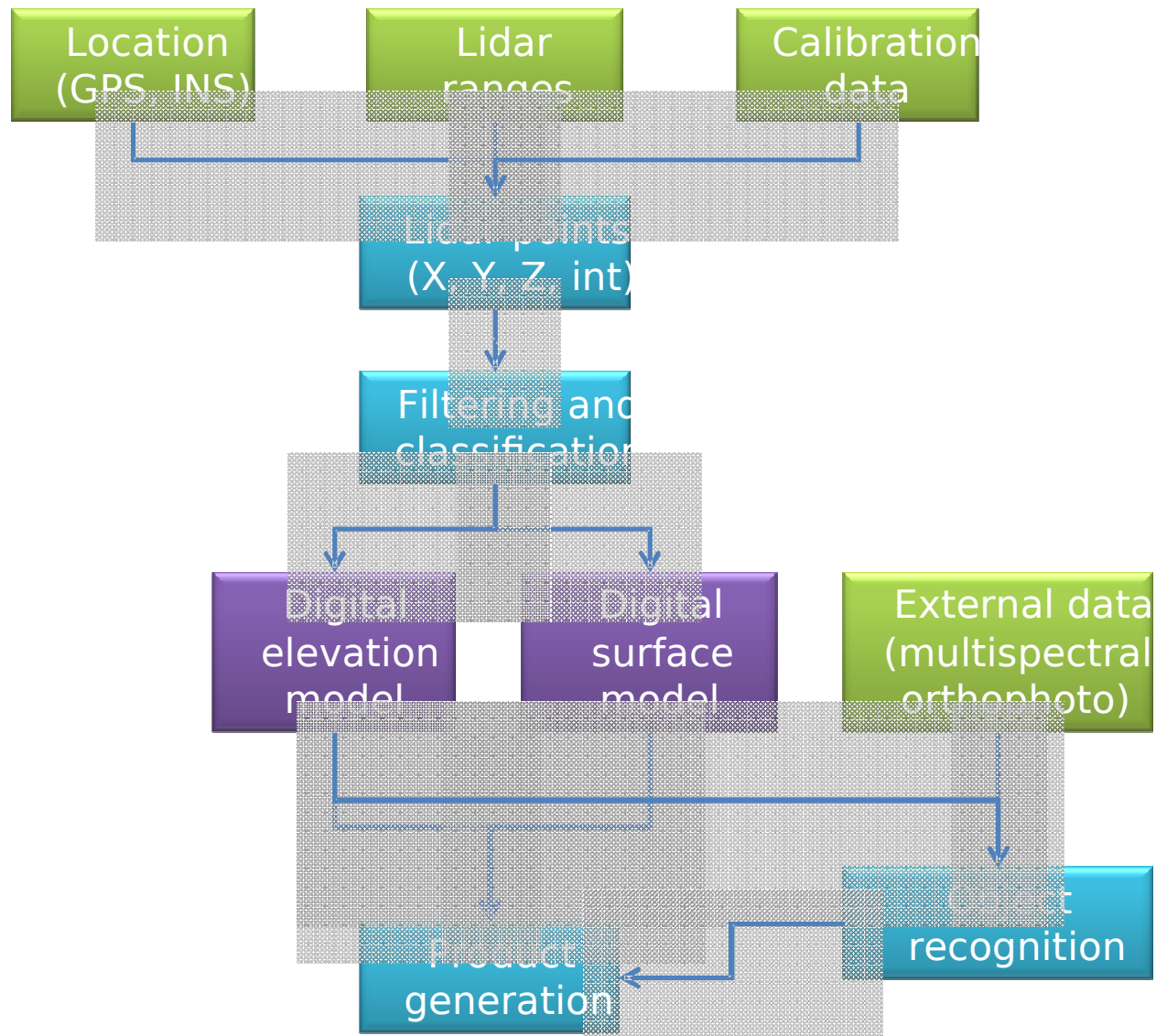


Minimum:	607.92
Maximum:	612.51
Range:	4.59
Sum:	88,299.15
Mean:	608.96
Variance:	0.956474
Standard Deviation:	0.977995

# Hops



# Data processing

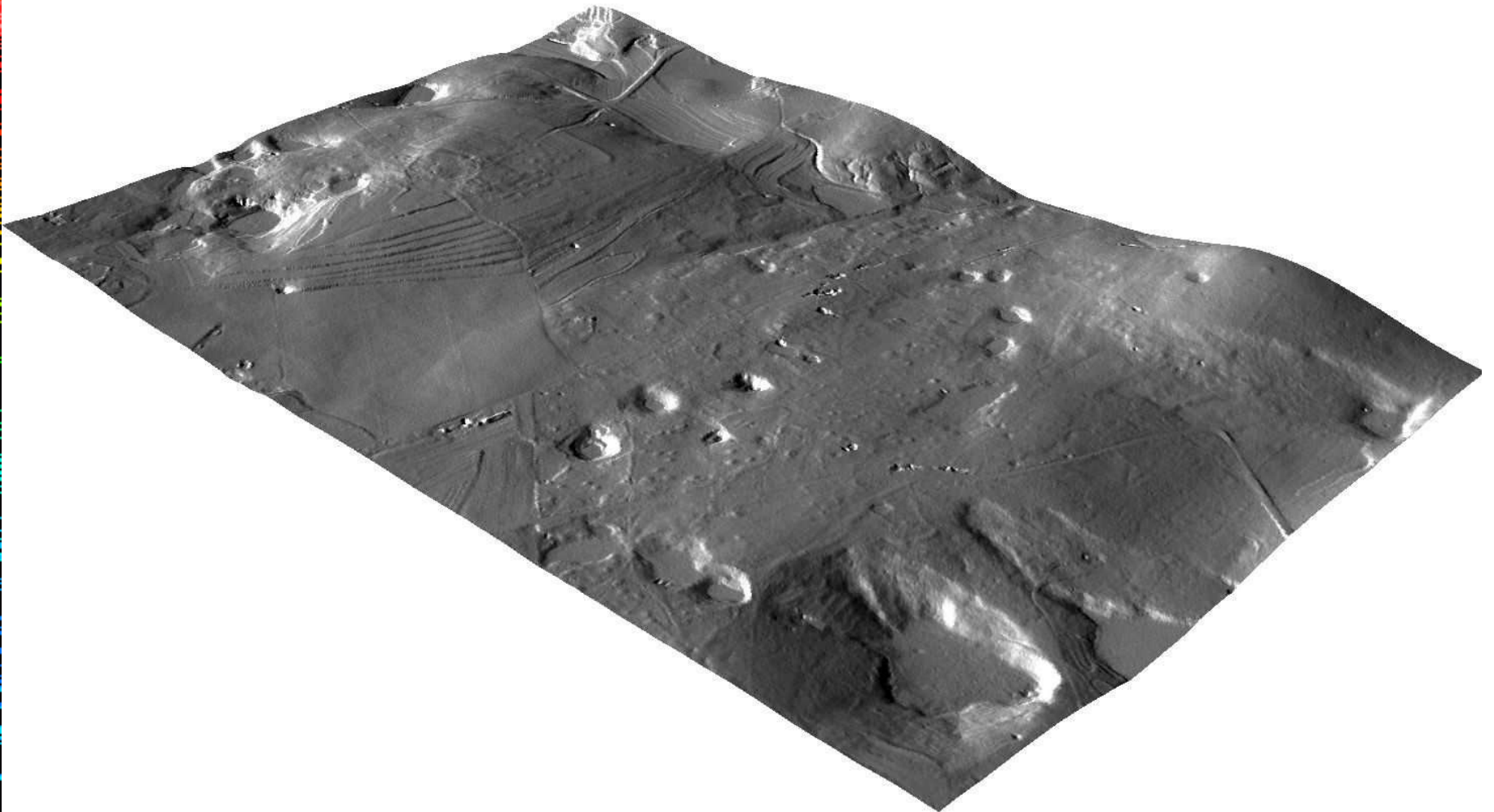
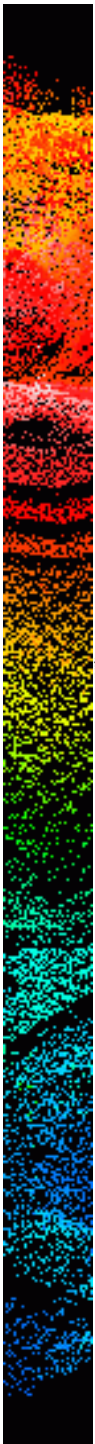




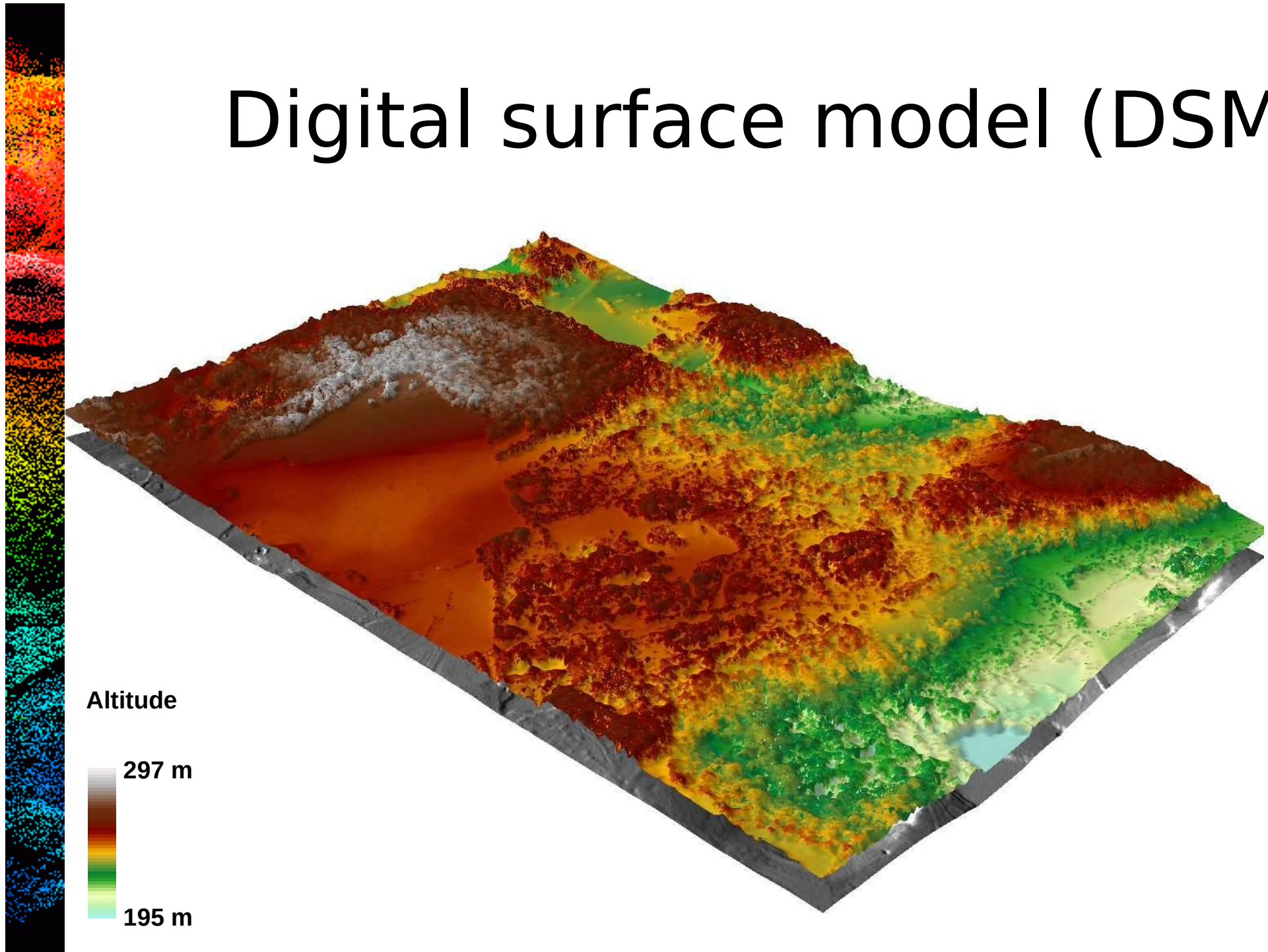
# DEM and DSM production

- Digital elevation model and digital surface models are the most important products derived with laser scanning
- From 3D data it is not easy to classify points into ground, top and in-between
- Filtering: classification of points into terrain and off-terrain

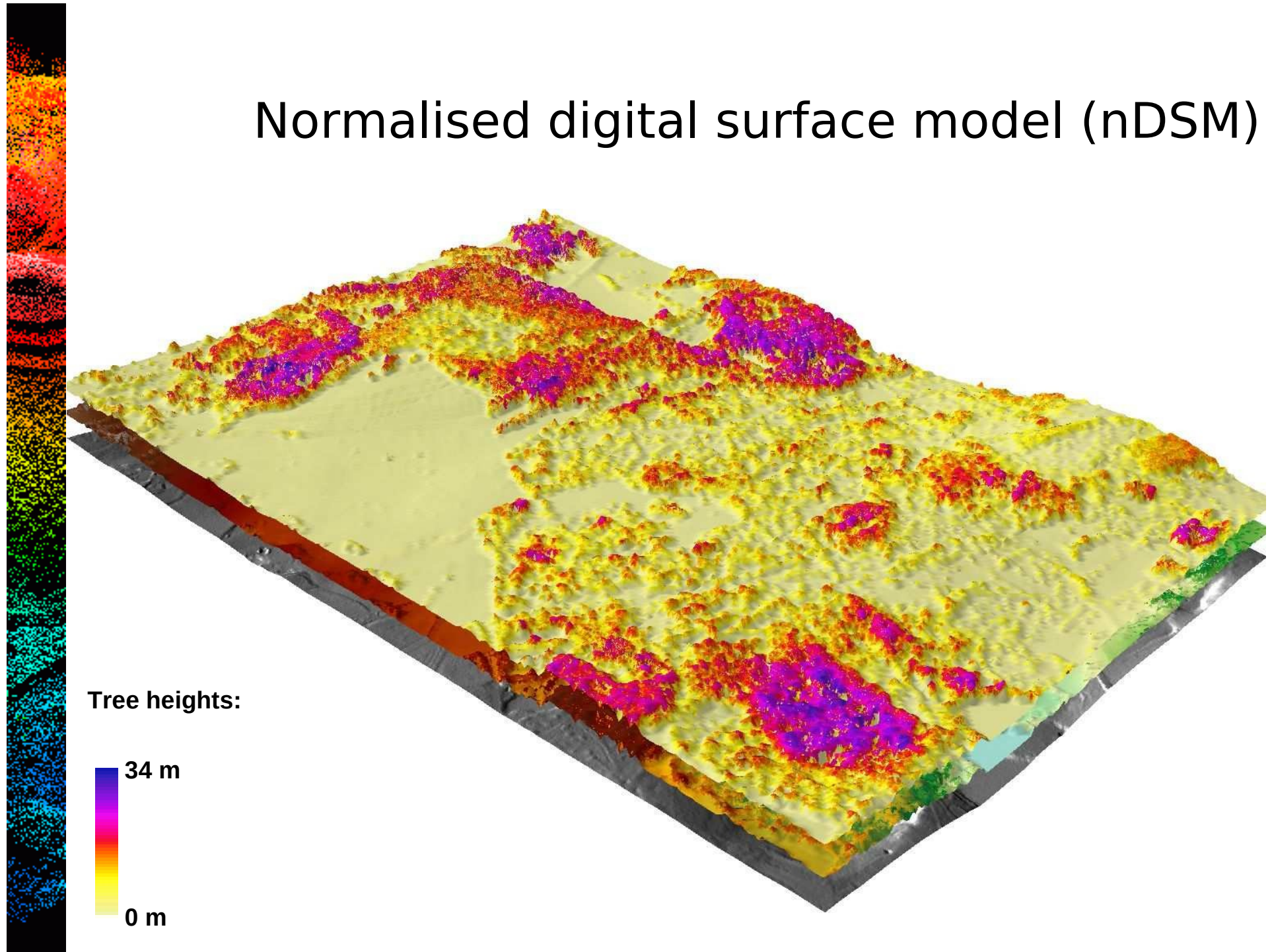
# Digital elevation model (DEM)



# Digital surface model (DSM)



# Normalised digital surface model (nDSM)

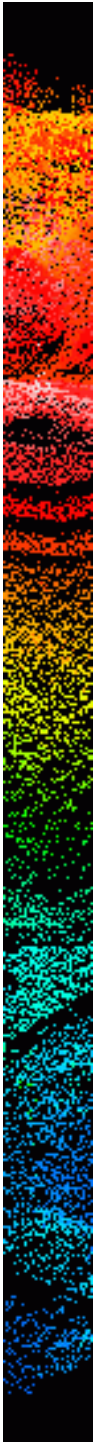




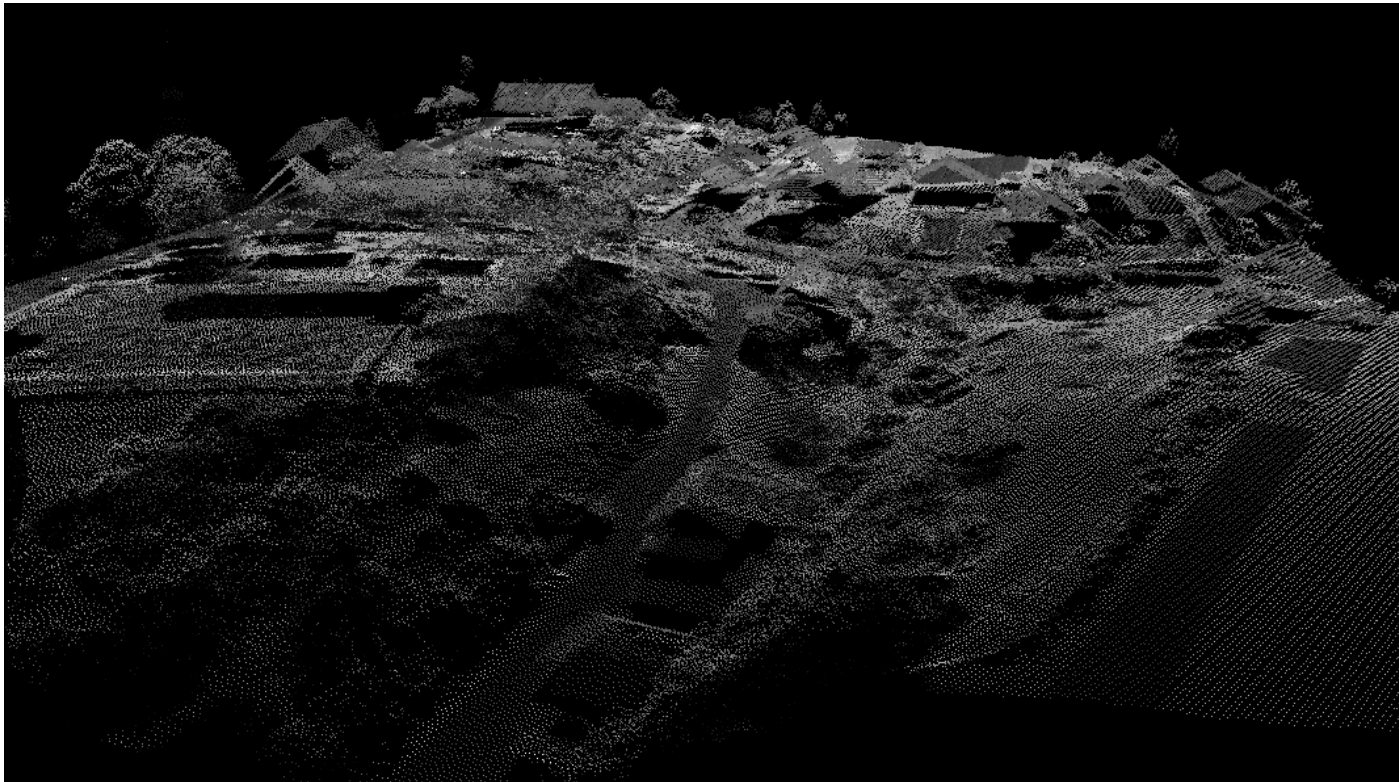
# Land use classification

- Only basic land cover classes were analysed
  - buildings
  - trees
  - roads
  - grass
  - fields
- Lidar data with attributes (intensity, return number) and aerial orthophoto

# Aerial photography (BD0F)

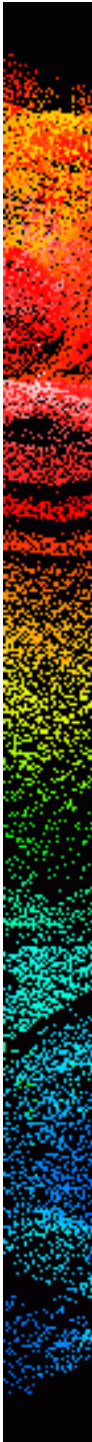


# Lidar intensity



$$I = \frac{\text{energy of received light}}{\text{energy of transmitted light}}$$

# Intensity image

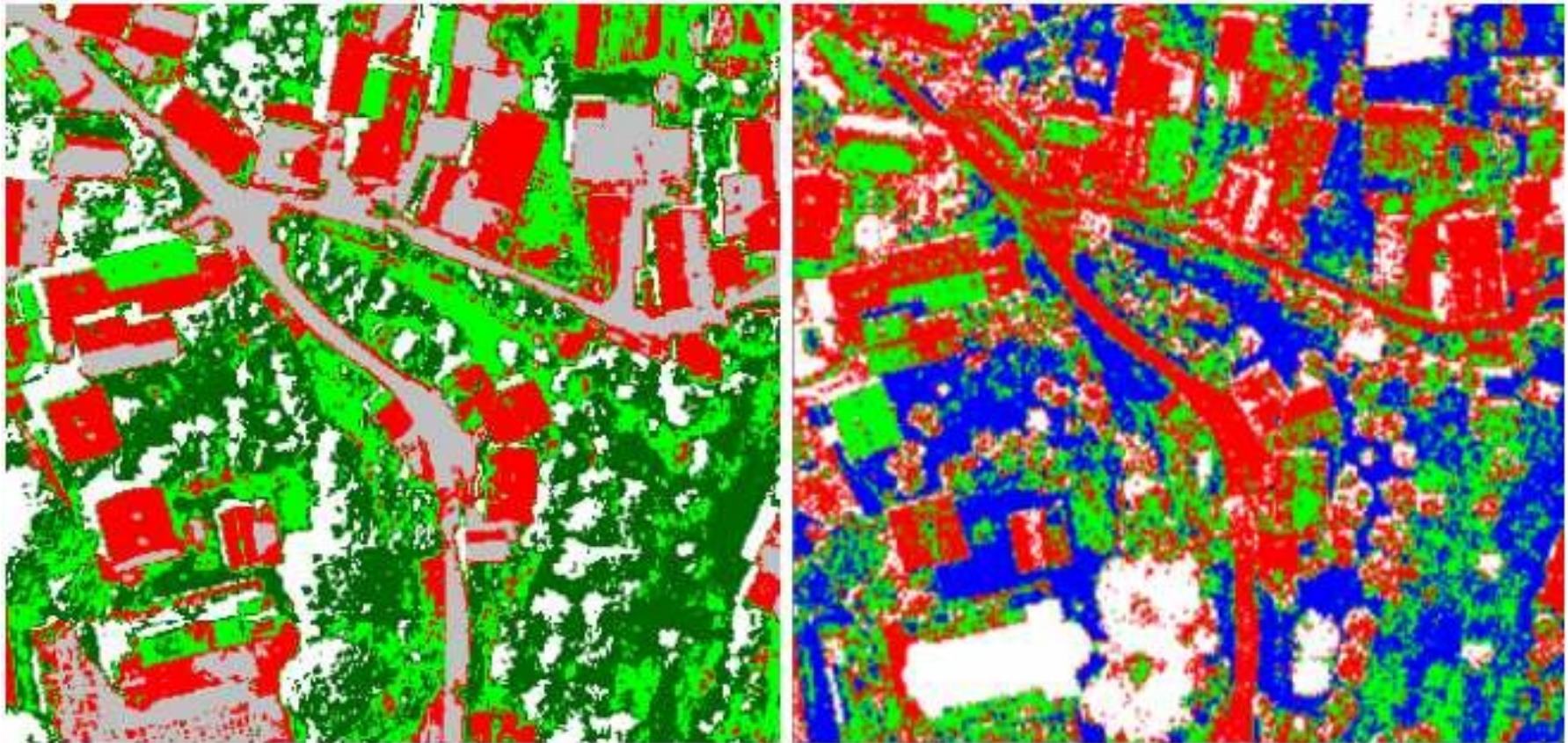




# Classification procedure

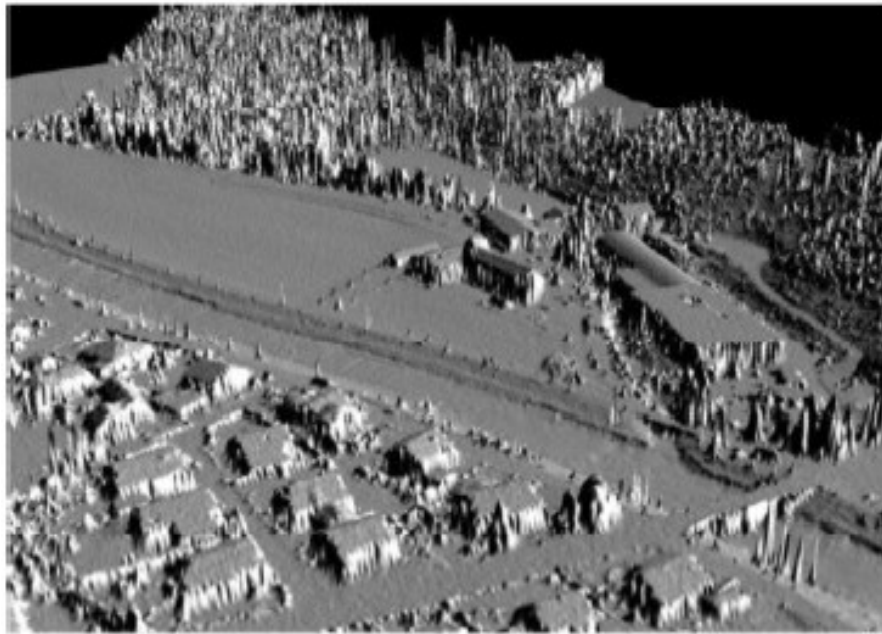
- Classification of intensity and / or colour ae photography (BD OF)
- Use of height levels
- Use of standard deviation
- Classification post-processing and quality control

# Initial classification with laser scanning data

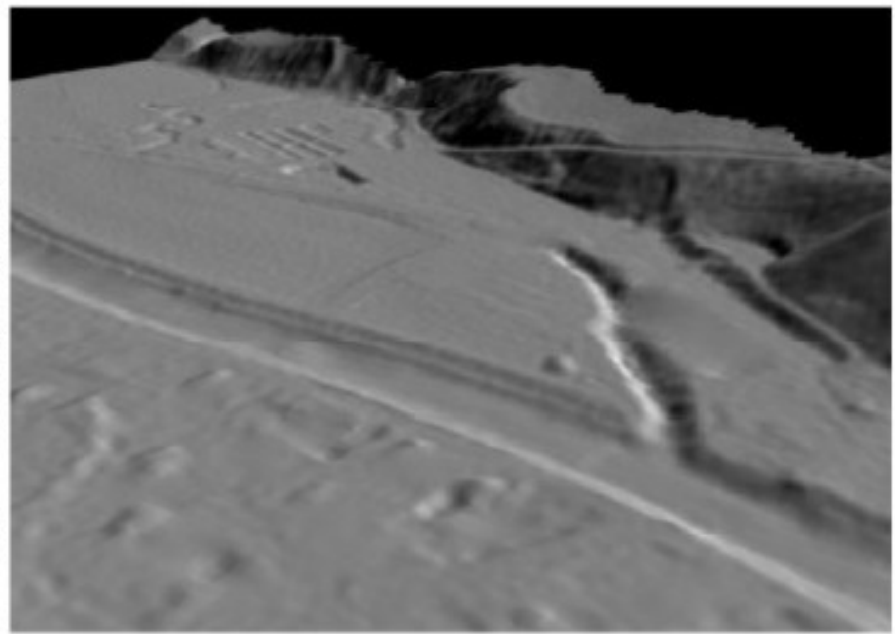


Classification of BDOF (left) and classification of intensity image (right).

# Use of height levels

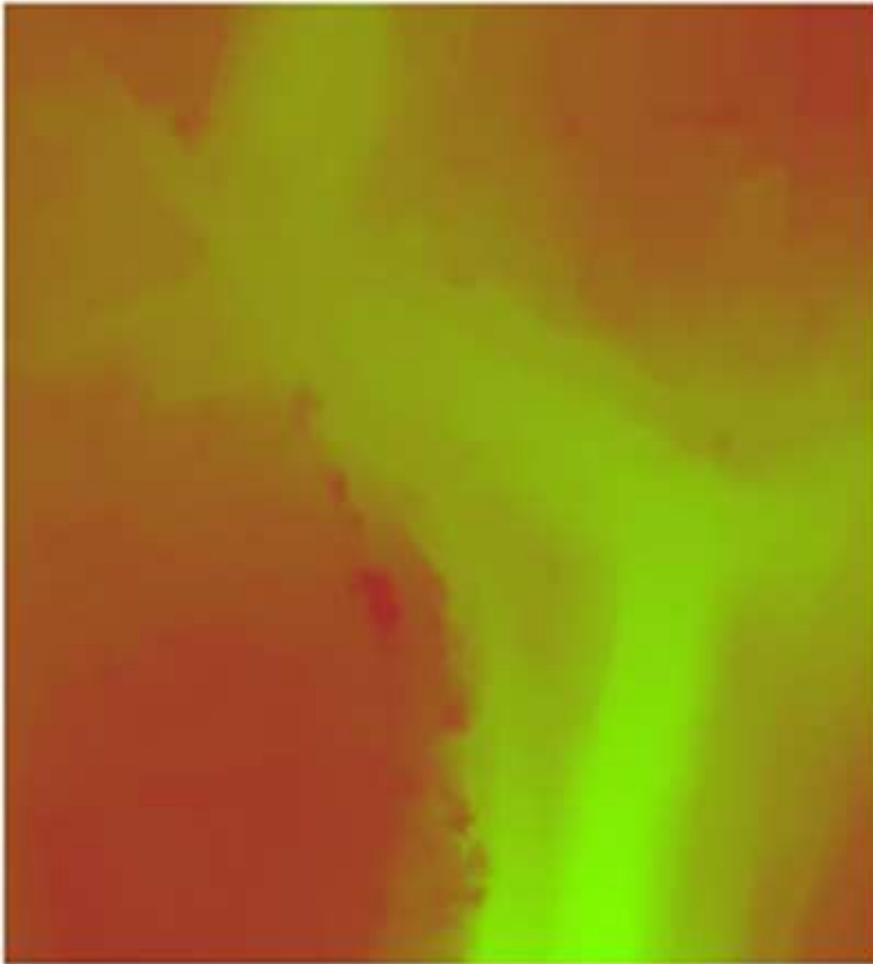


digital surface model (DSM)

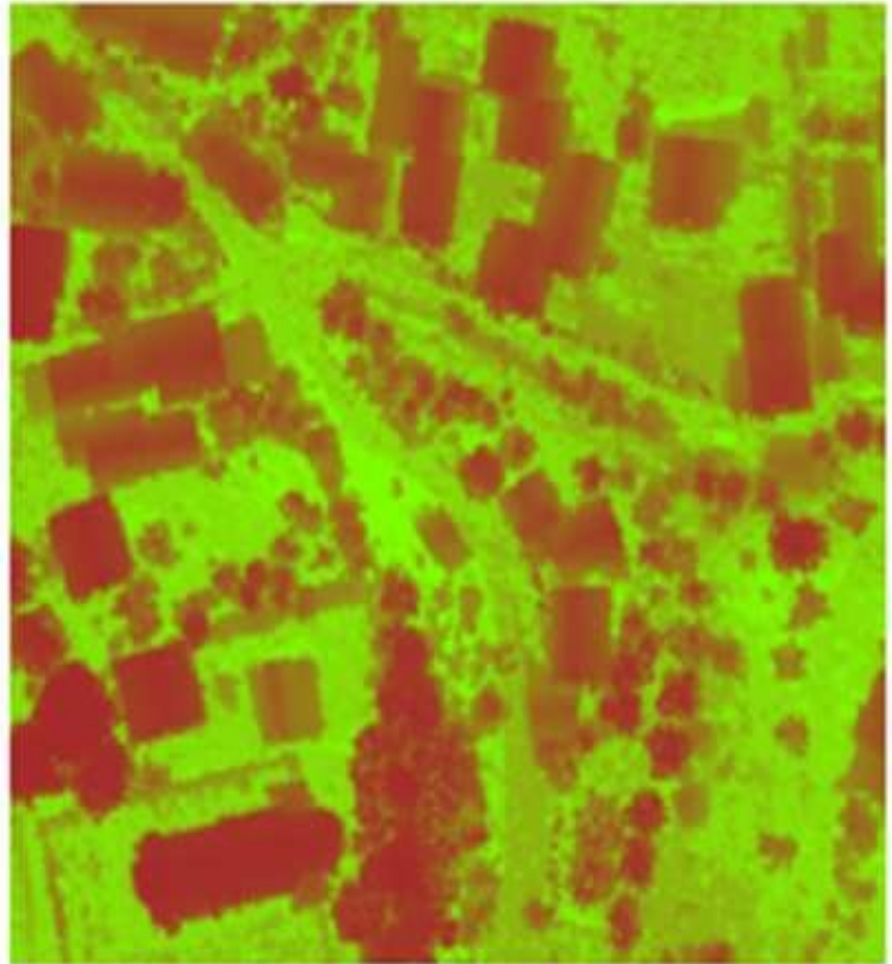


digital elevation model (DEM)

# Use of height levels

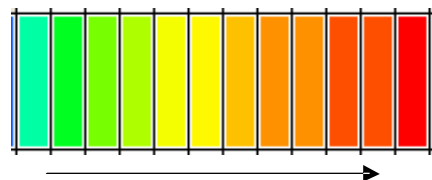
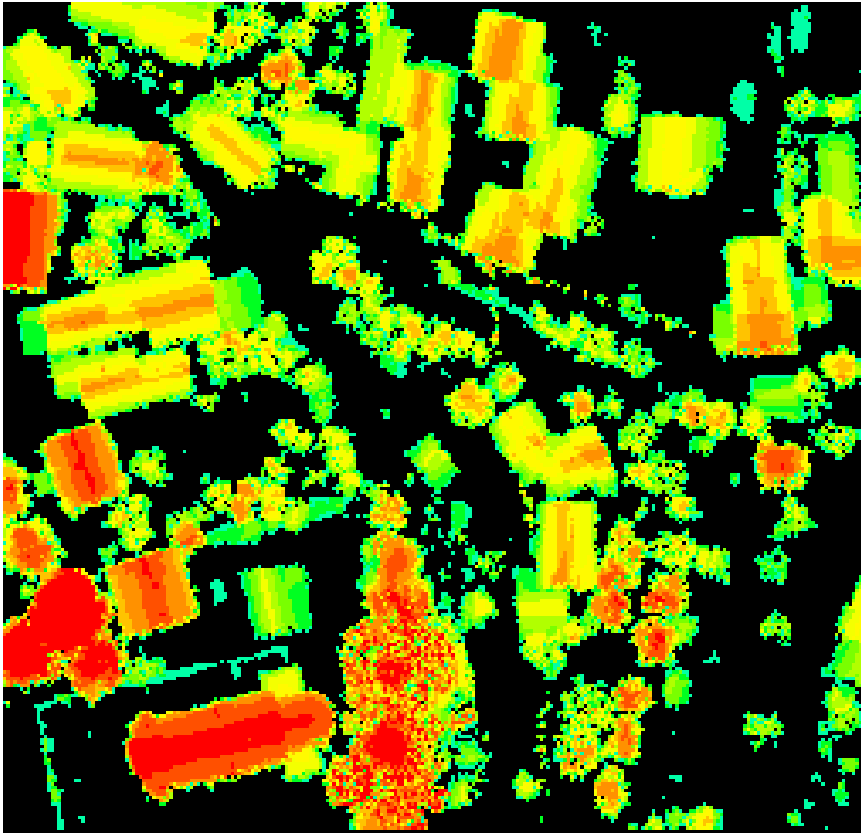


DEM



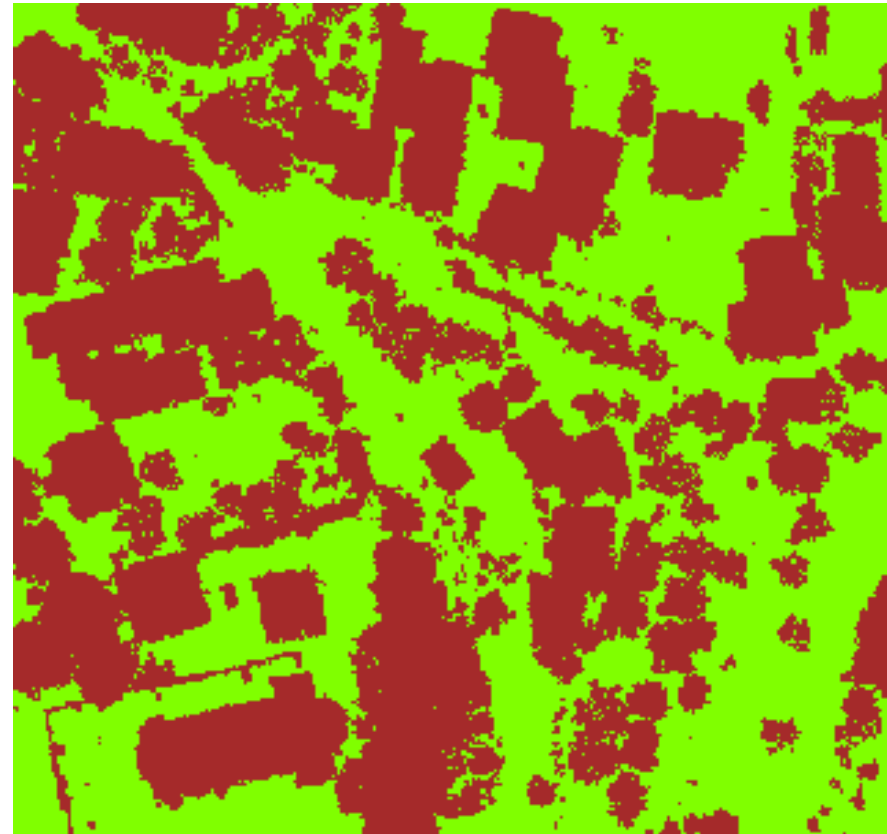
nDSM

# Use of height levels



0 m

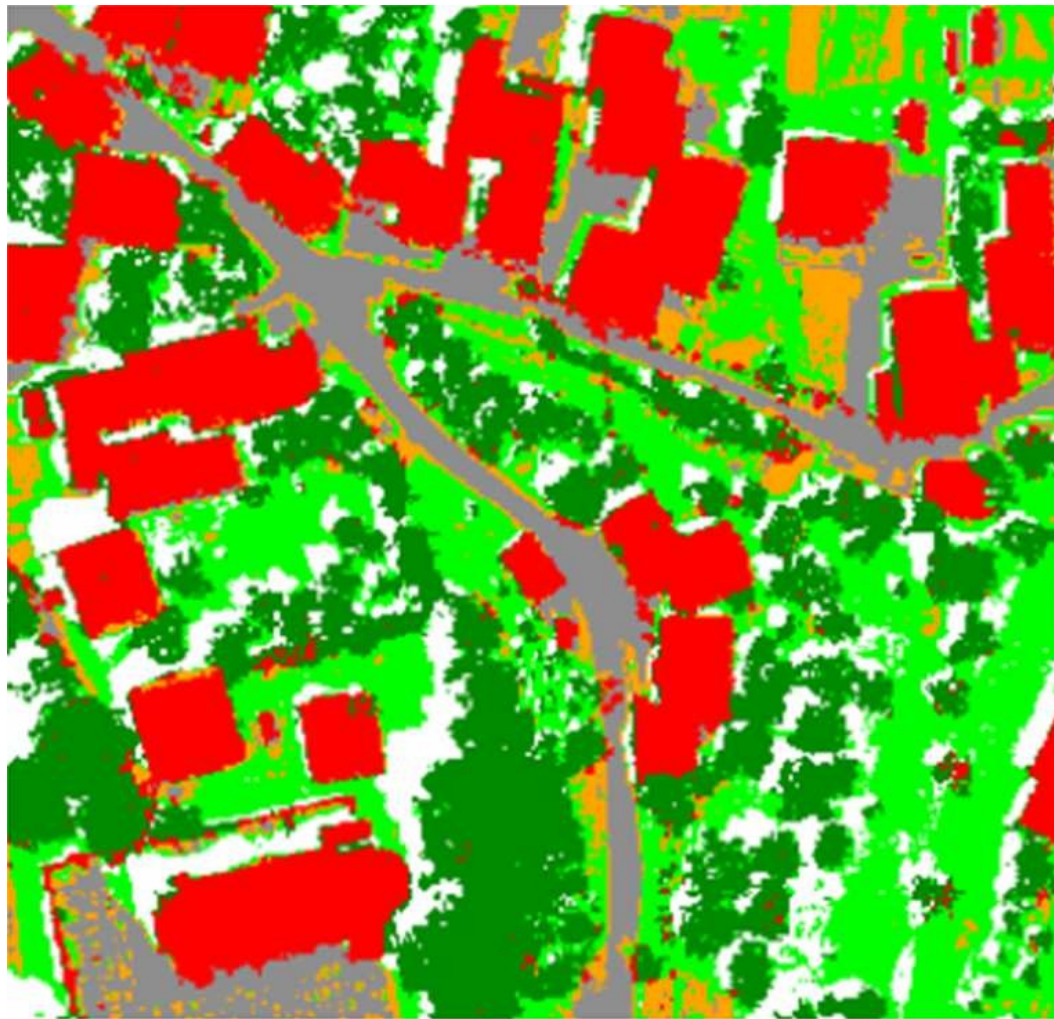
20 m



$h < 1 \text{ m}$

$h \geq 1 \text{ m}$

# Use of height level BDOF



■	buildings
■	trees
■	grass
■	roads
■	fields

almost correct separation  
shadows  
noise

Classification of BDOF after heights separation.

# Use of height levels – intensity image



red	buildings
dark green	trees
light green	grass
grey	roads
orange	fields

better classification

very good separation of asphalt  
and grass

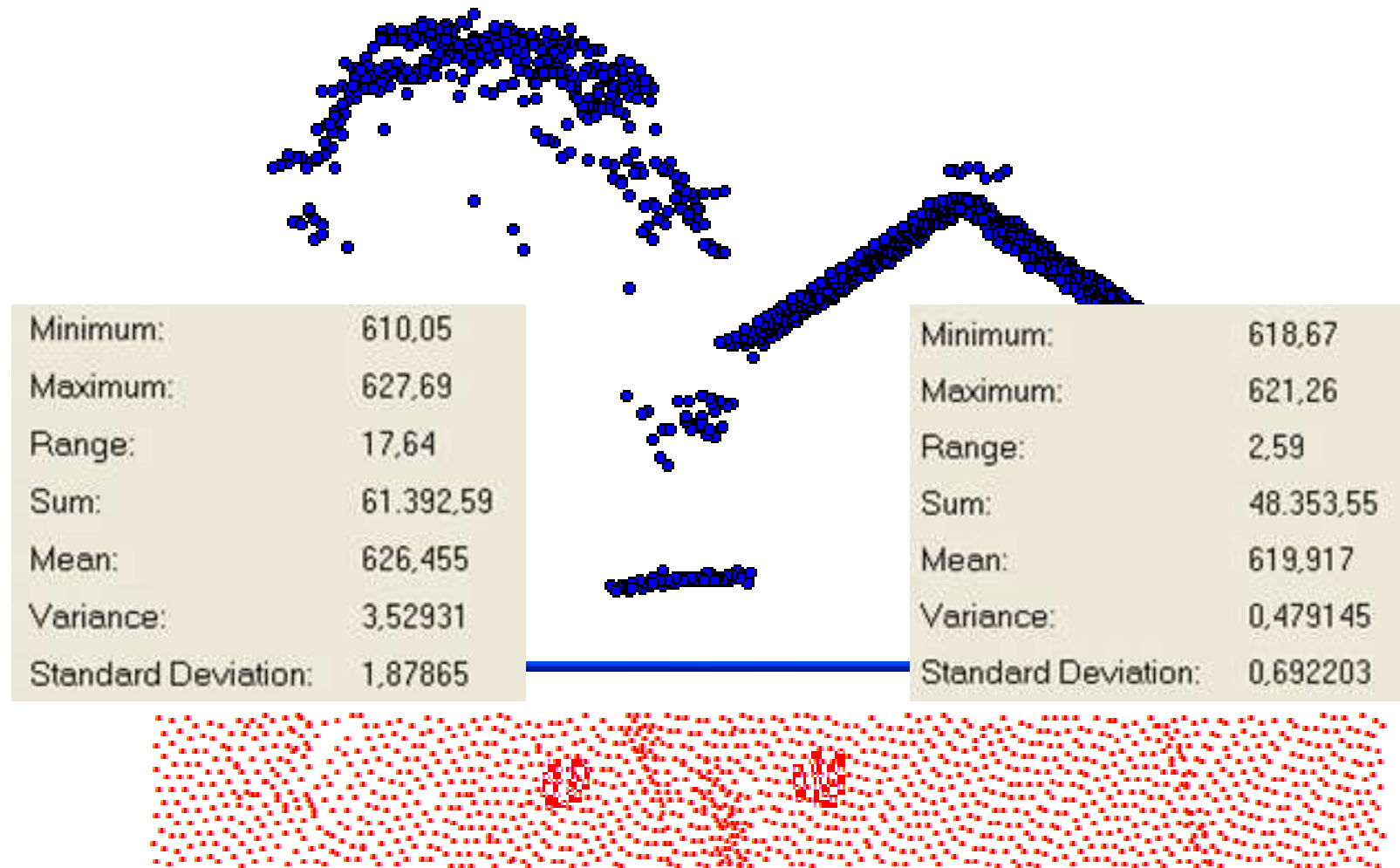
good separation of fields

impossible separation of asphalt  
and trampled grass

impossible separation of trees  
and buildings

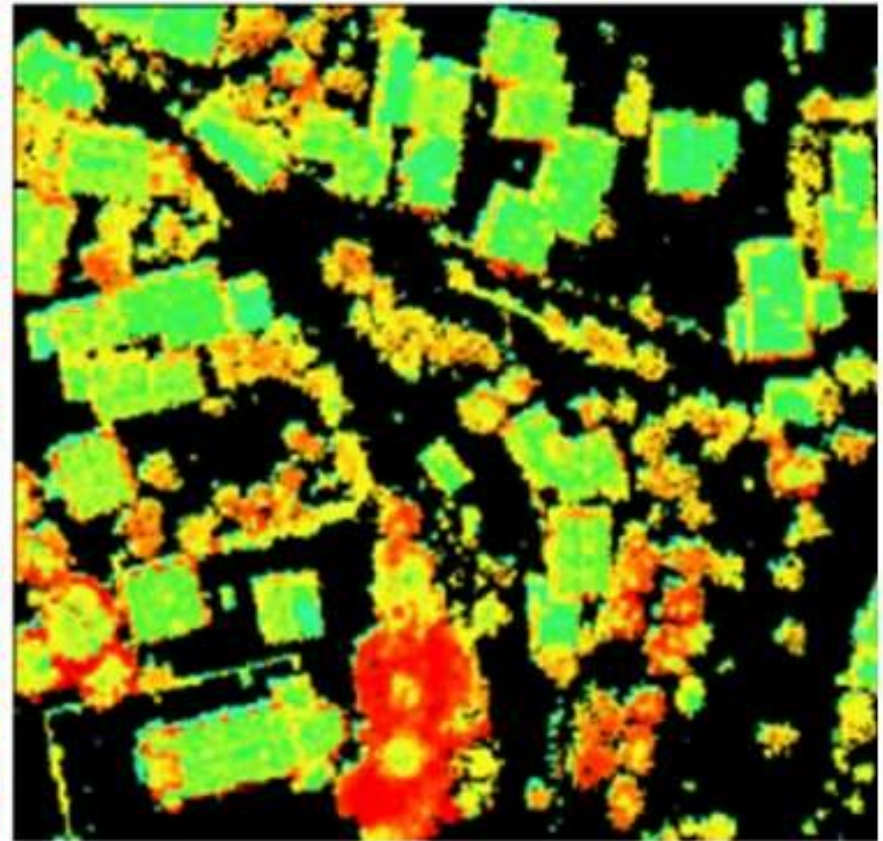
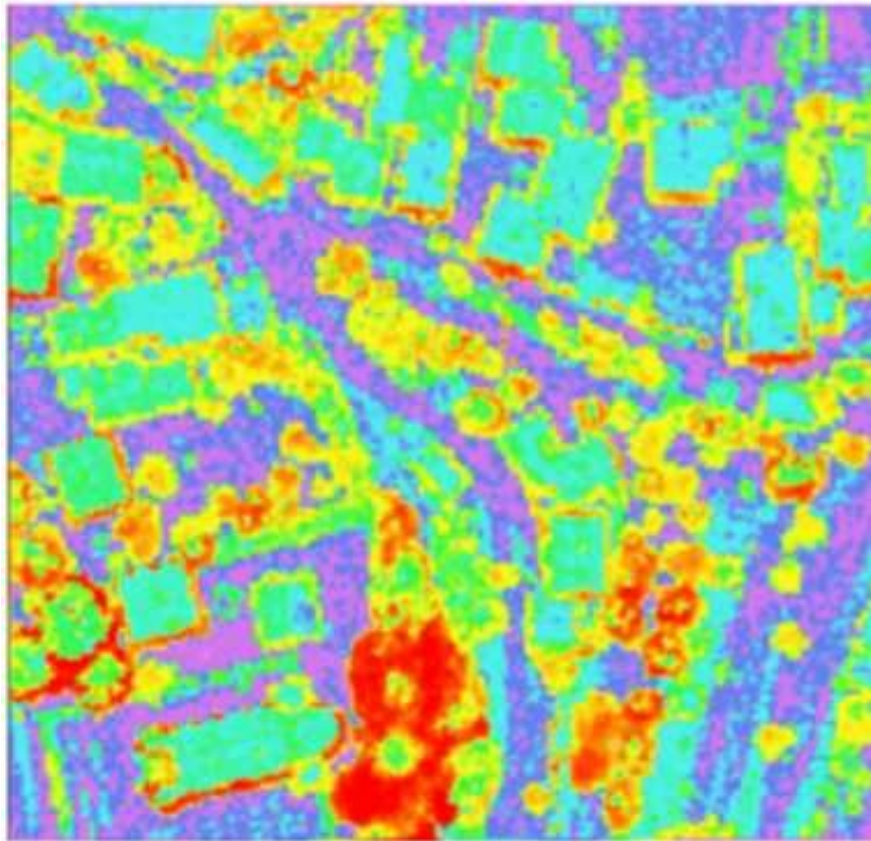
Classification of intensity image after heights separation.

# Use of standard deviation



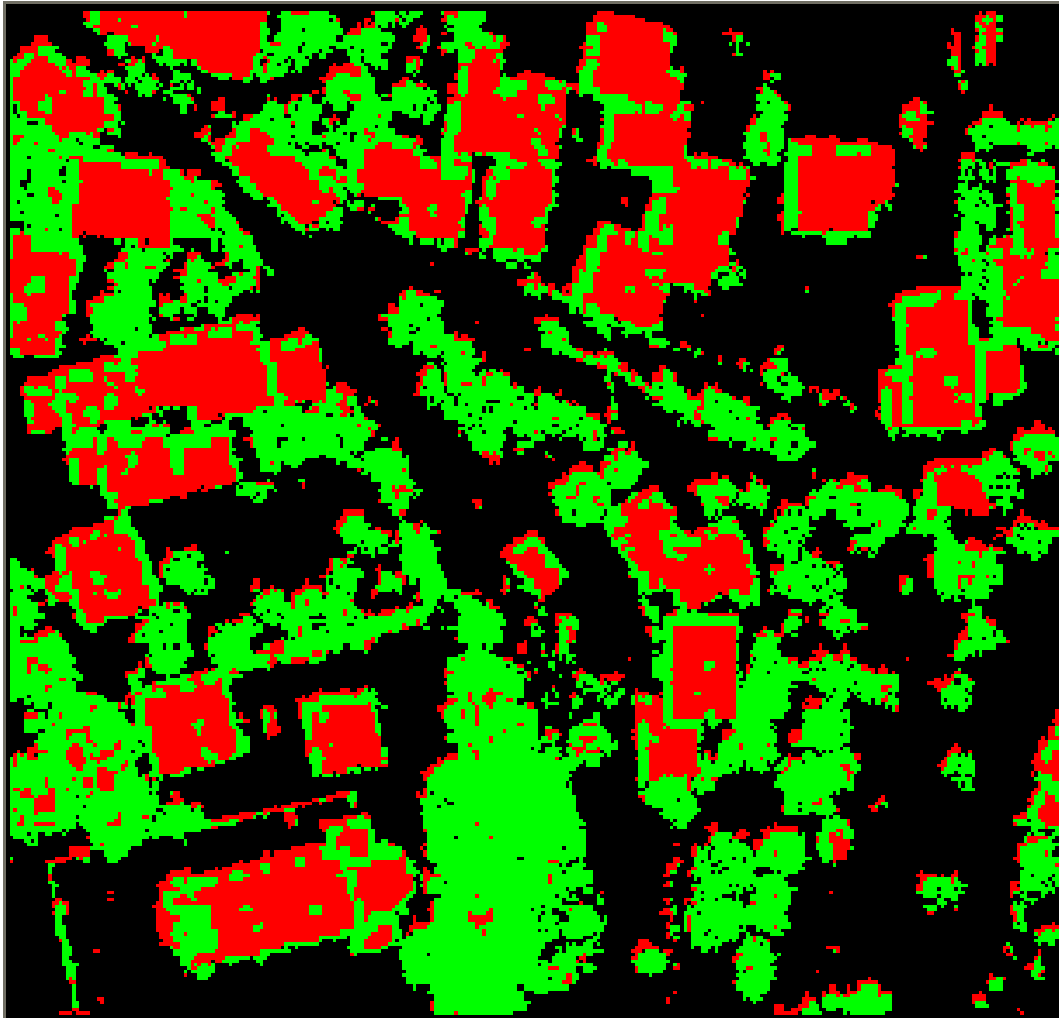
Statistical data of laser points – tree (left) and roof (right)

# Use of standard deviation



Coloured image of all STD values (left), STD values for objects, higher than 1 m (right)

# Use of standard deviation



classification much better  
almost all buildings correctly  
separated  
irregular building edges  
deformed shape of objects  
noise

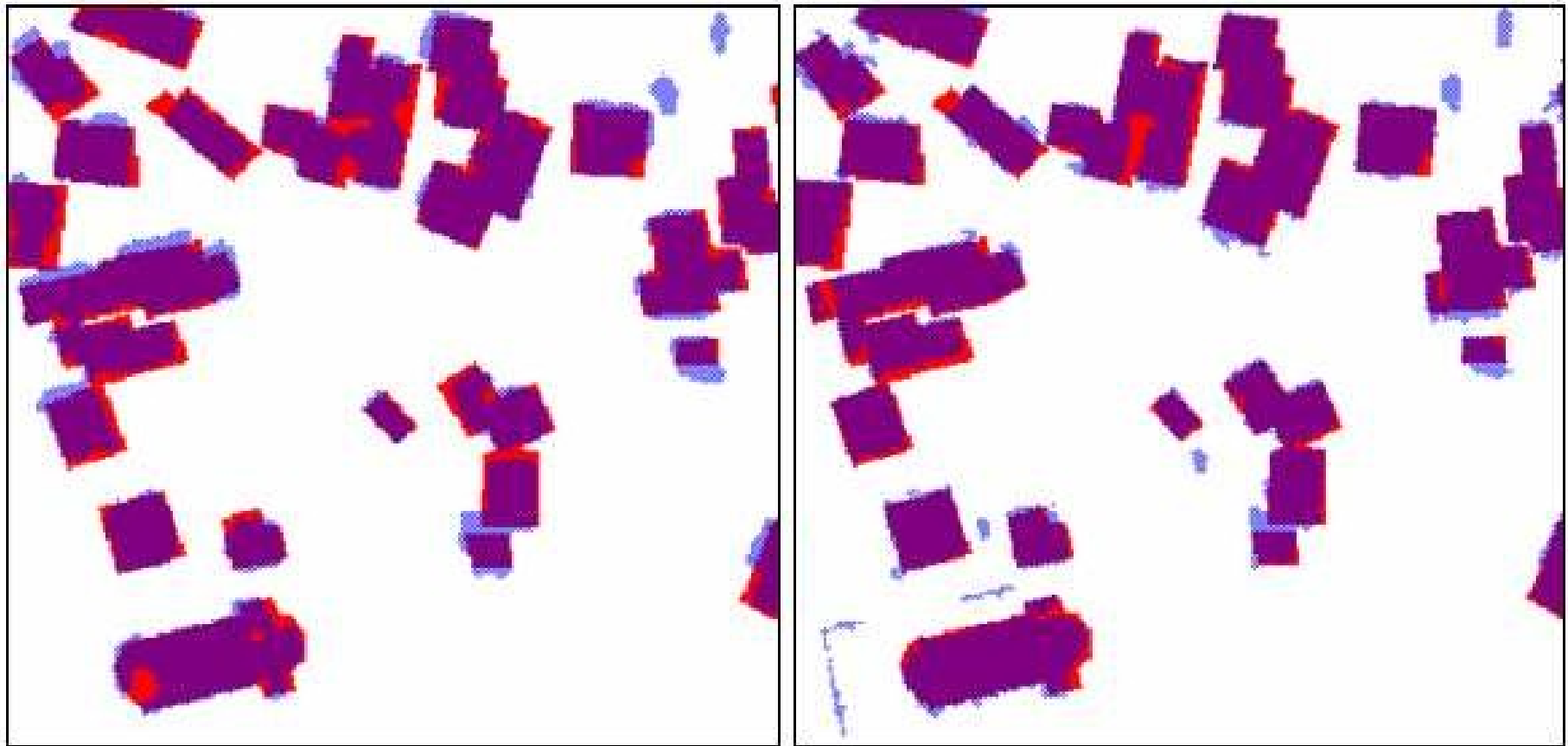
Separation of trees (green) and buildings (red), based on STD values.

# Quality of building separation

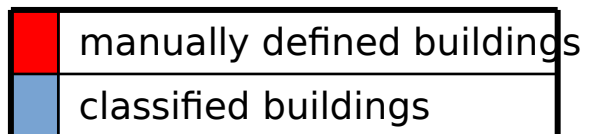


Manually vectorised buildings in vector (left) and raster (right) form.

# Quality of building separation



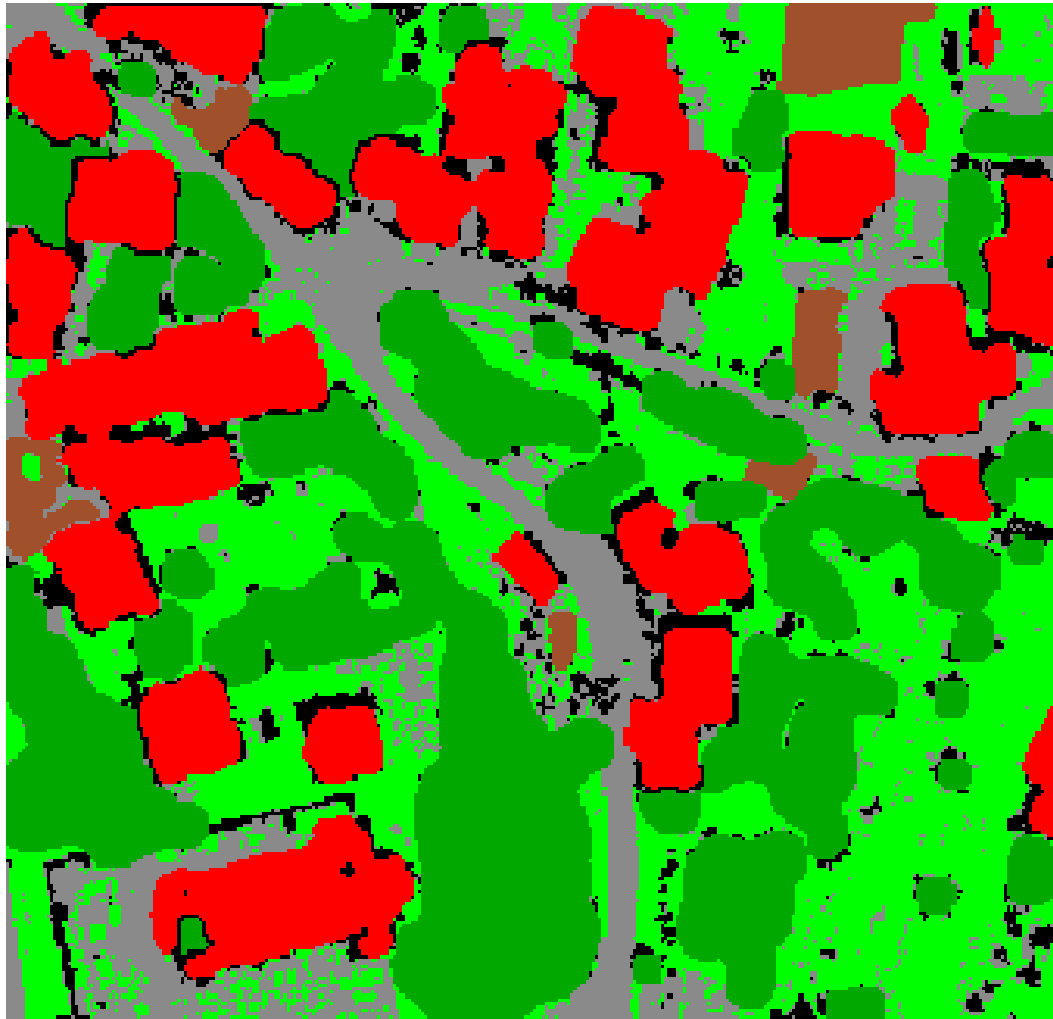
Buildings from lidar data (left) and BDOF (right) compared to manual digitalization



$$k_{\text{lidar}} = 0,94$$

$$k_{\text{BDOF}} = 0,95$$

# Fusion of classified objects



Fusion of trees and buildings with background.

each class is  
determined  
separately



fusion (holes and  
overcovering)

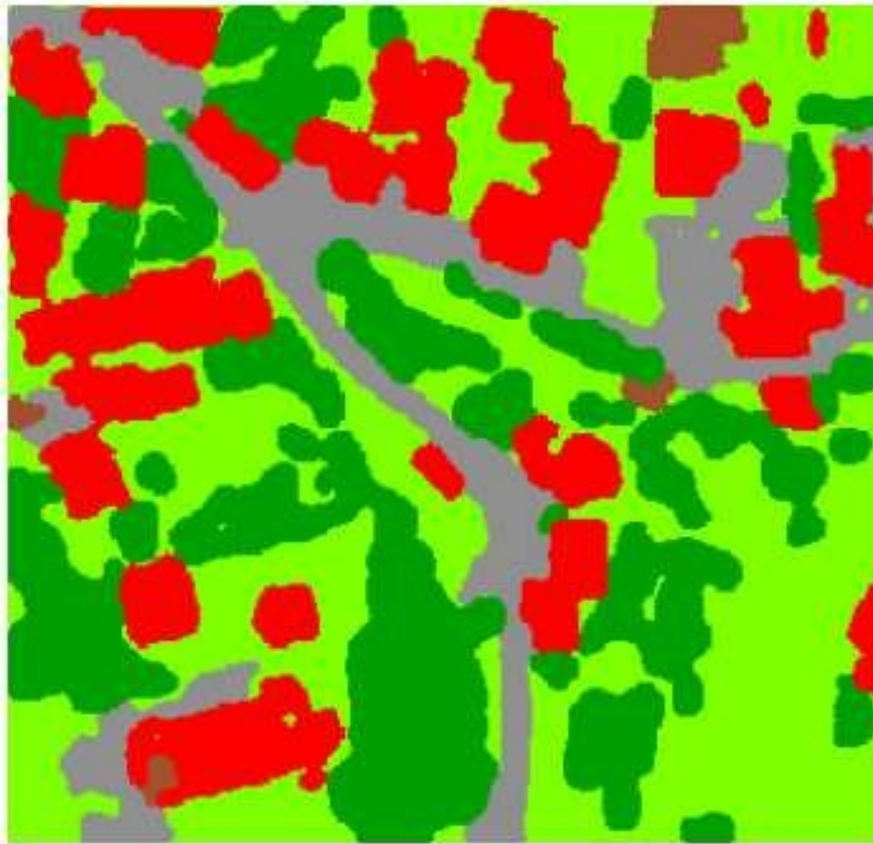


define order of layers:  
buildings, trees,  
fields, roads and grass

# Final classification

lidar data

BDOF



areas well defined






slightly deformed shape of objects



good shape of objects

areas well defined

presence of shadows

	buildings
	trees
	grass
	asphalt
	fields



# Conclusions

- Land cover map has been produced from lidar data (with attributes) and aerial photography
- Height information (3D data profile) is essential
- Intensity is mostly overlooked – it can complement optical data



# Conclusions

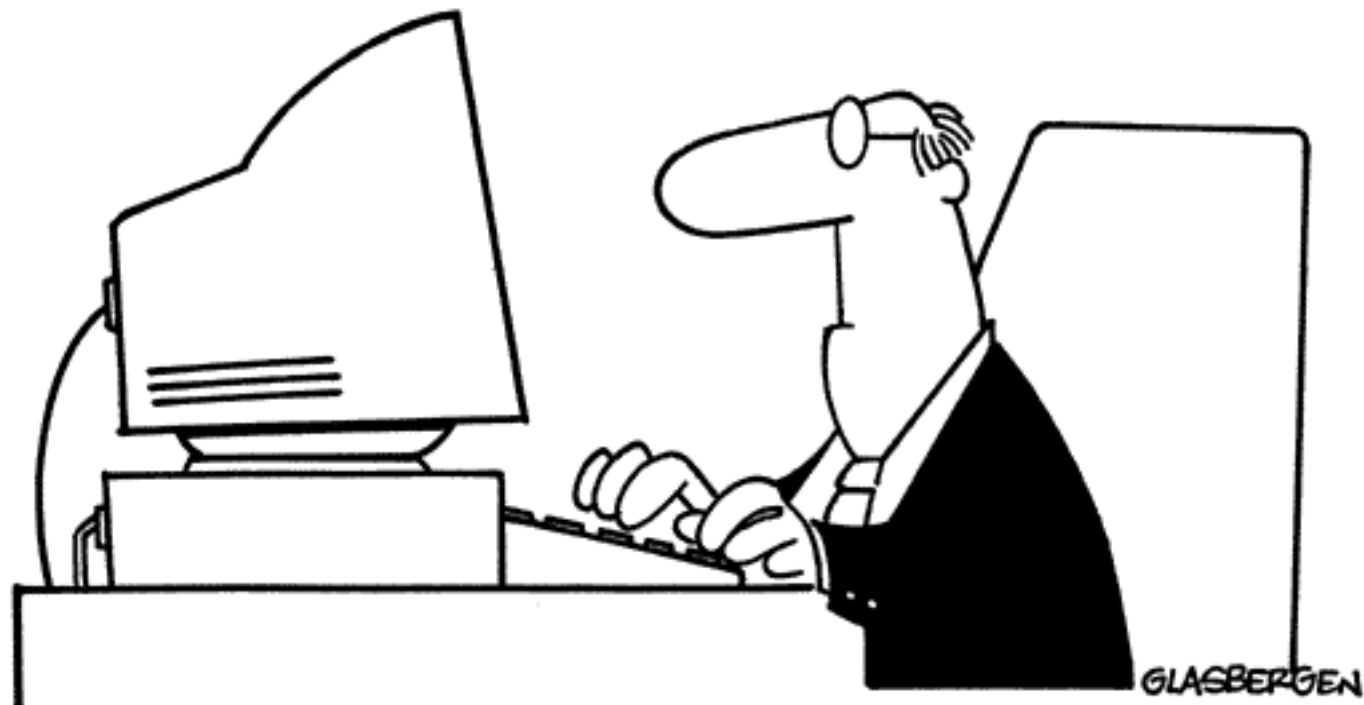
- Advantages

- Well defined procedure with high level of automatization
- Useful for local studies
- Good attribute and positional accuracy
- No need for orthorectification
- Prompt and cost-friendly method of layer acquisition
- Possibility of modification for specific studies

- Disadvantages

- Useful merely for the study on a local level
- Huge quantity of point data requires powerful hardware and software technology

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**“MEMO: It has come to my attention that every time we solve one problem, we create two more. From now on, all problem solving is forbidden.”**