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# GRASS GIS for the distinction of vegetation from buildings using LiDAR altimetric data

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Politecnico di Milano

March 5, 2008



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- 1 Airborne Laser Scanning (ALS) is given by the combination of:
  - Sensor
  - GPS which provides the location of the sensor
  - INS which provides its orientation parameters: pitch, roll and yaw



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- 1 Airborne Laser Scanning (ALS) is given by the combination of:
  - Sensor
  - GPS which provides the location of the sensor
  - INS which provides its orientation parameters: pitch, roll and yaw
- 2 The relative position of the reflecting ground spot with respect to the laser scanner emission point is determined by:
  - The **time** each pulse takes to reach the ground and return back
  - The **angle** from the nadir at which it has been emitted



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  - Sensor
  - GPS which provides the location of the sensor
  - INS which provides its orientation parameters: pitch, roll and yaw
- 2 The relative position of the reflecting ground spot with respect to the laser scanner emission point is determined by:
  - The time each pulse takes to reach the ground and return back
  - The angle from the nadir at which it has been emitted
- 3 The laser data are then combined with the sensor location and orientation to give the **coordinates X, Y, Z (WGS84)** of the laser footprint on the terrain surface.



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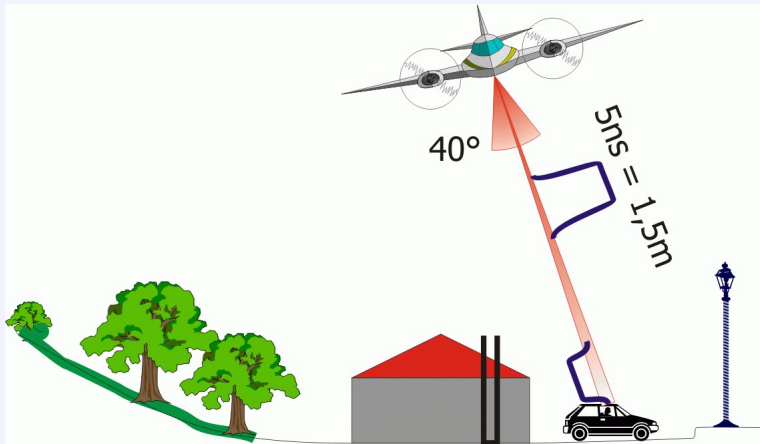
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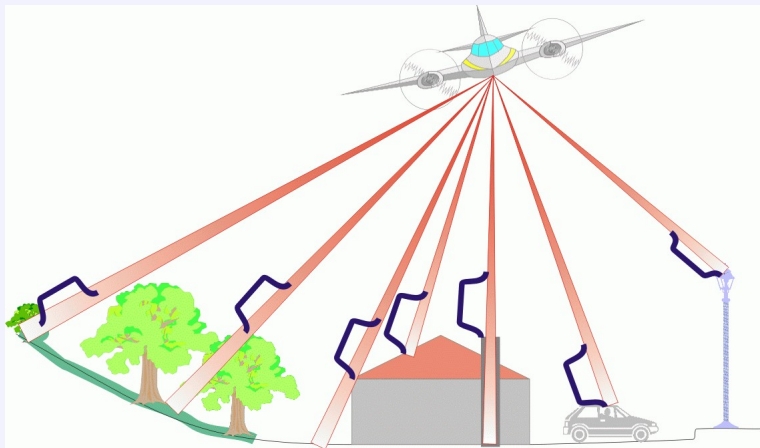
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- 1 High **accurate measurements** in both altimetric and planimetric components
- 2 Laser pulses are emitted with high repetition rates per second, thus **high resolution** can be obtained.
- 3 **Monoscopy** and **almost-nadirality** permit to reach the ground or the studied object surface even in highly vegetated zones





# First and Last pulses

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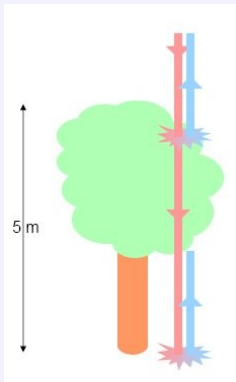
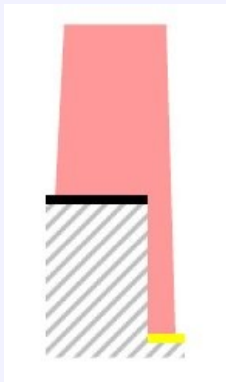
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- 1 Due to spot size, some pulse may be partially reflected by object at different heights and partially by the terrain.
- 2 The sensor collects at least two (up to several) returns for a single pulse emitted.





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- 1 A considerable difference between first and last pulse can be a clue for the presence of an object with different heights (vegetation or edges of objects, such as buildings, cars, transmission lines, etc.)
- 2 No chance exists to directly recognize whether the reflecting ray belongs to a point on the **bare earth** or to a point on an **object**
- 3 The data recorded as last pulse (the last return of a single pulse) has the greatest probability to detect the ground



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- 1 A point cloud  $V = \{v = (x, a) \mid x \in \mathbb{R}^3, a \in \mathbb{N}\}$ , treated as a set of attributed points in a three-dimensional space, where bare earth labeled points take 0 values and 1 otherwise, is **filtered** when points labeled as 1 are removed.
- 2 That is, **filtering** is the automatic procedure of differencing bare earth from objects in ALS point clouds



# Motivation of filters

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- 1 ALS point clouds represent the surveyed surface. Digital Surface Model or **DSM**
  - Hydrology
  - Topography
  - Cityscapes
  - Coastal engineering
  - Volume computations
  - Power lines
- 2 Filtering allows to extract attached (buildings and vegetation) and detached objects (bridges, highpasses,...). Digital Terrain Models or **DTM**
  - Hydrology
  - City modelling
  - Forestry



# Geographic Resources Analysis Support System



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- 1 Known as **GRASS**, it is a GIS software for the geospatial data management and analysis.
- 2 Since is an open source software with lots of built-in libraries, it is possible to implement embedded analysis algorithms.
- 3 GRASS 6 vector architecture allows and requires topology (problem to deal with)
- 4 It is written in C/C++ that allows to implement heavy computational algorithms
- 5 Portable: Version for GNU/Linux, MS-Windows, Mac-OSX, SUN, etc, thus anyone can use it.
- 6 More information in: <http://grass.osgeo.org>



# Commands in GRASS GIS 6

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## 1 LiDAR filtering tools within GRASS GIS 6:

- v.outlier
- v.lidar.edgedetection
- v.lidar.growing
- v.lidar.correction
- v.surf.bspline



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  - v.lidar.edgedetection
  - v.lidar.growing
  - v.lidar.correction
  - v.surf.bspline
- 2 Interpolation command **v.surf.bspline**:
  - Cross validation algorithm (*leave one out*)



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  - v.lidar.edgedetection
  - v.lidar.growing
  - v.lidar.correction
  - v.surf.bspline
- 2 Interpolation command v.surf.bspline:
  - Cross validation algorithm (*leave one out*)
- 3 New vegetation filter:
  - v.lidar.vegetation





# Vegetation filter motivations

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- 1 Detecting vegetation zones in ALS point clouds is an important task for **hydrology**, **city modelling** or **forestry studies**
- 2 This filters have been thought to distinguish amongst bare earth, **vegetation** and **buildings**.
- 3 We have developed our vegetation classification from the filter algorithm previously described:
  - There already was a structure which could be used beyond its initial scope
  - There would be an algorithm able to filter vegetation in the **open GIS** community
  - Only after the participation in the ISPRS filter test [Sithole and Vosselman(2004)], where it was supposed to differentiate between bare earth and object, it was seen that it might be useful to distinguish amongst different types of objects.



# Requested Digital Elevation Models by Adbpo

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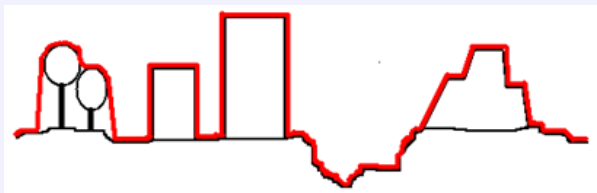
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## 1 Digital Surface Model





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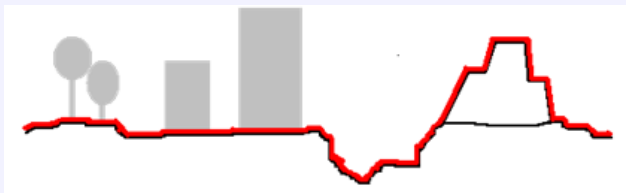
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- 1 Digital Surface Model
- 2 Digital Terrain Model





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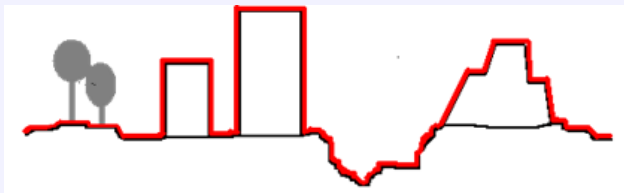
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- 1 Digital Surface Model
- 2 Digital Terrain Model
- 3 Hydrological Digital Model





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- 1 Input data is the previous object-terrain classification.
- 2 A segmentation is done by:
  - Rasterization of the pre-classification
  - Region growing
  - Convex-Hull
- 3 **Dimensions** and ratio between **area** and **perimeter** are used to classify segments:
  - Small or narrow shape objects are not likely to be buildings, thus are vegetation.
  - Single terrain points are always considered as vegetation.
  - Object double pulse outside hull segments are considered as vegetation.
  - Otherwise are buildings.



# Csite3 classification

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- 1 Location: Stuttgart
- 2 188514 points  $\Rightarrow$  0.9 points/m<sup>2</sup>
- 3 Features: Building with eccentric roof, buildings with vegetation between them, data gaps...





# Csite3 classification

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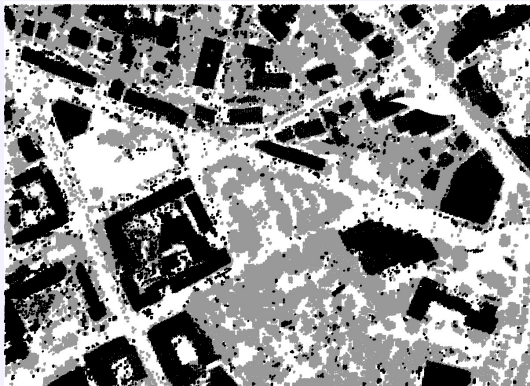
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# Csite3 confusion matrix

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|      |            | CLASSIFICATION |      |            |      | Total  |
|------|------------|----------------|------|------------|------|--------|
|      |            | Buildings      |      | Vegetation |      |        |
|      |            | Points         | %    | Points     | %    |        |
| TRUE | Buildings  | 41505          | 92.2 | 3520       | 7.8  | 45025  |
|      | Vegetation | 10904          | 15.3 | 60442      | 84.3 | 71346  |
|      | Total      | 52409          | -    | 63962      | -    | 116371 |

- 1 Type I error (Reject building points): 7.8%
- 2 Type II error (Accepting vegetation as building points): 15.3%
- 3 Total error: 12.4%





# Csite4 classification

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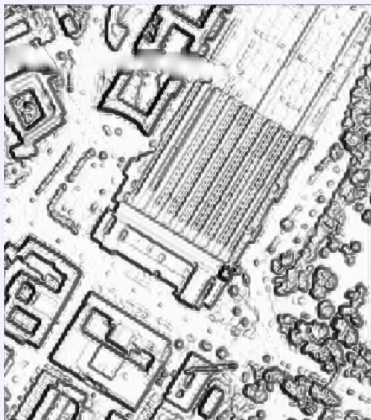
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- 1 Location: Stuttgart Railway Station
- 2 259030 points  $\Rightarrow$  0.9 points/m<sup>2</sup>
- 3 Features: Large buildings, highpasses, data gaps...





# Csite4 classification

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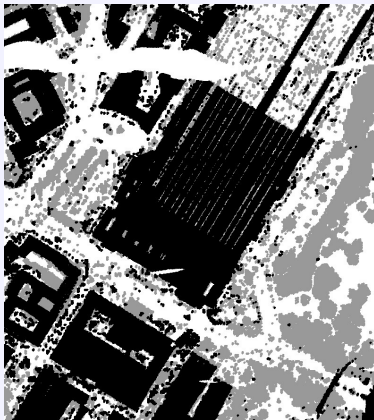
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# Csite4 confusion matrix

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|      |            | CLASSIFICATION |      |            |      | Total  |
|------|------------|----------------|------|------------|------|--------|
|      |            | Buildings      |      | Vegetation |      |        |
|      |            | Points         | %    | Points     | %    |        |
| TRUE | Buildings  | 81479          | 90.1 | 8923       | 9.9  | 90402  |
|      | Vegetation | 8920           | 14.3 | 53334      | 15.7 | 63354  |
|      | Total      | 90399          | -    | 62257      | -    | 152656 |

- 1 Type I: 9.9%
- 2 Type II: 14.3%
- 3 Total error: 11.7%



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- 1 A new filter able to distinguish vegetation from buildings with **only** altimetric LiDAR data has been implemented.
- 2 The filter makes use **morphological** parameters and **differences** in first and last pulses.



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- 1 A new filter able to distinguish vegetation from buildings with only altimetric LiDAR data has been implemented.
- 2 The filter makes use morphological parameters and differences in first and last pulses.
- 3 Vegetation filtering is strongly affected by the pre-classification into terrain and off-terrain points:
  - High **Type I** error due to misclassified building edges.
  - **Type II** error due to elevated terrain zones misclassified as object and then later misclassified as buildings.



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- 1 A new filter able to distinguish vegetation from buildings with only altimetric LiDAR data has been implemented.
- 2 The filter makes use morphological parameters and differences in first and last pulses.
- 3 Vegetation filtering is strongly affected by the pre-classification into terrain and off-terrain points:
  - High Type I error due to misclassified building edges.
  - Type II error due to elevated terrain zones misclassified as object and then later misclassified as buildings.
- 4 Nevertheless, about the 88% of the points are **correctly** classified into vegetation and buildings.
  - Wide vegetation regions are always correctly classified as well as the majority of single trees.
  - Most of the building shapes are well defined.



# Future work

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- 1 Some efforts have to be done in order to reduce final errors caused by the former classification into terrain and off-terrain points.
- 2 More tests have to be carried out in such a way to better understand the filter performances.
- 3 Due to energy different absorption responses in vegetation and buildings, **intensity** LiDAR data should be considered in order to obtain a better classification.



# Final conclusions

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- 1 With the new vegetation filter, able to distinguish vegetation from buildings, the built-in **LiDAR filtering tools** available in GRASS GIS have been improved.
- 2 GRASS GIS has been proved to be a perfect software to develop heavy computational analysis algorithms in.
- 3 With these two filters it has been shown that **GFOSS** is a feasible way to use LiDAR programs without depending on proprietary software.
- 4 The community has helped to improve the software in such a way to obtain a solid and reliable **filter** and **interpolation** command.





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G. Sithole and G Vosselman.

Experimental comparison of filter algorithms for bare-earth extraction from airborne laser scanning point clouds.

*ISPRS Journal of Photogrammetry and Remote Sensing*, 59(Issues 1-2):85–101, 2004.



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