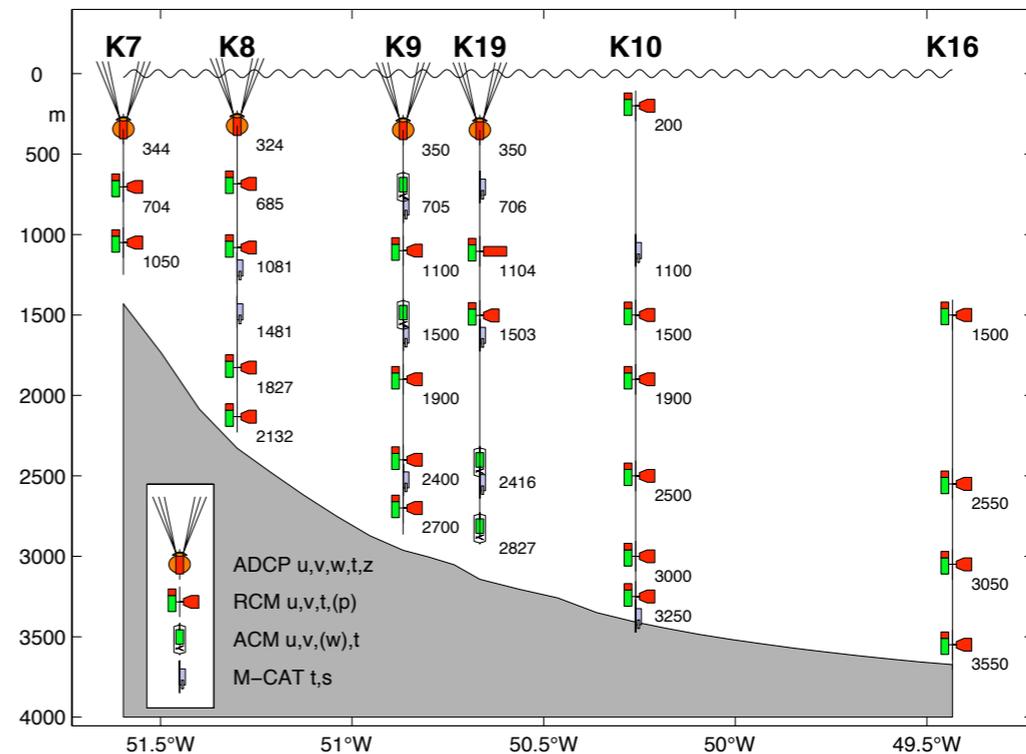
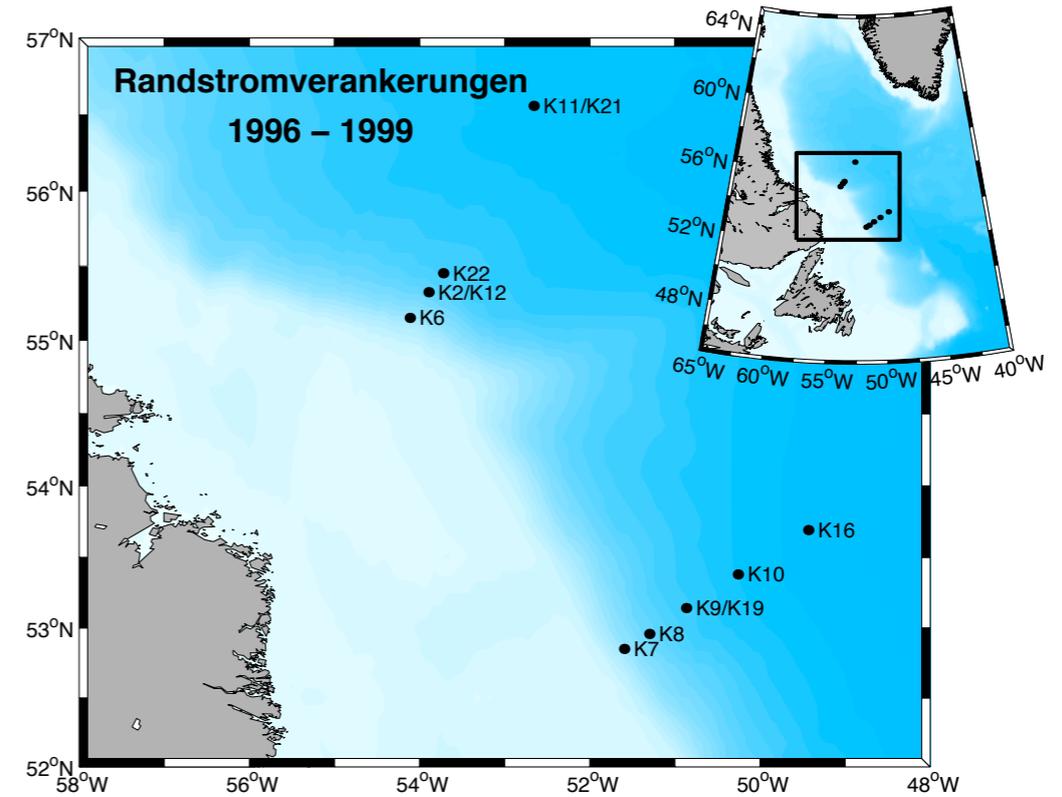
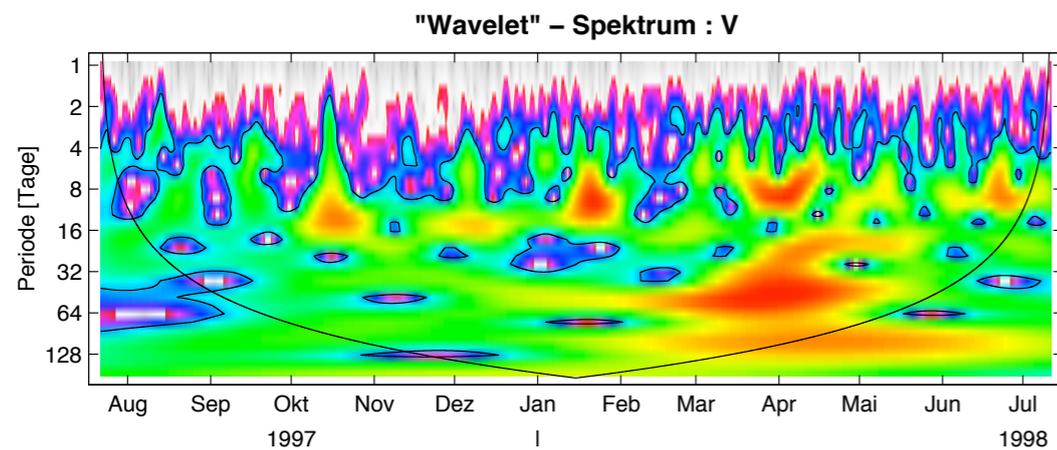
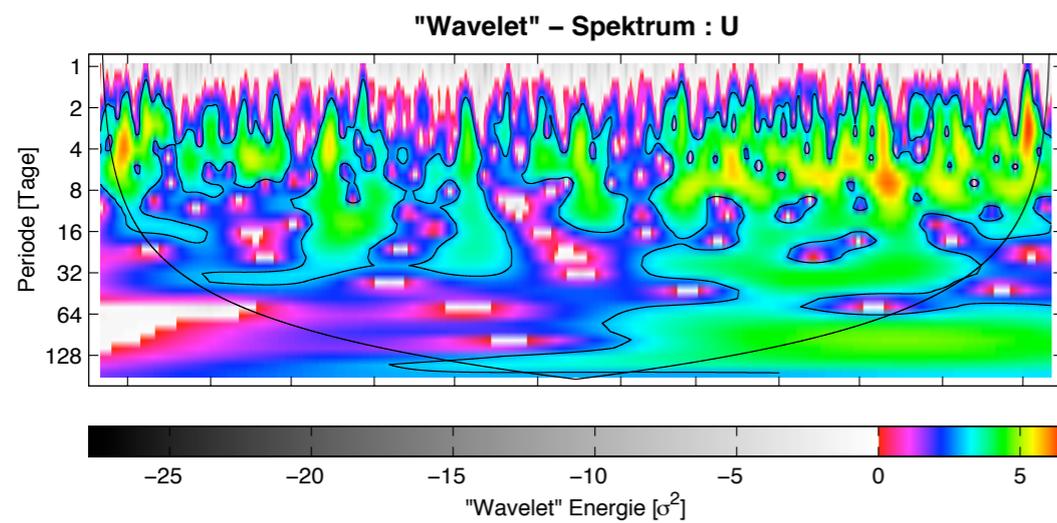
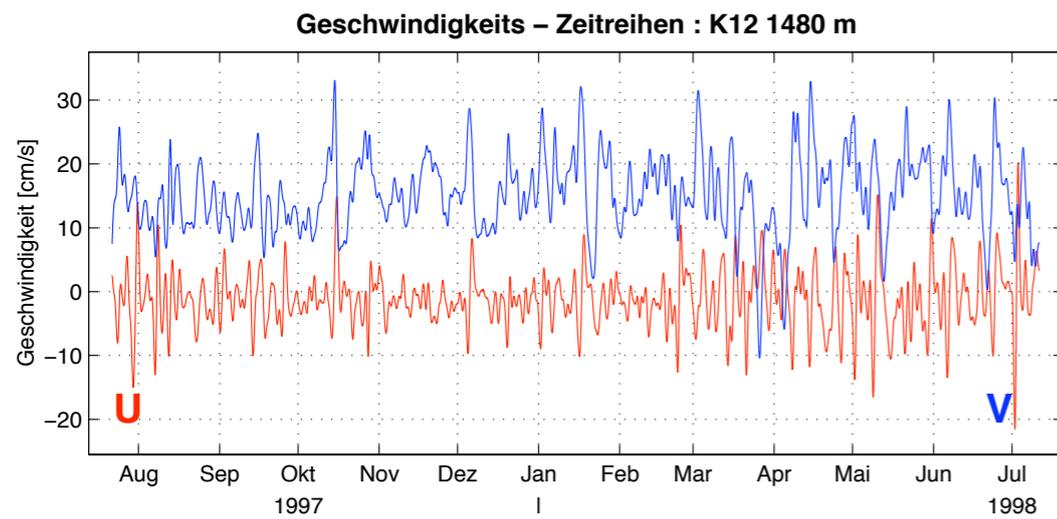

Derivation of structural vegetation information from laser scanning data

Felix Morsdorf

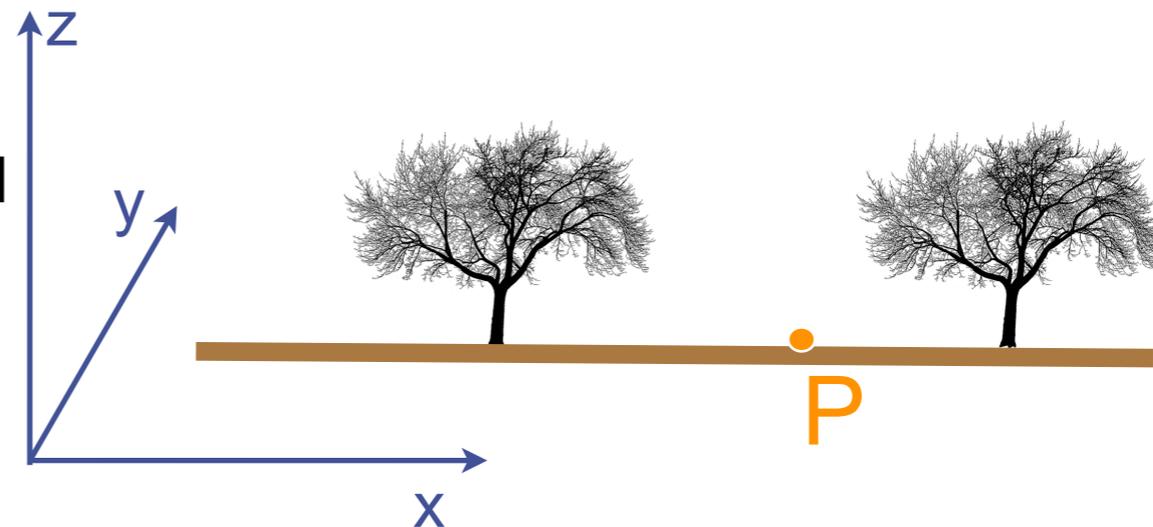


Background in Oceanography ...



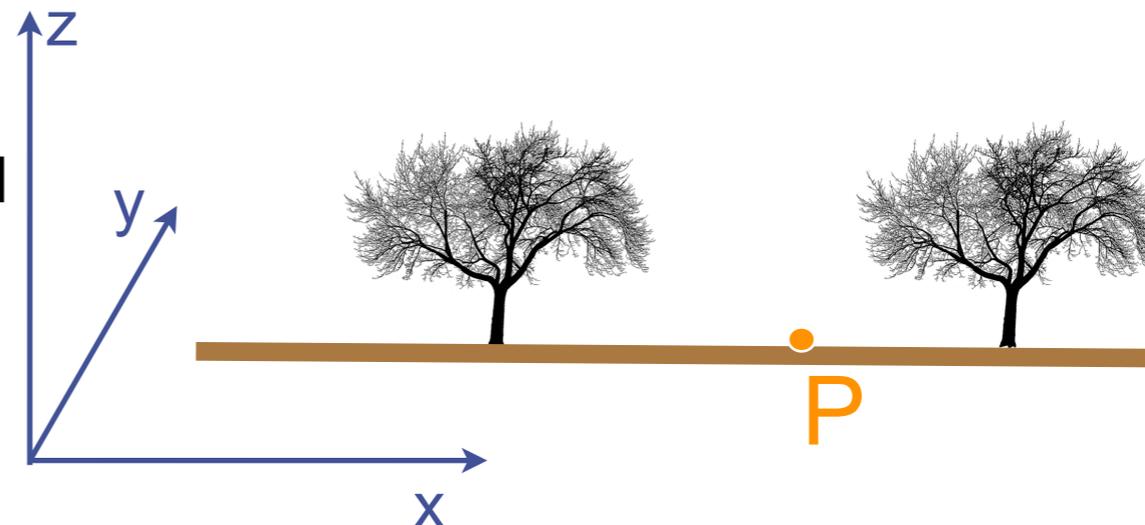
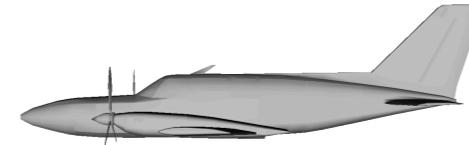
Measurement principle - LIDAR

- It is the aim to estimate a 3d coordinate in a known reference system
-
- Position vector \vec{f}
 - ▶ measured by GPS/INS
- Range vector \vec{d}
 - ▶ time of flight measurement and calibration of sensor
- Location vector
 - ▶ vectorial sum of position and range vectors \vec{p}



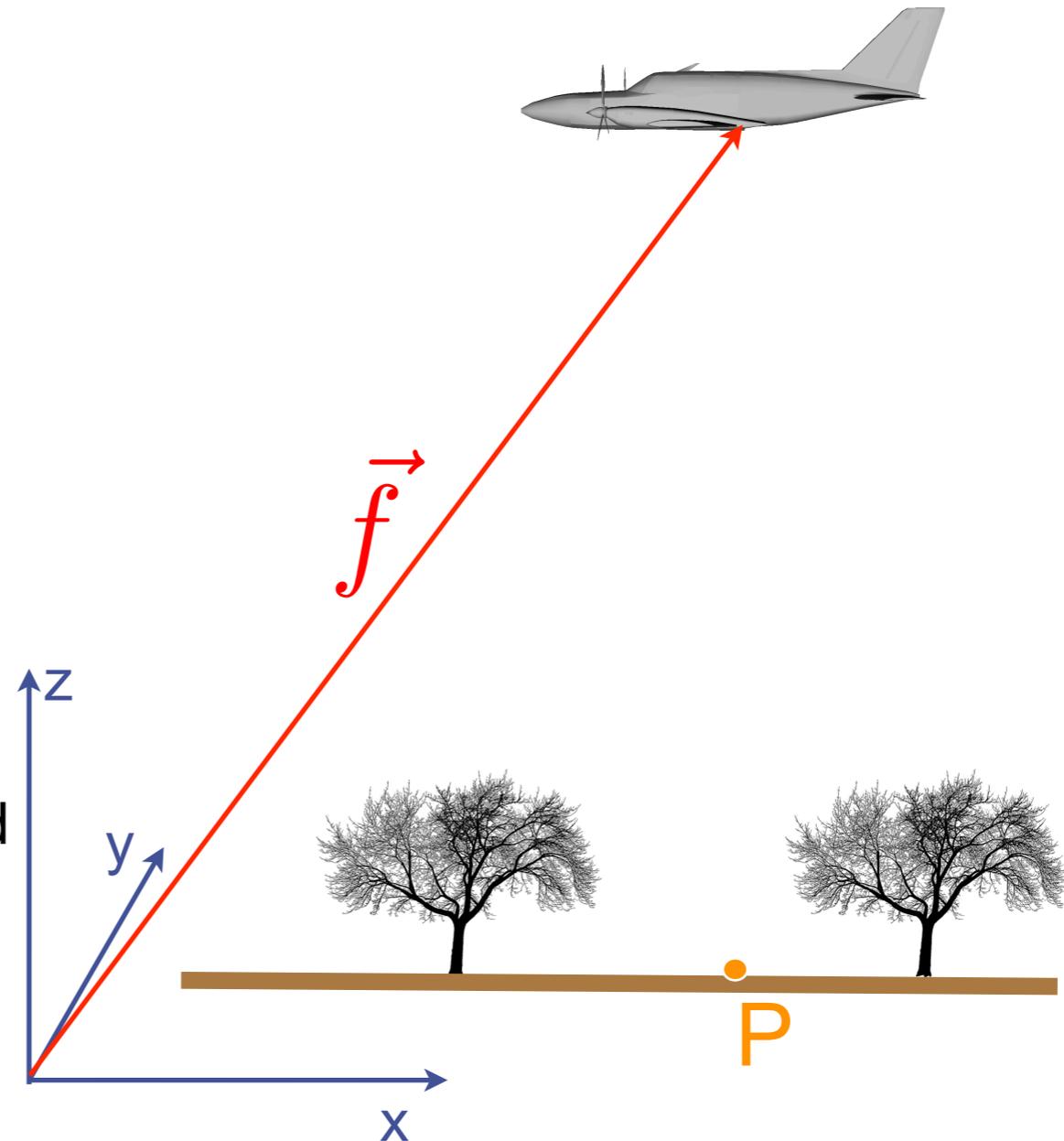
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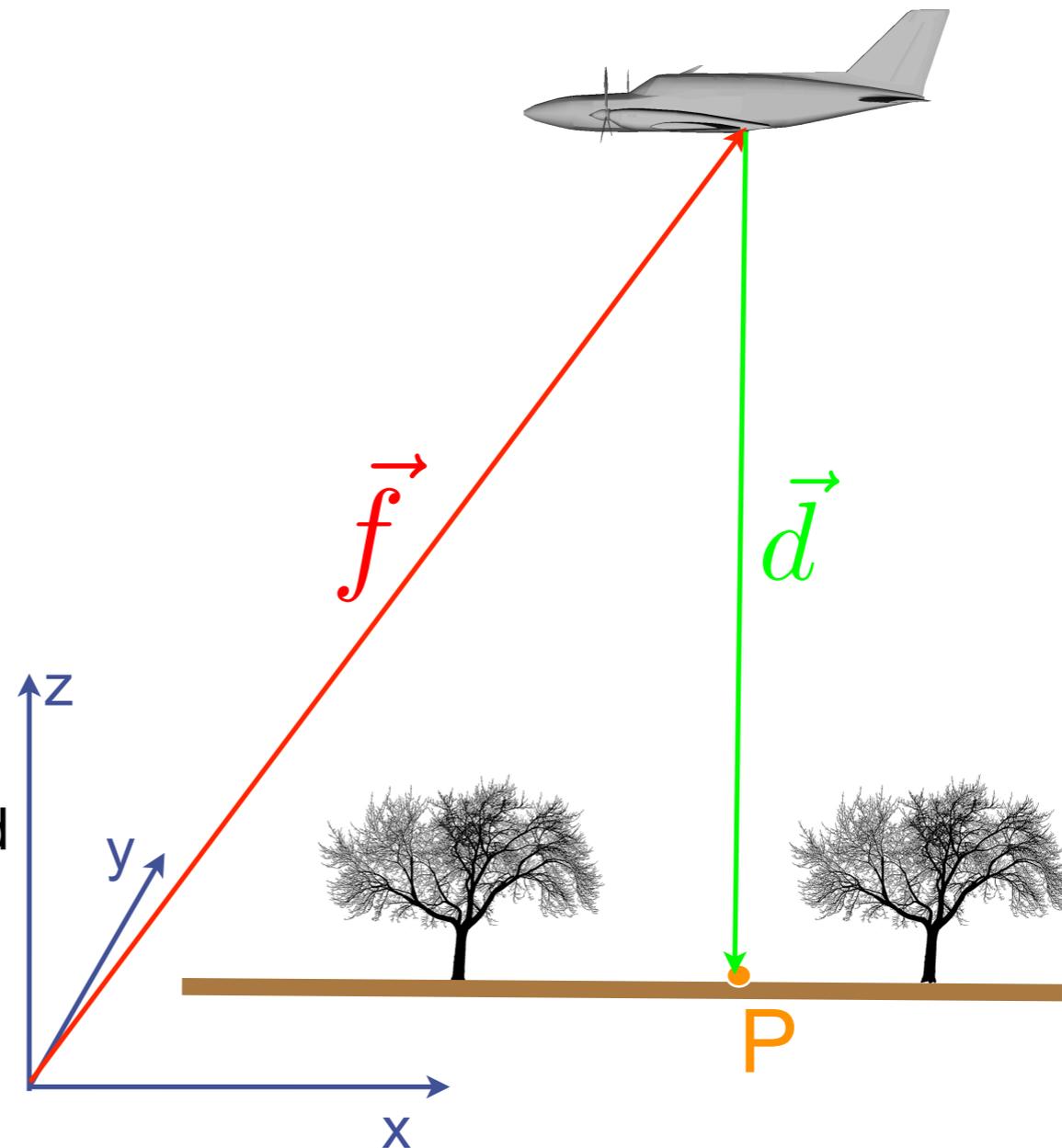
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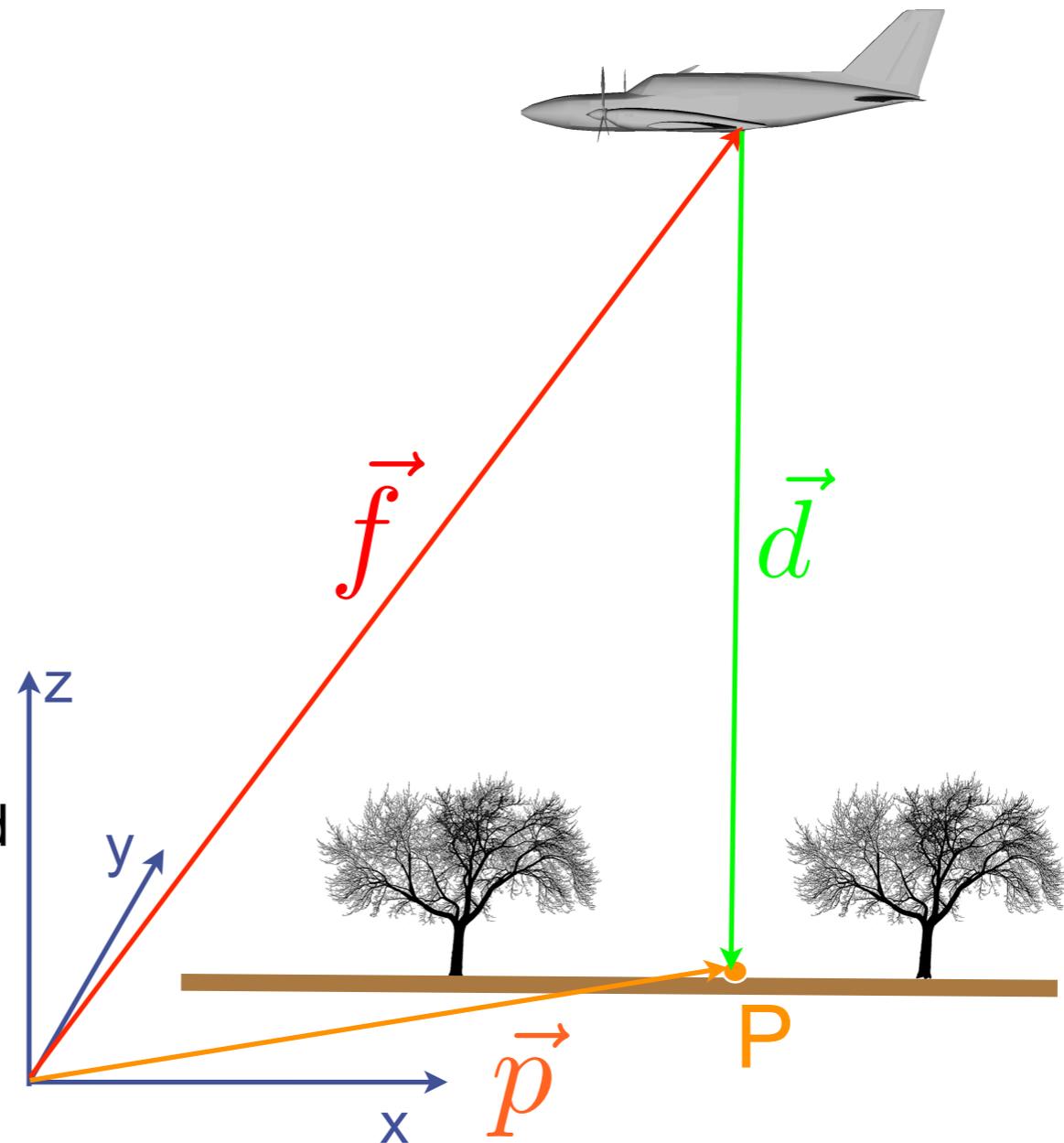
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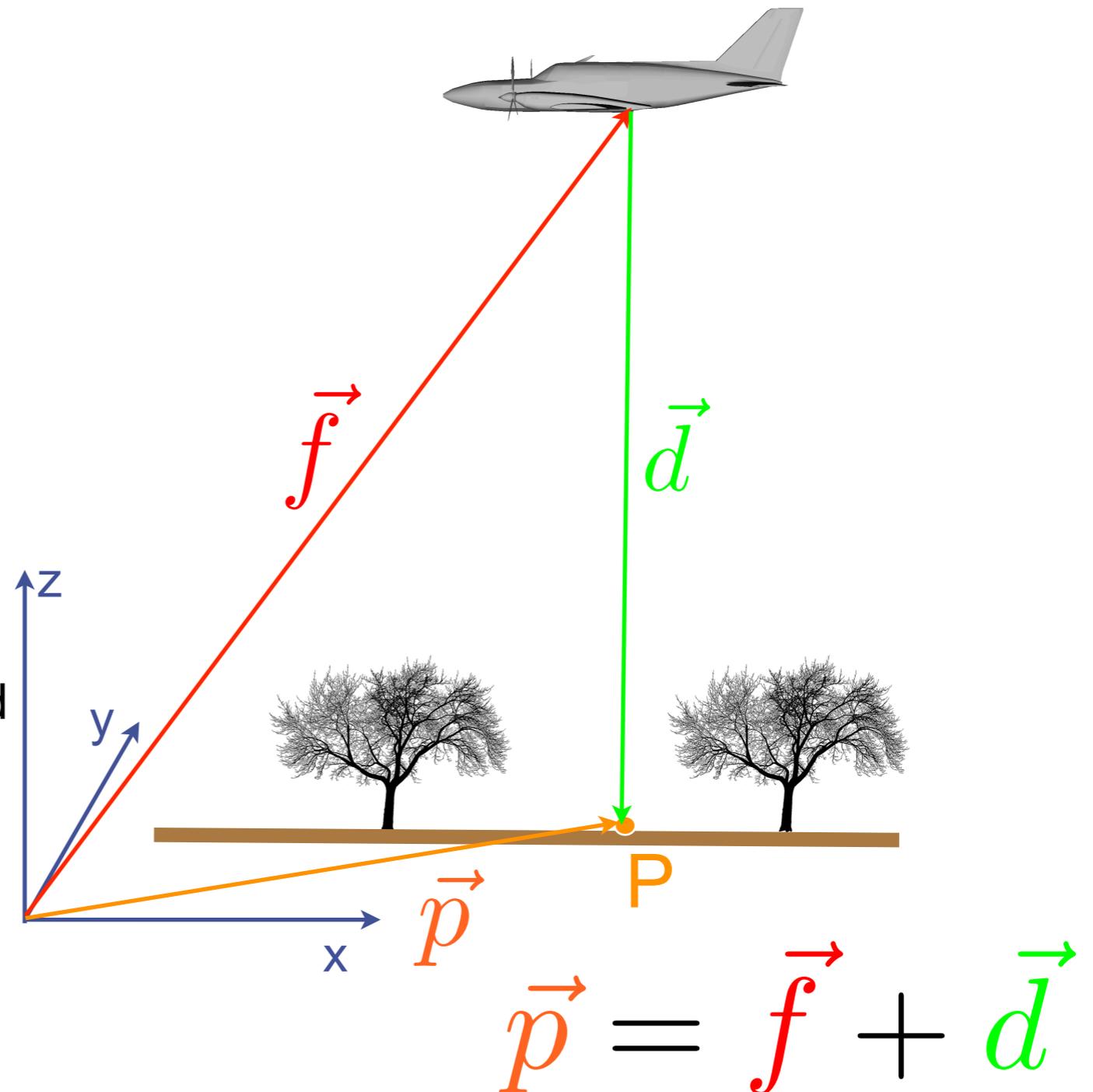
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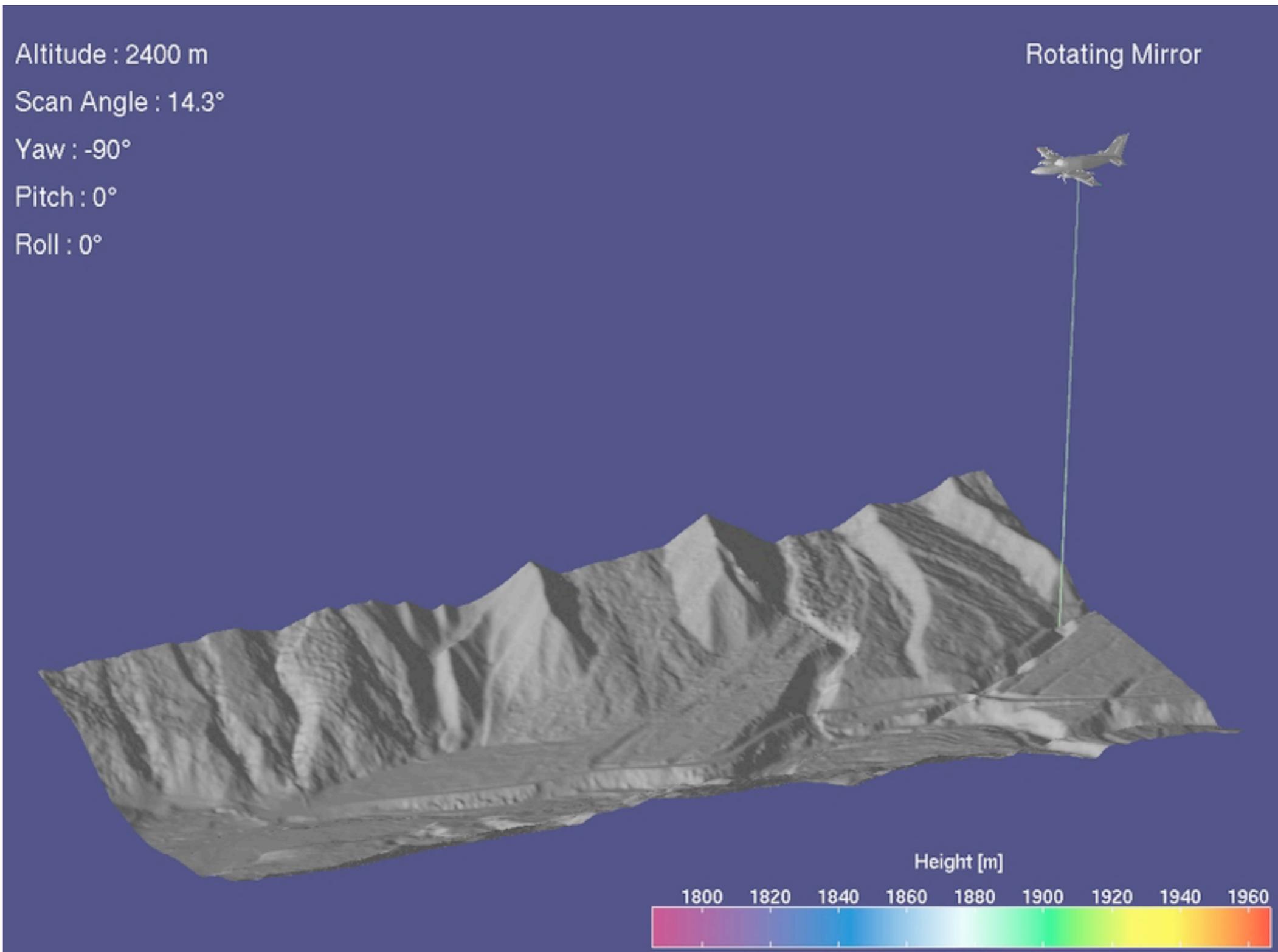
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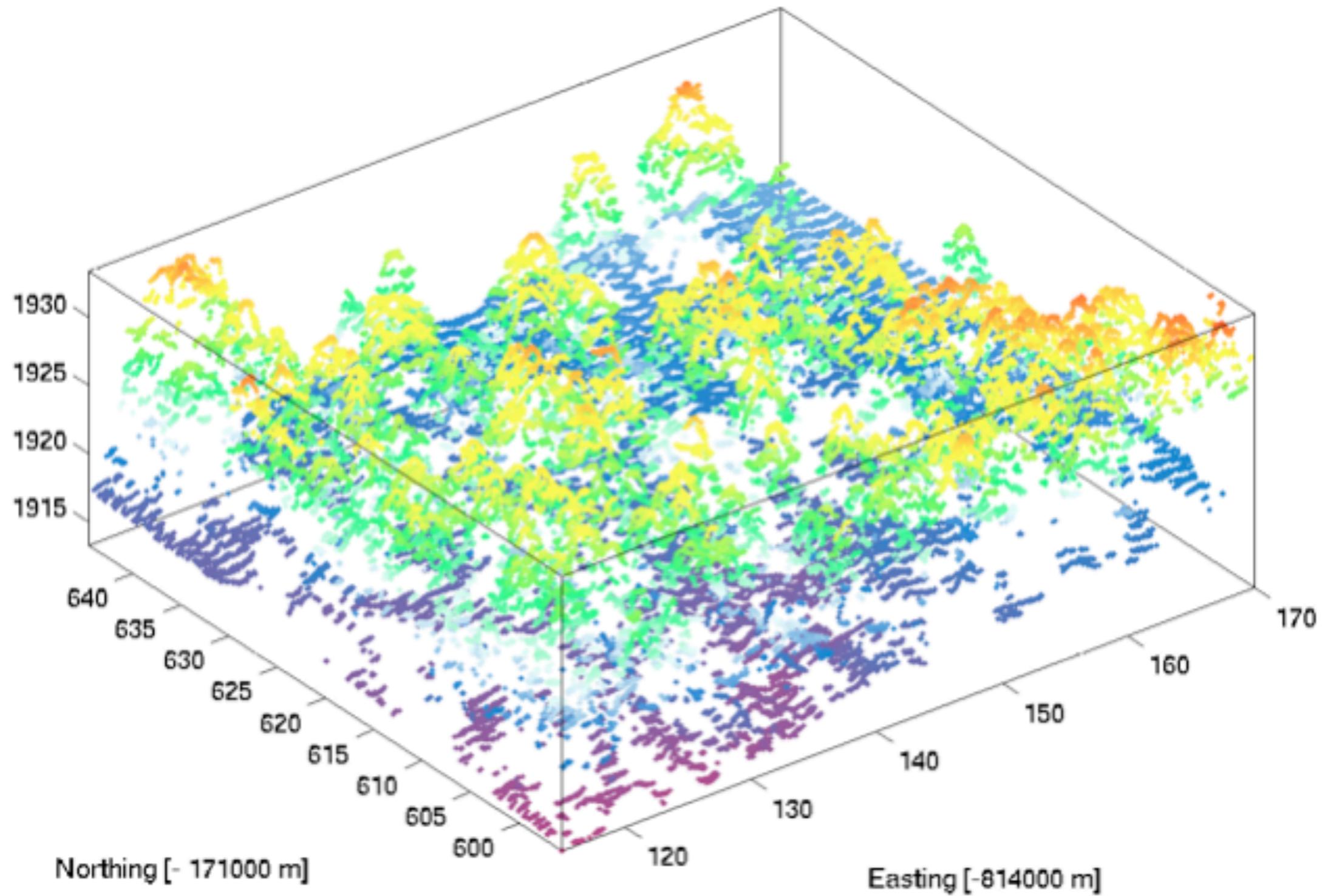
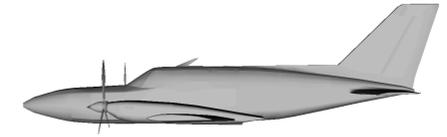


Technology - LiDAR -> Airborne Laser Scanning (ALS)

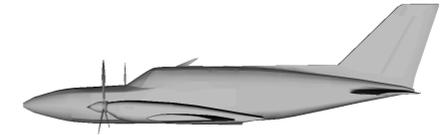
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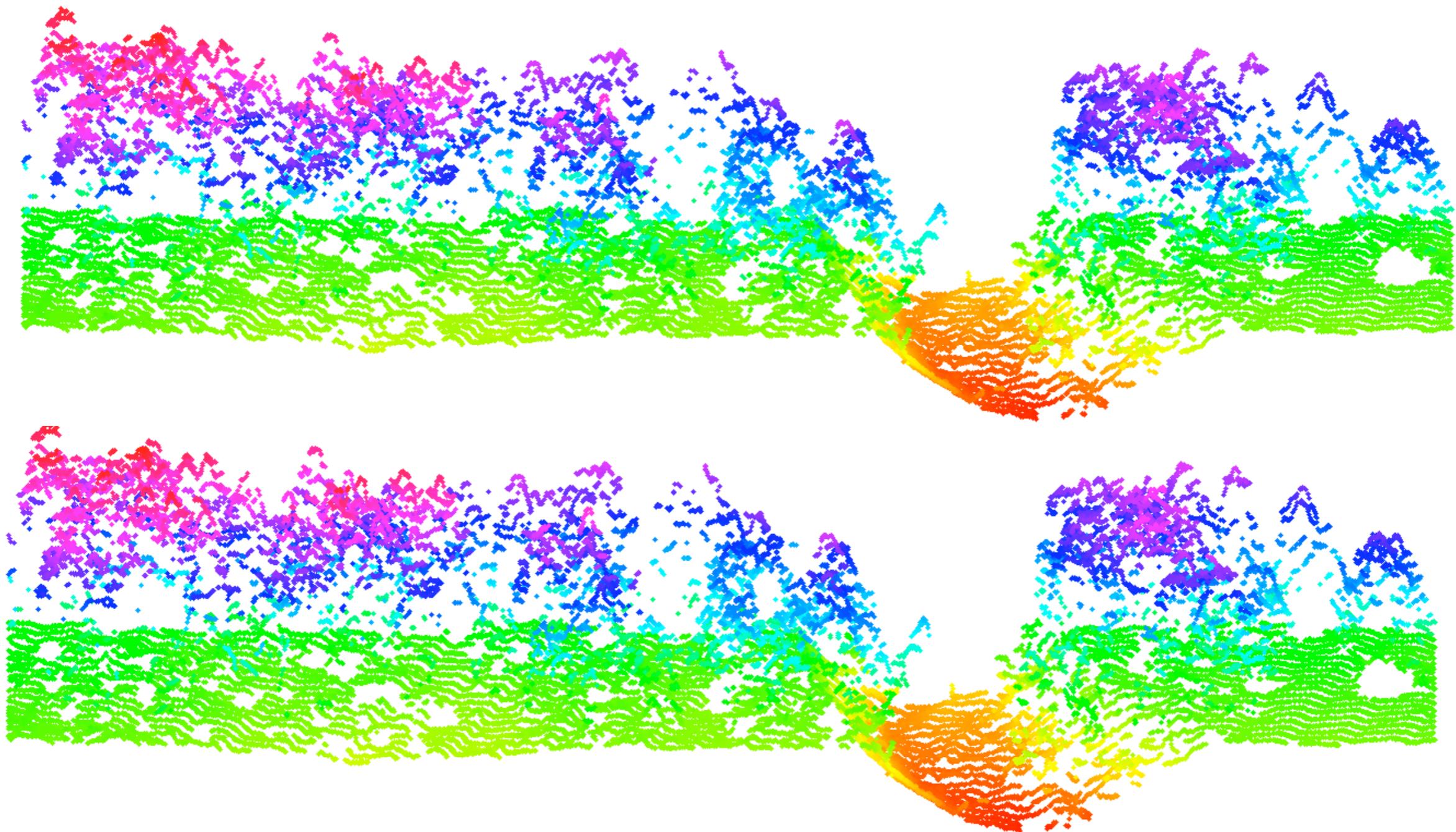
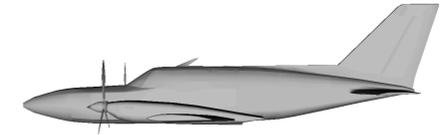
ALS - raw data



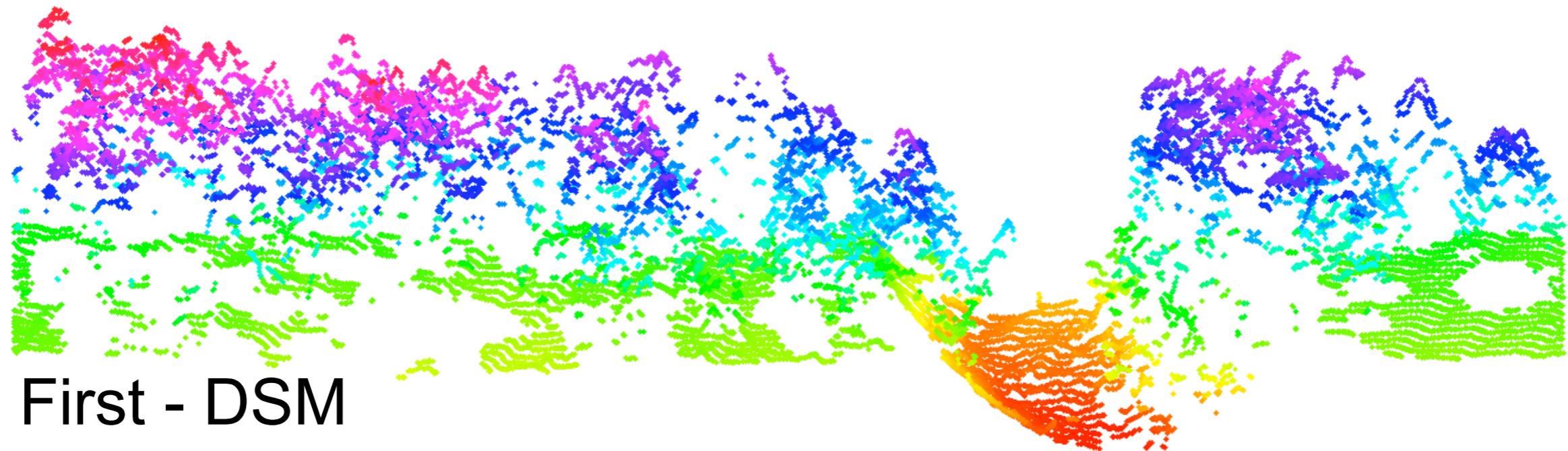
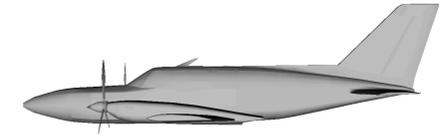
ALS - general data products



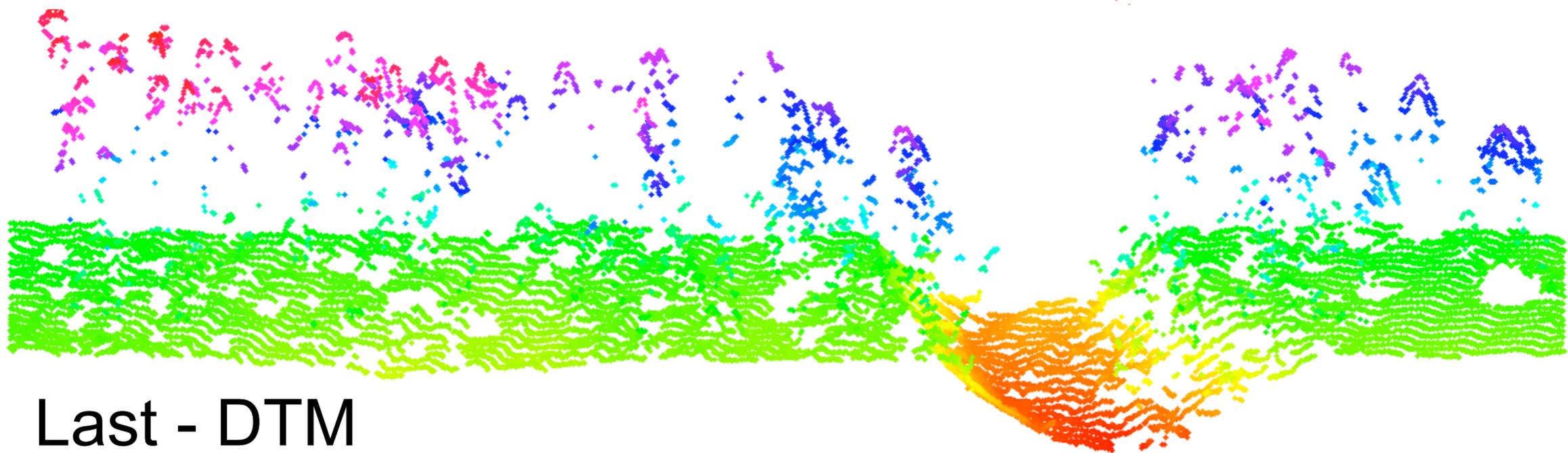
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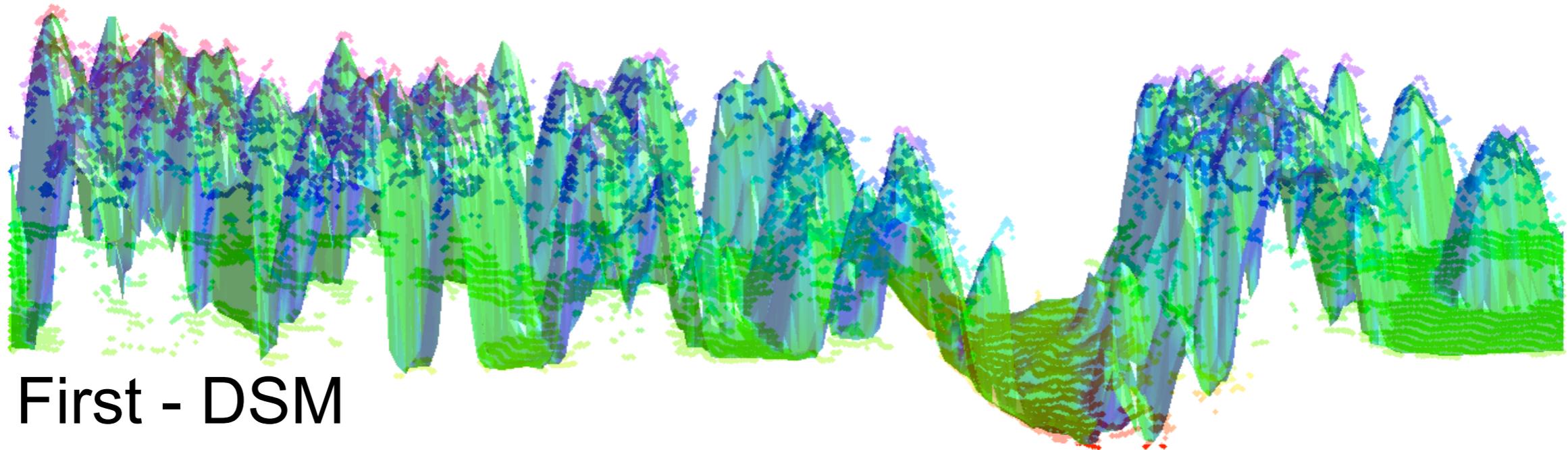
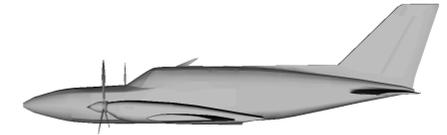


First - DSM

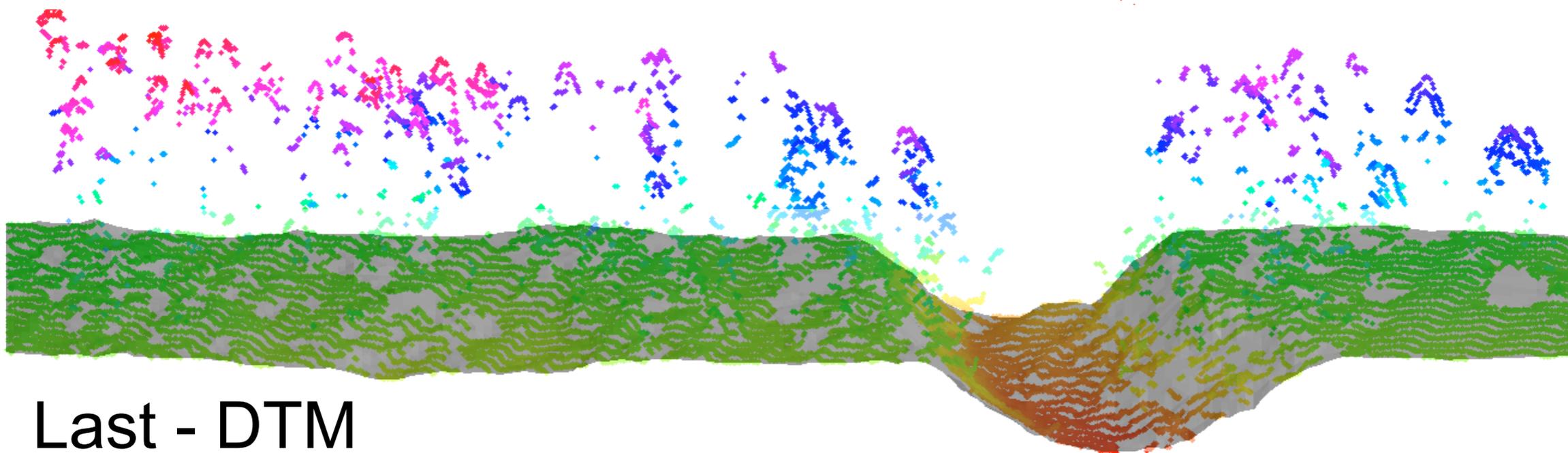


Last - DTM

ALS - general data products

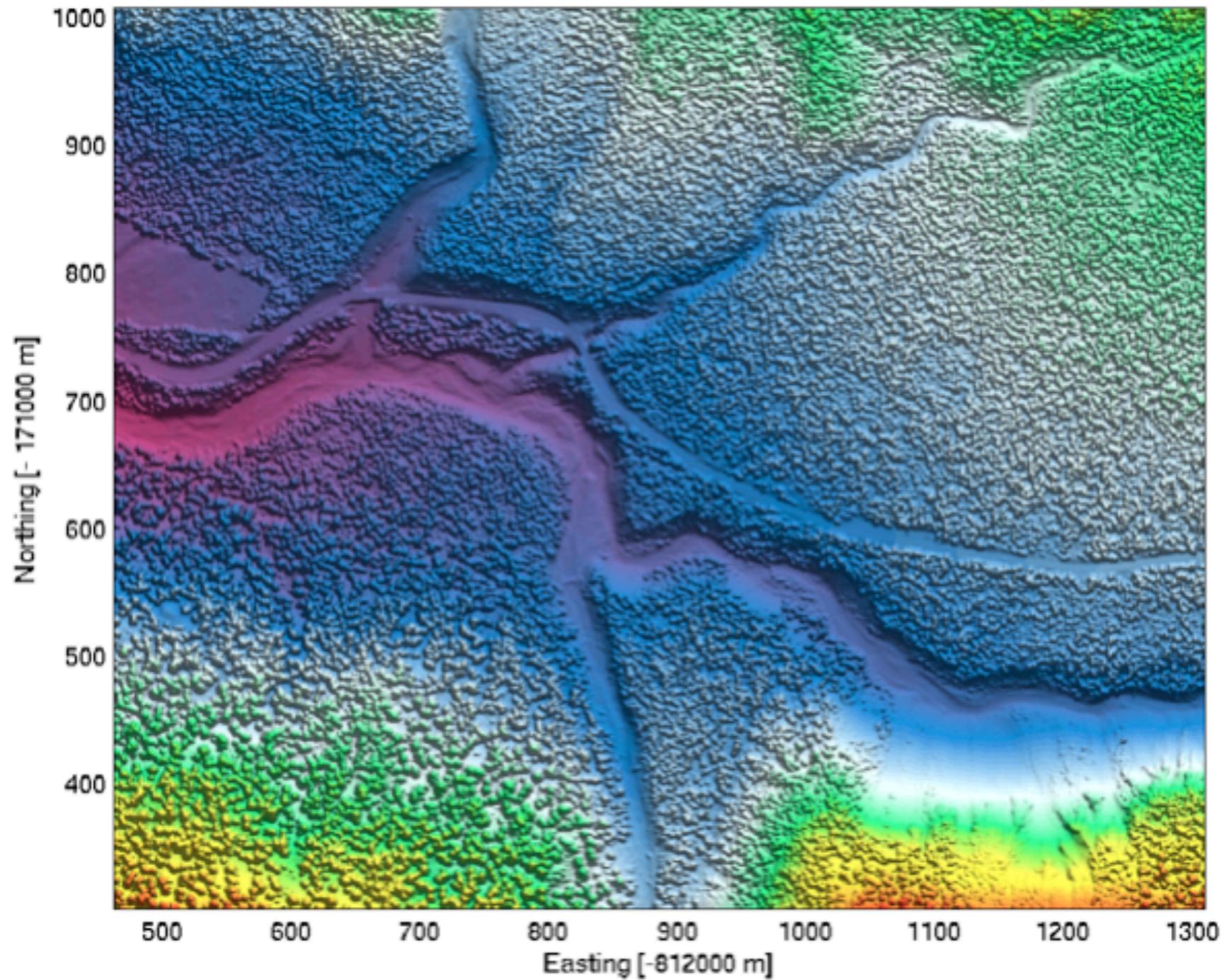
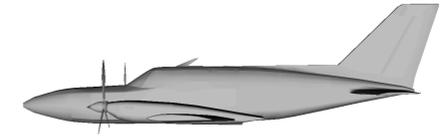


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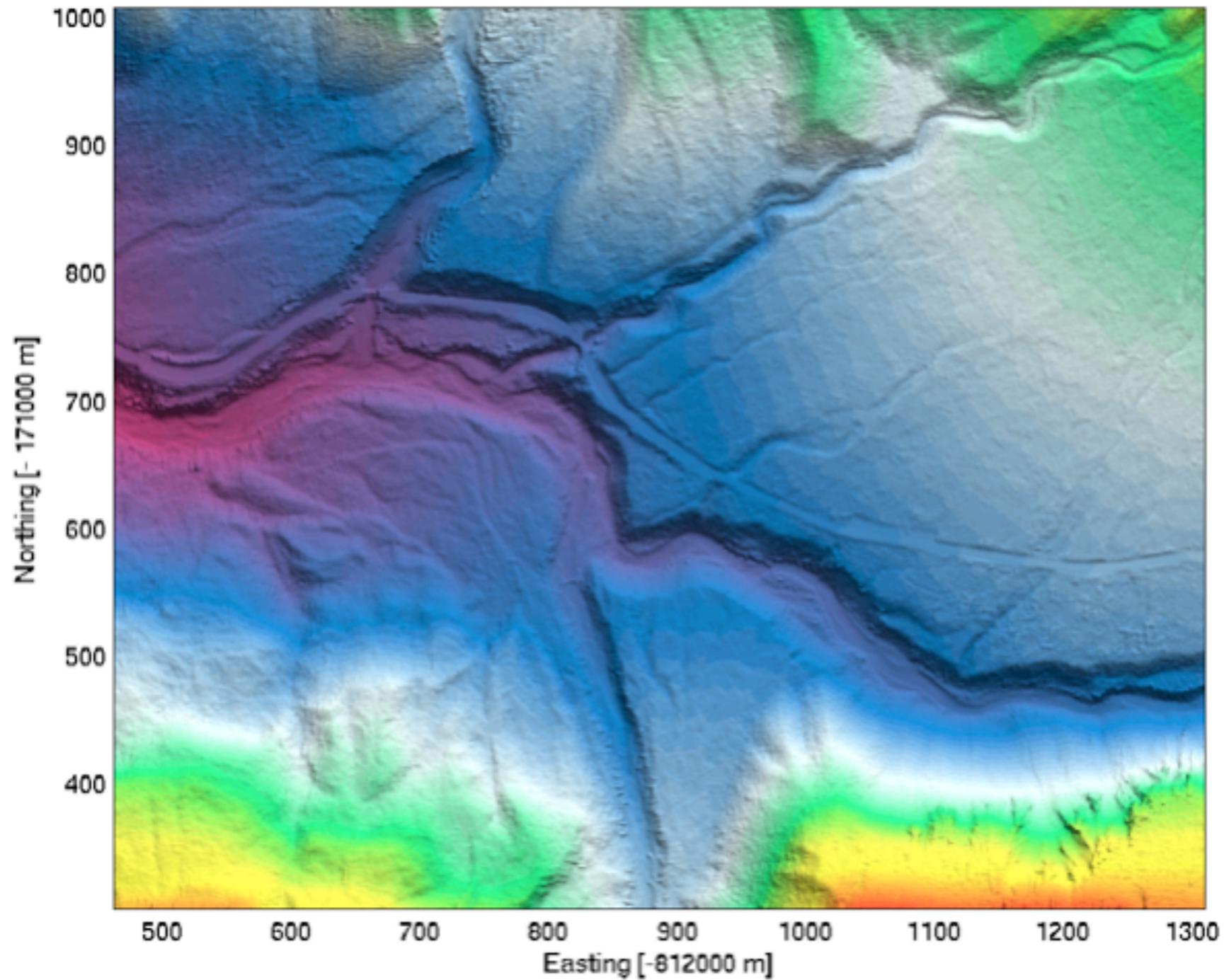
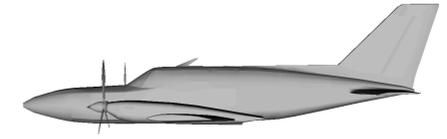


Last - DTM

ALS - DSM vs. DTM

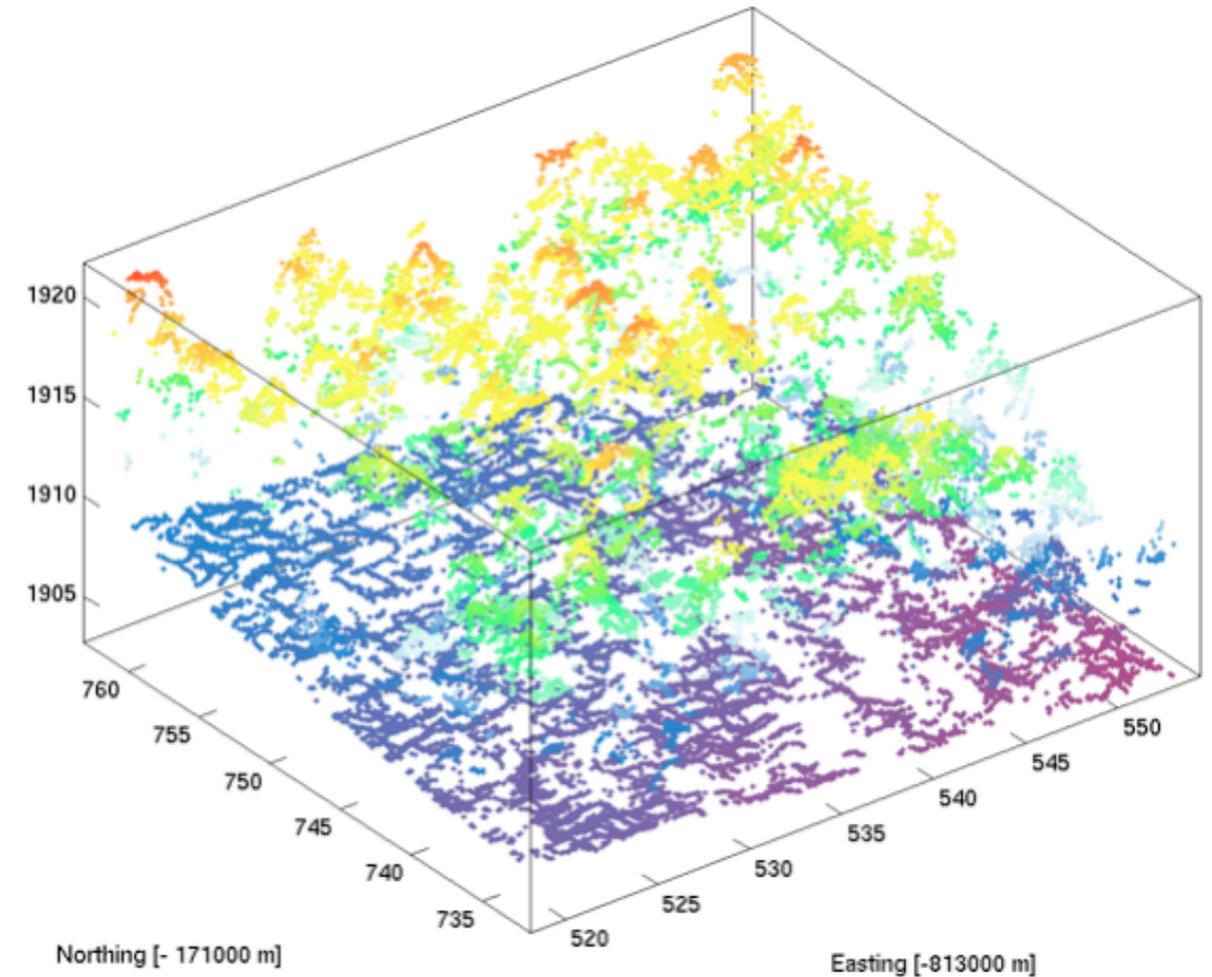


ALS - DSM vs. DTM



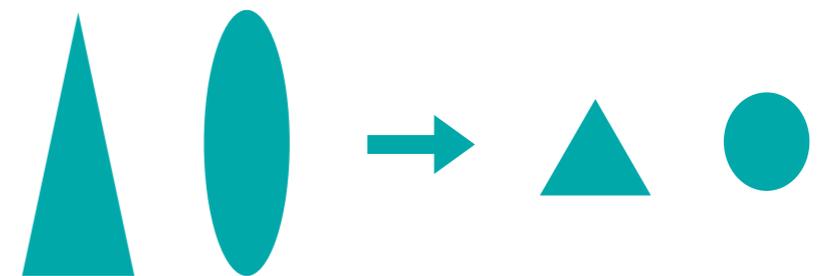
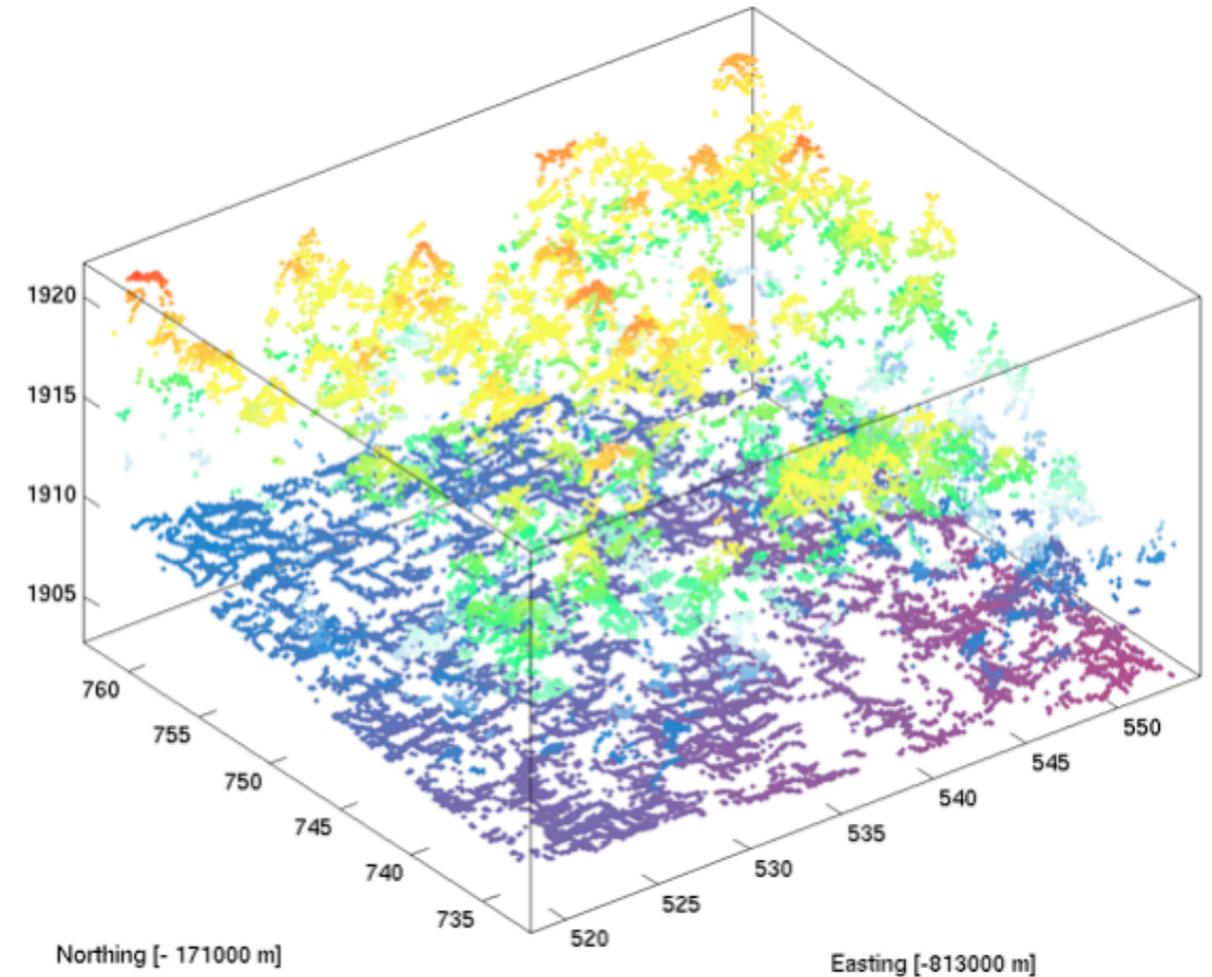
Extraction of single tree geometry - the promise of raw data ...

- why work on raw data:
 - ▶ no loss of information by interpolation into raster models
 - ▶ 3D structure of vegetation is contained in the point cloud
 - ▶ but:
 - Algorithm development and implementation far more complicated than for DSM/DTM
- two step procedure:
 - ▶ (1) seed points: local maxima in CHM
 - ▶ (2) supervised classification ('cluster-analysis') starting off with seed points from(1)
 - feature space is x,y,z, with z being compressed
 - euclidean distance metric

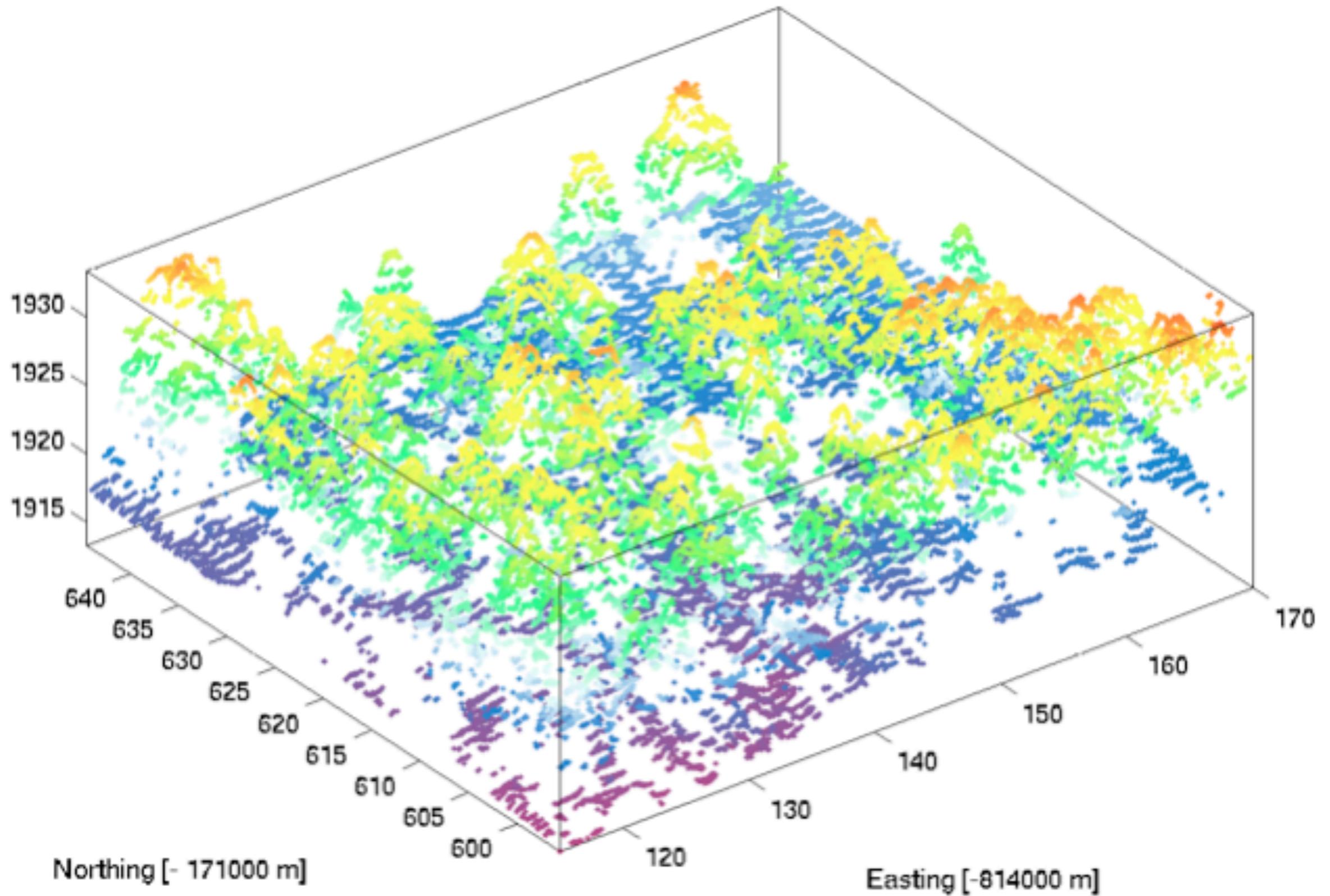
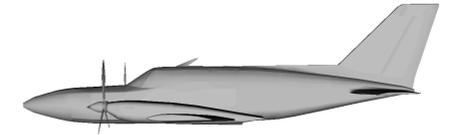


Extraction of single tree geometry - the promise of raw data ...

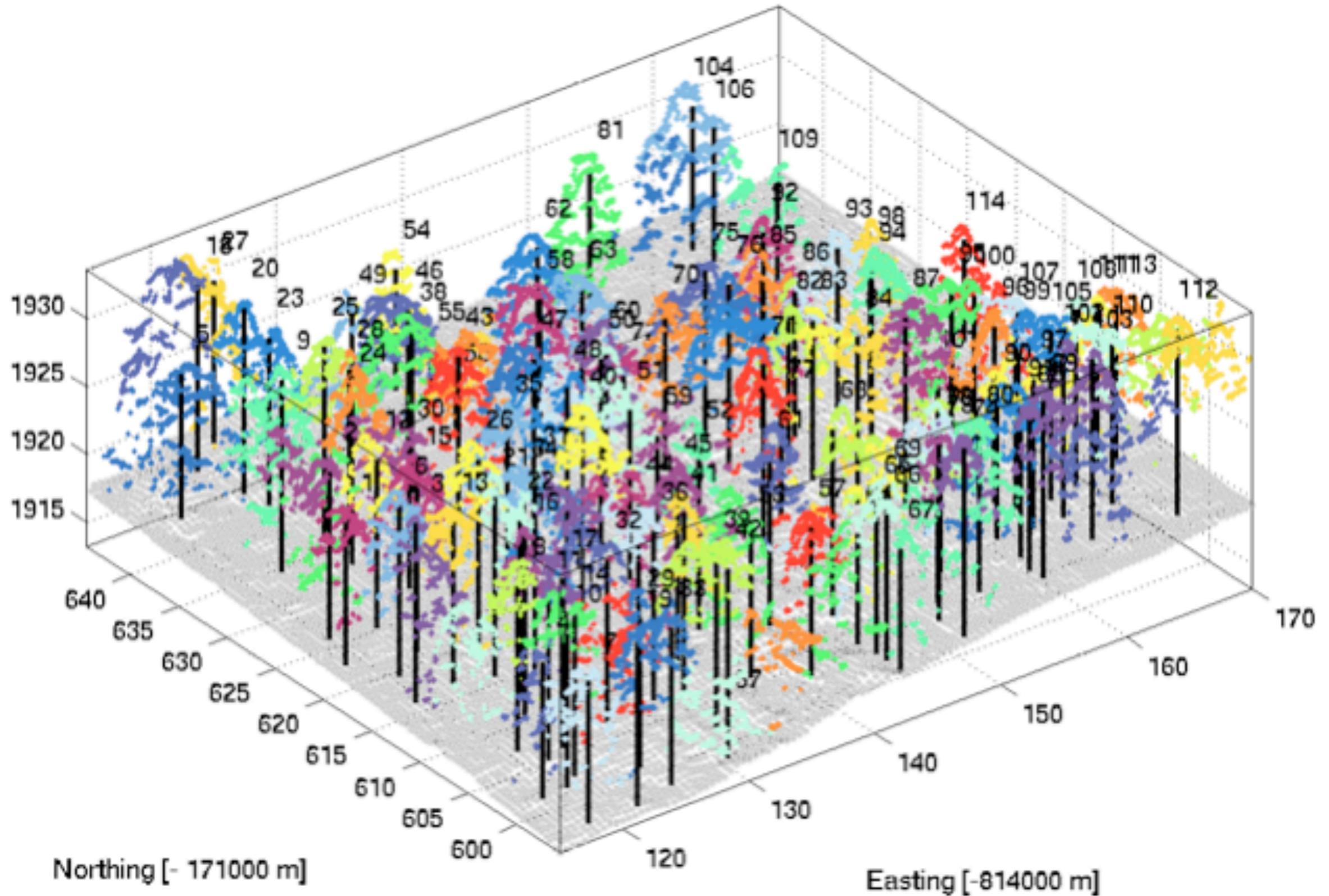
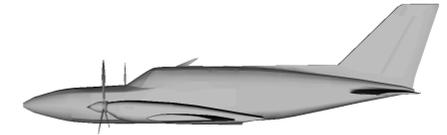
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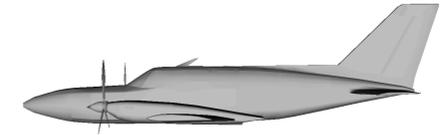
ALS - from raw data to “semantic” information



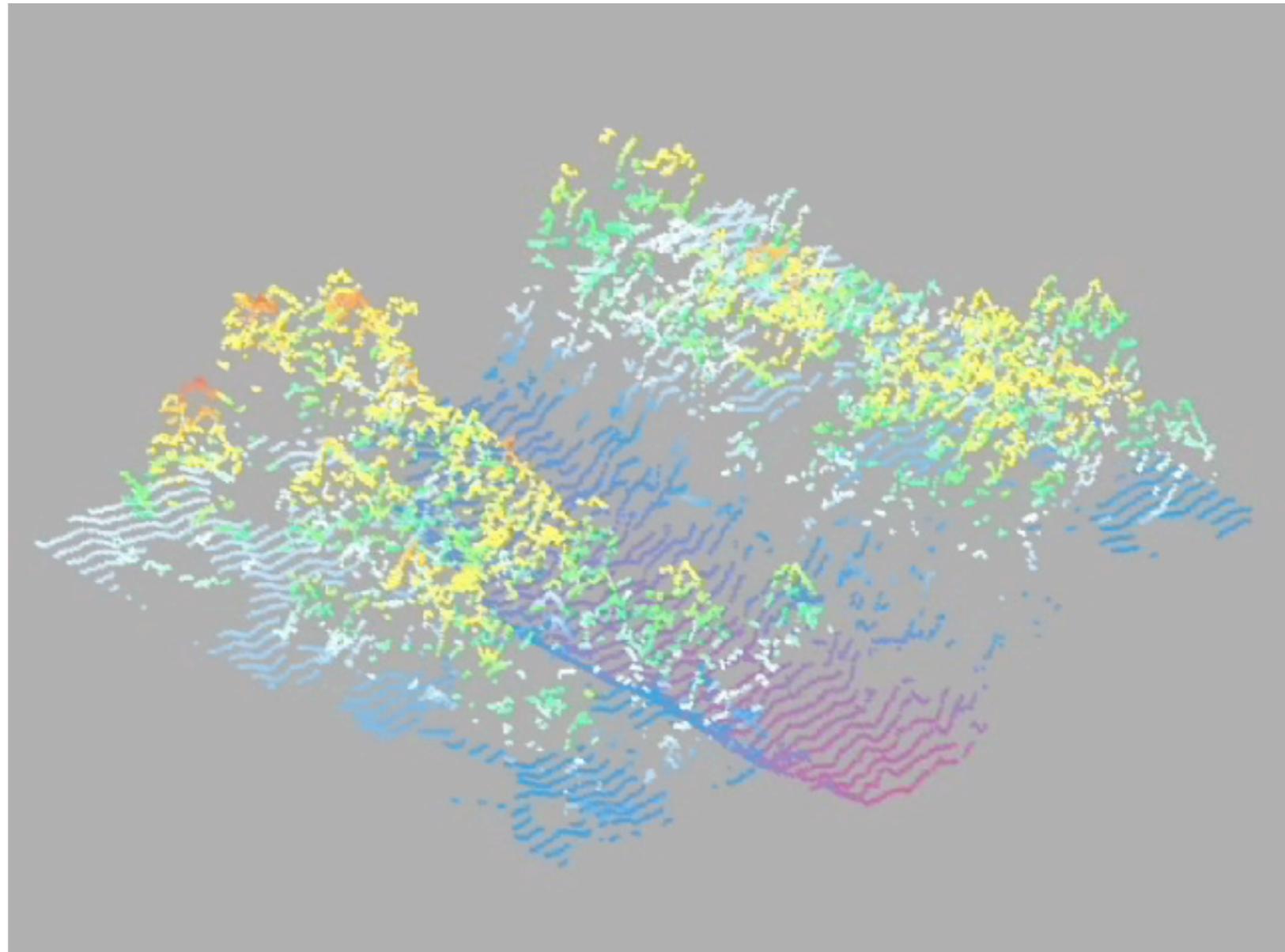
ALS - from raw data to “semantic” information



ALS - canopy geometry

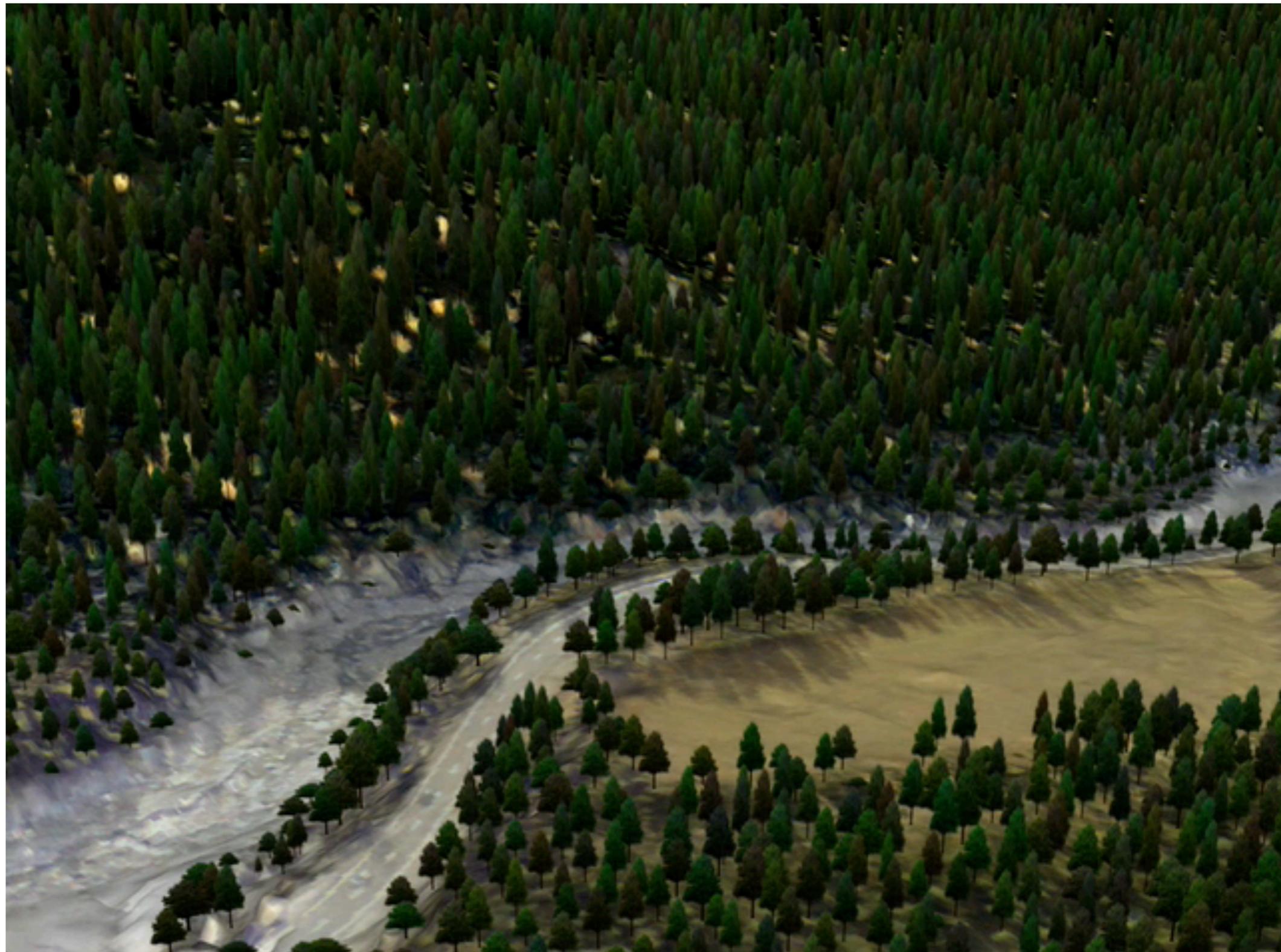
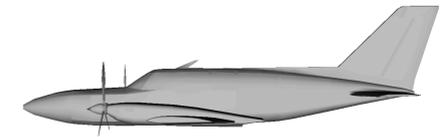


- these geometric properties can be derived from segmented clusters:
 - ▶ tree position
 - ▶ tree height
 - ▶ crown diameter
 - ▶ crown volume
 - ▶ crown base height
- allows for geometric reconstruction of forest scene
- validated with field data
 - ▶ 75% of trees, ~ 0.3 m tree height accuracy

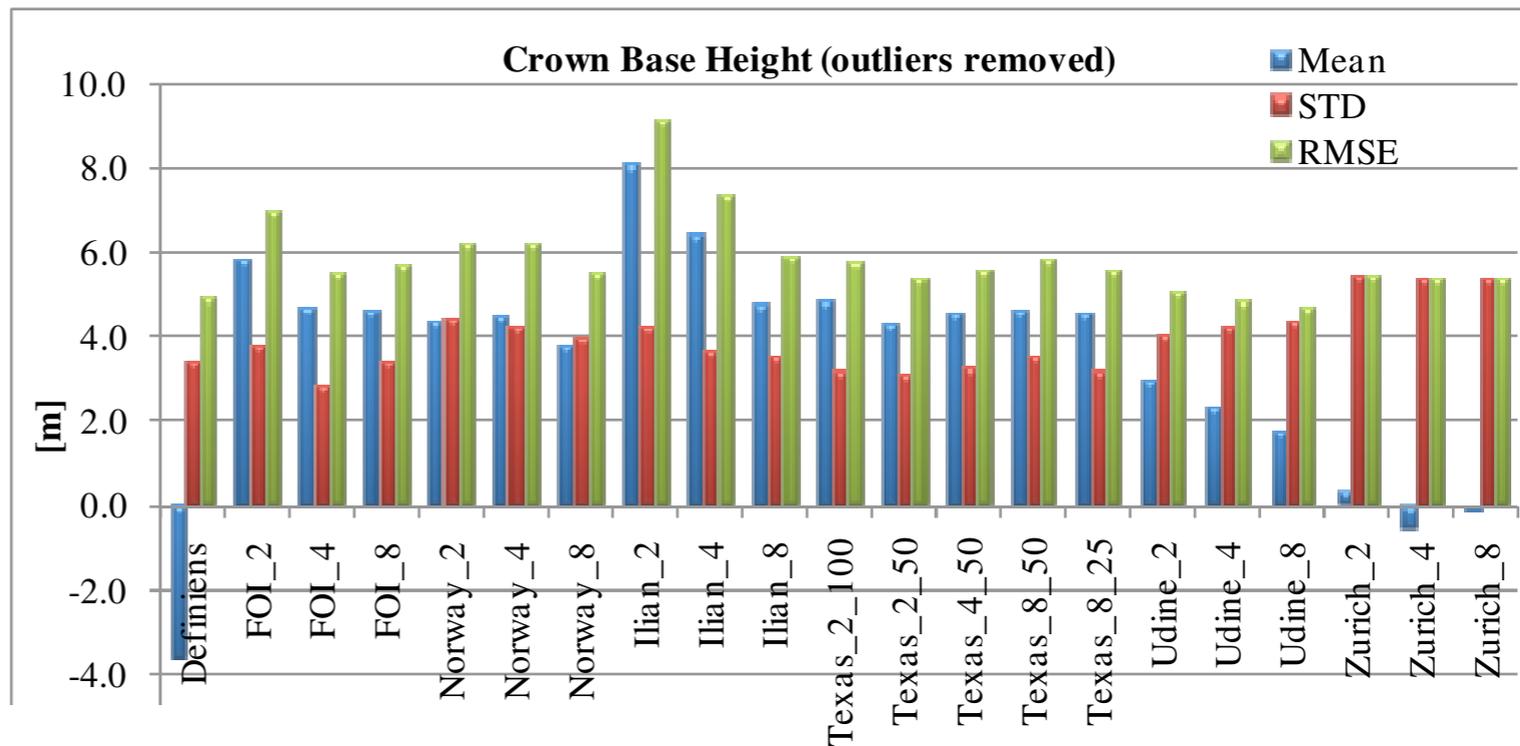


Morsdorf, F.; Meier, E.; Kötz, B.; Itten, K.I.; Dobbertin, M. & Allgöwer, B.
LIDAR-based geometric reconstruction of boreal type forest stands at single tree level for forest and wildland fire management
Remote Sensing of Environment, **2004**, 3, 353-362

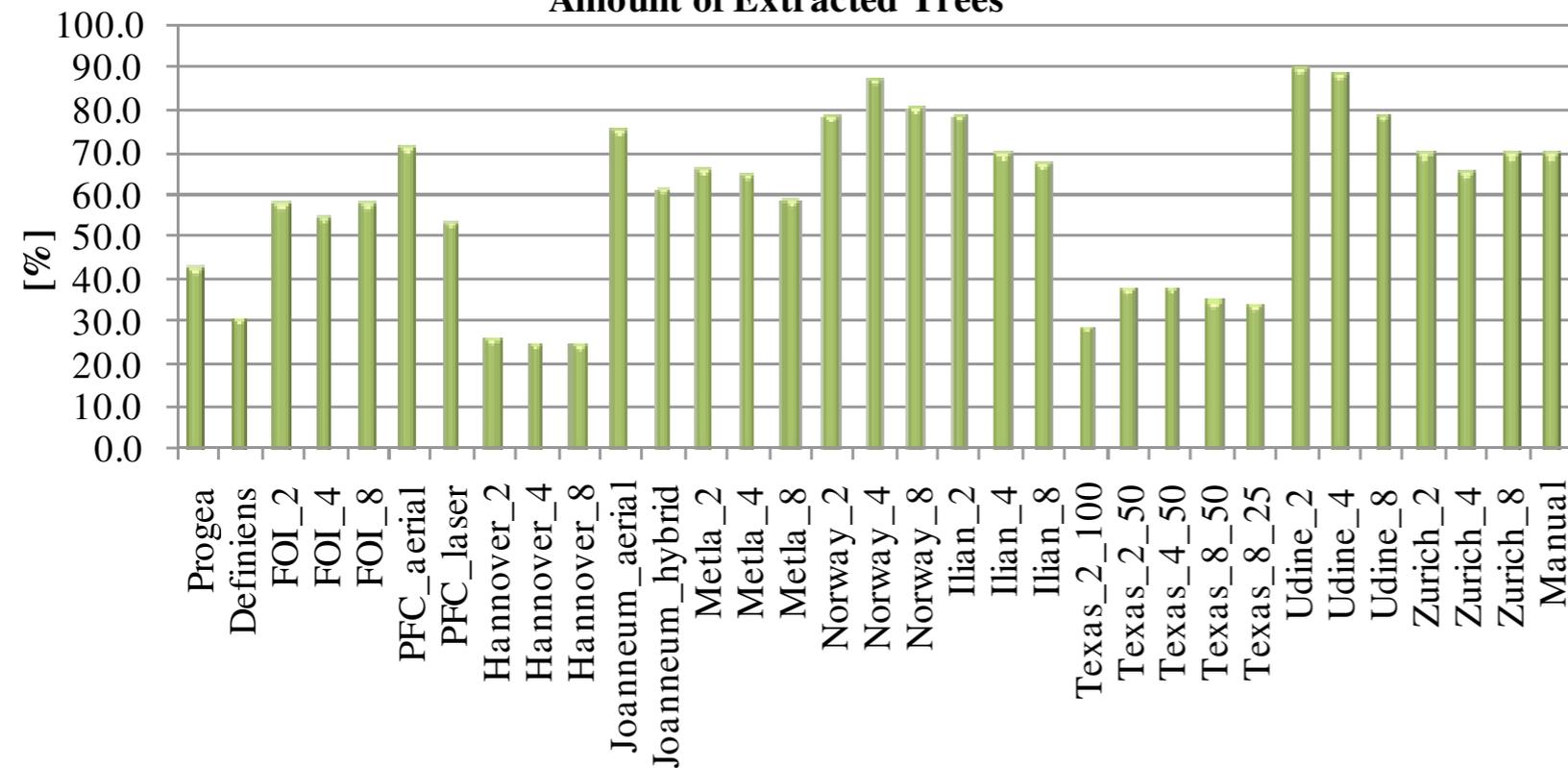
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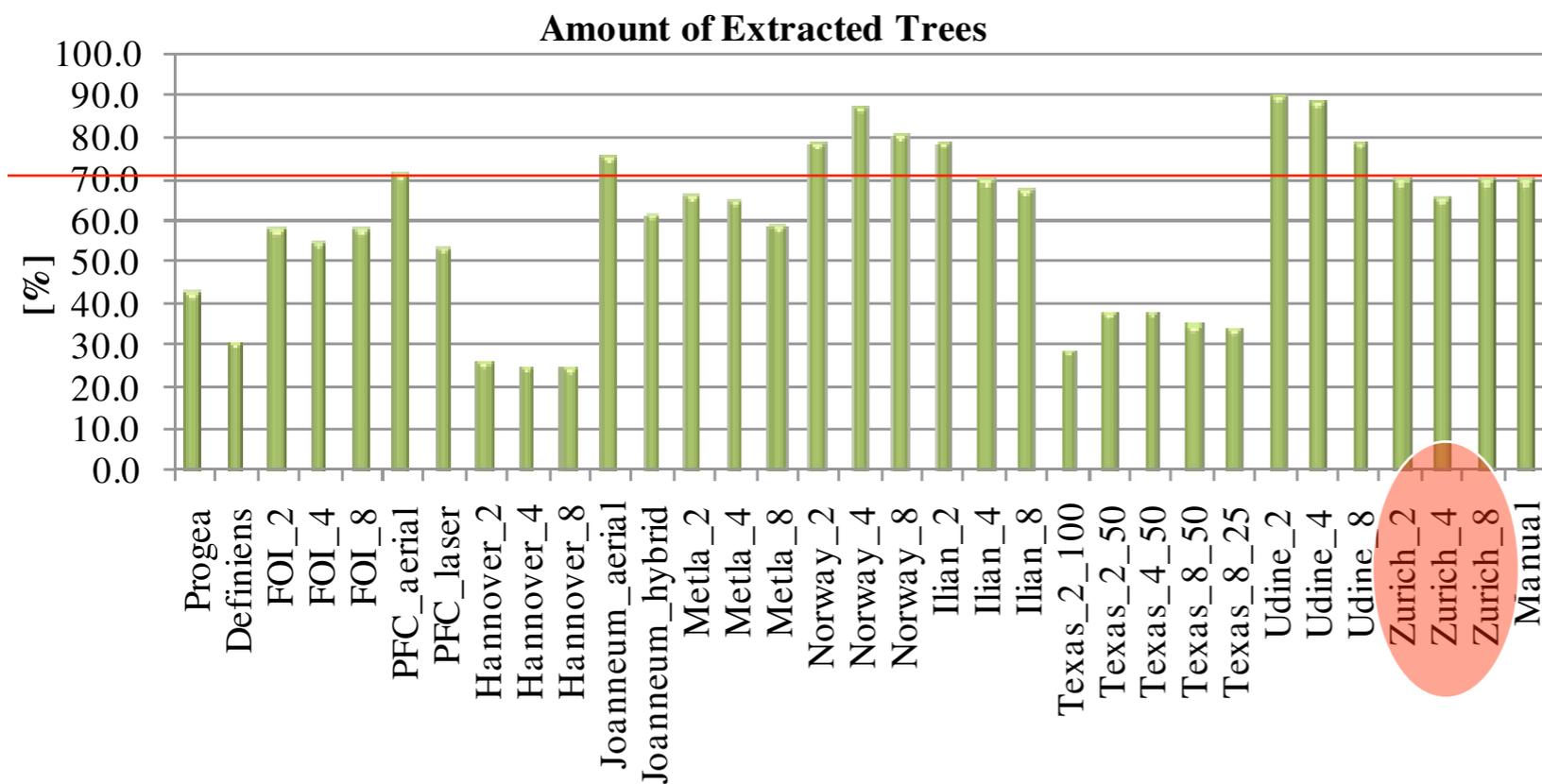
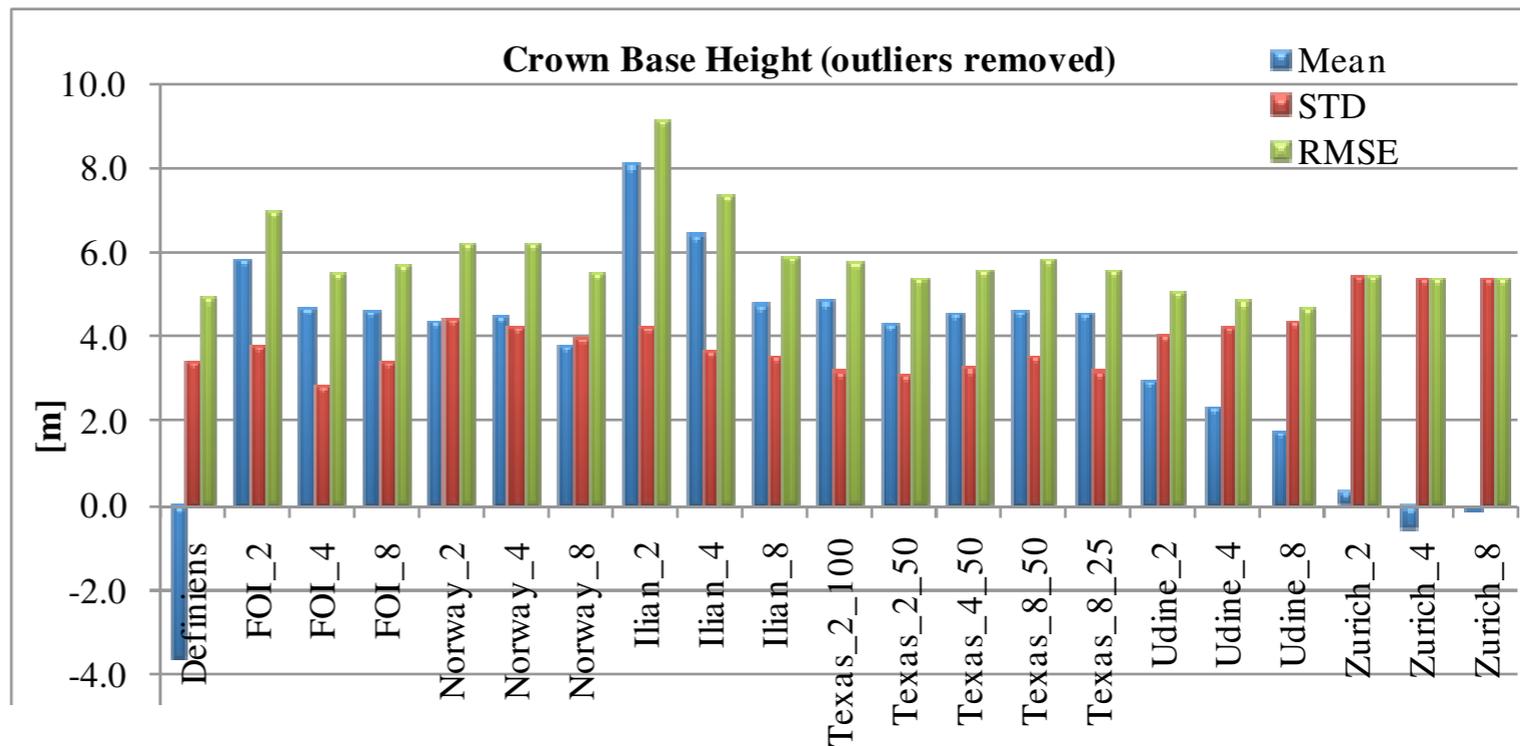
EuroSDR comparison project of tree delineation methods



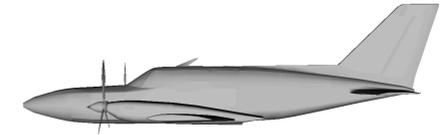
Amount of Extracted Trees



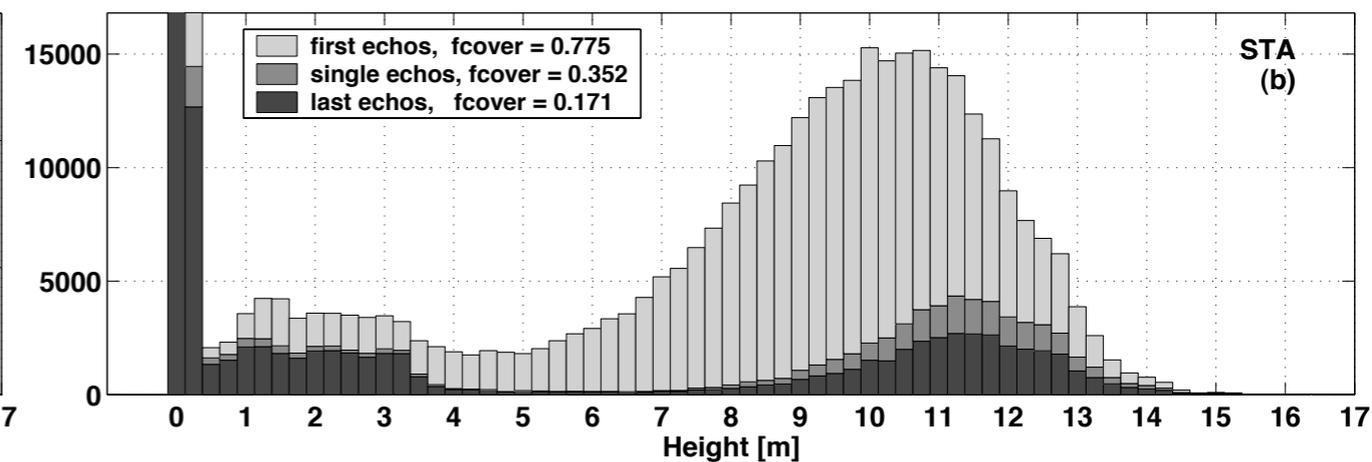
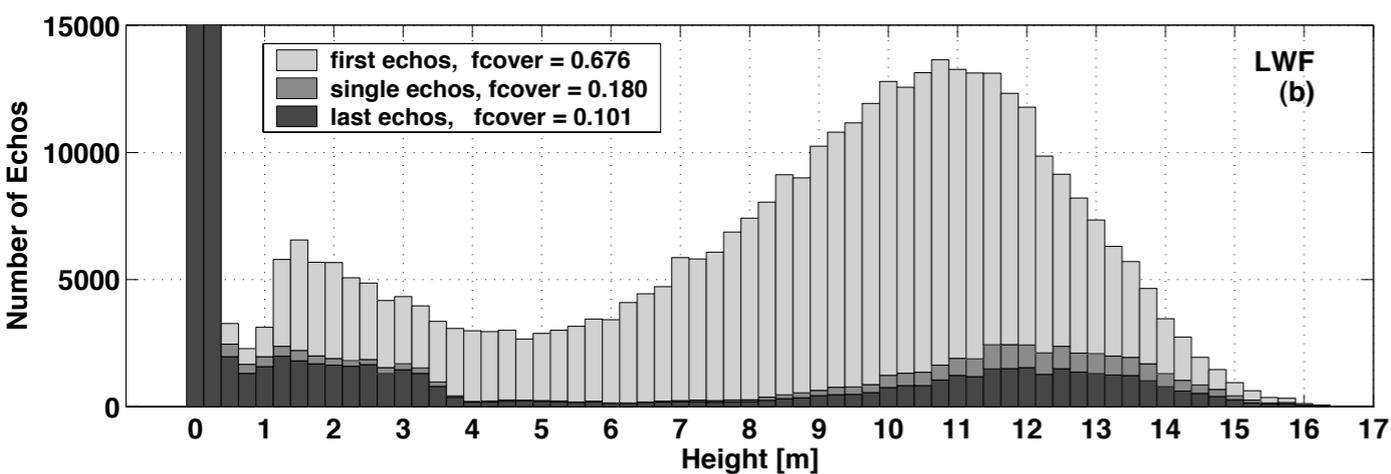
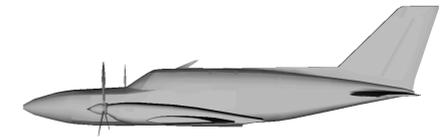
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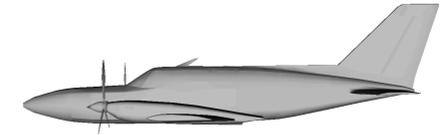
ALS - canopy density



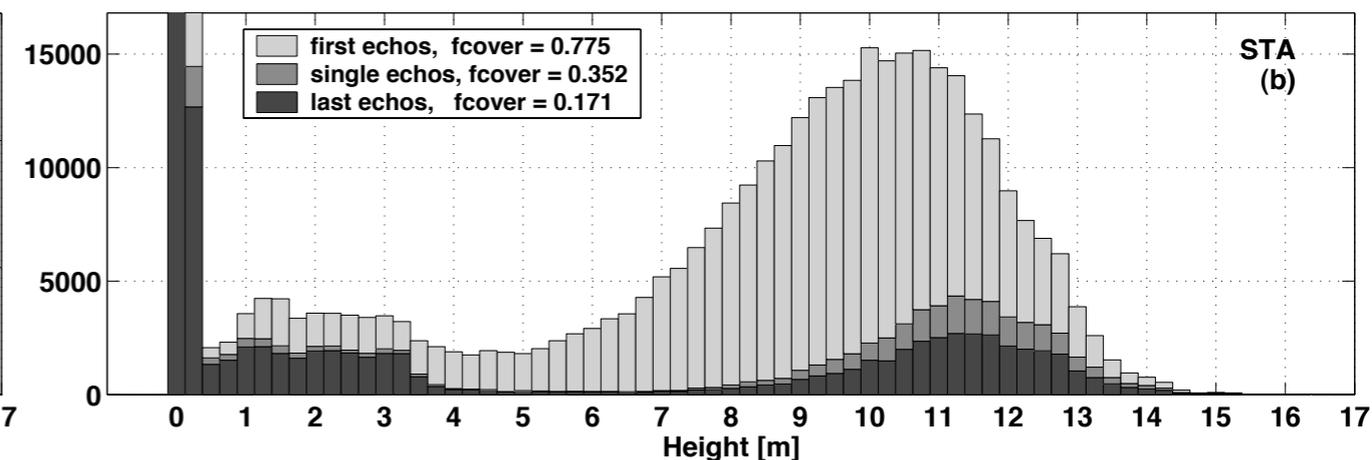
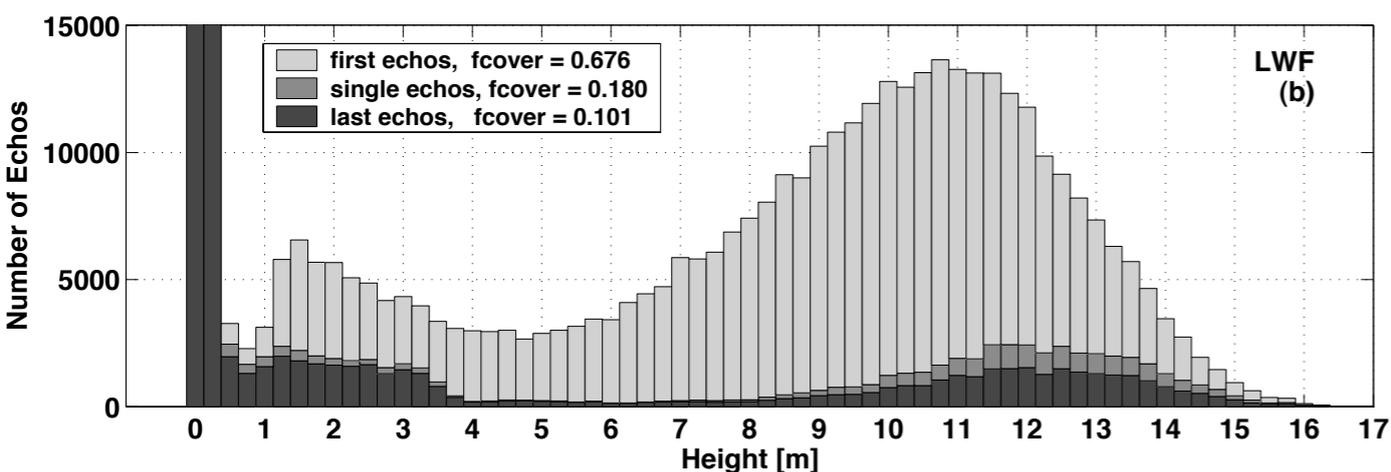
ALS - canopy density (gap fraction)



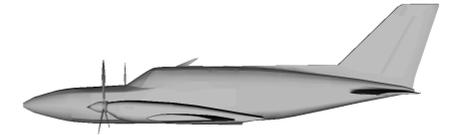
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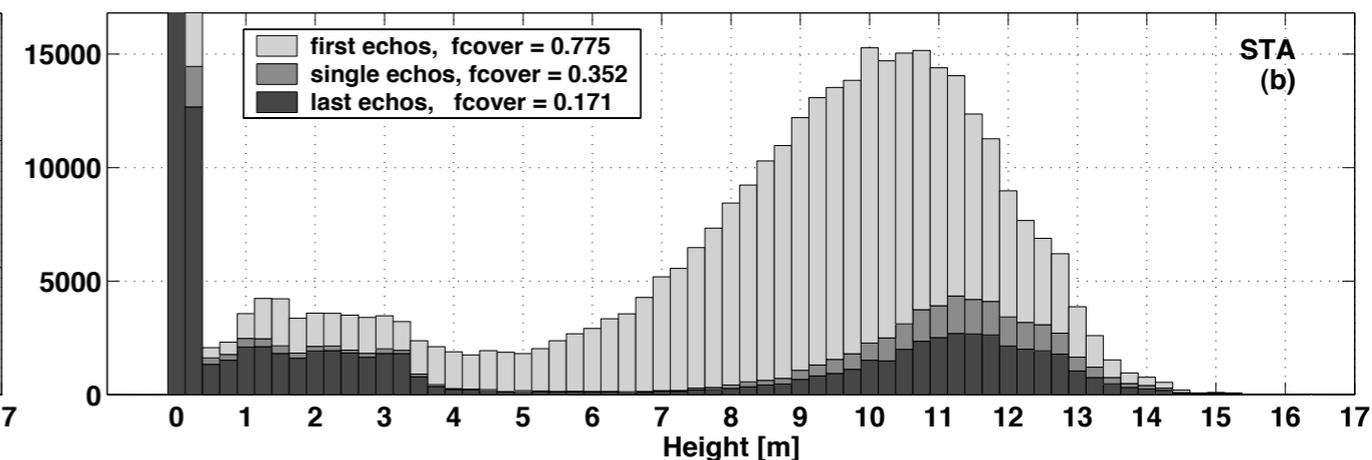
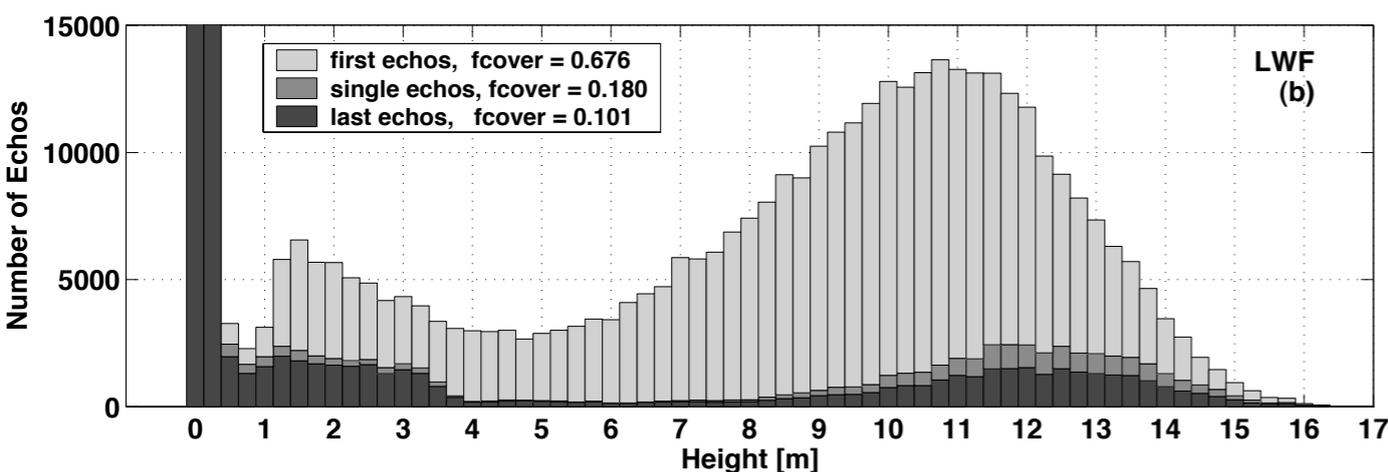
- Computation of canopy density from ALS raw data
 - ▶ fractional cover (canopy closure)
 - Sum of echos at a height larger than 1.25m (threshold) divided by the sum of all echos
 - ▶ leaf area index (LAI)
 - Relation of single and last echos to number of first echos inside the canopy
 - echos inside vegetation are classied by a height threshold
 - should be a proxy of canopy density when reflectance differences can be neglected



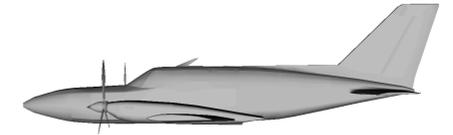
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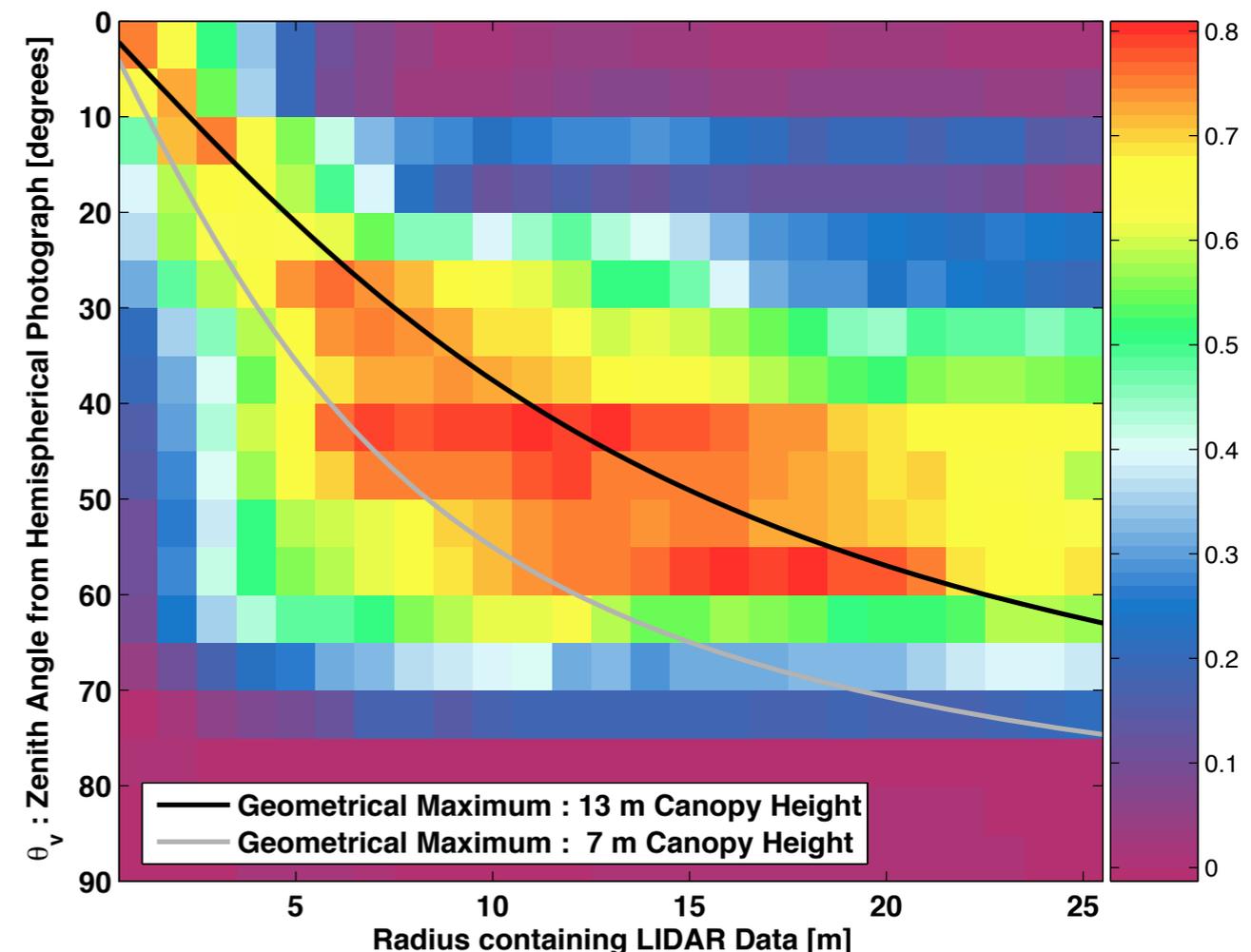
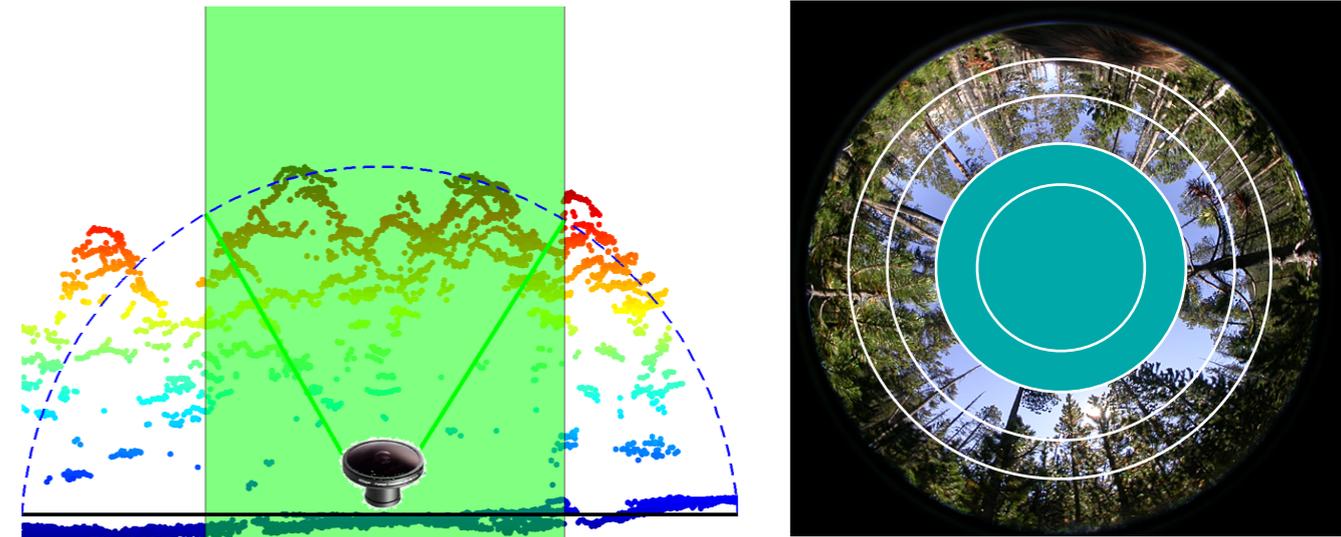
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 - echos inside vegetation are classied by a height threshold
 - should be a proxy of canopy density when reflectance differences can be neglected
- Validation with field measurements ...
 - ▶ which field measurements and ...
 - ▶ ... at which scales ?



ALS - canopy density (gap fraction)

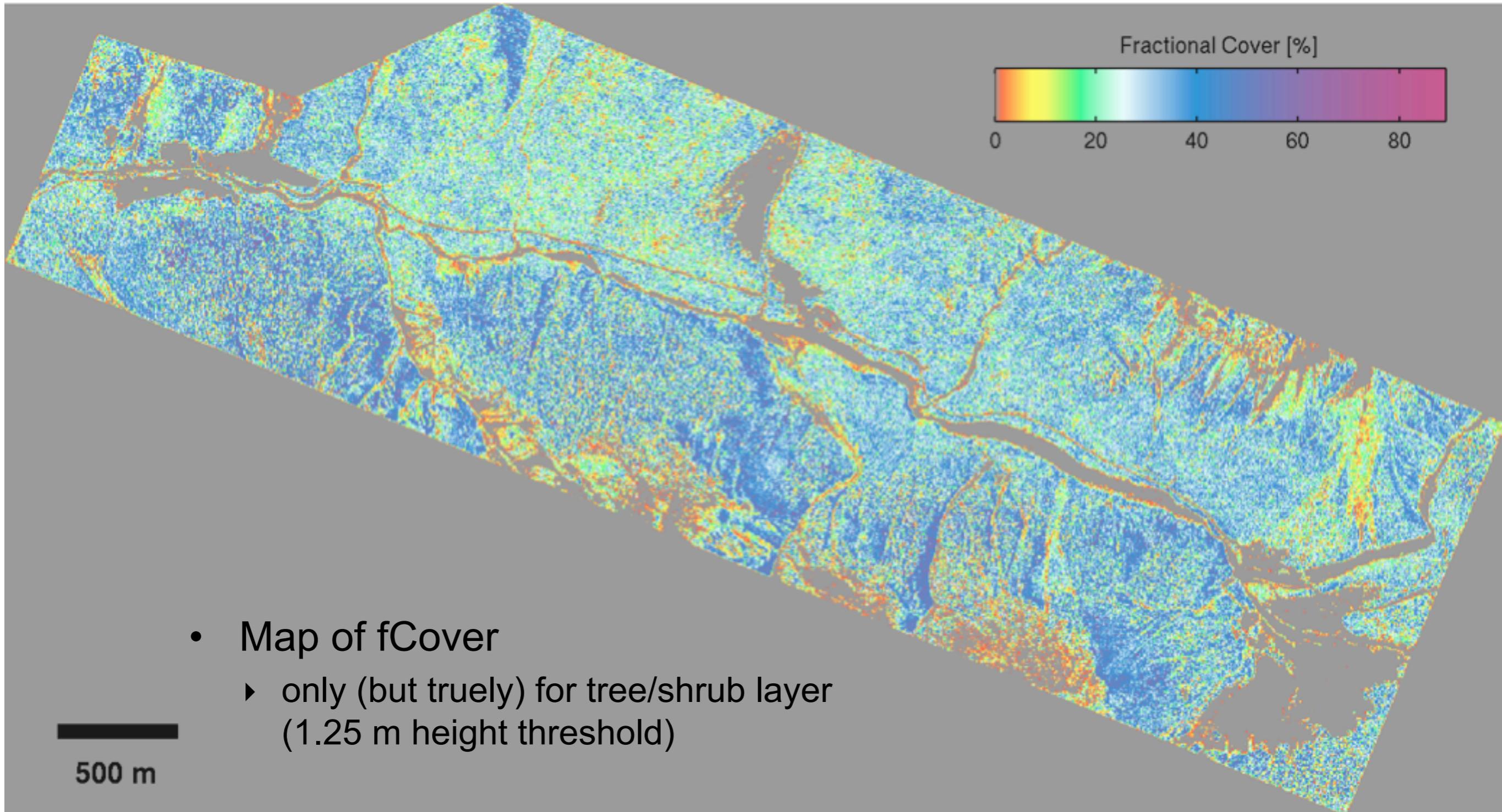
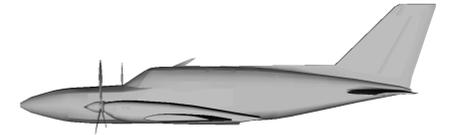


- R^2 for each correlation of “ground truth” and ALS estimates
- two parameters are varied
 - ▶ Zenith angle in hemispherical photograph
 - ▶ data trap size for ALS data selection to compute proxy
- High correlation at small scales (1-2 m)
 - ▶ good enough geolocation of both ALS and field data!



Morsdorf, F.; Kötz, B.; Meier, E.; Itten, K.I. & Allgöwer, B.
Estimation of LAI and fractional cover from small footprint airborne
laser scanning data based on gap fraction, *Remote Sensing of
Environment*, 2006, 3, 353-362

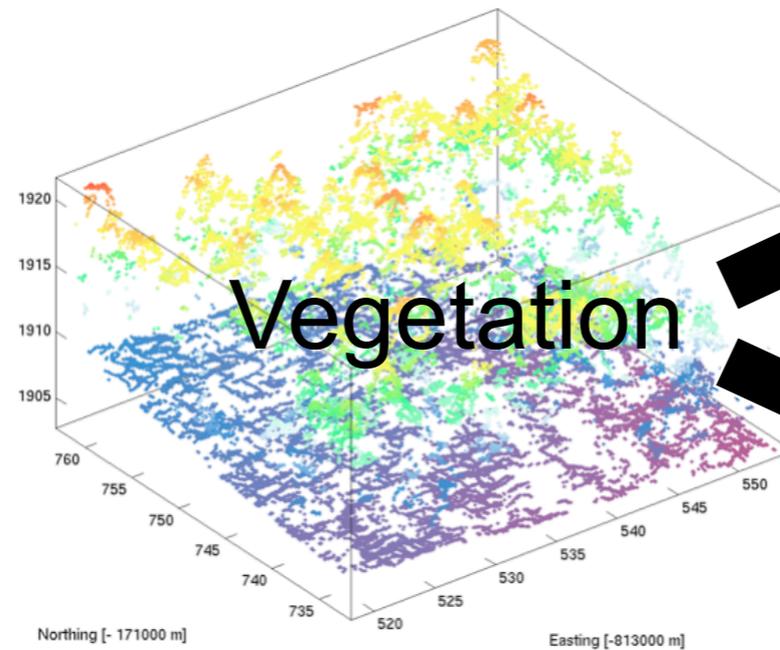
Canopy density - fractional cover



Application (1): Fire behaviour modelling

- Many relevant input layer for modelling fire behaviour can be derived from ALS data
- High spatial resolution of derived parameters
 - ▶ Sensitivity of fire behaviour model ?

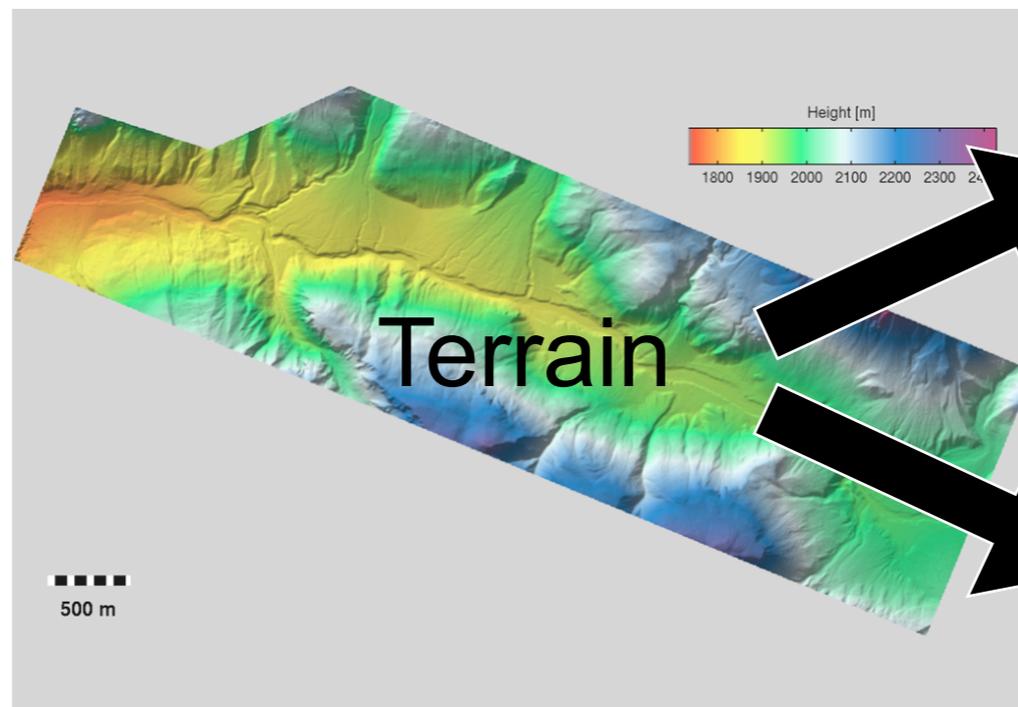
Level I products



Level II products

Density

Height

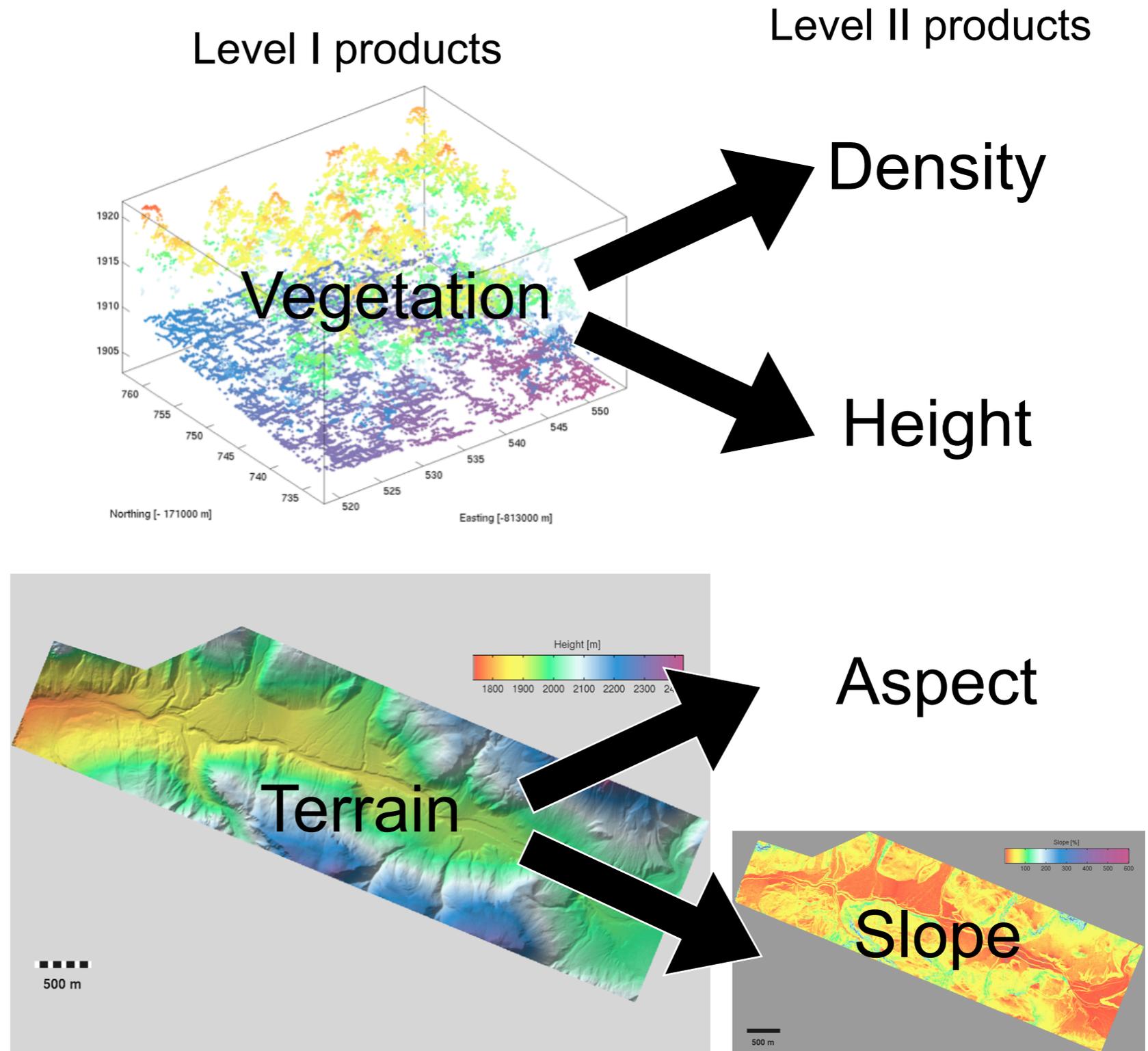


Aspect

Slope

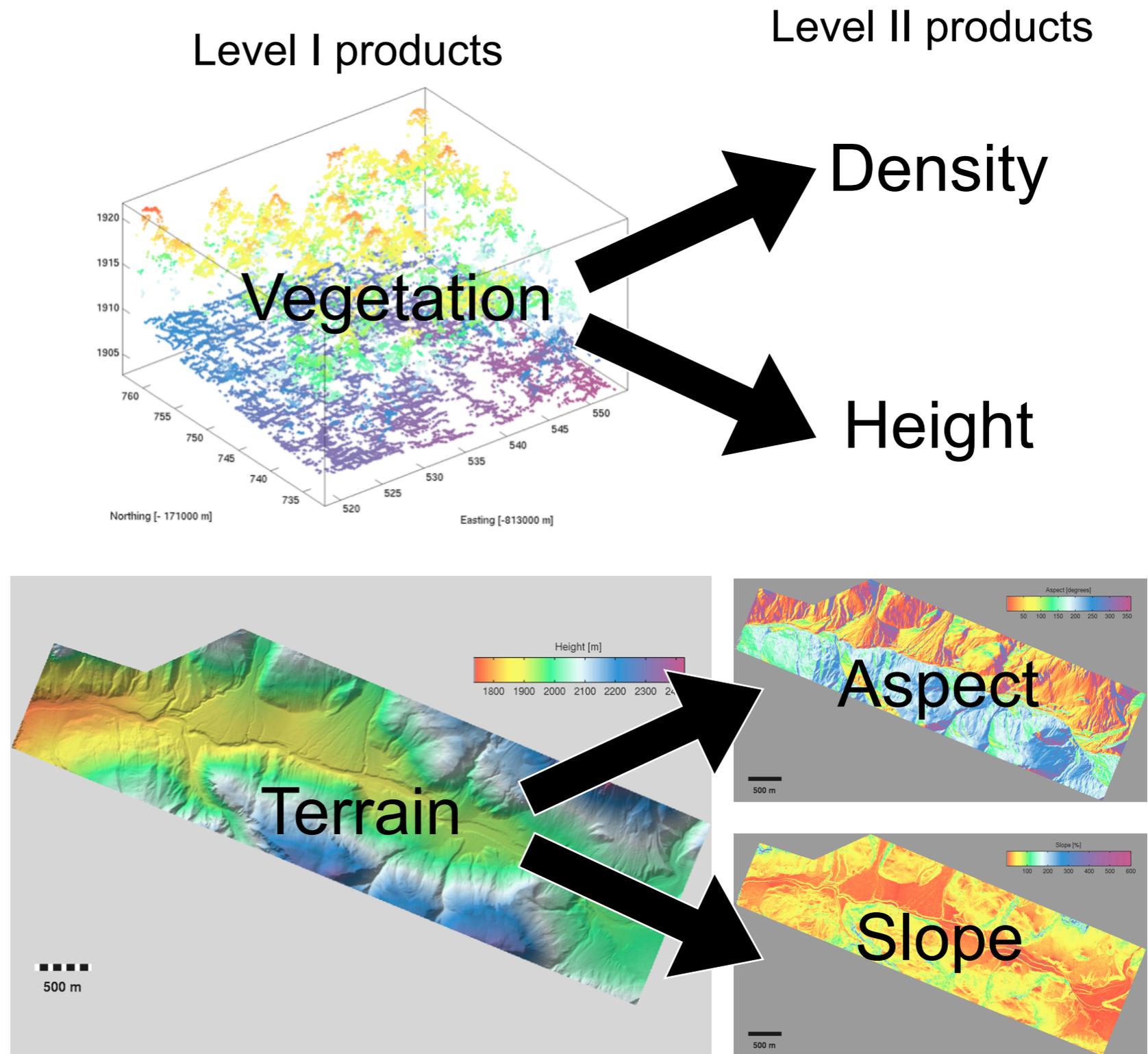
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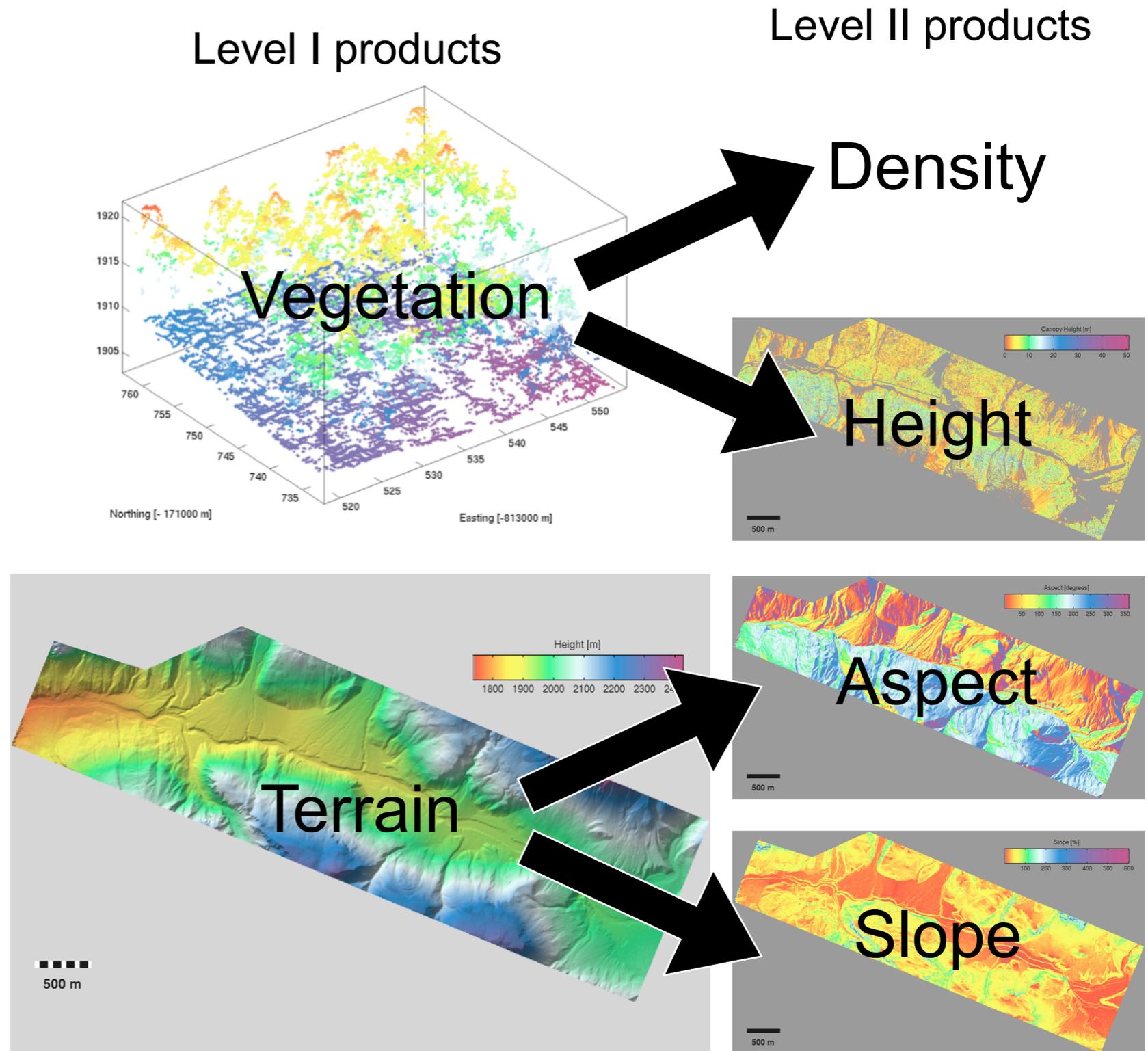
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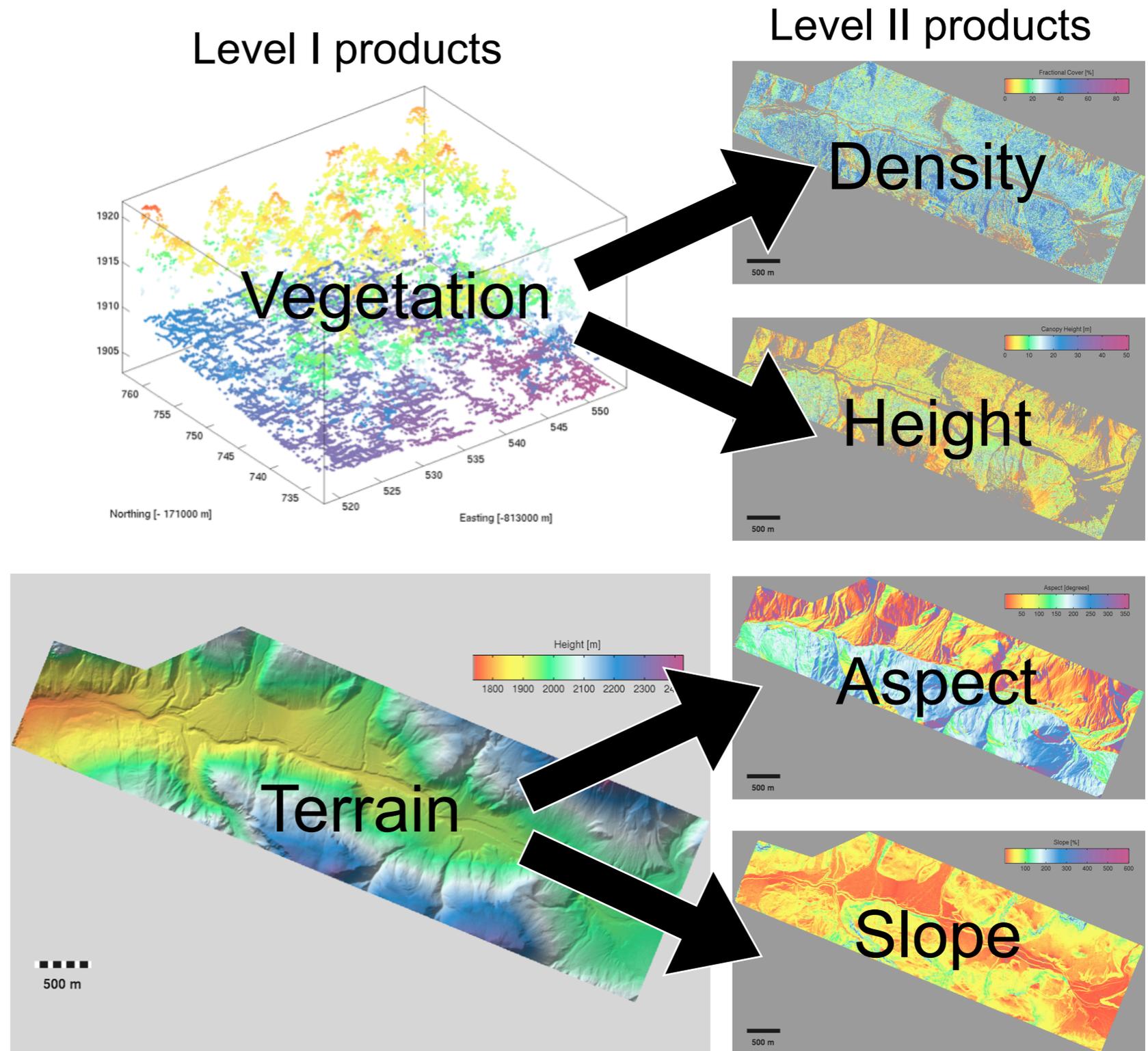
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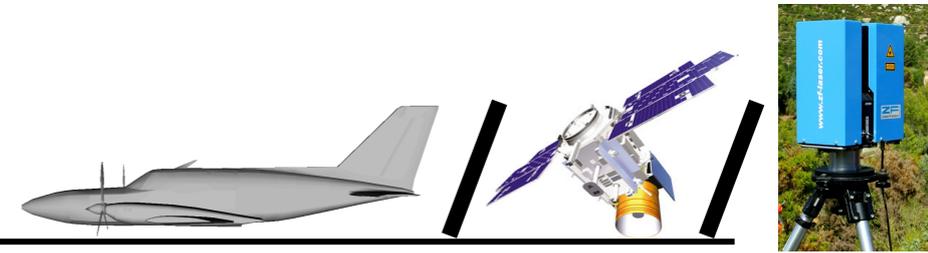


Application (1): Fire behaviour modelling

- Many relevant input layer for modelling fire behaviour can be derived from ALS data
- High spatial resolution of derived parameters
 - ▶ Sensitivity of fire behaviour model ?



Application (2) : RAMI

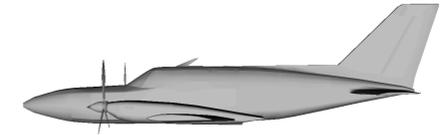


- Detailed virtual characterisation of an actual site (SNP)
 - ▶ ALS single tree reconstruction
 - ▶ Spectral characterisation of scene elements from field measurements
 - Needle, bark, soil (snow, understory)
- Structural models of trees and shoots
 - ▶ might not be correct for sub-species/site/age !
- Allows forward simulation of RS signals in a RTM
 - ▶ upscaling (leaf to canopy), validation, prototyping



<http://rami-benchmark.jrc.ec.europa.eu/>

ALS - Intensity



- LiDAR intensity should prove useful
 - ▶ no shadows, problem of radiometric calibration (almost) solved





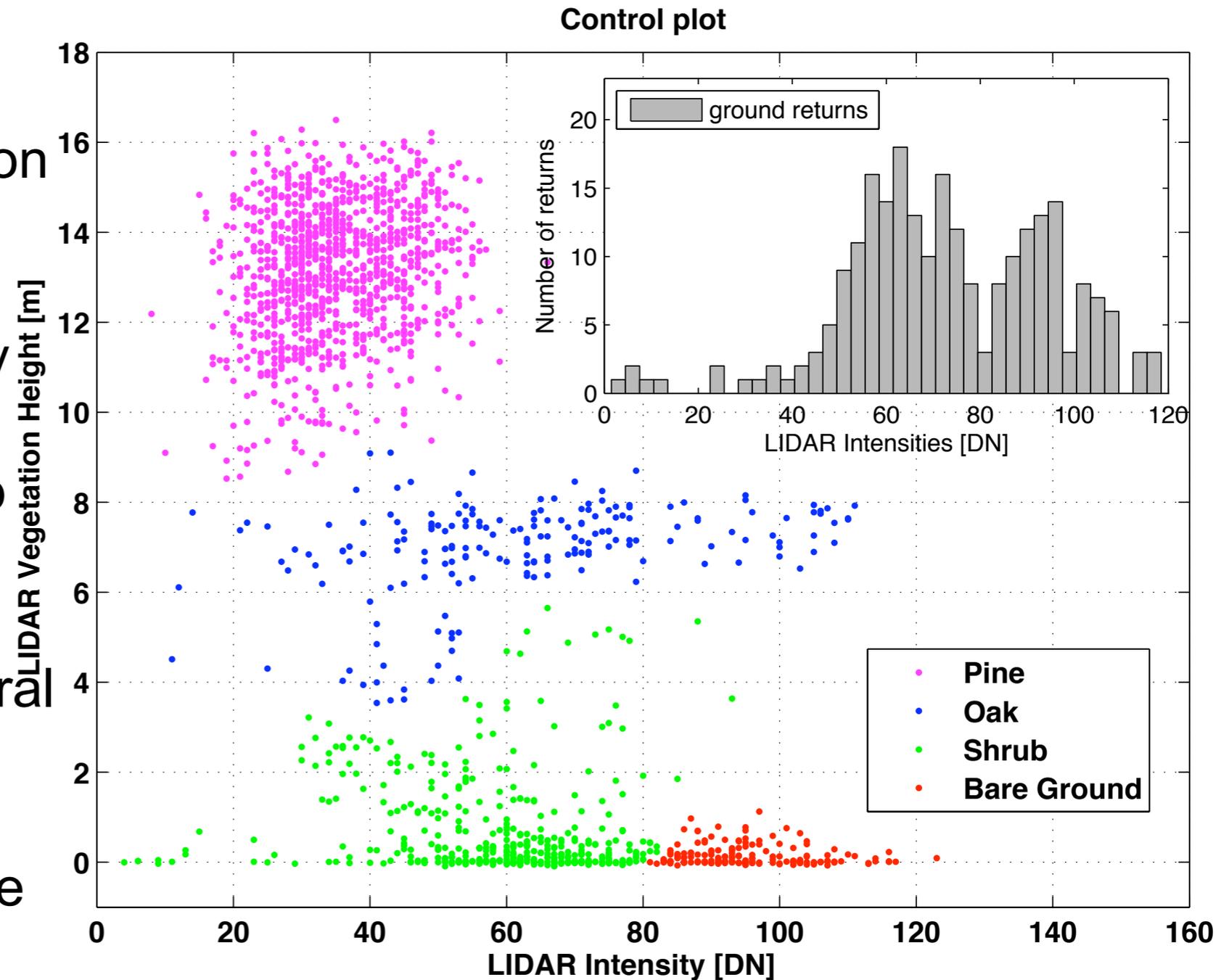
ALS - Intensity - Case study from southern France

- Three layered fire-prone ecosystem close to Lamanon, Provence
 - ▶ *pinus halepensis* (alleppo pine)
 - ▶ *quercus ilex* (holm oak)
 - ▶ *buxus sempervirens* (shrubs)
- Study site comprises four differently treated plots
 - ▶ 30x30 (40x30) with 15 m buffer zone
 - ▶ **control** - all species, untreated
 - ▶ **pine** - only pine
 - ▶ **oak** - only oak
 - ▶ **mixed** - oak and pine



Use of intensity for species discrimination

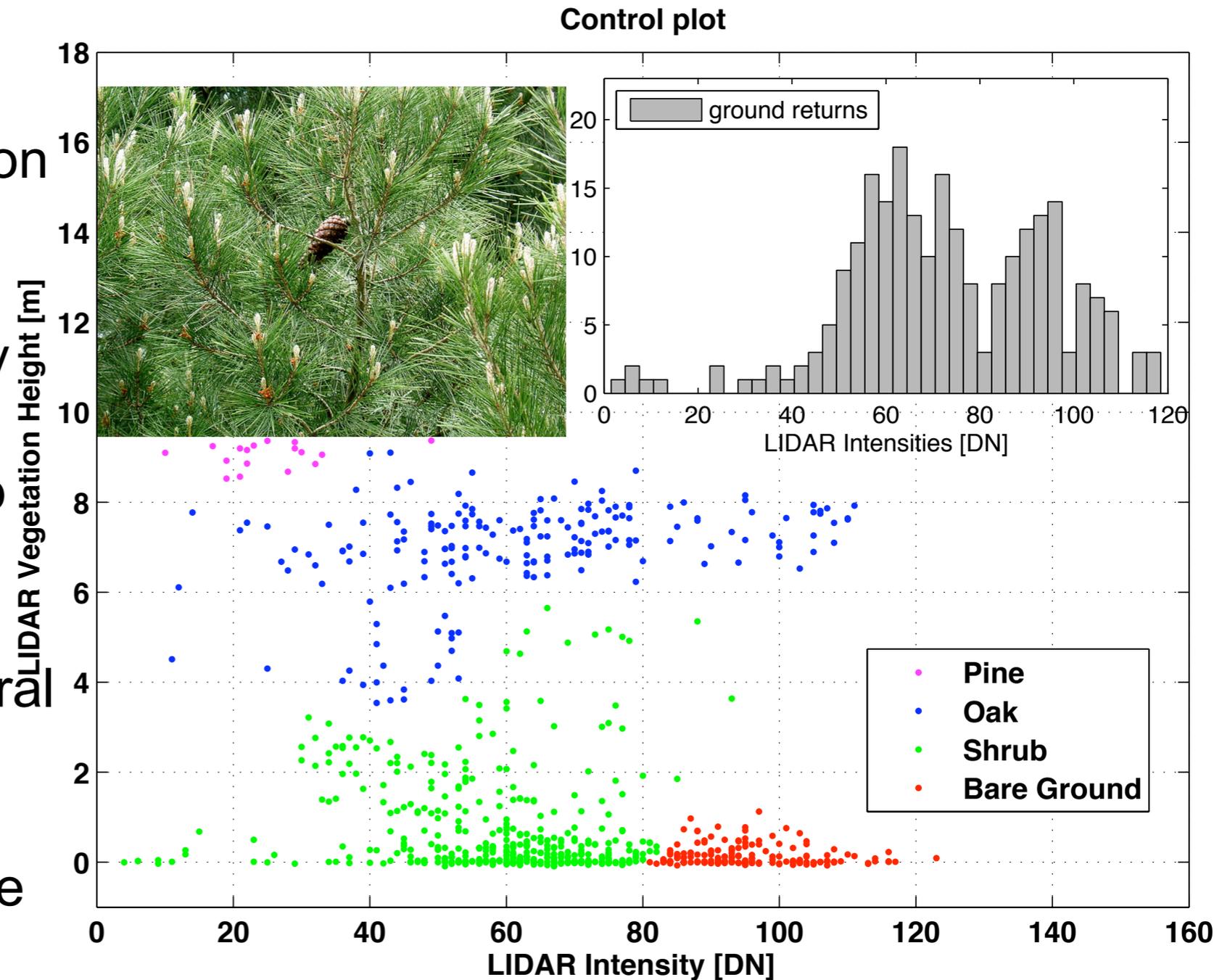
- Intensity as second feature for discrimination of vertical strata (species)
- Added value especially close to the ground
- Ability to monitor shrub clearings
- However, intensity is mixed signal of structural and reflectance properties
 - but then: this mixture can be species specific



Morsdorf, F.; Mårell, A.; Koetz, B.; Cassagne, N.; Rigolot, E. & Allgöwer, B.
Discrimination of vegetation strata in a multilayered Mediterranean forest ecosystem by height and intensity data from airborne laser scanning
Remote Sensing of Environment, 2010, 114, 1403-1415.

Use of intensity for species discrimination

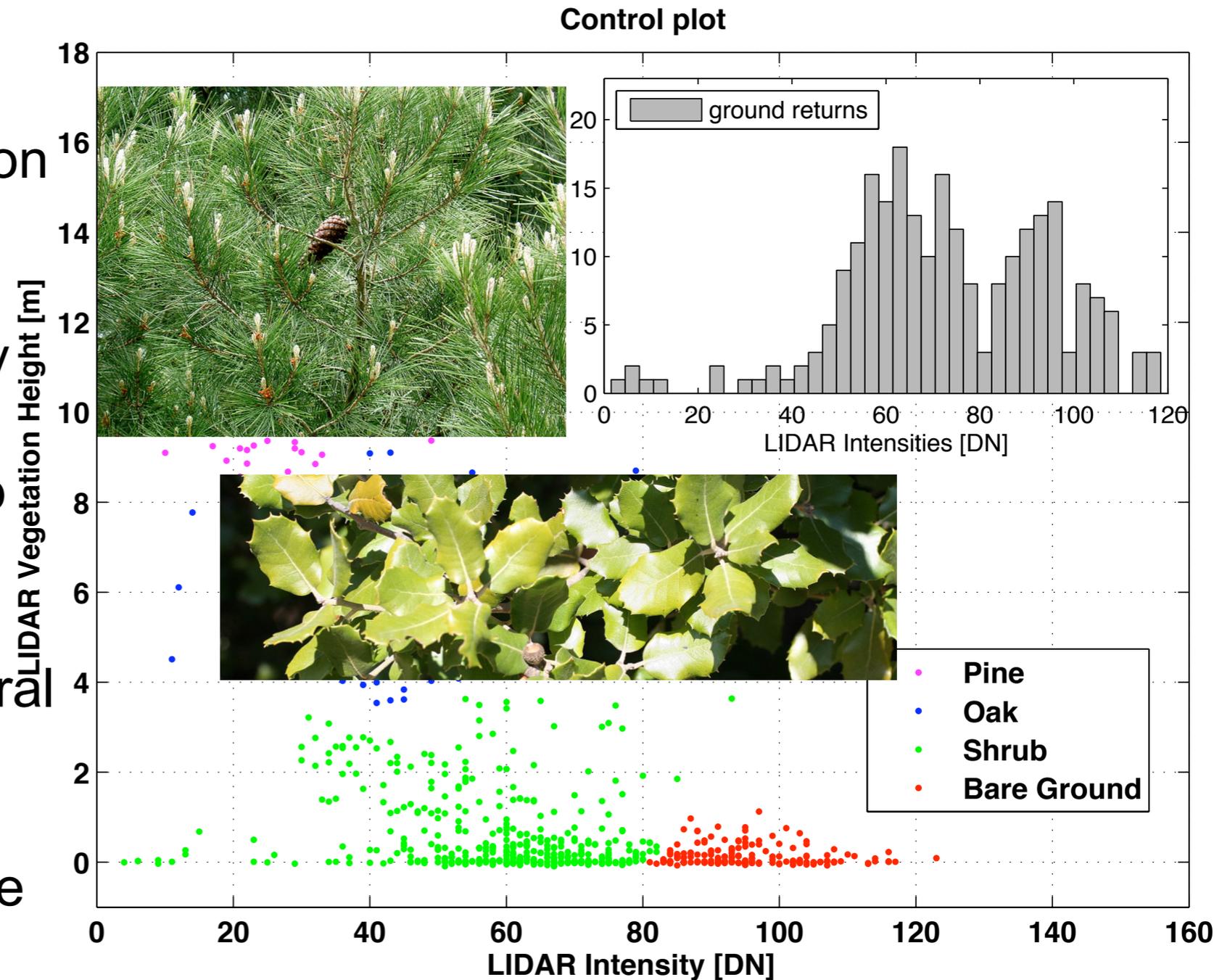
- Intensity as second feature for discrimination of vertical strata (species)
- Added value especially close to the ground
- Ability to monitor shrub clearings
- However, intensity is mixed signal of structural and reflectance properties
 - but then: this mixture can be species specific



Morsdorf, F.; Mårell, A.; Koetz, B.; Cassagne, N.; Rigolot, E. & Allgöwer, B.
Discrimination of vegetation strata in a multilayered Mediterranean forest ecosystem by height and intensity data from airborne laser scanning
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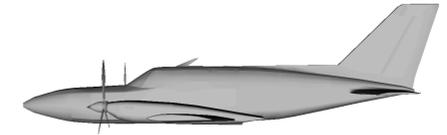


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Recent developments



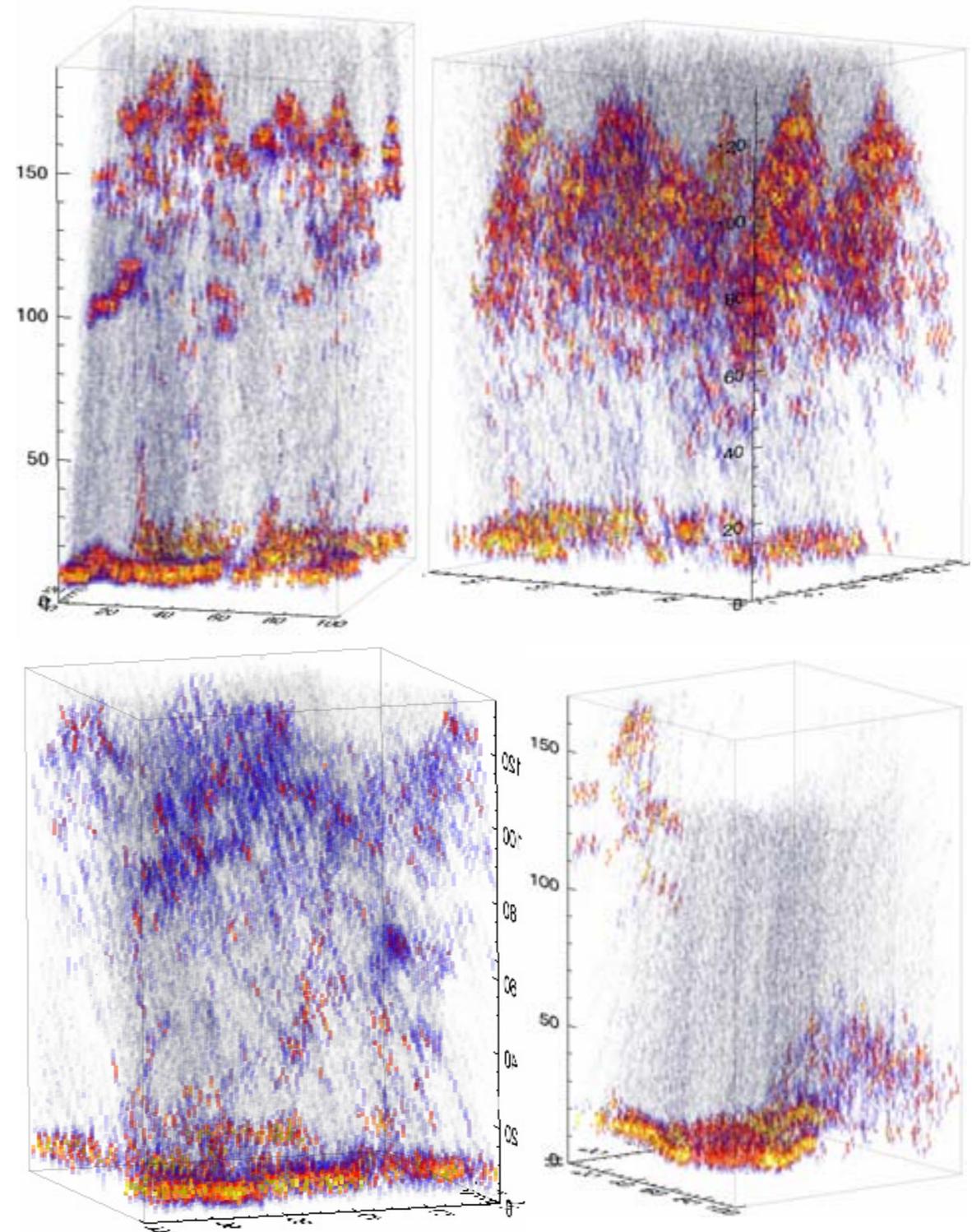
ALS - full waveform



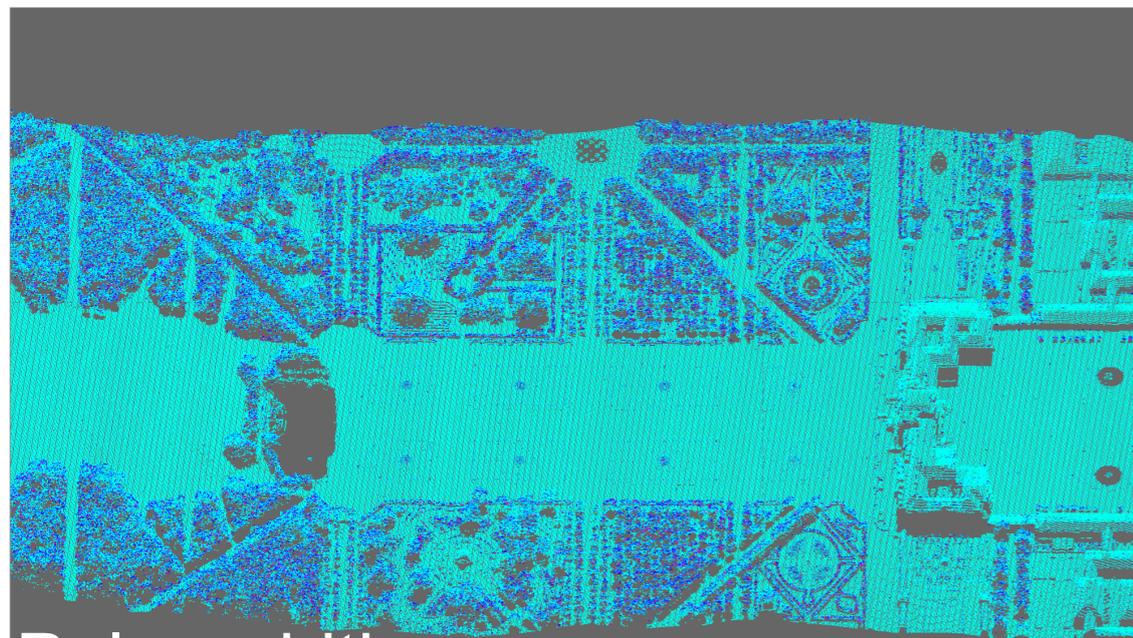
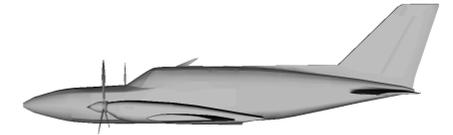
- Higher information content
- Amount of data and it's processing is a tough task
 - ▶ Waveform will be recorded along arbitrary lines in 3d space
- First processing attempts were focused on the detection of additional echos
- Cross section is the physical property that can be derived

$$\sigma = \frac{4\pi}{\Omega} \rho A_s$$

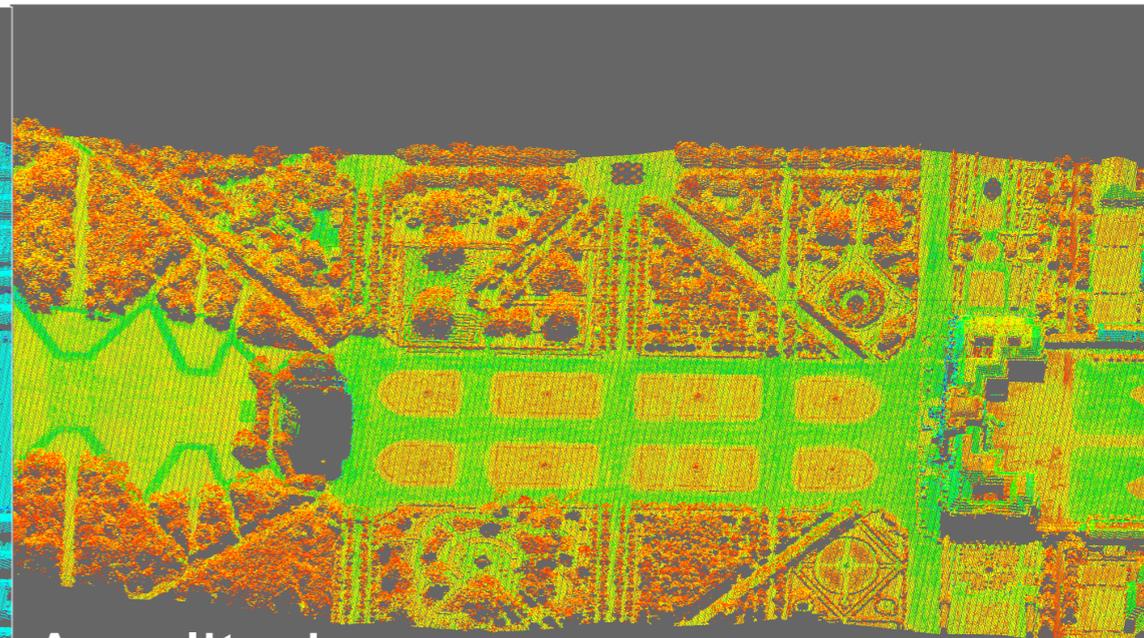
Persson; Söderman, U.; Töpel, J. & Ahlberg, S.
Visualization and analysis of full-waveform airborne laser scanner data
International Archives of Photogrammetry and Remote Sensing, 2005, XXXVI



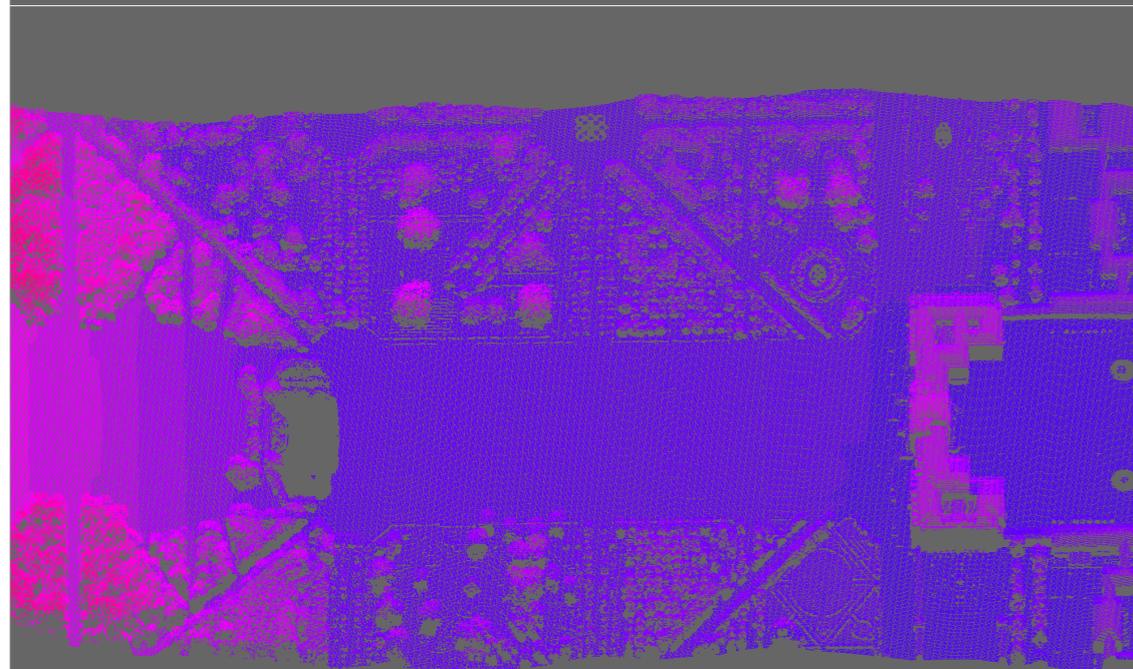
ALS - full waveform (Wagner et al., 2008)



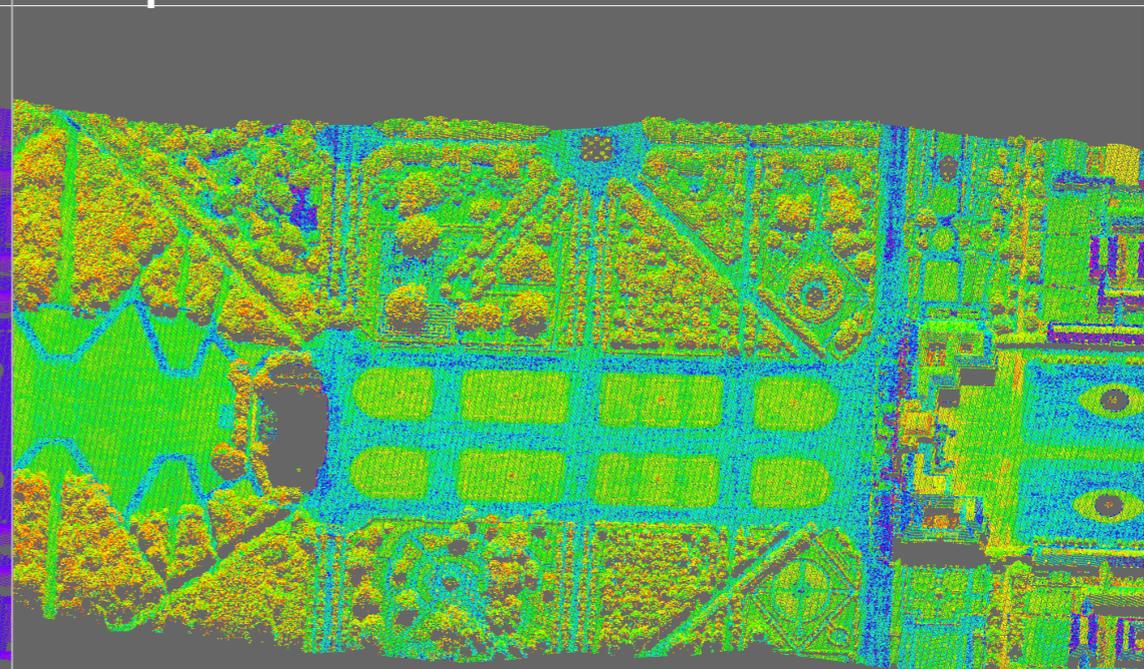
Pulse width



Amplitude



Range



Cross section

Wagner, W.; Hollaus, M.; Briese, C. & Ducic, V. 3D vegetation mapping using small-footprint full-waveform airborne laser scanners. *International Journal of Remote Sensing*, Taylor & Francis, 2008, 29, 1433-1452

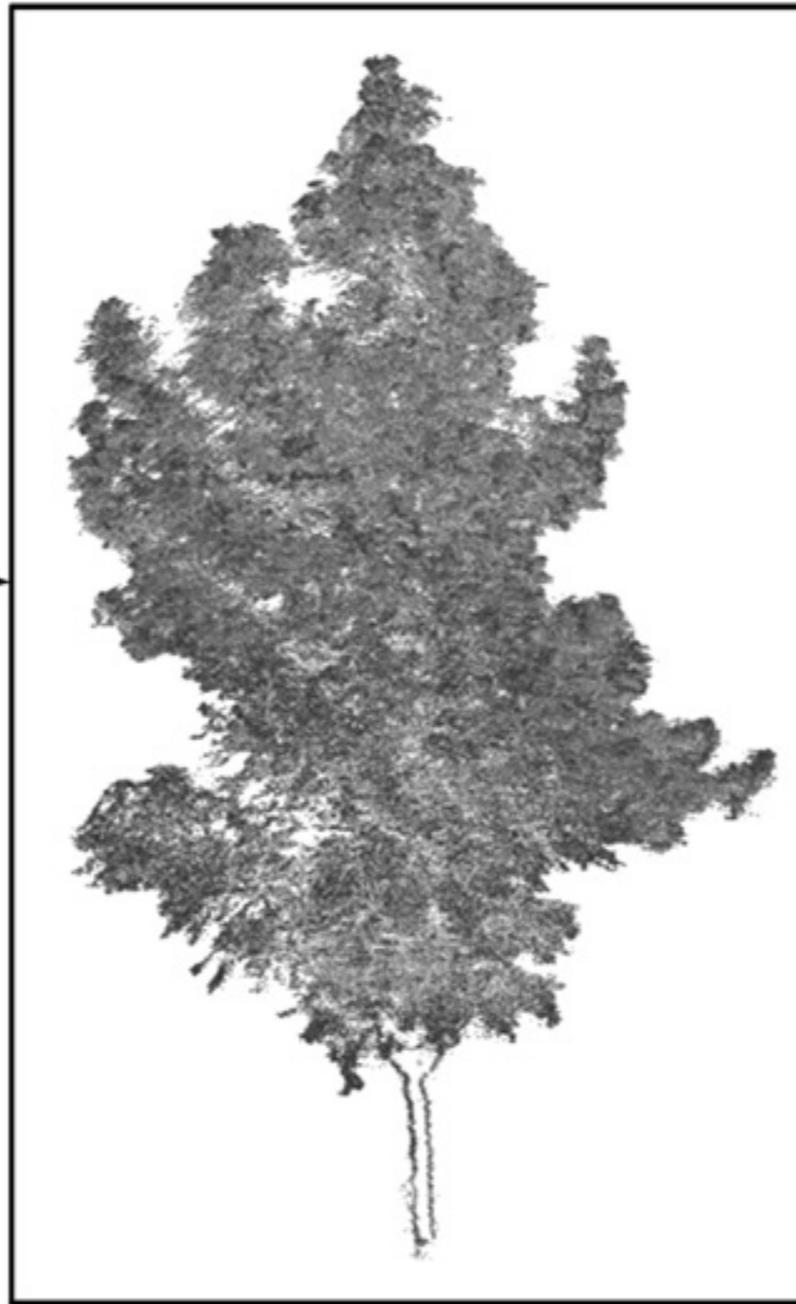
How to generate data for RT models - TLS



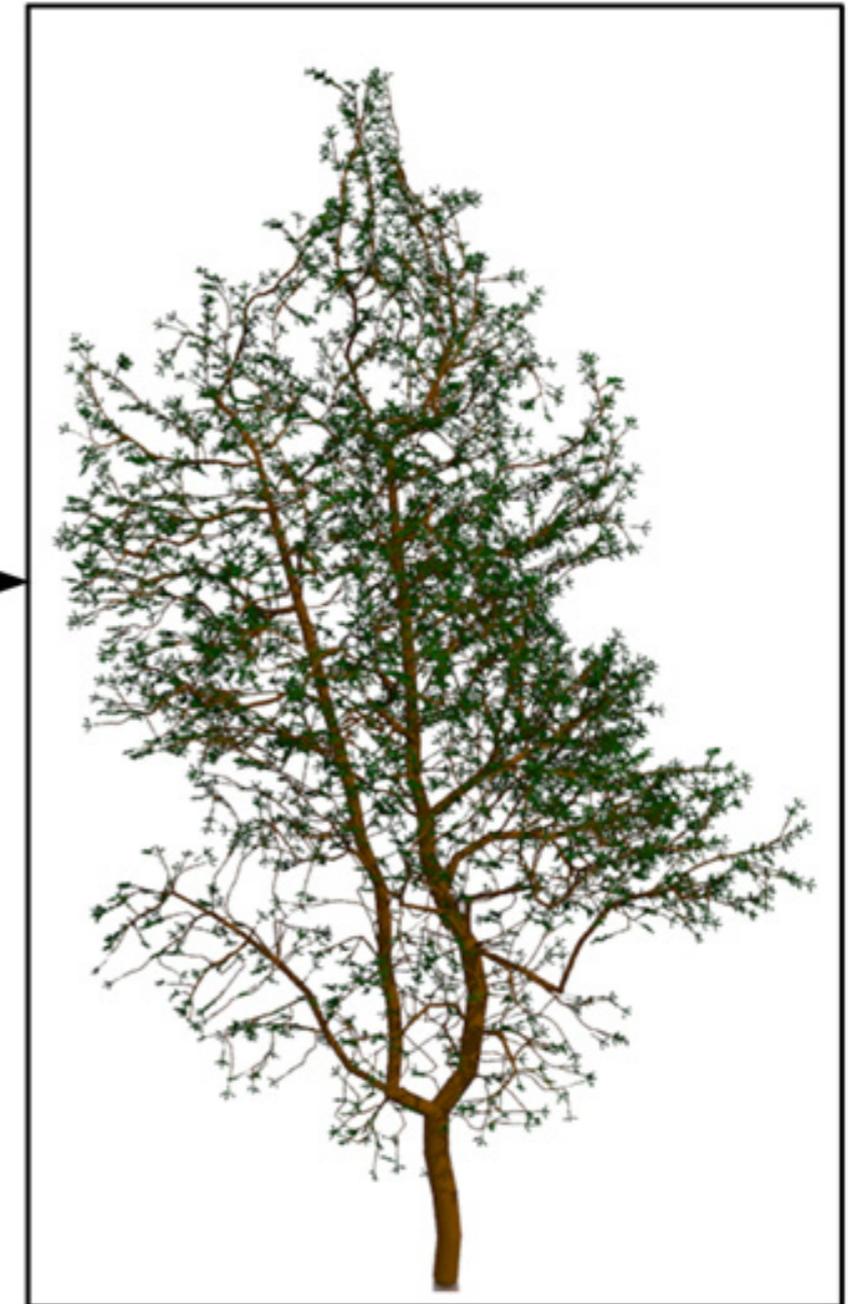
In Situ Tree



3D Point Cloud

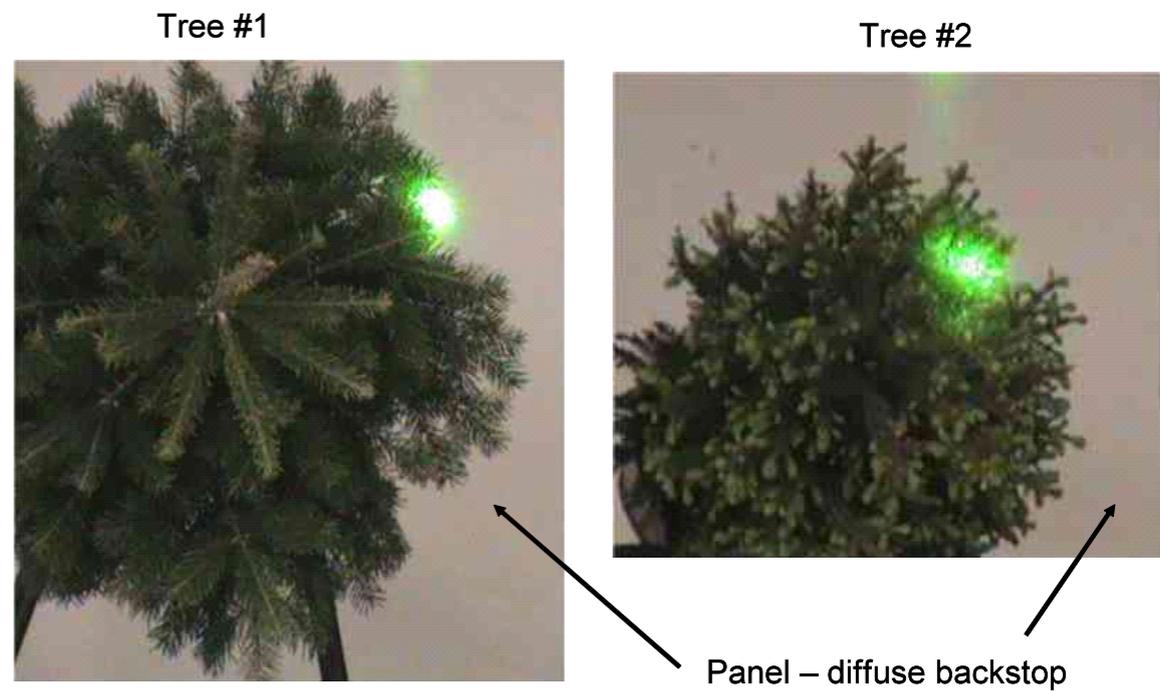
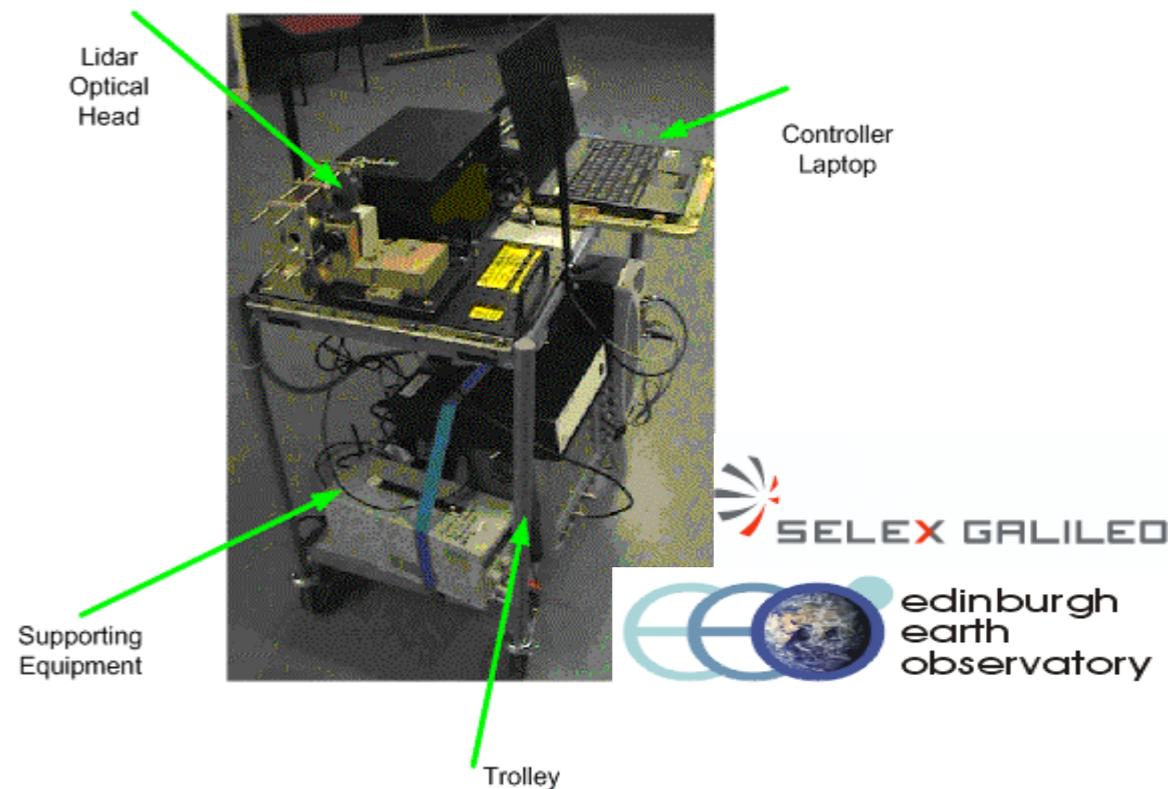
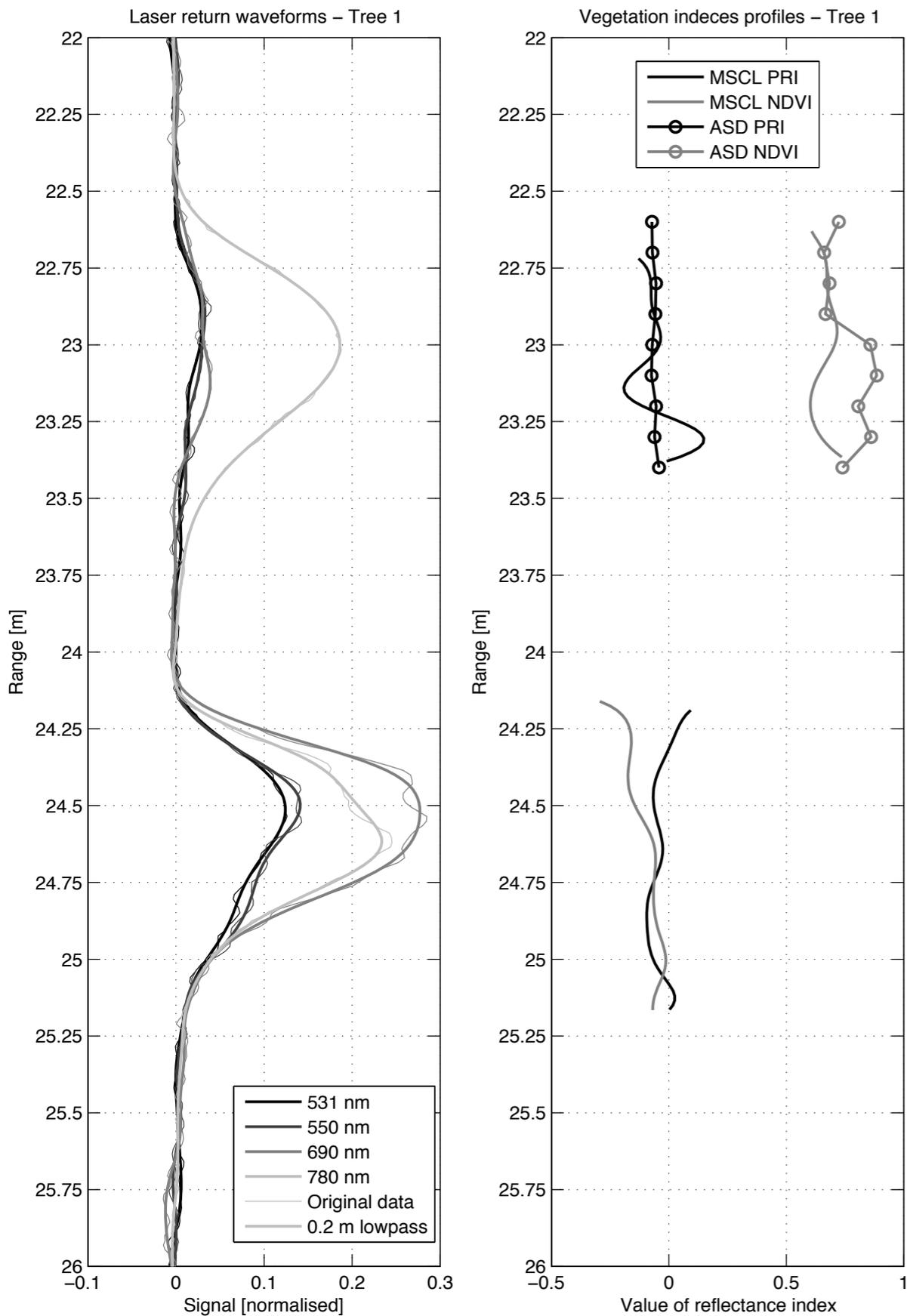


Tree Model



Côté, J.-F.; Widlowski, J.-L.; Fournier, R. A. & Verstraete, M. M.
The structural and radiative consistency of three-dimensional tree reconstructions from terrestrial lidar
Remote Sensing of Environment, **2009**, 113, 1067 - 1081

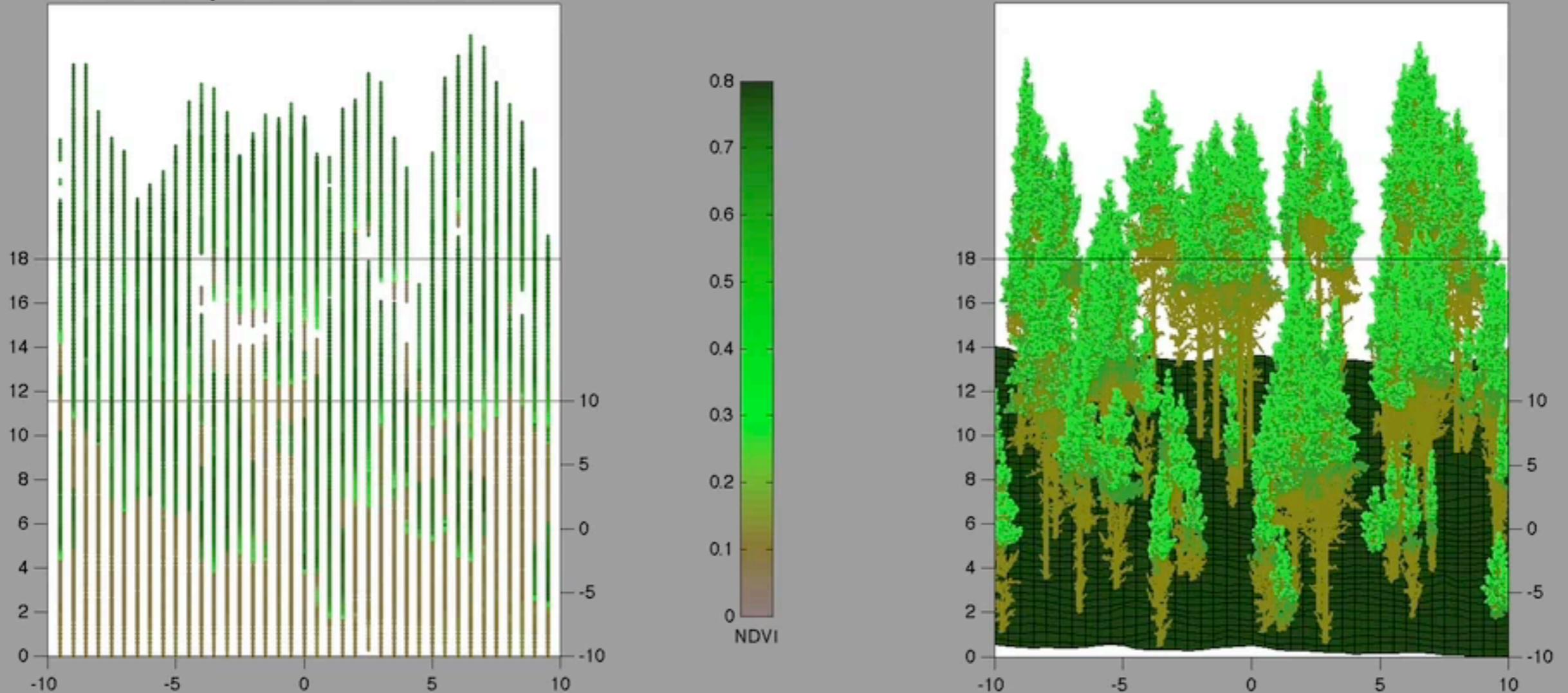
MSL - Multi-Spectral LiDAR



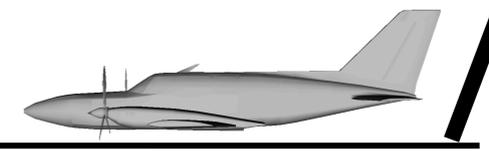
Woodhouse, Tharandt, 9-10 September 2010. A Multi Spectral Canopy Lidar Demonstrator Project, Iain H Woodhouse, Caroline Nichol, Peter Sinclair, Jim Jack, Felix Morsdorf, Tim Malthus, Genevieve Patenaude, 2010, Transactions in Geoscience and Remote Sensing, in review.

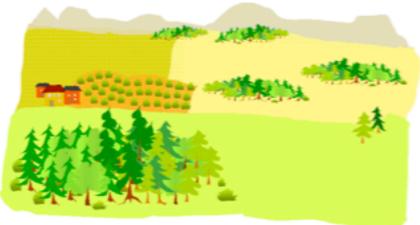
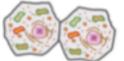
Simulation: an airborne multi-spectral canopy LiDAR (MSCL)

Morsdorf, F.; Nichol, C.; Malthus, T. & Woodhouse, I.H. Modelling multi-spectral LIDAR vegetation backscatter - assessing structural and physiological information content, *Remote Sensing of Environment*, **2009**, 113, 2152-216.

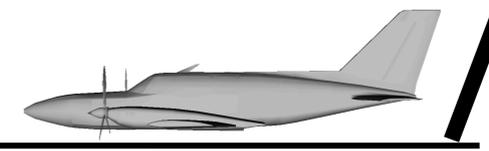


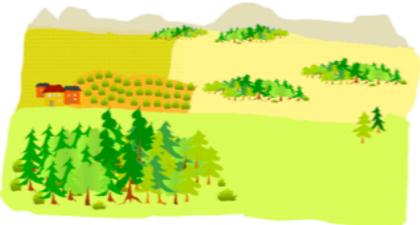
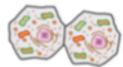
Summing up - scales



Fuel scales / levels	For which fire behaviour model?	Which data acquisition method?	For which purpose?
 Landscape (2D/3D)	<ul style="list-style-type: none"> Farsite Fire line rotation model 	<ul style="list-style-type: none"> Satellite images Aerial photos Imaging spectroscopy 	<ul style="list-style-type: none"> Fuel type maps Ignition risk models Risk maps Spatial distribution of landscape elements
 Stand (2D/3D)	<ul style="list-style-type: none"> Behave Fire line rotation model Firetec 3D Canadian Model McArthur danger meter 	<ul style="list-style-type: none"> Stand inventory and mapping Aerial photos LIDAR Imaging spectroscopy 	<ul style="list-style-type: none"> Input parameters for fire behavior models Fuel type characterisation Experimental burns
 Groups, WUI (2D/3D)	<ul style="list-style-type: none"> Firestar 2D (x,z) Firetec 3D NIST 	<ul style="list-style-type: none"> Stand inventory and mapping Aerial photos LIDAR Imaging spectroscopy 	<ul style="list-style-type: none"> Input parameters for fire behavior models 3D fuel structures Biophysical parameters
 Individuals (3D)	<ul style="list-style-type: none"> Firestar 2D (x,z) Firetec 3D CFIS 	<ul style="list-style-type: none"> Cube method Field sampling Ground truth 	<ul style="list-style-type: none"> Input parameters for fire behavior models Fire danger rating system (FMC) Structural & biophysical parameters
 Particles	<ul style="list-style-type: none"> Firestar 2D (x,z) 	<ul style="list-style-type: none"> Cube method Field sampling 	<ul style="list-style-type: none"> Input parameters for fire behavior models Structural & biophysical parameters
 Cells	...	<ul style="list-style-type: none"> Biochemical analysis 	<ul style="list-style-type: none"> Input parameters for fire behavior models Combustion behavior

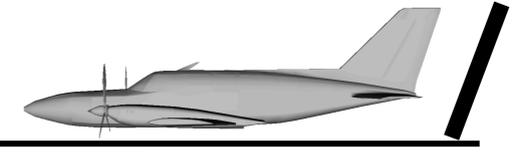
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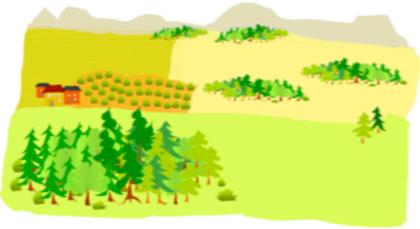
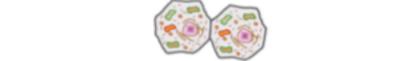


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Airborne laser scanning
ALS

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Airborne laser scanning

ALS

Terrestrial laser scanning

TLS

Summary

- Tree geometry and vegetation density can be derived from ALS
- Accuracy of the methods presented are **at least** on the level of traditional field work
 - ▶ Validation problem - in theory some ALS based methods may perform better, but how prove it?
- ALS and TLS can provide complementary structural information across a range of scales
 - ▶ but to fully exploit this potential, additional research is needed
 - ▶ e.g. by the integration of structural information derived from ALS and TLS with spectral information and tree models, to be used with RTM ...
 - ... to simulate RS signals - a powerful tool for:
 - ▶ Sensor prototyping (e.g. MSCL)
 - ▶ Product validation (see above)

Outlook

Outlook

- Challenges

- ▶ automatic extraction of semantic information from point cloud data
- ▶ implementation/validation of methods for higher level products
 - RT is needed to fully understand and exploit full-waveform data
- ▶ e.g. LAI (PAI) from TLS
- ▶ parameterization of sub-scale processes in RT, measurements needed!

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 - ▶ implementation/validation of methods for higher level products
 - RT is needed to fully understand and exploit full-waveform data
 - ▶ e.g. LAI (PAI) from TLS
 - ▶ parameterization of sub-scale processes in RT, measurements needed!
- Opportunities
 - ▶ including ALS intensity and full-waveform information
 - e.g. species discrimination
 - ▶ multi-spectral TLS for true LAI estimation
 - ratio of leafy/woody components
 - ▶ RT and ALS/TLS based characterisation of actual scenes for upscaling

Thank you for your attention!

