

# Close-range sensing and object-based analysis of shallow landslides and erosion in grasslands of the Alps

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# Introduction

## Shallow erosion in grassland of the Alps

- Mechanical erosion of grass cover and soil
- Depth approx. 0.2 – 2 m
- Eroded areas of c. 10 – 100 m<sup>2</sup> (individual patches)
- Often large number of eroded areas at a particular slope
- Processes:
  - Shallow landslides
  - Abrasion by snow gliding and avalanches



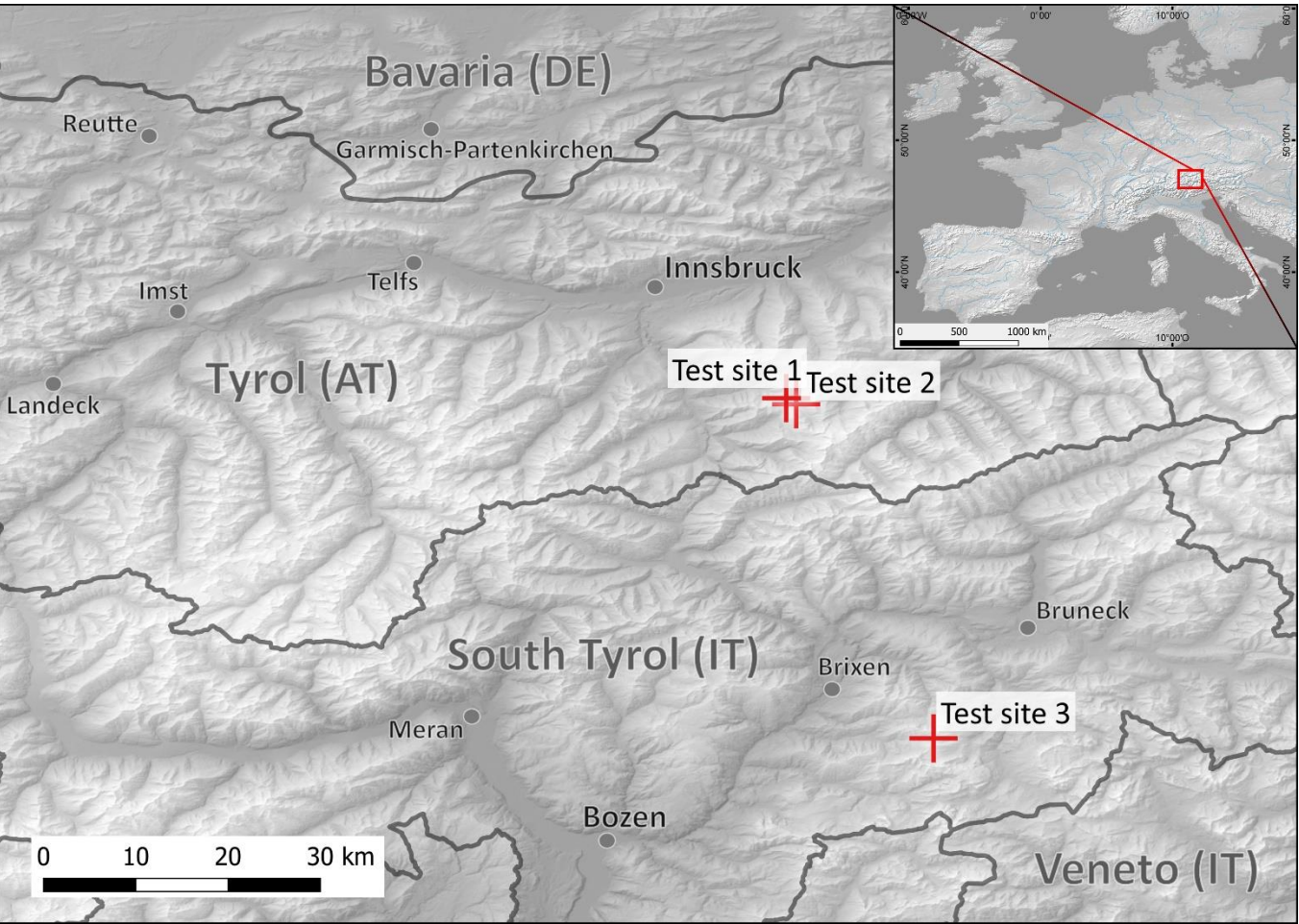
### **Investigation of shallow erosion in grassland of the Alps**

1. Mapping and quantification of eroded areas and their dynamics
2. Process understanding and possibilities for mitigation

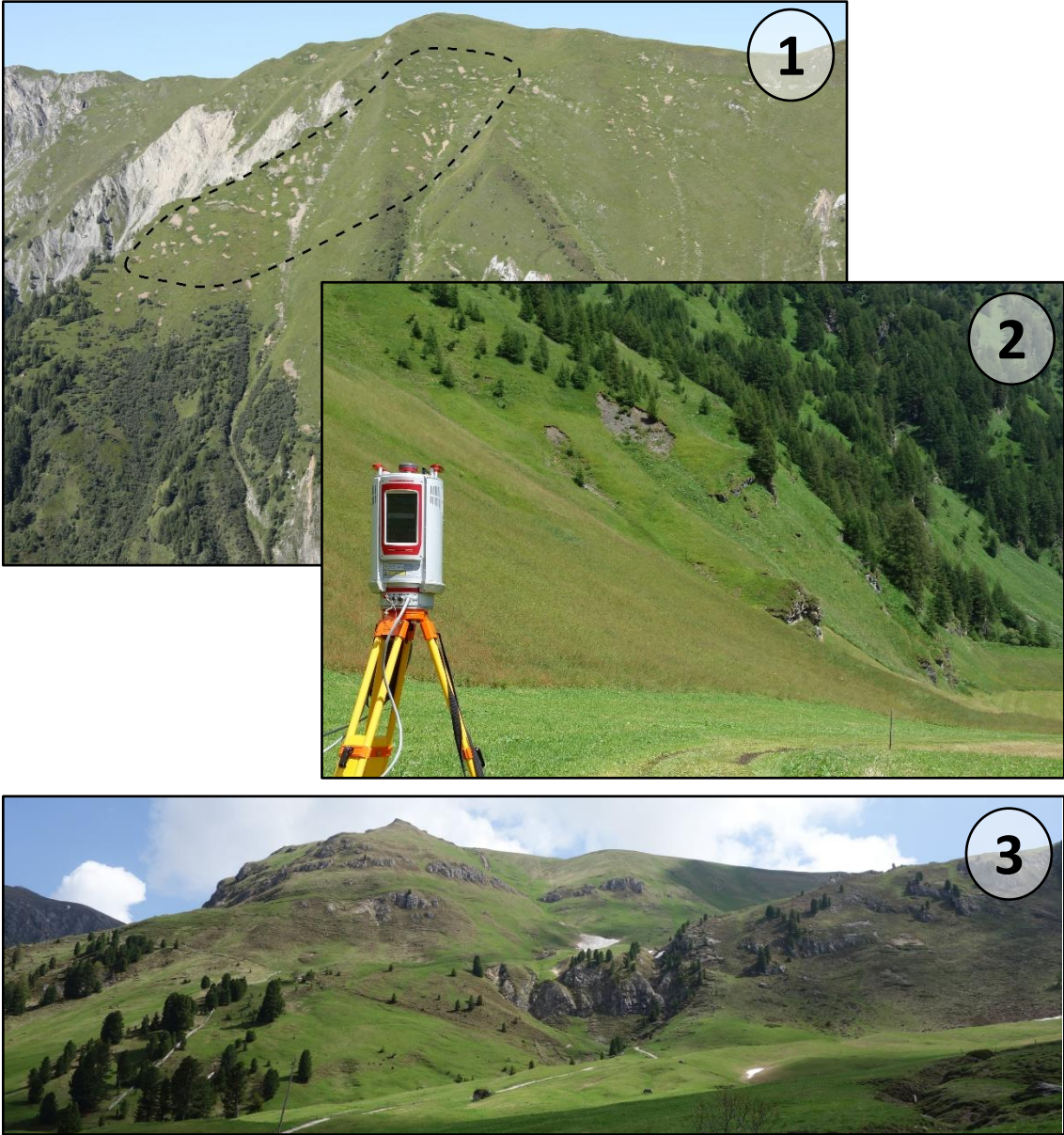
1. Mapping eroded areas using ground-based photography
2. 3D landslide monitoring with terrestrial laser scanning
3. Unmanned aerial vehicle laser scanning for erosion monitoring



# Test sites



Map data sources: Elevation model: Copernicus Land Monitoring Service 2020; small shaded relief map: Natural Earth 2020; administrative region boundaries: Autonomous Province of Bozen - South Tyrol 2017.





# 1. Mapping eroded areas using ground-based photography

Mayr et al. 2016. *ISPRS Annals of the Photogrammetry, Remote Sensing and Spatial Information Sciences*, III-5, 137 – 144.



## Data acquisition

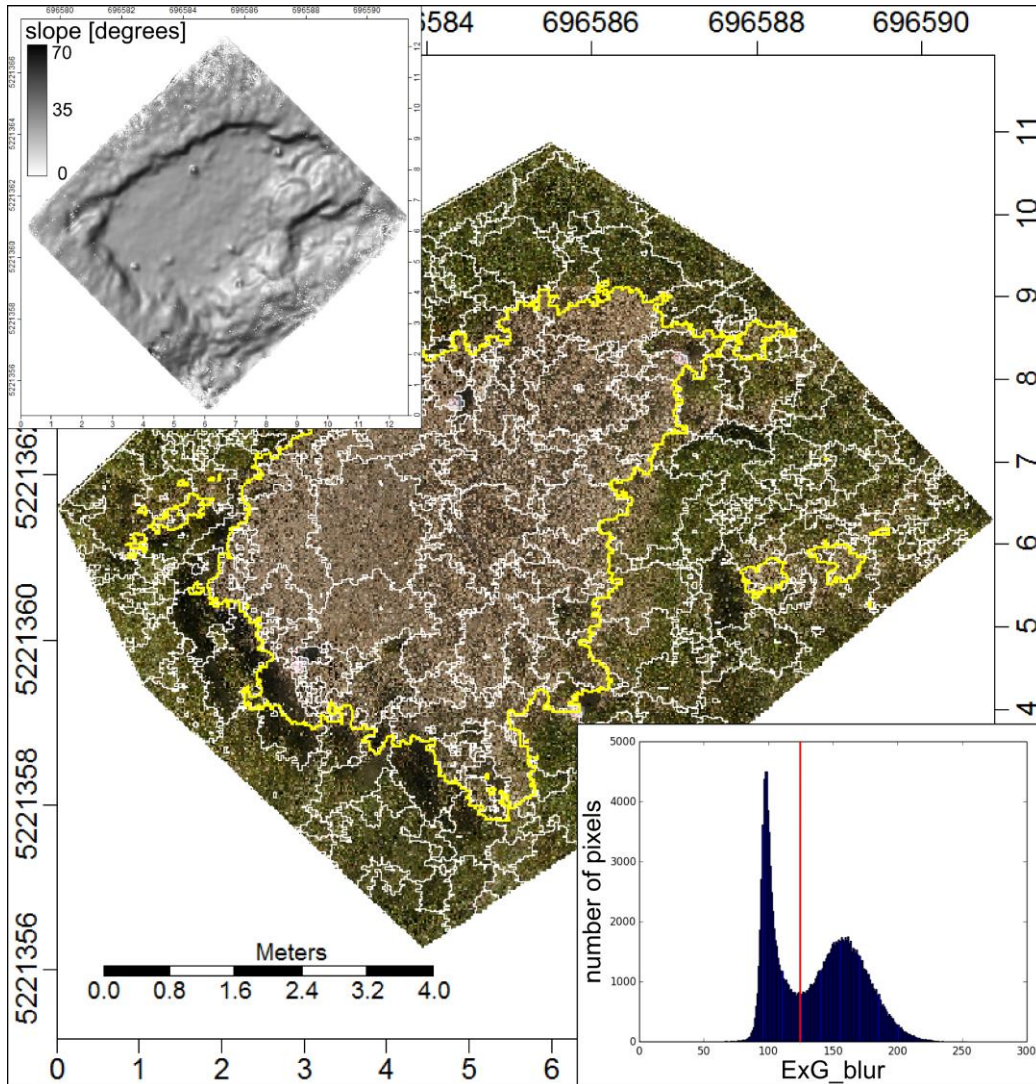
- 10 scenes with one eroded area each
- Pole-mounted DSLR camera
- 4 ground control points (measured with DGNSS)
- > 100 oblique images per scene shot from around the eroded area

## Image matching

- SfM-MVS
- Point cloud and orthophoto generation (2 cm GSD)

# 1. Mapping eroded areas using ground-based photography

Mayr et al. 2016. *ISPRS Annals of the Photogrammetry, Remote Sensing and Spatial Information Sciences*, III-5, 137 – 144.



## Orthophoto classification (OBIA)

- Classes *eroded* and *grass*
- Segmentation by seeded region growing
- ExG vegetation index calculated from RGB bands
- Unsupervised classification by histogram-based thresholding of  $ExG_{mean}$
- Validation with manual boundary delineation

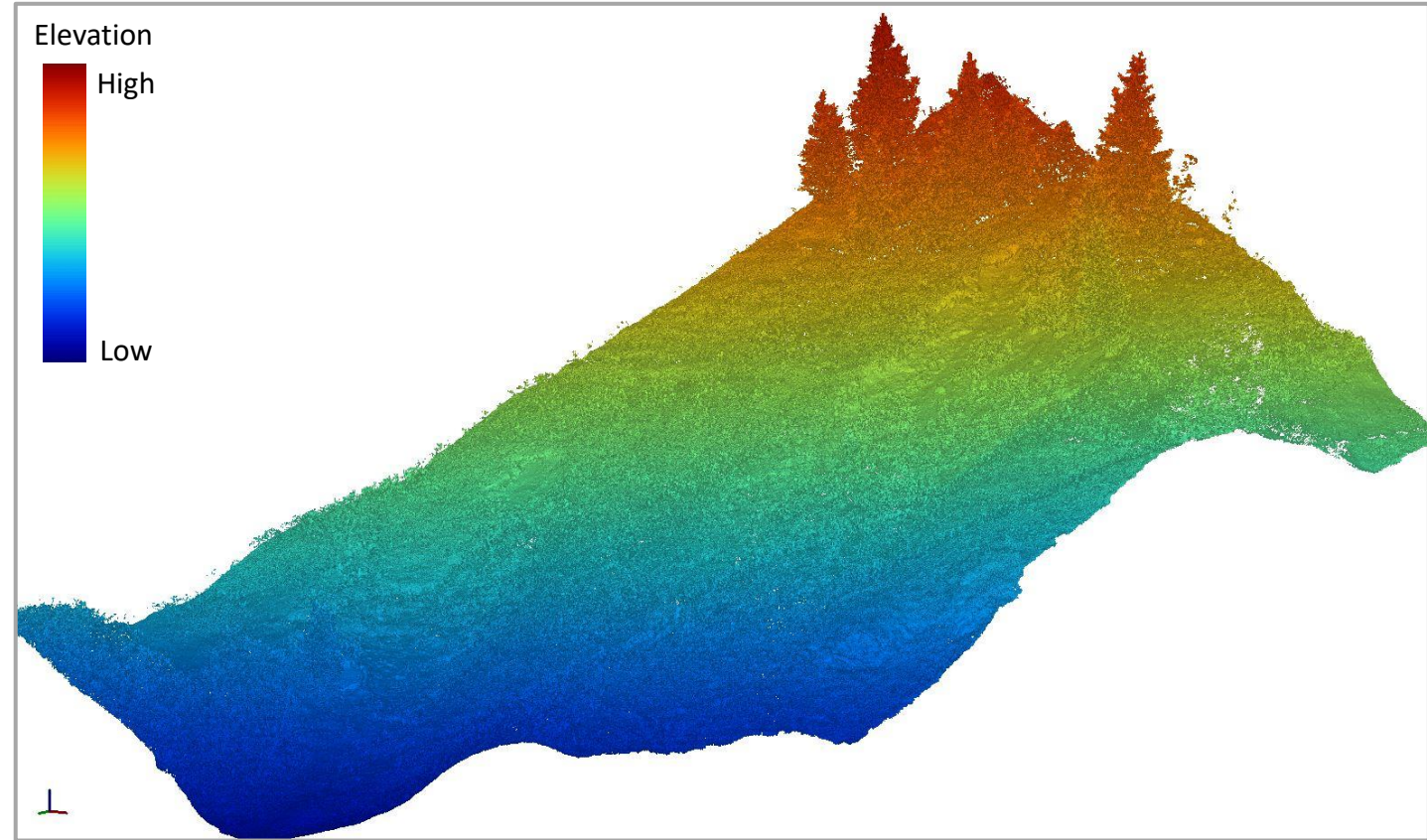
## Results

- Classification accuracy > 90% (OA)
- Main uncertainties:
  - Gradual transitions at eroded area boundaries
- Useful for validation of eroded area mapping in aerial orthophotos



## 2. 3D landslide monitoring with terrestrial laser scanning

Interpretability of data?

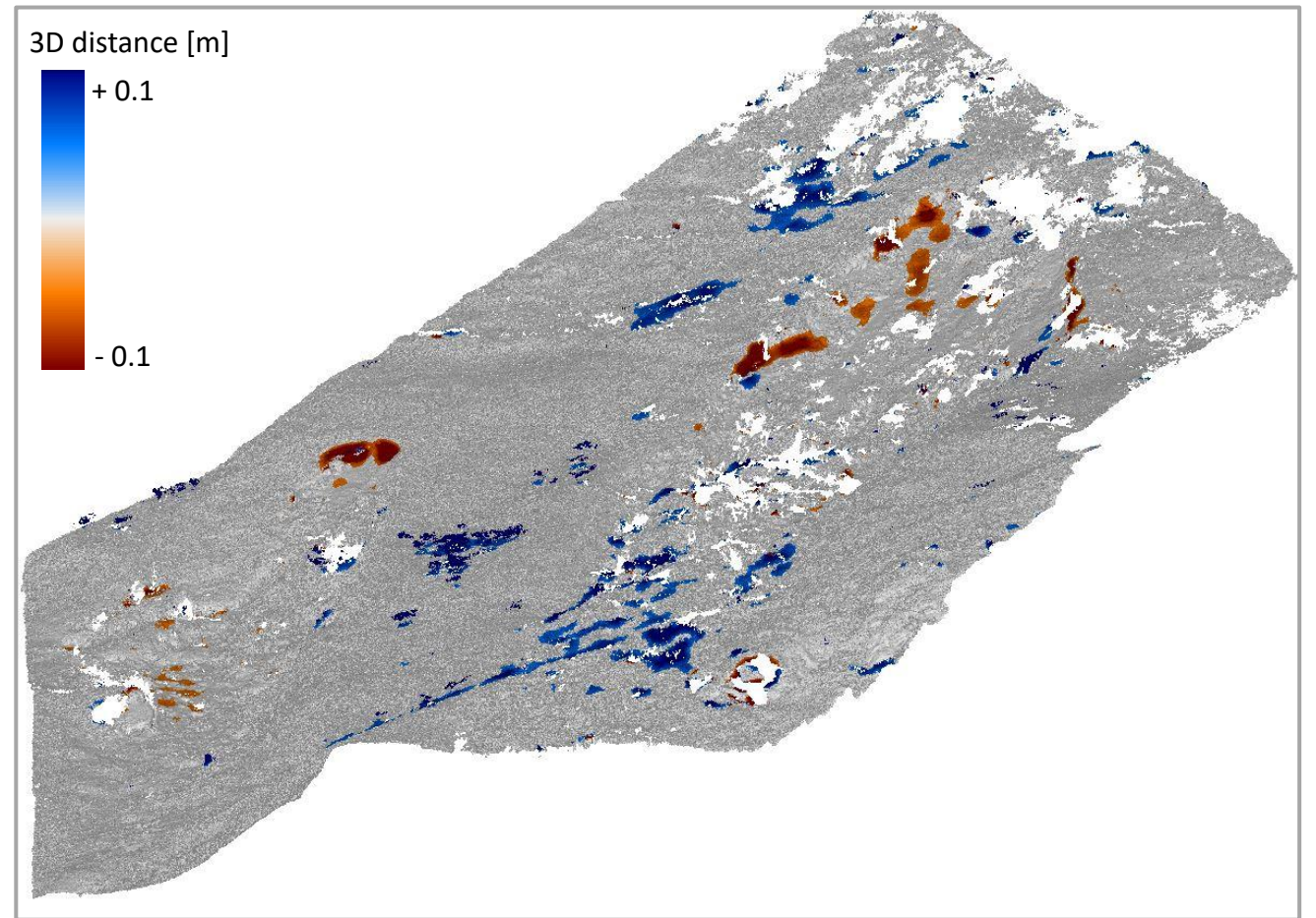
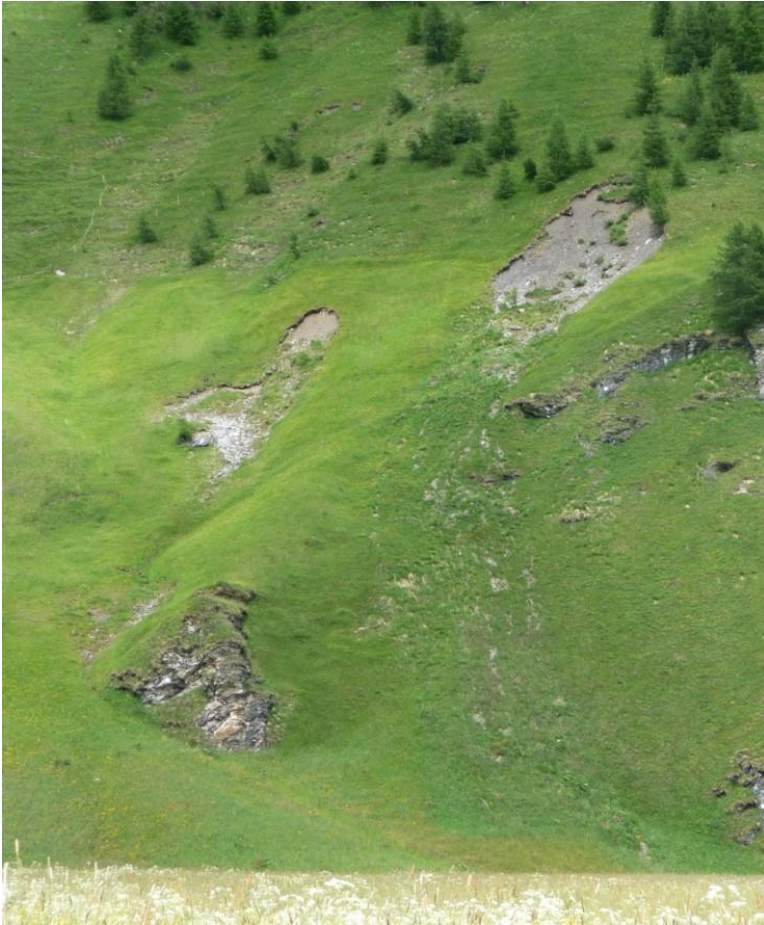


Point cloud with shading and colored by elevation (z).



# 3D landslide monitoring with TLS

## Interpretability of data?

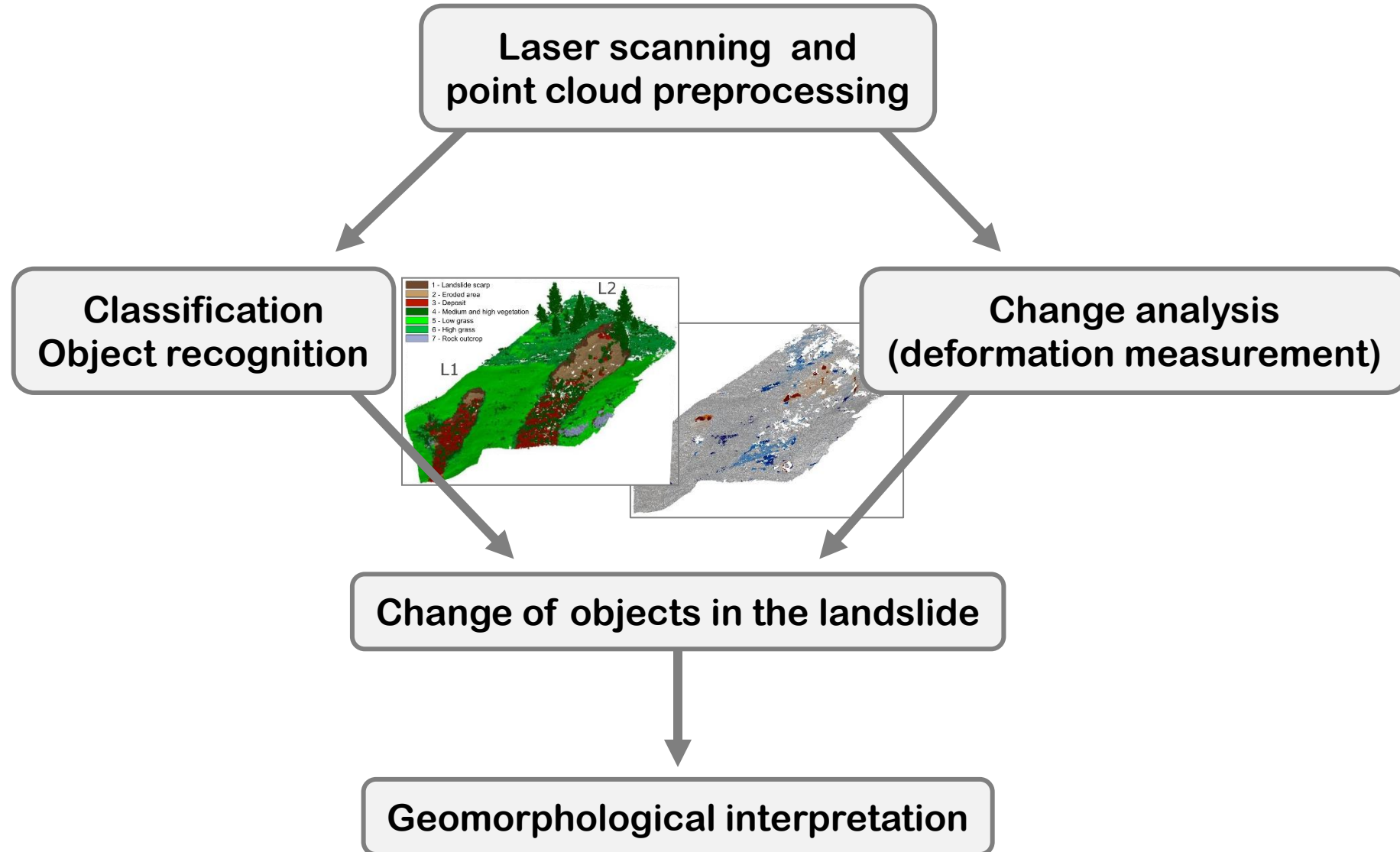


Type of changes? What kind of objects are affected?  
(Reasons for change?)

→ **Lack of semantic information**

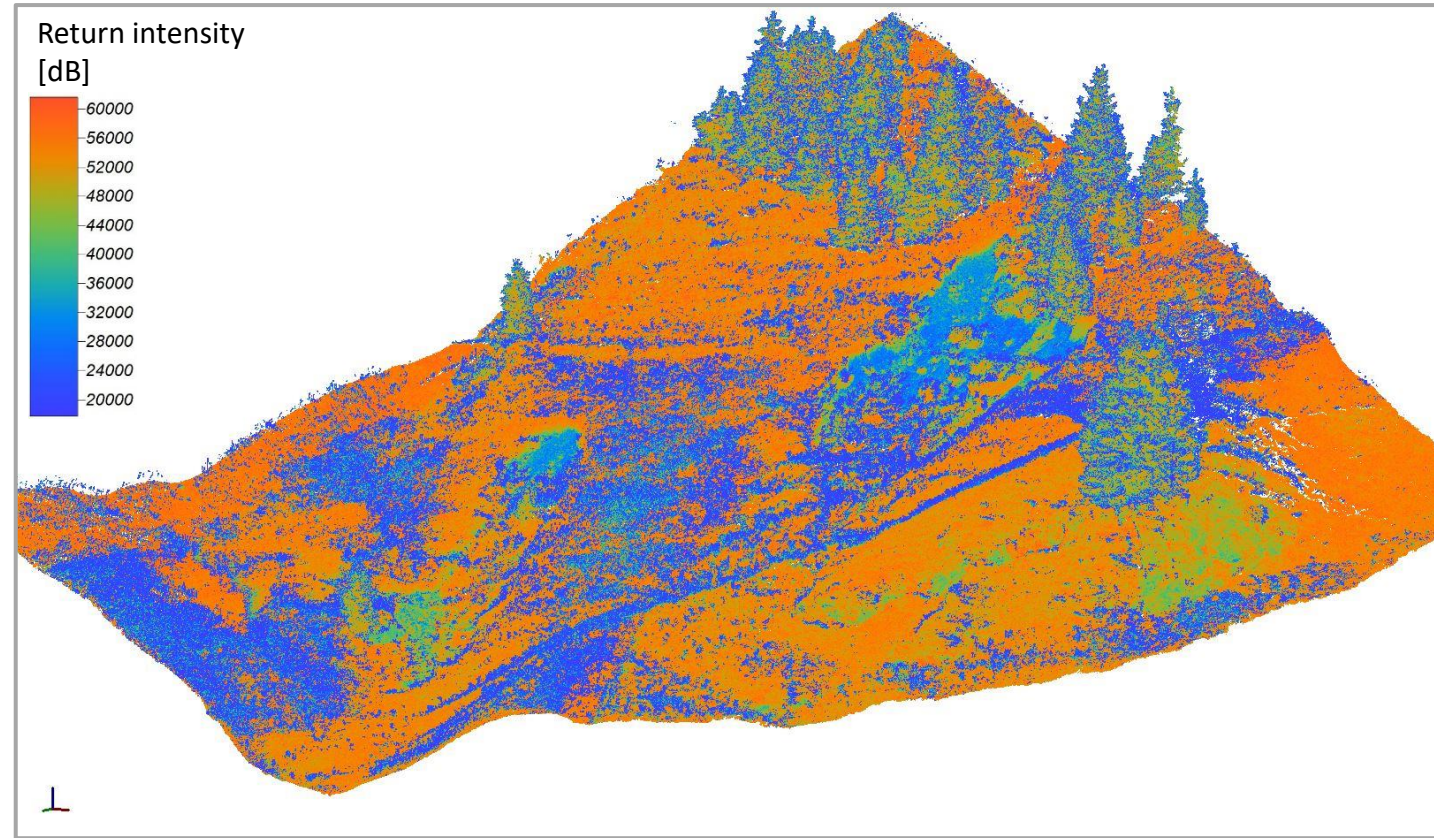
# 3D landslide monitoring with TLS

Approach for automated extraction of geomorphological information





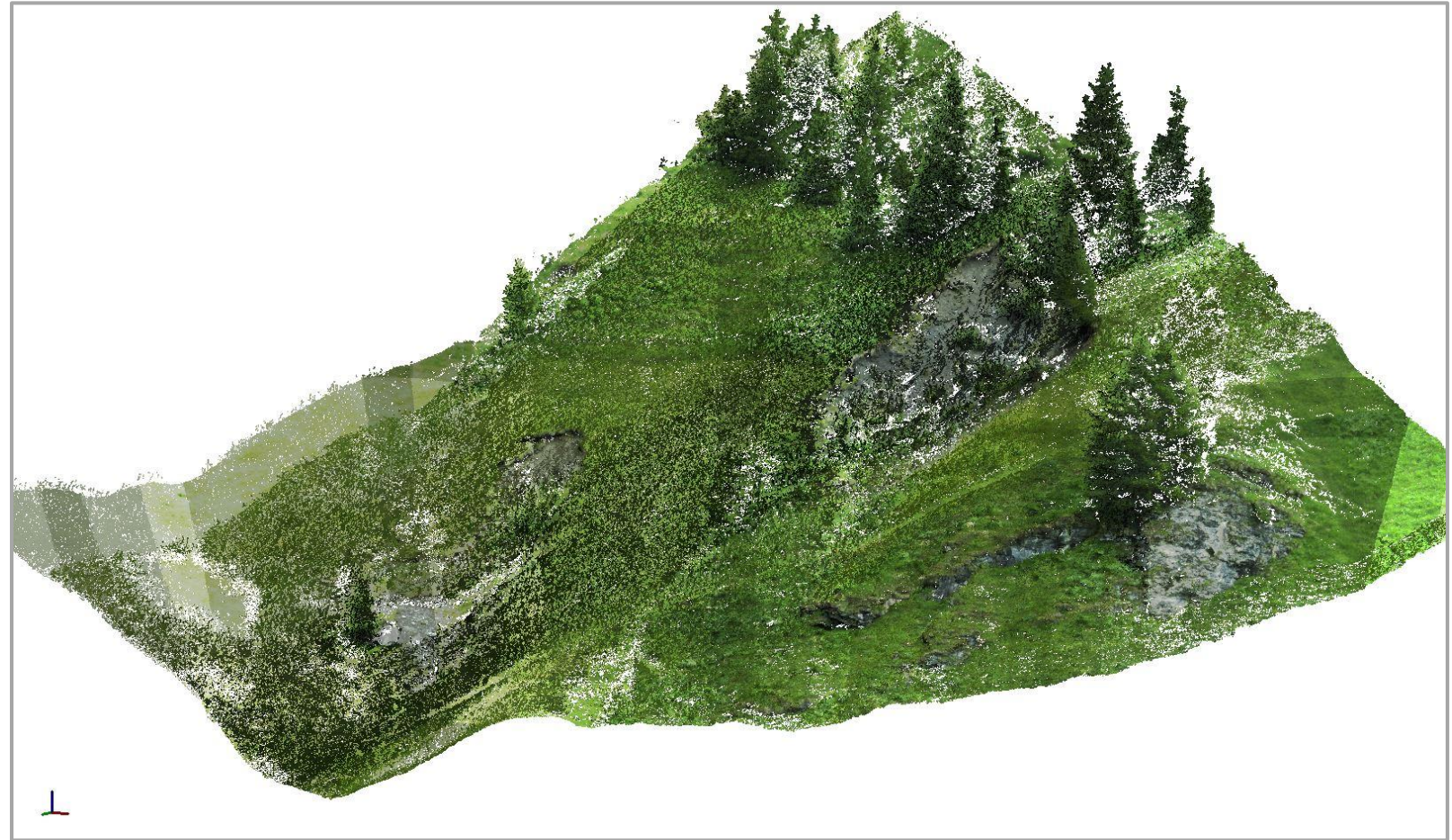
# 3D landslide monitoring with terrestrial laser scanning



Point cloud colored by laser return intensity (1064 nm wavelength).



# 3D landslide monitoring with terrestrial laser scanning



Point cloud colorized with RGB photos (04 July 2018)

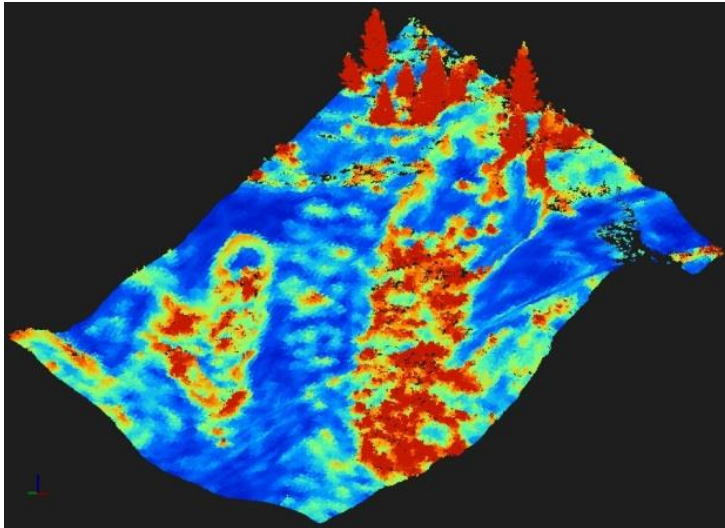


# Object-based point cloud classification

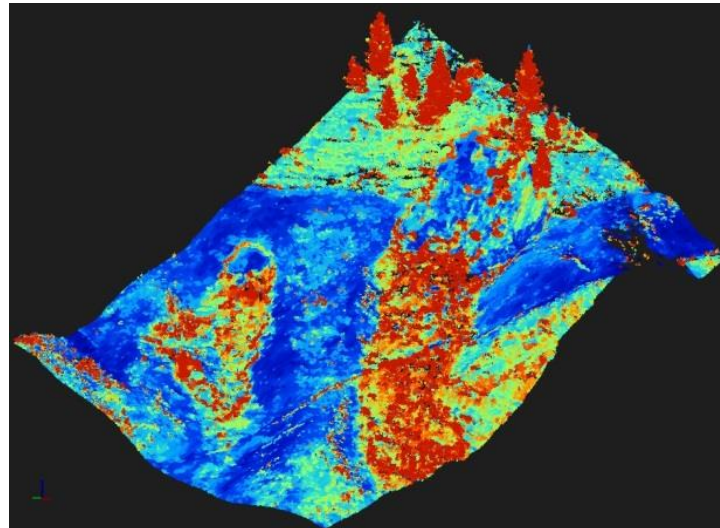
## Geometric point cloud features

Mayr, A., Rutzinger, M., Bremer, M., Oude Elberink, S., Stumpf, F., Geitner, C. (2017).  
Object-based classification of terrestrial laser scanning point clouds for landslide monitoring.  
*The Photogrammetric Record*, 32(160), 377-397.

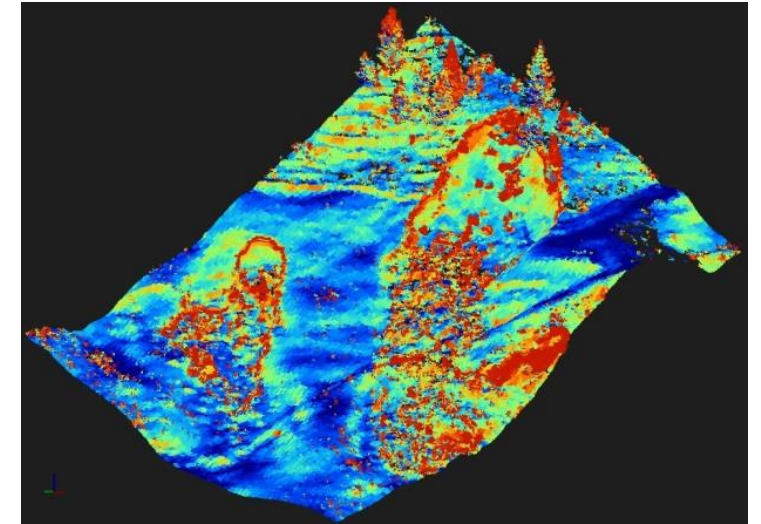
- Planarity measures
- Slope
- Curvature
- Vertical distribution of points
- At three different scales  
(varying neighbourhood radius: 0.2, 0.4 and 1.0 m)
- Aggregation to segments (mean, standard dev.)



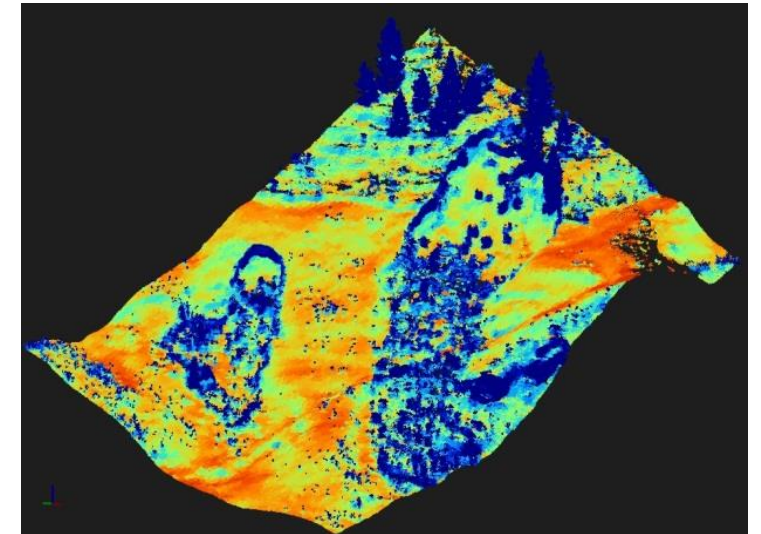
sd from plane (r = 1.0 m)



sd from plane (r = 0.2 m)



Slope (r = 0.2 m)



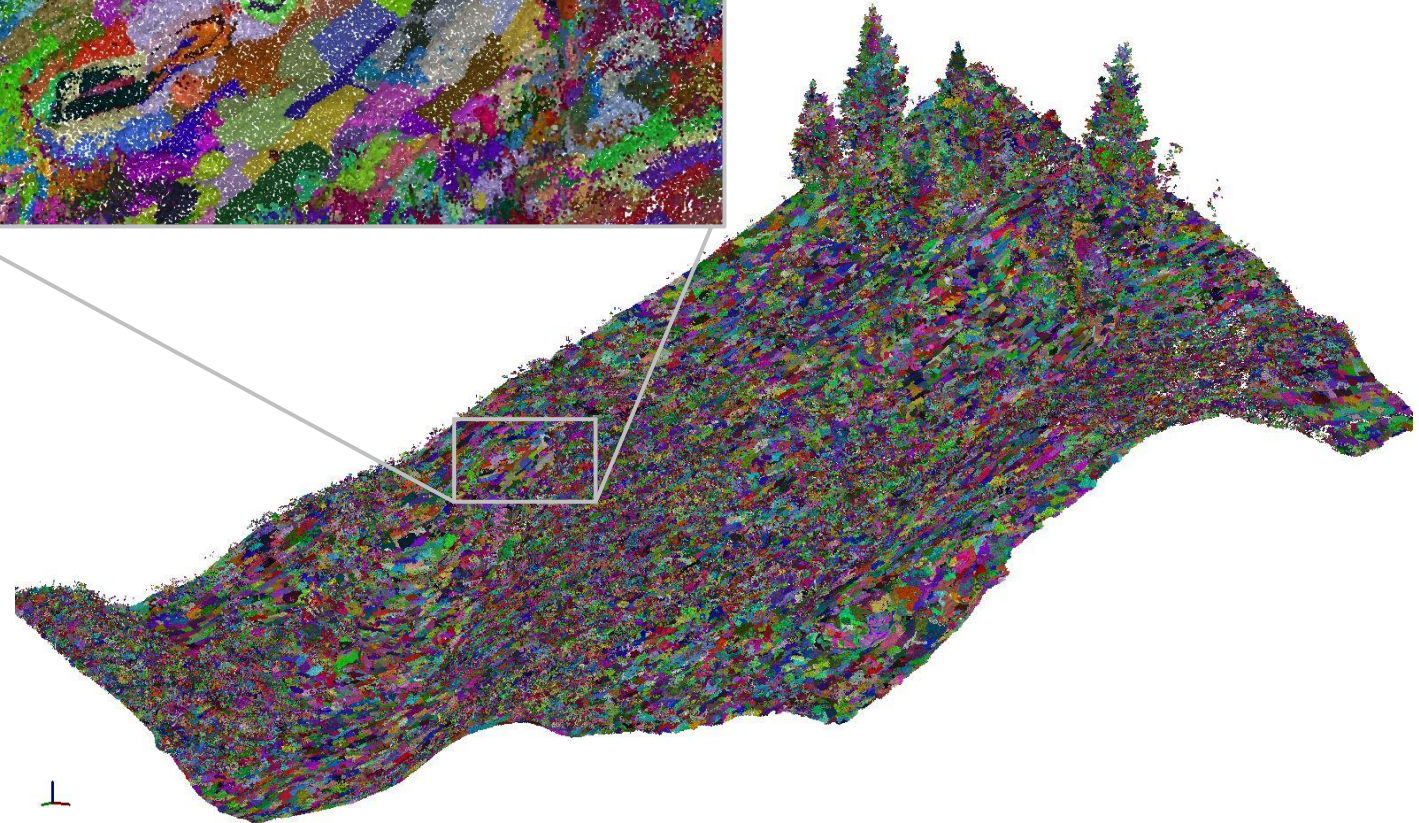
3D/2D density ratio (r = 0.2 m)



# Object-based point cloud classification

## Segmentation

Mayr et al. 2017. *The Photogrammetric Record*, 32(160), 377-397.



Point cloud colored by segment ID.

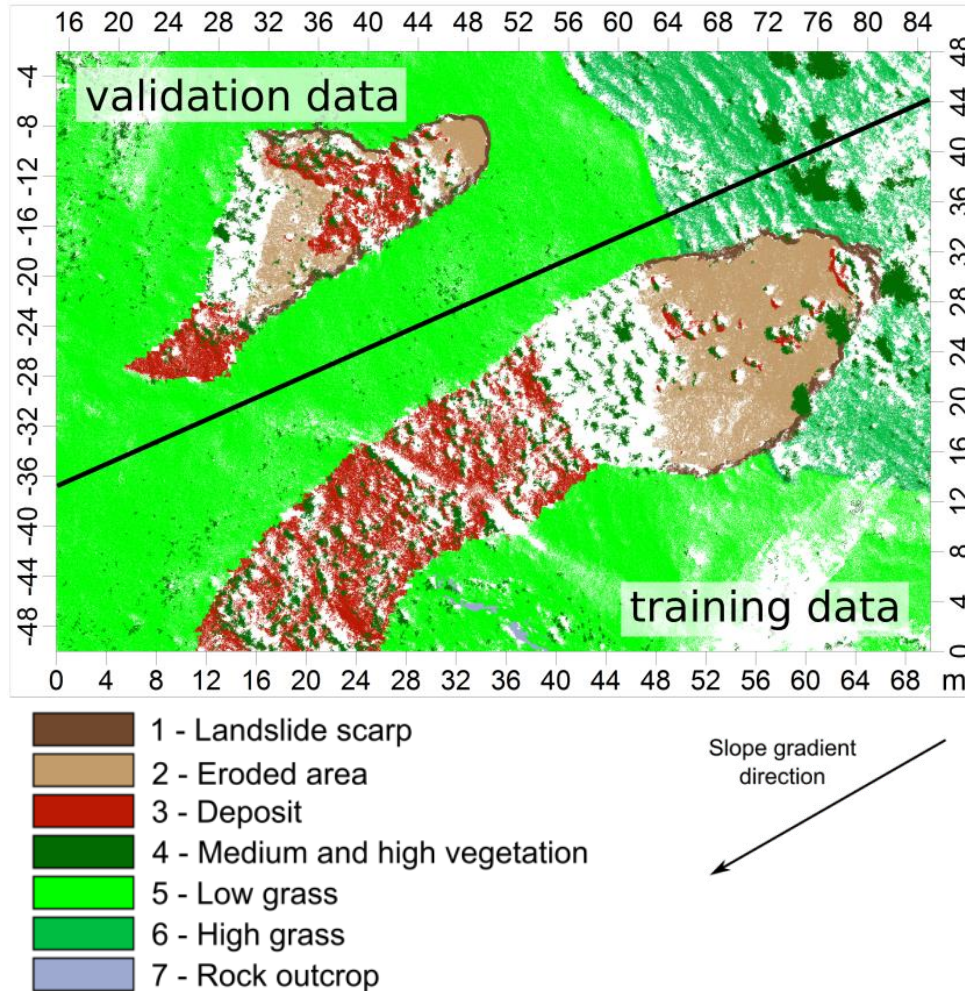


# Object-based point cloud classification

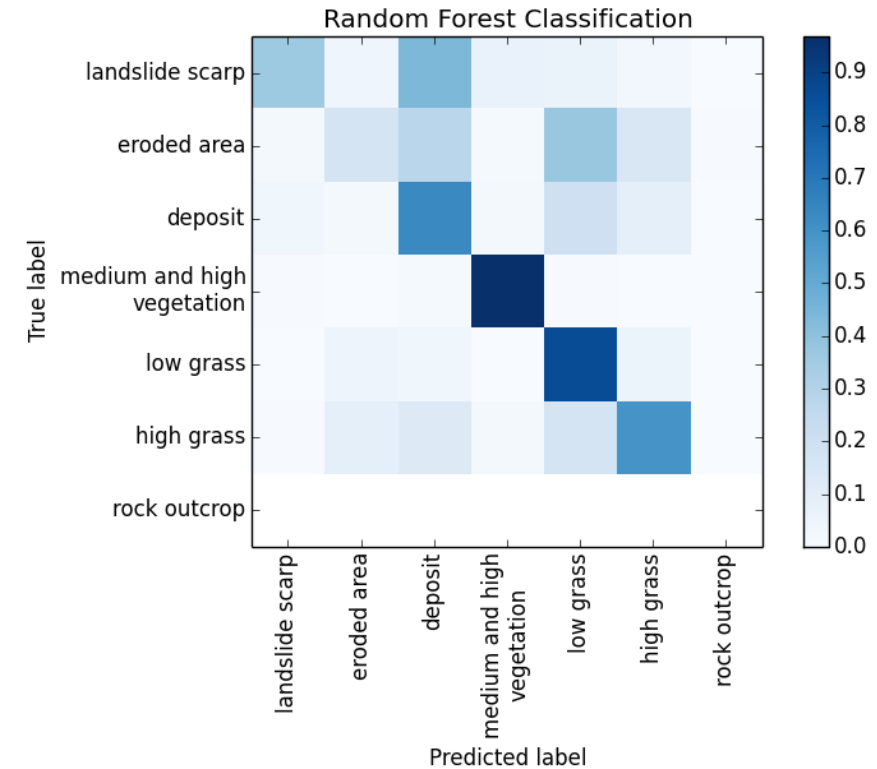
Mayr et al. 2017. *The Photogrammetric Record*, 32(160), 377-397.

## Random forest classification based on geometric features

### Manually labelled reference data (one epoch (#7))



### Validation



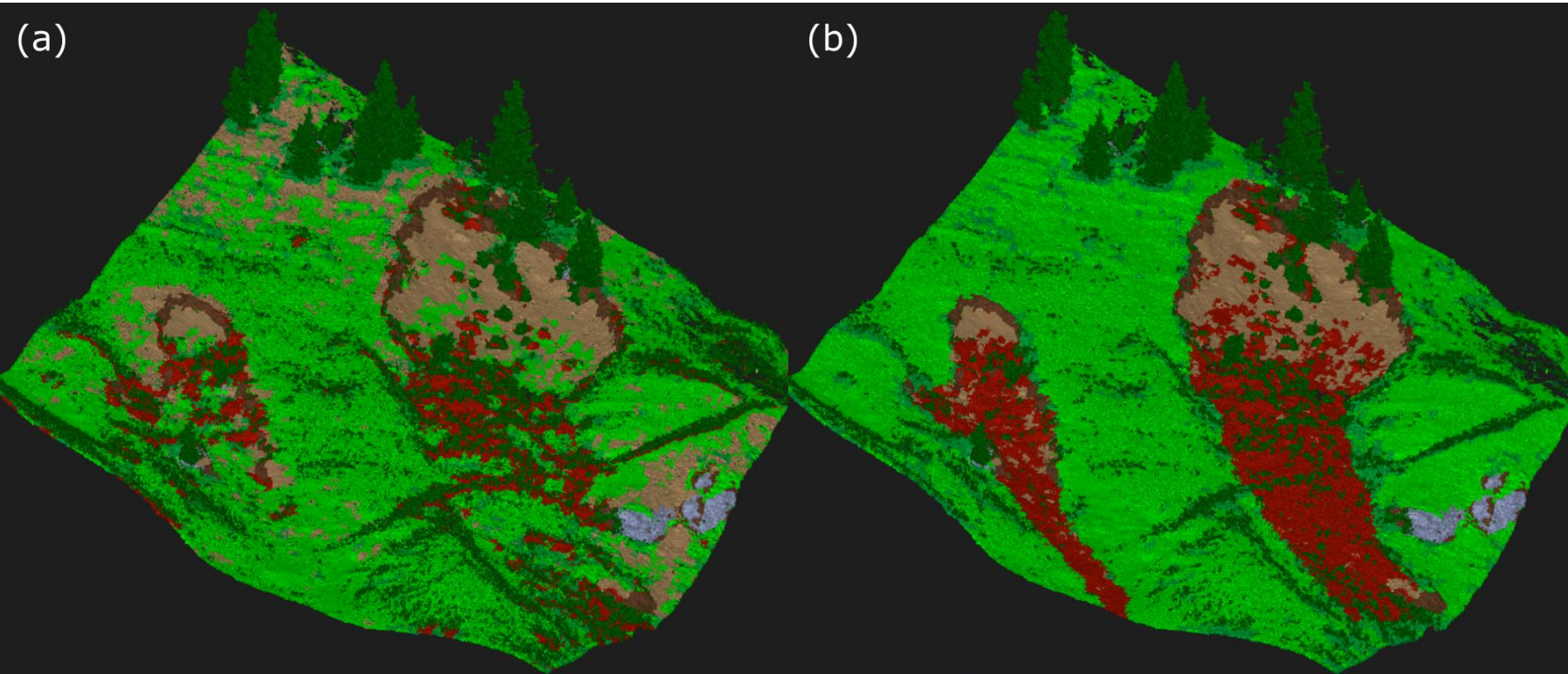
### Application

→ The RF classifier labelled all point cloud epochs.

# Object-based point cloud classification

Mayr et al. 2017. *The Photogrammetric Record*, 32(160), 377-397.

## Topological rules corrected the initial classification



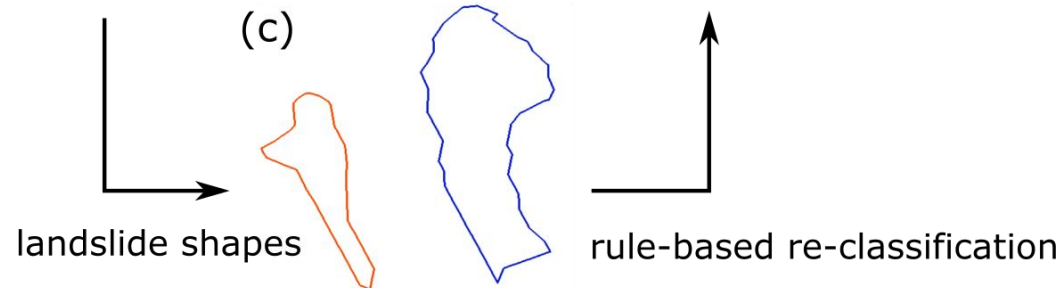
Effect of the correction step.

Point cloud epoch #8

(a) as classified by the random forest classifier,

(b) after rule-based re-classification.

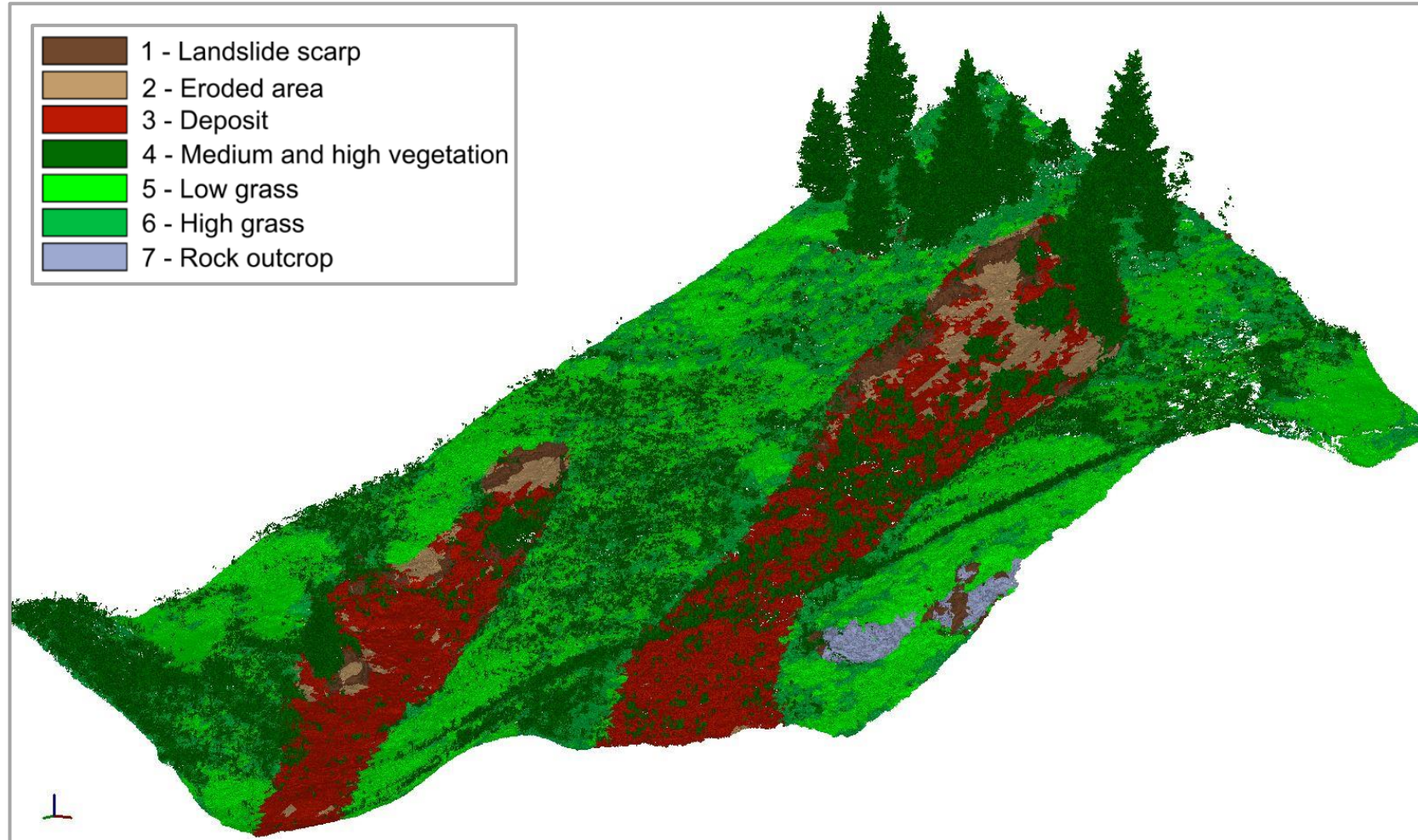
- 1 - Landslide scarp
- 2 - Eroded area
- 3 - Deposit
- 4 - Medium and high vegetation
- 5 - Low grass
- 6 - High grass
- 7 - Rock outcrop





# Object-based point cloud classification

## Results

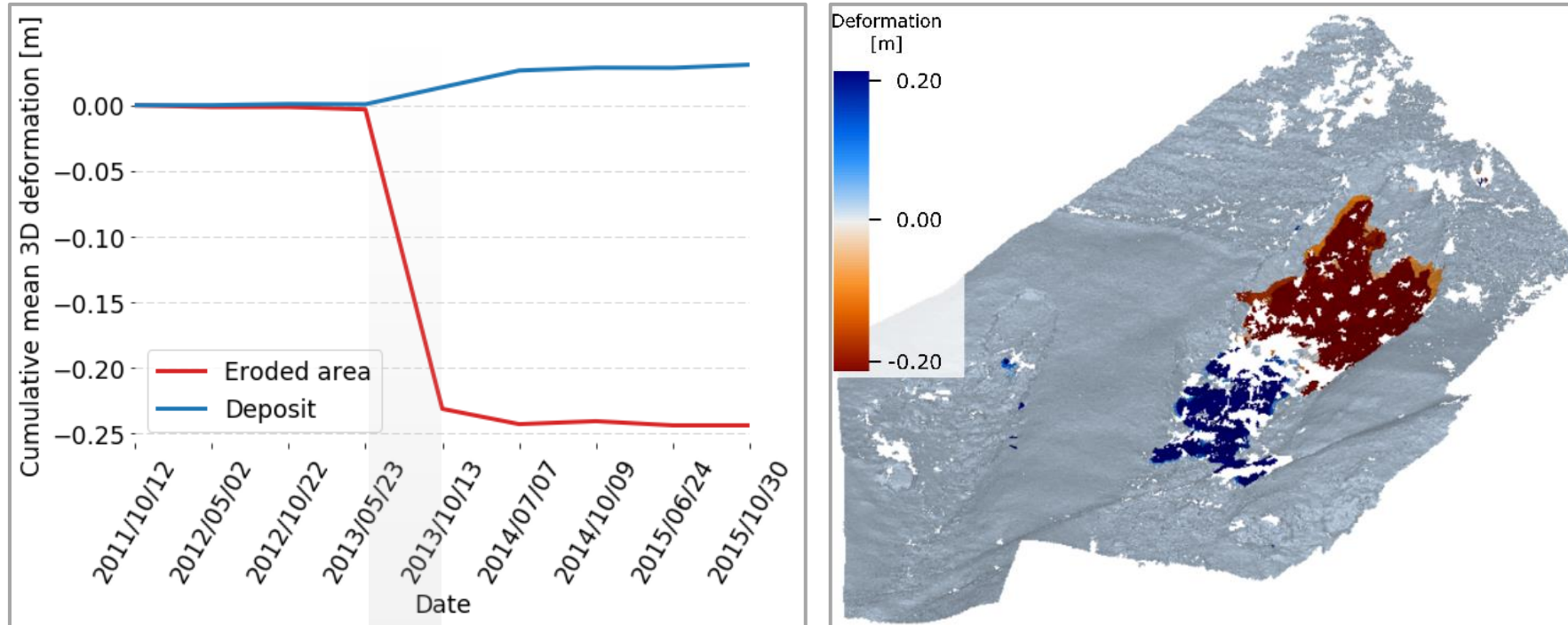


Classified point cloud epoch #13.

# 3D landslide monitoring with TLS

Mayr et al. 2018. *Int. Arch. Photogramm. Remote Sens. Spatial Inf. Sci.*, XLII(2), 691-697.

## Landslide reactivation



... triggered by strong rainfall  
in June 2013 (110 mm over 3 days)

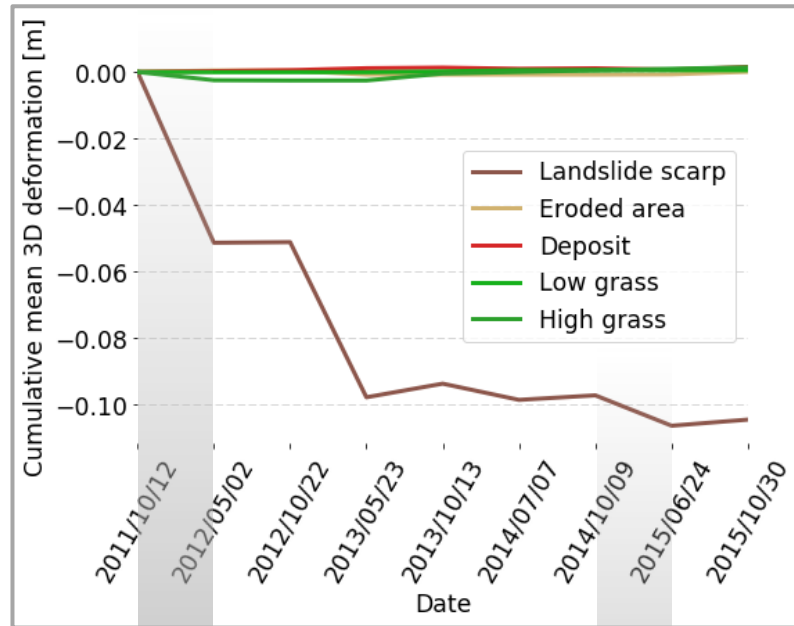


# 3D landslide monitoring with TLS

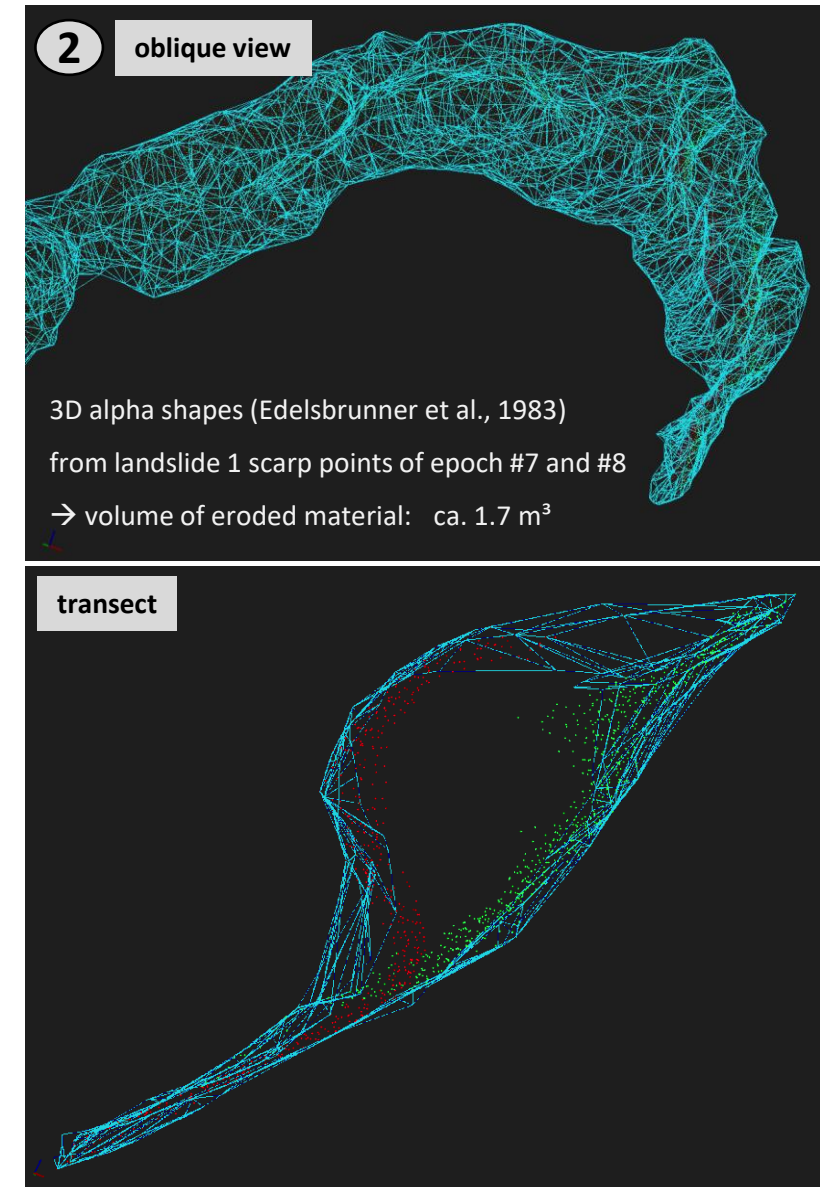
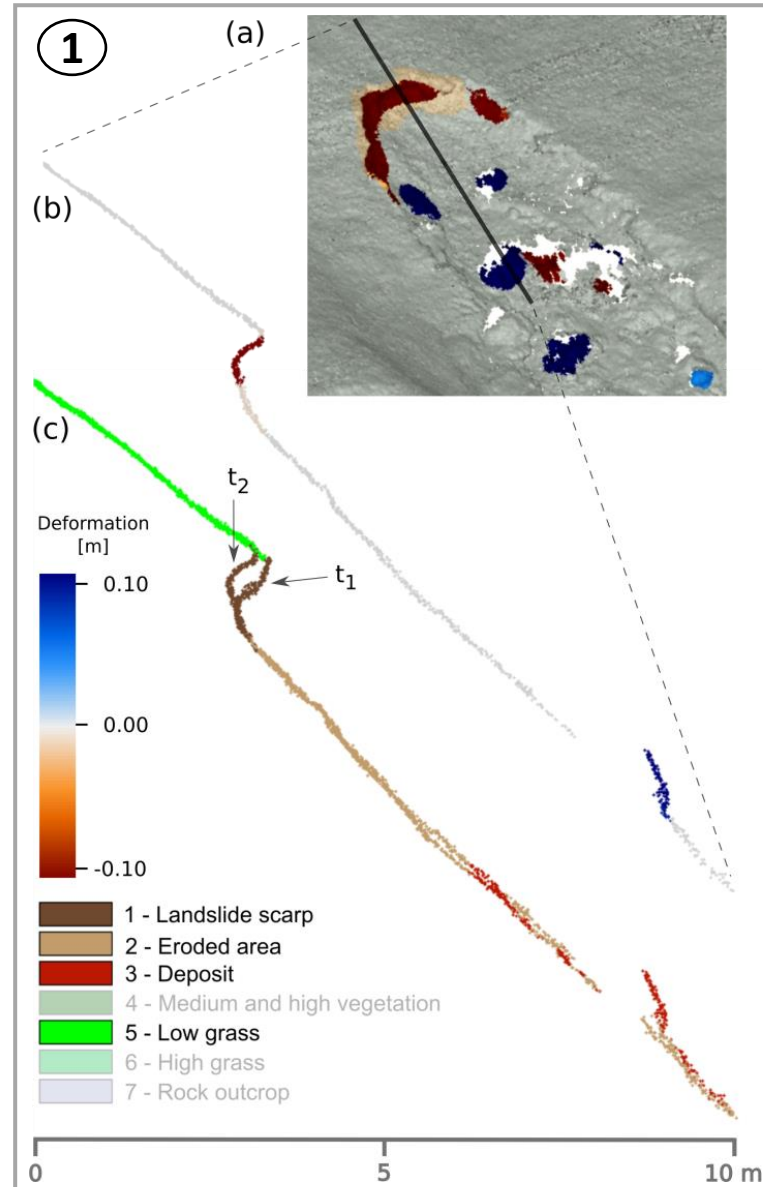
## Scarp erosion

Mayr et al. 2017. *The Photogrammetric Record*, 32(160), 377-397.

Mayr et al. 2018. *Int. Arch. Photogramm. Remote Sens. Spatial Inf. Sci.*, XLII(2), 691-697.



1 2  
Examples for scarp erosion



# 3D landslide monitoring with terrestrial laser scanning

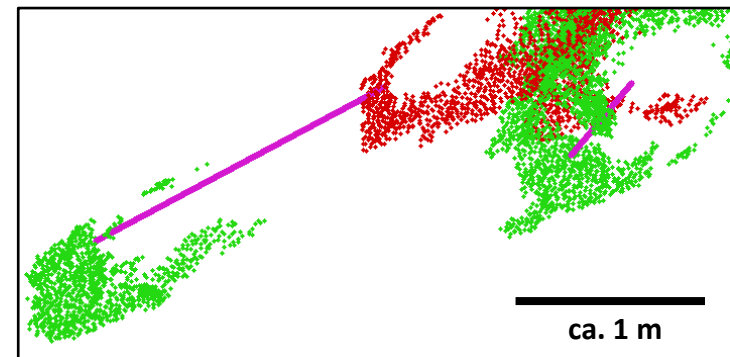
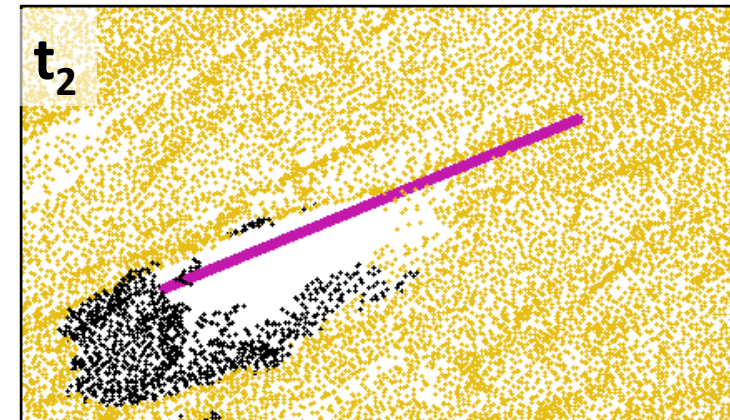
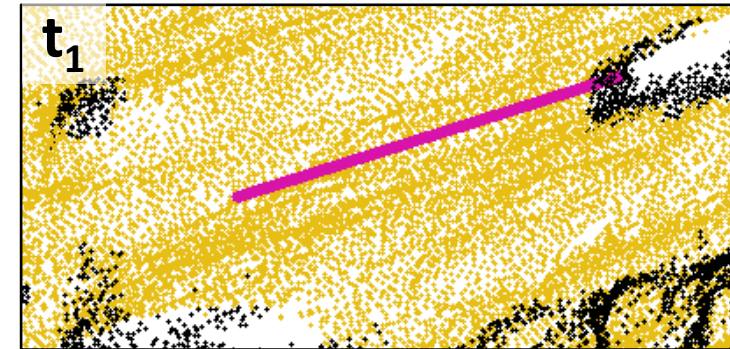
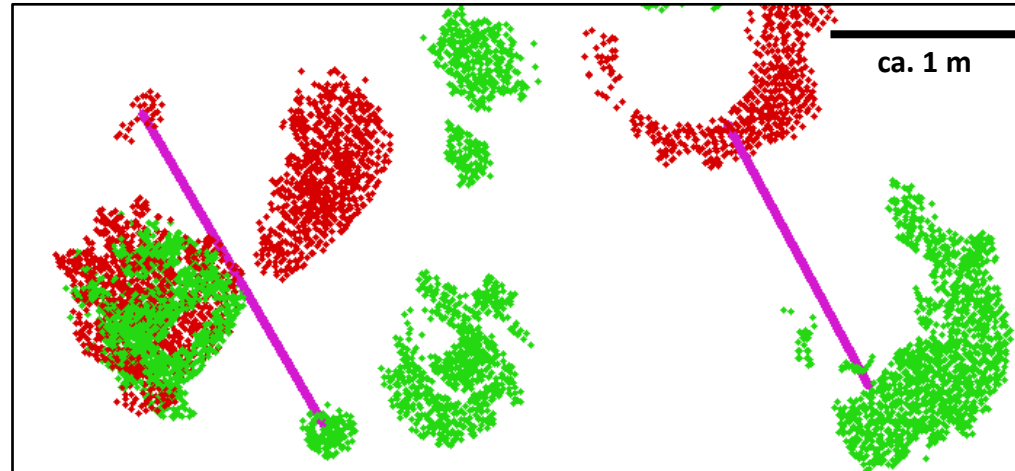
## Object tracking



Movement of clods of turf and soil  
in the landslide scar:

- Object matching
- Displacement vectors
- Some preliminary results ...

$t_1$  →  $t_2$





### 3. Unmanned aerial vehicle laser scanning (ULS) for erosion monitoring

#### System configuration and data acquisition

- RiCOPTER
  - octocopter
  - 24.9 kg maximum take-off mass
- Riegl VUX-1LR laser scanner:
  - 1550 nm wavelength
  - 330° FOV



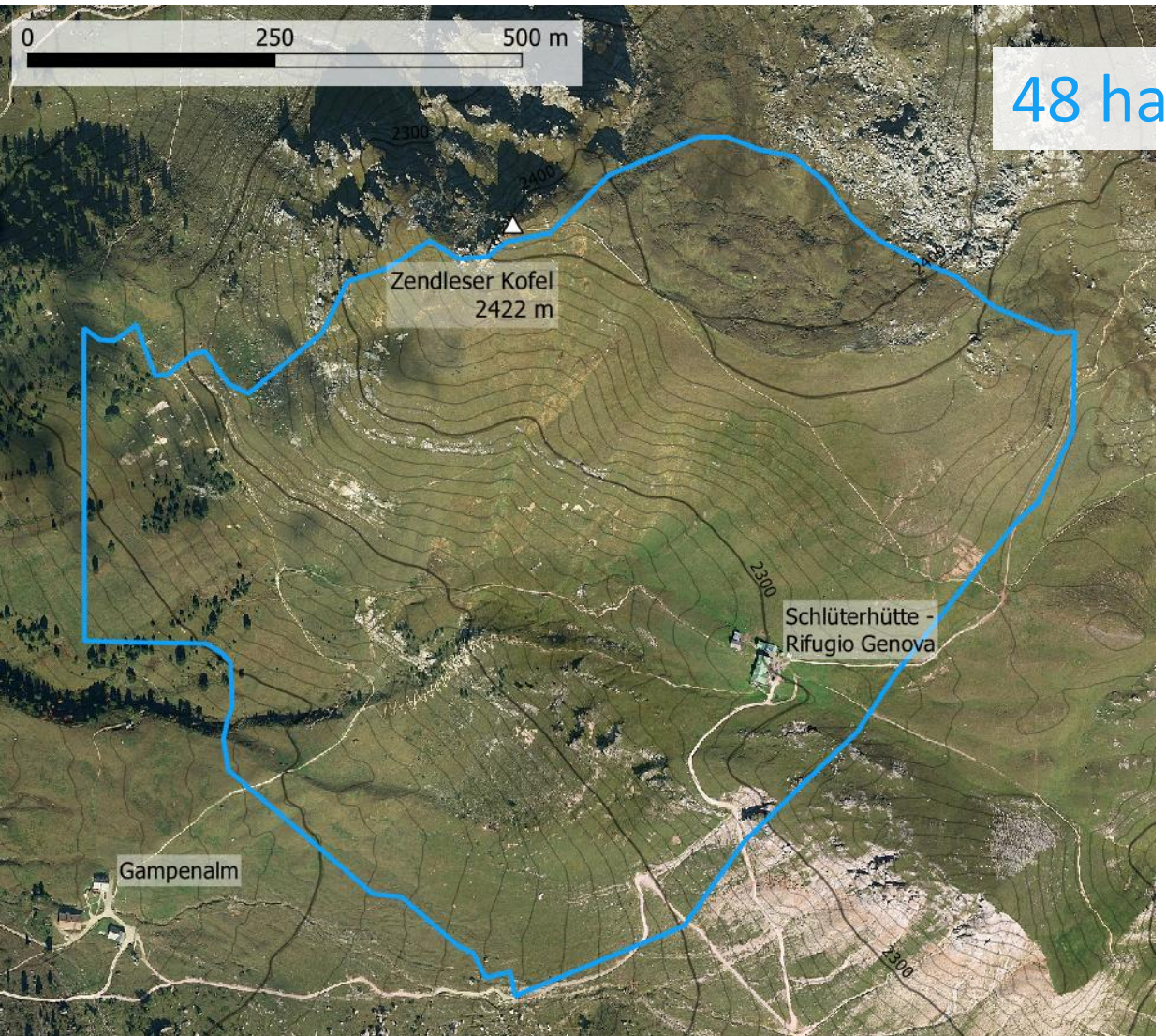
- 2 oblique Sony Alpha 6000 cameras (RGB)
- Applanix AP20 IMU and DGNSS receiver recording sensor position and orientation



# ULS for erosion monitoring

## System configuration and data acquisition

Mayr et al. 2019. *ISPRS Annals of the Photogrammetry, Remote Sensing and Spatial Information Sciences*, IV-2/W5.



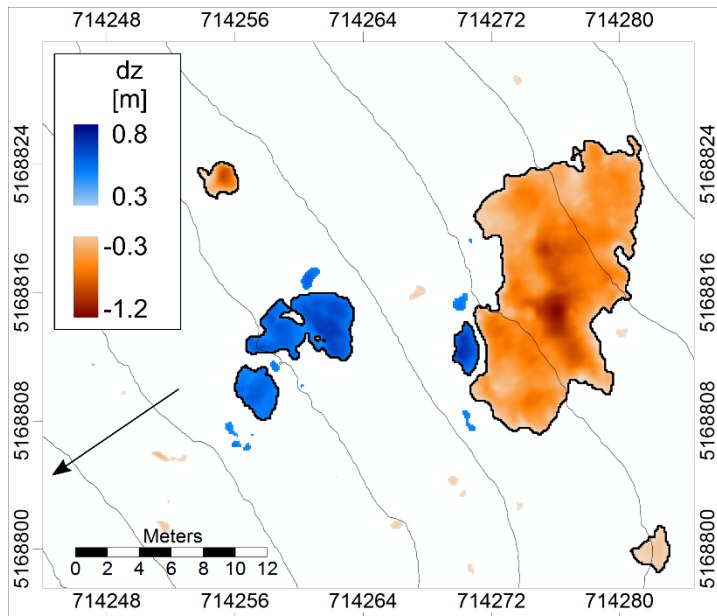
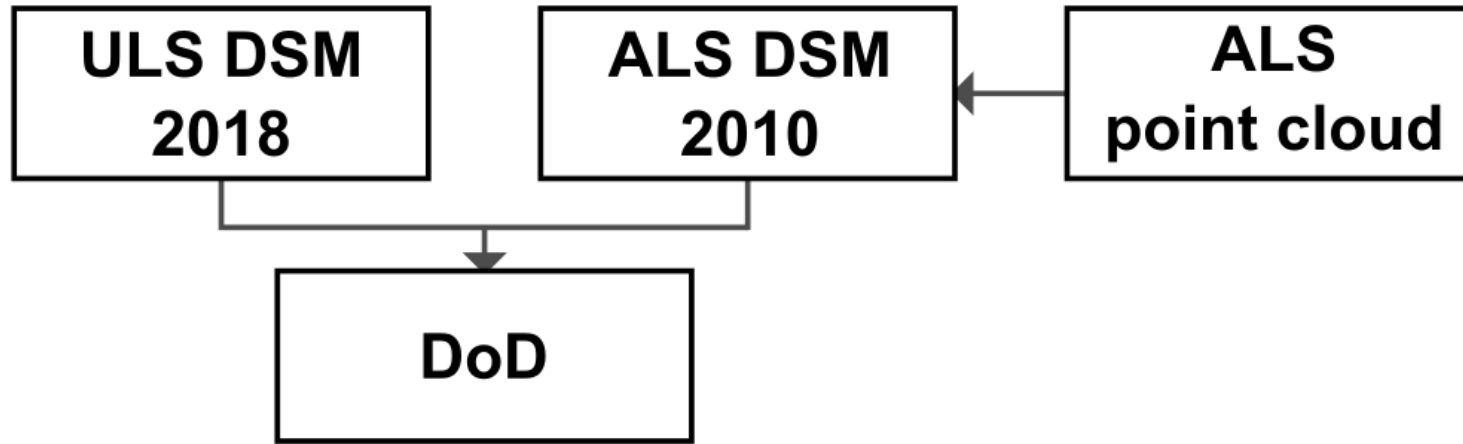
- Detailed flight planning
- Strips in different elevation levels to compensate the terrain ( $\Delta z = 300$  m)
- 70 m average flying altitude
- 8 m/s flight speed
- 760 ( $\pm 374$ ) pts/m<sup>2</sup>



# ULS-based mapping and quantification of erosion

## DSM-of-Difference (DoD)

Mayr et al. 2019. *ISPRS Annals of the Photogrammetry, Remote Sensing and Spatial Information Sciences*, IV-2/W5.

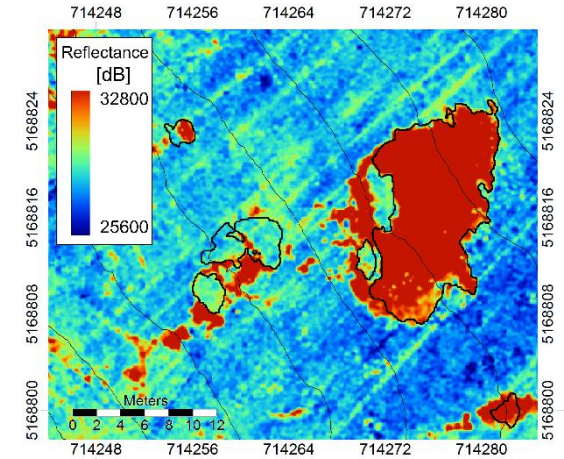
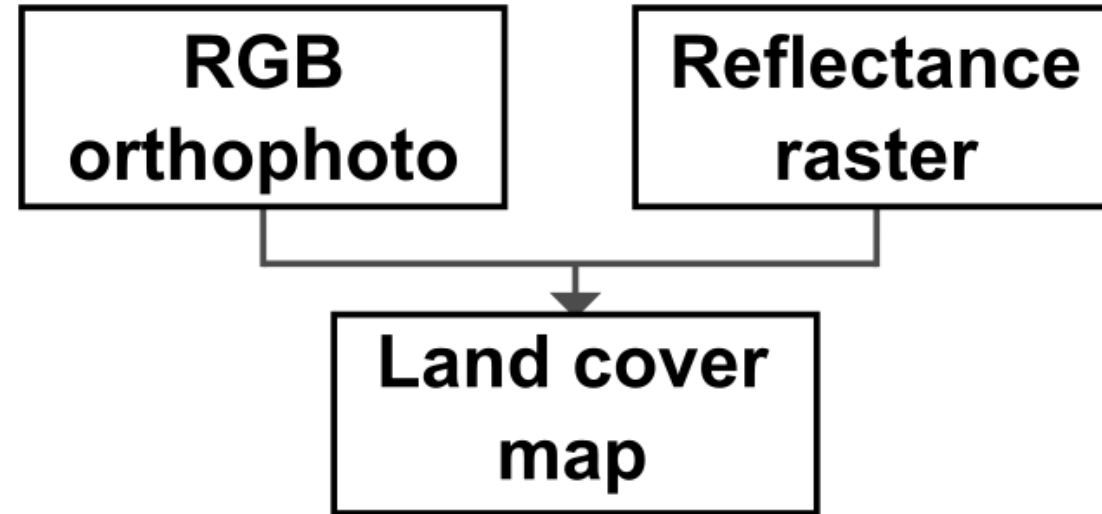
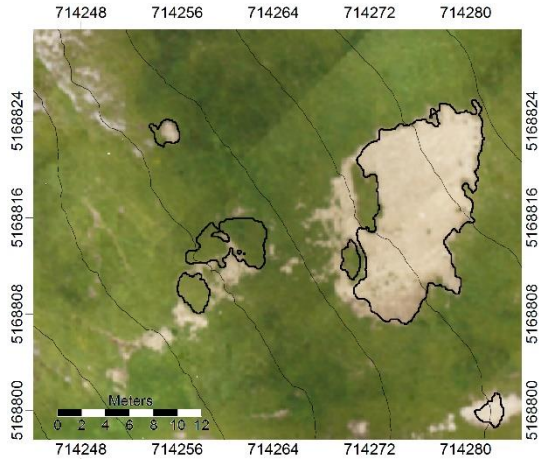


- DSM-of-Difference (DoD)
- Slope mask
- Consider only  $dz > 0.3$  m

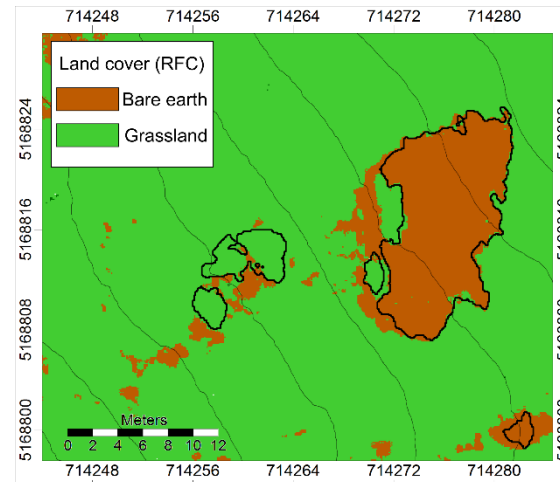
# ULS-based mapping and quantification of erosion

## Supervised land cover classification

Mayr et al. 2019. *ISPRS Annals of the Photogrammetry, Remote Sensing and Spatial Information Sciences*, IV-2/W5.



- Random Forest classification
- Classes:
  - Bare earth
  - Grassland
  - Trees





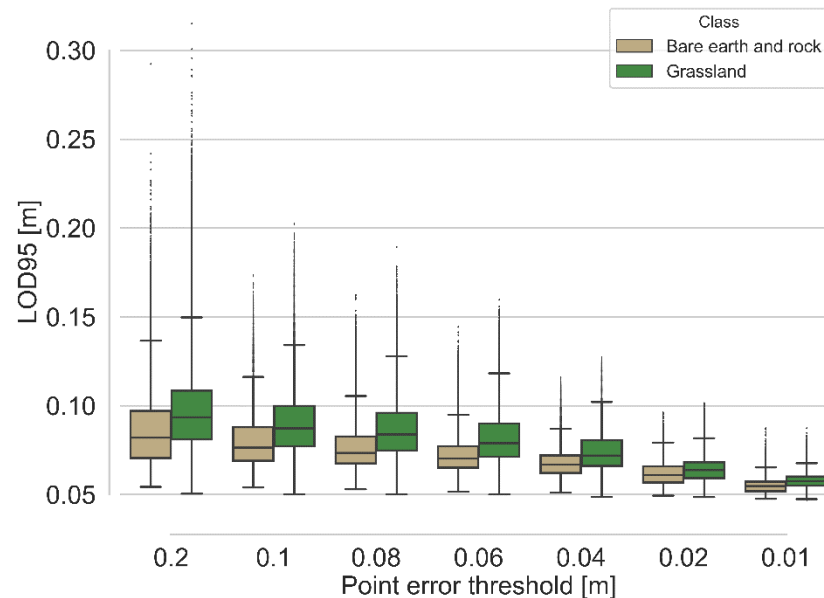
### Accuracy assessment of multitemporal ULS point clouds:

- mean 3D distance at validation patches:
  - 0.043 m ( $\pm$  0.023 m) with direct georeferencing
  - 0.002 m ( $\pm$  0.016 m) after global ICP adjustment → *registration error*
- Estimation of a spatially varying LOD (Lague et al. 2013, Fey and Wichmann 2017), including:
  - *Registration error*
  - *Plane-fitting variance* (surface roughness, noise)
  - *Point error* (3D positional uncertainties due to footprint effects)

### Impact of scanning geometry on the LOD (via footprint effects):

*Point error modelled for a subset (cf. Schär et al. 2007)*

- High variability
- Compromises the LOD
- Quality-based point cloud filtering (point error threshold  $t_{pe}$ ) improves the LOD
- $t_{pe}$  must be chosen carefully (adaptively?) to maintain consistently dense point clouds



	$t_{pe}$ [m]	
	0.20	0.04
LOD <sub>95</sub> minimum [m]	0.045	0.045
LOD <sub>95</sub> maximum [m]	0.359	0.139
LOD <sub>95</sub> mean [m]	0.090	0.073
LOD <sub>95</sub> standard deviation [m]	0.020	0.010
Number of points	40.4 Mio	34.7 Mio
Number of points with a valid distance and LOD <sub>95</sub>	32.9 Mio	28.2 Mio

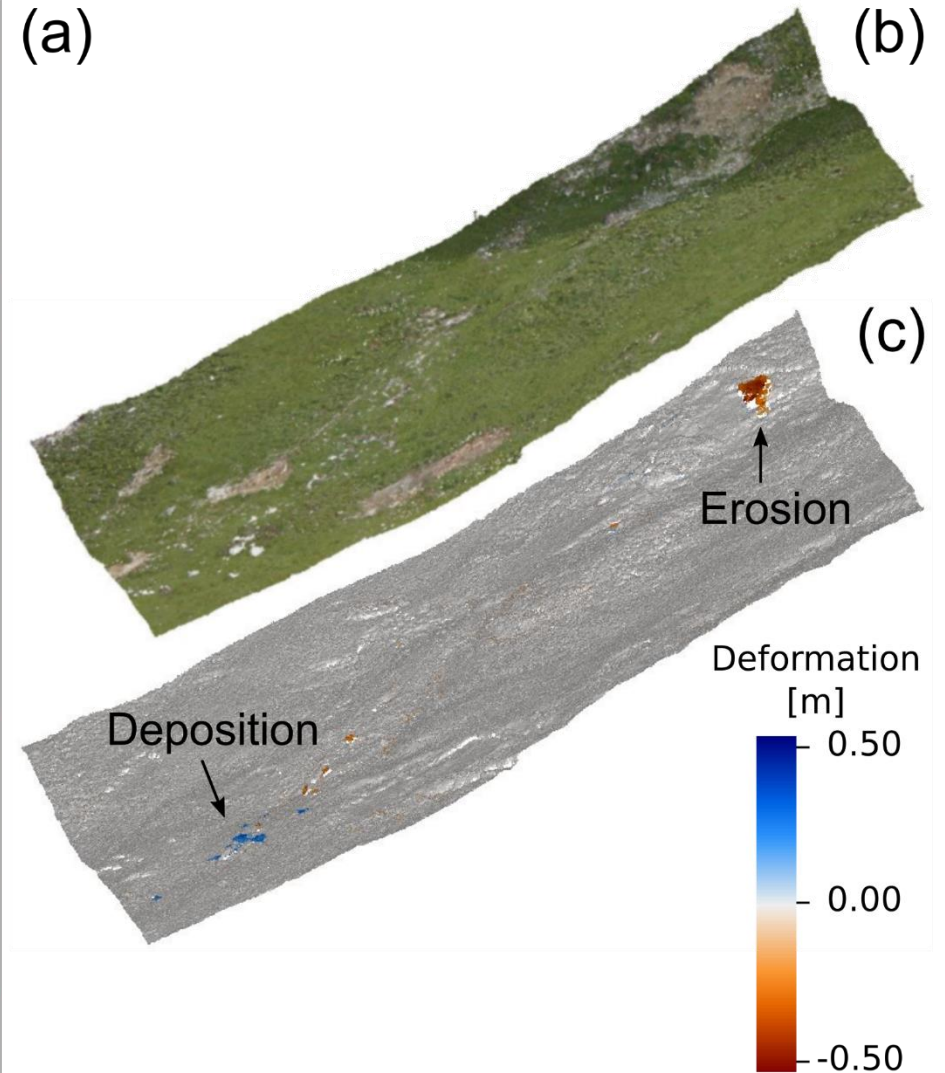
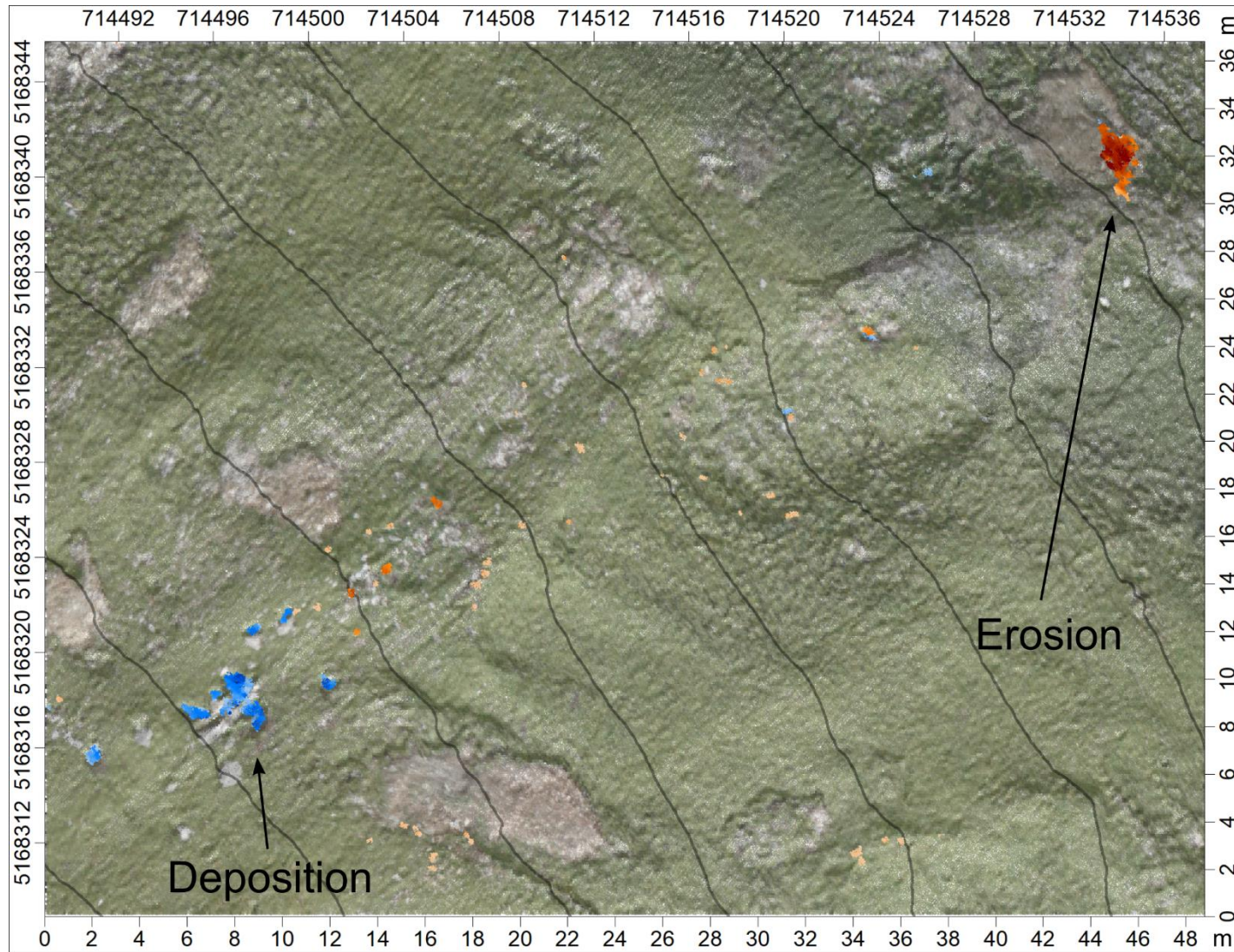
LOD for different point error thresholds



# ULS for erosion monitoring

## Example: Secondary erosion and deposition

Mayr et al. 2020. *ISPRS Annals of the Photogrammetry, Remote Sensing and Spatial Information Sciences*, forthcoming.



# Summary and conclusions

## Close-range sensing and object-based analysis of shallow landslides and erosion

- suited for **reference data acquisition** to validate an erosion mapping with aerial orthophotos
- close-range sensing enables a **systematic monitoring** of shallow erosion with **LODs at (sub-)decimetre-level** (depending on the specific survey configuration (ground control, range etc.))
- monitoring of geomorphic processes:
  - **estimate the volume of material** that is redistributed during the development of **new eroded areas** (ULS case study)
  - **secondary development**:
    - retrogressive erosion of **landslide scarps**
    - **reactivation** of the main body of a landslide
- **object-based approaches** helped to detect and quantify erosion processes in close-range sensing data and, thus, are found to improve the **data interpretability**
- **geomorphic objects** (at different spatial levels) are characterized by both **morphometric and spectral signatures**; a **combination of morphometric and spectral features** may be ideal (data quality!?)
- **fuzziness and variability of natural objects** are problematic



# References

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