



# Semi-automated regional classification of the style of activity of slow rock-slope deformations using PS InSAR and SqueeSAR velocity data

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## DSGSD and large landslides



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#### Slow rock slope deformations:

#### continuum between DSGSDs and Large Landslides





| DSGSD                     | Large Landslides (LL)    |  |  |
|---------------------------|--------------------------|--|--|
| > 6 – 10 km <sup>2</sup>  | > 1 km²                  |  |  |
| Limited cumulative strain | Higher cumulative strain |  |  |
| Creep behaviour           | Hidrological sensitivty  |  |  |
| Morphostructures          | Topographic expression   |  |  |

- Recently recognized as active landslides
- Widespread (>1300 in the Alps)
- Complex displacement pattern →

different damage potential



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Slow rock slope deformations *style of activity* = complex combination of:

- 1) Segmentation, heterogenous activity
- 2) Displacement rate (mm-cm/yr)



3) Kinematics





## **Research needs and methods**

## Main issues:

- Many
- Complex: ≠ style of activity and stages of evolution
- Threaten infrastructures

## Study approach:

- InSAR and morphostructural data integration
- Multi-technique approach
- Multi-scale approach

# **Regional scale**

Screening: semi-automated classification

Semi detailed mapping + PSI dataset

Improved PSI analysis

→ segmentation and heterogeneity
 → kinematics









- Austroalpine, Penninic and Southalpine domains
- Alpine sector: high elevation, steep topography, medium strength foliated metamorphics
- Southalpine sector: less steep, stratigraphic control



## Available PSI datasets:

| Satellite    | PSI technique         | Mode       | Θ(°)  | δ(°)   | Revisit time(days) | Time interval(yr) |
|--------------|-----------------------|------------|-------|--------|--------------------|-------------------|
| ERS 1/2      | PSInSAR™              | Ascending  | 23.20 | ~13.00 | 25                 | 1992-2003         |
| ERS 1/2      | PSInSAR <sup>™</sup>  | Descending | 23.09 | ~12.00 | 35                 | 1992-2000         |
| RADARSAT-S3  | SqueeSAR™             | Ascending  | 32.49 | 12.12  | 24                 | 2002 2007         |
| RADARSAT-S3  | SqueeSAR™             | Descending | 36.27 | 9.60   | 24                 | 2003-2007         |
| Sentinel1A/B | SqueeSAR™             | Ascending  | 41.99 | 10.23  |                    | 2015 2017         |
| Sentinel1A/B | SqueeSAR <sup>™</sup> | Descending | 41.78 | 8.89   | 12 (6 after 2016)  | 2015-2017         |



- 208 mapped slow rock slope deformations: 134 DSGSDs+74 LL uniformly mapped
- Semi detailed mapping: 3 polygonal layers + 3 linear layers



Descriptive morphostructural and morphometric variables for each landslide

Mean LOS velocity : ineffective in representing the state of activity

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 Automated discrimination of homogenous/segmented landslides through peak analysis implemented in an original Matlab tool
 <sub>a)</sub>
 <sub>b)</sub>
 <sub>b)</sub>





•  $\Delta$  parameter  $\rightarrow$  changes in the 2D displacement vector orientation along slope

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• Asymmetry of  $\Delta$  frequency as predictor of kinematics  $\rightarrow$  signature of landslide kinematics



• Δ mean, mode, median, skewness, kurtosis = inputs of a supervised machine learning analysis



Linear discriminant resulted the best predictive model with an accuracy higher than 80%.



• Multivariate analysis = PCA + cluster analysis (K-medoids)

| Variable type    | Label  | Variable name                      |
|------------------|--------|------------------------------------|
|                  | DB     | Deformed nested landslides density |
| Marabastrustural | NB     | Immature nested landslide density  |
| worphostructural | LS     | Landslide scarp sector density     |
|                  | DM     | Morpho-structures density          |
| Morphometrical   | Ні     | Hypsometric integral               |
|                  | L/W    | Elongation ratio                   |
|                  | A/2p   | Shape factor                       |
|                  | Δh     | Relief                             |
|                  | Aspect | Northerness                        |
| InSAR derived    | v_PM   | Velocity of major peak             |
|                  | v_Pm   | Velocity of minor peak             |
|                  | Q_dev  | Quartile deviation                 |
|                  | Δ_SK   | Skewness of $\Delta$ distribution  |
|                  | Δ_Μ    | Median of $\Delta$ distribution    |

- Combined (mapping+ InSAR derived variables)
- 1) Bulk inventory
- 2) DSGSDs

- SAR covered  $\rightarrow$  166 cases
- 3) Large Landslides
- Morphometric (mapping derived variables)
- 3) Bulk inventory (with SAR blind)  $\rightarrow$  208 cases



PCA and cluster analysis on the bulk inventory (SAR covered): *different statistical signatures* of DSGSD and LL  $\rightarrow$  morphological differences (e.g. L/W: more elongated shape for large landslides; density of DB: higher accumulated internal deformation for LL; energy relief: > for DSGSD)





- Combined PCA on SAR covered DSGSDs (117)
- 5 cluster analysis on the PCs scores
- PC1-PC2-PC3: 50.2% of the variance



• gc1-gc5 groups: representative rate + kinematics + morphostructural expression



- Combined PCA on SAR covered Large Landslides (49)
- 2 cluster K-medoids analysis on the PCs scores
- PC1-PC2-PC3: 47.2% of the variance



LL1-LL2: ≠ morphostructural expression → ≠ maturity and accumulated deformation



- Landslides with no SAR data (42)  $\rightarrow$  listwise exclusion from combined PCA
- PCA & cluster on mapping derived variables+ proximity analysis
- PC1-PC2-PC3: 67% of variance



gc attribution to SAR blind landslides



|       | Classes | Kin  | DM     | DB     | Median V <sub>LOS</sub><br>(mm/yr) | Vel<br>heterogeneity |
|-------|---------|------|--------|--------|------------------------------------|----------------------|
| DSGSD | Gc1     | Т    | High   | Medium | 13.5                               | High                 |
|       | Gc2     | Т    | High   | Medium | 4.4                                | Low                  |
|       | Gc3     | R-RT | Medium | High   | 3.9                                | Low                  |
|       | Gc4     | T-RT | Medium | Low    | 6.1                                | High                 |
|       | Gc5     | R-RT | Low    | Low    | 3.7                                | Medium               |
| ш     | LL1     | Т    | High   | Low    | 4.5                                | Low                  |
|       | LL2     | R-RT | Medium | High   | 4.3                                | Medium               |



## Style of activity of slow rock-slope deformations:

*interplay between displacement rates, kinematics and complexity (e.g. segmentation, heterogeneity, internal damage, structural controls)* 

Slow rock slope deformations: *main characteristics* 

- DSGSD and large landslides: different expression, mechanisms, evolutionary stages
- Similar displacement rates may correspond to ≠ kinematics and damage potential
- Statistically-based classification → style of activity groups

Slow rock slope deformations: *implications* 

- Screening of slow rock slope deformations → *through replicable semi automated tools*
- Identification of critical case studies
- Prioritization of detailed site-specific mapping, monitoring and modelling studies