

Spatio-temporal cluster analyses of landslides in Italy at national and regional scale

Marj Tonini ^a, Gaetano Pecoraro ^b, Kim Romailer ^a, Michele Calvello ^b
(marj.tonini@unil.ch, gpecoraro@unisa.it)

^a Institute of Earth Surface Dynamics, Faculty of Geosciences and Environment,
University of Lausanne, Switzerland

^b Department of Civil Engineering, University of Salerno, Italy

Main objective

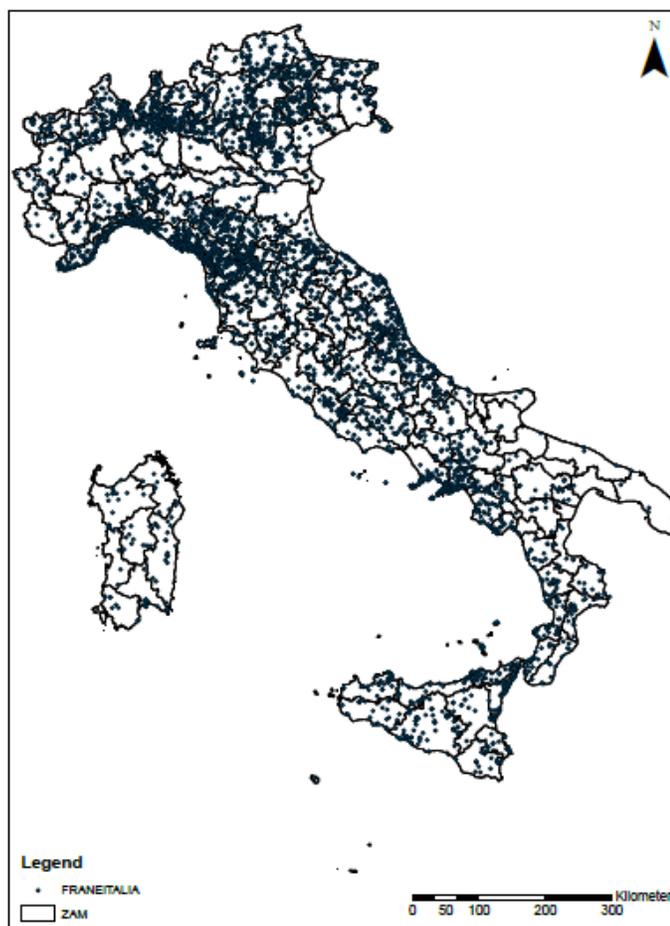
- Detection and mapping of spatio-temporal **clusters of landslides** for warning purposes.
- Analyses are performed both at national scale, considering the **Italian peninsula** and the surrounding islands, and at regional scale, focusing on the **Campania region**.
- At national scale, a subdivision of the territory into 158 **warning zones** (WZ), as identified by the civil protection regional centers to deal with weather-induced hydrogeological hazards, was adopted.
- The landslides inventory supporting the results is available on an open data repository, **FranelItalia**, a geo-referenced catalog developed consulting online news sources and reporting landslide events in Italy from 2010 to 2017
(<https://data.mendeley.com/datasets/zygb8jygrw/1>)



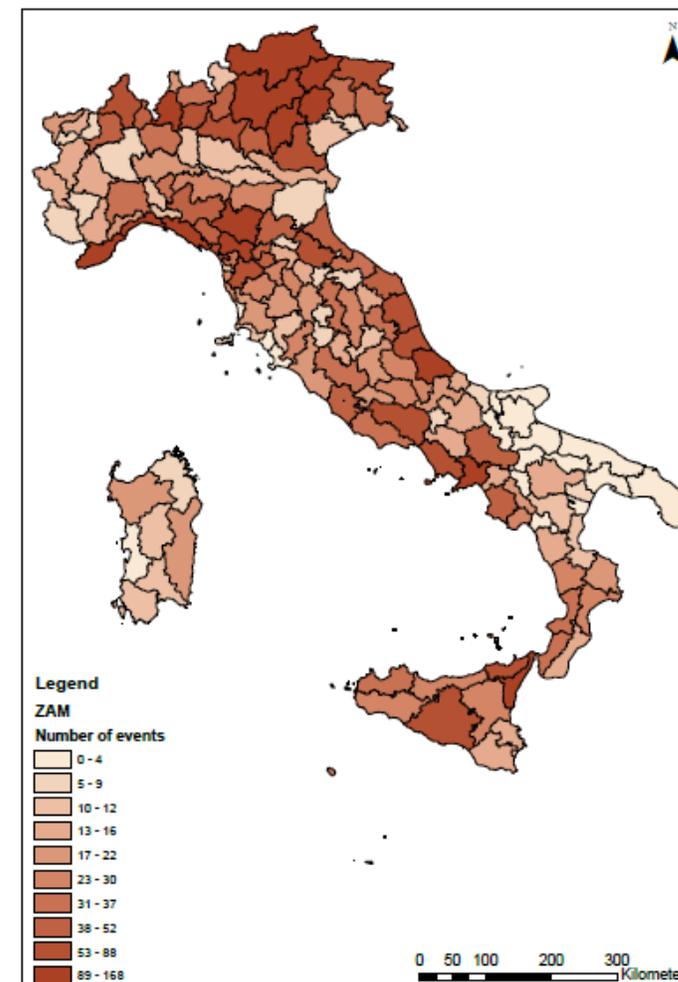
Dataset: landslide events at national scale



SLE = single landslide events.
 ALE = areal landslide events, referring to multiple landslides occurring in the same area and triggered by the same cause.



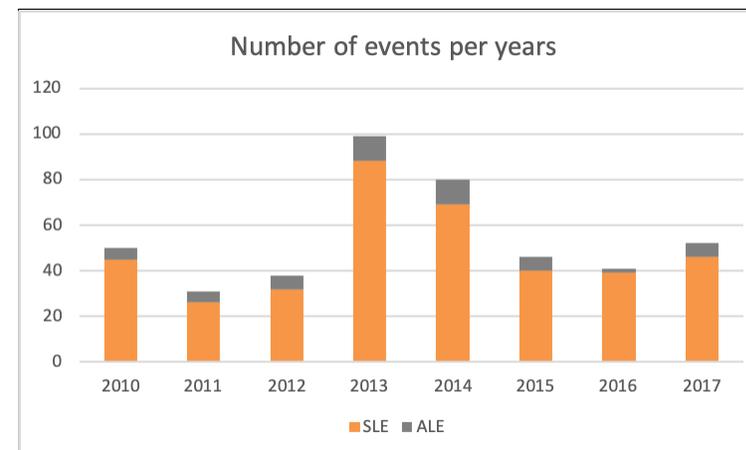
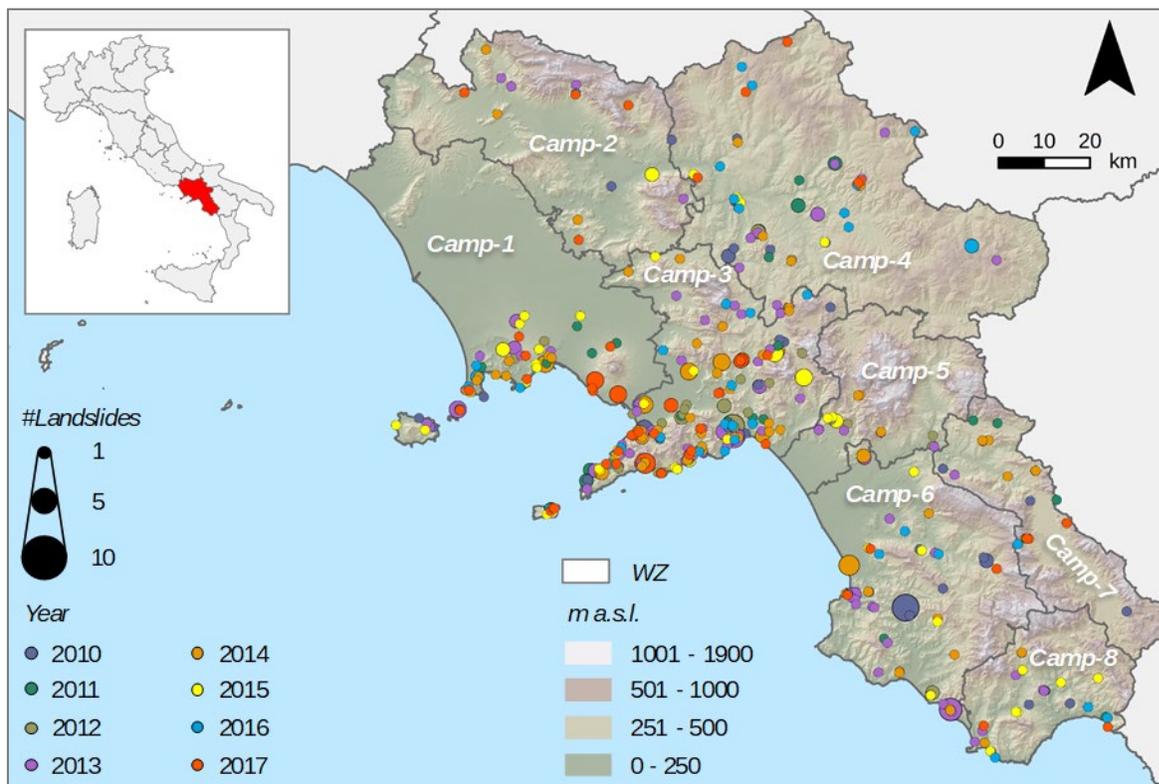
Franeltalia events



Density of events (by WZ)

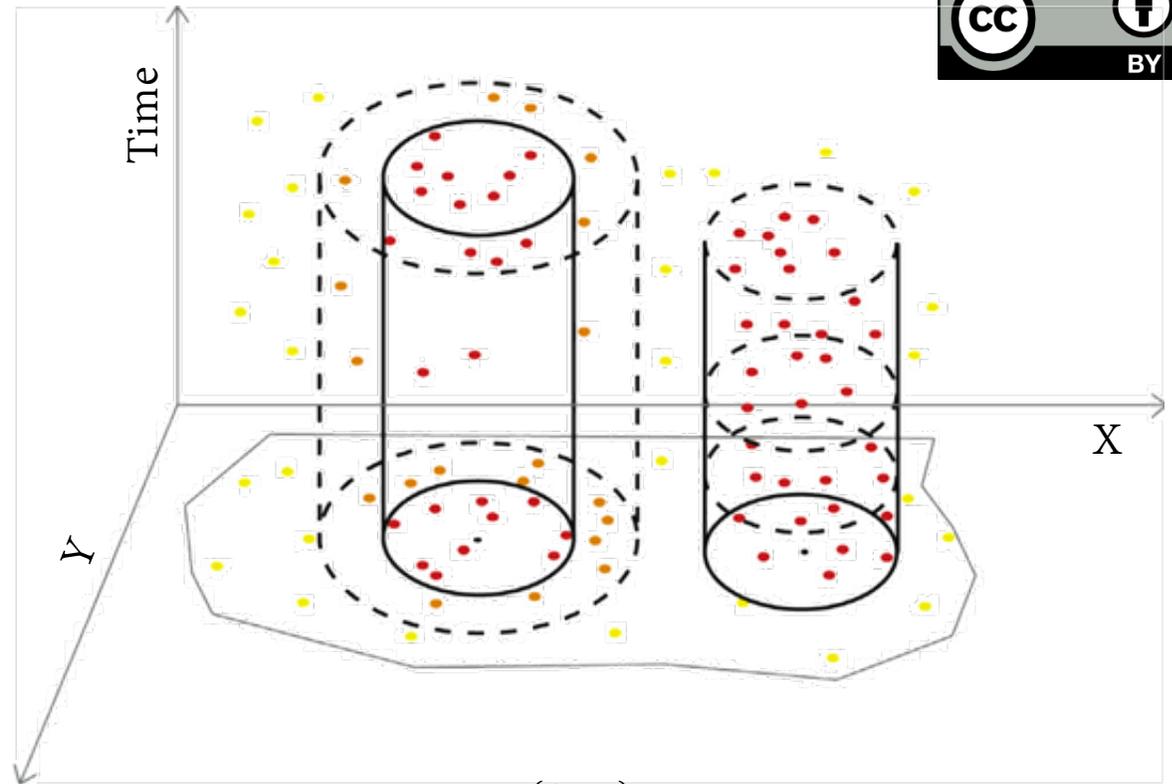
Dataset: landslide events at regional scale

Campania region



Statistical analysis

- The statistical analyses are conducted using the **space-time permutation scan statistics** model, accounting for the geographical spatial dimension as well as for the temporal dimension of events.
- Two types of analyses were performed, both at national and at regional scale:
 - **global analysis** encompassing the entire 8-year study period ;
 - **annual analysis** considering each single year.



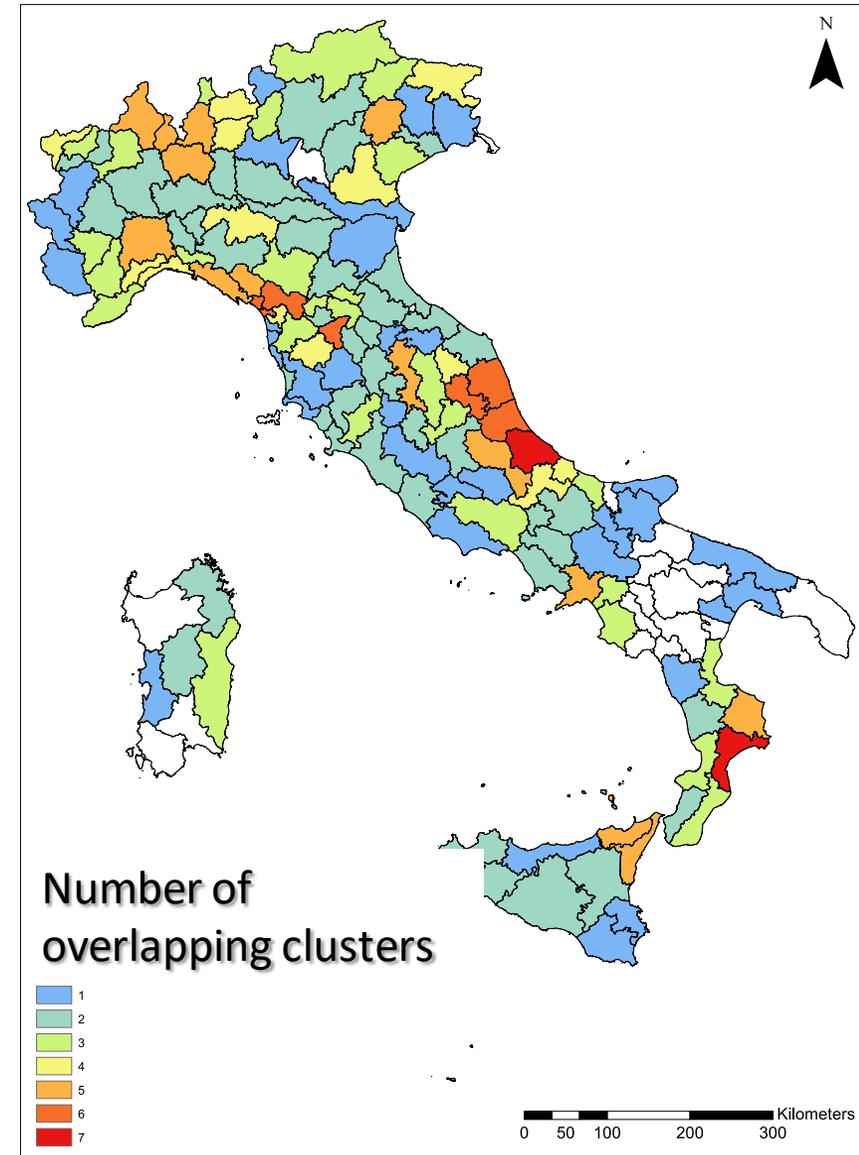
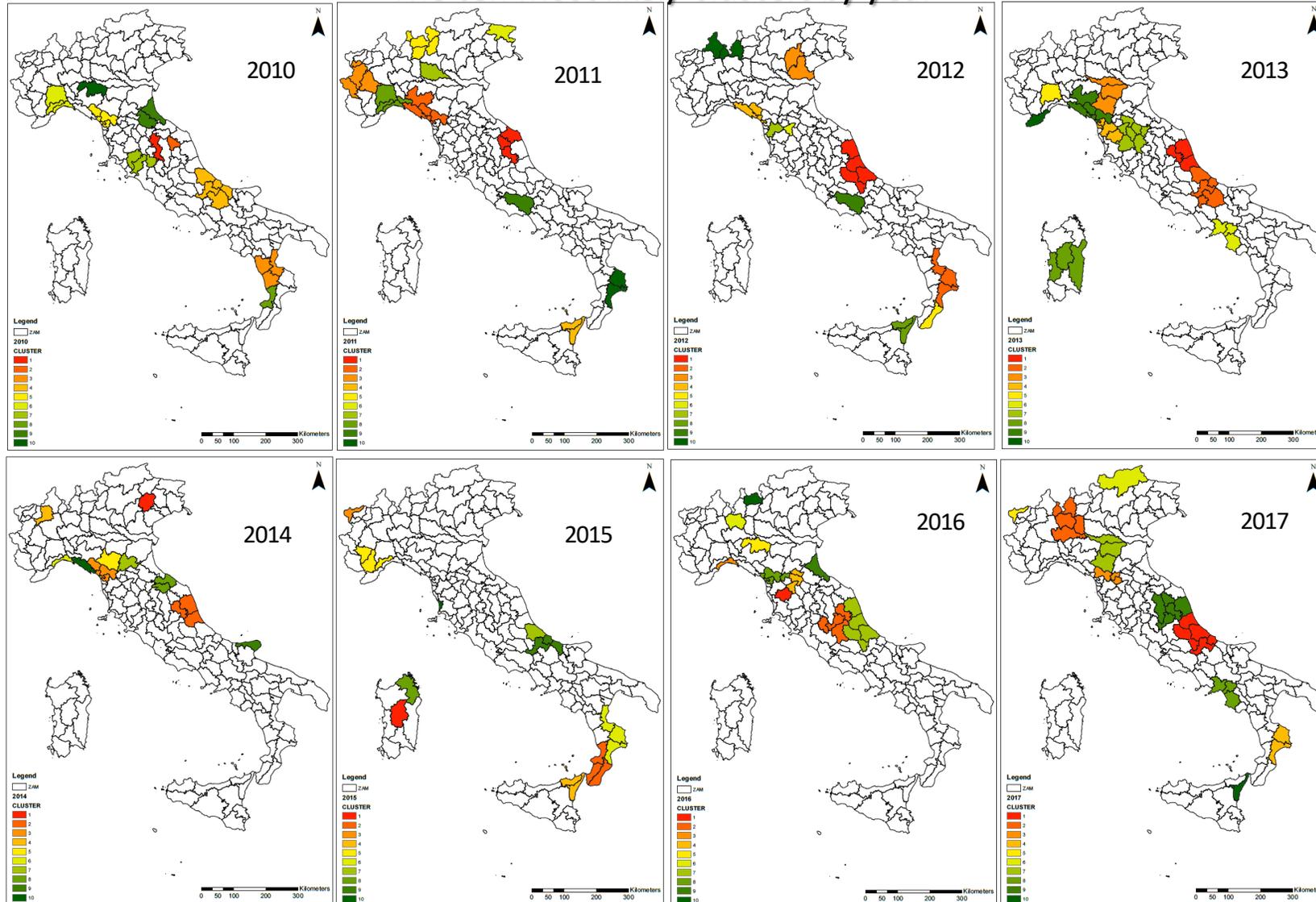
$$GLR = \left(\frac{c_{st}}{\mu_{st}} \right)^{c_{st}} \left(\frac{C - c_{st}}{C - \mu_{st}} \right)^{(C - c_{st})}$$

C_{st} : events falling inside and outside ($C - c_{st}$) the cylinder
 μ_{st} : expected number of events

| Scale | Spatial aggregation | Temporal aggregation | | Max spatial size (radius) | Max temporal size | |
|-----------------|---------------------|----------------------|---------|------------------------------|-------------------|----------|
| | | Annual | Global | | Annual | Global |
| National | Warning zone | 1 day | 1 month | 50 Km | 1 month | 6 months |
| Regional | (None) | 1 day | 1 month | 10 km | 1 week | 6 months |

Results: annual analyses at national scale

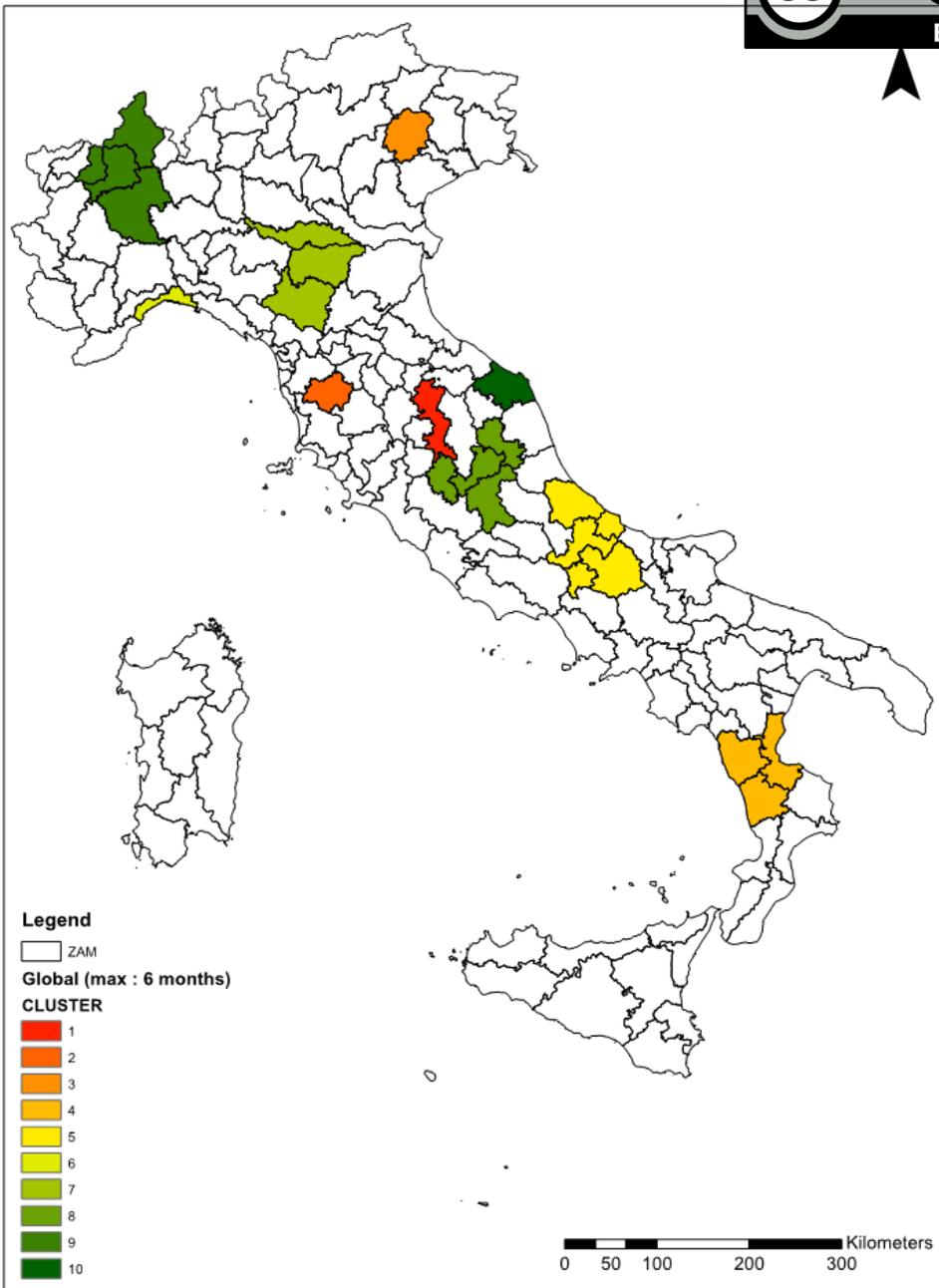
The ten most likely clusters by year



Results: global analyses at national scale

The ten most likely clusters over the entire study period (2010-2017)

| CLUSTER | START_DATE | END_DATE | P_VALUE | OBSERVED | EXPECTED |
|---------|------------|------------|----------|----------|----------|
| 1 | 2010/12/1 | 2010/12/31 | 1.00E-17 | 61 | 4.52 |
| 2 | 2016/4/1 | 2016/4/30 | 1.00E-17 | 30 | 0.52 |
| 3 | 2014/8/1 | 2014/8/31 | 1.00E-17 | 43 | 2.03 |
| 4 | 2010/1/1 | 2010/2/28 | 1.00E-17 | 44 | 2.94 |
| 5 | 2015/1/1 | 2015/4/30 | 1.00E-17 | 78 | 12.63 |
| 6 | 2014/10/1 | 2014/11/30 | 1.00E-17 | 59 | 7.89 |
| 7 | 2013/3/1 | 2013/4/30 | 1.00E-17 | 79 | 15.46 |
| 8 | 2016/10/1 | 2016/10/31 | 1.00E-17 | 28 | 1.05 |
| 9 | 2014/11/1 | 2014/12/31 | 1.00E-17 | 50 | 6.00 |
| 10 | 2011/3/1 | 2011/5/31 | 1.00E-17 | 40 | 3.65 |

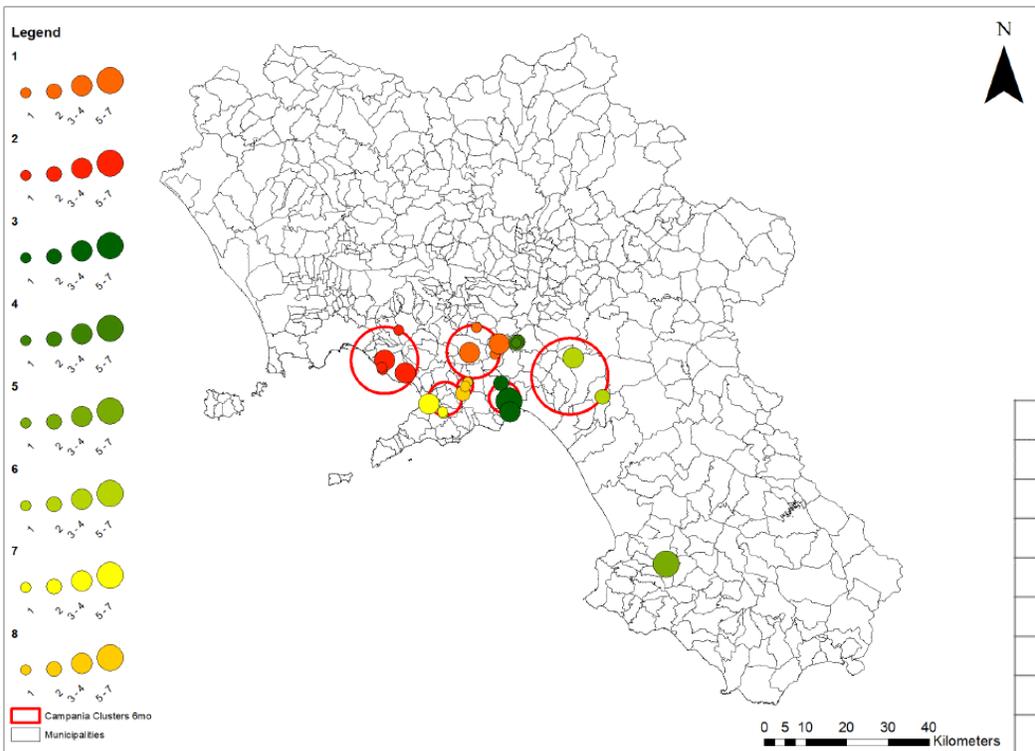


Results: cluster analyses at regional scale

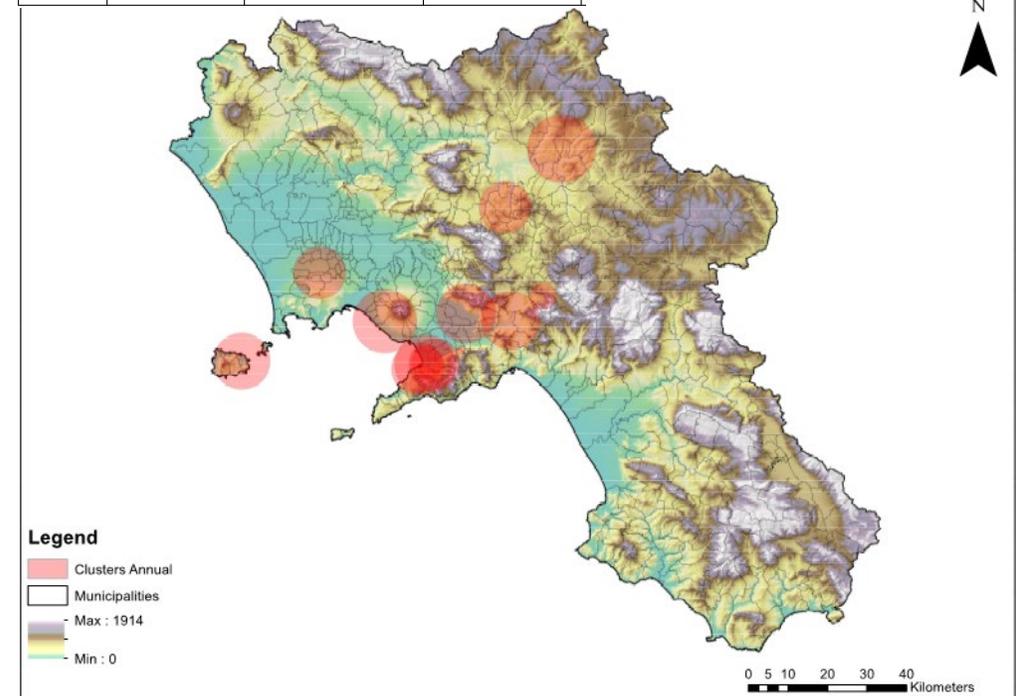
| YEAR | CLUSTER | START_DATE | END_DATE |
|------|---------|------------|------------|
| 2010 | 1 | 2010/12/27 | 2010/12/27 |
| | 2 | 2010/9/9 | 2010/9/11 |
| | 3 | 2010/12/4 | 2010/12/5 |
| 2011 | 1 | 2011/3/8 | 2011/3/9 |
| 2012 | 1 | 2012/12/15 | 2012/12/15 |
| | 2 | 2012/9/13 | 2012/9/13 |
| | 3 | 2012/10/31 | 2012/10/31 |
| 2013 | 1 | 2013/1/15 | 2013/1/15 |
| | 2 | 2013/1/19 | 2013/1/25 |
| | 3 | 2013/10/6 | 2013/10/6 |
| 2014 | 1 | 2014/7/31 | 2014/7/31 |
| | 2 | 2014/2/27 | 2014/3/2 |
| | 3 | 2014/9/12 | 2014/9/12 |
| | 4 | 2014/9/1 | 2014/9/1 |
| 2015 | 1 | 2015/10/11 | 2015/10/11 |
| | 2 | 2015/10/7 | 2015/10/7 |
| 2017 | 1 | 2017/11/6 | 2017/11/6 |
| | 2 | 2017/11/5 | 2017/11/5 |

Overlapping annual clusters

Significant cluster over the entire investigated period



| Cluster ID | Start date | End date |
|------------|------------|------------|
| 01 | 2010/09/01 | 2010/09/30 |
| 02 | 2010/12/01 | 2010/12/31 |
| 03 | 2012/09/01 | 2012/10/31 |
| 04 | 2012/09/01 | 2013/01/31 |
| 05 | 2014/07/01 | 2014/07/31 |
| 06 | 2015/12/01 | 2015/12/31 |
| 07 | 2017/09/01 | 2017/10/31 |
| 08 | 2017/10/01 | 2017/11/30 |



Conclusions

- The **spatio-temporal cluster analysis** allows discovering clusters of landslides caused, in a given period, by a single triggering event, usually an intense rainfall.
- This approach can be considered complementary to the **landslide index (LI)**, for the visualization and the quantitative assessment of landslides events inventoried both at national and regional scale:
 - LI highlights areas where the density of landslides is higher during the entire study period;
 - the spatio-temporal cluster analysis allows detecting areas characterized by relevant and recurrent landslide activity in a specific time frame.

REFERENCE: Tonini M., Pecoraro G., Romailier K., Calvello M. *Spatio-temporal analysis of recent Italian landslides for warning purposes*. Submitted to Journal (April 2020).

