

# A data-driven model for the assessment of shallow landslides hazard with the integration of satellite soil moisture and rainfall data

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# 1. THE PROBLEM



Rainfall-induced shallow landslides: triggered by short-period but very intense rainfall events; causing significant damages to cultivations, roads and building



27<sup>th</sup>-28<sup>th</sup> April 2009 event in Oltrepò Pavese (1639 shallow landslides in about 250 km<sup>2</sup>)

## 2. BACKGROUND

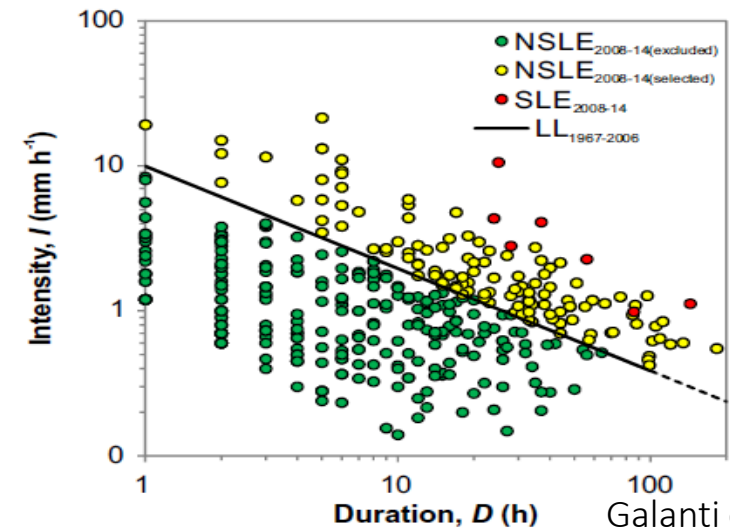
Methodologies for the assessment of spatial and temporal probability of occurrence or hazard of shallow landslides

Rainfall thresholds

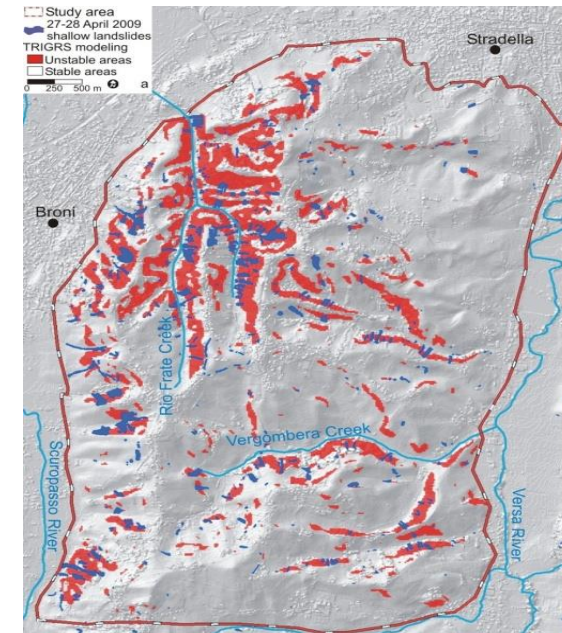
- + Rainfall features representative of the triggering conditions
- + Easily to be implemented at regional scale
- Soil features and geomorphological predisposing factors are not considered
- Uncertainties related to the quality and the amount of the rainfall data

Physically-based methods

- + Quantitative analysis of the rainfall triggering conditions leading to the triggering
- + Consideration of the soil hydrological and geotechnical parameters and of the geomorphological attributes
- + Analysis of change in time of stable/unstable areas
- Significant amount of input data, difficult to be implemented at large scale
- Uncertainties on the boundary conditions of the model



Galanti et al., 2018



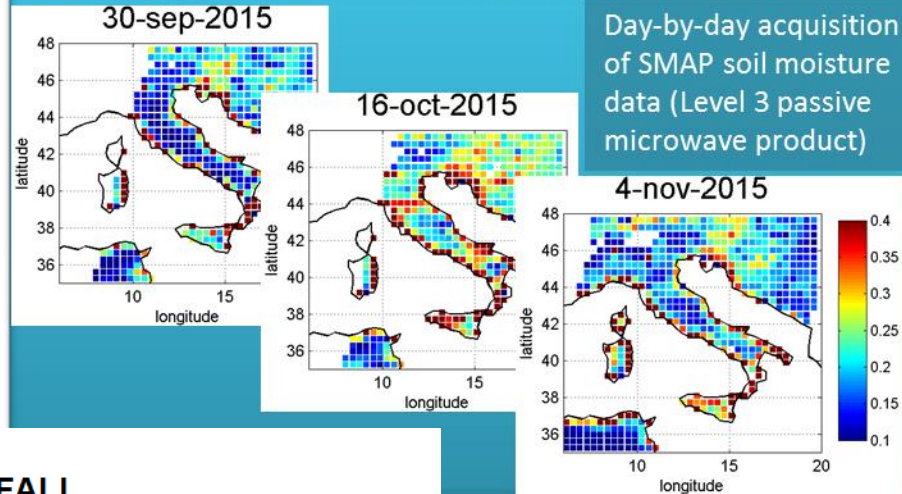
Bordoni et al., 2015

## 2. BACKGROUND

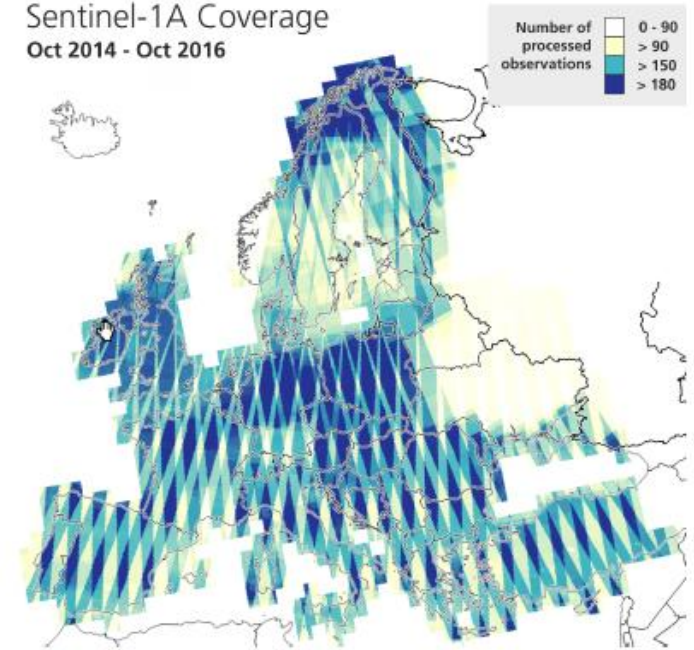
### Satellite soil moisture for hydrological app

- ASCAT (12.5 km, 12 ore)
- Sentinel-1 (1 km, 2-3 giorni)
- SCATSAR (1 km, giornaliero)
- SMAP, SMOS, AMSR2 (3-9-25 km, giornaliero)

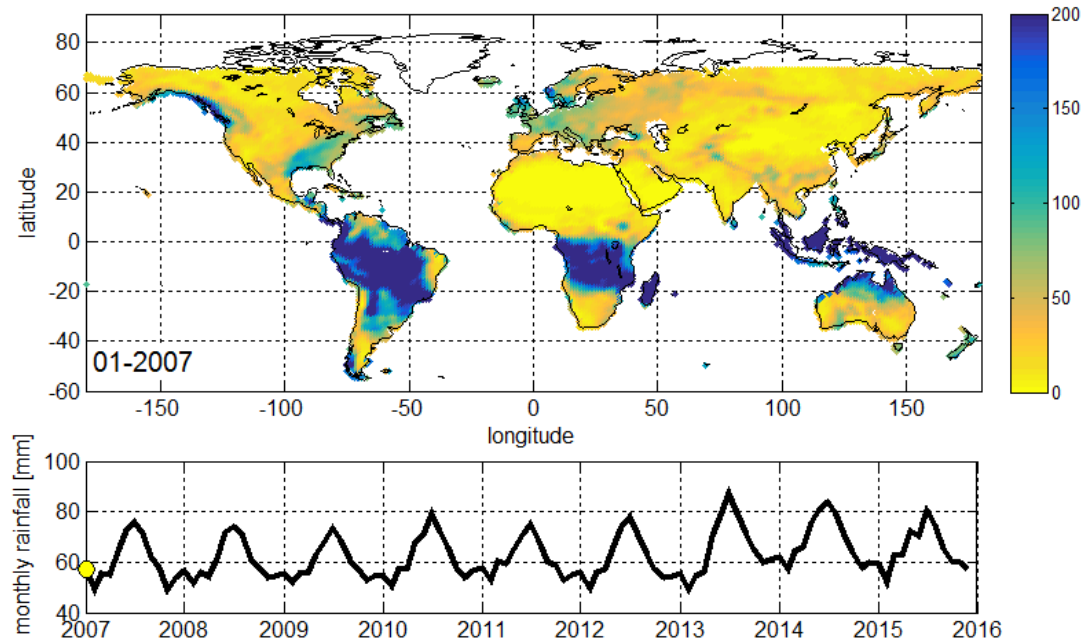
### REAL-TIME ACQUISITION OF SMAP SOIL MOISTURE DATA OVER ITALY



### Sentinel-1A Coverage Oct 2014 - Oct 2016



### SM2RAIN<sub>ASCAT</sub> - MONTHLY RAINFALL



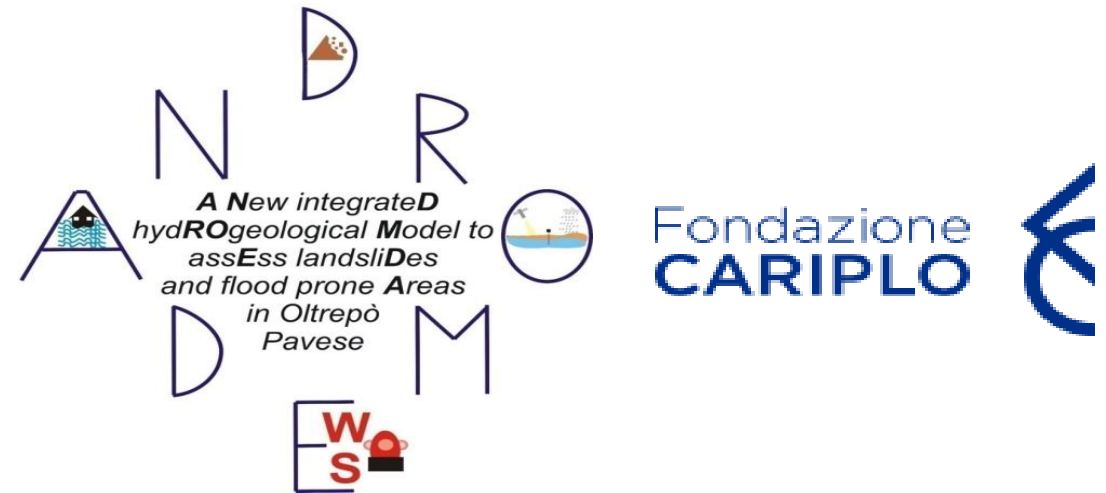
**Detecting rainfall from the bottom up:** using soil moisture observations for measuring rainfall (**SM2RAIN**) (Brocca et al., 2014)

- GPM-IMERG (10 km, 30 minuti)
- SM2RAIN-derived:
  - ASCAT (12.5 km, giornaliero)
  - SCATSAR (1 km, giornaliero)
- Integrati (GPM+SM2RAIN)

### 3. OBJECTIVES

**Development and test of a dynamic method for the assessment of spatial and temporal probability of occurrence and hazard of rainfall-induced shallow landslides at large scale (catchement, regional), with the integration of satellite measures of rainfall and soil moisture**

The work was realized in the frame of ANDROMEDA project, funded by Fondazione Cariplo and realized by University of Pavia and CNR-IRPI Perugia, which aims to develop a prototypal early-warning system for the assessment of shallow landslides and flood occurrence in Oltrepò Pavese area



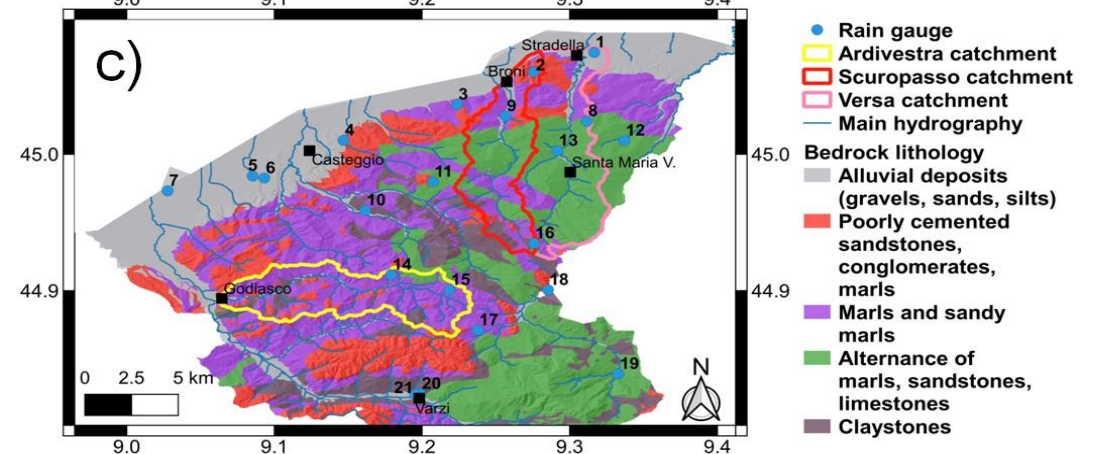
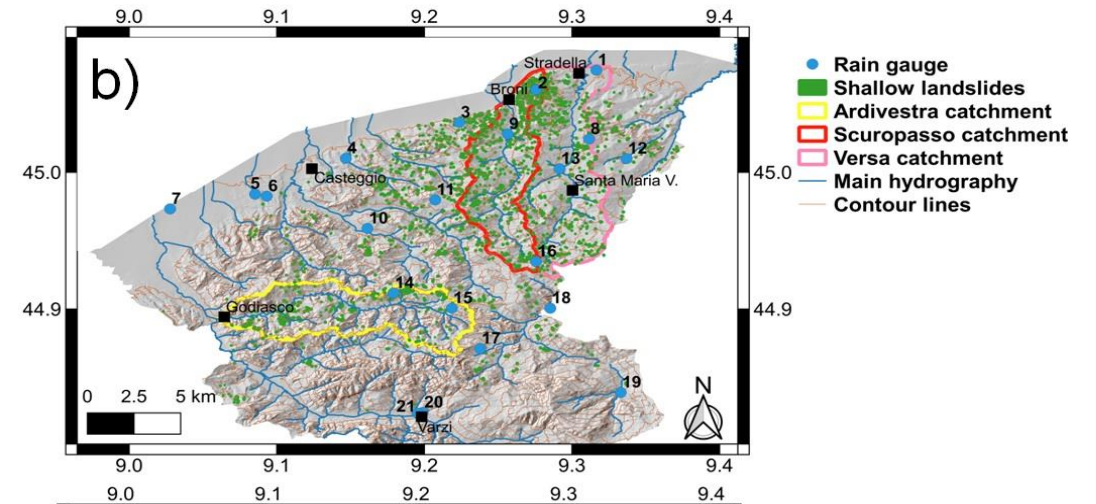
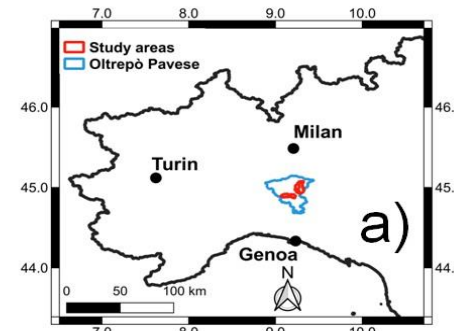
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# 4. STUDY AREAS

## Oltrepò Pavese area (720 km<sup>2</sup>)

Pilot catchments representative of the typical geological and geomorphological settings: **Ardivestra** (medium steep slopes, clayey and chaotic bedrocks) **Scuropasso-Versa** (very steep slopes, marly, arenaceous, conglomeratic bedrocks)



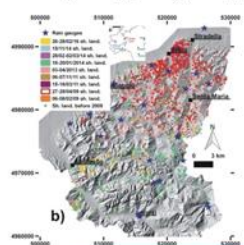
# 5. METHODS

## INPUT DATA

DTM (1x1m)  
Land use  
Lithotechnical map



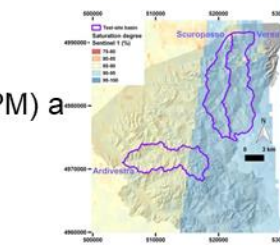
Shallow landslides / flood inventories



Field measured rainfall and soil moisture



Satellite rainfall (GPM) and soil moisture (ASCAT, Sentinel)

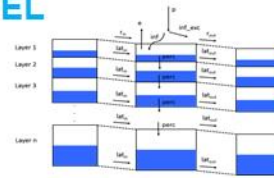


Comparison in situ and satellite data



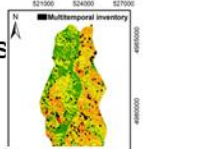
## INTEGRATED HYDROLOGICAL-HYDRAULIC MODEL

Spatial and temporal model of soil moisture dynamics

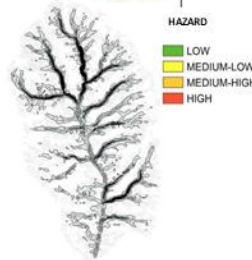


BASIN SCALE  
hazard assessment integrating  
satellite rainfall/soil moisture

Shallow landslides hazard



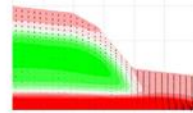
Floods hazard



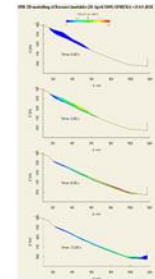
VALIDATION

SLOPE SCALE

Finite Elements Modeling



Triggering

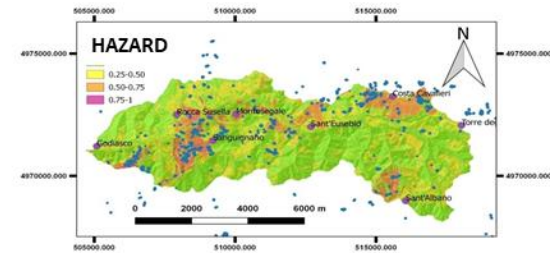


Run out

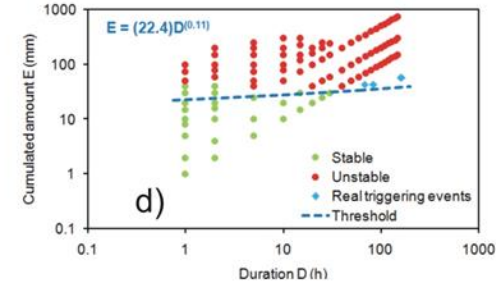


## OUTPUTS

Shallow landslides / floods hazard and risk scenarios for different return periods



Soil moisture – rainfall thresholds for the occurrence of shallow landslides or floods

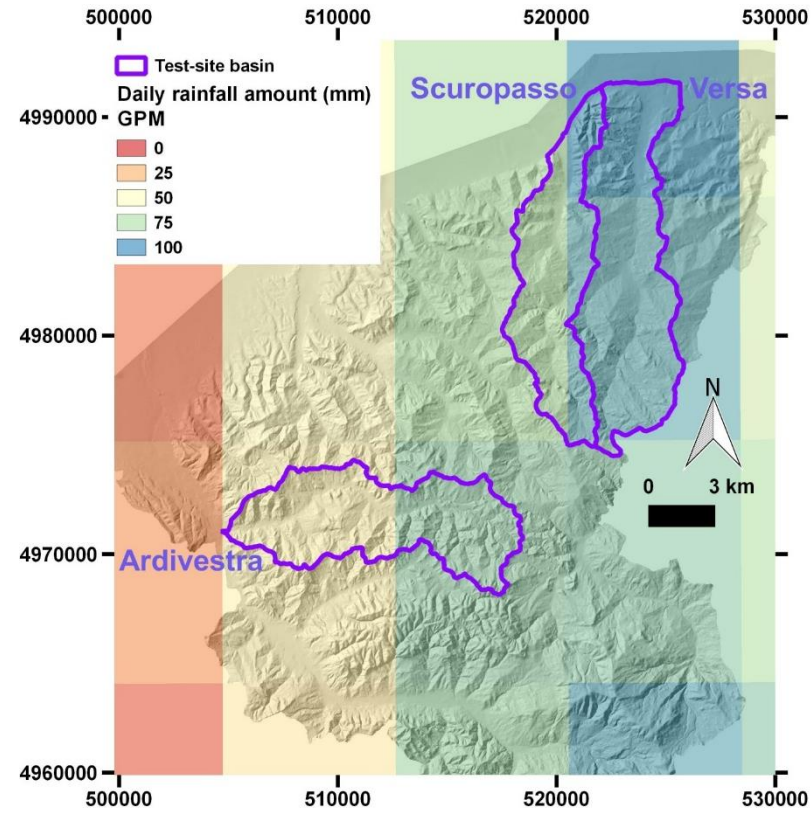


prototypal EWS validation

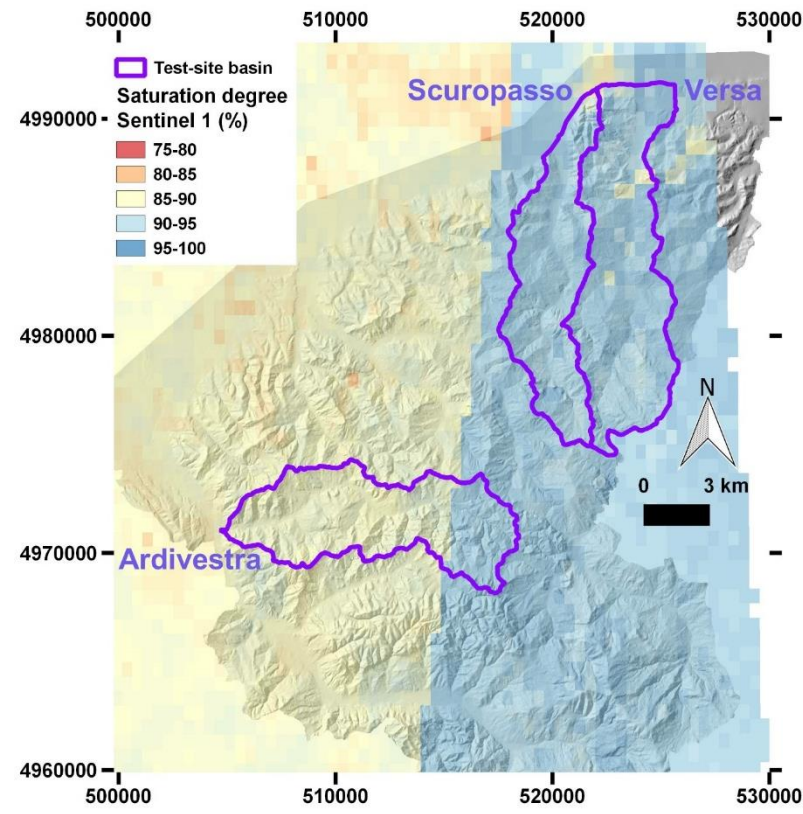
# 6. RESULTS - COMPARISON BETWEEN FIELD AND SATELLITE MEASURES

## Maps of rainfall and soil moisture measured through satellites

### Rainfall GPM

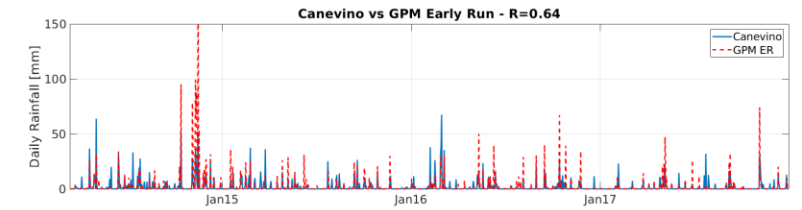
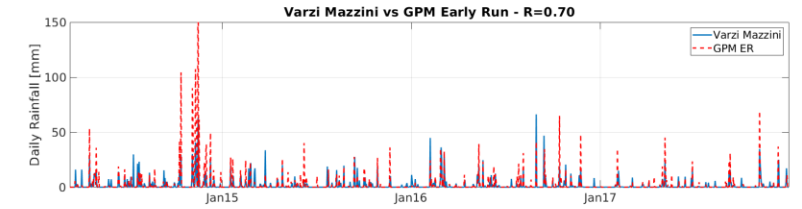


### Soil moisture Sentinel 1

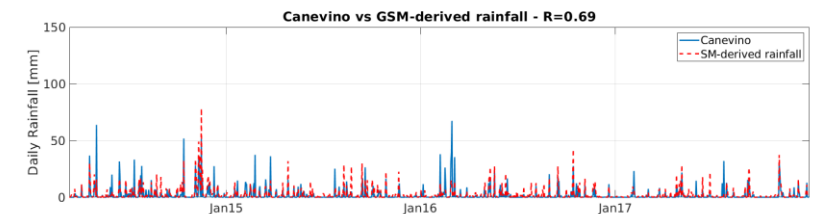
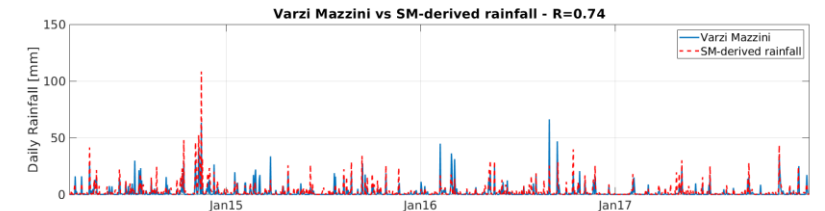


## Validation of satellite data through field measures

### Rain gauge vs GPM: $R=0.64-0.70$



### Rain gauge vs SM2RAIN-ASCAT: $R=0.69-0.74$

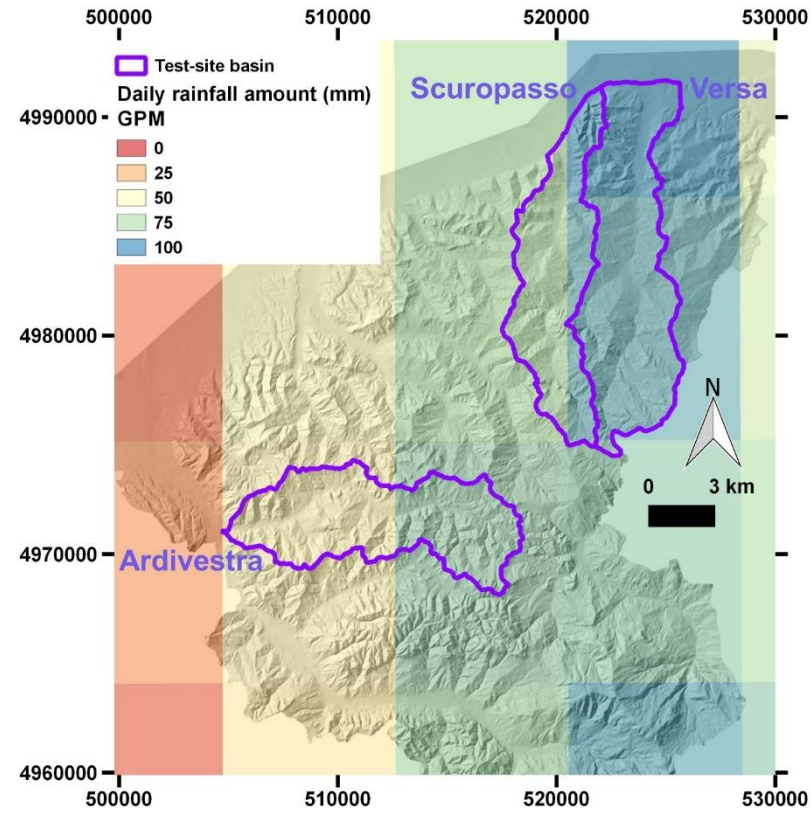




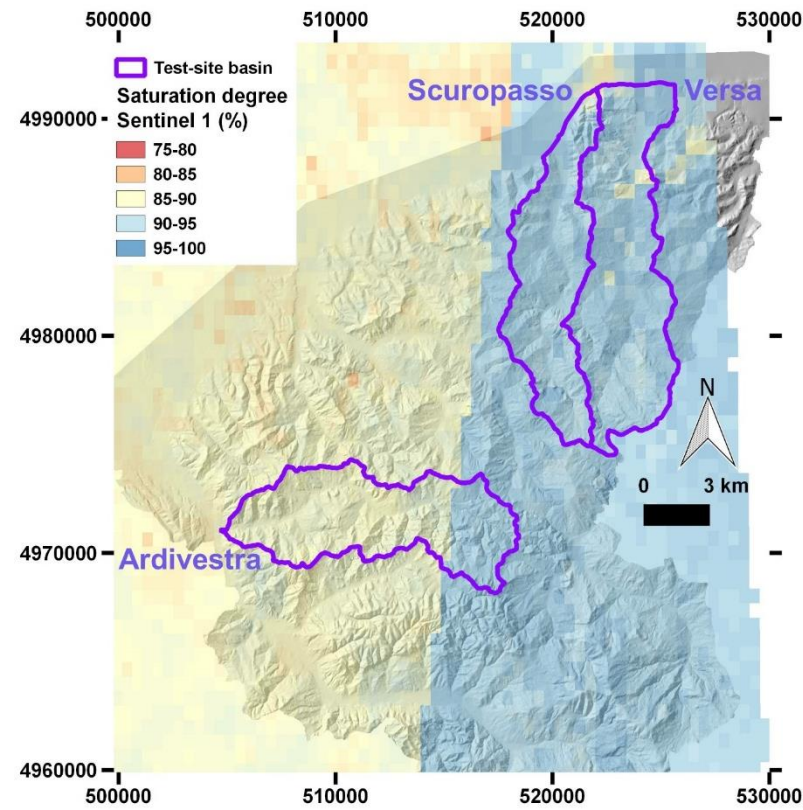
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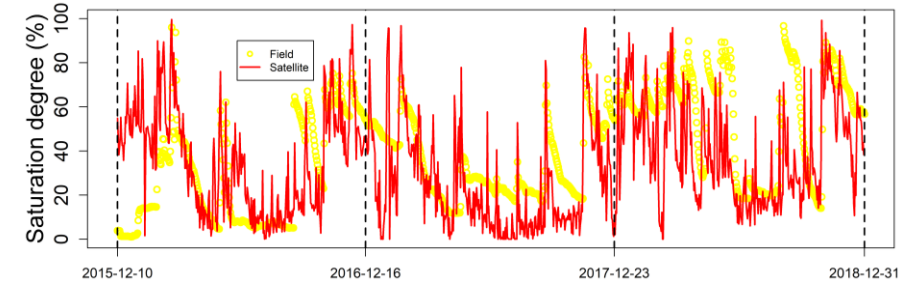
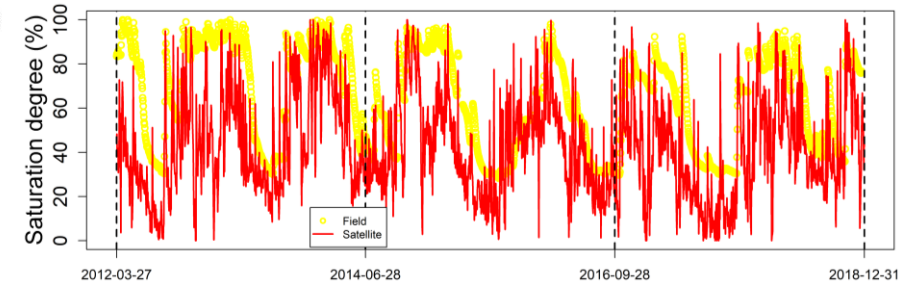


### Soil moisture Sentinel 1

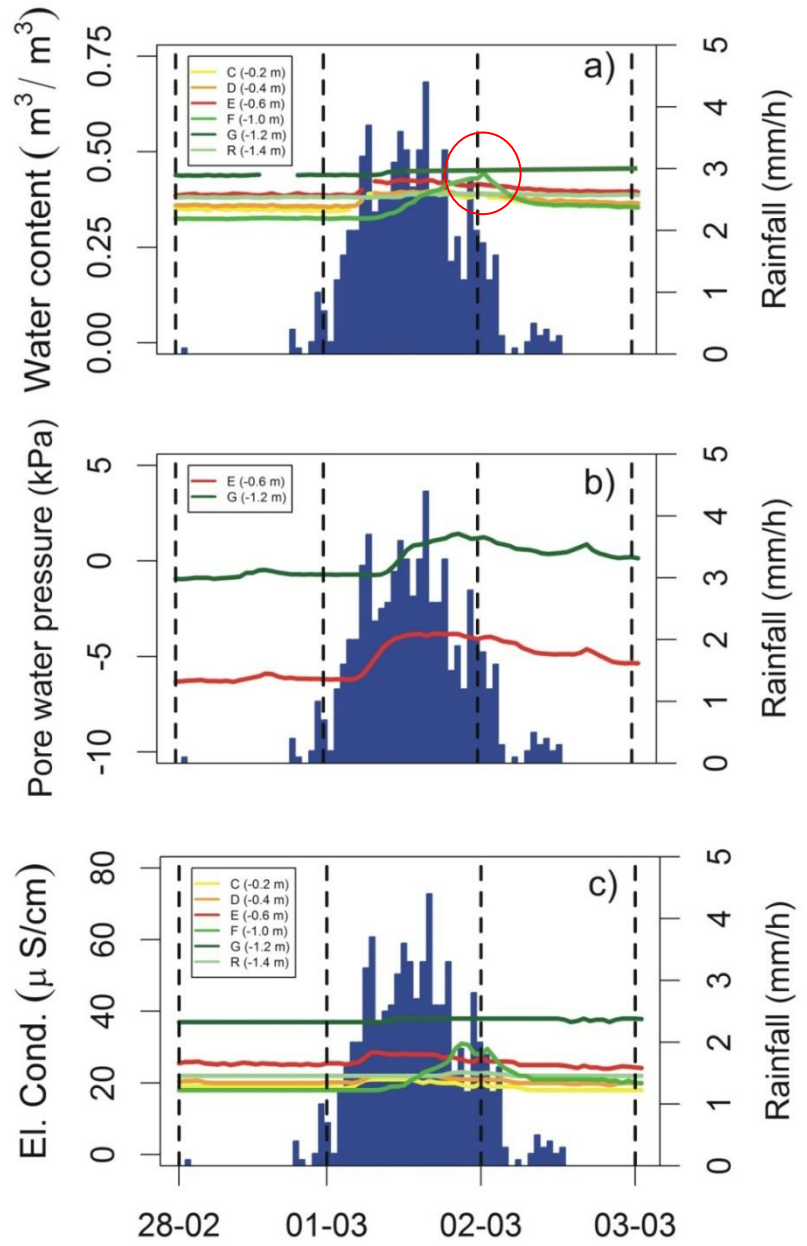


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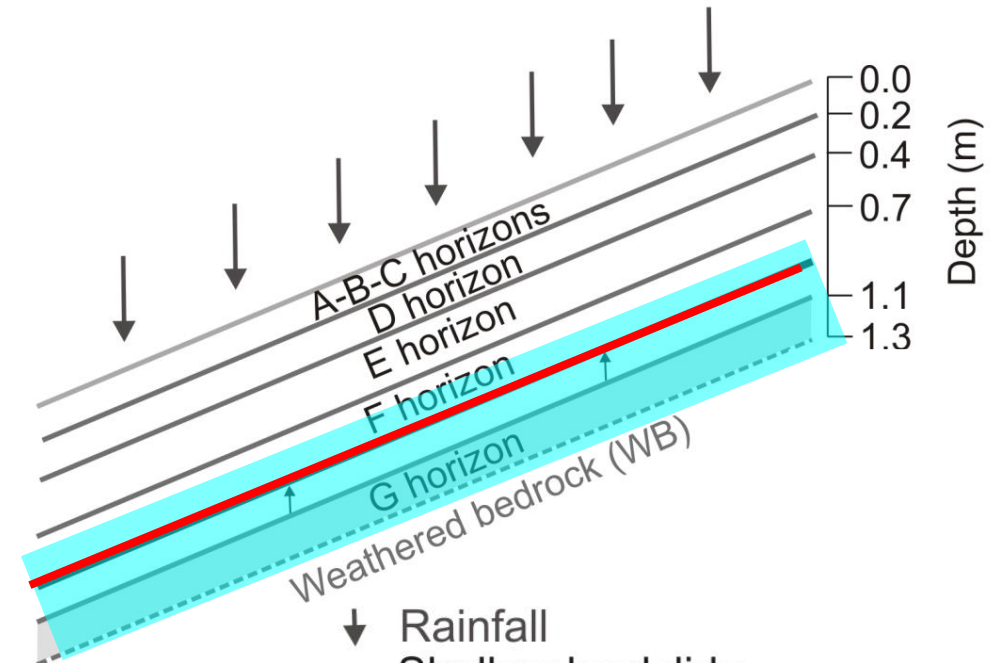
### Field soil moisture vs ASCAT: $R=0.64-0.71$



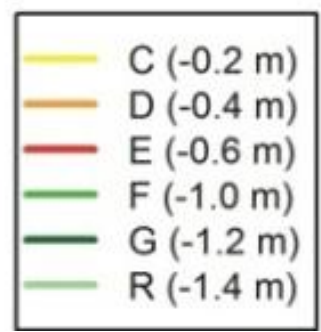
# 6. RESULTS - TRIGGERING CONDITIONS OF SHALLOW LANDSLIDES THROUGH FIELD MONITORING



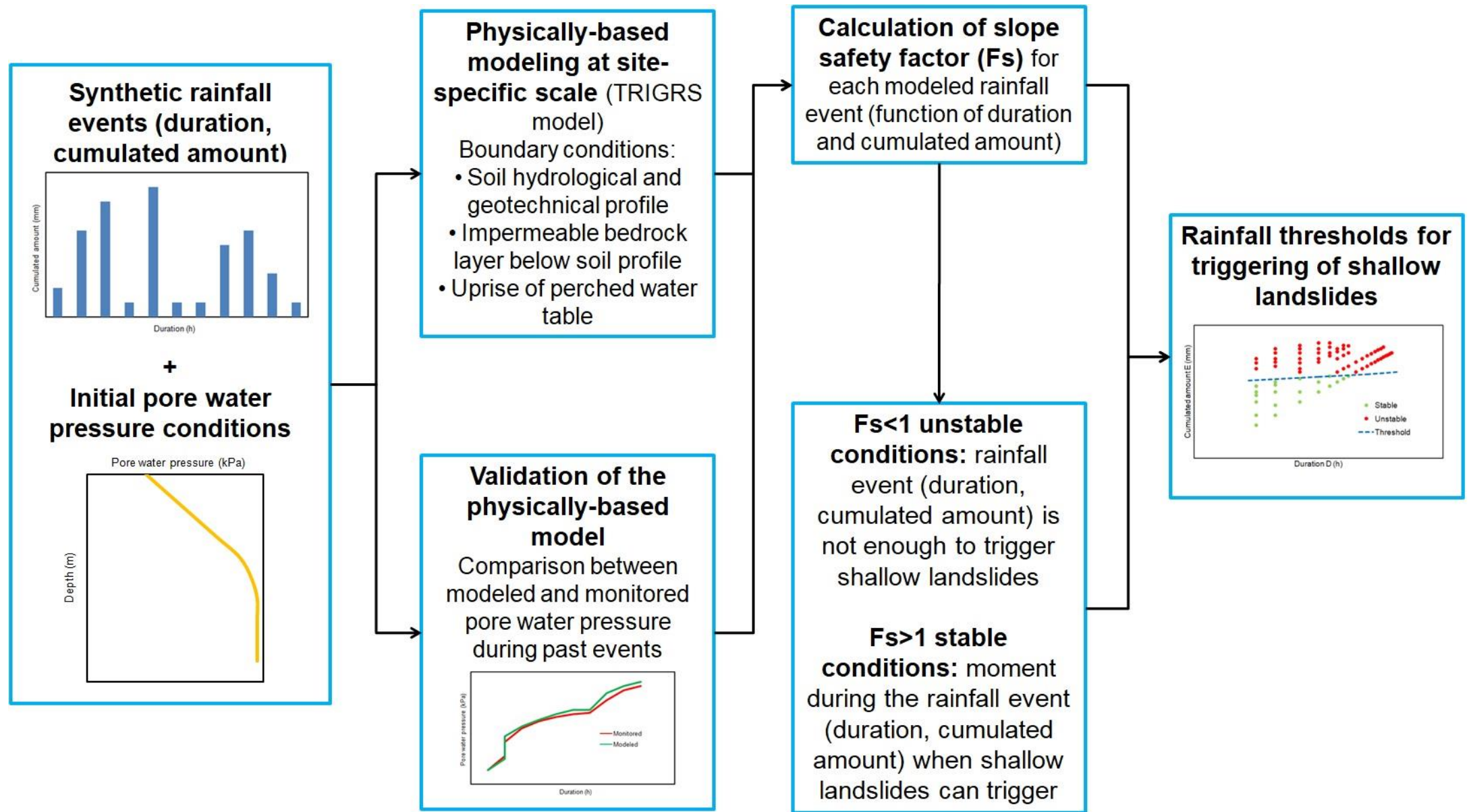
28 February-2 March 2014 event (69 mm in 42 h)



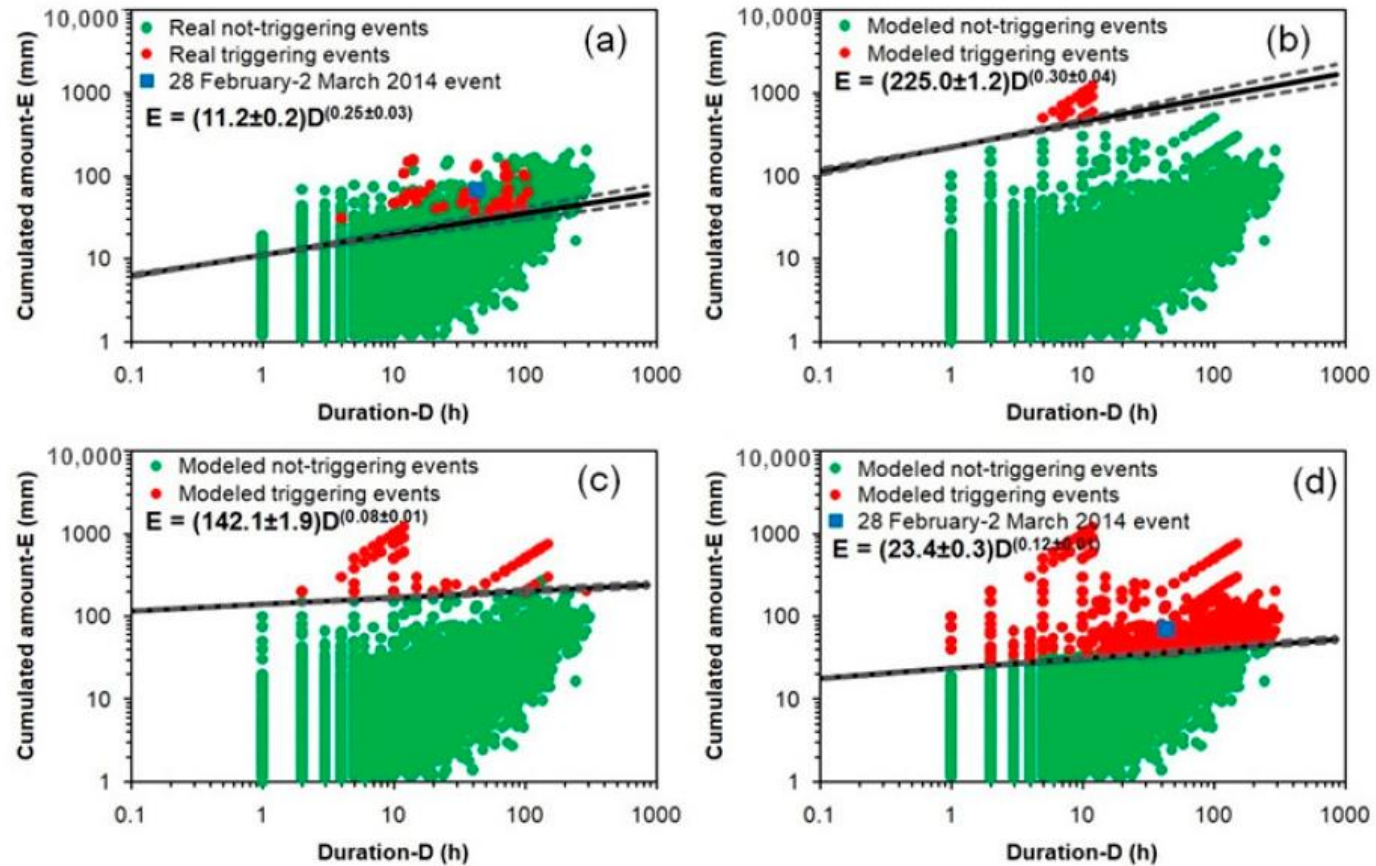
- ↓ Rainfall
- Shallow landslide sliding surface
- Perched-water table during wet periods
- ↑ Uprising of water table



# 6. RESULTS - RAINFALL THRESHOLDS



# 6. RESULTS - RAINFALL THRESHOLDS



- Significant differences on the rainfall cumulated amount between different thresholds
- Significant effects of the initial pore water pressure on the cumulated amount required to trigger shallow landslides
- Low values of triggering rainfall for empirical-statistical thresholds
- Better estimation of rainfall triggering conditions since thresholds reconstructed through physically-based methods

Threshold	TP (%)	TN (%)	FP (%)	FN (%)
Empirical thresholds	95 ± 2	76 ± 3	24 ± 3	5 ± 2
Physicallybased thresholds (-20 kPa) (TRIGRS/-20)	-	100 ± 0	0 ± 0	-
Physicallybased thresholds (-10 kPa) (TRIGRS/-10)	-	100 ± 0	0 ± 0	-
Physicallybased thresholds (0 kPa) (TRIGRS/0)	100 ± 0	93 ± 1	7 ± 1	0 ± 0

## 7. FUTURE DEVELOPMENTS

- ❑ Testing the data-driven approach for rainfall events with different features
- ❑ Comparison between data-driven and physically-based methodologies for shallow landslides hazard assessment
- ❑ Reconstruction of rainfall thresholds through satellite data (rainfall, soil moisture)
- ❑ Comparison of the reconstructed thresholds with the official ones (Lombardy region early-warning system) for future events

# THANKS FOR THE ATTENTION

## References:

Bordoni M., Corradini B., Lucchelli L., Valentino R. Bittelli M., Vivaldi V., Meisina C. (2019). Empirical and physically based thresholds for the occurrence of shallow landslides in a prone area of Northern Italian Apennines. *Water* 11, 2653. doi:10.3390/w11122653

Bordoni M., Corradini B., Lucchelli L., Meisina C. (2019). Preliminary results on the comparisons between empirical and physically-based rainfall thresholds for shallow landslides occurrence. *Italian Journal of Engineering Geology and Environment*, 1, 5-10. doi:10.4408/IJEGE.2019-01.S-01

## For more information on ANDROMEDA project:

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