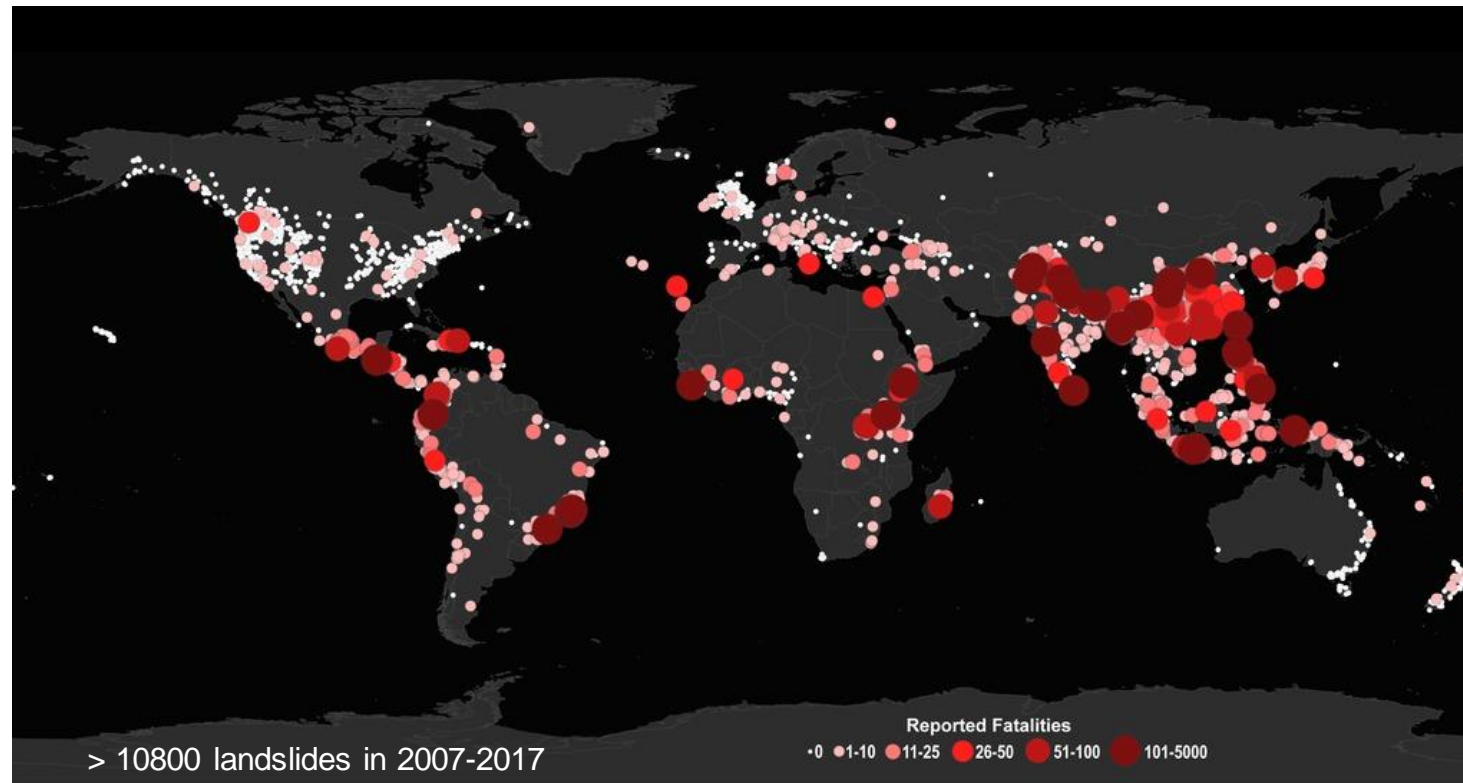


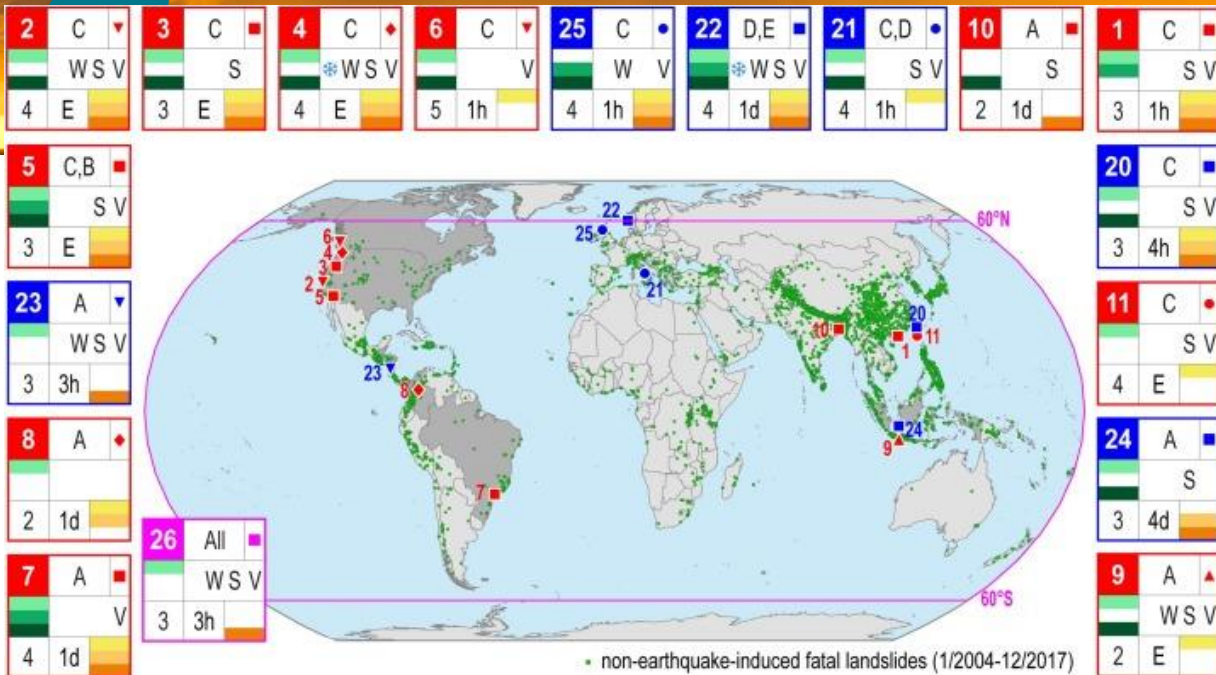
A dramatic landscape photograph showing a sunset over a field of tall grass. The sky is filled with dark, heavy clouds, and a bright lightning bolt strikes down on the right side. The sun is low on the horizon, creating a strong orange and yellow glow.

Landslide hazard assessment through satellite precipitation products

Luca Ciabatta and the Hydrology Group of IRPI-CNR (Italy)

Worldwide, **rainfall-induced landslides** are among the most common and dramatic natural hazards.





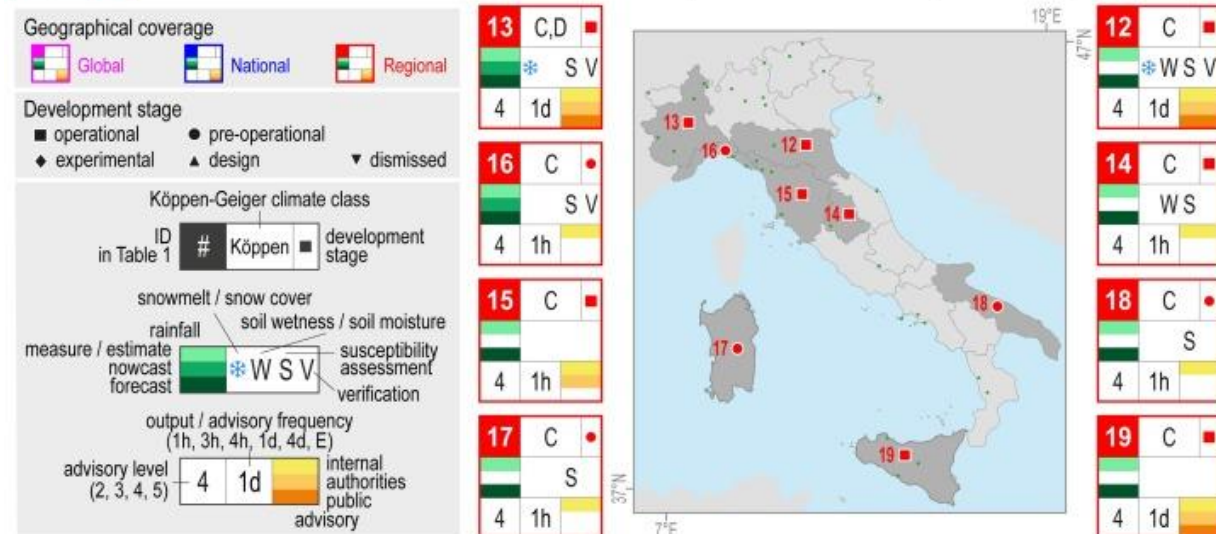
To mitigate the landslide risk, **early warning systems** based on rainfall thresholds were developed in several countries

Only 26 past and present LEWS

Not evenly distributed over the World

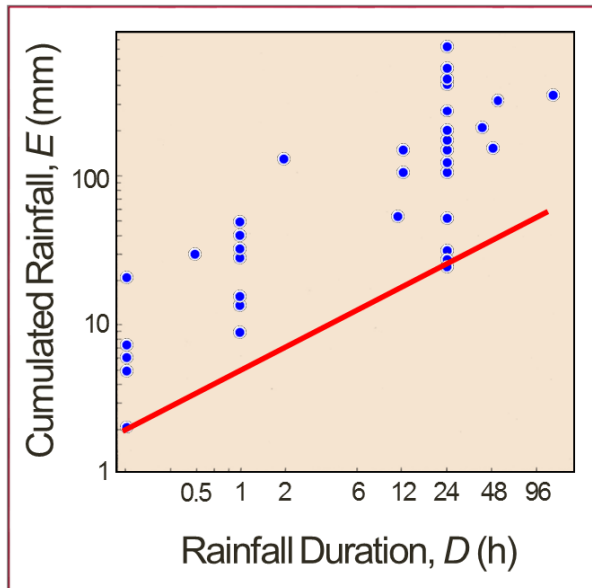
Many of them are still in development

LEWS are based mainly on **rain gauge** measurements.



Guzzetti et al. (2020) – Earth-Science Reviews

Rainfall thresholds



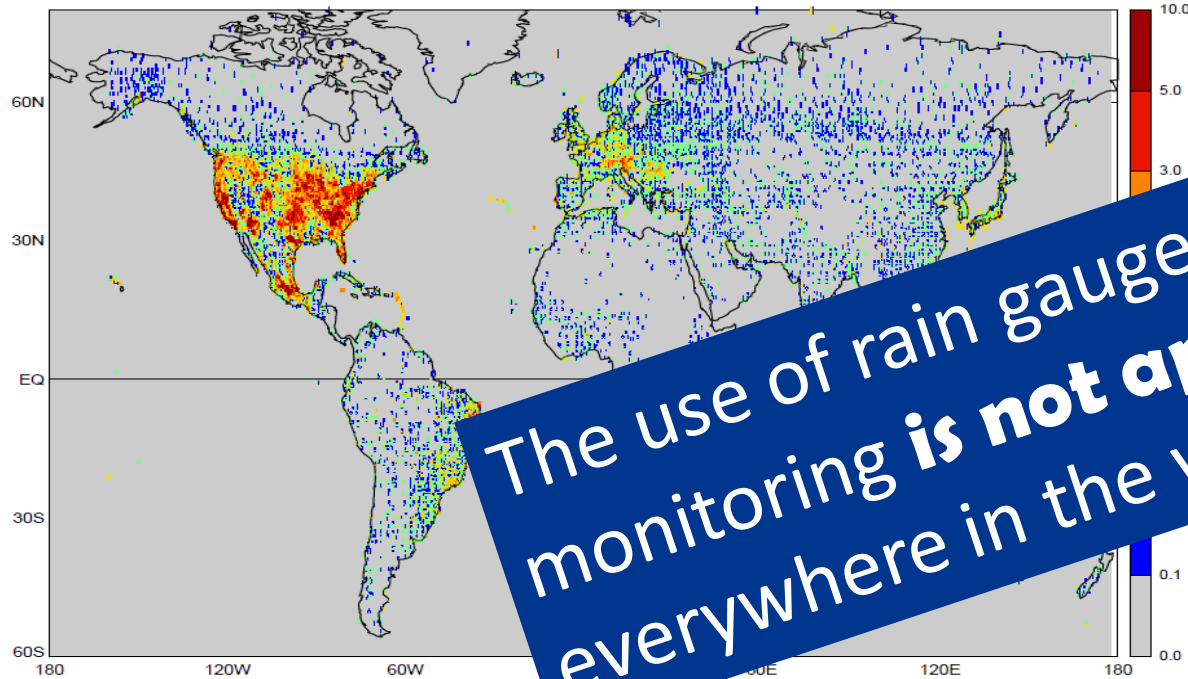
Innes (1983)

Empirical relationships that are defined as the best separators of rainfall conditions that resulted and did not result in slope instability. They take into account rainfall characteristics as for the ED thresholds:

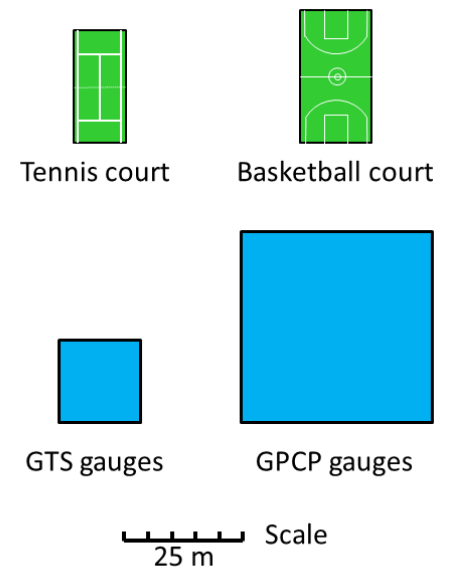
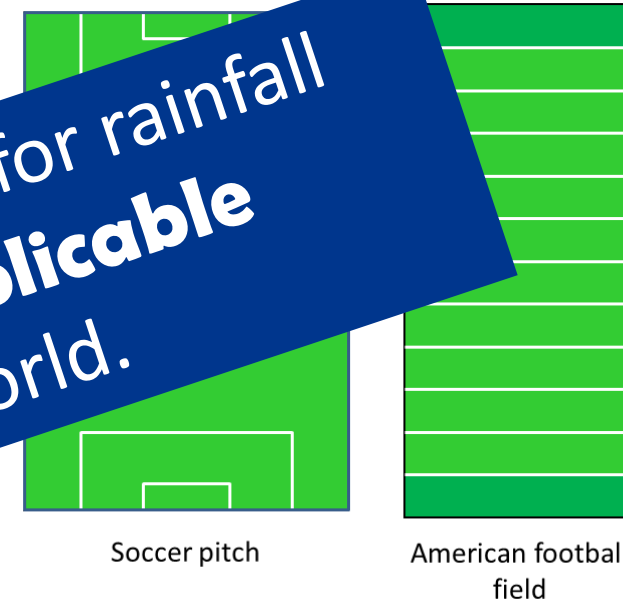
$$E = \alpha \cdot D^\gamma, \gamma > 0$$

where E is in mm and D in h.

Global precipitation climatology project rain gauge stations

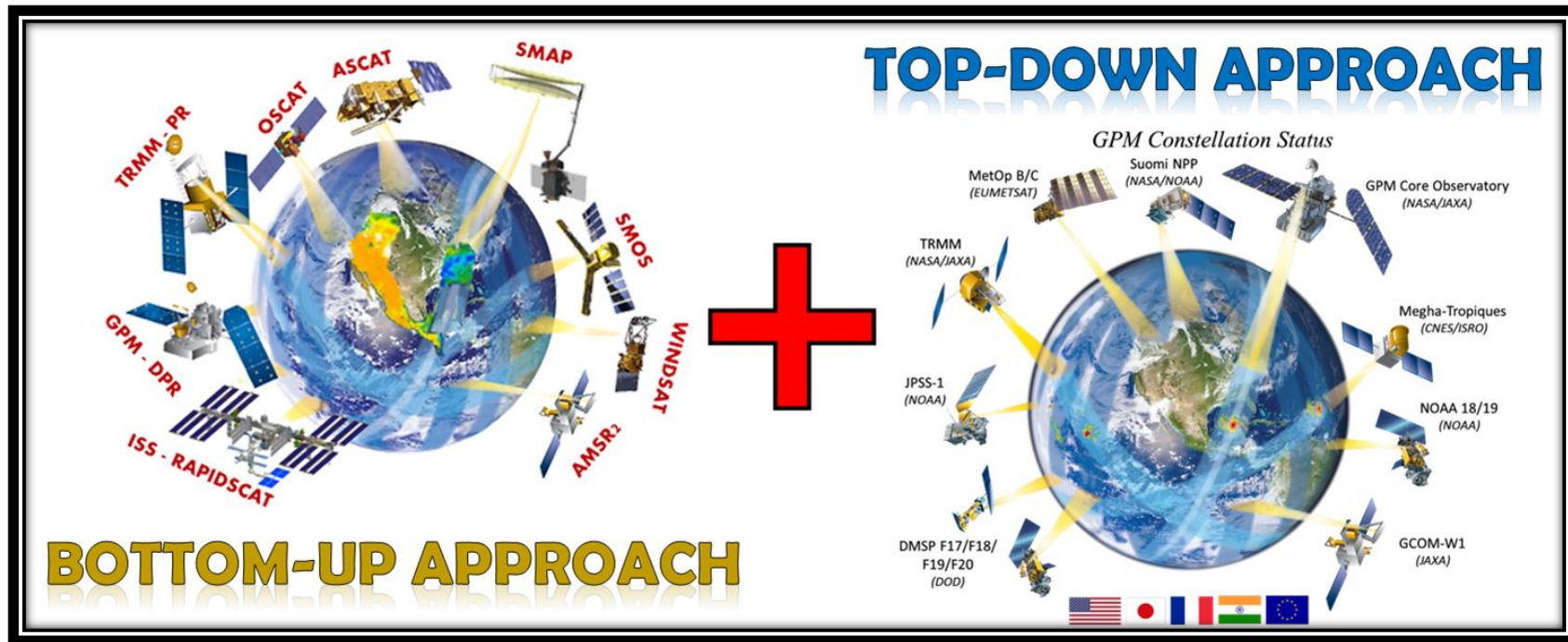


Equivalent areas of common sports pitches and courts compared with the total areas of orifices of all GTS and GPCP gauges (Kidd et al. 2015)



The use of rain gauges for rainfall monitoring is **not applicable** everywhere in the world.

Satellite-based rainfall products with global coverage and with adequate spatial-temporal resolution for landslide studies are now available.



Global Landslide Hazard Assessment for Situational Awareness (Global LHASA)

Based on GPM Rainfall product



7-day Antecedent Rainfall Index (ARI)

Step 1

Low

High

Susceptibility

Step 2

Low-Very Low

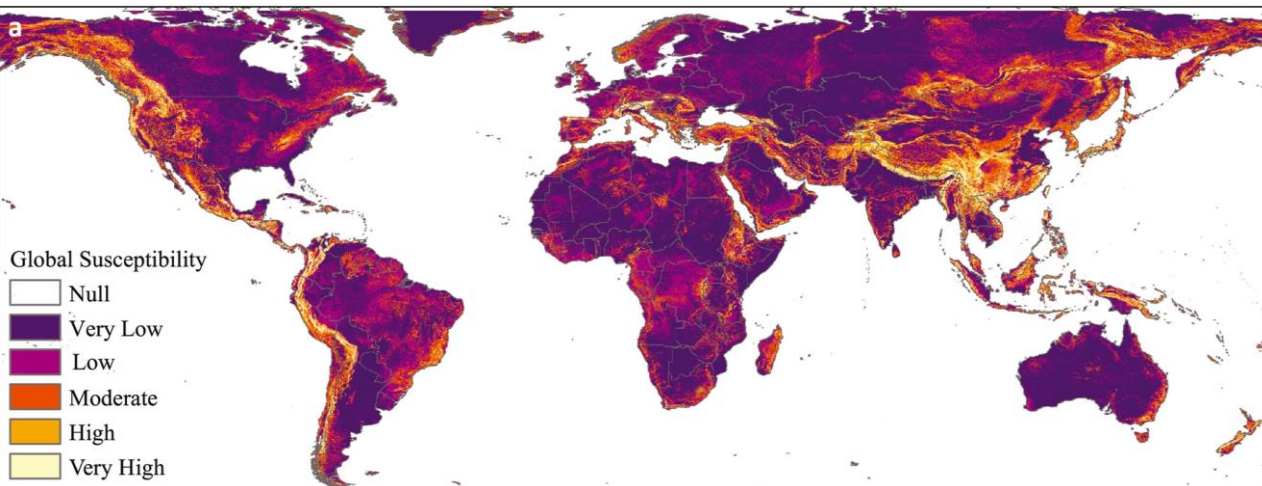
Moderate-High

Very High

No Nowcast

Moderate-Hazard Nowcast

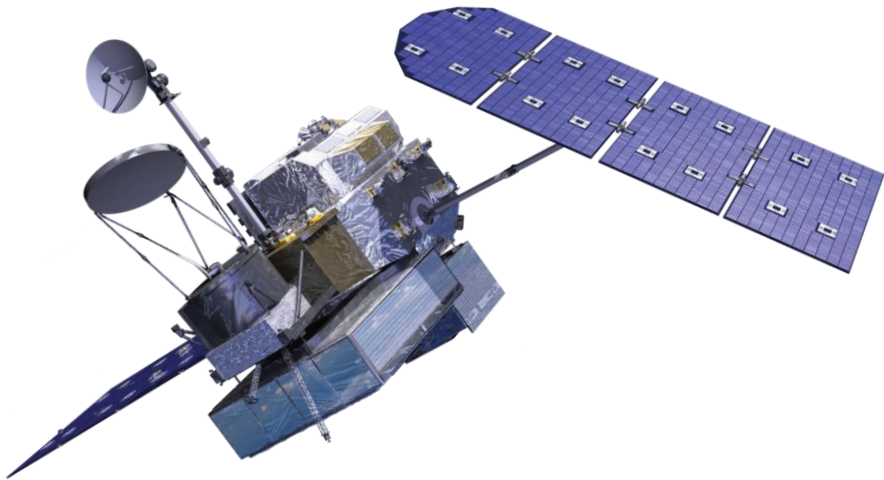
High-Hazard Nowcast



Stanley & Kirschbaum, 2017

Kirschbaum & Stanley, 2018

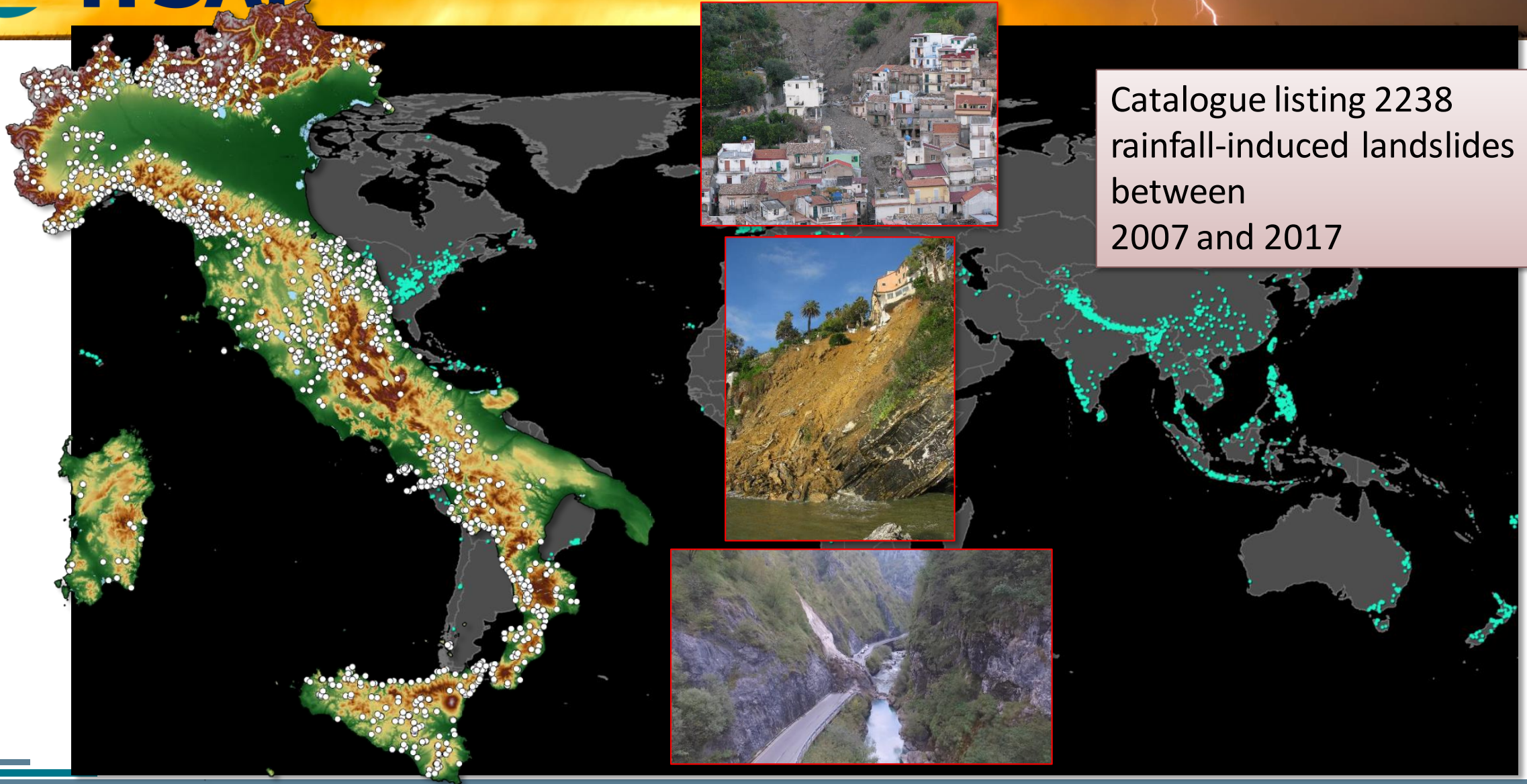
Are there any other ways in which we can **use satellite rainfall products** in landslide forecasting?



+

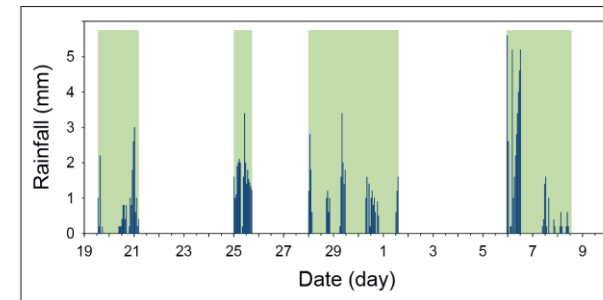
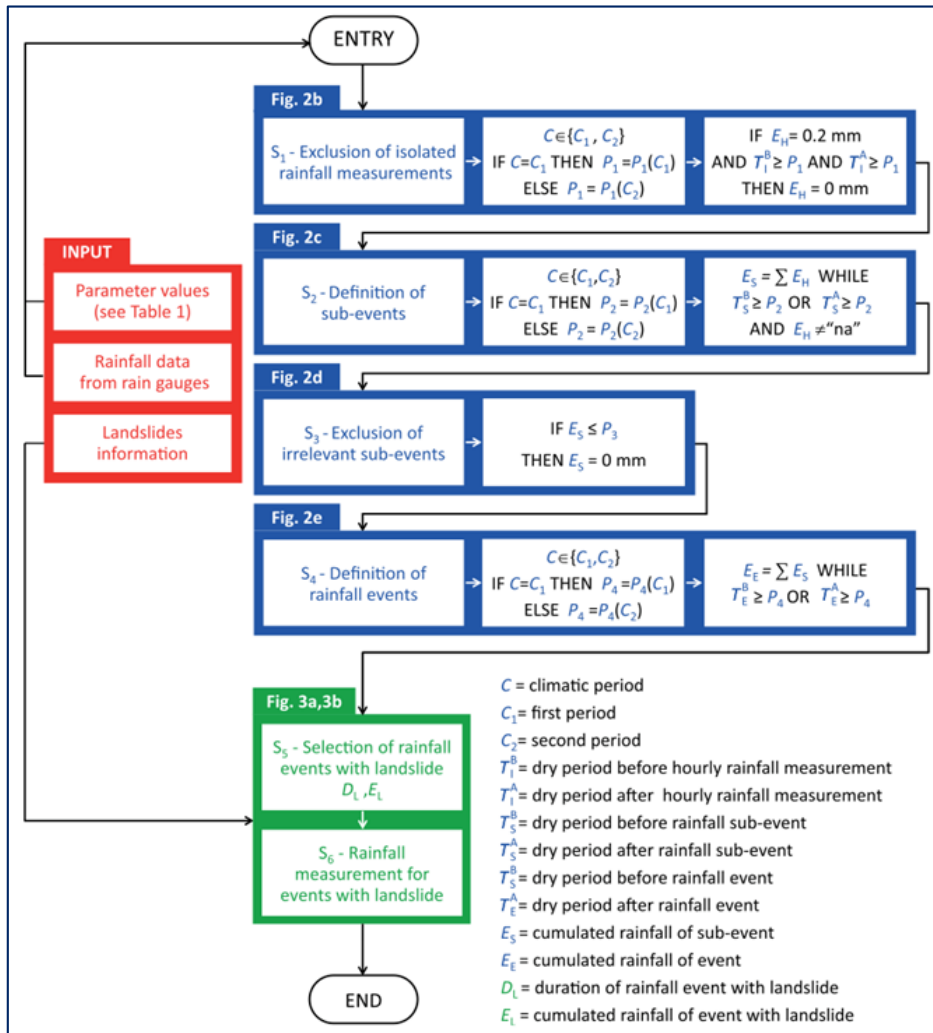


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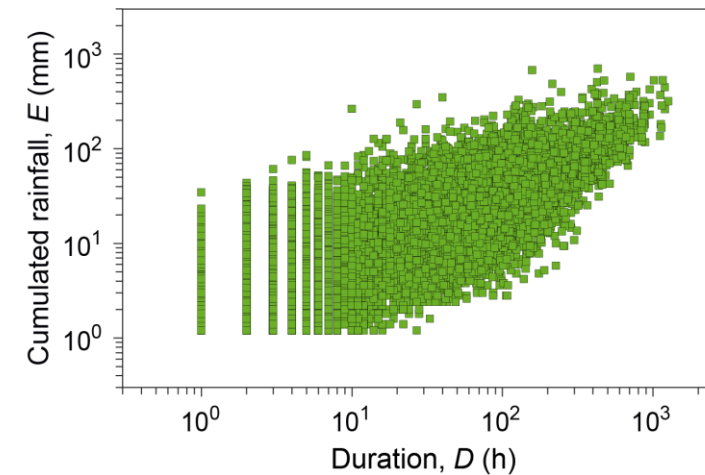


Catalogue listing 2238
rainfall-induced landslides
between
2007 and 2017

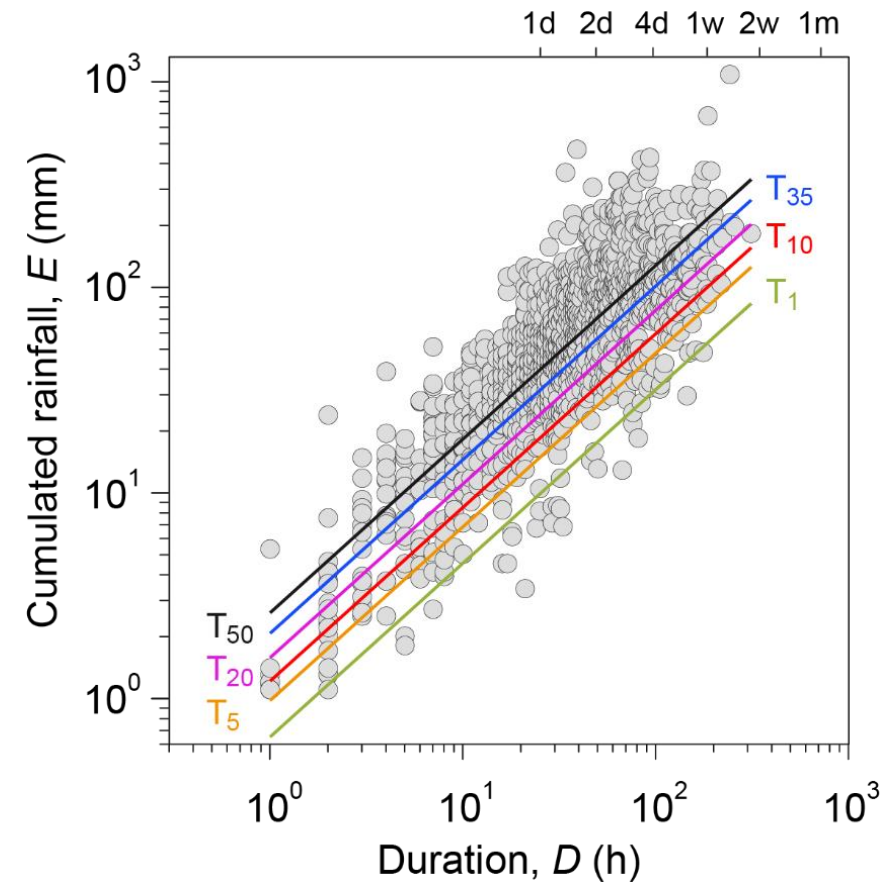
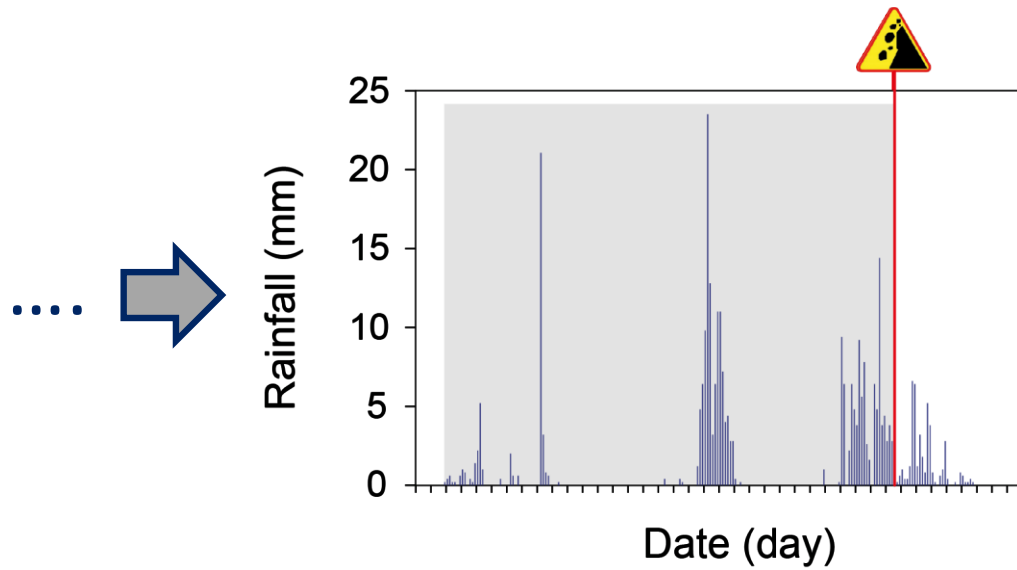
Data set	Approach	Grid (km)	Period (h)	Coverage	Time interval
SM2RASC	Bottom-Up	10	24	Global	2007-
3B42-RT	Top-Down	10	3	± 50°	1997-
GPM	Top-Down	10	1	Global	2014-
MERGED	Mixed	10	1	Global	2007-



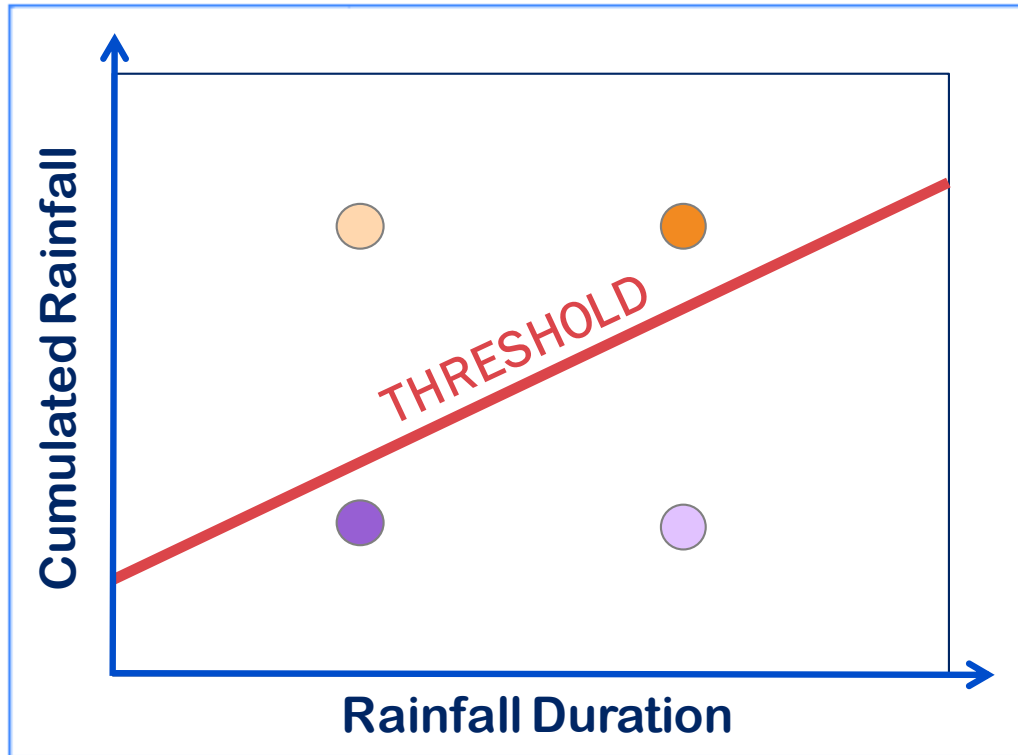
...



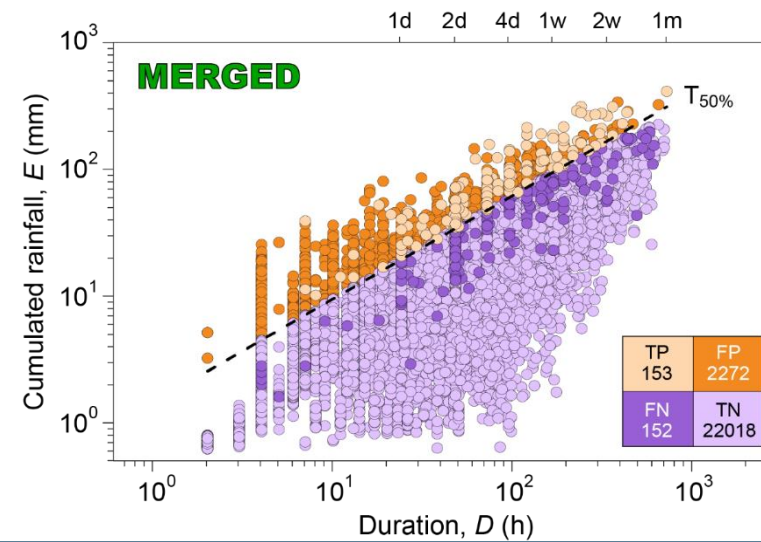
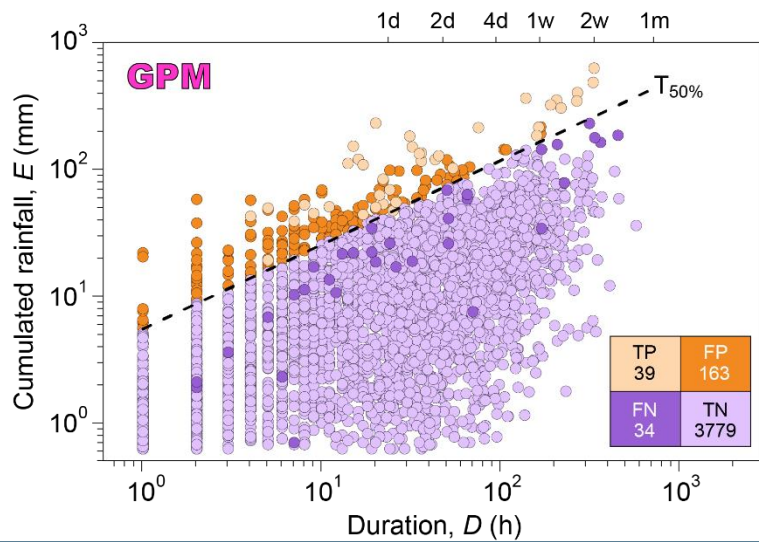
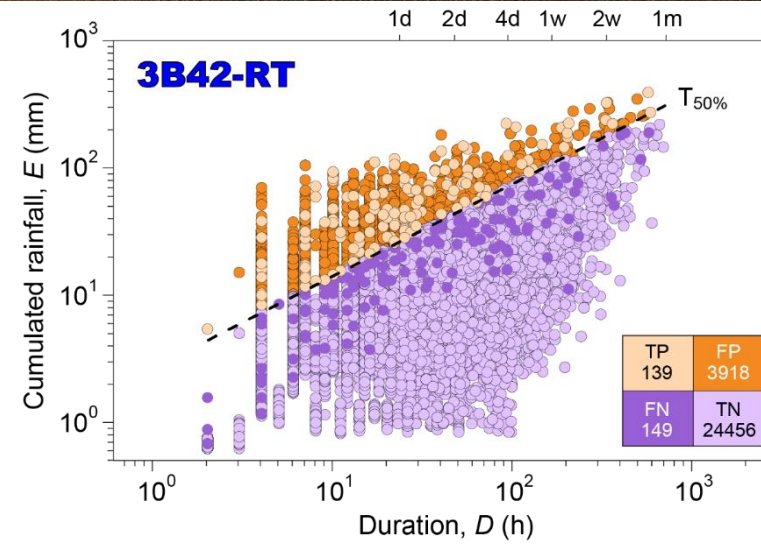
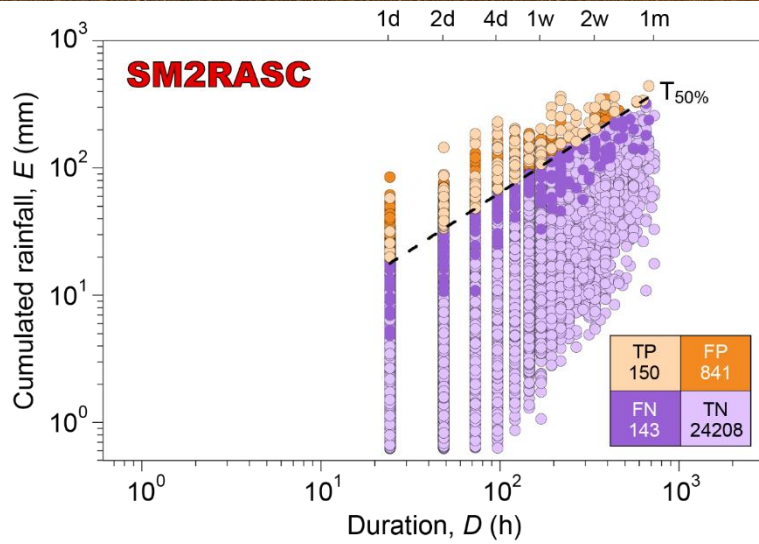
Melillo et al. (2015)

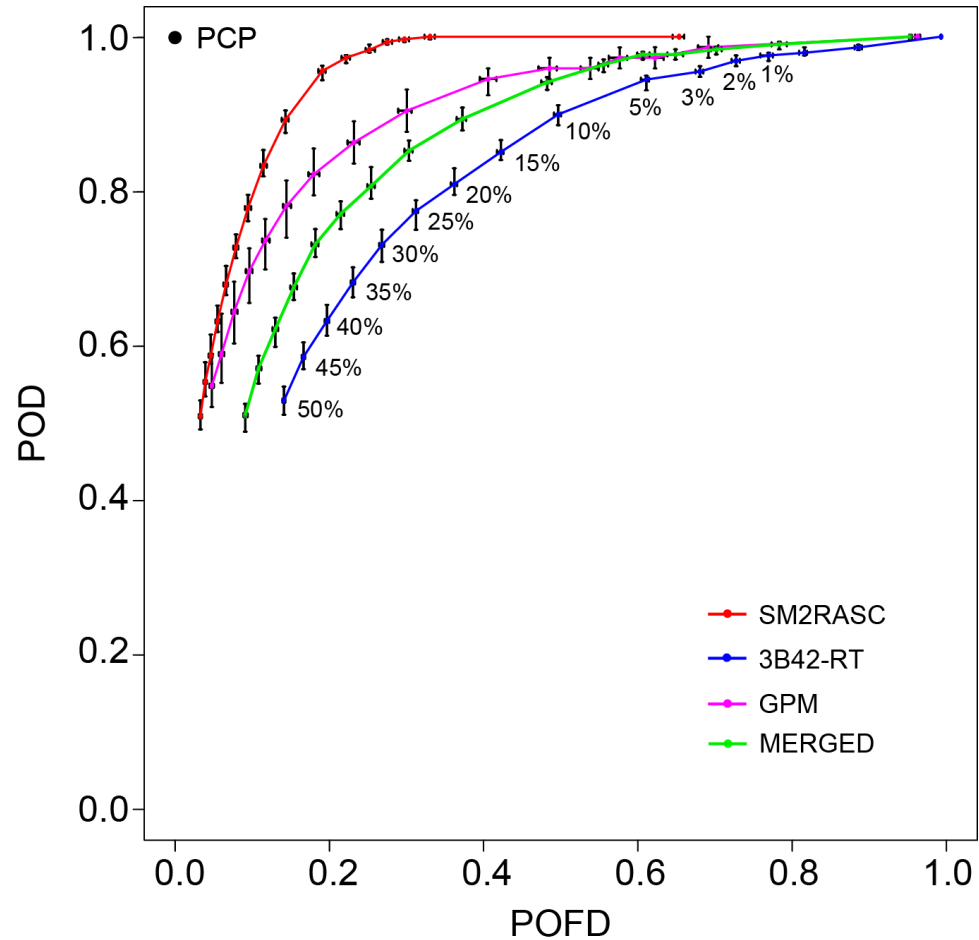


Brunetti et al. (2010)



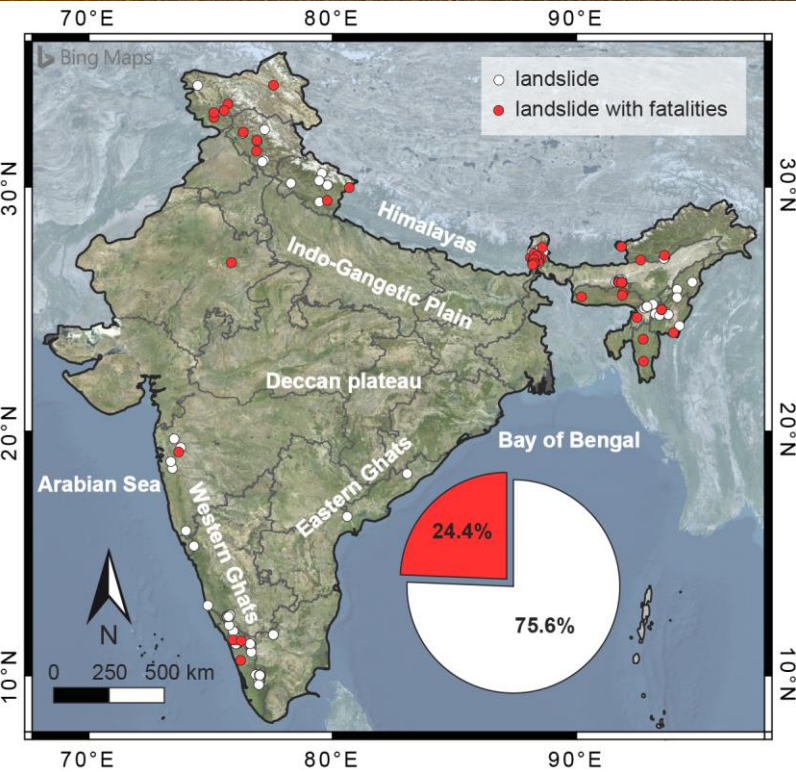
PREDICTED AND REPORTED (TP)	PREDICTED BUT NOT REPORTED (FP)
NOT PREDICTED BUT REPORTED (FN)	NOT PREDICTED AND NOT REPORTED (TN)



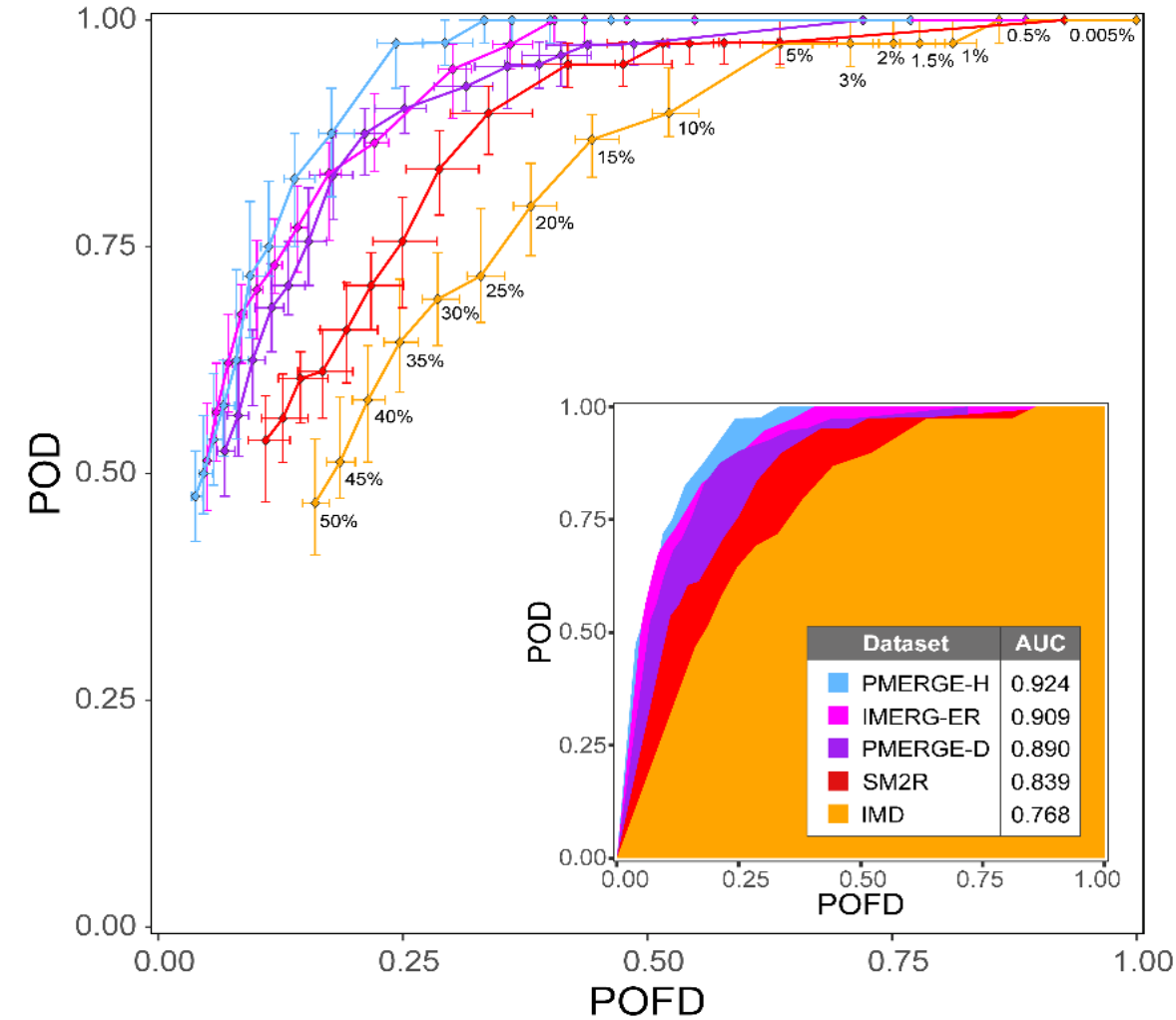


SM2RASC gives the best performance.
GPM is performing better than **MERGED**, while **3B42-RT** is the worst.

We compiled a catalogue of **197** rainfall-induced landslides occurred in India in the 13-year period between **April 2007 and October 2019**



Dataset	Approach	Spatial Resolution	Temporal Resolution	Coverage	Time interval
IMD	Ground	0.25°	Daily	India	2007-2019
GPM-ER	Top-Down	0.10°	30 min	Global	2000-
SM2RASC	Bottom-Up	12.5 km	Daily	Global	2007-
Merged	Mixed	0.10°	1-hour	Global	2007-



The satellite products provided **better performance wrt ground data**, confirming the added value of using satellite rainfall products for landslide forecasting.



High resolution application in Italy

**Soil Moisture from Fusion of Scatterometer and SAR:
Closing the Scale Gap with Temporal Filtering**

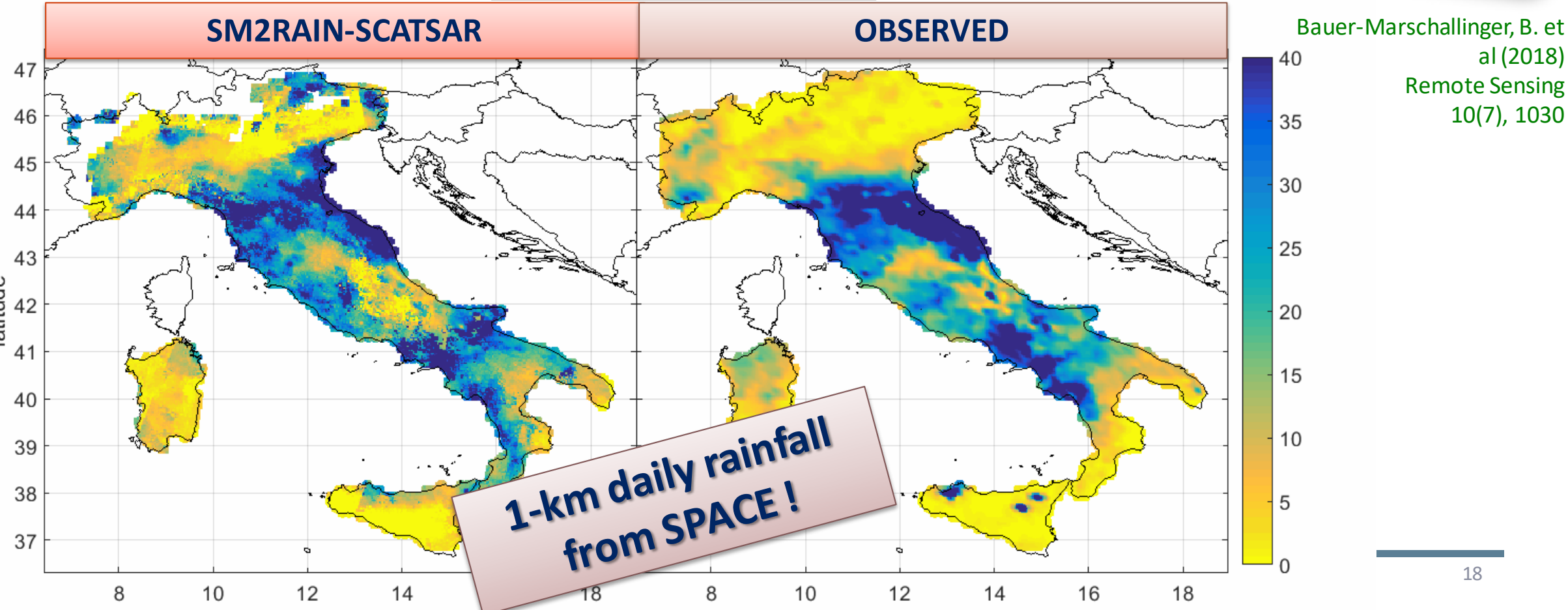
Bernhard Bauer-Marschallinger^{1,2}, Christoph Paulik³, Simon Hochstoger³, Thomas Mistelbauer², Sara Modanesi³, Luca Ciabatta³, Christian Massari³, Luca Brocca³, Wolfgang Wagner¹

¹ TU Wien, Department of Geodesy and Geoinformation Research Group Remote Sensing, remote.sensing@tuwien.ac.at
² Earth Observation Data Centre for Water Resources Monitoring (EODC), office@eodc.eu
³ National Research Council (NRC), Research Institute for Geo- Hydrological Protection (IRPI), director@irpi.cnr.it

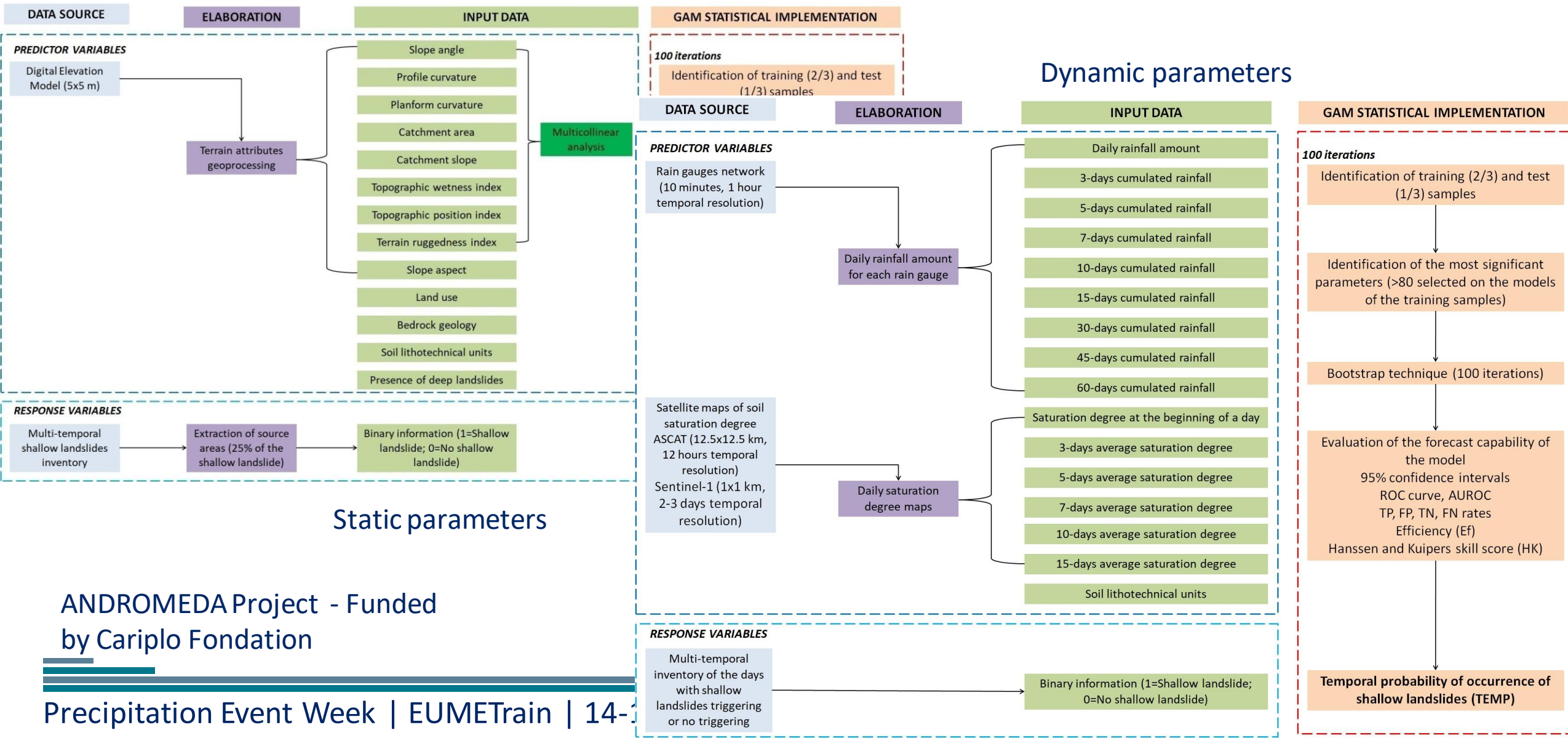
Integration of Sentinel-1 and ASCAT: SCATSAR

From 01-04-2015 to 05-04-2015

Animation (3 months) of 5-day accumulated precipitation

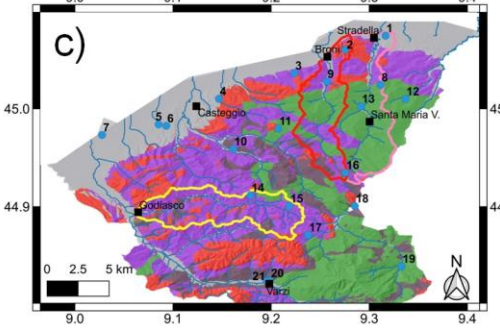
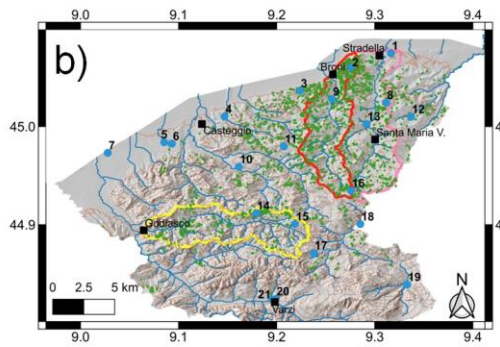
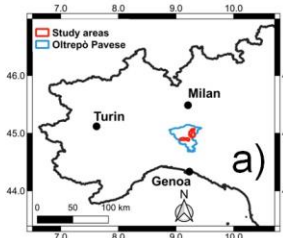


Bauer-Marschallinger, B. et al (2018) Remote Sensing 10(7), 1030

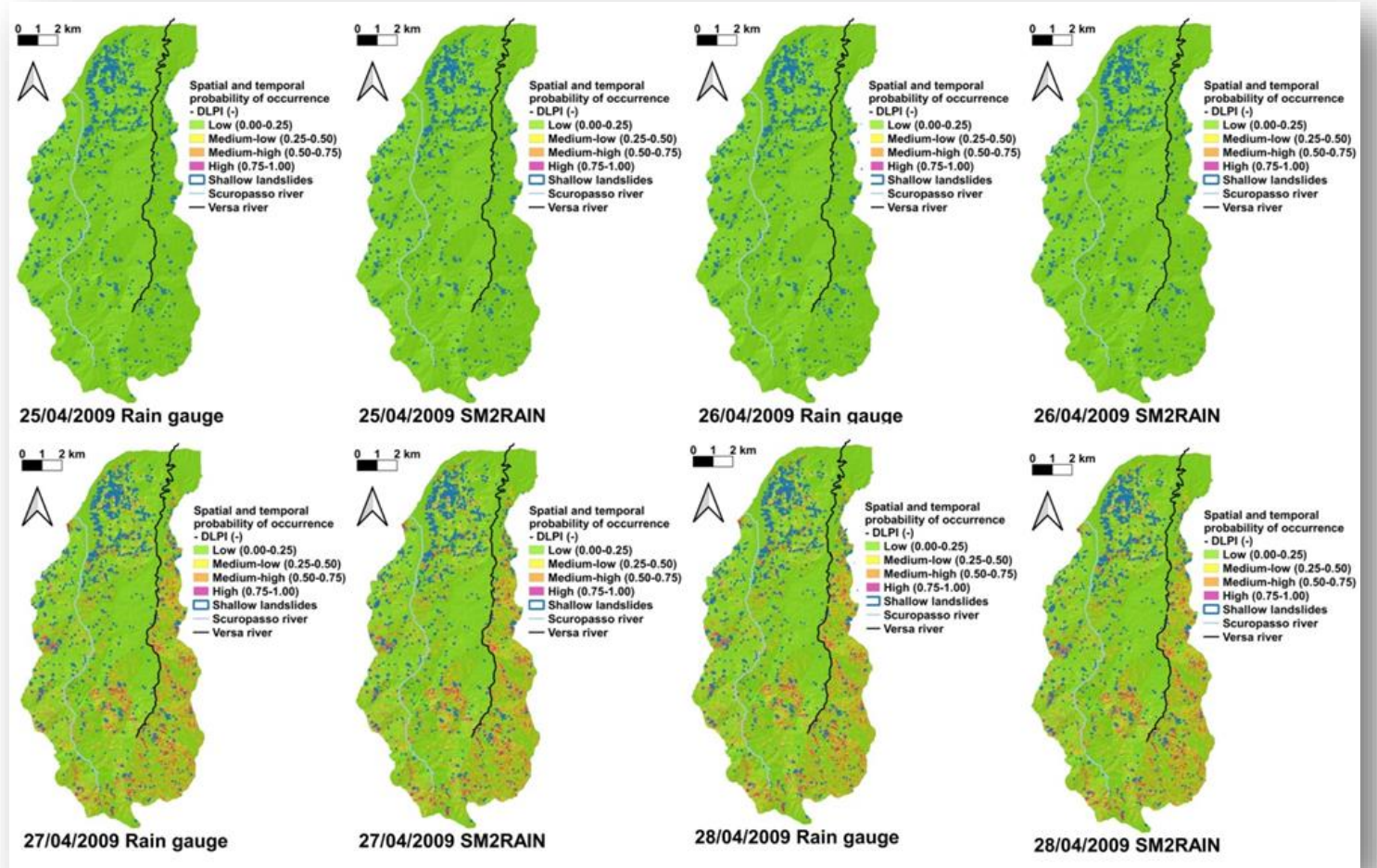


ANDROMEDA Project - Funded by Cariplo Fondation

ANDROMEDA
A New integrated hydrogeological Model to assess landslides and flood prone Areas in Oltrepò Pavese



- Rain gauge
 - Shallow landslides
 - Ardivestra catchment
 - Scuropasso catchment
 - Versa catchment
 - Main hydrography
 - Contour lines
-
- Bedrock lithology
 - Alluvial deposits (gravels, sands, silts)
 - Poorly cemented sandstones, conglomerates, marls
 - Marls and sandy marls
 - Alternance of marls, sandstones, limestones
 - Claystones

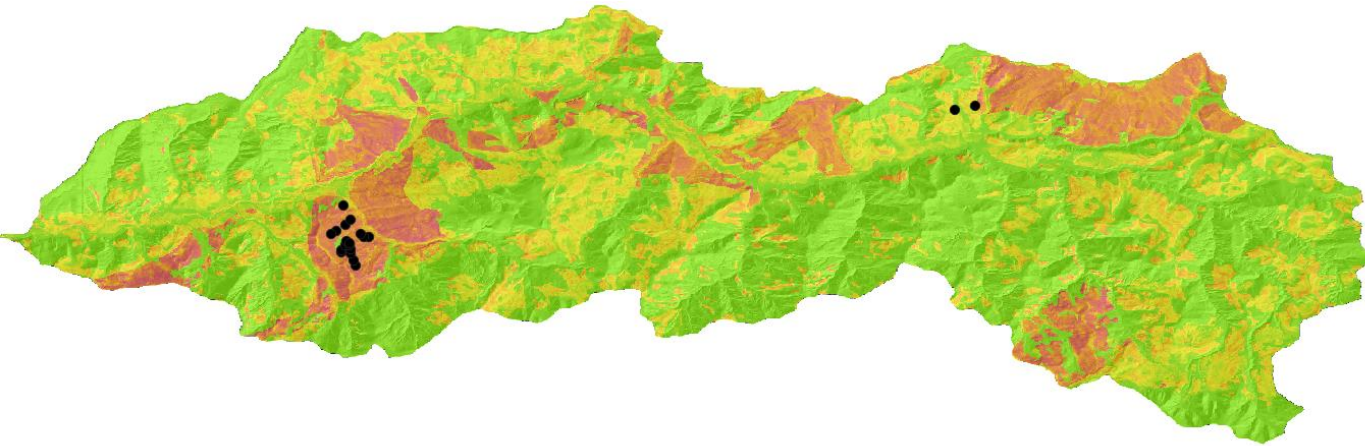


ANDROMEDA

@CARIPLO

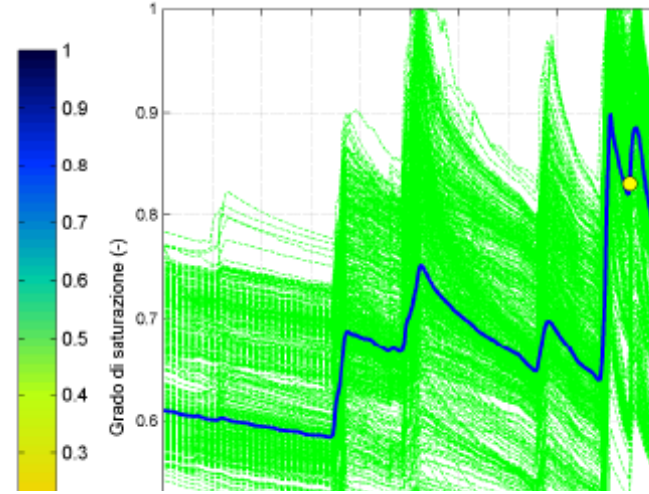
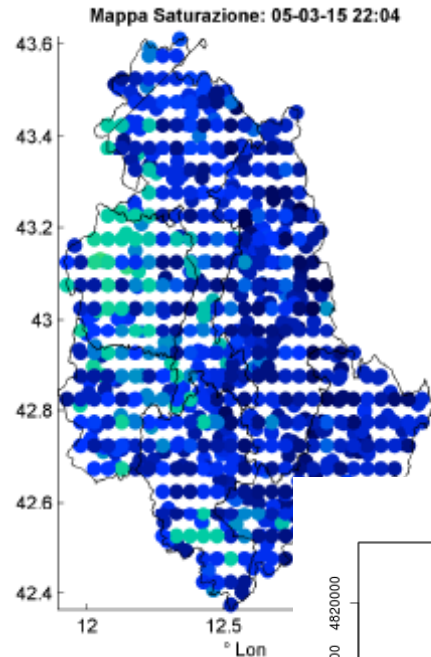
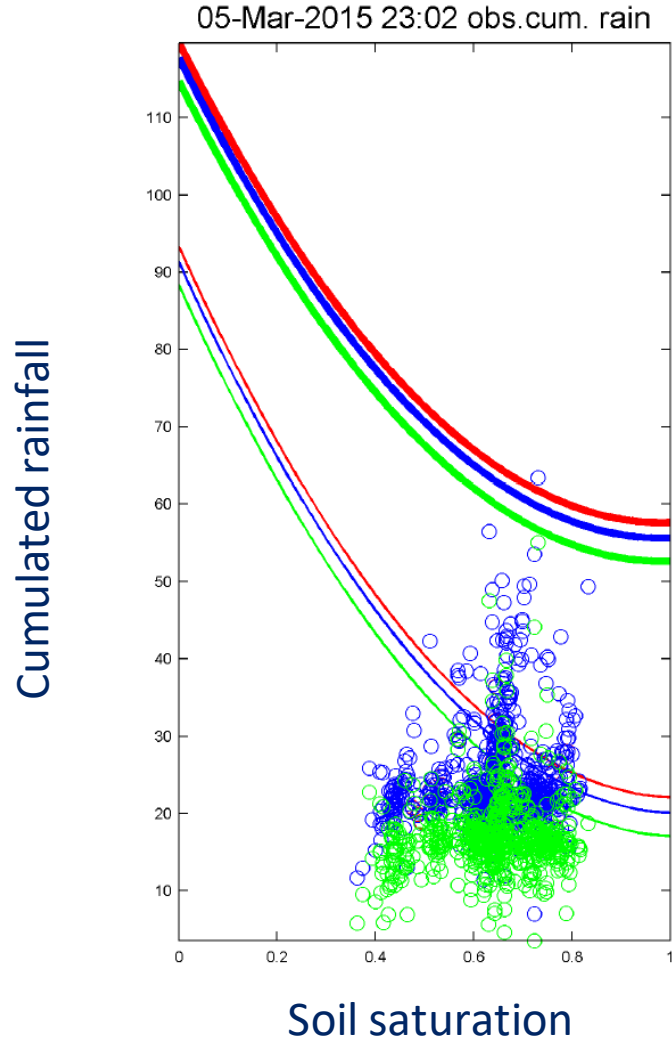
Vivaldi et al. (2020). doi:10.5194/egusphere-2020-22240

November 2019 rainfall events validation



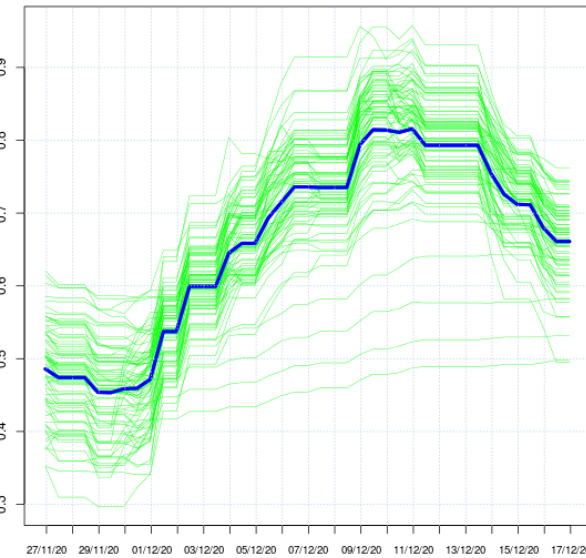
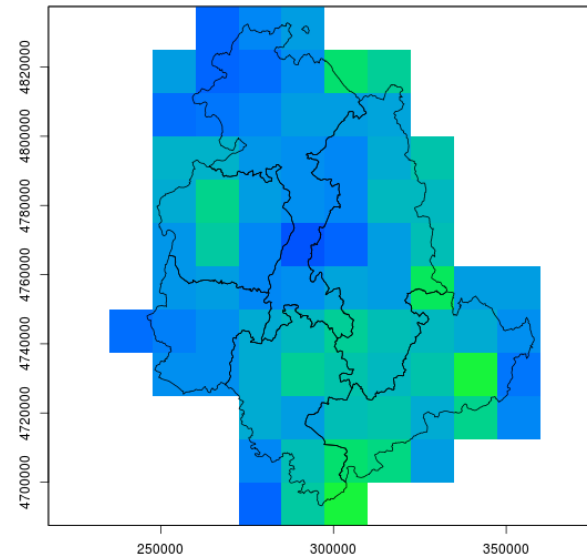
All the landslide events (black dots) in Ardivestra basin fall within **high and medium high susceptibility areas**, confirming the skill of the proposed methodology in landslide risk assessment at **high spatial resolution**

Ponziani et al. (2012)



HSaf ASCAT-Soil Water Index (T=var)

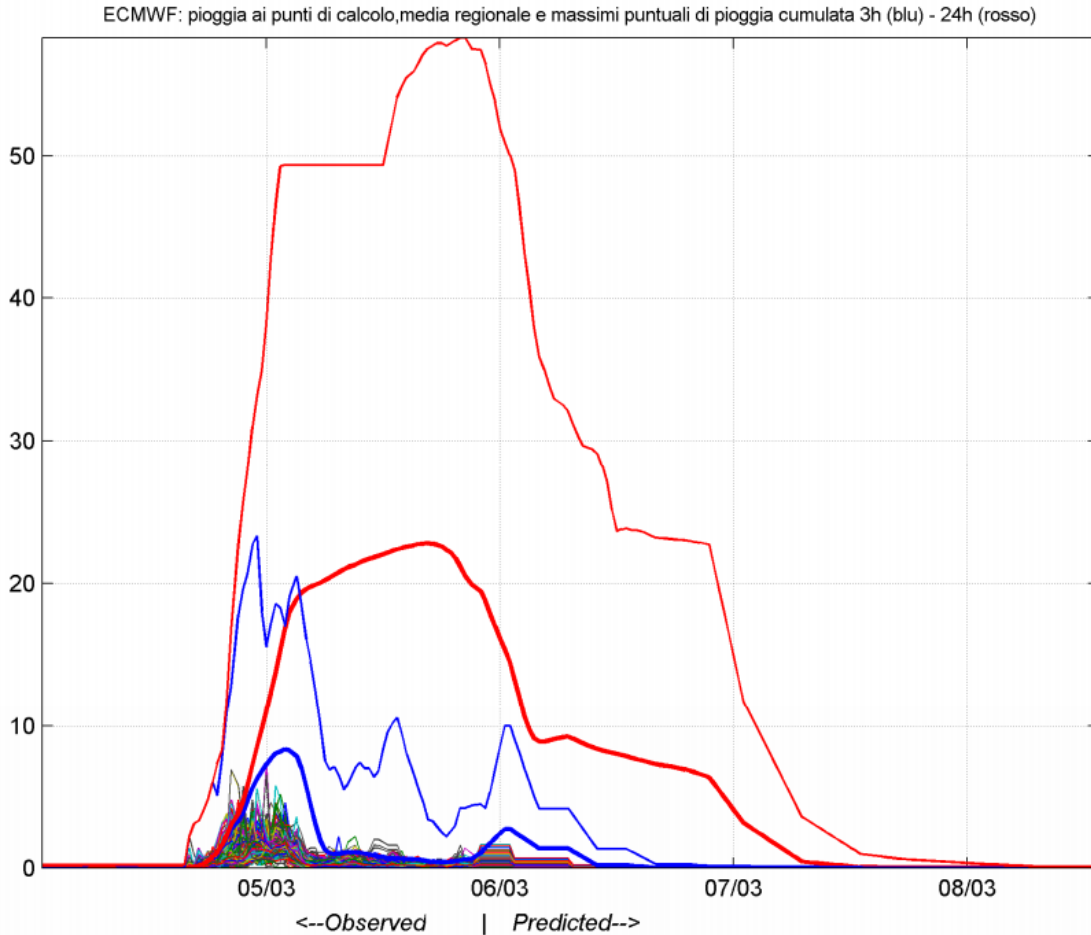
HSaf ASCAT-Soil Water Index (T=var)



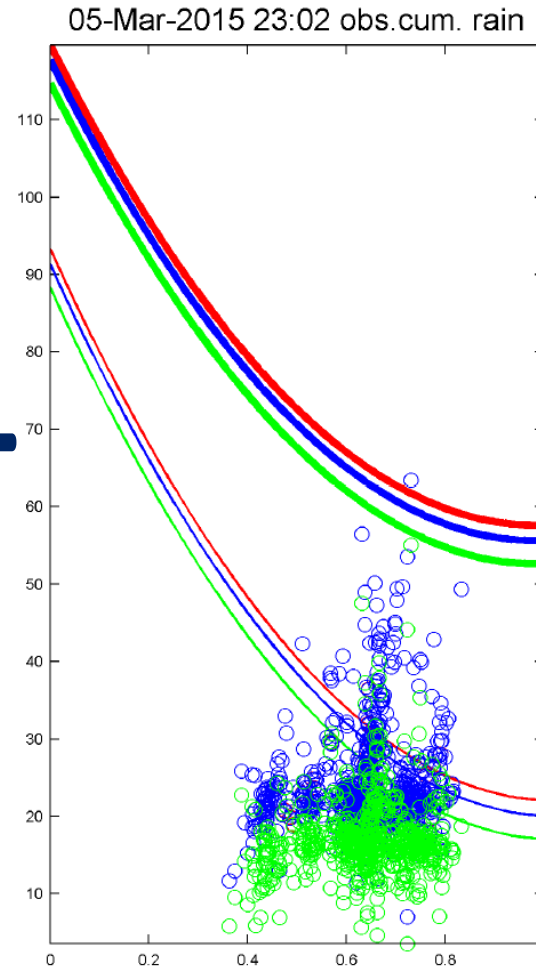
Data (g/m/a)

Ultimo dato processato: 20201216-230000-asc.xyz

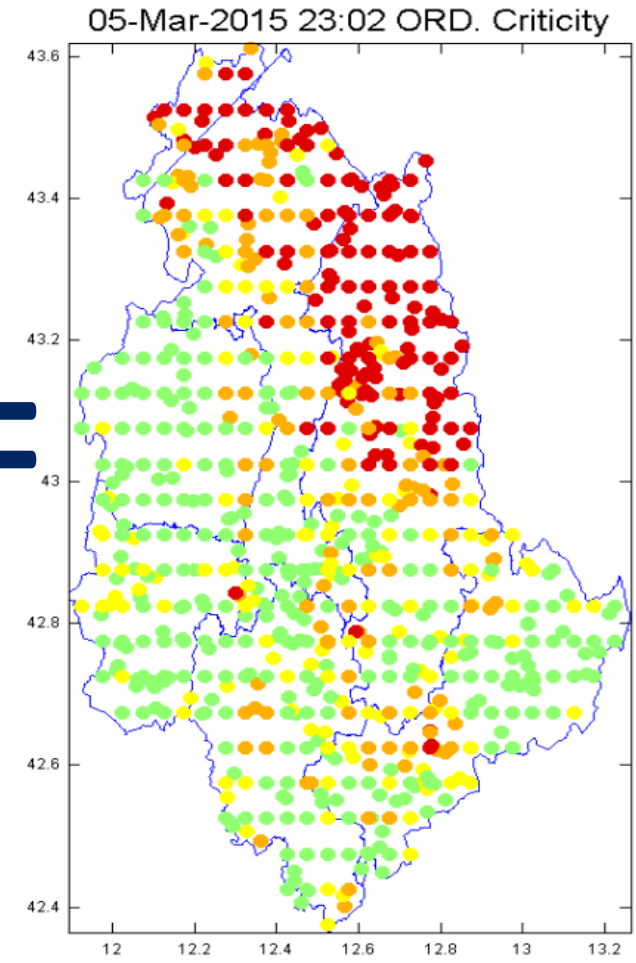
Meteorological forecast

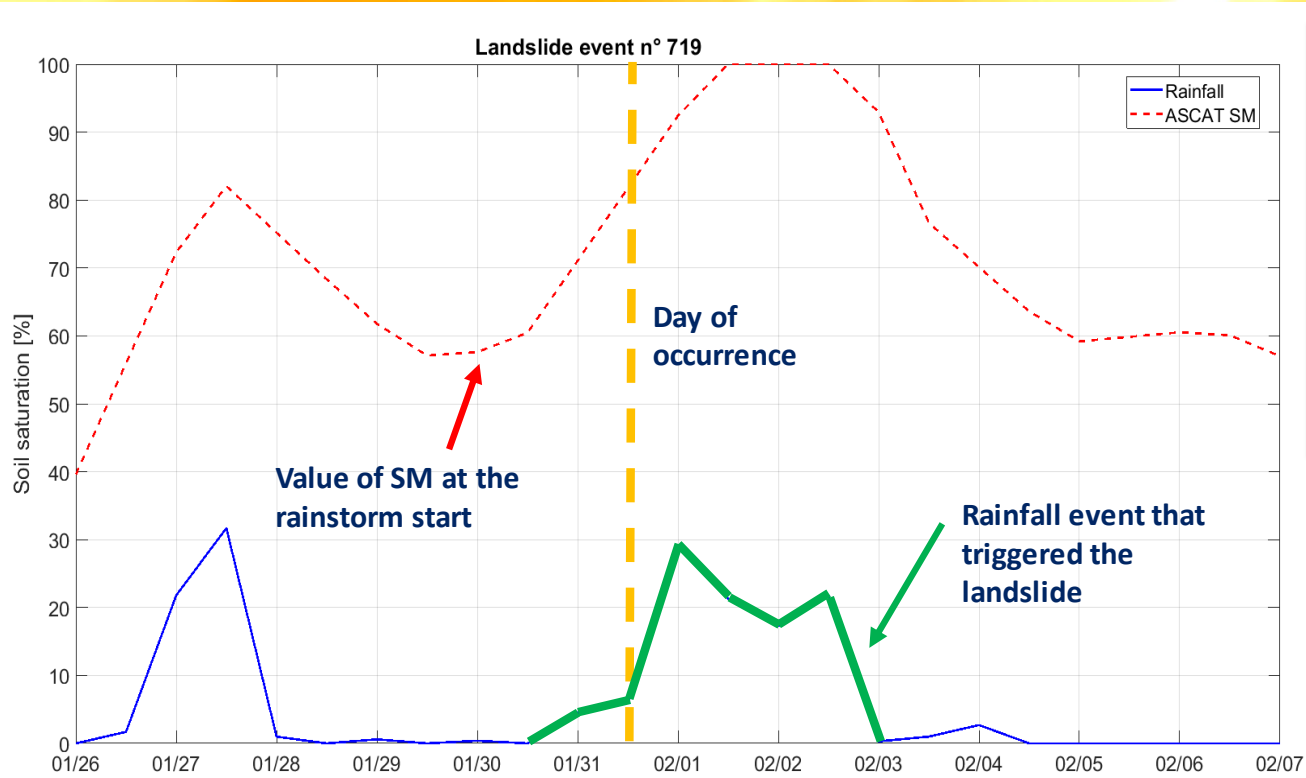


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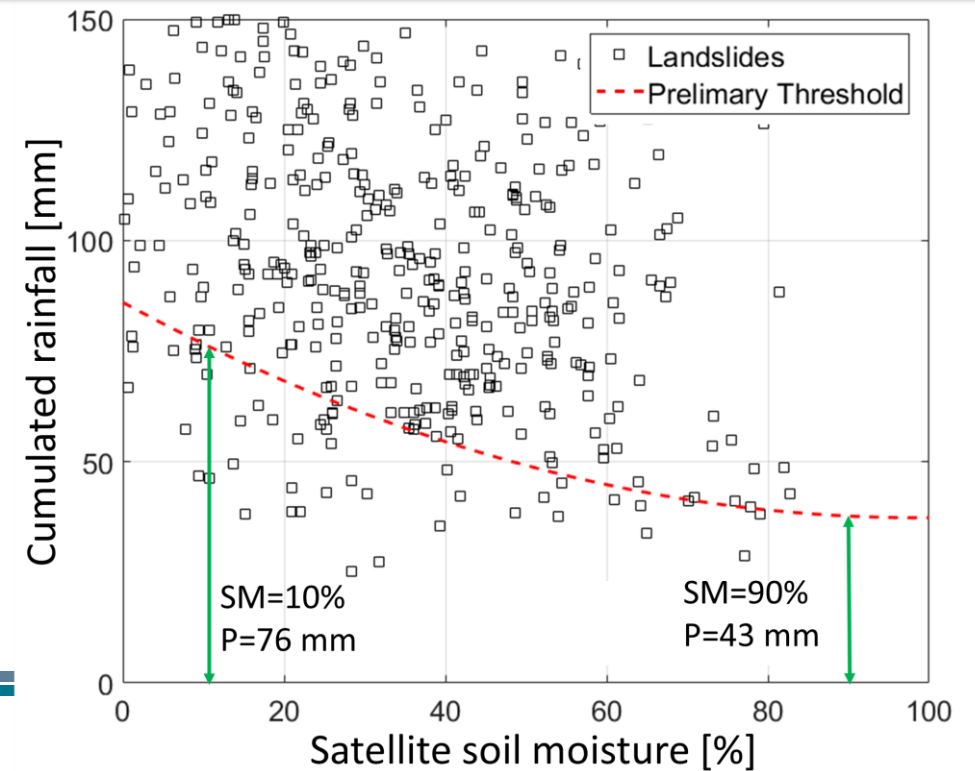


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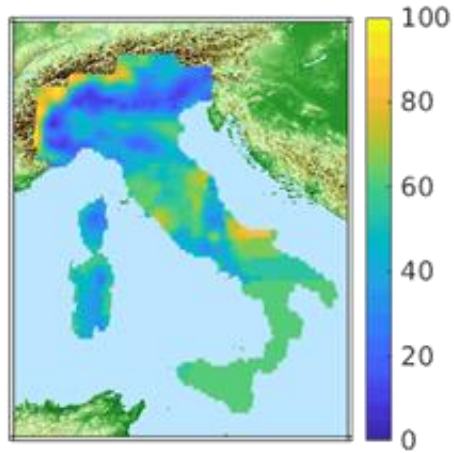




- 1184 landslide events between 2007 and 2014 over Italy
- ASCAT SM data 12.5 km/daily spatial/temporal resolution
- Observed rainfall from the Italian monitoring network

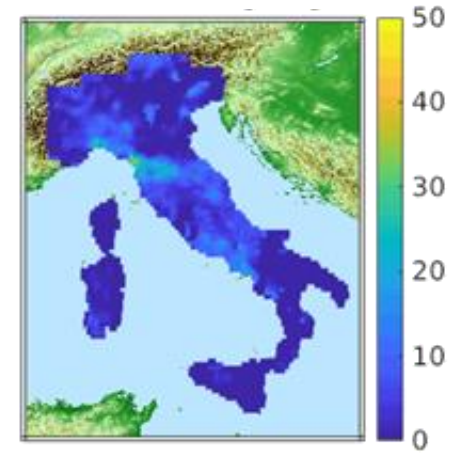


Relative soil moisture



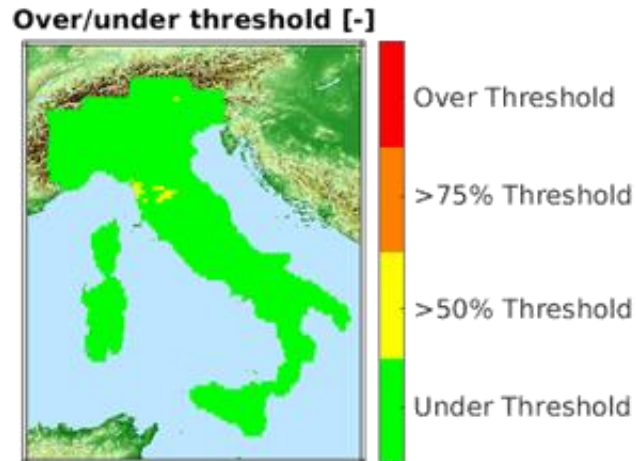
How much water is in the soil?

GPM+SM2RAIN
 daily rainfall

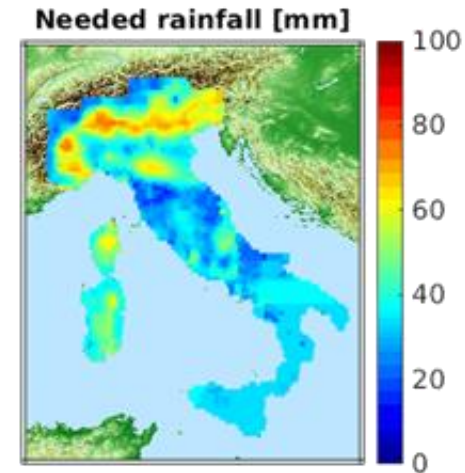


How much does it rain?

Landslide
 Alert map



1-day Landslide
 Guidance



How much rainfall is needed for the occurrence of landslide?

- Satellite rainfall products considered here are able to **satisfactorily predict landslide** occurrence in Italy and India through the use of different methodologies;
- Both the **top-down** and **bottom-up** approaches are found to provide good performance;
- The obtained results will have a more important use in scarcely gauged regions (e.g., developing countries);
- The combined use of satellite **soil moisture** and **rainfall** data for landslide guidance analysis show promising results

Thank you for your attention

For further information just
contact us:

luca.ciabatta@irpi.cnr.it

- Bauer-Marschallinger, B., Paulik, C., Hochstätter, S., Mistelbauer, T., Modanesi, S., Ciabatta, L., Massari, C., Brocca, L., Wagner, W. (2018). Soil moisture from fusion of scatterometer and SAR: closing the scale gap with temporal filtering. *Remote Sensing*, 10(7), 1030, doi:10.3390/rs10071030. <https://doi.org/10.3390/rs10071030>.
- Brunetti, M.T., Melillo, M., Peruccacci, S. Ciabatta, L., Brocca, L., 2018. How far are we from the use of satellite rainfall products in landslide forecasting? *Remote Sens. Environ.* 210, 65-75. <https://doi.org/10.1016/j.rse.2018.03.016>.
- Guzzetti, F., Gariano, S.L., Peruccacci, S., Brunetti, M.T., Marchesini, I., Rossi, M., Melillo, M., 2020. Geographical landslide early warning systems. *Earth-Sci. Rev.*, 200, 102973. <https://doi.org/10.1016/j.earscirev.2019.102973>.
- Kirschbaum, D., Stanley, T. (2018). Satellite-Based Assessment of Rainfall-Triggered Landslide Hazard for Situational Awareness. *Earth's Future*, 6 (3), pp 505-523
- Melillo, M., Brunetti, M.T., Peruccacci, S., Gariano, S.L., Guzzetti, F., 2015. An algorithm for the objective reconstruction of rainfall events responsible for landslides. *Landslides*, 12(1), 311–320. <https://doi.org/10.1007/s10346-014-0471-3>
- Ponziani, F., Pandolfo, C., Stelluti, M., Berni, N., Brocca, L., Moramarco, T. (2012). Assessment of rainfall thresholds and soil moisture modeling for operational hydrogeological risk prevention in the Umbria region (central Italy). *Landslides*, 9(2), 229-237, doi:10.1007/s10346-011-0287-3. <http://dx.doi.org/10.1007/s10346-011-0287-3>
- Stanley, T., Kirschbaum, D. (2017). A heuristic approach to global landslide susceptibility mapping. *Natural Hazards* volume 87, pages145–164
- Vivaldi et al. (2020, doi:10.5194/egusphere-egu2020-22240)