



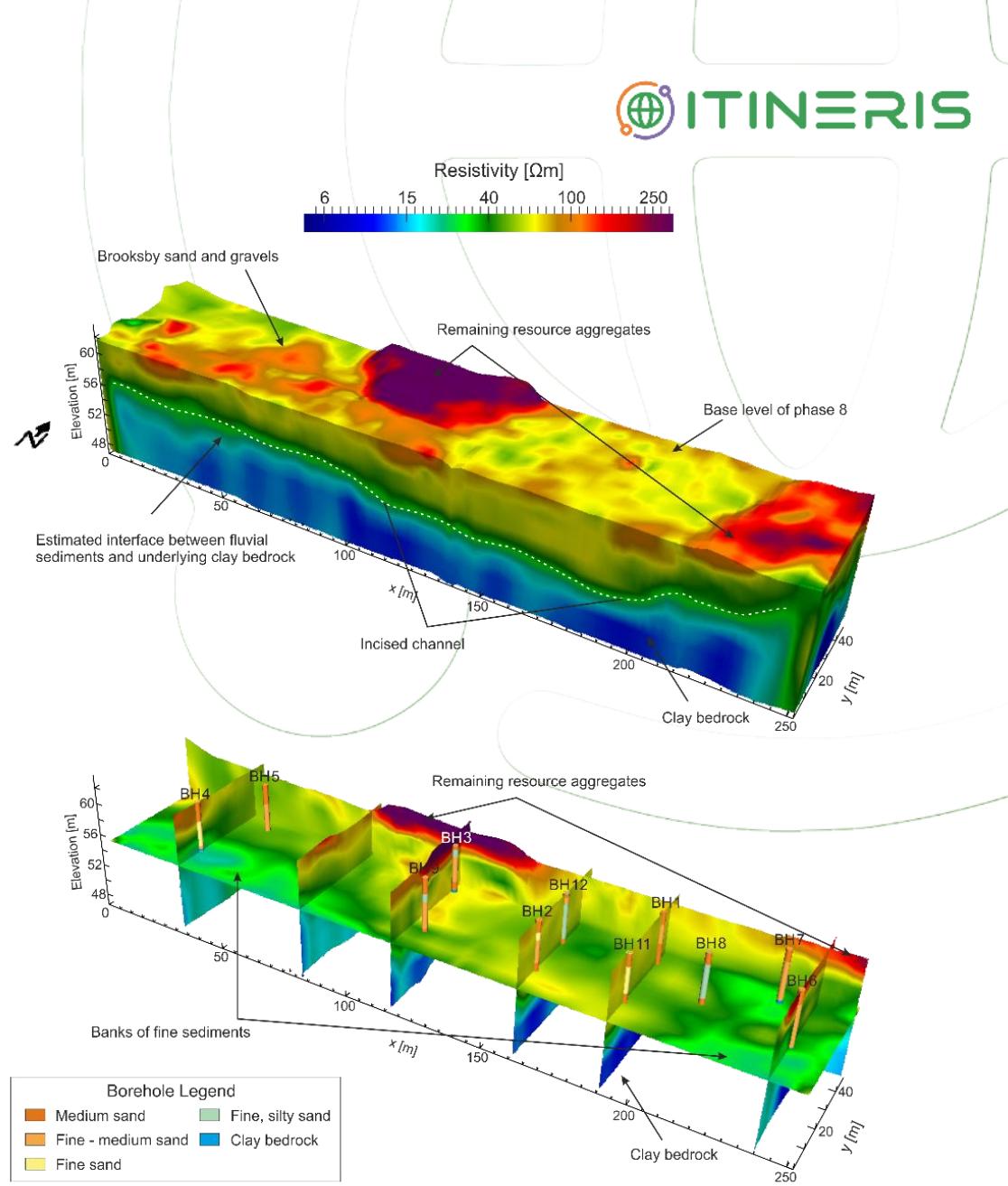
Examples of integrated landslide monitoring

IR0000032 – ITINERIS, Italian Integrated Environmental Research Infrastructures System
(D.D. n. 130/2022 - CUP B53C22002150006) Funded by EU - Next Generation EU PNRR-
Mission 4 “Education and Research” - Component 2: “From research to business” - Investment
3.1: “Fund for the realisation of an integrated system of research and innovation infrastructures”



Outline of the day

- **Fundamentals of electrical resistivity measurements**
 - Electrical properties of soils and rocks
- **Geoelectrical monitoring: measurement principles and properties**
 - Basic principles, inversion approaches
 - Practical considerations
 - Examples
- **Quantitative analysis of geoelectrical monitoring data**
 - Limitations & opportunities
 - Applications
- **Examples of integrated landslide monitoring**



Electrical resistivity of Earth Materials

Soil properties important for landslide studies

Geophysical property

Electrical resistivity
&
Chargeability

Geophysical proxy

Moisture content
Porosity
Clay content

Landslide properties

Groundwater table

Pore pressure

Hydraulic conductivity

Soil thickness

Residual friction angle

Cohesion

Measured property

Derived property

Derived property

5G-enabled intelligent and adaptive critical infrastructure

Critical Infrastructure – Supporting everyday life

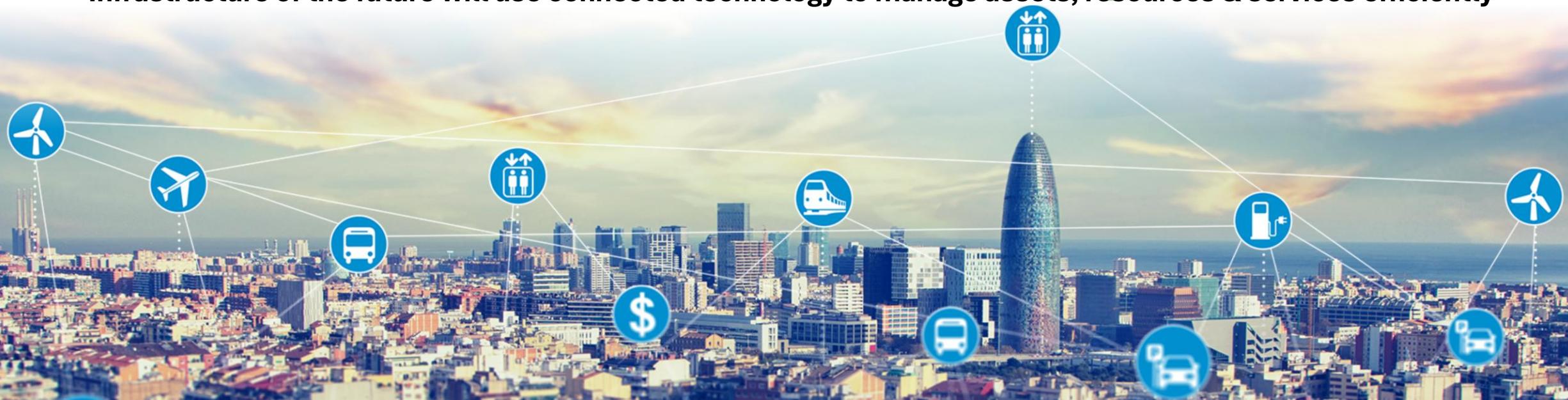
Presidential Policy Directive – Critical Infrastructure Security and Resilience:

*“The Nation's critical infrastructure provides the **essential services that underpin American society** [...] are vital to public confidence and the **Nation's safety, prosperity, and well-being**.”*

Estimated amount to be spent by 2040 to repair and maintain infrastructure:

US: \$12.4T worldwide: \$94T

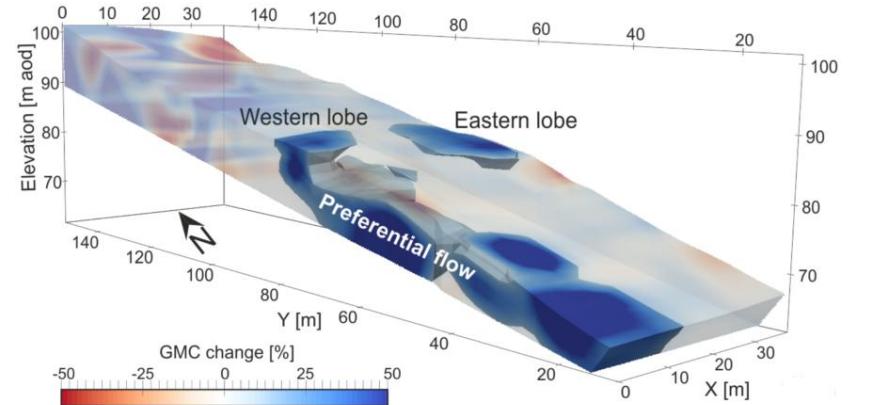
Infrastructure of the future will use connected technology to manage assets, resources & services efficiently



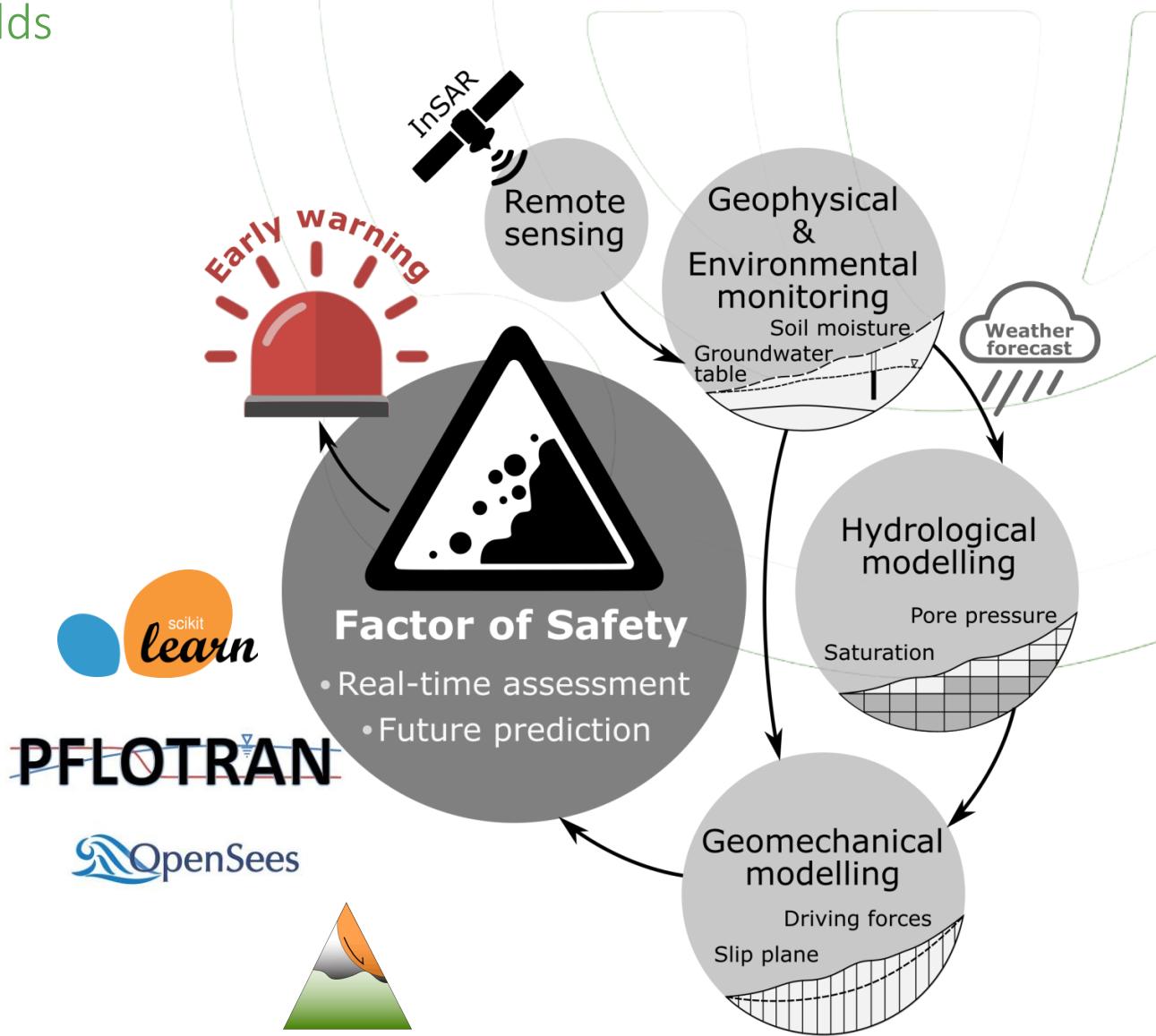
Nested sensing for slope stability assessment and early warning

Utilize and integrate recent advances in various fields

- **Sensing technologies**, e.g. low-cost geophysical monitoring

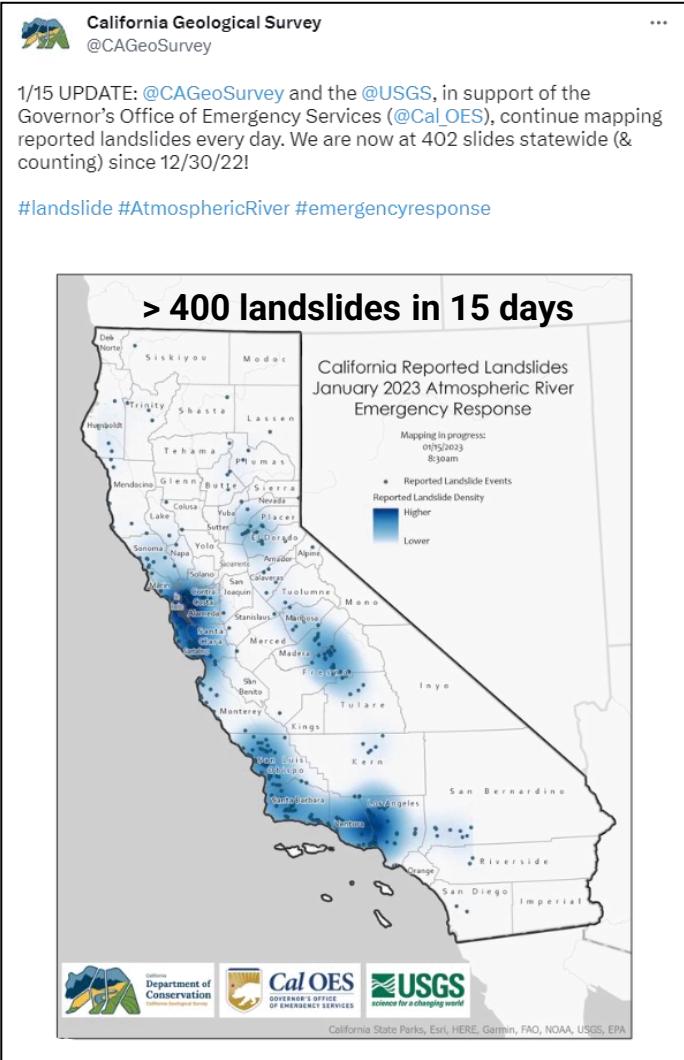


- **Machine Learning**
 - Real-time data assimilation of various data streams
- **Hydrological Modelling**
 - Parallelized, large-scale modelling of subsurface flow
- **Geomechanical Modelling**
 - 3D, large-scale assessment of slope's factor of safety



California – a land of extremes

Atmospheric rivers causing extreme rainfall, triggering landslides



Heavy rain and landslides in California left part of a backyard swimming pool hanging off the edge of a cliff

Aditi Bharade Mar 17, 2023, 10:14 AM GMT+1



NEWS > TRANSPORTATION

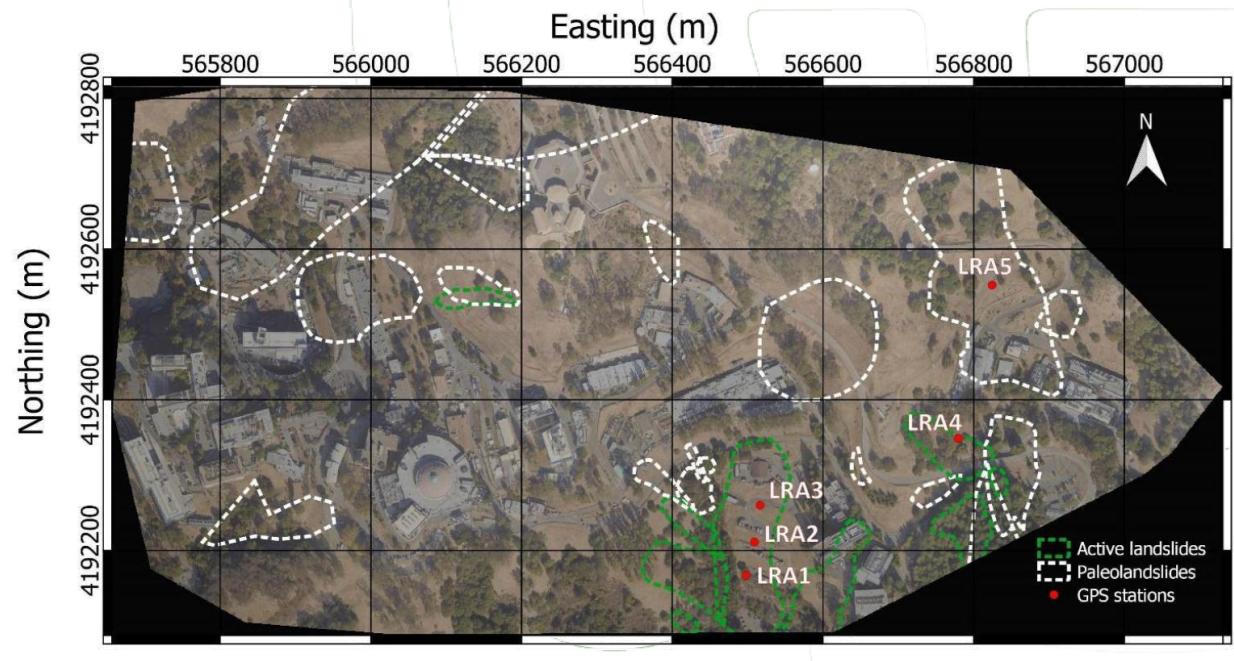
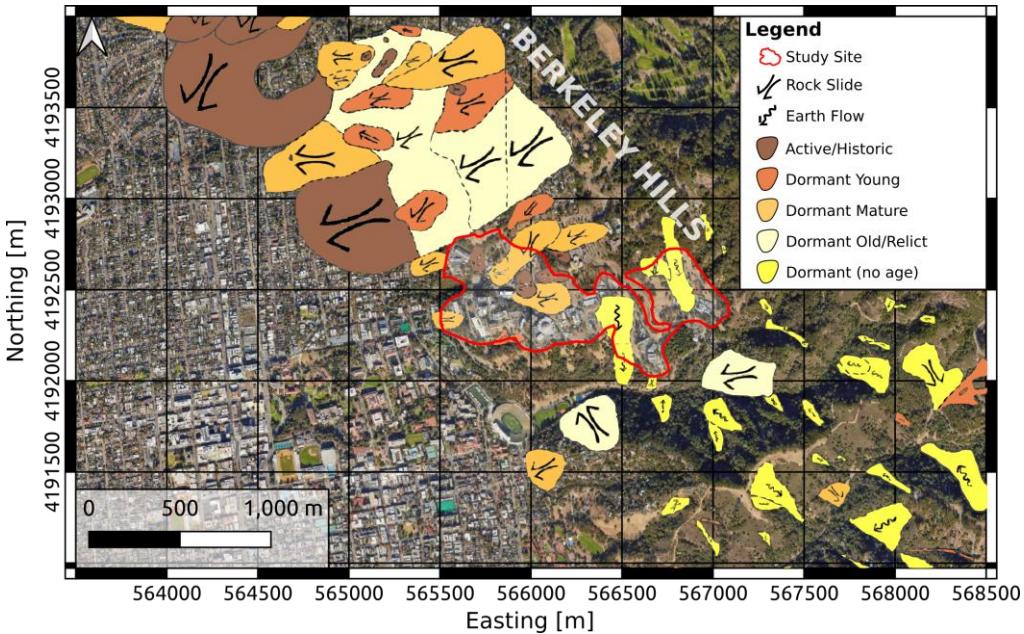
Caltrans reevaluating landslides, Highway 70 remains closed



An aerial view of the massive landslide located at the 15.2 mile post in Plumas County, California pictured Wednesday, March 1, 2023. (Caltrans/Contributed)

Berkeley Lab – A playground for developing sensing technology

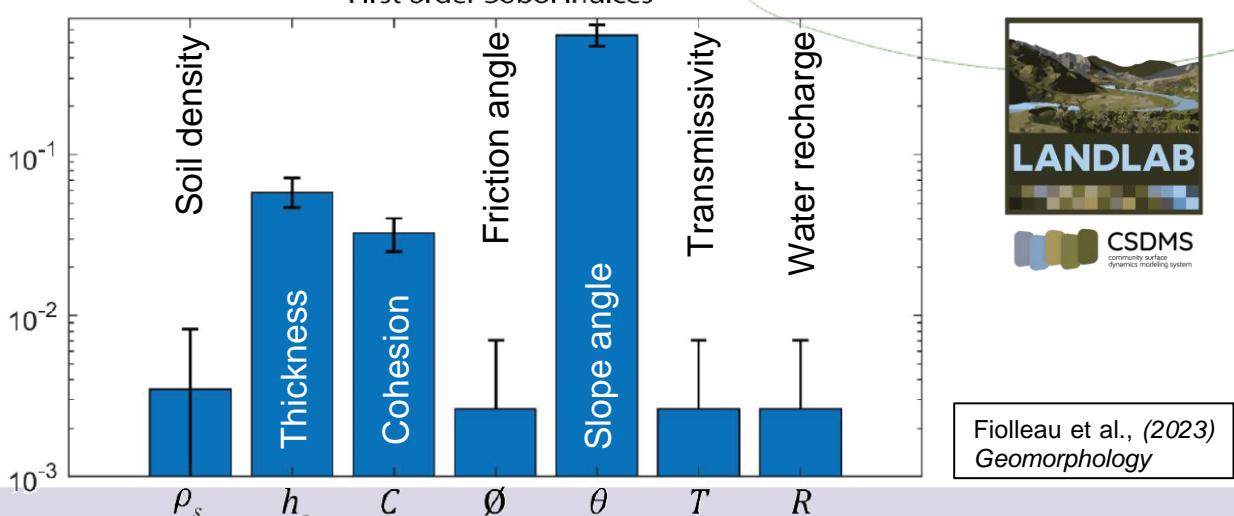
Study site and landslide hazard



Berkeley Lab has a high landslide risk!

- Active and dormant landslides
- Unique scientific facilities
- Campus acts as “Field Laboratory”

Assessing landslide hazard through geostatistical hydrogeomechanical modelling

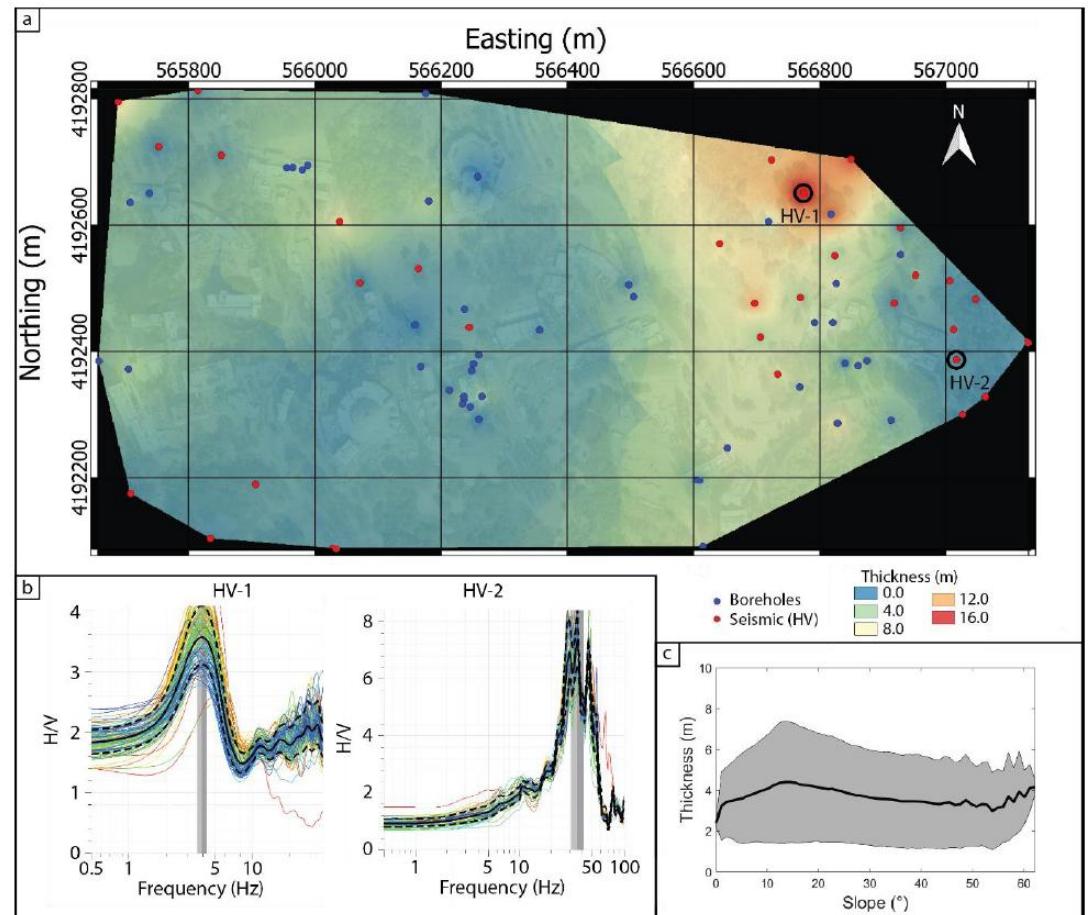


Geophysics & remote sensing for Landslide Hazard Assessment

Mapping soil thickness and vegetation distribution

Soil thickness

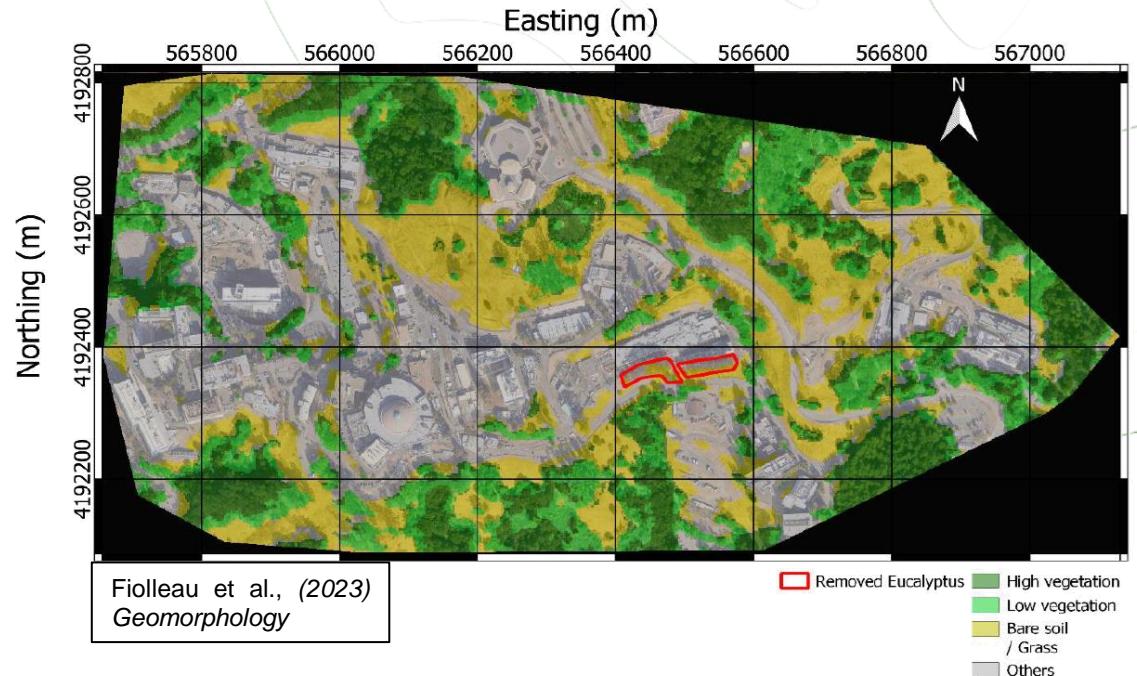
Soil thickness estimated using 47 boreholes and 31 ambient seismic noise measurements



Soil/Root cohesion

Total cohesion = soil cohesion + root cohesion

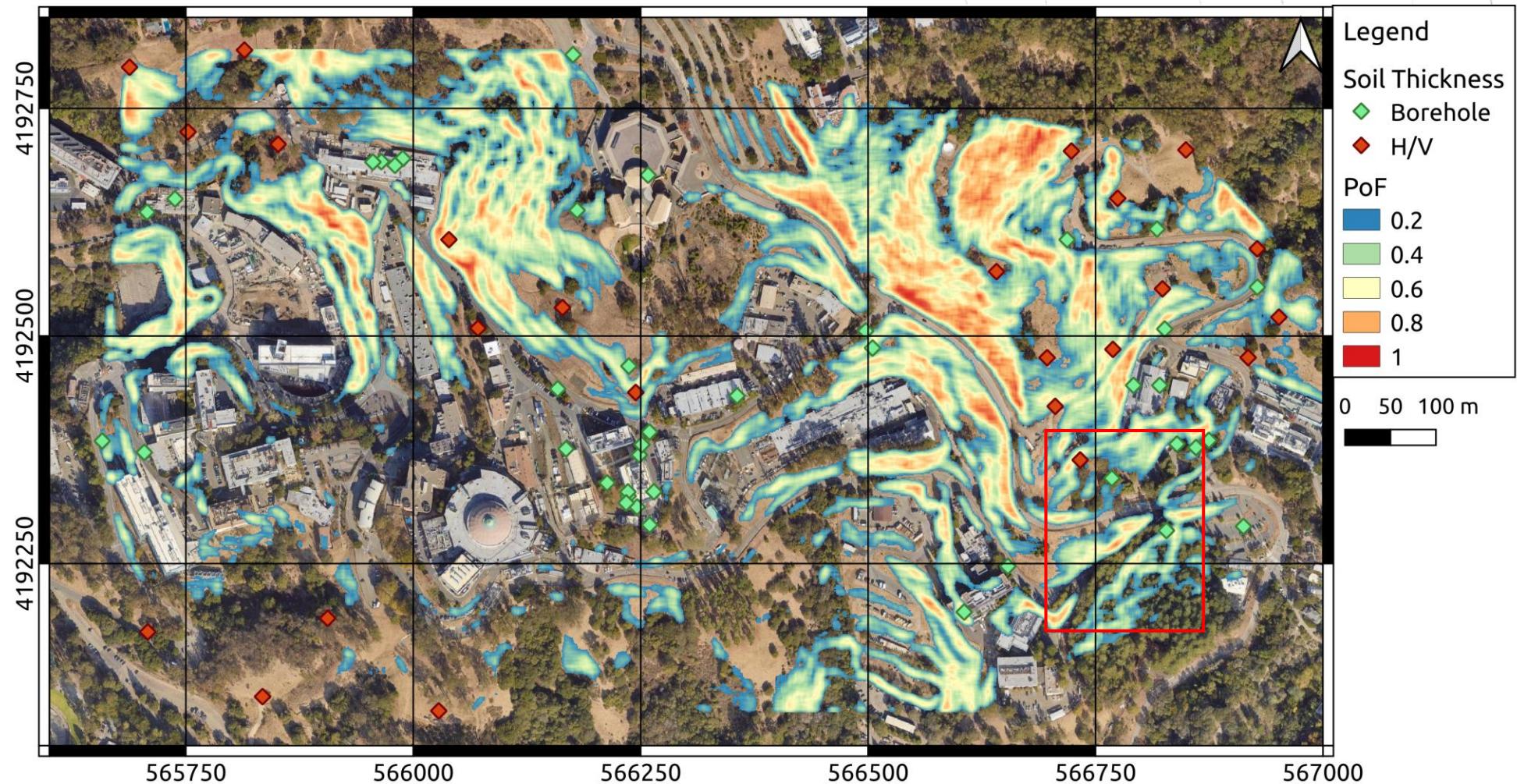
Vegetation classified based on Planet data (3m resolution)



Other soil parameters (friction angle, soil cohesion, density) from geotechnical drilling and soil testing

Landslide hazard map

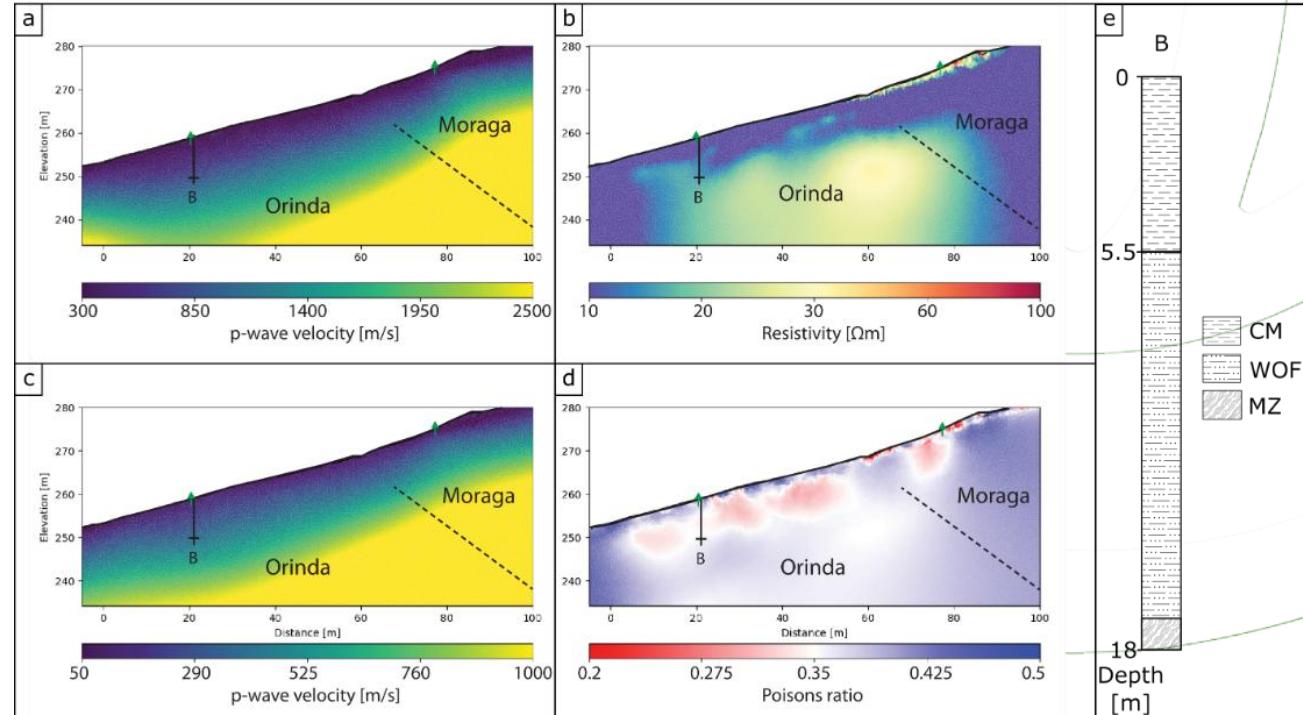
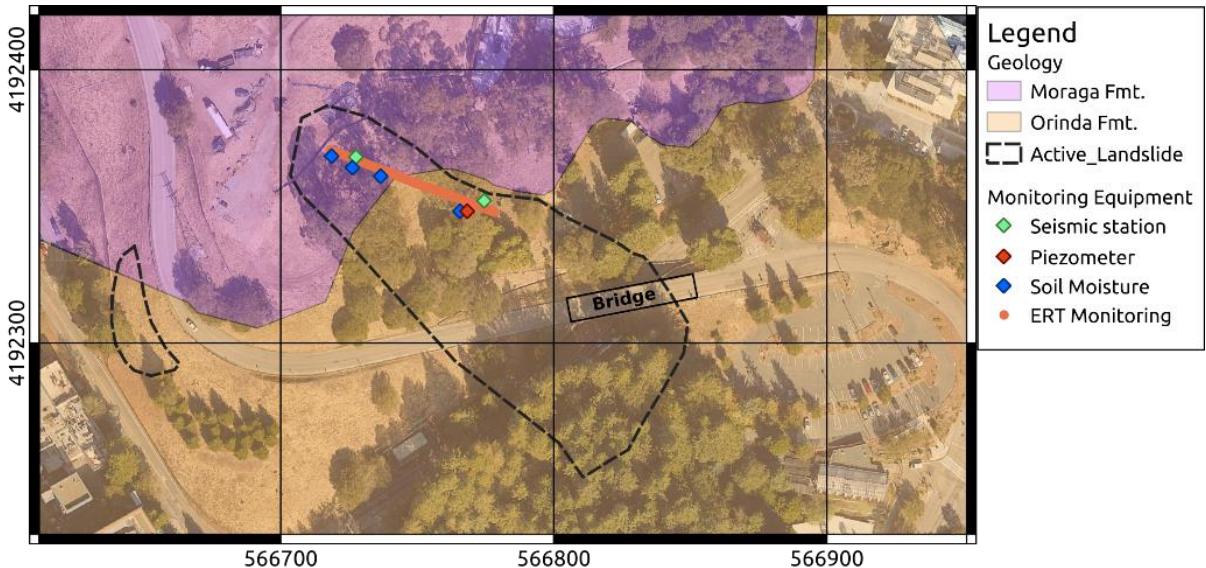
Many areas of elevated landslide hazard



Probability of Failure from Monte-Carlo Simulation (*LandLab* python code), based on infinite slope model

Monitoring landslide reactivation during winter storm event

Moisture infiltration causes reactivation



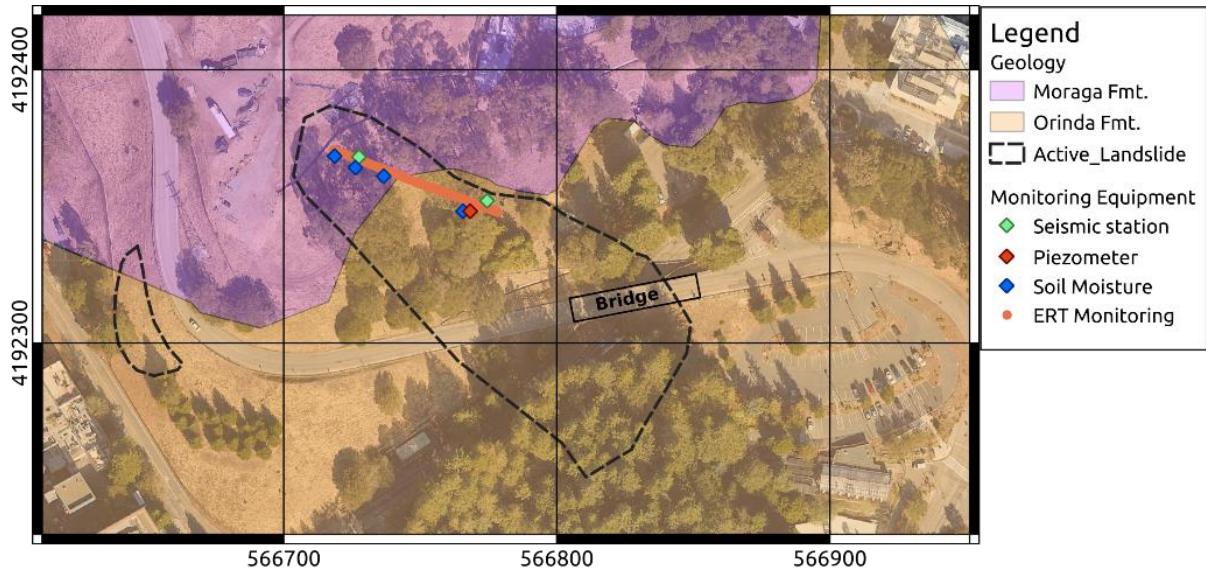
Landslide characteristics

- Slow-moving landslide (10 mm/year)
- GPS monitoring (since 2012) shows complex movements of shallow and deeper slip surfaces
- Characteristic for many slides across the site, which occur close to the interface between Moraga (permeable) and Orinda (non-permeable) formation

Fiolleau et al. (2023)
Journal of Applied Geophysics

Monitoring landslide reactivation during winter storm event

Moisture infiltration causes reactivation

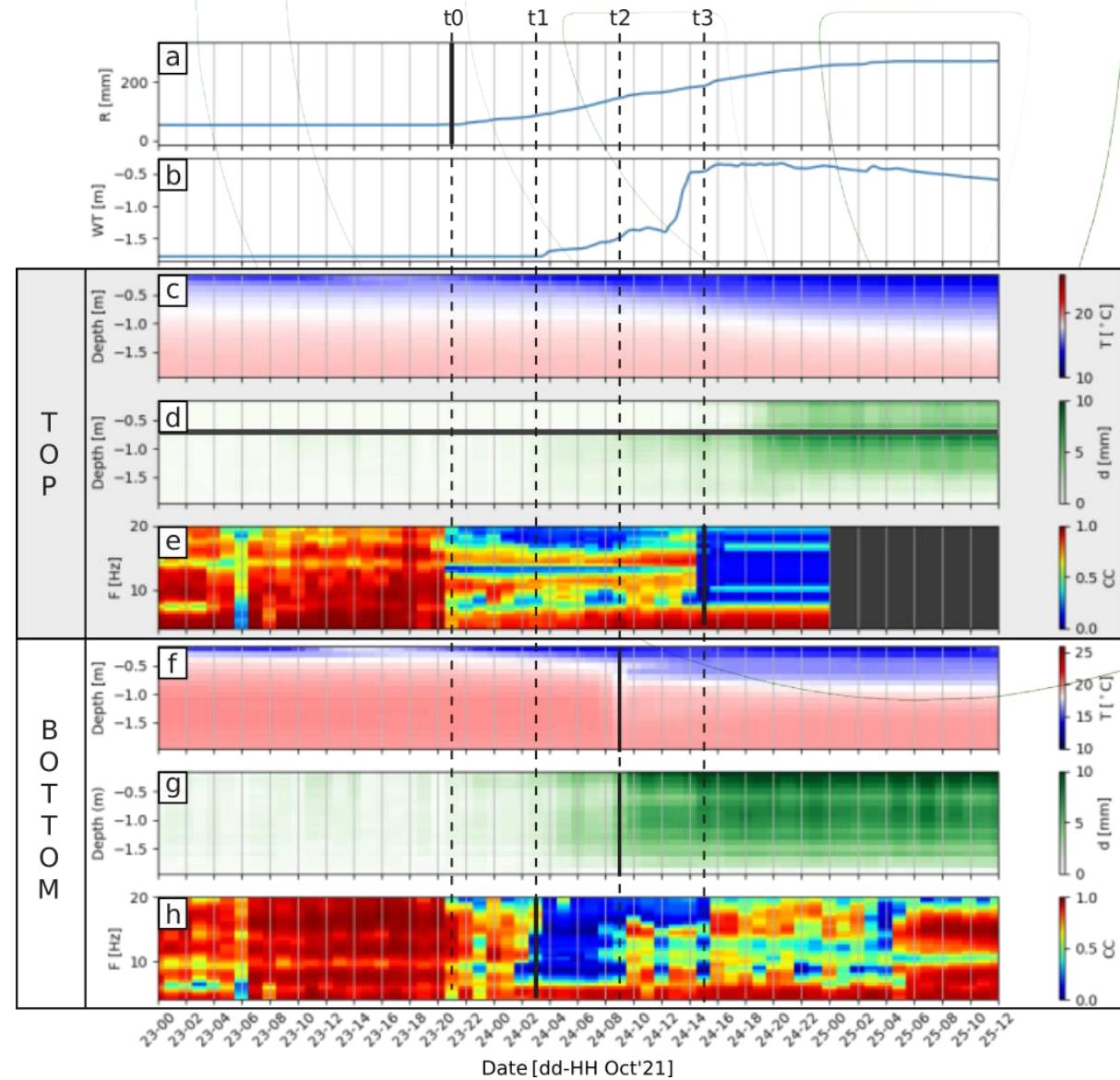


Monitoring of extreme rainfall event of October 2021

Ambient seismic noise monitoring: assessing changes in seismic/elastic properties

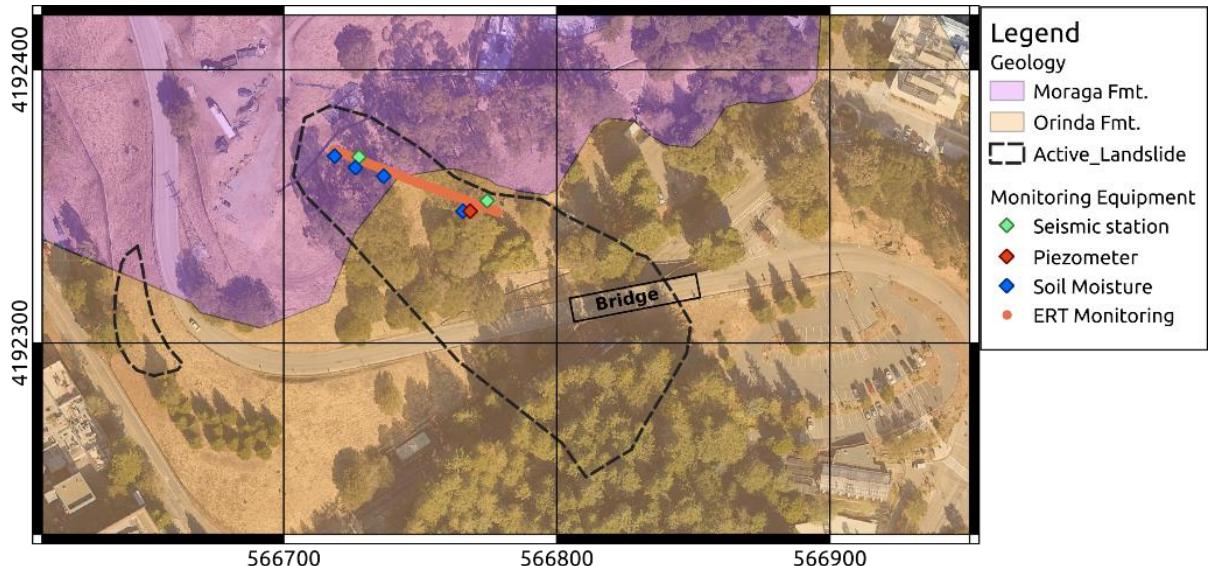
Seismic signals become disturbed **about 5 h before movement**

Landslide is characterized by movement at the toe, followed by movement at its top



Monitoring landslide reactivation during winter storm event

Moisture infiltration causes reactivation

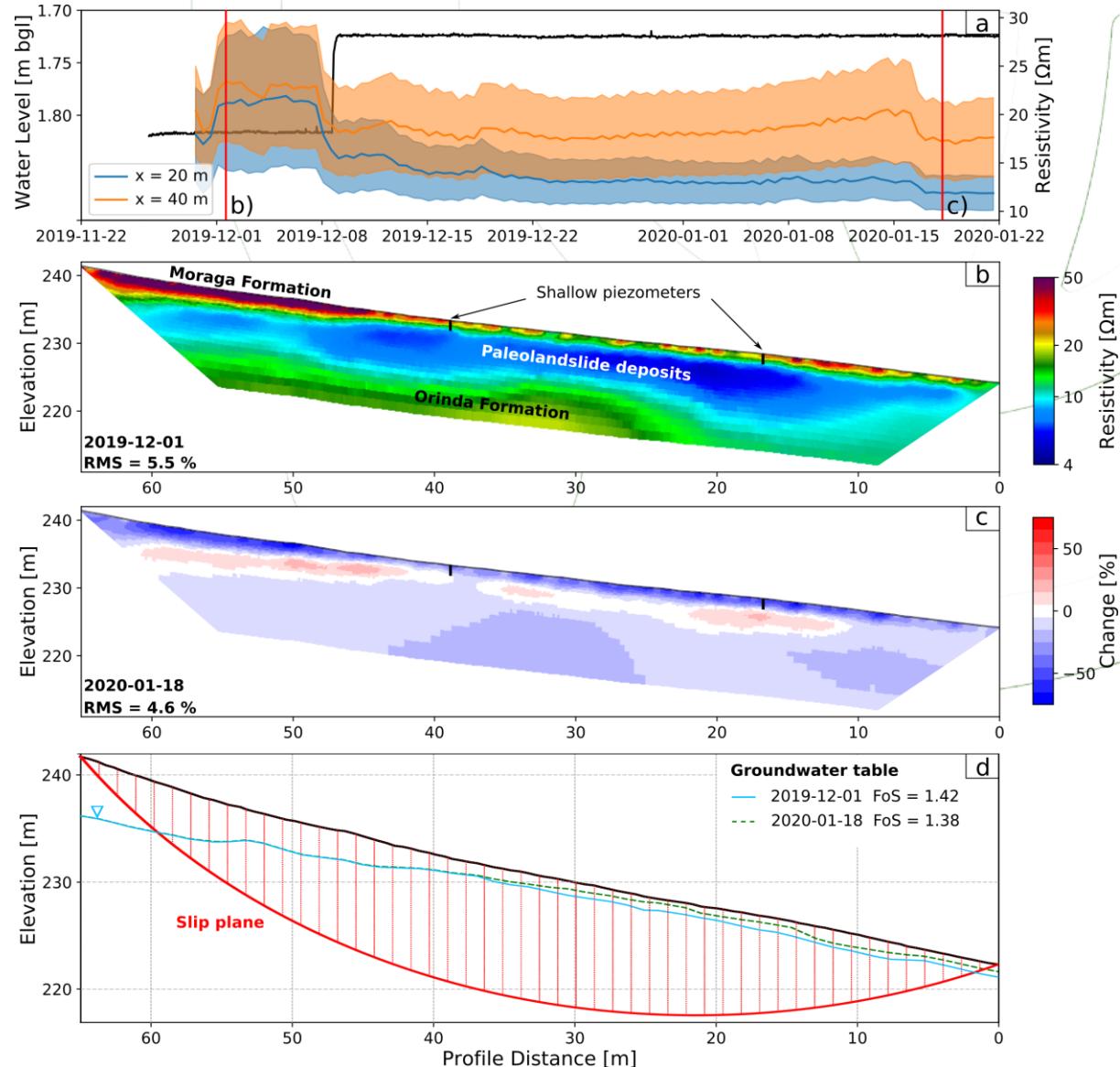


Subsurface response to prolonged rainfall shows changes in groundwater table

- Increasing resistivity due to a change in pore-fluid conductivity

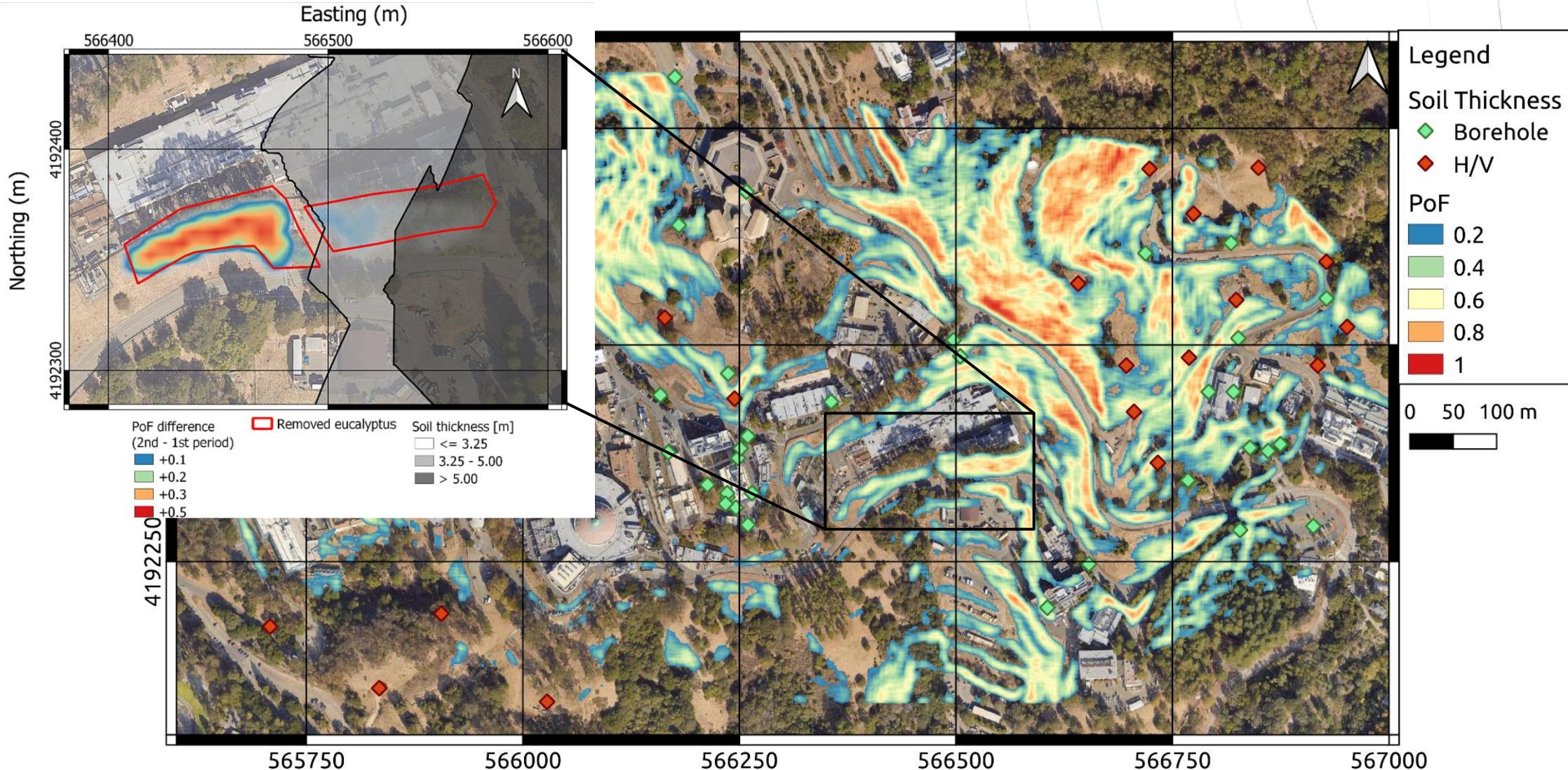
Simple slope stability model indicates decreasing FoS with increasing water table elevation

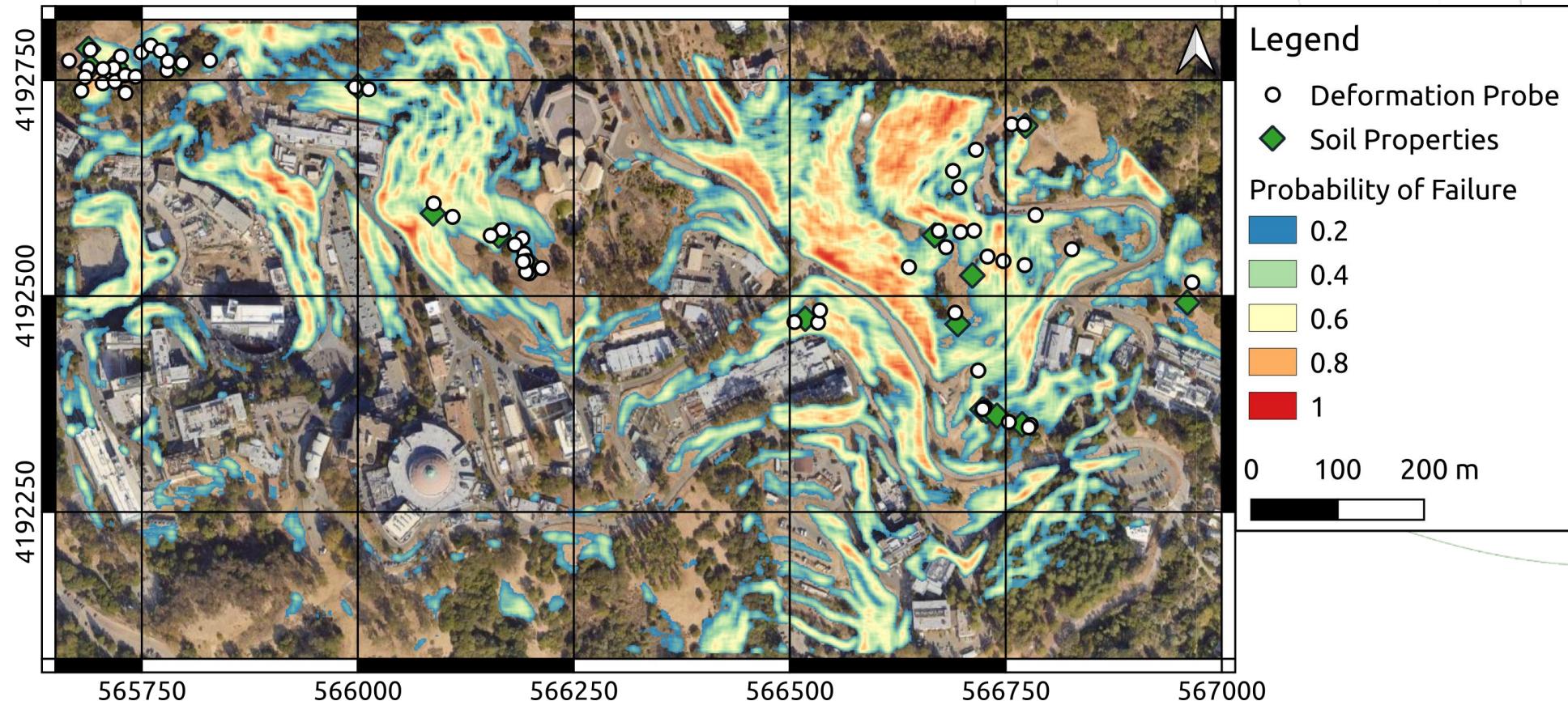
Developed automated groundwater table extraction using unsupervised clustering for near real-time FoS estimation



Landslide hazard map

Wildfire management - Effect of vegetation





Distributed sensor network provides real-time measurements of soil moisture/suction, and deformation

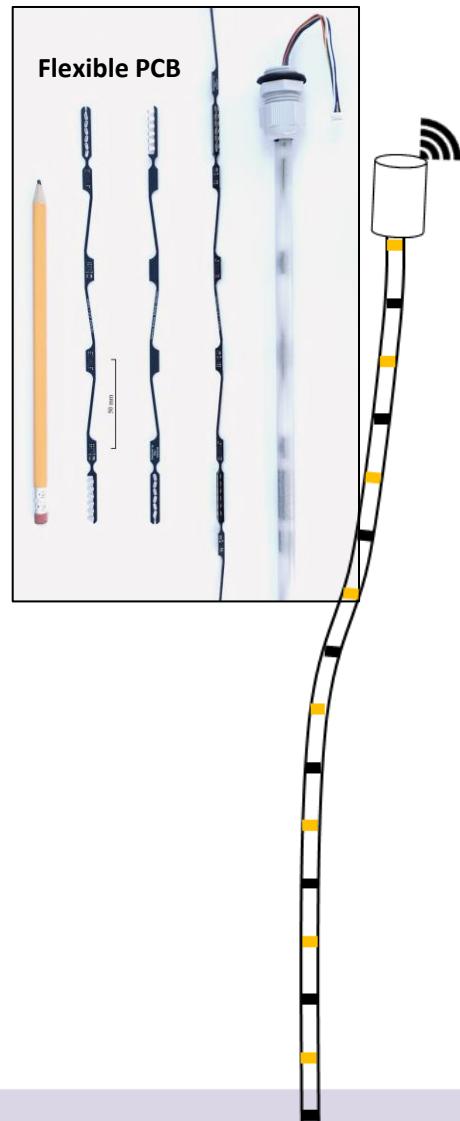
- 18 depth-distributed soil moisture/suction sensors
- 60 deformation probes
- LoRa connectivity
- Low-cost, low-powered devices

Low-cost, low-powered distributed sensor network

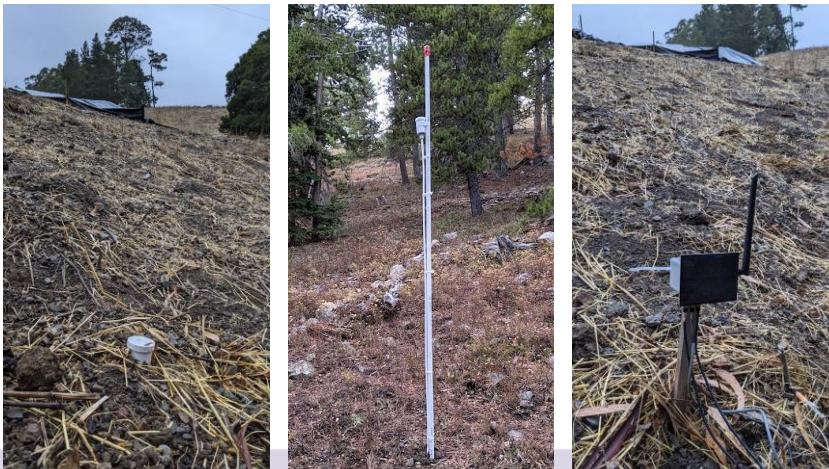
Adaptive, long-term monitoring using in-house sensor developments

Low-power (3V), low-cost (\$100) deformation probe

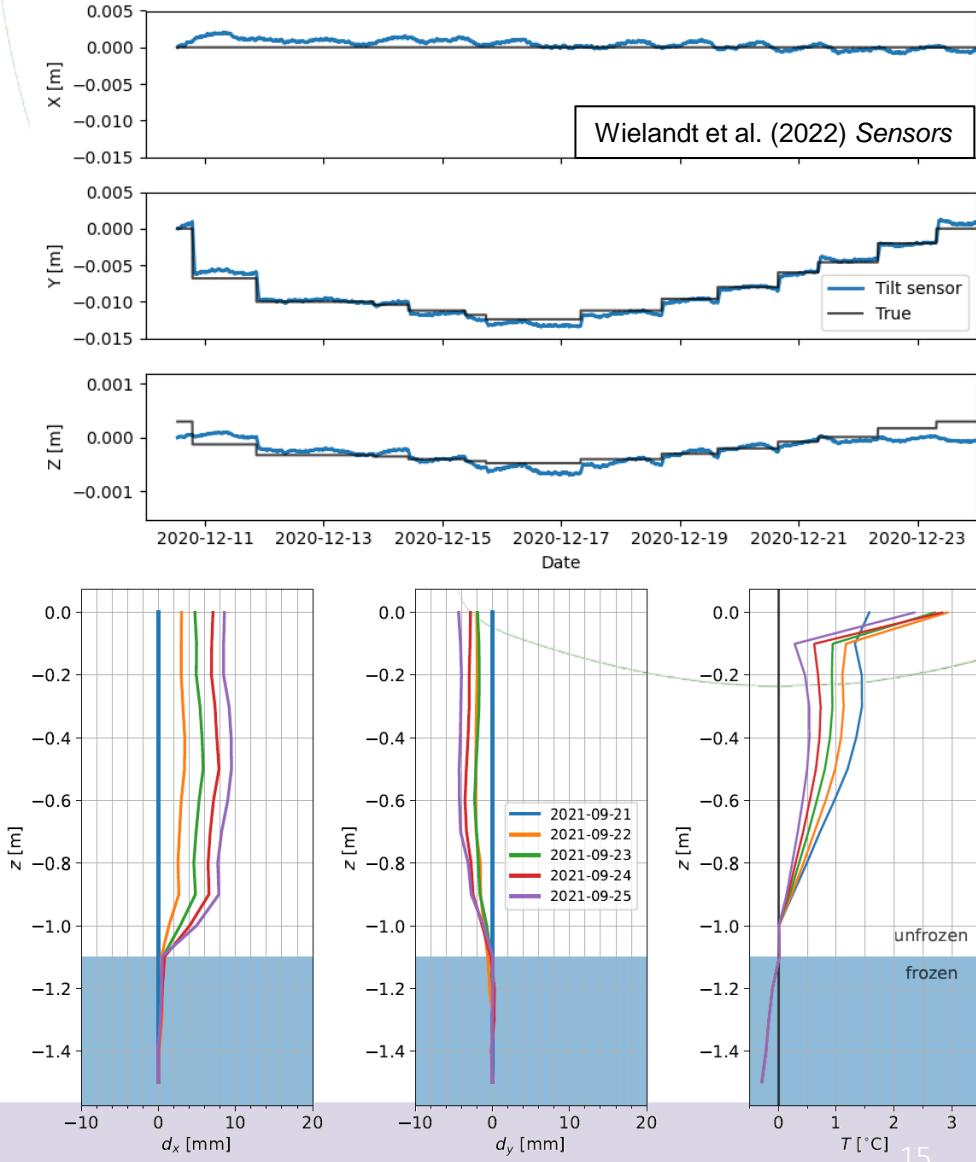
- Temperature sensors every 10 cm
- MEMS accelerometers every 10 cm
 - Depth-resolved deformation measurement
- **Sampling: 5 min**
- **Battery life: 3 years**
- LoRa connectivity for real time data telemetry
- **Millimeter accuracy – submillimeter sensitivity**



Low-power (3.7V), low-cost (\$80) SDI-12 loggers with LoRa connectivity and feedback

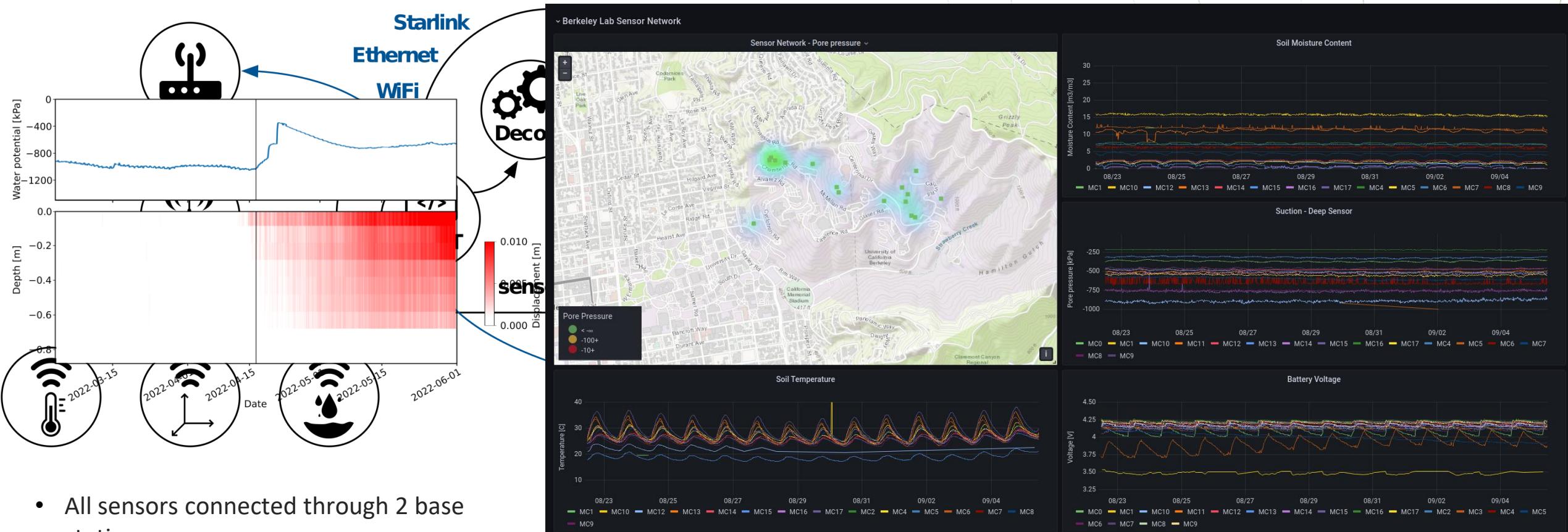


Advanced technologies for landslides, Firenze, January 30



Low-cost, low-powered distributed sensor network

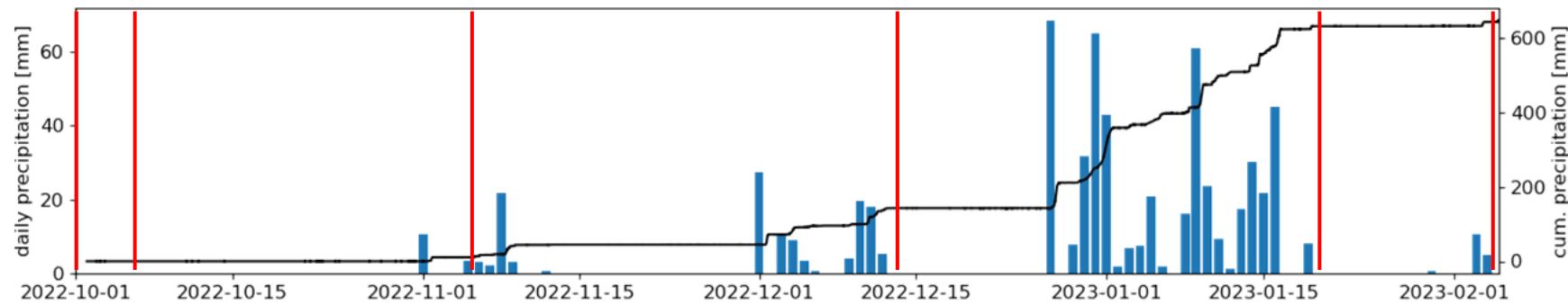
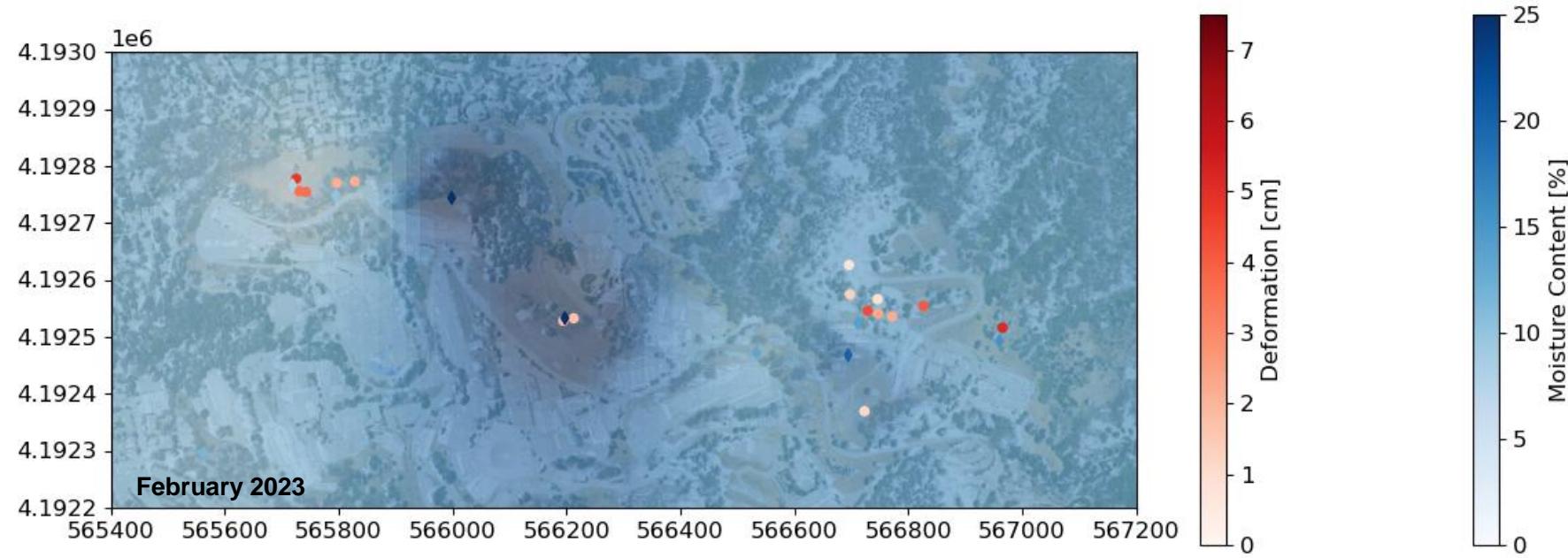
Adaptive, long-term monitoring using in-house sensor developments



- All sensors connected through 2 base stations
- Soil moisture/suction network operational since Feb 2022 (initial deployment Oct'19)
- Data pushed to InfluxDB – open-source database designed for time-series data
- Data visualized through Grafana

Subsurface response to Atmospheric Rivers

Monitoring the site during 600 mm of rain...



Machine Learning to predict critical parameters

Essential for LEWS and adaptive sensing strategies

Recurrent Neural Network, Long Short-Term memory model

- Remembers events in the past
- Can handle data composed of various frequencies

Two approaches:

- Predict the next 1h based on the prior 24 h
- Predict 12 h based on prior 14 days

Inputs:

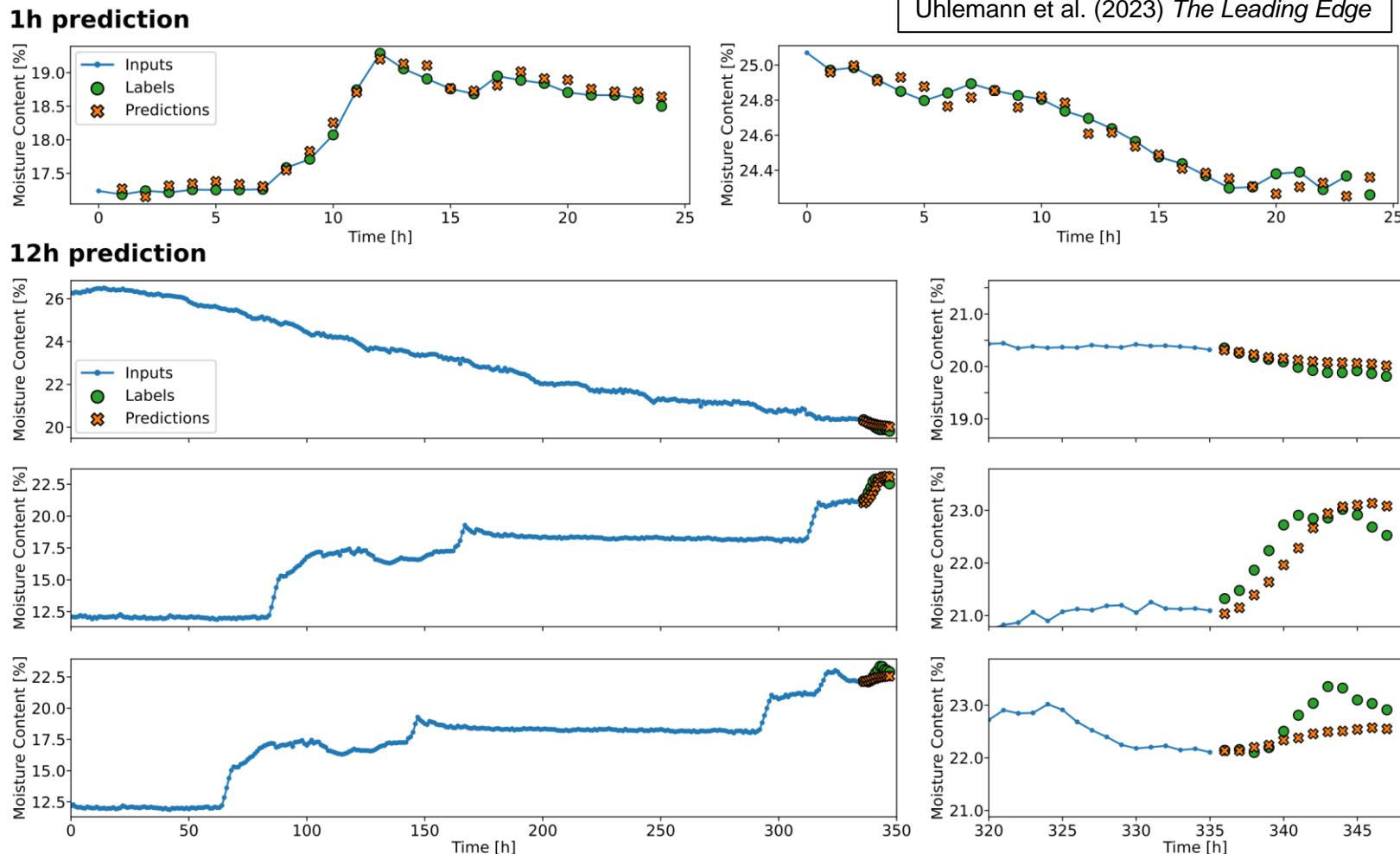
1-year time-series of actual and antecedent rainfall, temperature, relative humidity, barometric pressure

Results

1h forecast has high accuracy (0.074% mean error)

12h forecast good in recovering gradual change, but fails in forecasting sudden changes

Sufficient accuracy for adaptive sensing strategies



More data required for accurate prediction

A Step Closer Towards Predictive Understanding?

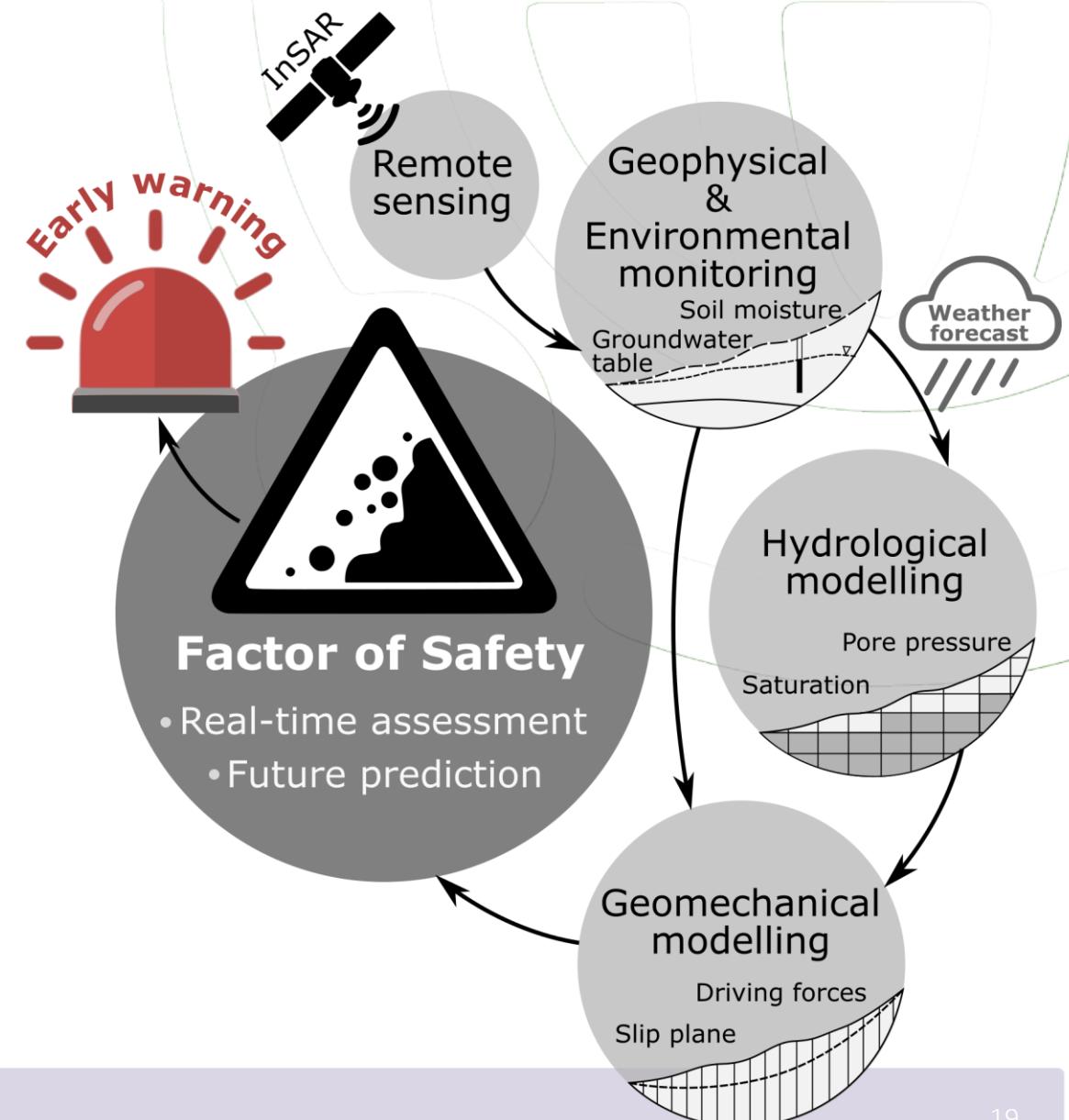
Combining multiple methods and scales

Recent advances in geophysical and environmental sensing allow for:

- Dense sensing of critical parameters
- Low-cost, low-powered remote deployments

Integration into hydro-geomechanical modelling allows to assess and predict slope stability

Integrated geophysical sensing allows for a predictive understanding of landslide processes!





THANKS!

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