

Early Warning System for rainfall induced landslides

KLIMA 2050 PhD Presentation
Erin Lindsay
<https://www.ntnu.edu/employees/erin.lindsay>



NTNU

Norwegian University of
Science and Technology



KLIMA
2050

TOC

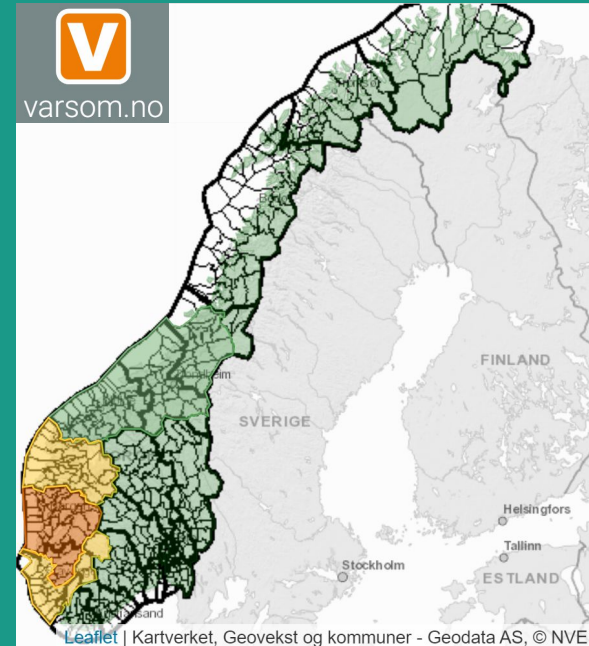
Background: KLIMA 2050 WP3

PhD & Supervision

Existing Landslide EWS

PhD focus areas

Preliminary results



About me:



Question for audience: What do these places have in common?



Background

WP3.4 Early warning system based on short-term weather forecasts (now-casting) - Objectives

- Develop real time EWS for shallow landslides at a regional or local scale.
- Build on existing Norwegian debris flow EWS (implemented by NVE in 2013).
- EWS to be based on forecasted meteorological (e.g. rain or snow), hydrological, and geotechnical parameters.
- Develop a set of connected numerical simulations.



Supervision, and KLIMA 2050 support network

Steinar Nordal



Lena Rubensdotter



Graziella Devoli



Jose Cepeda,
Regula Frauenfelder



CONSORTIUM

Private sector

SKANSKA

MESTERHUS
- det blir som avtalt

Multiconsult

Finans Norge

SKJÆVELAND
GRUPPEN

NORGESHUS

weber
SAINT-GOBAIN

isola

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Public sector



Statens vegvesen



NVE

AVINOR

Jernbane-
direktoratet

STATSBYGG

TRONDHEIM KOMMUNE

Research & education

SINTEF

BI

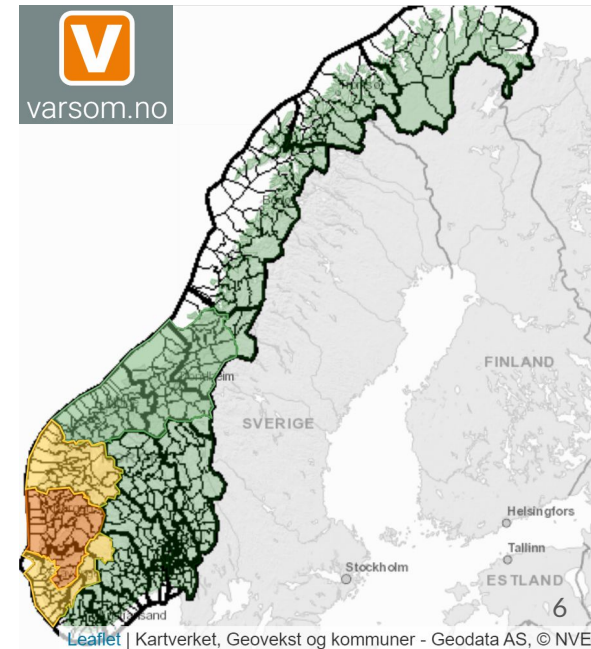
NTNU

Meteorologisk
institutt

NGI

Existing landslide EWS in Norway

- Joint initiative by public agencies
- Launched 2013 and managed by NVE
- Warn of potentially dangerous hydrological situations (3 days ahead)
- Warnings are based on:
 - MET forecasts
 - Landslide thresholds
 - Real time observations (temp, precipitation, discharge, groundwater)
 - National landslide susceptibility maps and historic landslides
- On-duty forecaster considers model, and decides which warning level to issue in each region (updated twice daily)





Improvements since 2009...

Landslide prevention in Norway improved significantly:

- Better coordination between national and local
- More systematic mapping of landslides (NVE, NGU, SVV...)
- Knowledge of landslide processes (SVV, NVE, Universities, NGU, NiFS project, ...)
- Assistance to municip. - spatial planning, emergency response
- Development of national database

Operational regional landslide EWS (rainfall-induced landslides and slush flows) with
95% correct forecasts!!



Issues remaining

1

Few stations measuring precipitation in landslide source areas.

Summer storms problematic to predict.

- Rainfall initiation thresholds??

2

Landslide susceptibility maps limited by resolution of input data.

e.g. Landslide in Hordaland 8/12/17

- NVE hazard level → orange
- Susceptibility not susceptible.
 - 1:250,000 quaternary map → bare bedrock

3

Historic landslide database is incomplete (landslide no., and size) and spatially biased along roads and railways.

Difficult to use database to determine rainfall thresholds, hazard mapping, etc.

4

Information about local thresholds is only available for some areas of Norway.

5

Geotechnical properties not included in EWS forecast model

Future landslide EWS in Norway

Users of landslide EWS would benefit from warnings at a more 'local' scale, in order to best plan contractor response to a given hazard situation.

- NVE working with MET in use of radar and 3h thresholds



Road cleared after debris flow in Almåskroken, Gaudalen, taken from helicopter shortly after the event (Adressa.no).

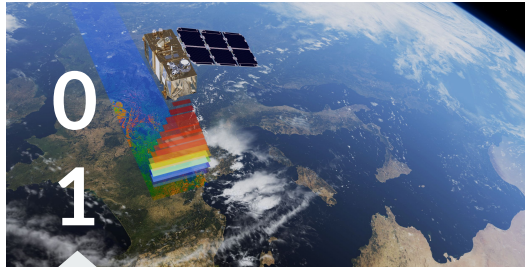


KLIMA 2050 possible research focus

Improve understanding of local threshold values and forecasting capabilities by:

- A. Predicting **future needs** for a landslide database (2050)
- B. Incorporating **geotechnical properties** into the landslide EWS
- C. Systematic **(semi-automated) identification** of landslides from remote sensing images

Innovation potential:



Detect landslides using satellites

Take advantage of free, frequent high resolution satellite data from ESAs new Sentinel-2 satellite. Apply machine learning to recognise landslide features, given a sudden loss of vegetation.

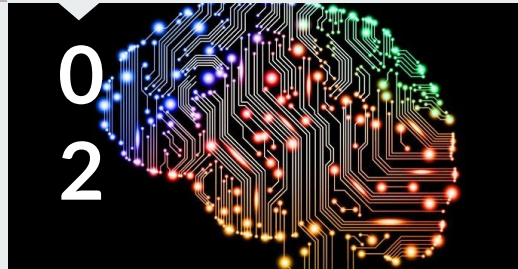
Machine learning for forecasting


Improve NVE forecasting capabilities, using artificial neural-network to train an algorithm for predicting number and magnitude of landslides for given conditions.



Update forecast tool with improved landslide event data

After it has been shown possible to reliably detect landslides, the landslide prediction algorithm should be retrained (Bayesian updating) on the new data-set





A. Vision - National landslide database

- Literature review - current SOTA: Landslide EWSs
- Predict future data sharing needs
- Identify technological developments that may enable improvements
- Shared vision of Norwegian landslide database (2050)
 - Encourage cooperation between global and local stakeholders



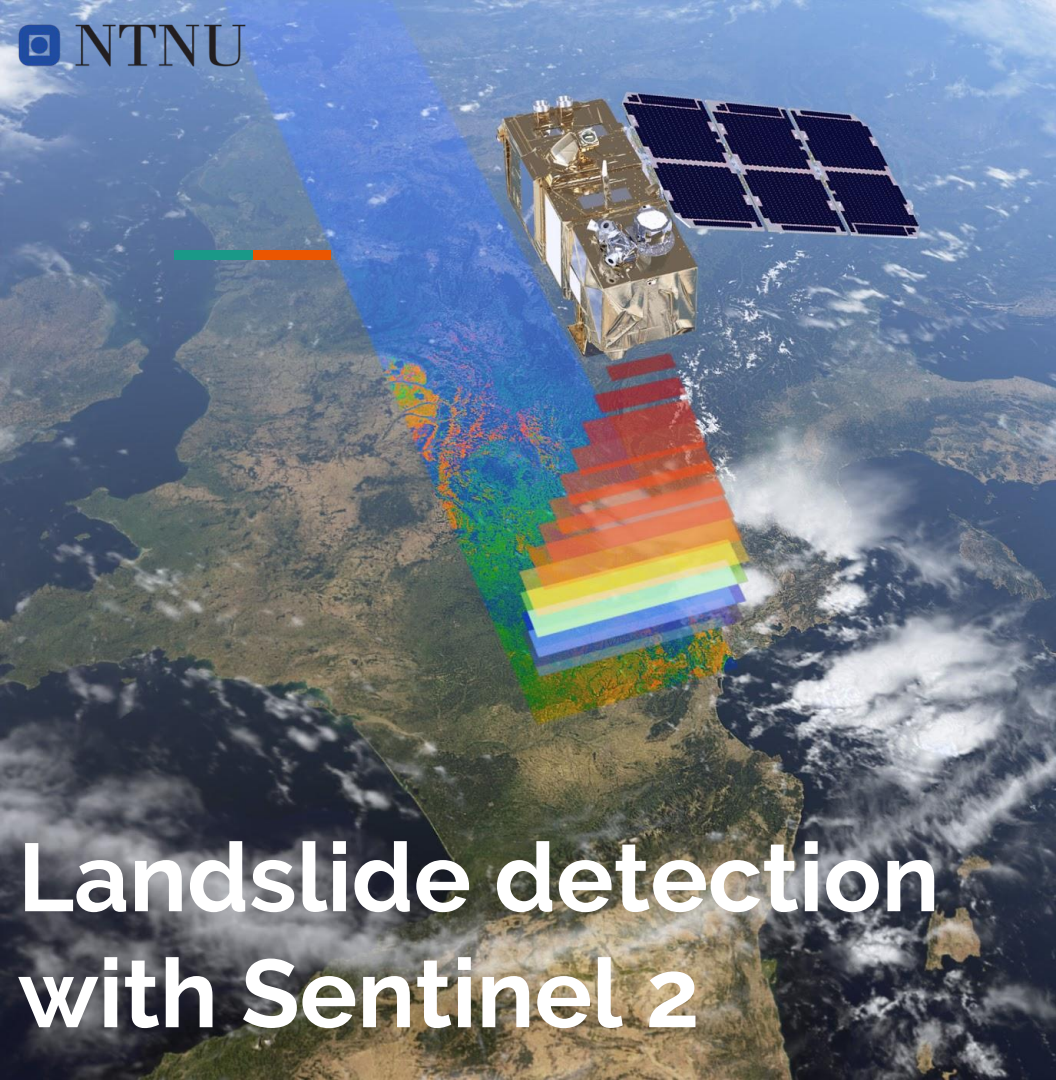
B. Regional trends in geotechnical properties of susceptible soils

- Literature review - SOTA: Landslide EWSs
- Master student - Emilie O Hauge
 - Investigating potential regional trends in geotechnical properties (shear strength and drainage) from a selection of Norwegian glacial tills (norsk: *morene*)
- Master student - Frieda Lange
 - Investigating susceptibility of thawing soil to landslides in different climate conditions



C. Systematic identification of LSs from remote sensing images

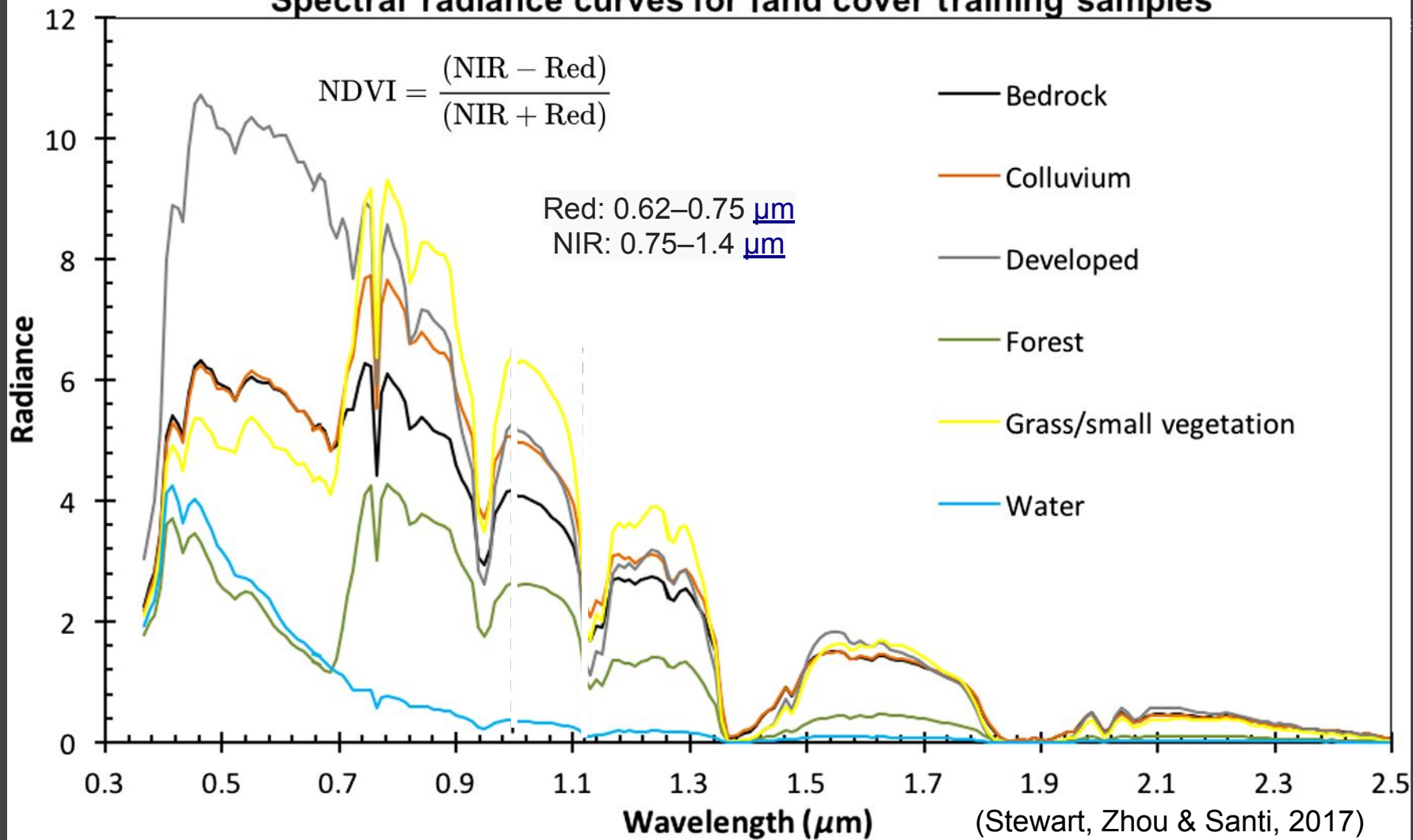
- Courses: Statistical pattern recognition, Computer intensive statistical methods
- Literature review:
 - How have machine learning and image classification been used in landslide identification?
 - What type of imagery has been used previously?
- Master student - Mads Fjeld
 - Investigating potential for using ESAs Sentinel 2 multi-spectral optical satellite to identify landslides in Norwegian conditions
- 'Pilot project (?) - Using Sentinel satellite data to identify LS. Supported by Romsenter.



Landslide detection with Sentinel 2

- Multi-spectral satellite for land use monitoring
- Freely available data, revisit time 1-2 days, pixel resolution 10-60m
- Compare subsequent images to identify LOSS of vegetation
- Normalized difference vegetation index (NDVI) used to detect vegetation or bare soil
- Use statistical pattern recognition techniques to distinguish landslides

Spectral radiance curves for land cover training samples



(Stewart, Zhou & Santi, 2017)



Research topic

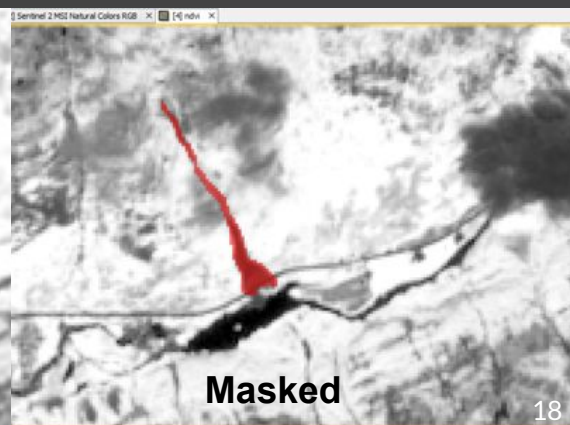
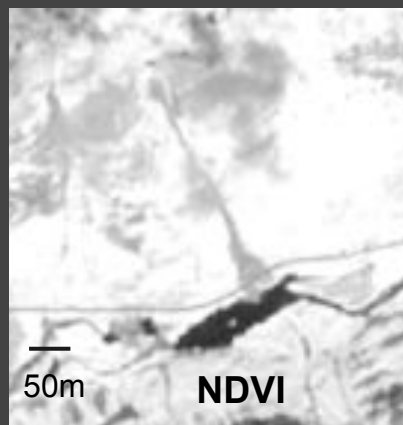
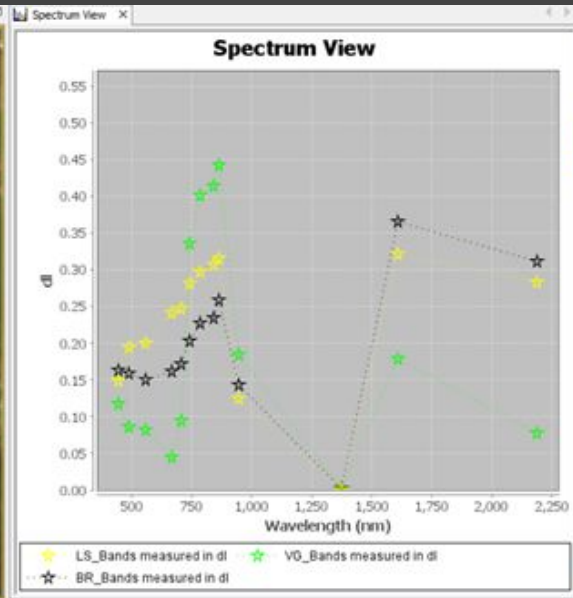
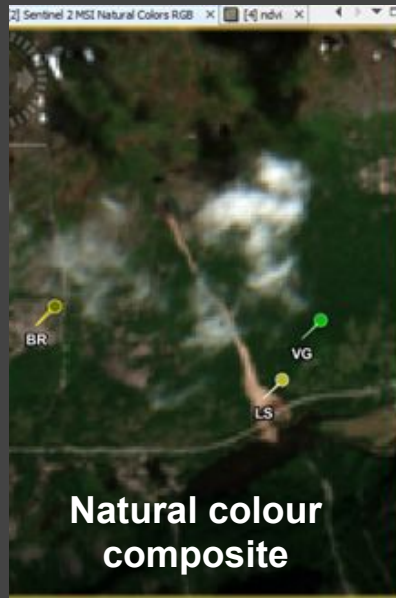
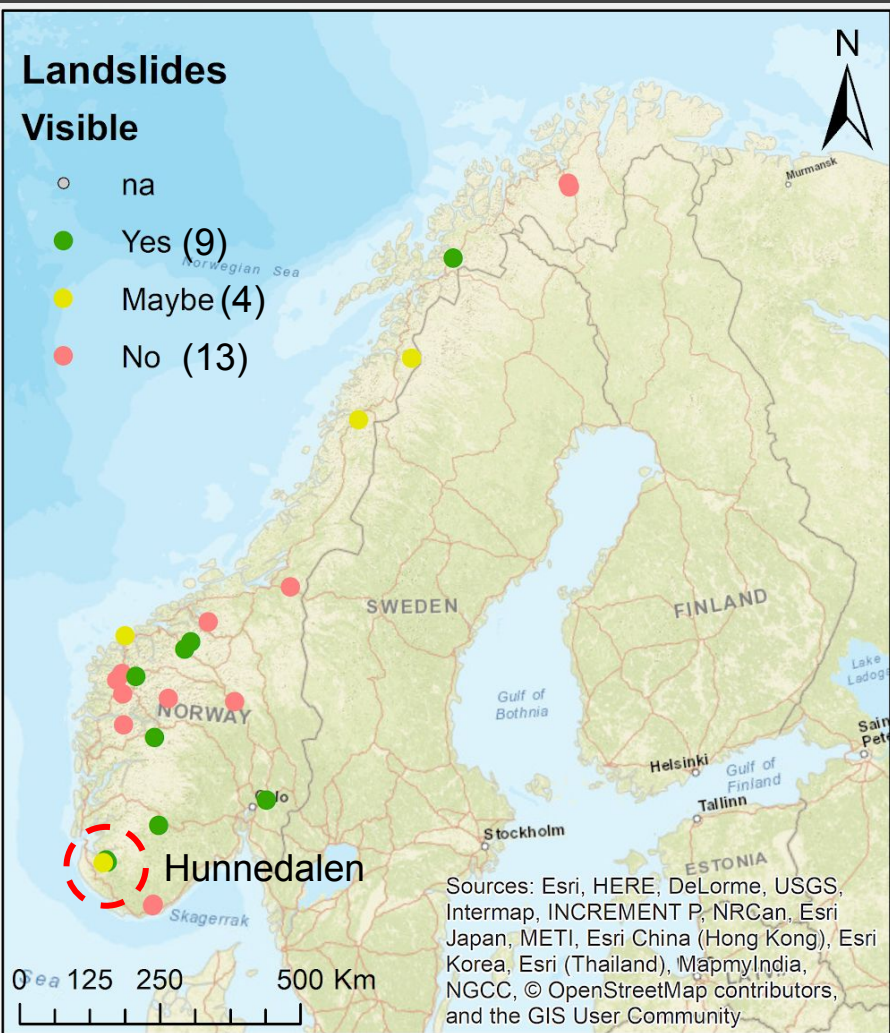
Master project
Mads Fjeld

Feasibility of using Sentinel 2 data to detect landslides in Norway, considering:

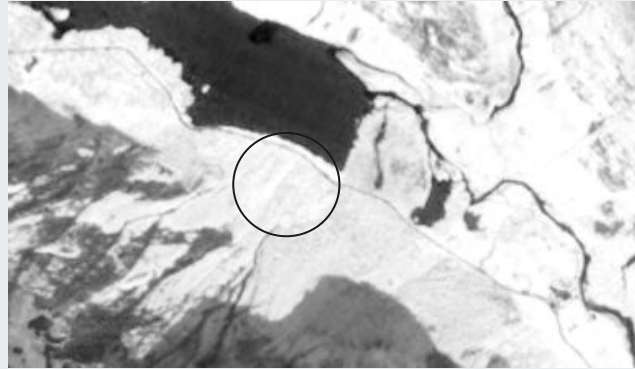
- Detectable event size
- Lighting conditions
- Cloud cover
- Terrain type (slope)
- Geology/quaternary cover
- Season
- Snow cover

Landslides Visible

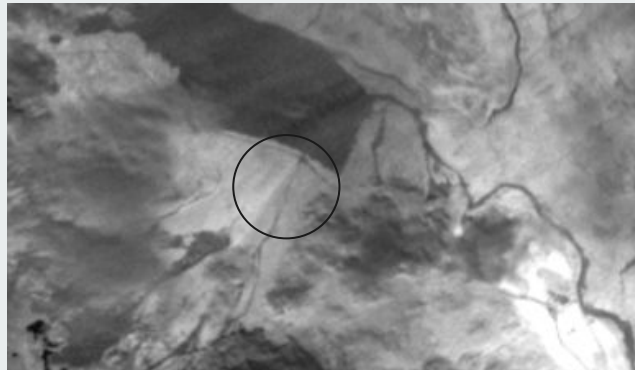
- na
- Yes (9)
- Maybe (4)
- No (13)



Summary



Pre-event NDVI (21.07.17)



Post-event NDVI (26.07.17)

Results:

Less than half of queried events detectable using this method (so far)

Greatest challenges:

Illumination (slope or season) and cloud cover

Potential:

General idea is still complementary to international efforts in this field which don't address issues with landslide detection - e.g. NASA 'now-casting' using GPM satellite mission.

Recommendation:

Consider alternative types of remote sensing - e.g. higher resolution satellites, drones, aerial photos.



Takk for meg!

Questions?





KLIMA 2050 Potential pilot project objectives

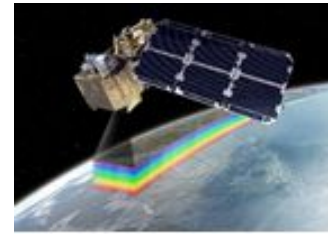
Improve understanding of local threshold values and forecasting capabilities by:

- ➔ 1. Improving **landslide event database**, utilising **satellite data** for cost-effective systematic mapping.
- 2. **Semi-automate** daily reporting and forecasting process
- 3. Installing **ground-based monitoring** in vulnerable areas.

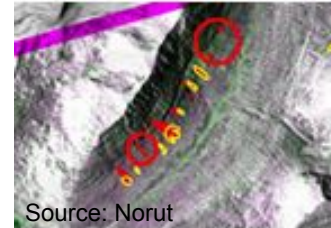
1. Landslide mapping, classification and prediction system

- Identify new landslides using satellite images.
- Use ML to identify and classify landslides.
- Retrieve and analyse local MET data to better understand local trigger thresholds.

Acquire and prepare data



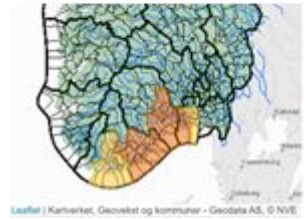
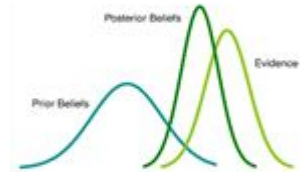
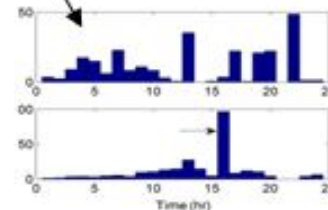
Detect landslides



Assign event geometry



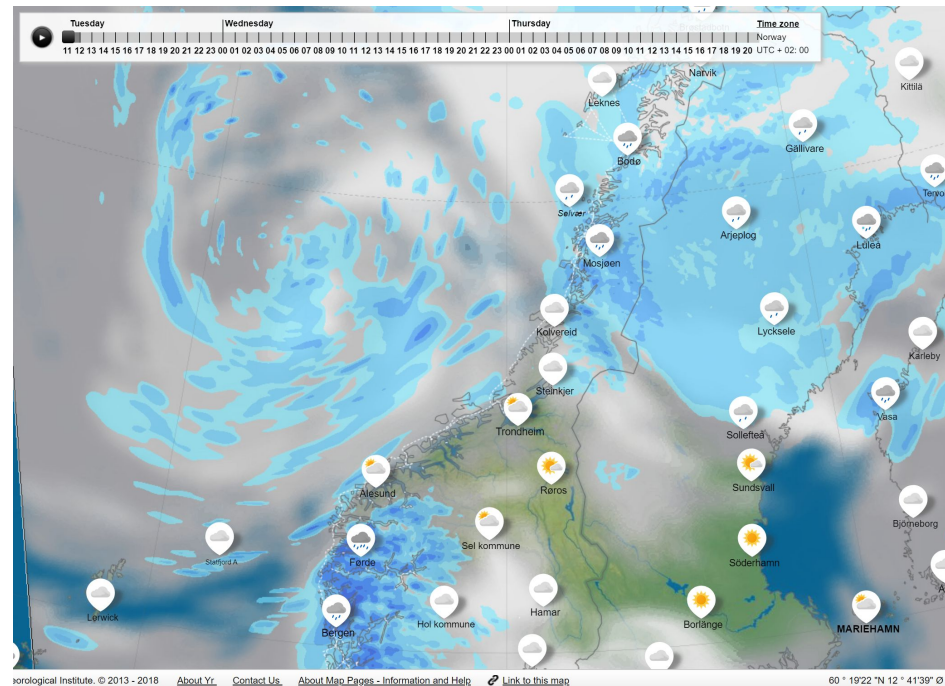
Acquire met. data from nearest stn.



Determine trigger, and any other relevant info. Update prediction model.

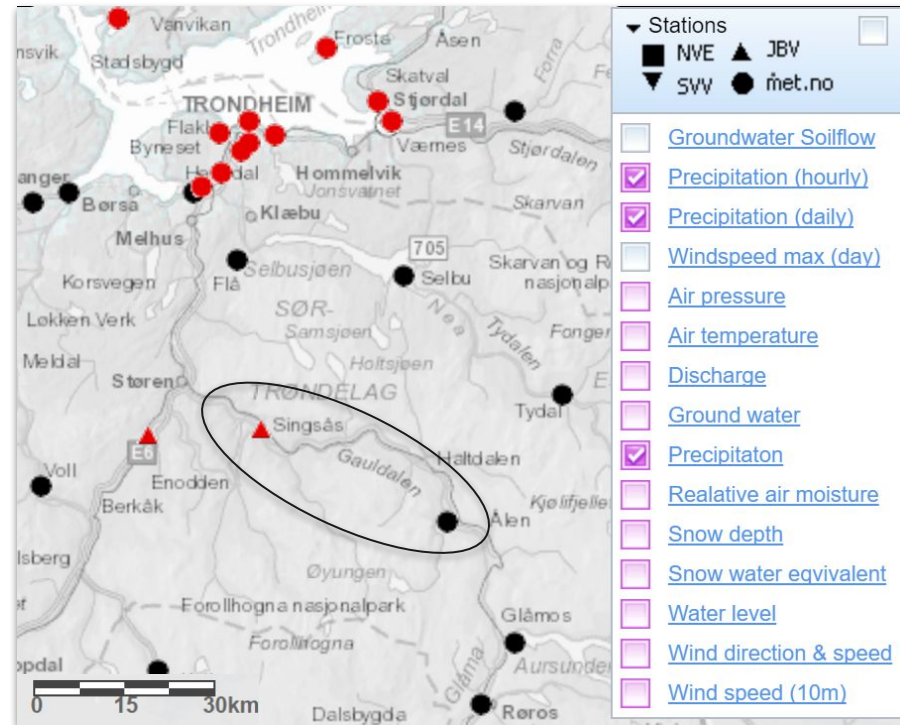
2. Semi-automate daily reporting and forecast process (NVE)

- Challenges: manual, time consuming, repetitive task. Information manually extracted after.
- Benefits:
 - improve efficiency, and consistency in reporting.
 - Retrieve and use historic forecasts to improve models more easily.
 - Trial using pattern recognition on forecasted weather formations.
- Recommend: Multi-consult to support NVE?



3. Improve meteorological monitoring in vulnerable areas

- Target problematic areas with insufficient monitoring.
- Install equipment and collect data.
- Analyse local triggering thresholds.





Knowledge gaps to be filled by KLIMA 2050 (WP3)



- **Consistent and verifiable procedures for the mapping of hazard, susceptibility, vulnerability and risk for debris flows at a local or regional scale.**
- Accurate methods for the vulnerability assessment of critical infrastructure to water-triggered landslides, including interactions with other hazards and cascading risks.



- **Reliable local/regional early warning systems for debris- and mudflows.**



- **Reliable regional geomechanical models for real-time assessment of landslide hazard during a storm event.**
- Environmentally friendly methods for the improvement of drainage and slope stabilization.
- Cost-effective and sustainable methods for constructions to act as barriers and/or diversion structures to protect the elements of risk from landslides, particularly in challenging terrain.
- Relevant procedures for managing landslide risk at various levels (municipality, regional).