

# Technology and Automation Revolutionizing Geoprofessional Practice

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**Berkeley**  
UNIVERSITY OF CALIFORNIA

GBA SPRING CONFERENCE

San Diego, April 9 2022

**THINK BIG.  
ACT BIGGER.**

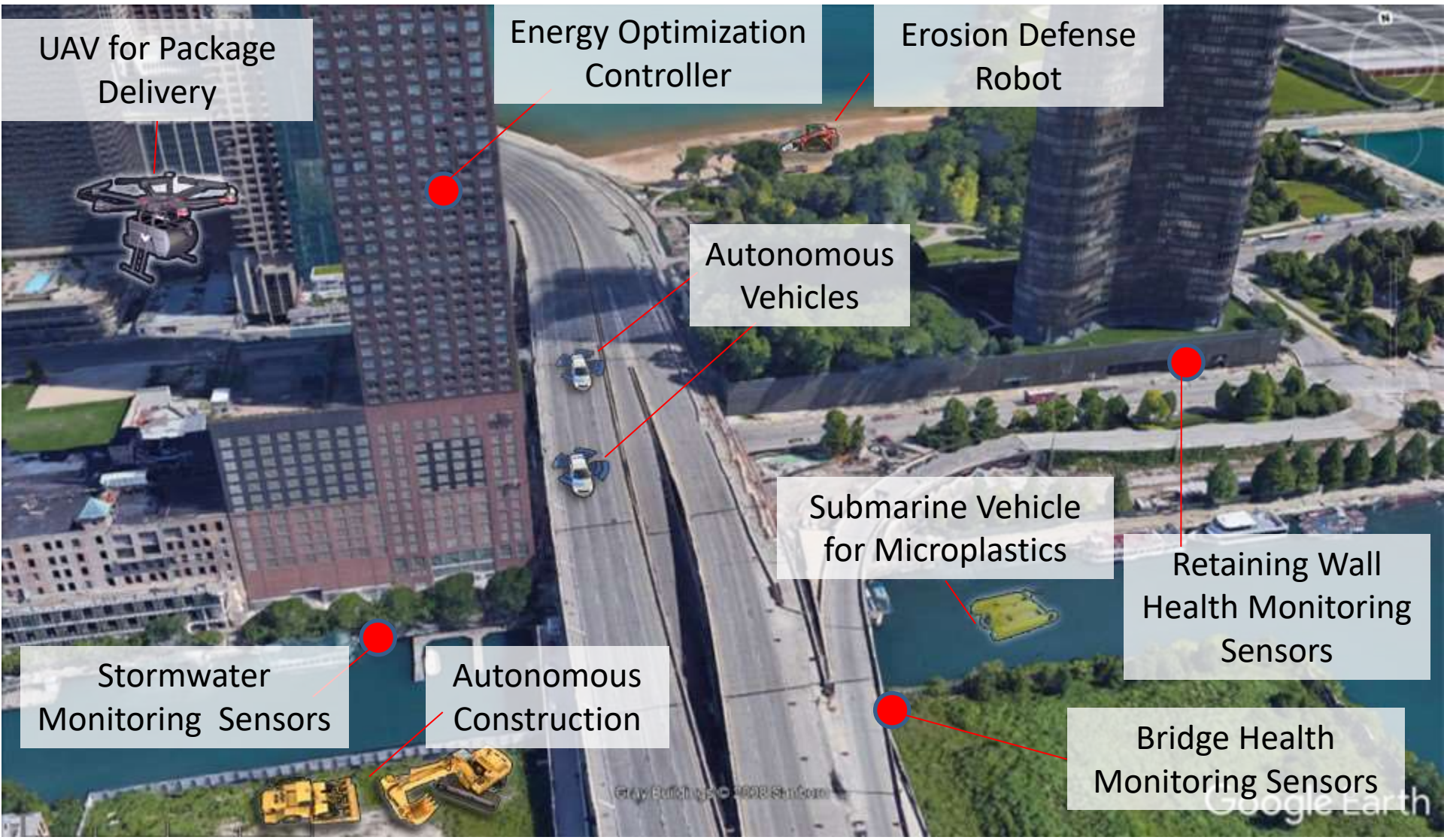


# Outline

- Automation & Infrastructure
- Example applications of autonomy and decision-making across scales:
  - Satellite
  - **UAVs**
  - On-the-ground sensors
- Think Big Conclusions
- Act Bigger Recommendations

# Autonomy for Infrastructure & the Environment

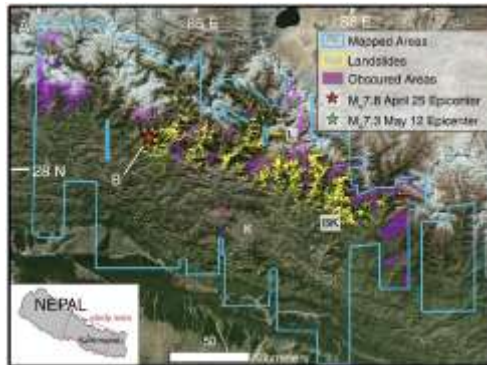
Advances in Autonomy (robotics, sensing and controls) will shape the way we protect the environment & design, build, monitor and operate our infrastructure



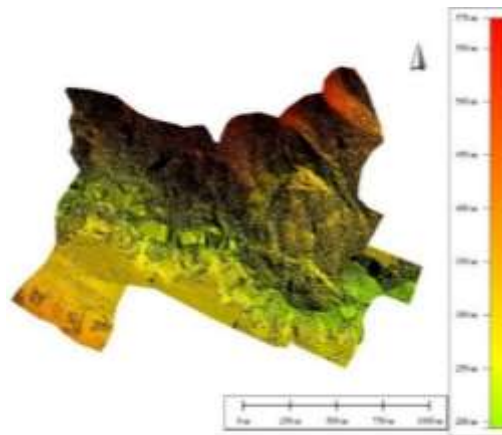


# Multi-scale, multi-sensing monitoring frameworks can provide system-level resiliency

## SATELLITES



## UNMANNED AERIAL VEHICLES



## WIRELESS SENSORS



**Coverage** >100 km<sup>2</sup>  
**Data Resolution** >0.5 m  
**Data Frequency** days  
**Sensors** Optical, Infrared, Radar

**1-100 km<sup>2</sup>**  
**>1 cm**  
**hrs**  
**Optical, Infrared, and more**

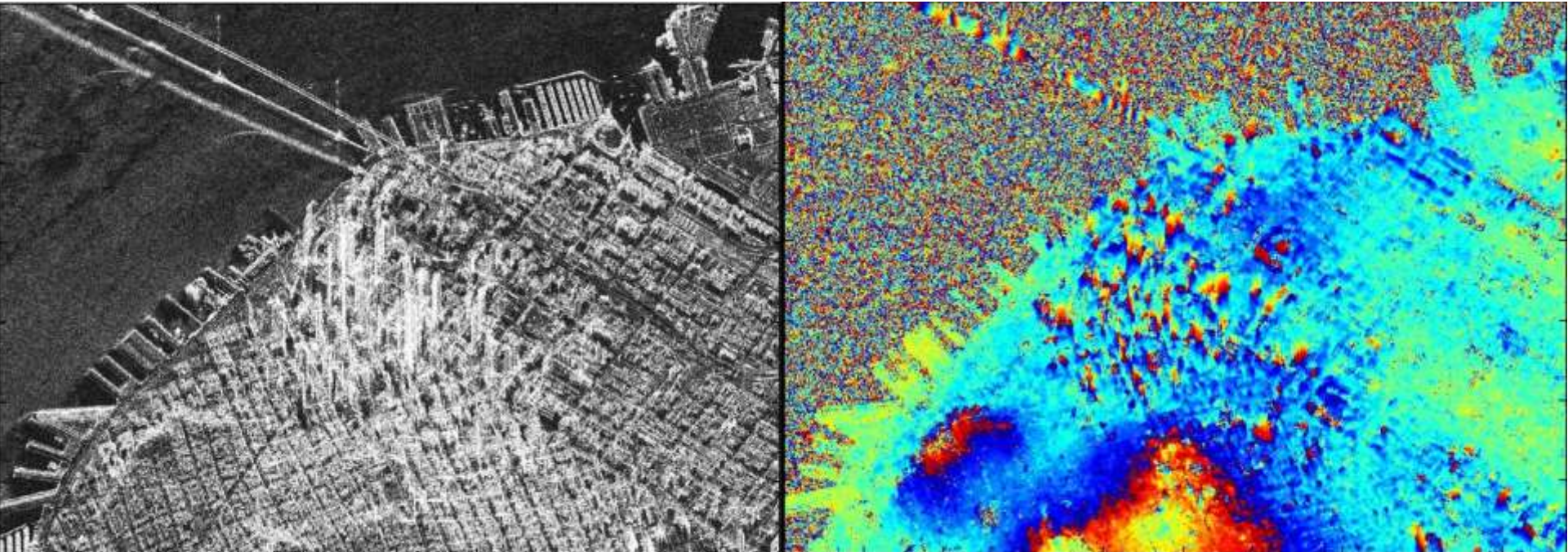
**<1 km<sup>2</sup>**  
**local**  
**sec**  
**Wide range**

# Satellite Monitoring Innovation

- Unprecedented investment on new satellite constellations with multiple sensors (optical, radar, infrared)
- Earth observation satellites in orbit:
  - 2008: 150 satellites
  - 2019: 768 satellites
- Improving data quality & data frequency collection

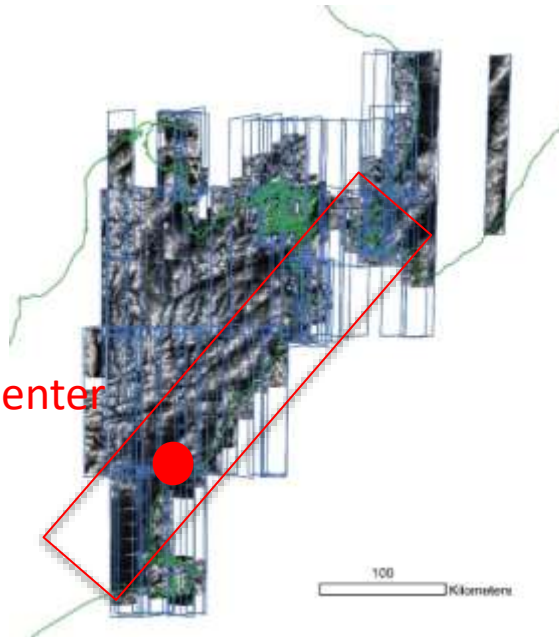


Worldview 3 – Digital Globe





# Satellite-based Digital Surface Model DSM following 2016 Kaikoura Earthquake



Kaikoura  $M_w$  7.8  
earthquake affected region

Based on open-access Surface Extraction with TIN-based Search-space minimization (SETSM) methodology.

**Created DSM at 0.5 m and 2 m resolution**  
**North part of South Island = 65,000 km<sup>2</sup>**  
**(Size of the State of South Carolina)**



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# Robots are an integral part of Autonomous Infrastructure

LAND-BASED



April©

SUBMARINE



Youcan©

AERIAL



DJI Matrice 600©

Photos of Robots used by our Research Group



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# Why is UAV Technology changing the Geo-Infrastructure field?

- Inexpensive, yet powerful
- Mobile
- Safe(r)
- Multi-sensing capability
- Data acquisition platform
- Computational platform



UAVs introduce mobility in sensing!



Photos of UAVs at UC Berkeley



# UAV Multi-Sensing Capabilities are key

The ability of UAVs to integrate with any type of sensor is empowering for characterizing infrastructure systems

Sensor to be used depends on project needs



Optical Camera



Infrared Camera



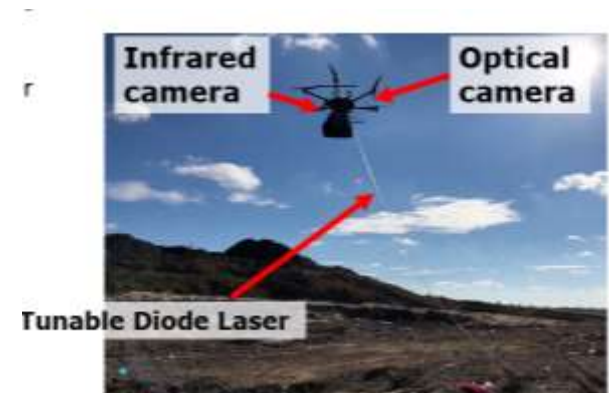
Multi-Spectral Camera



LIDAR

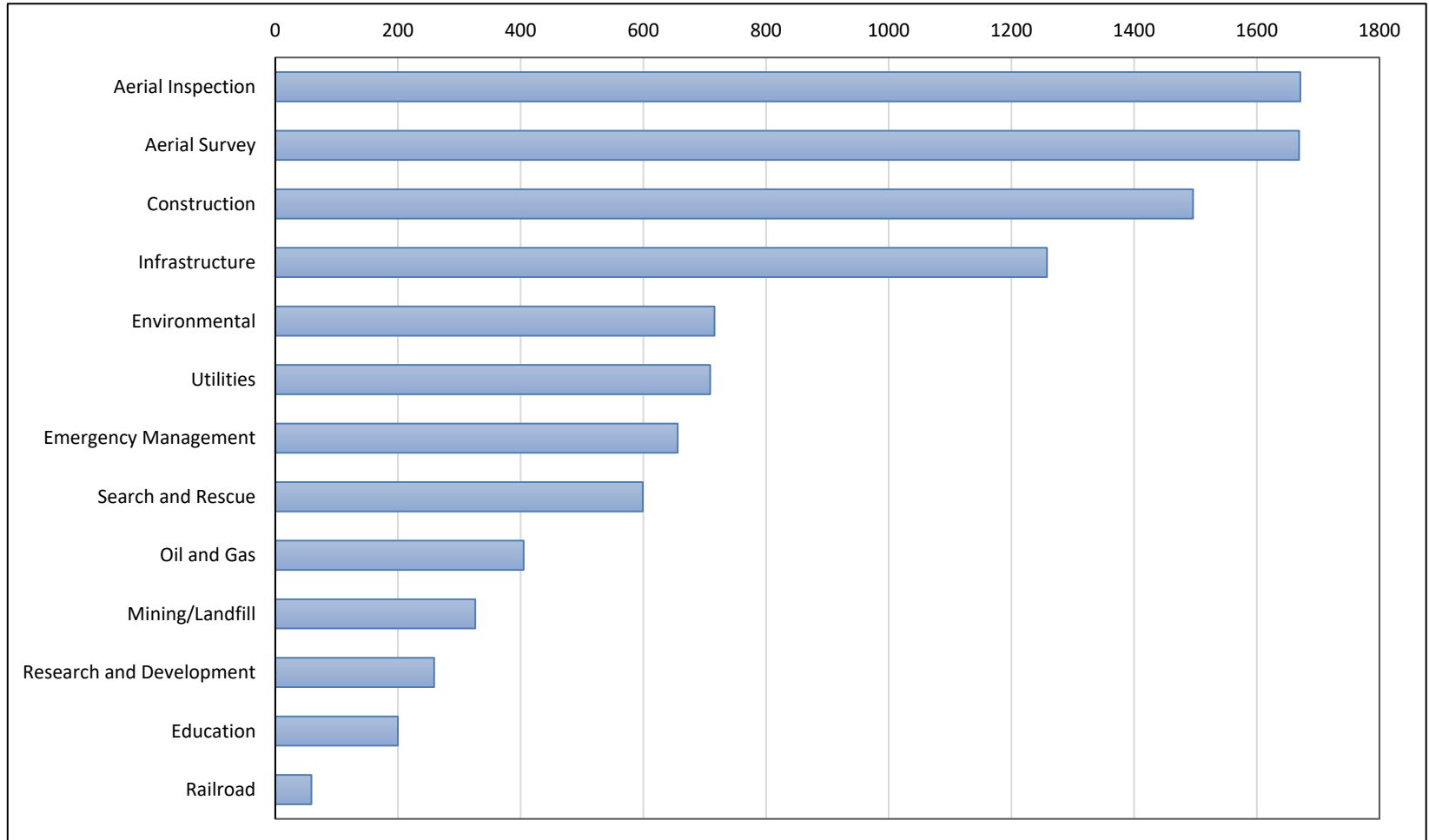


Geophysics



Laser + opt + infrared

# Imagery Collection and Construction Sequence Monitoring



**Number of civil engineering-related applications cited in FAA UAS exemption applications  
(Greenwood et al. 2019)**

# Mobility & Accessibility are key advantages of UAV-based imagery!



- November 17<sup>th</sup> 2015 Mw 6.4 Lefkada earthquake (Greece)

← November 19<sup>th</sup> 2015 (2 days later)

**UAVs allow immediate access to field data that may be otherwise inaccessible by land or satellite**

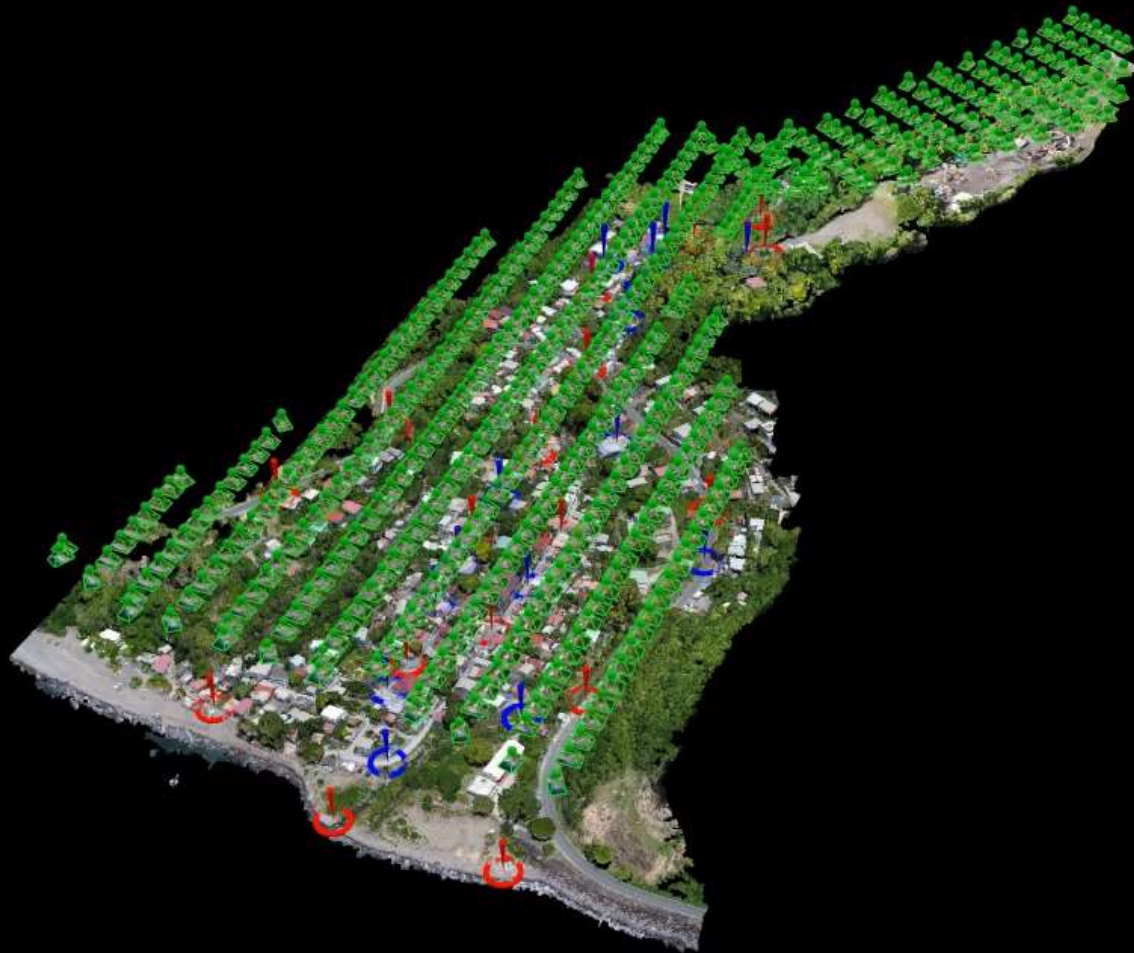


← April 12<sup>th</sup> 2016 (5 months later)



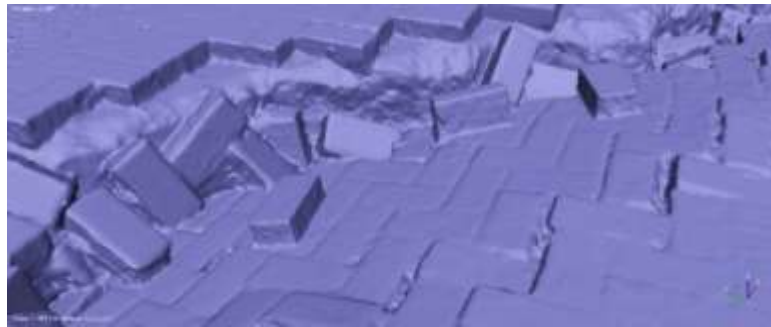
# Creation of 3D Models using Optical Cameras

- Based on Structure-from-Motion (SfM) Photogrammetry using overlapping imagery
- 3D models may be 3D point clouds, 3D Surfaces (Meshes)

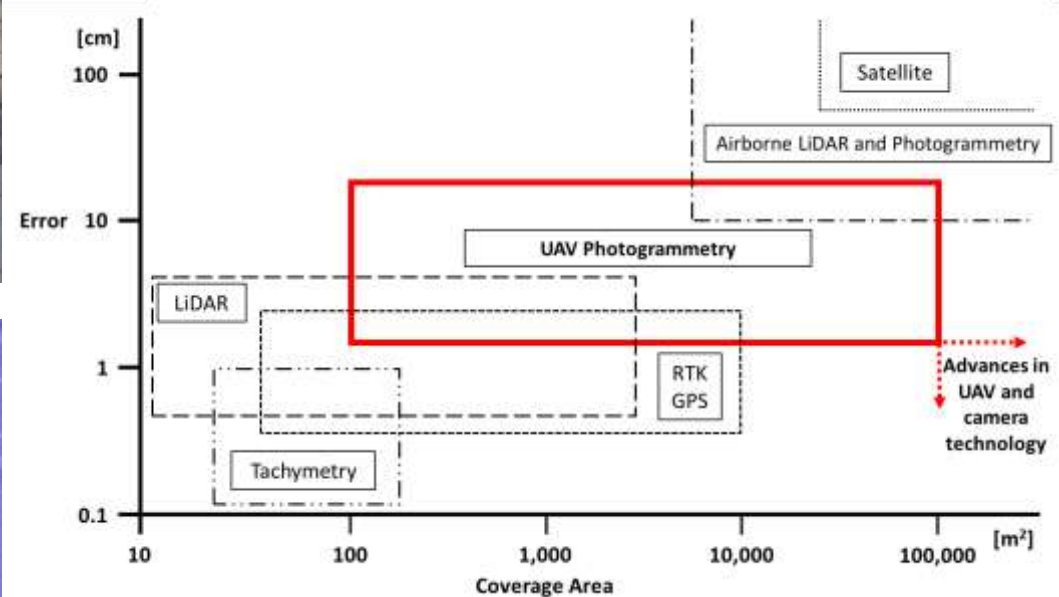


Island of Dominica, Caribbean sea

# SfM is competitive in Accurately Mapping Large Areas at High Resolution



Resolution can be really high!  
Ground Sampling Distance  
GSD: 1.13 mm/pix  
point density: 77.7 points/cm<sup>2</sup>



Extensive publication record on error/accuracy quantification

# Example Study #1:

## Remote Mapping of a Bridge Scour Failure

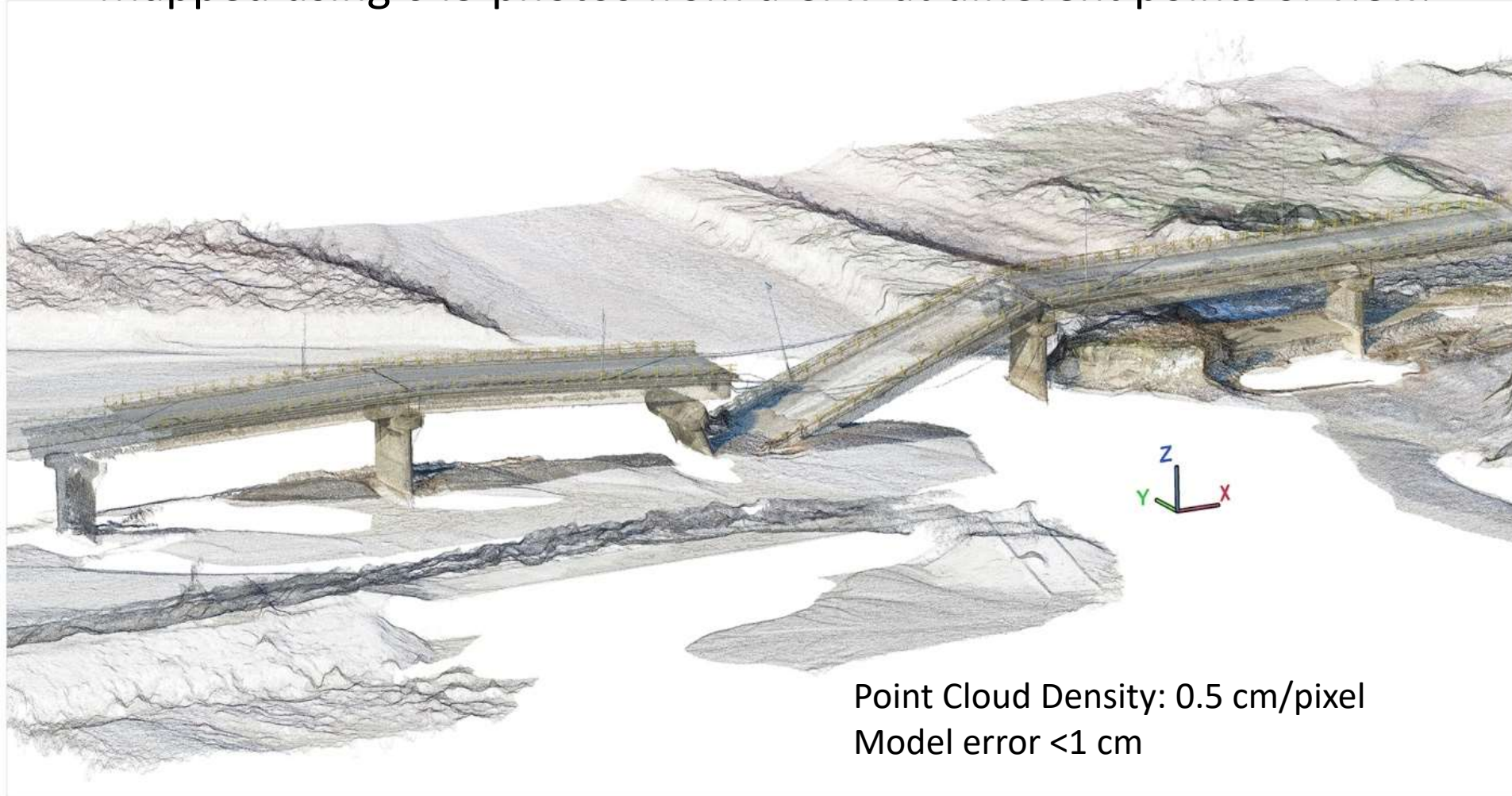
- Failure location was physically inaccessible due to river flooding & safety concerns by the owner
- 3-hr survey just 2 days after the failure. Analyzed using SfM





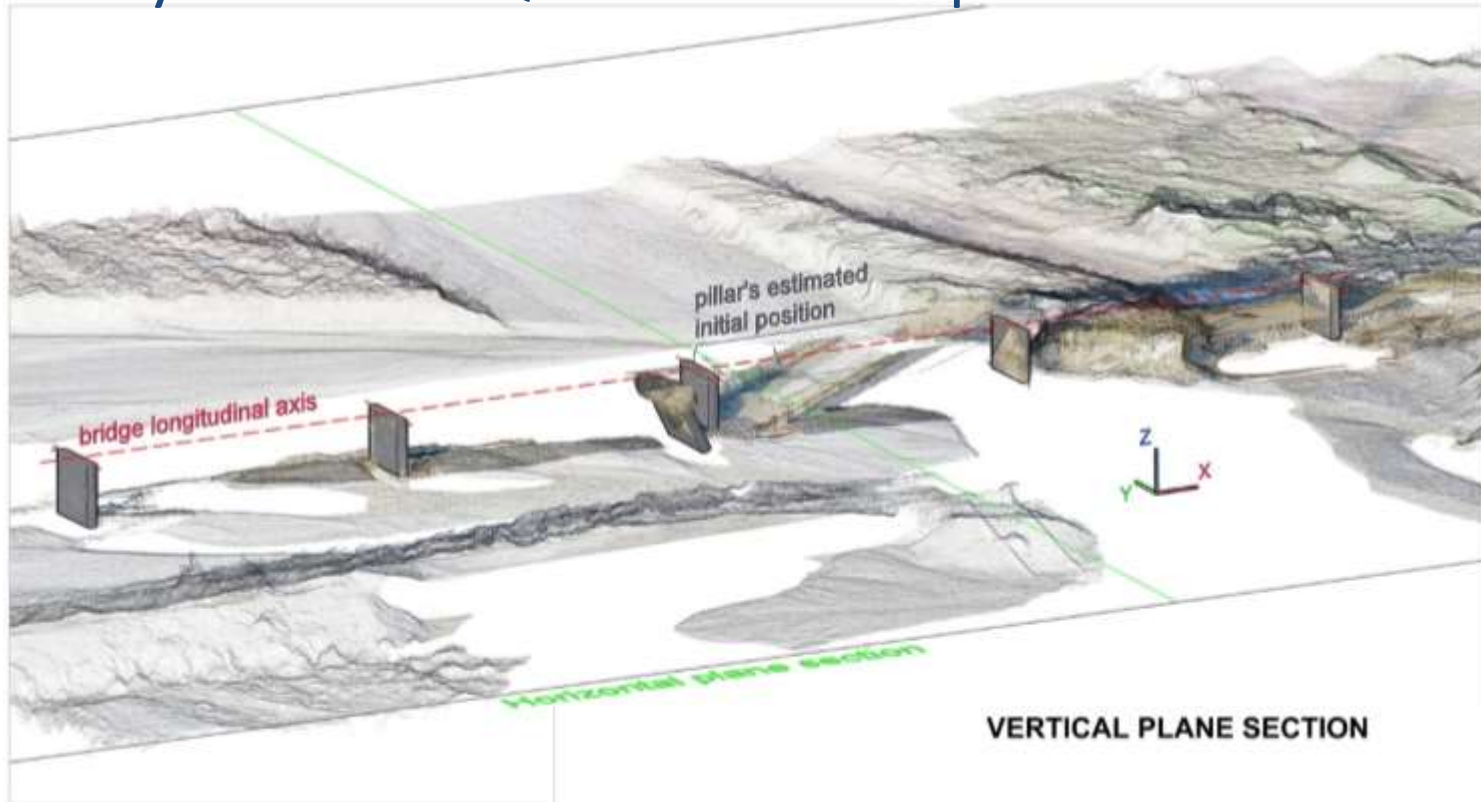
# 3D point cloud of the model

Mapped using 649 photos from a UAV at different points of view.

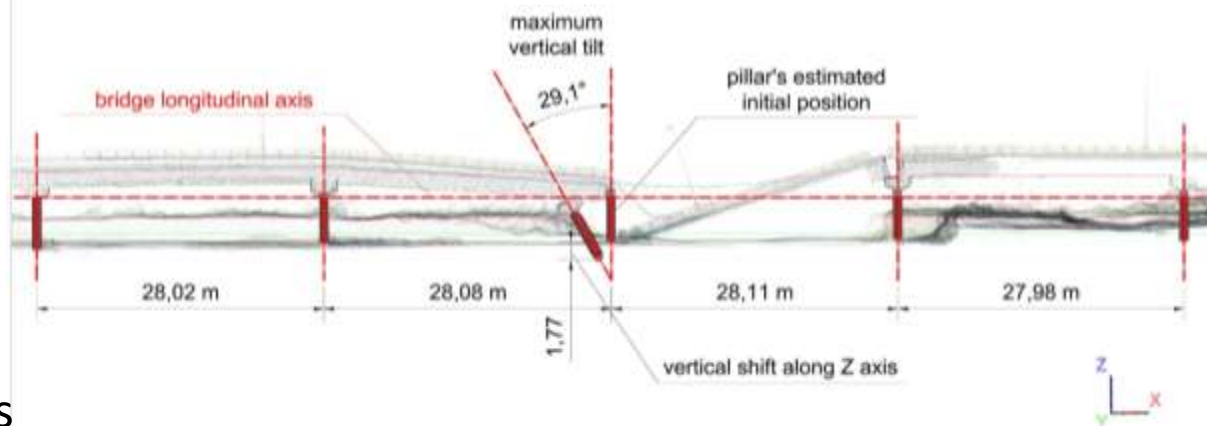


Point Cloud Density: 0.5 cm/pixel  
Model error <1 cm

# Remotely-collected Quantitative Displacement Measurements



VERTICAL PLANE SECTION



The bridge pier *displaced*:  
1.38 m along bridge axis  
0.91 m perpend. to axis  
1.77 m vertically  
The bridge pier *rotated*:  
5.7 degrees horizontally  
Vertical inclination 29.1 degrees



# Example Study #2: Cut and Fill Volume Placement Calculation

Monitoring of operations at a landfill / construction site



July 30 2019



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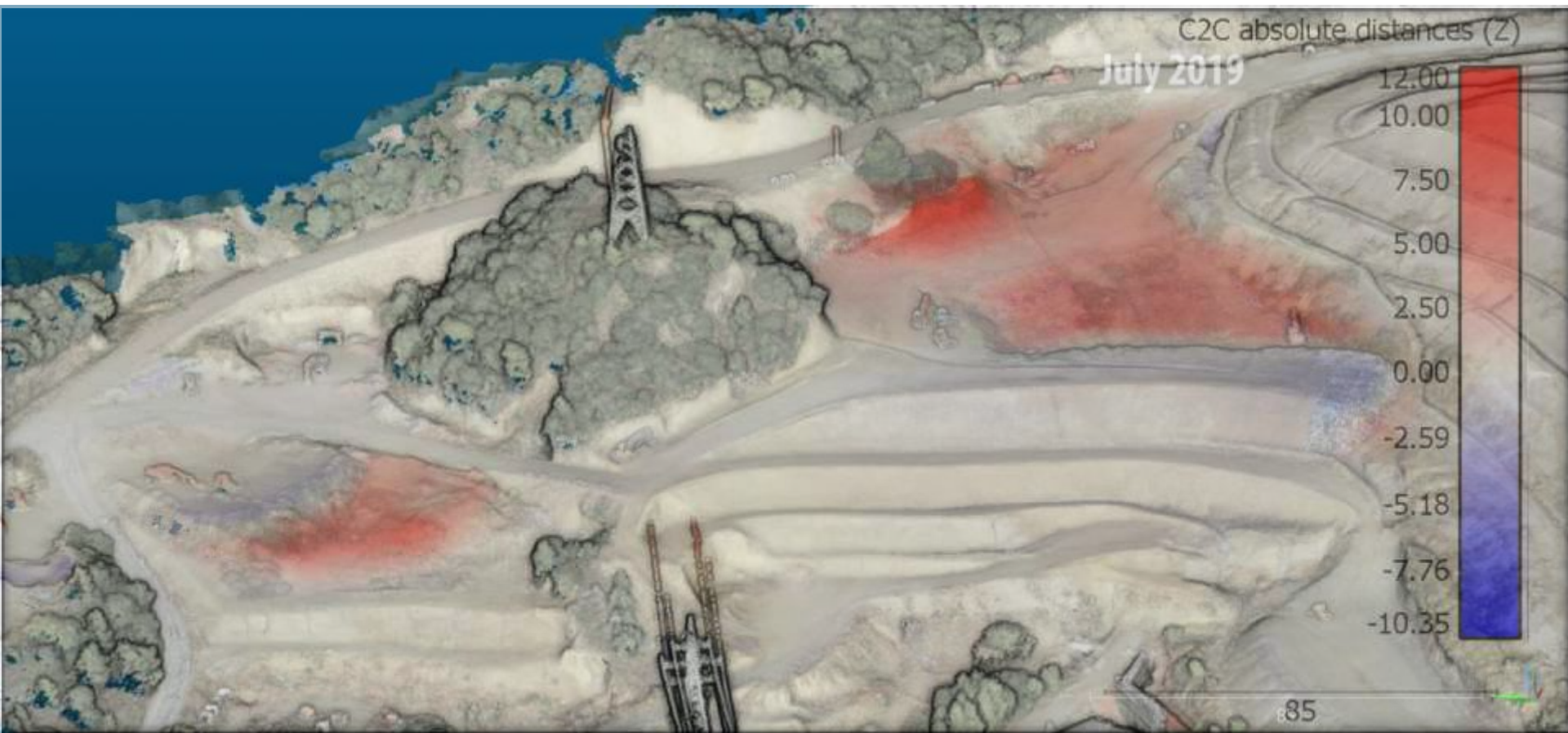
December 18 2019



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Volume of material placed between July 30 and December 18 2019: 53,200 m<sup>3</sup>

Volume of material excavated between July 30 and December 18 2019 : 8,500 m<sup>3</sup>

Height changes of a few cm can be measured



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# Example Study #3

## Instability Monitoring of Canal



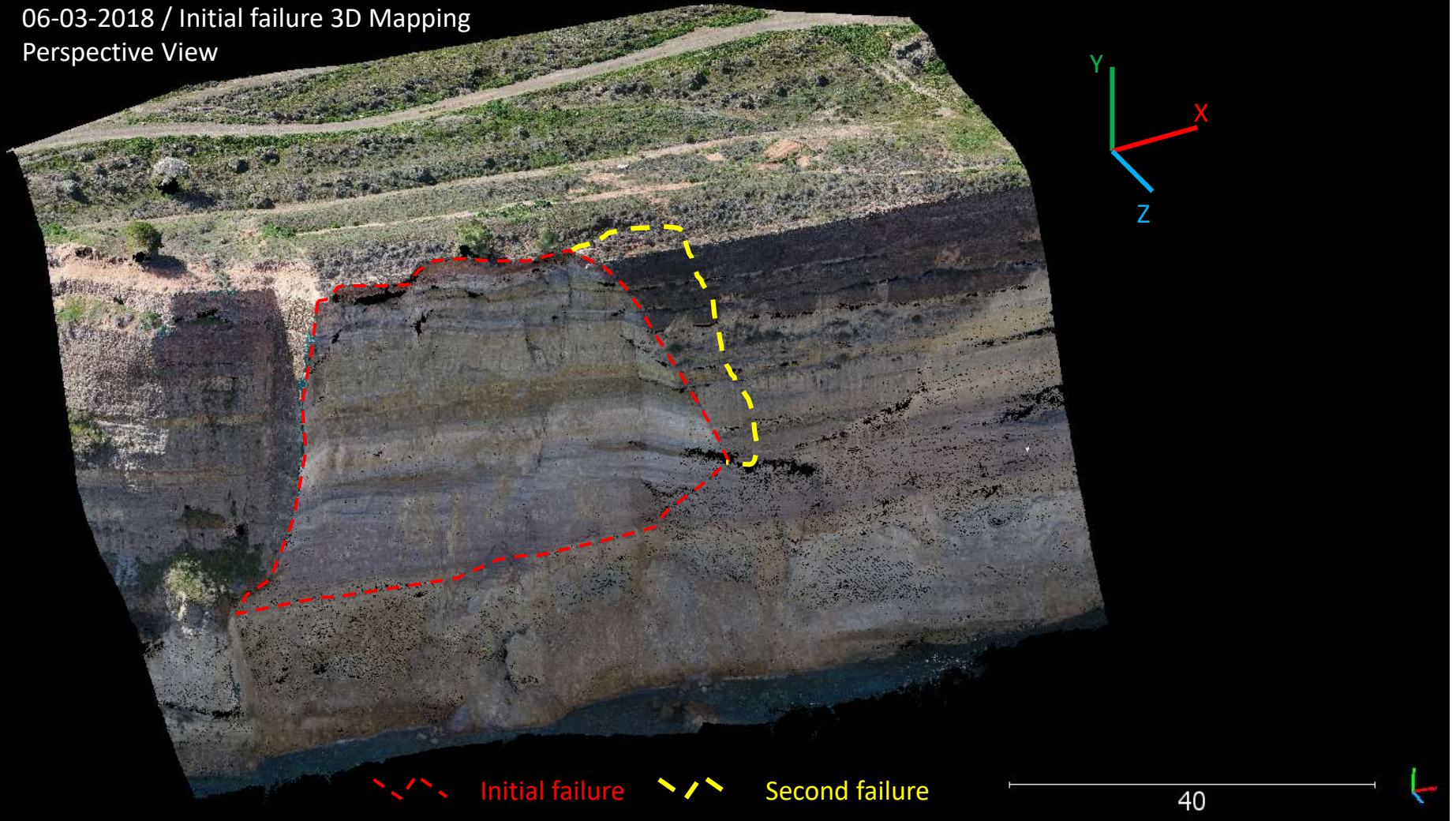
The Corinth Canal, Greece





# February 26 2018: First Failure

06-03-2018 / Initial failure 3D Mapping  
Perspective View



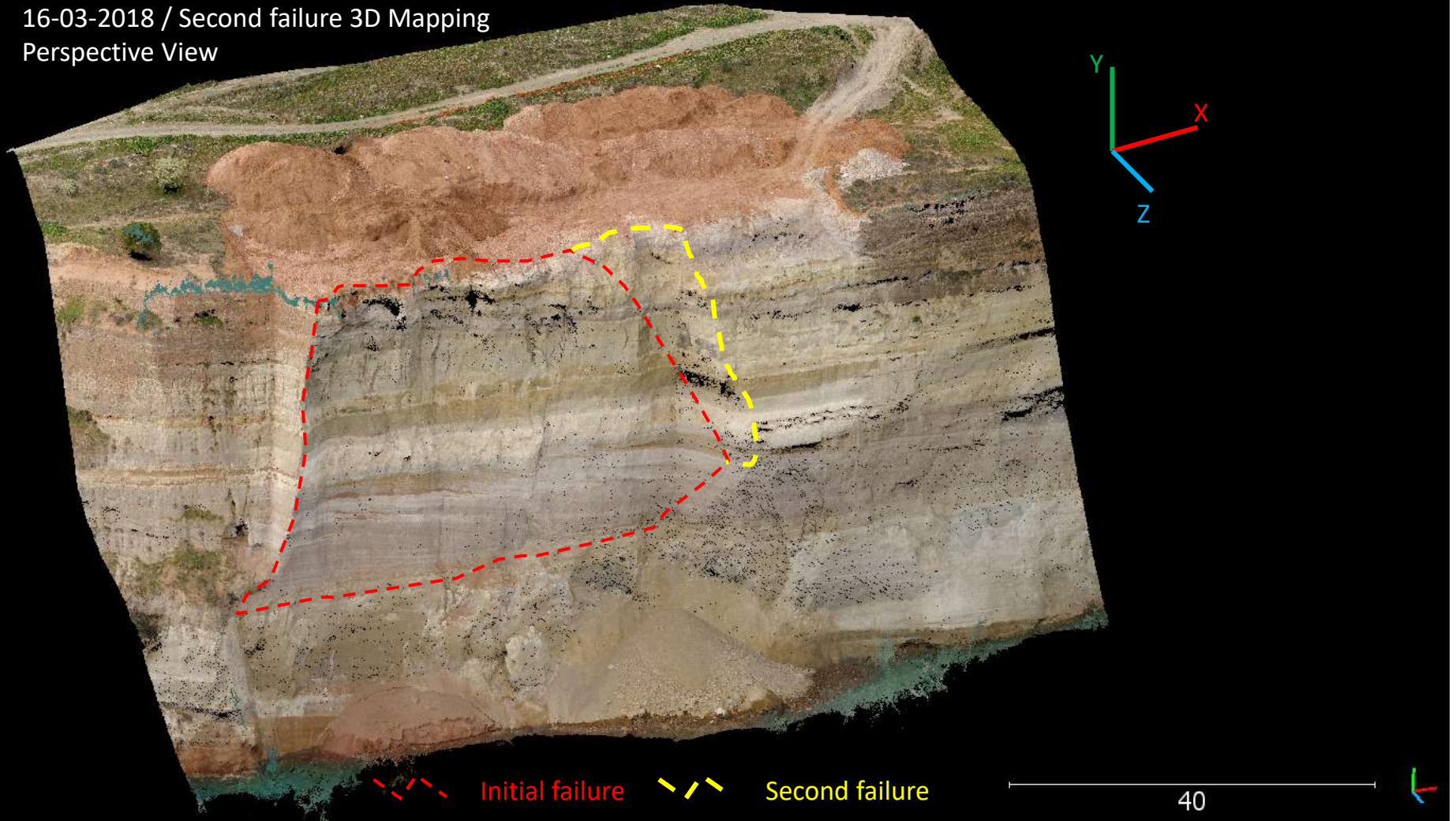
Volume Involved: 6000 m<sup>3</sup>





# March 9 2018: Second Failure

16-03-2018 / Second failure 3D Mapping  
Perspective View

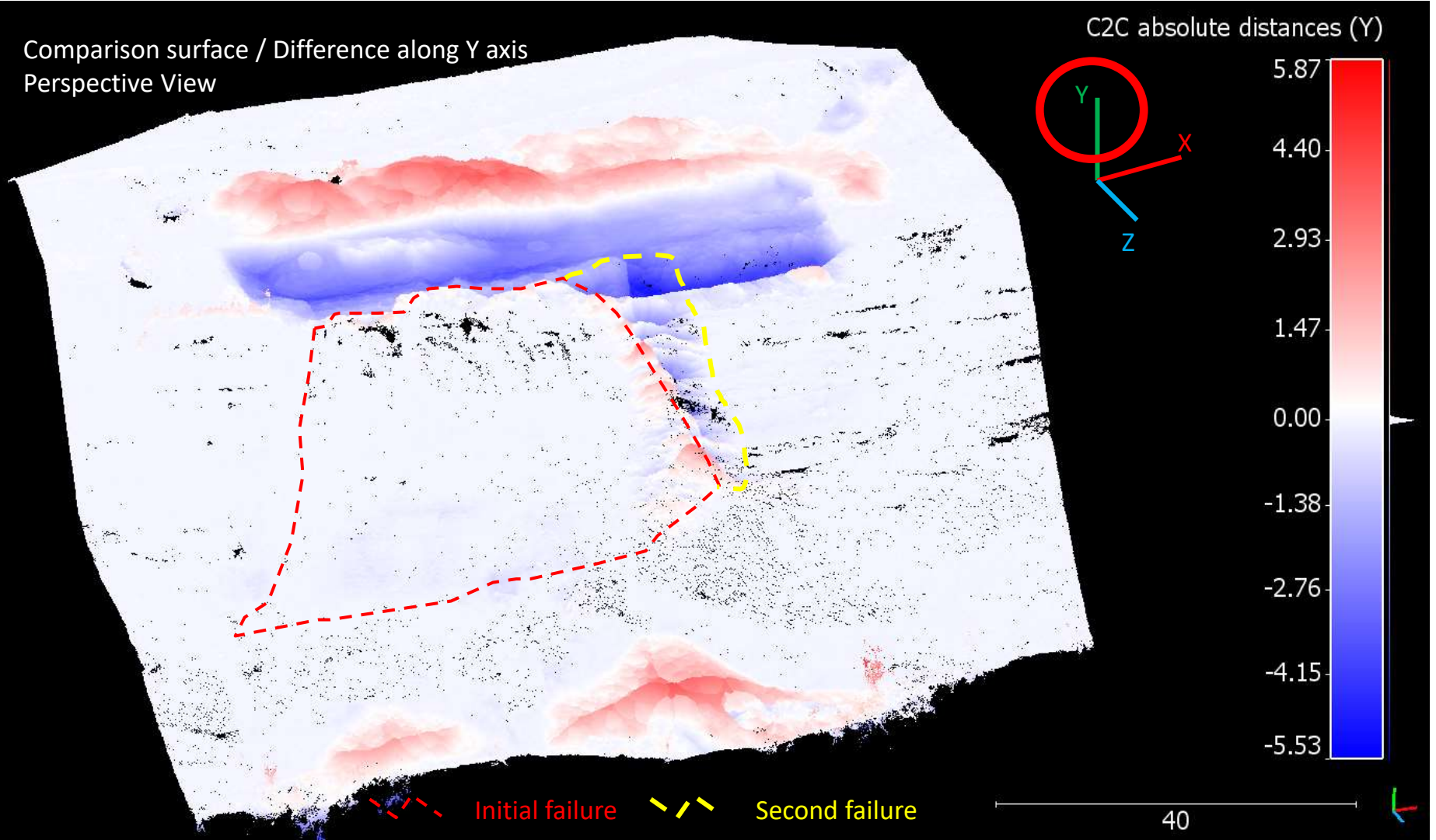


Volume Involved: 700 m<sup>3</sup>





Comparison surface / Difference along Y axis  
Perspective View

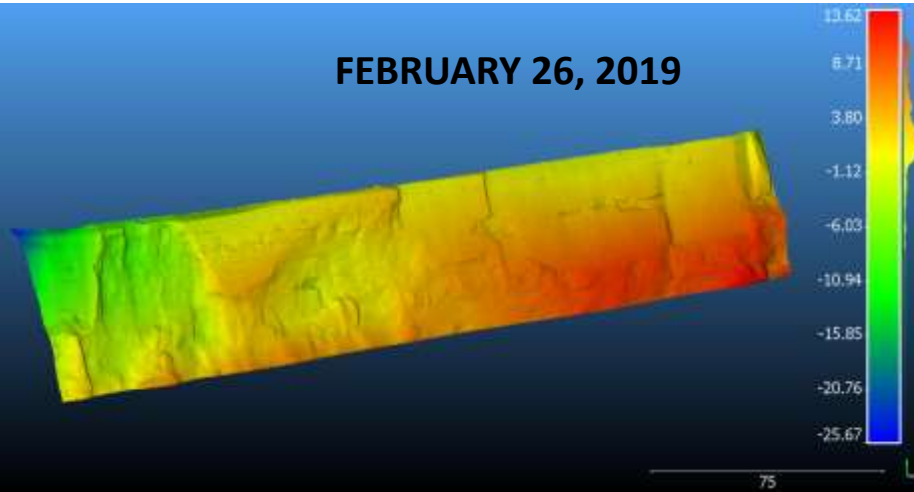


First failure: **6000 m<sup>3</sup>**. Second failure: **700 m<sup>3</sup>**



# SLOPE MONITORING

**FEBRUARY 26, 2019**



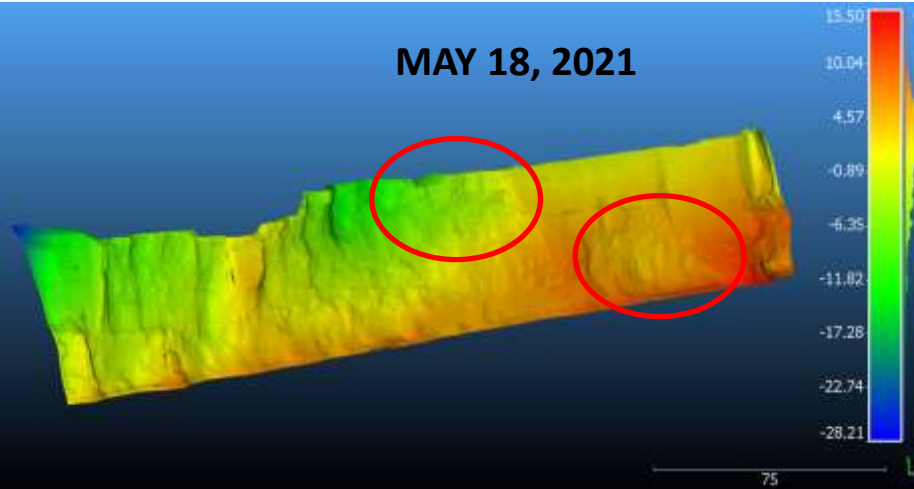
**MARCH 9, 2019**



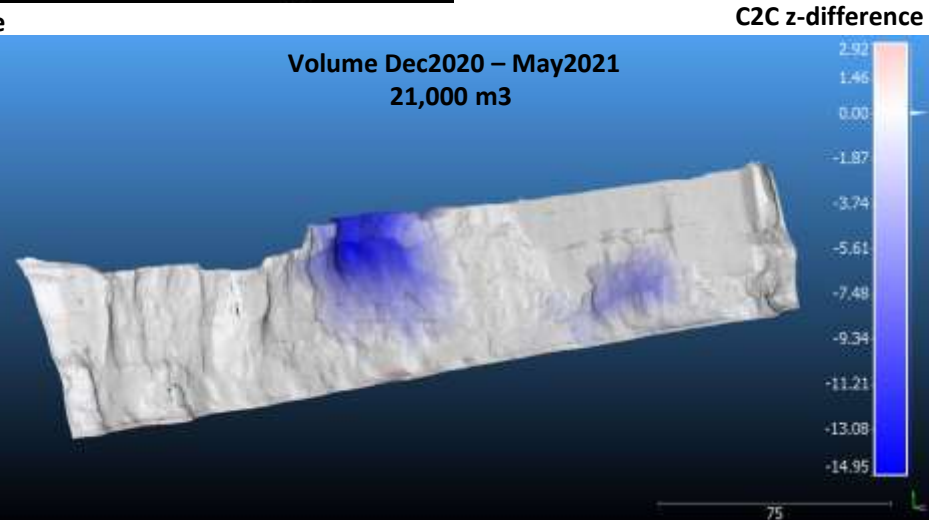
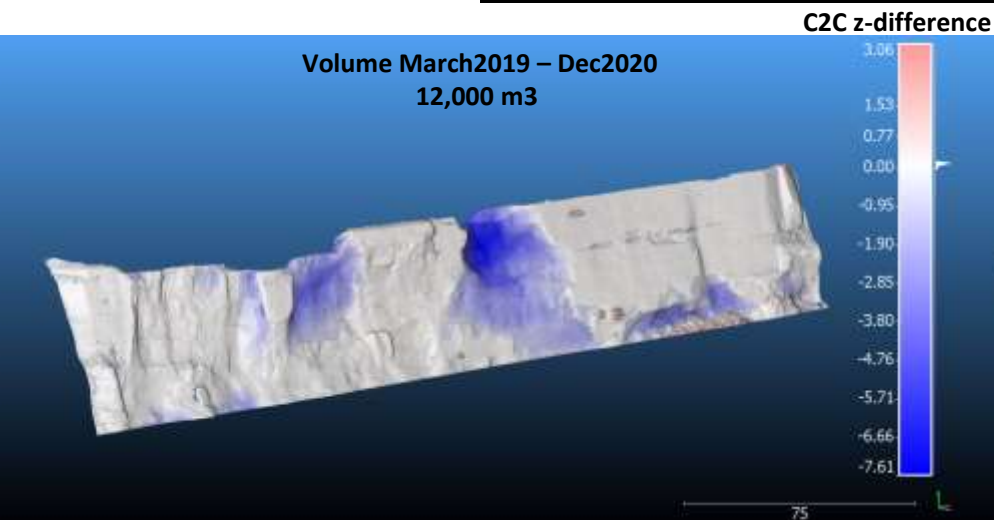
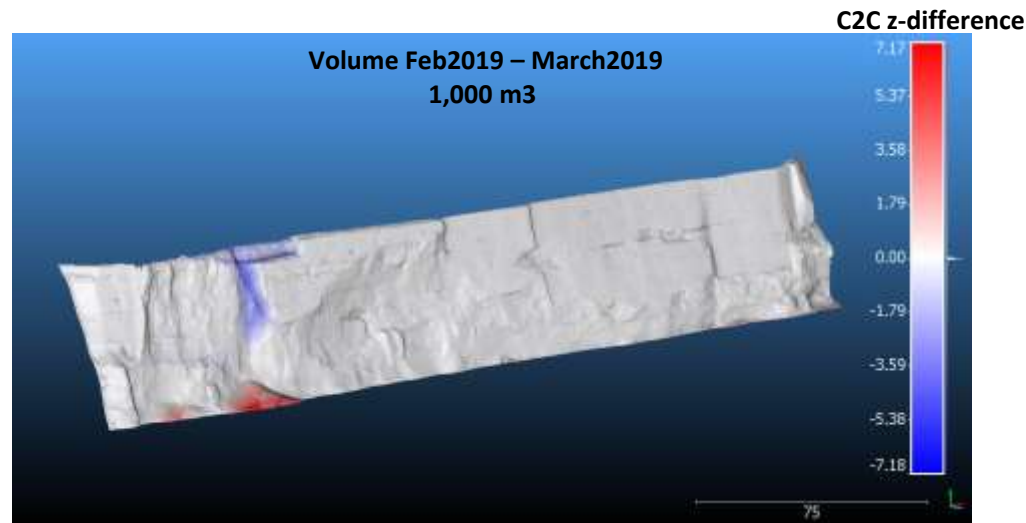
**DECEMBER 8, 2020**



**MAY 18, 2021**



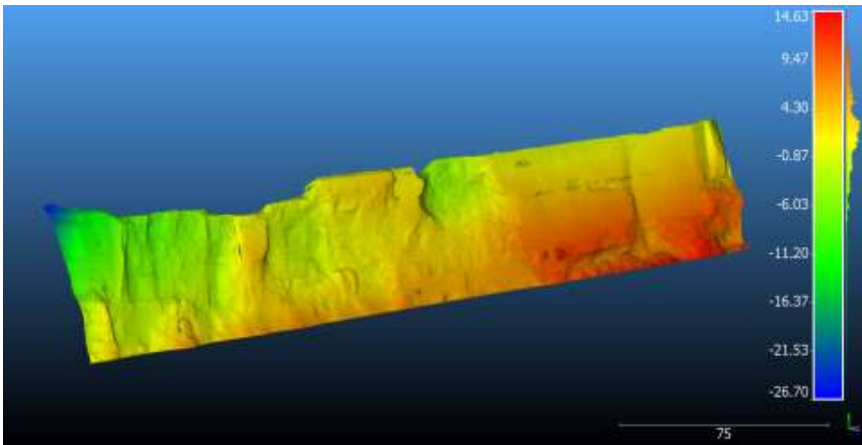
# VOLUME CALCULATION



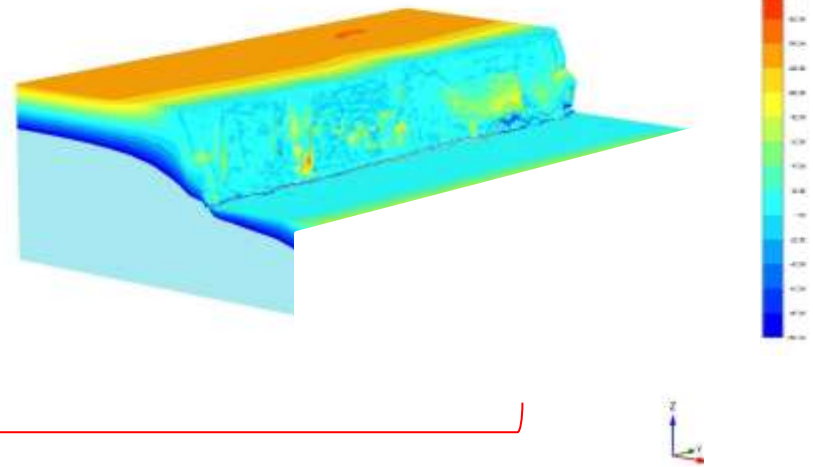


# Monitoring paired with Numerical Modeling Leads to Predictive Capabilities

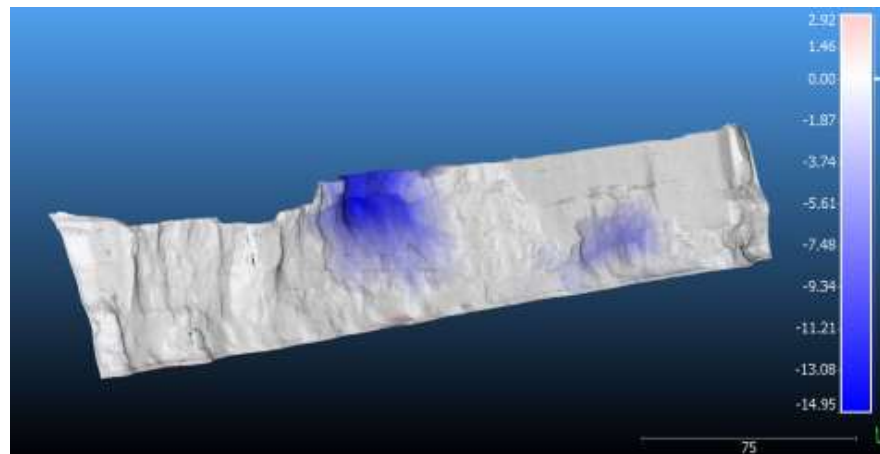
3D GEOMETRY ON DECEMBER 8, 2020



FINITE ELEMENT MODEL SIMULATION FOR STRESS CONCENTRATIONS



SLOPE RETREAT BY MAY 18 2021



# Infrastructure 3D Modeling by our Research Group



**Historical Structures**



**Cliffs / Cuts**



**Structural Damage**



**Retaining Walls**



**Canals**



**Quarries**



**Bridge Collapse**



**Ports**



**Landfills**



**Roadway Embankments**



**Dams & Levees**



**Landslides**



**Railroad**



**Rockfall**



**Airports**



**Rock masses**

# Community-Level Infrastructure Assessment Frameworks using Digital Twins

Data collected allows transition from infrastructure component to infrastructure system

*Vrisa village, 12<sup>th</sup> June 2017  $M_w$  6.3 Lesvos earthquake, a week after the earthquake*

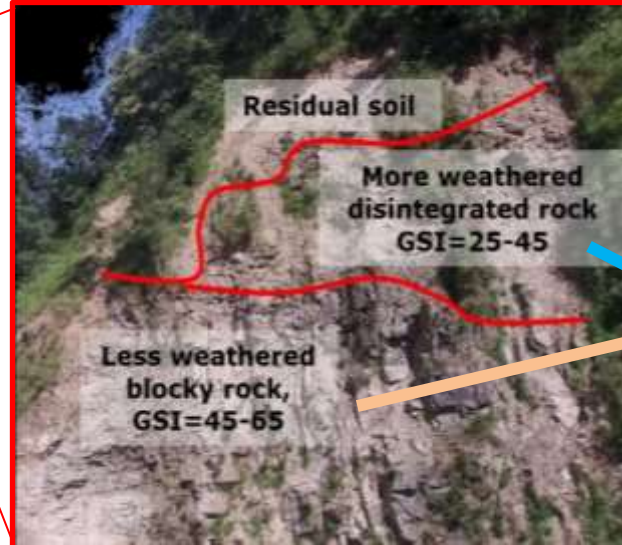
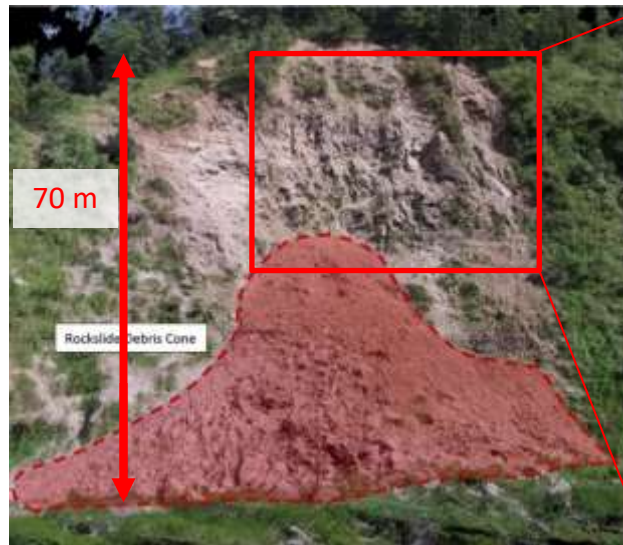




# Enhancing Team and Client **Collaboration & Communication** of Engineering Results using Virtual Reality and Augmented Reality



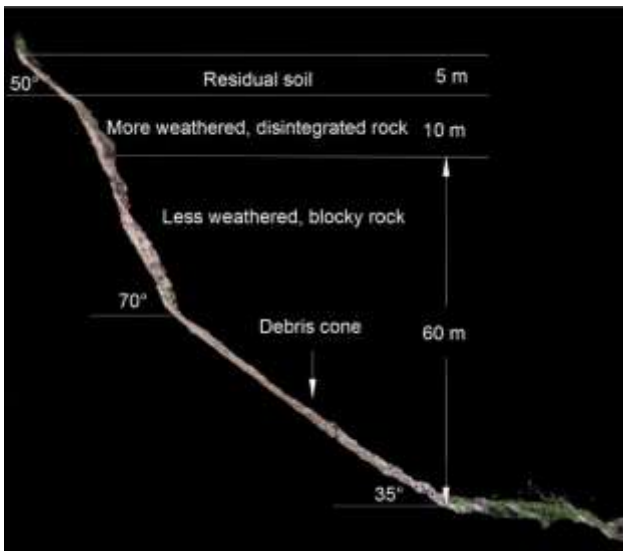
# Example 4: “Conventional” Rock Mass & Landslide Characterization



**Geological Strength Index**  
Weathering condition of  
DISCONTINUITIES  
good → bad

	90	80	70	60	50	40	30	20	10
INTACT OR MASSIVE - intact rock specimens or massive in situ rock with few widely spaced discontinuities								N/A	N/A
BLOCKY - well interlocked undisturbed rock mass consisting of cubical blocks formed by three intersecting discontinuity sets									
VERY BLOCKY - well interlocked, partially disturbed mass with well faceted angular blocks formed by 4 or more joint sets									
BLOCKY/DISTURBED/SEAMY - folded with angular blocks formed by many intersecting discontinuity sets. Persistence of bedding planes or schistosity									
DISINTEGRATED - poorly interlocked, heavily broken rock mass with mixture of angular and rounded rock pieces									
LAMINATED/SHEARED - Lack of blockiness due to close spacing of weak schistosity or shear planes									

(Hoek et al. 2002)



Using 3D Digital Imagery Attributes, derive rock mass characteristics, e.g.,

- Rock mass structure
- Rock mass weathering
- Rock mass strength

Zekkos, D., Clark, M., Whitworth, M., Greenwood, W., West, A. J., Roback, K., ... & Lynch, J. (2017). Observations of landslides caused by the April 2015 Gorkha, Nepal, earthquake based on land, UAV, and satellite reconnaissance. *Earthquake Spectra*, 33(1\_suppl), 95-114.

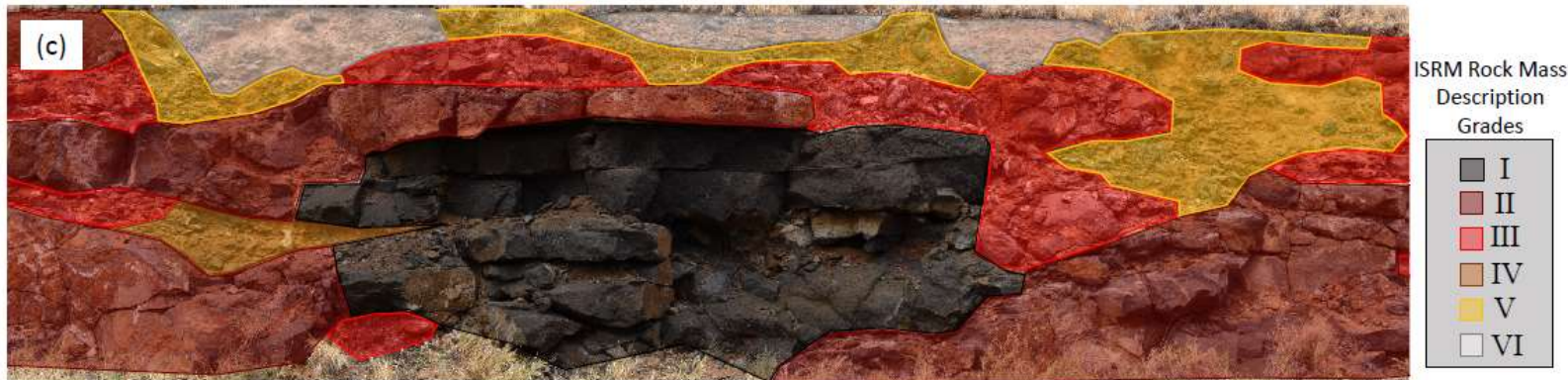


# AI-based Digital “Image” Analyses of Rockmass 3D Model – Roadcut in Hawaii

3D Model



Manual  
Field  
Characterization



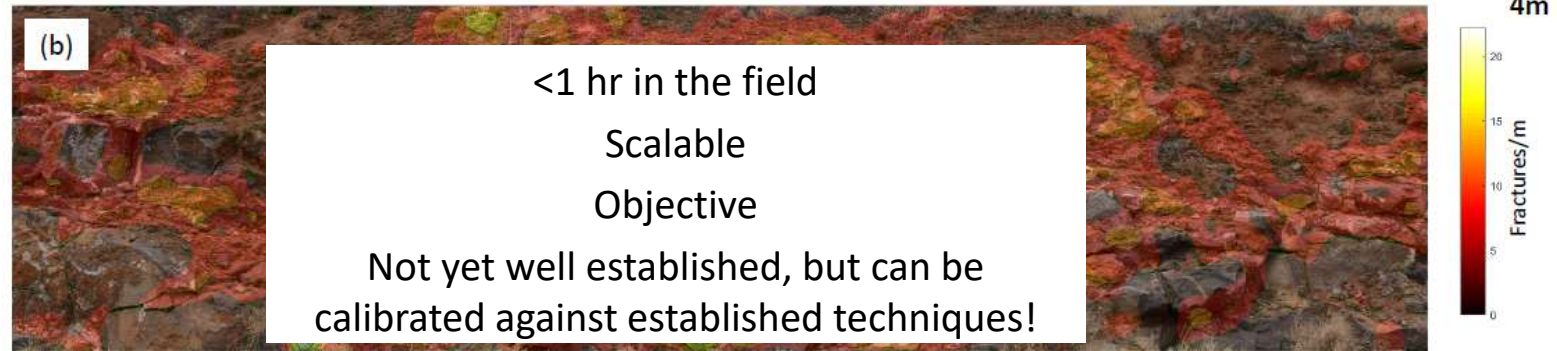


# AI-based Digital “Image” Analyses of Rockmass 3D Model of Roadcut in Hawaii

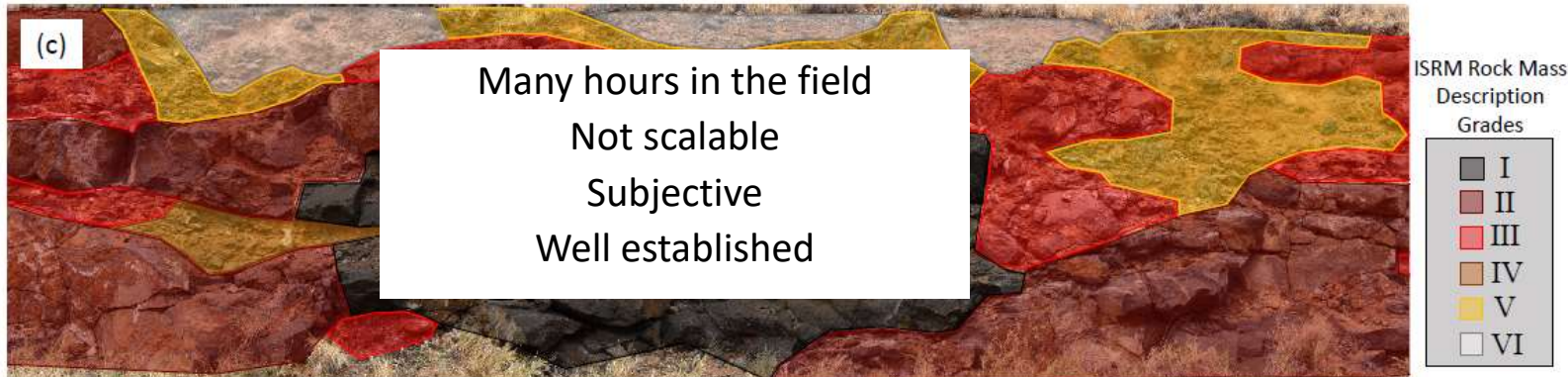
3D Model



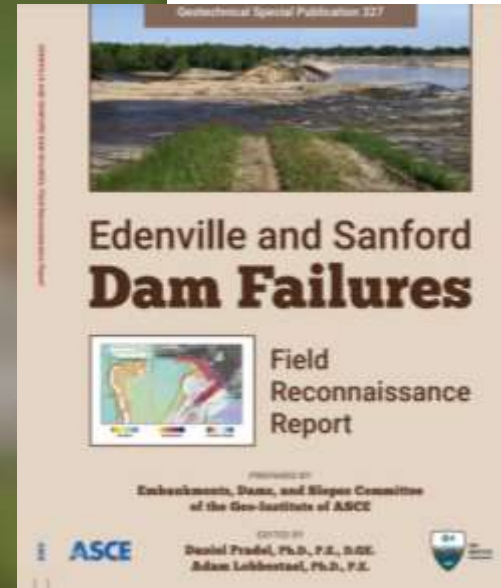
AI-based  
Fracture  
Detection



Manual  
Field  
Characterization



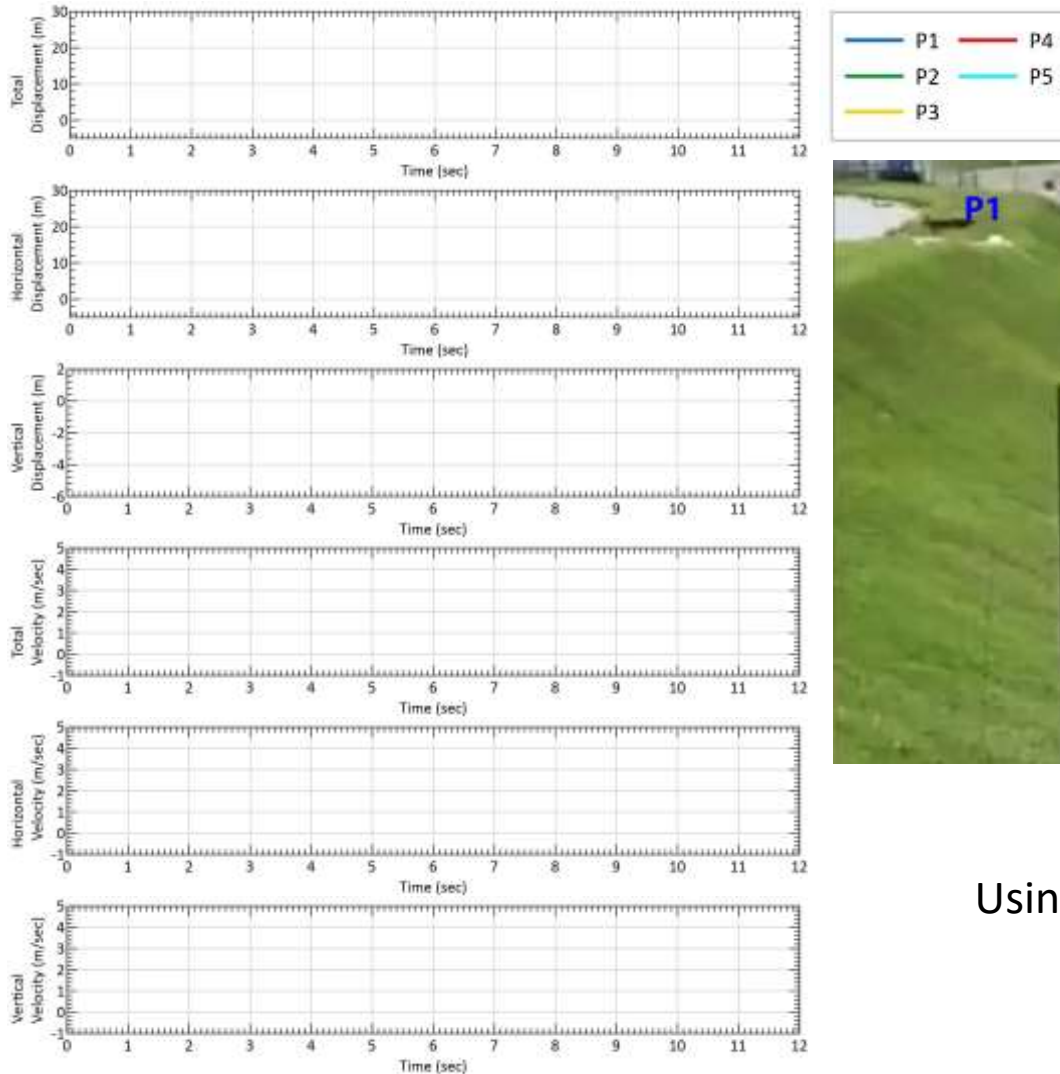
# Example 5: UAV-enabled optical and infrared imagery fusion at Edenville Dam following May 19 2020 Failure



- Failure captured by by-stander
- Edenville Failure caused failure of Sanford dam and flooding to communities downstream



# Forensic Investigation of the Kinematics Based on Digital Image Analysis



Using Image Stabilization algorithms and Pixel tracking algorithms



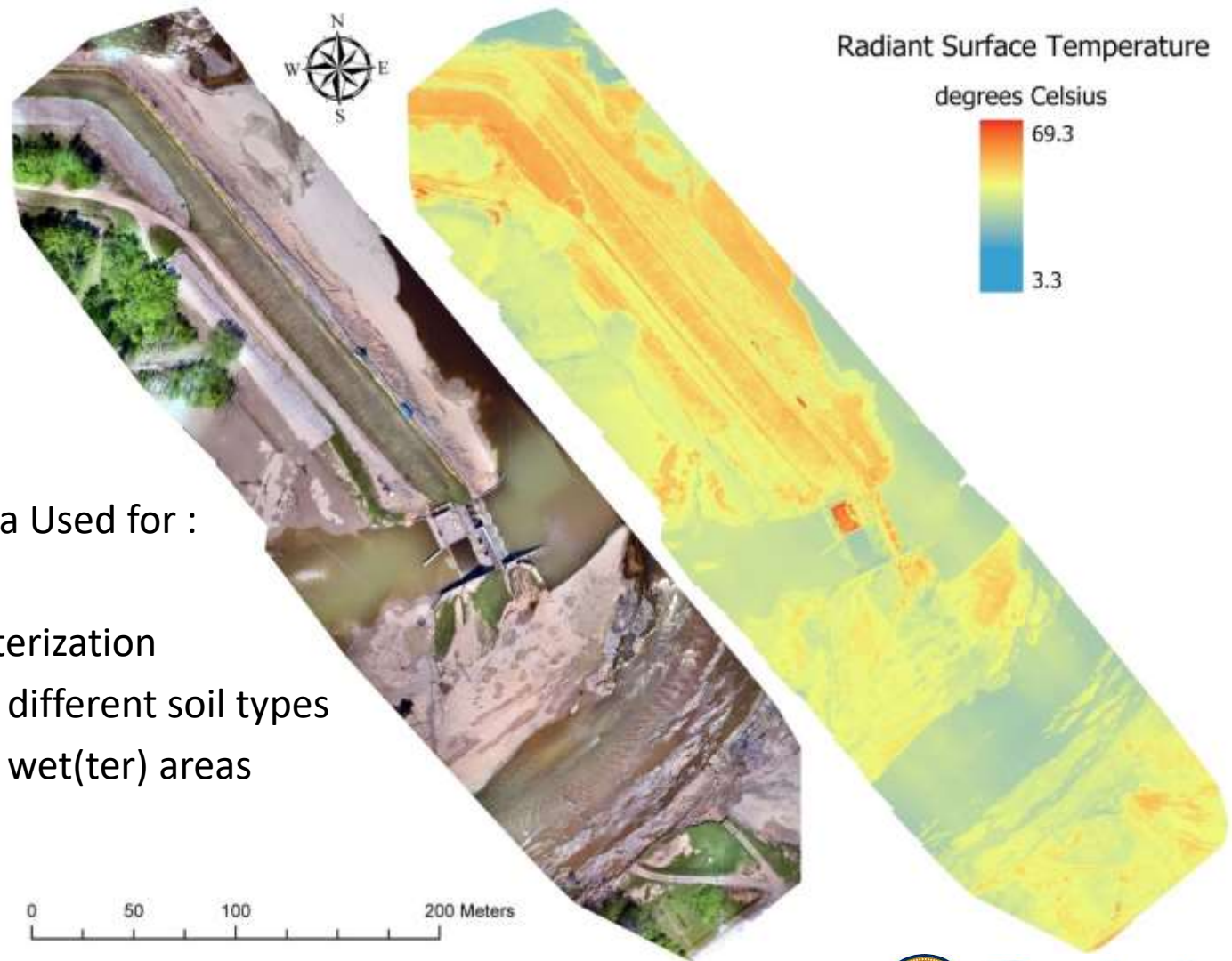
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## 3D Model from Optical Data



# Optical and Infrared 3D Models of Edenville Dam



Optical and Infrared Data Used for :

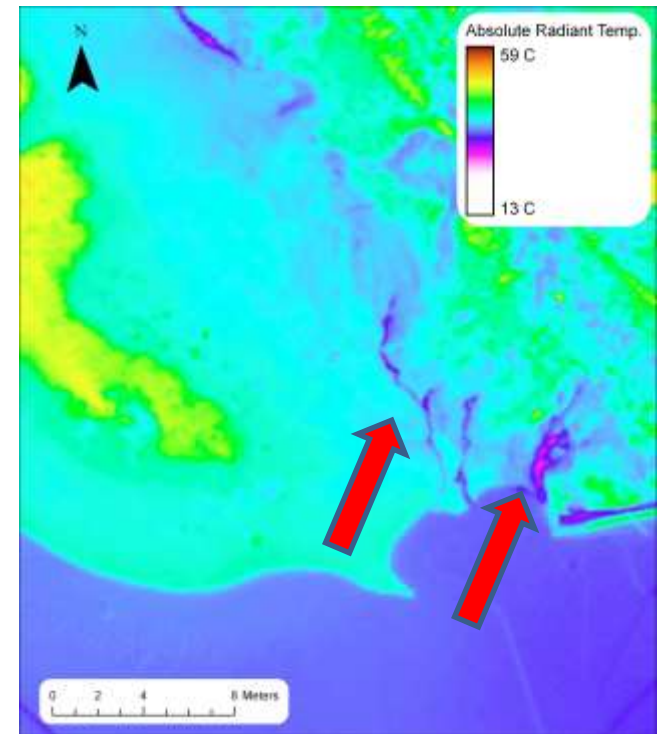
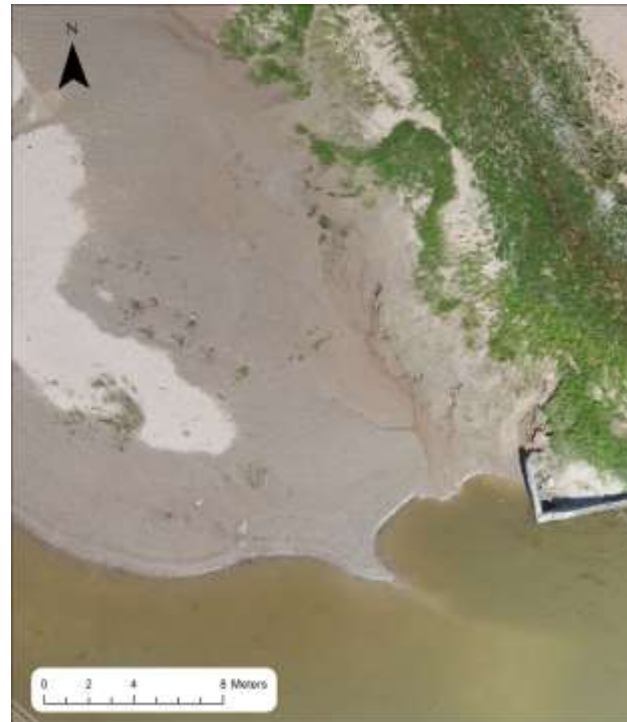
- 3D modeling
- Material characterization
- Identification of different soil types
- Identification of wet(ter) areas





# Infrared-based Identification of wet areas and seepage

Seepage is discerned as areas of lower temperature



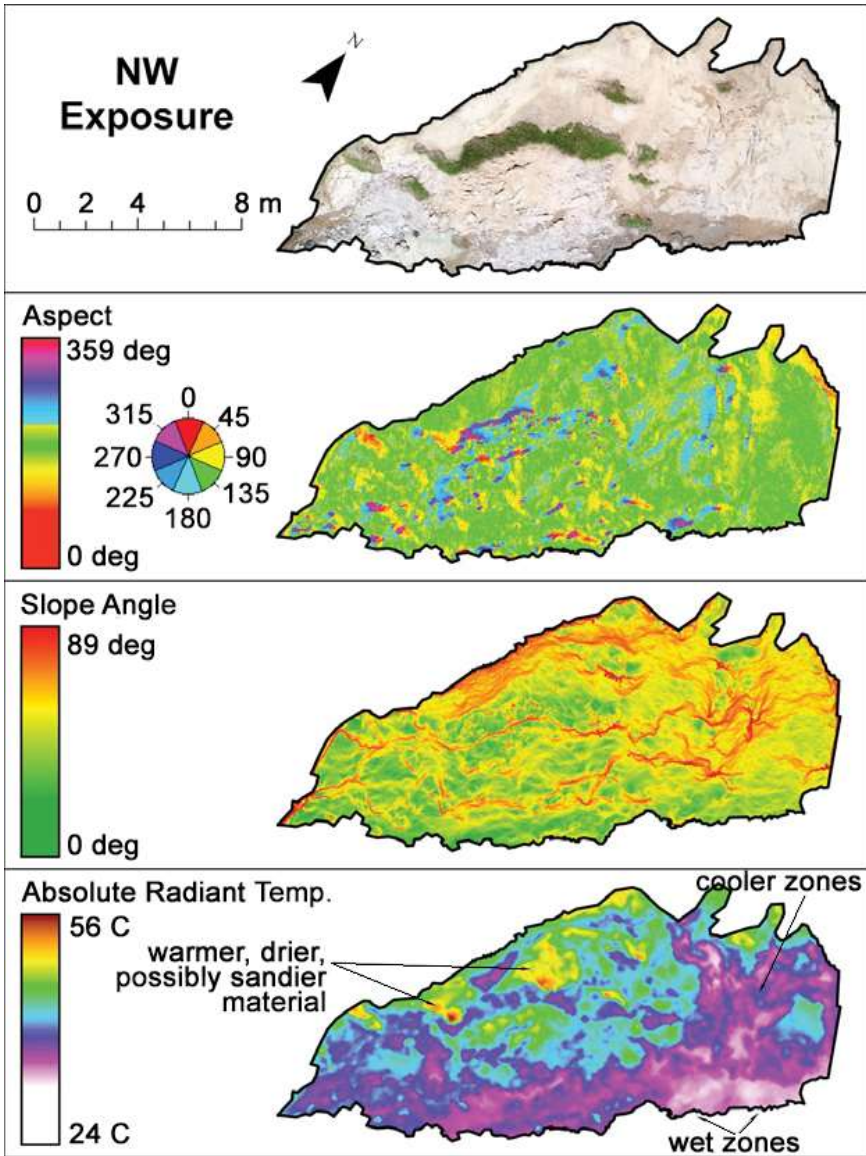
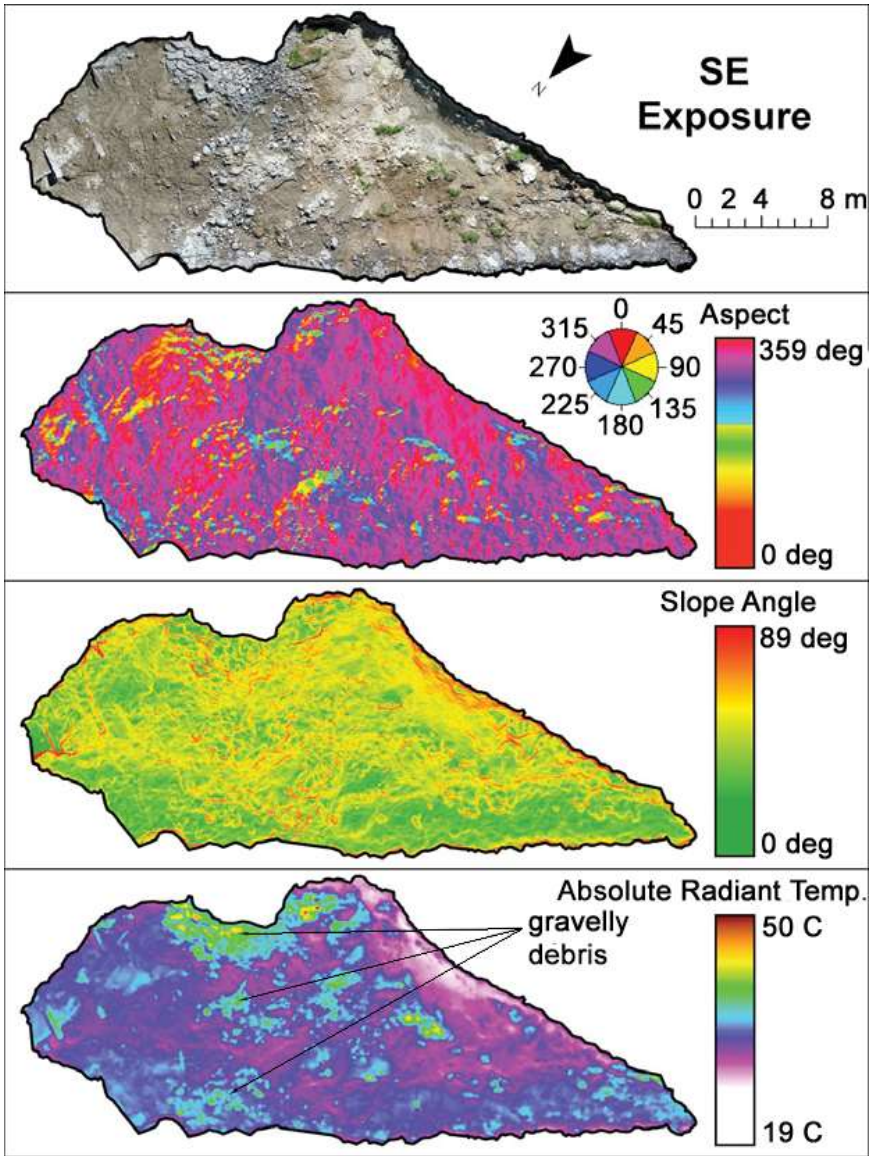
Even quantitative spatial estimates of moisture content are possible

Zekkos, D., Champagne, C., Lynch, J., Manousakis, J., & Athanasopoulos-Zekkos, A. UAV-Enabled Coupled Infrared and Optical Characterization of the May 19, 2020, Edenville Dam Failure in Michigan. In *Geo-Congress 2022* (pp. 119-128).



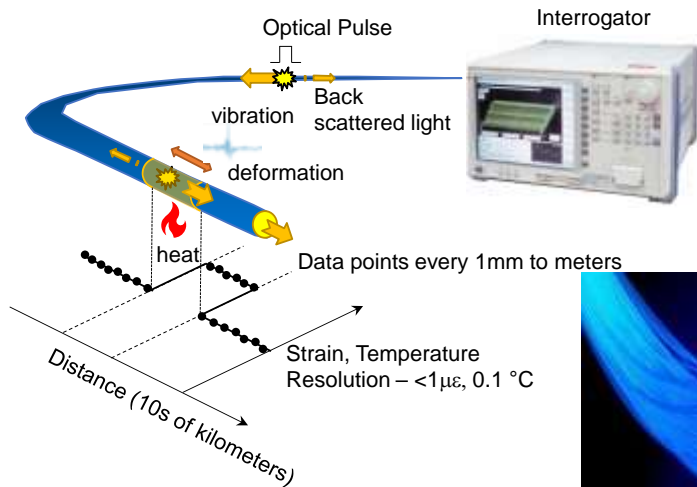
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# AI-based characterization of soil type and moisture content using Optical and Infrared Data



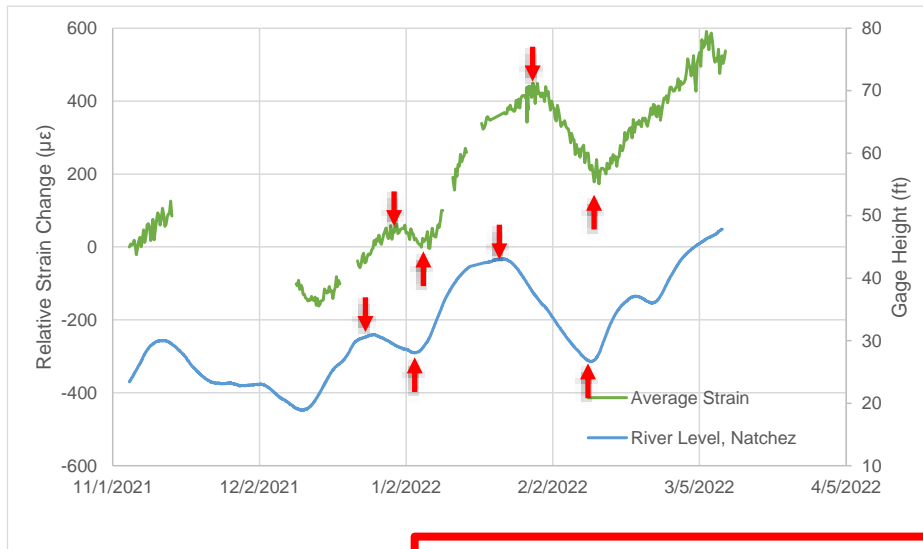


# Continuous Levee Monitoring using Fiber Optics

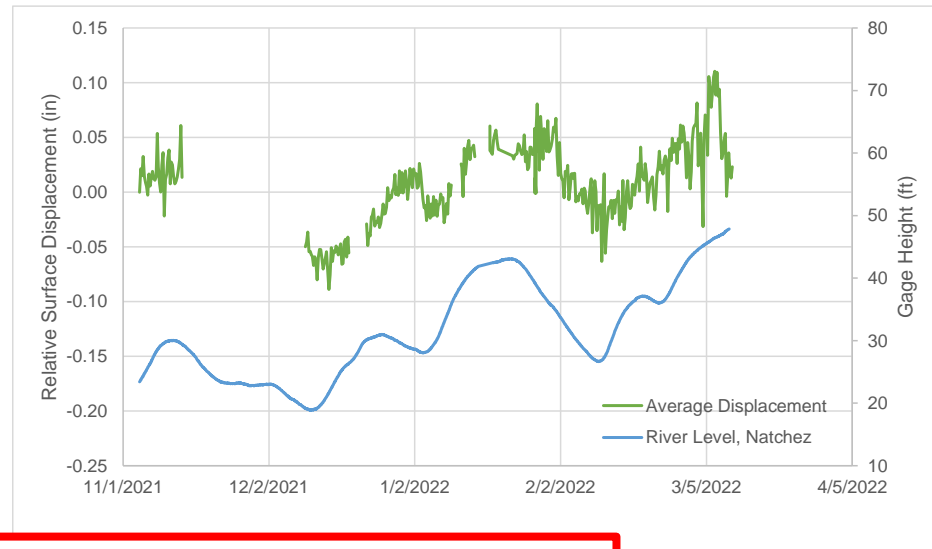


Kenichi Soga

Maximum strain versus time



Surface displacement versus time



Monitoring the heartbeat of the levee?

# AI-based Health Assessment of Landfills

Approach used in landfills for:

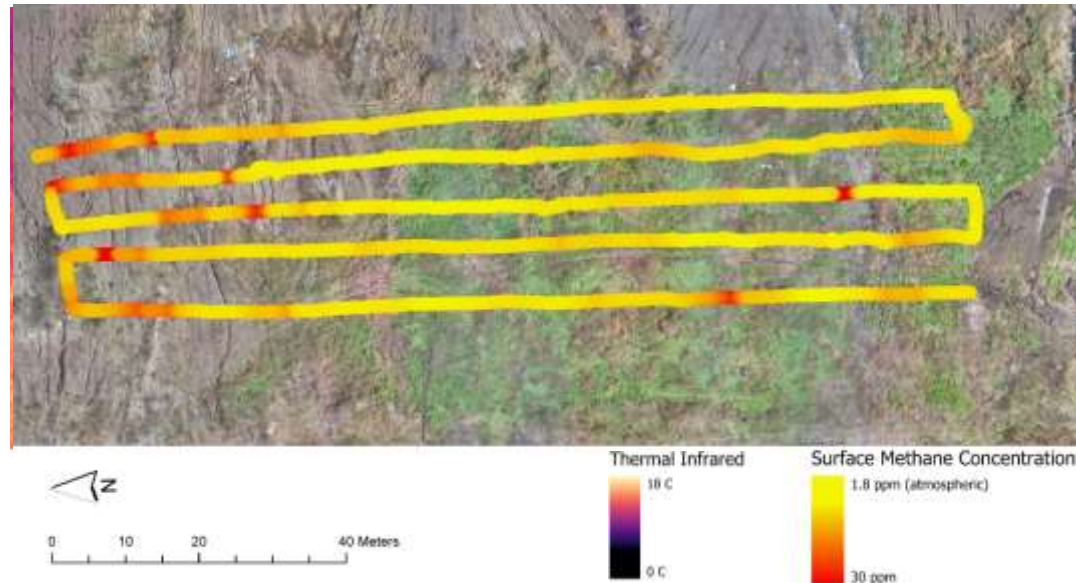
- Finding thermal “hotspots”
- Classifying soil materials
- Methane leaks
- Ground cracks

**Infrared camera**

**Optical camera**



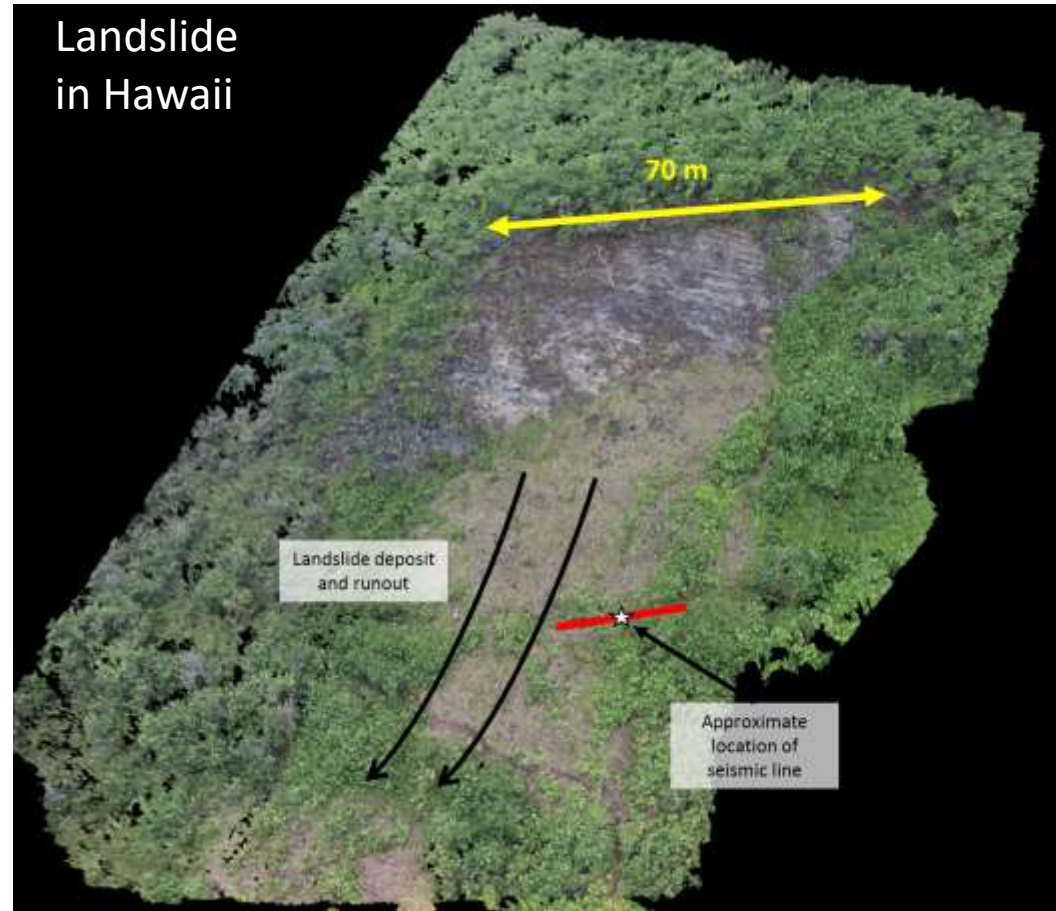
**Tunable Diode Laser**



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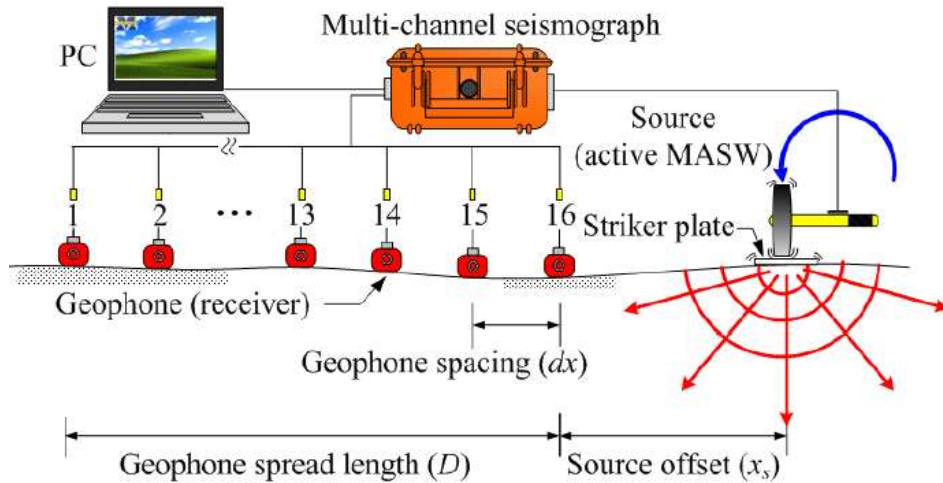


# Example #6: Fully Autonomous UAV Subsurface Characterization using Seismic Geophysics



Fully autonomous UAV subsurface characterization will allow measurements in dangerous, remote sites and at reduced cost

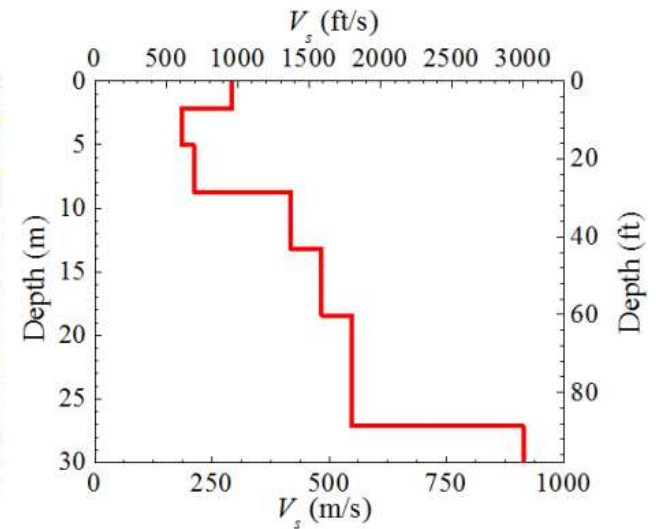
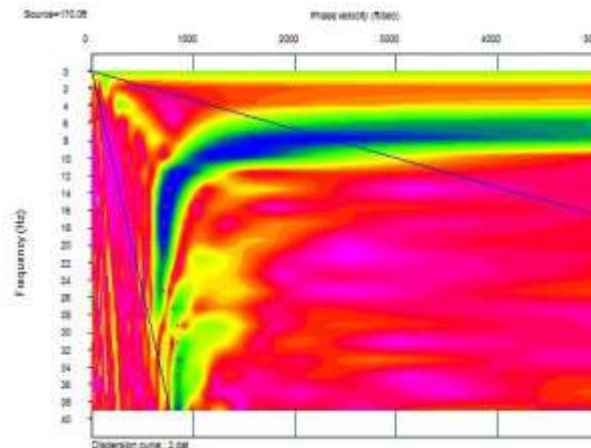
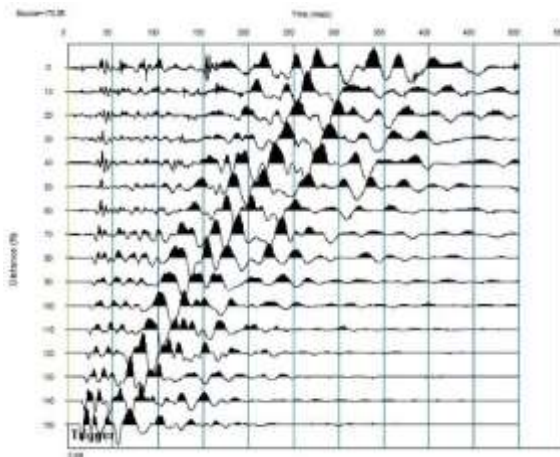
# Multichannel Analysis of Surface Waves Analysis



Data  
Collection

Dispersion  
Analysis

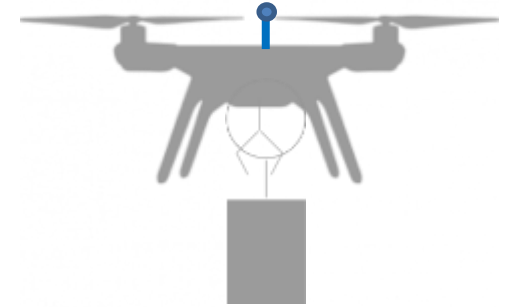
Inversion





# Fully autonomous Seismic Surface Wave Measurements

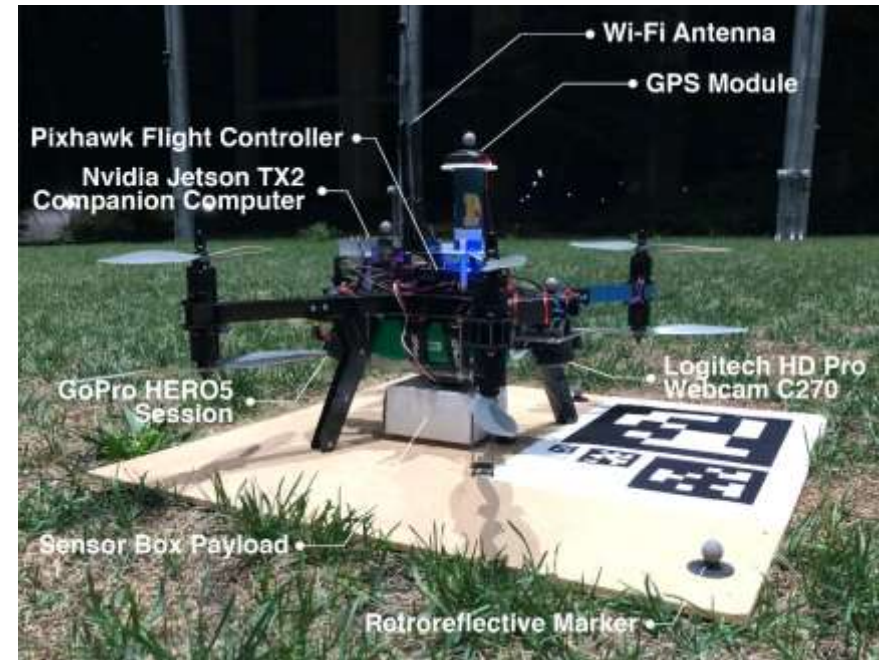
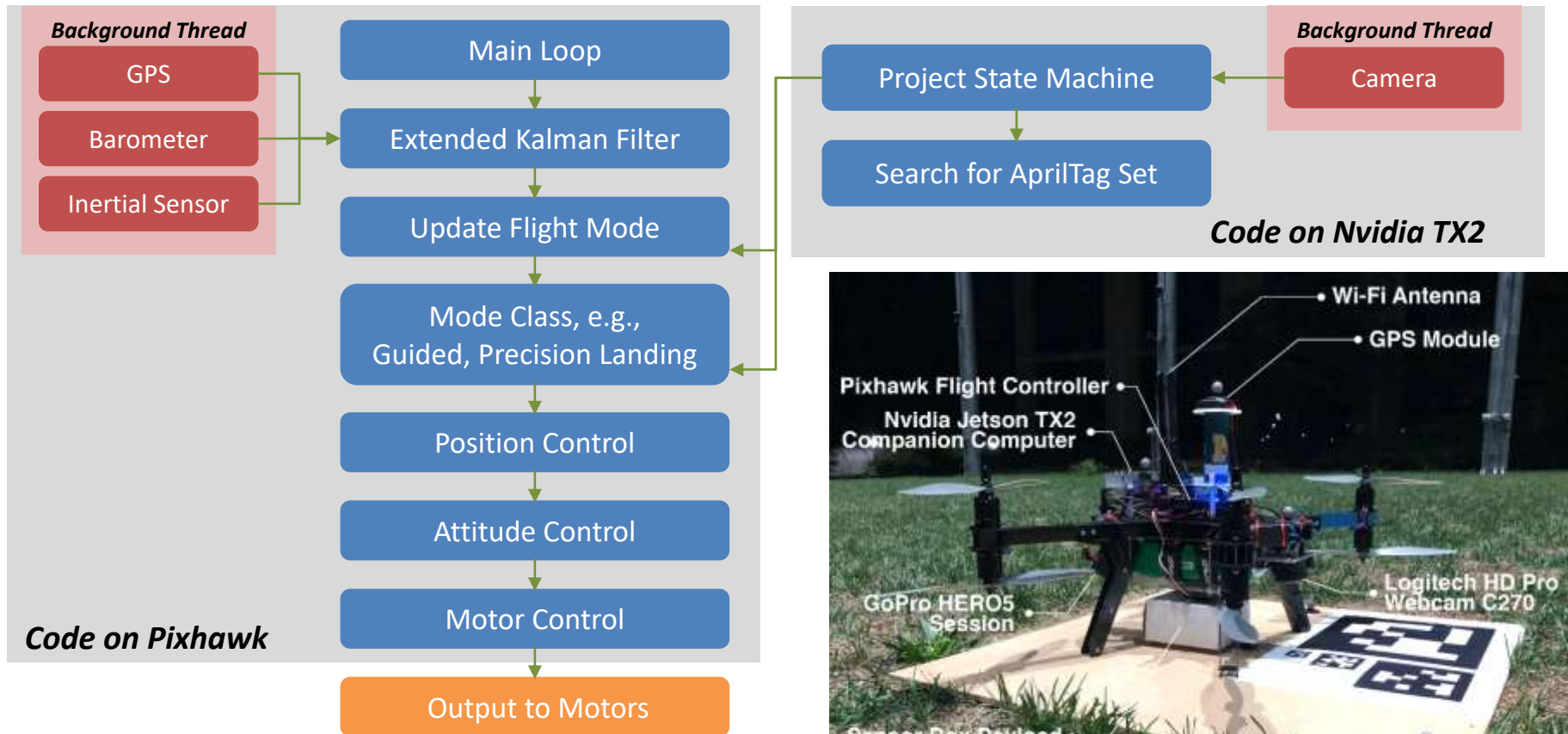
1. Small **UAV-geophones**, position themselves based on instruction from mother UAV and identifying previously positioned UAVs.
2. Mother UAV drops mass to generate stress wave, that is sensed by geophones.
3. UAV swarm confirms data acquisition and data quality, transmits data to mother UAV and departs
4. Mother UAV picks up dropped mass and departs



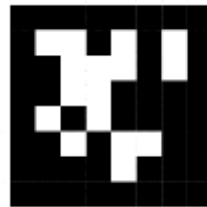
4.5 Hz Geophones



# UAV System Software Architecture



Base model: 3D Robotics X8+



Fiducial marker employed in our experiments: AprilTag  
(source: APRIL robotics lab, UMich)

Hao Zhou

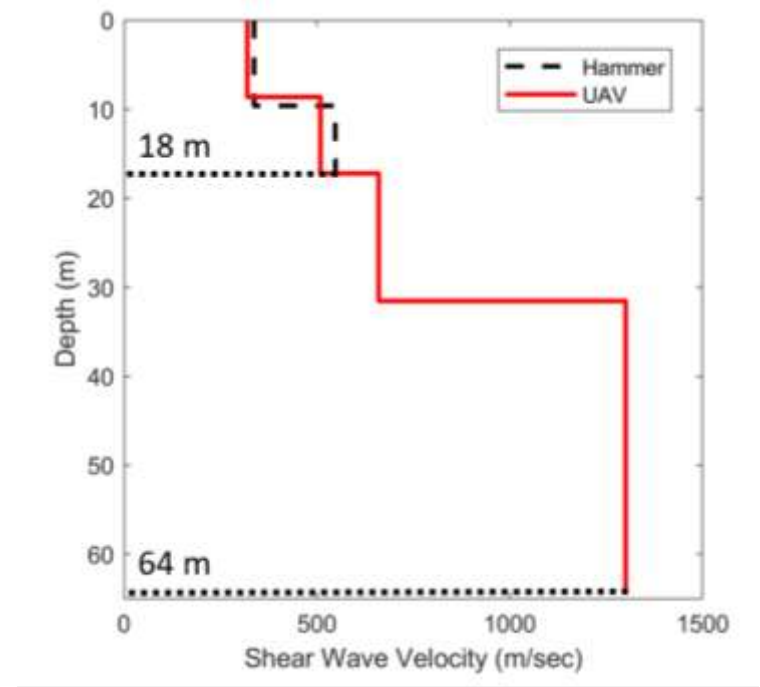


# A new autonomous, portable, safer MASW for deep(er) site characterization



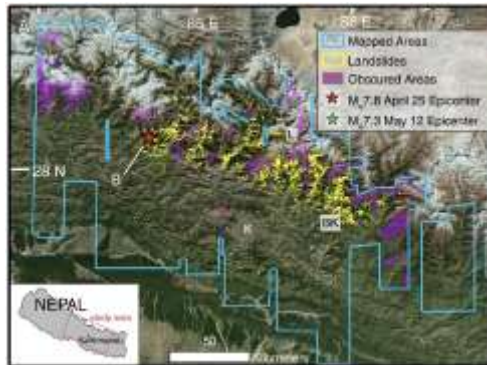
Greenwood, W. W., Zekkos, D., & Lynch, J. P. (2021). UAV-Enabled Subsurface Characterization Using Multichannel Analysis of Surface Waves. *Journal of Geotechnical and Geoenvironmental Engineering*, 147(11), 04021120.

Zhou, H., Lynch, J., & Zekkos, D. (2022). Autonomous wireless sensor deployment with unmanned aerial vehicles for structural health monitoring applications. *Structural Control and Health Monitoring*, e2942.

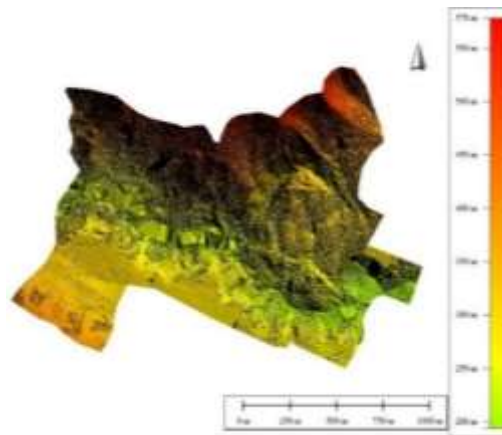


# For Distributed Systems, multi-scale, multi-sensing monitoring frameworks can provide system-level resiliency

## SATELLITES



## UNMANNED AERIAL VEHICLES



## WIRELESS SENSORS



**Coverage** >100 km<sup>2</sup>  
**Data Resolution** >0.5 m  
**Data Frequency** days  
**Sensors** Optical, Infrared, Radar

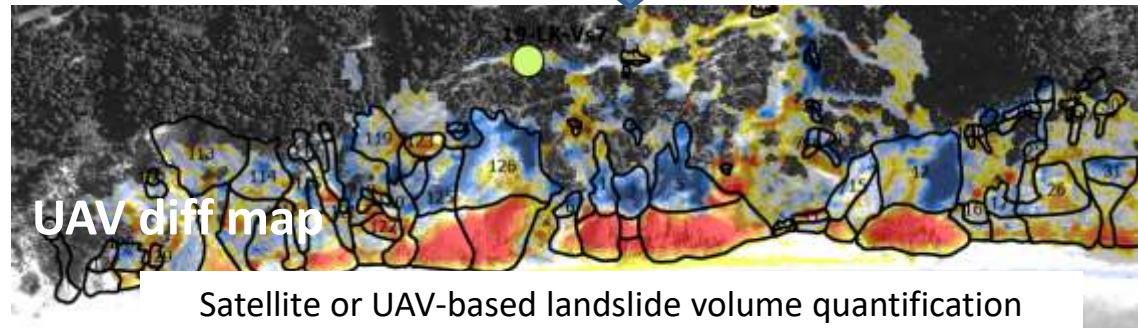
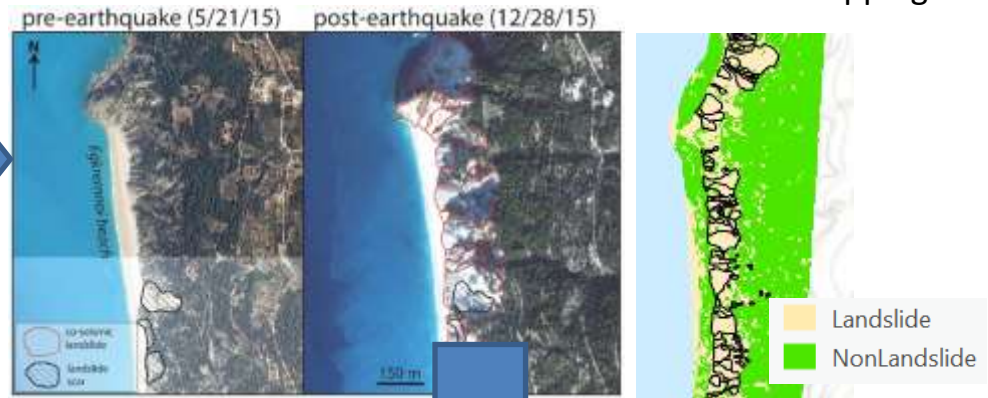
**1-100 km<sup>2</sup>**  
**>1 cm**  
**hrs**  
**Optical, Infrared, and more**

**<1 km<sup>2</sup>**  
**local**  
**sec**  
**Wide range**

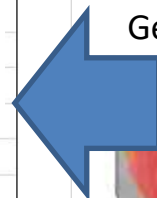
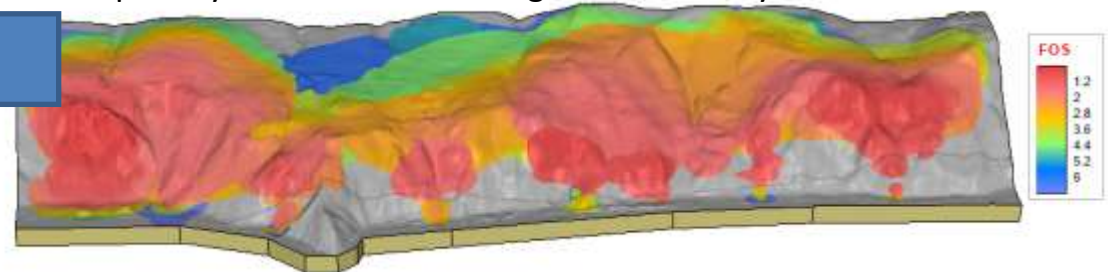


# Coastal Instability Monitoring

Satellite-based manual and ML-based landslide mapping

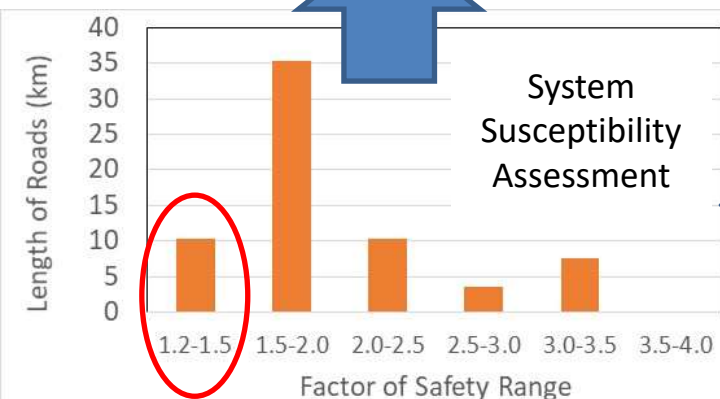


Geo-spatially derived shear strength and Stability Assessment



System  
Susceptibility  
Assessment

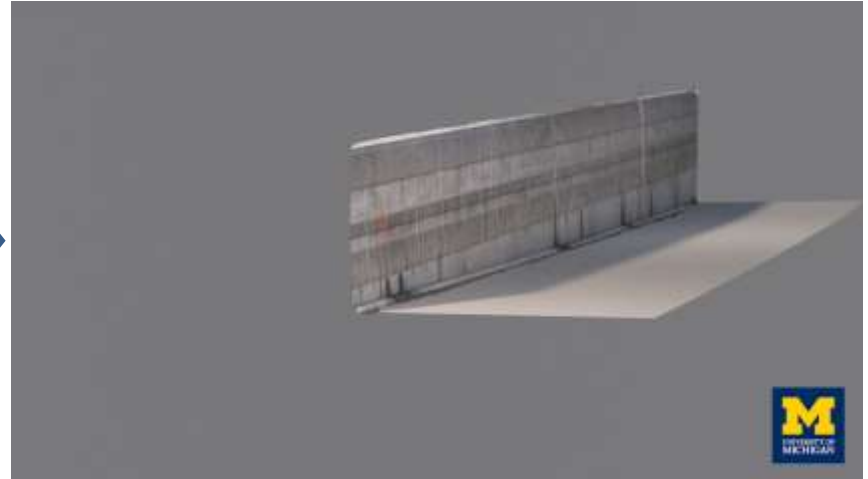
Focused monitoring in most critical locations



# Highway Retaining Wall Condition Assessment



Optical-based inspection of Distributed Asset



4D AI algorithms for moisture and geometry change detection



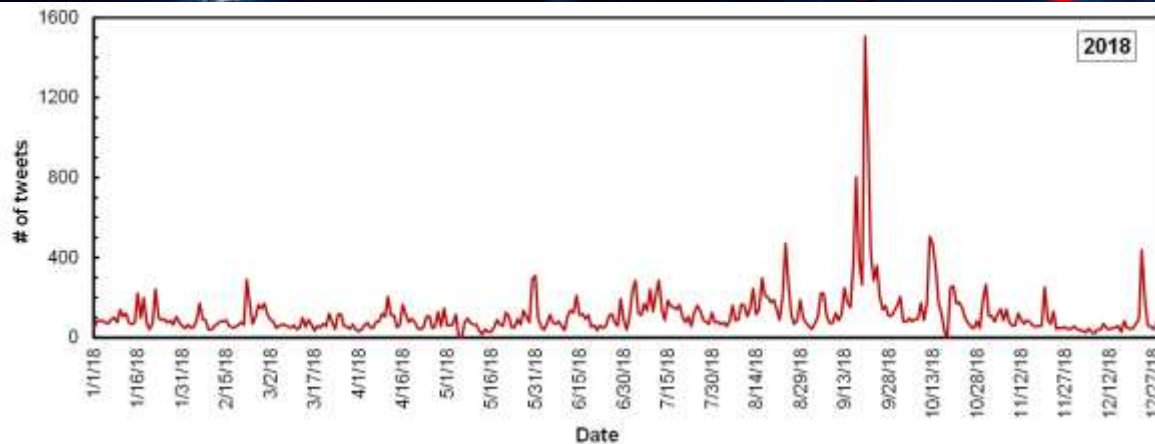
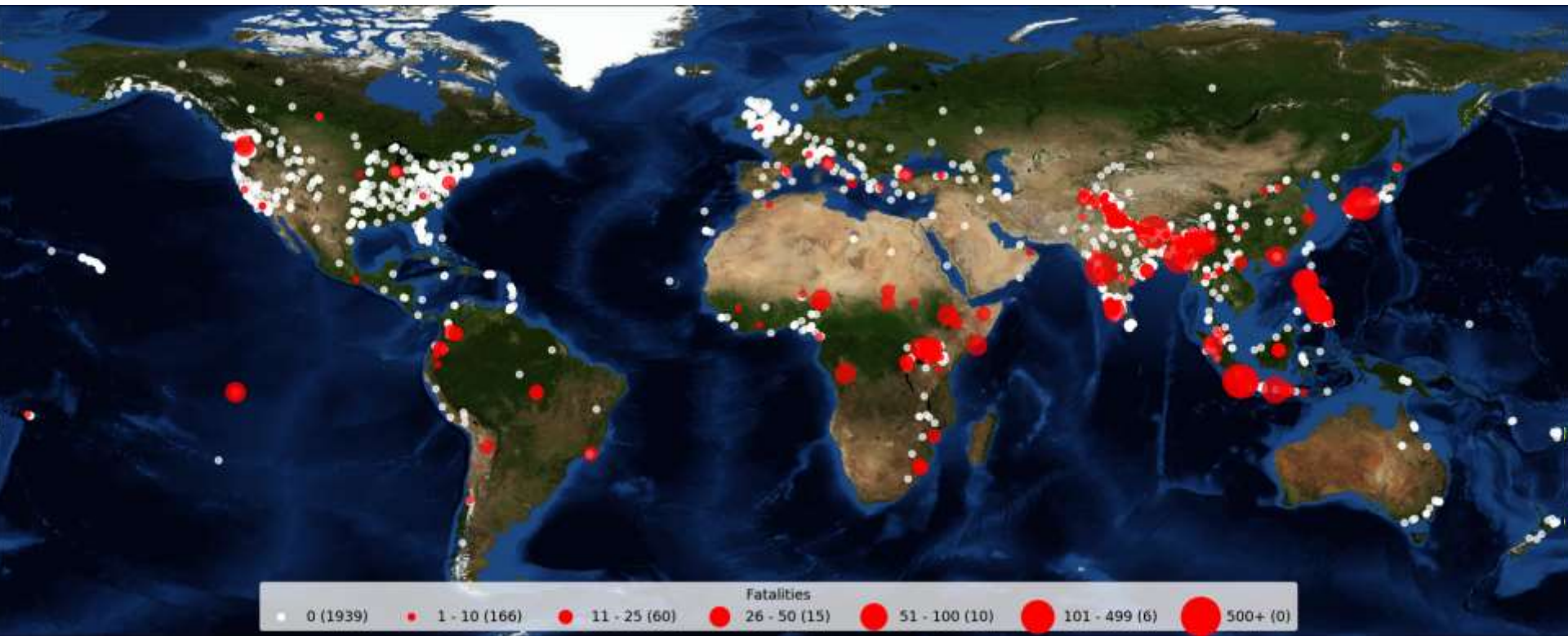
Michigan DOT's inspection procedures based on Risk-based Asset Management of Retaining Walls



Prioritization of critical locations for Self-powered Wireless Sensing



# Tweeting People as Landslide Sensors





**THINK BIG.**  
**ACT BIGGER.**





## Automation in the Geo-Profession

- We are at the beginning of the Automation “revolution” in Civil Infrastructure. Autonomy revolutionizes the **quality**, **quantity** and **rate** by which we collect (**perishable**) **geo-data**;
- Approaches allow for an **unprecedented** level of infrastructure **monitoring**; key to that is the **mobility** and **multi-sensing** aspects
- Autonomy brings **Big Data Approaches using AI to the forefront**. Data collected highlight the need for **refined models** that better capture the true performance of infrastructure
- These approaches will **improve** decisions for **infrastructure assessment, asset management**, and **risk quantification**.





## Automation in the Geo-Profession

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- Approaches allow for an **unprecedented** level of infrastructure  
The Automation “Revolution” does not threaten the geoprofessional community. It strengthens and expands it: In skills, portfolio, diversity of workers.

Data collected highlight the need for **refined models** that better capture the true performance of infrastructure

- These approaches will **improve** decisions for **infrastructure assessment**, **asset management**, and **risk quantification**.



# ACT BIGGER. : Education at UC Berkeley



- CEE Students learn Python at undergraduate education
- New undergraduate courses on Smart Infrastructure Sensing and Modeling Course
- Technologies and frameworks introduced in graduate geo-curriculum
- Short course for training professionals

<http://geotechnical.berkeley.edu>



Kenichi Soga



Robert Kayen

# ACT BIGGER.: Research



Berkeley  
CENTER FOR  
Smart Infrastructure

<https://smartinfrastructure.berkeley.edu/>



Director:  
Kenichi Soga



Co-Director:  
Matt Dejong



Co-Director:  
Dimitrios Zekkos

The center **integrates research, the tech industry, consultants, contractors and infrastructure owners**

Develops and tests **emerging technologies** such as intelligent systems and networks, remote sensing and monitoring, and **data analytics for decision-making** to address major infrastructure and environmental problems



# ACT BIGGER. : Geo-Industry (You)

- Diversify the staff that you are hiring in gender as well as in expertise:
  - Sensors / Electronics engineer
  - Remote Sensing professionals
  - Data Analyst; programmer

**or collaborate with companies/groups that have this expertise**

- We are seeing “the rise of geodata analyst”, a new sub-discipline of geotechnical engineering and geology. A geo-data Analyst:
  - Understands geotechnical engineering
  - Has programming skills
  - Can manage and process geospatial and sensor big data
  - Can apply AI to this data
- Connect and partner with Universities to collaborate in new advances and focus research in the directions that matter to your organization

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# Thank you!

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ACT BIGGER.**

