

# Integrated Strategies for Enhanced Rapid Earthquake Shaking, Ground Failure, & Impact Estimation Employing Remotely Sensed & Ground Truth Constraints

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Stony Brook University

Haeyoung Noh  
Stanford University

12NCEE Meeting, Salt Lake City  
June 29, 2022



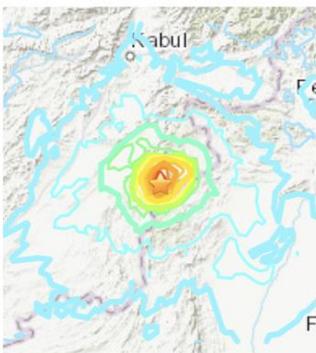
← Latest Earthquakes

# M 5.9 - 46 km SW of Khōst, Afghanistan

2022-06-21 20:54:36 (UTC) | 33.092°N 69.514°E | 10.0 km depth

- Overview
- Interactive Map
- Regional Information
- Impact
- Felt Report - Tell Us!
- Did You Feel It?
- ShakeMap
- PAGER
- Ground Failure
- Technical
- Origin
- Moment Tensor
- Waveforms
- Download Event KML
- View Nearby Seismicity

## Interactive Map



Contributed by US<sup>2</sup>

## Regional Information



Contributed by US<sup>2</sup>

## Felt Report - Tell Us!

0 0 0 0 7 3

Responses

Contribute to citizen science. Please [tell us](#) about your experience.

Citizen Scientist Contributions

## Did You Feel It?

IX

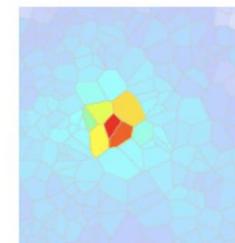


Community Internet Intensity Map

Contributed by US<sup>2</sup>

## ShakeMap

IX

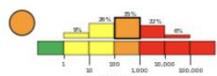


Estimated Intensity Map

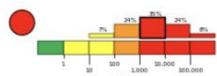
Contributed by US<sup>2</sup>

## PAGER

RED



Estimated Economic Losses



Estimated Fatalities

Contributed by US<sup>2</sup>

## Ground Failure

### Landslide Estimate



Significant area affected

Limited population exposed

### Liquefaction Estimate



Little or no area affected

Little or no population exposed

Contributed by US<sup>2</sup>

## Origin

### Review Status

REVIEWED

### Magnitude

5.9 mwb

### Depth

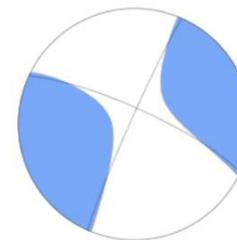
10.0 km

### Time

2022-06-21 20:54:36 UTC

Contributed by US<sup>2</sup>

## Moment Tensor



Fault Plane Solution

Contributed by US<sup>2</sup>

## View Nearby Seismicity

### Time Range

± Three Weeks

### Search Radius

250.0 km

### Magnitude Range

≥ 2.0

ANSS Comcat

**M 5.9, 46 km SW of Kht, Afghanistan**

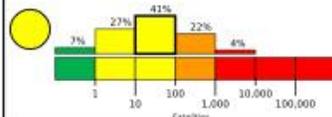
Origin Time: 2022-06-21 20:54:36 UTC (Wed 01:24:36 local)  
Location: 33.0924° N 69.5135° E Depth: 10.0 km

**PAGER Version 2**

Created: 58 minutes, 54 seconds after earthquake

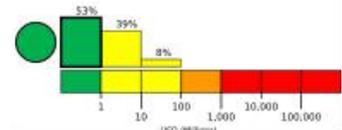
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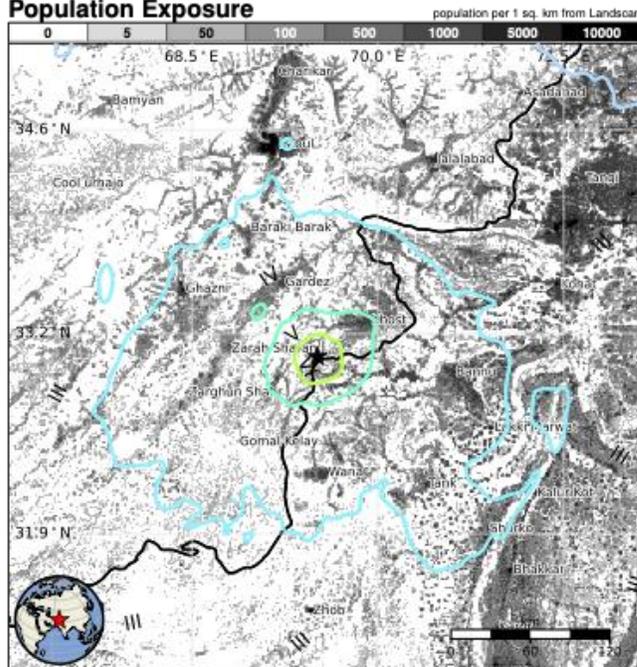


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**Population Exposure**



**Structures**

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IV	Gardez	104k
IV	Ghazni	141k
IV	Jalalabad	200k
III	Kabul	3,044k
III	Peshawar	1,219k

bold cities appear on map. (k = x1000)

Event ID: us7000h3u

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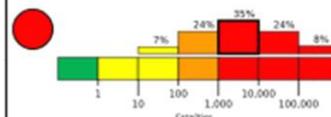
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**PAGER Version 5**

Created: 2 days, 17 hours after earthquake

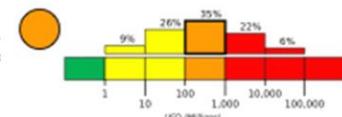
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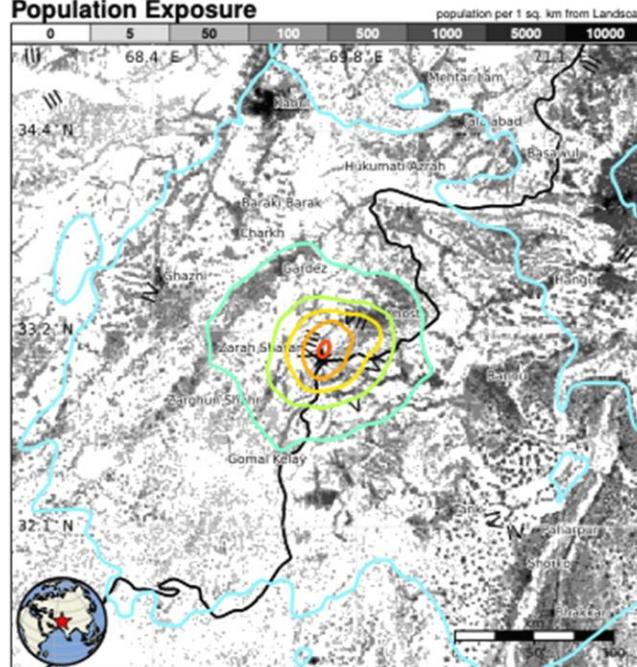


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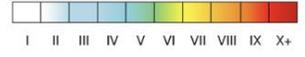
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**CLOSE**

Epicenter 

Intensity



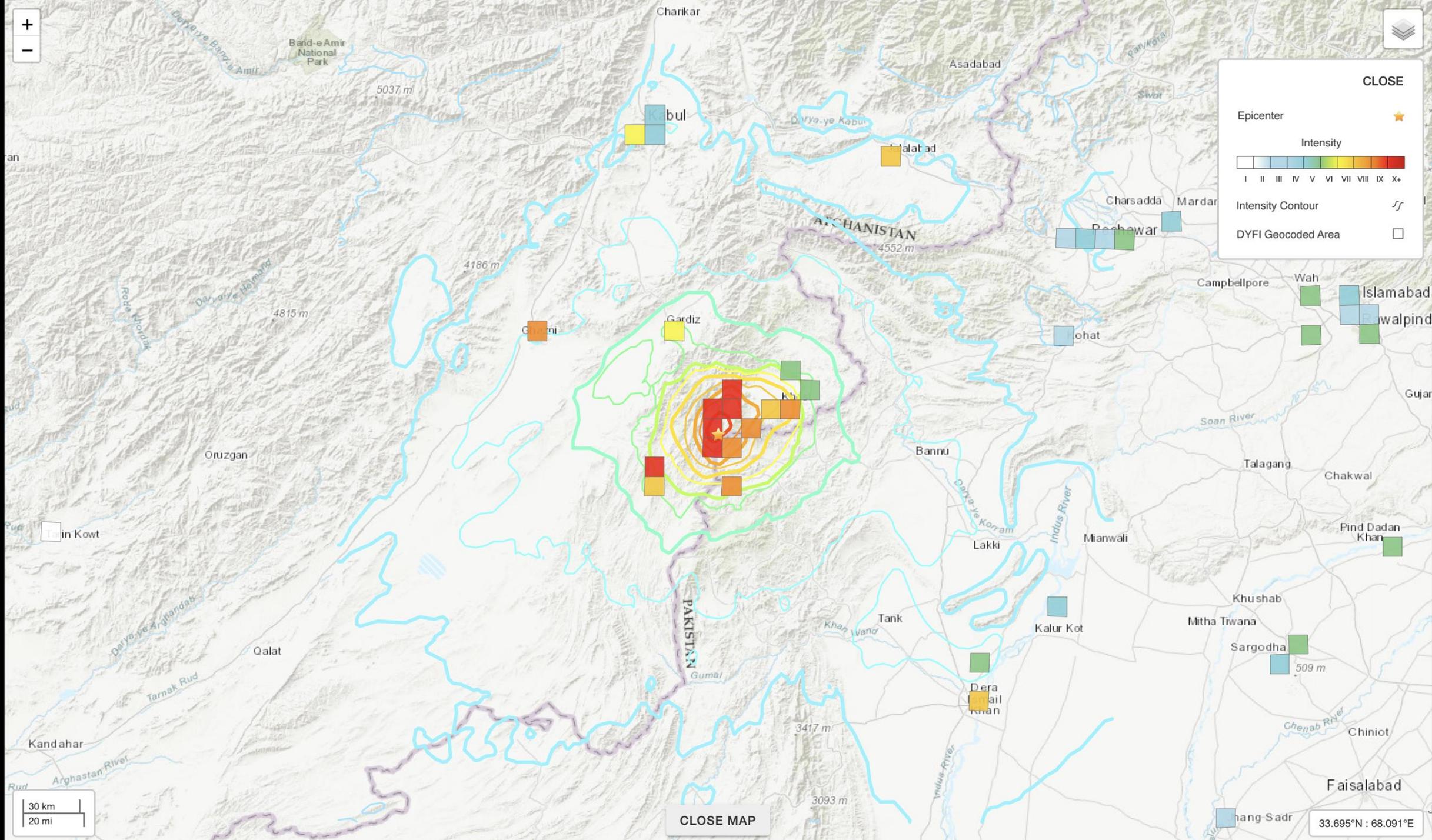
Intensity Contour 

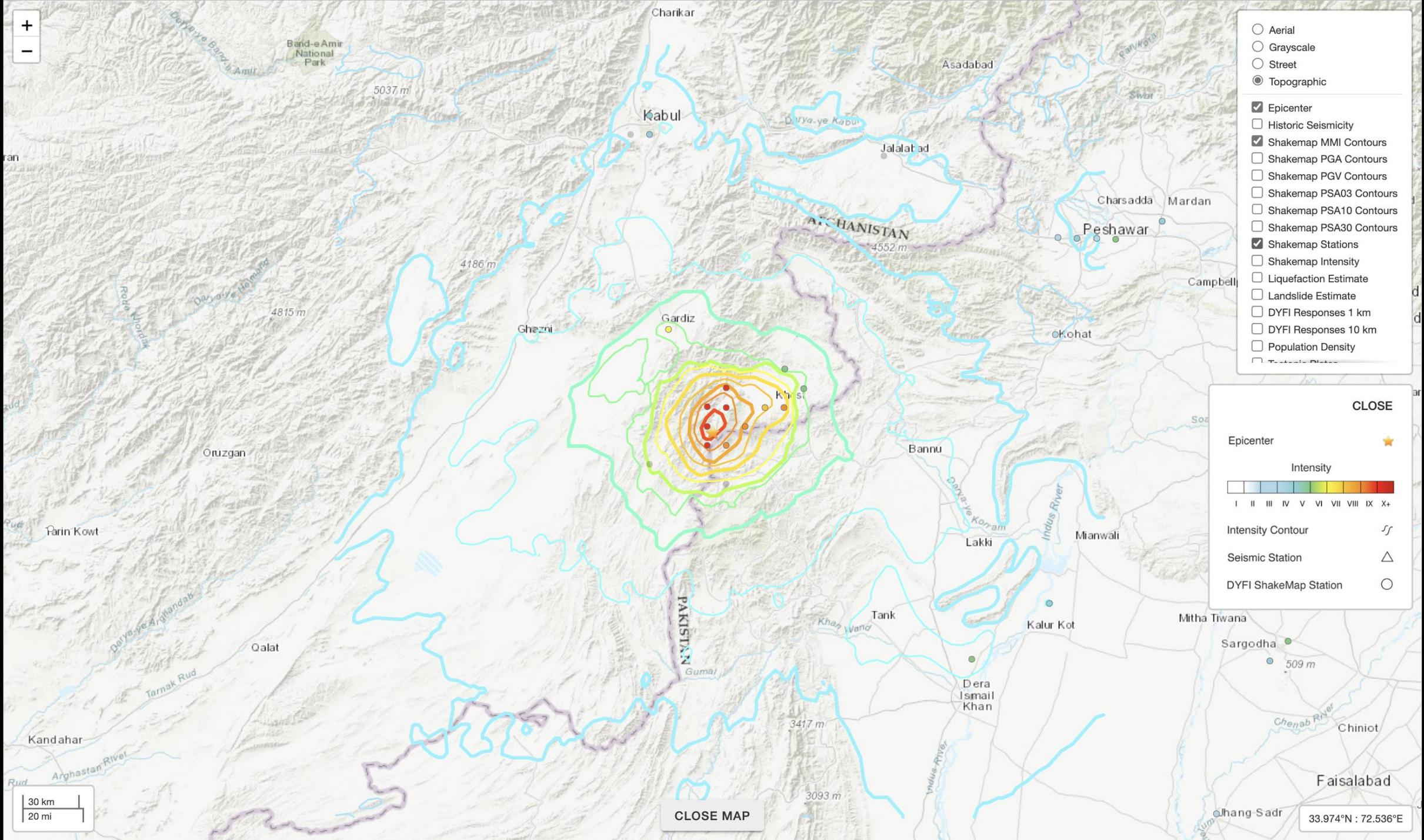
DYFI Geocoded Area 

30 km  
20 mi

CLOSE MAP

33.695°N : 68.091°E



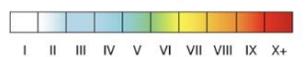


- Aerial
  - Grayscale
  - Street
  - Topographic
- 
- Epicenter
  - Historic Seismicity
  - Shakemap MMI Contours
  - Shakemap PGA Contours
  - Shakemap PGV Contours
  - Shakemap PSA03 Contours
  - Shakemap PSA10 Contours
  - Shakemap PSA30 Contours
  - Shakemap Stations
  - Shakemap Intensity
  - Liquefaction Estimate
  - Landslide Estimate
  - DYFI Responses 1 km
  - DYFI Responses 10 km
  - Population Density
  - Tectonic Plates

**CLOSE**

Epicenter 

Intensity



Intensity Contour 

Seismic Station 

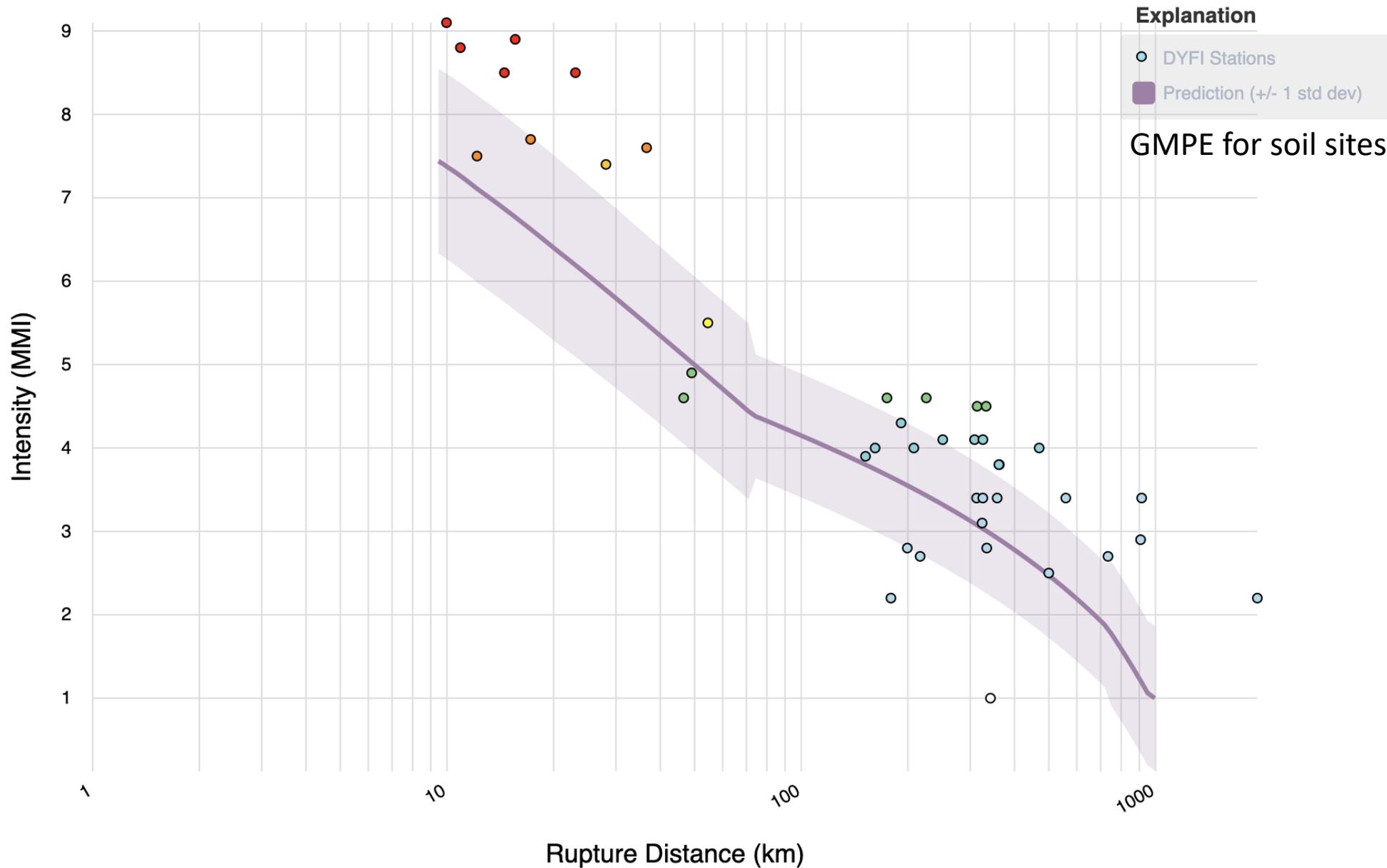
DYFI ShakeMap Station 



CLOSE MAP

33.974°N : 72.536°E

# Predictions and Observations

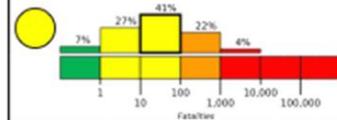


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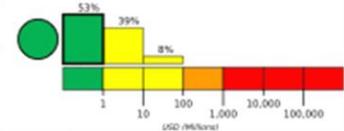
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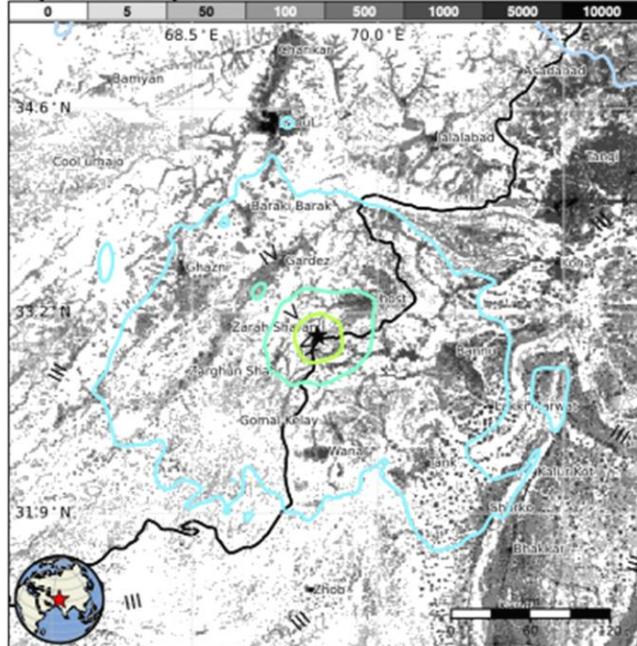


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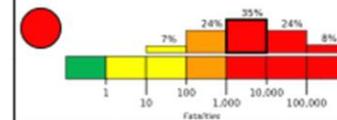
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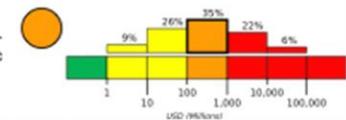
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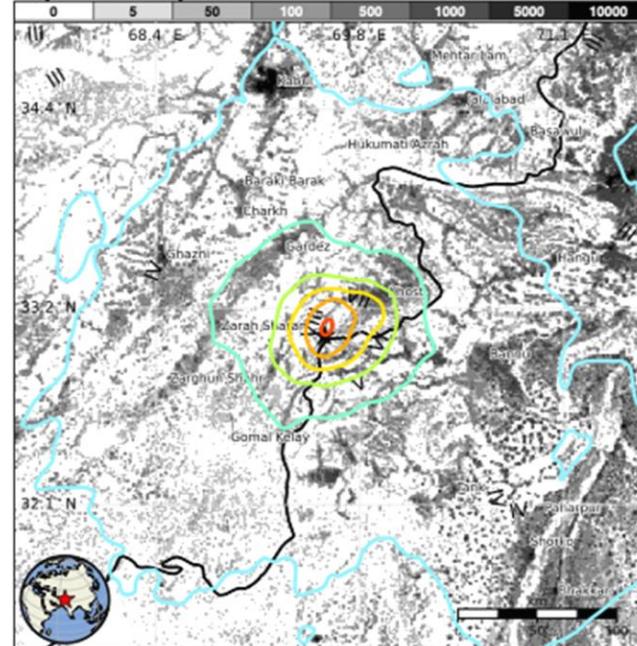


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# Quantifying & Reducing Uncertainties

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## 1. Improve prior models:

- Improved regional (ergodic?) GMM's, IPEs, GMICE.
- ShakeMap Atlas V4: 250 more loss events since 2010, w/ better data constraints, population, demographics, etc., than previous generation.
- Loss models – better data, exposure & vulnerability databases, etc.
- Calibration w/ better uncertainty propagation (ShakeMap, population, losses).

## 2. Update prior models on-the-fly by adding ground truth observations:

- Citizen-science, crowd-sourced observations, official/media reports
  - Imagery (InSAR, optical, UAV, lidar)
  - Building & infrastructure damage (site specific) observations
  - Ground failure (specific occurrences of liquefaction & landsliding)
-



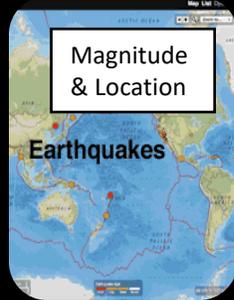
# USGS Earthquake Information System

Earthquake

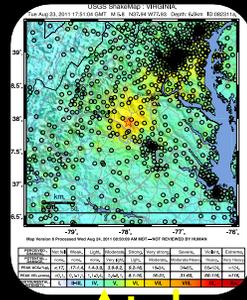


Post-Earthquake

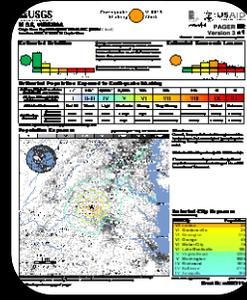
Mag/Loc



ShakeMap



PAGER



0.0 sec

10 Min

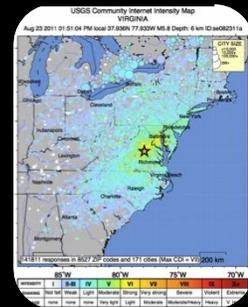
20 Min

1 Hour

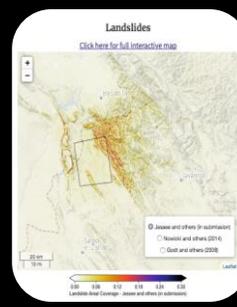
1 Day

3 Days

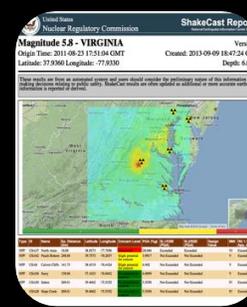
DYFI?



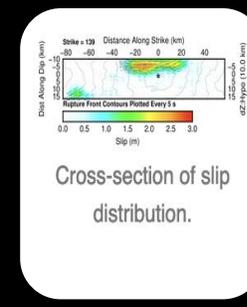
Ground Failure



ShakeCast

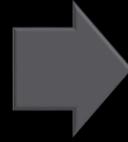


Finite Fault



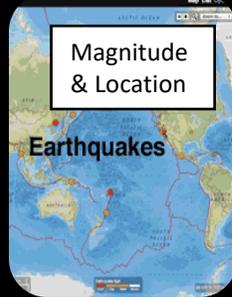
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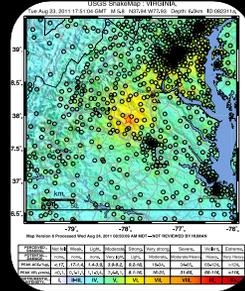


Post-Earthquake

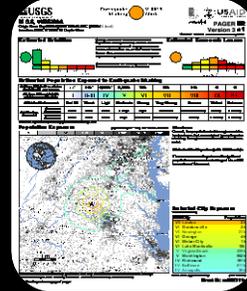
Mag/Loc



ShakeMap



PAGER



Reporting



Imagery



0.0 sec

10 Min

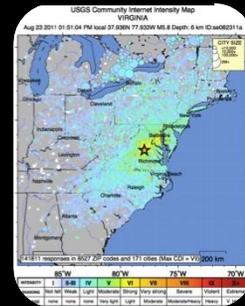
20 Min

1 Hour

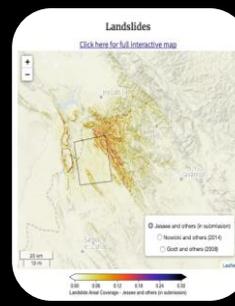
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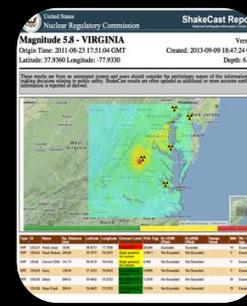
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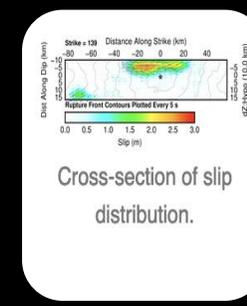
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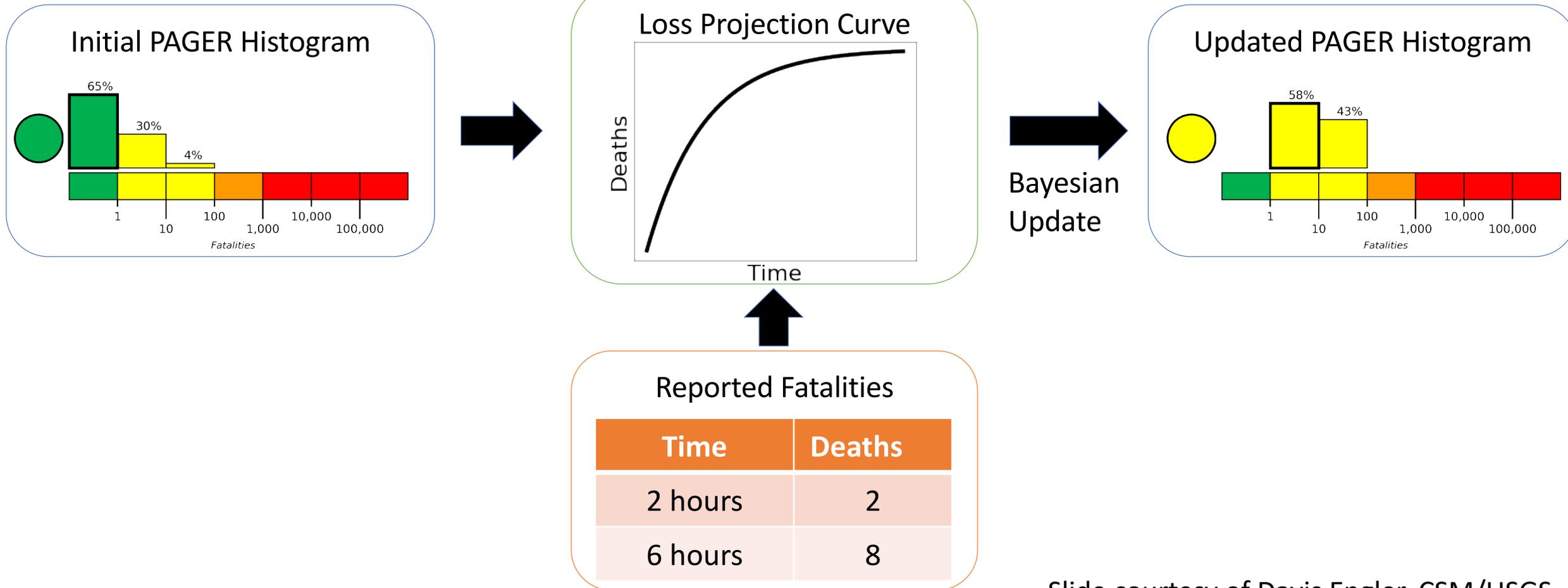


Finite Fault



# Introduction to the updating framework

- Goal: Improve PAGER's fatality estimates in the hours/days after an earthquake



# An efficient Bayesian framework for updating PAGER loss estimates

Hae Young Noh, M.EERI<sup>1</sup>, Kishor S Jaiswal, M.EERI<sup>2</sup>,  
 Davis Engler<sup>2,3</sup>, and David J Wald, M.EERI<sup>4</sup>

Earthquake Spectra  
 1–24  
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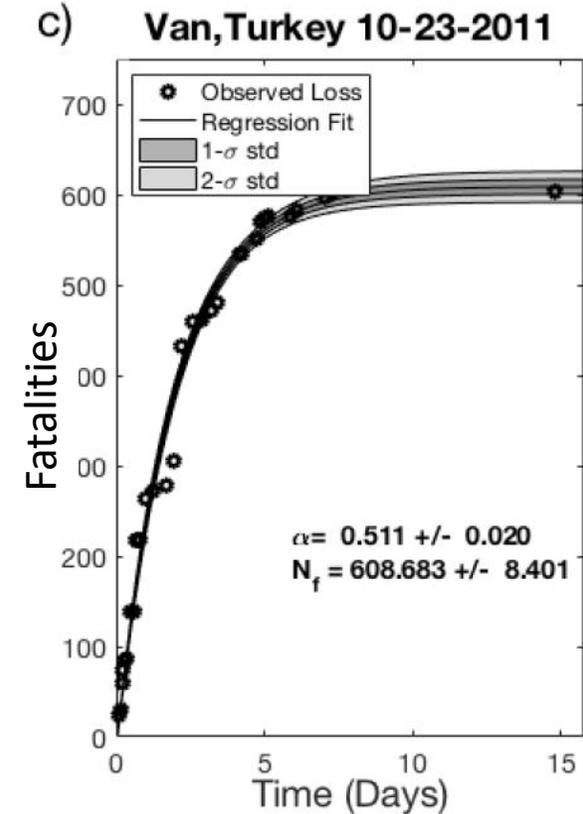
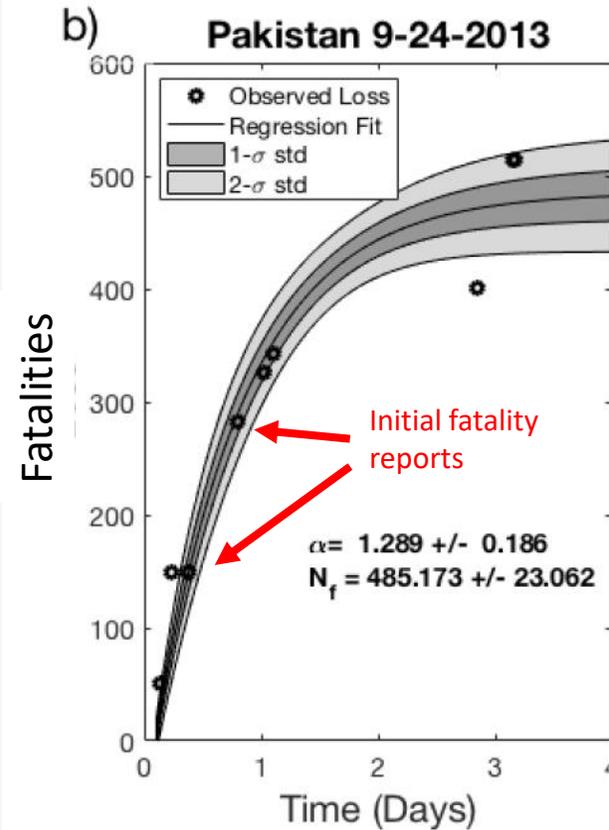

## Abstract

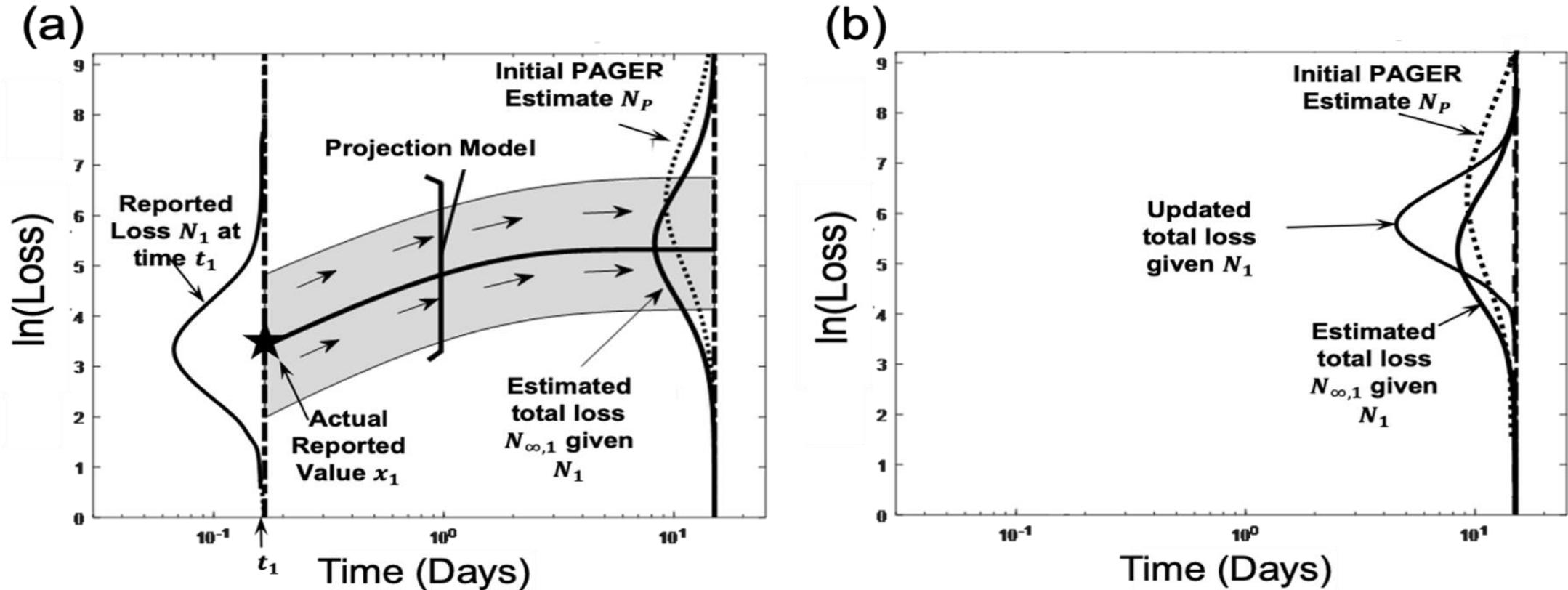
We introduce a Bayesian framework for incorporating time-varying noisy reported data on damage and loss information to update near real-time loss estimates/alerts for the U.S. Geological Survey's Prompt Assessment of Global Earthquakes for Response (PAGER) system. Initial loss estimation by PAGER immediately following an earthquake includes several uncertainties. Historically, the PAGER's alerting on fatality and economic losses has not incorporated location-specific reported data on physical damage or casualties for a given earthquake. The proposed framework provides the ability to include early reports on fatalities at any given time and improve the overall impact forecast for the earthquake. The reported data on fatalities or damage are generally incomplete and noisy, especially in the early hours of the disaster. To address these challenges, we develop a recursive Bayesian updating framework that takes into account the loss projection model and the measurement and model uncertainties. The framework is applied to loss data for three example earthquakes, and the results show that the proposed updating improves the loss estimates and alert level to the correct level within the first day of the earthquake.

## Keywords

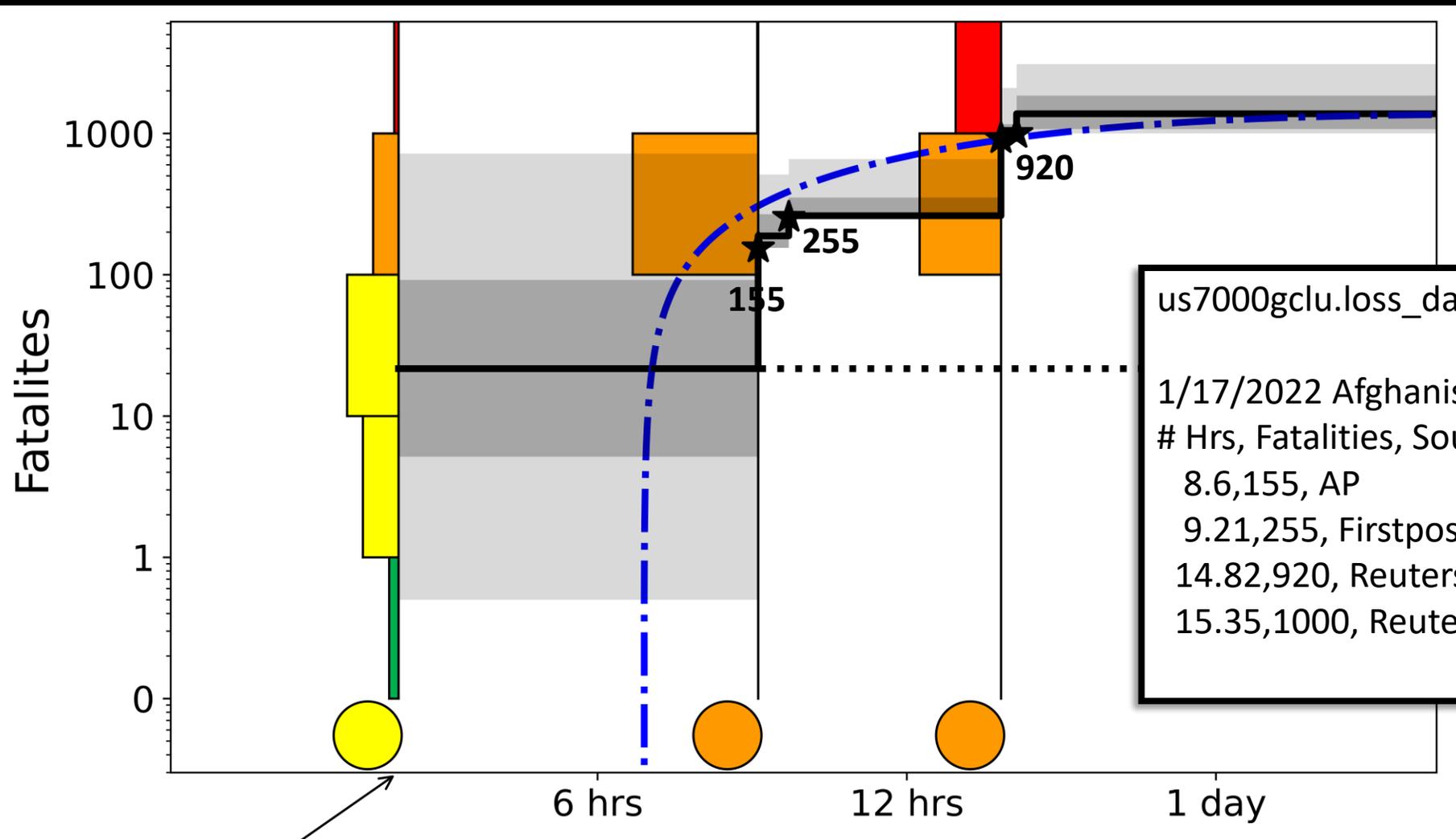
PAGER, Bayesian updating, casualty, loss modeling, forecast

Date received: 2 June 2020; accepted: 8 June 2020





(a) The projection step, where the reported loss data at time  $t_1$  is used to obtain an estimate of total loss based on the loss projection model. (b) The updating step, using the estimated total loss given the report at time  $t_1$  as an observation of total loss, the PAGER loss distribution is updated to obtain a new estimate of the total loss distribution.



us7000gclu.loss\_data.txt

1/17/2022 Afghanistan us7000gclu

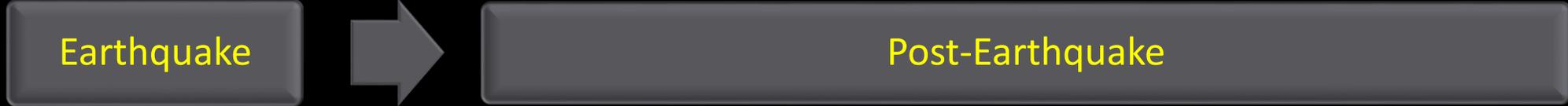
# Hrs	Fatalities	Source
8.6	155	AP
9.21	255	Firstpost India
14.82	920	Reuters
15.35	1000	Reuters

Initial PAGER Histogram

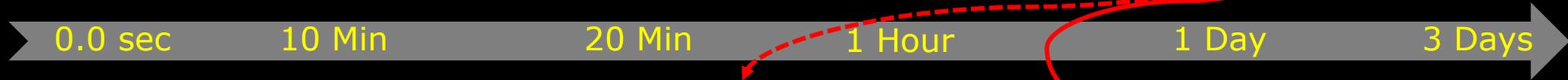
Time

- Reported Loss Data
- Updated Median Total Fatalities
- 25-75 Percentile Range
- PAGER Alert Level
- PAGER Median Total Fatalities
- Updated Median Loss Projection Curve
- 5-95 Percentile Range
- PAGER Histogram

# USGS Earthquake Information System

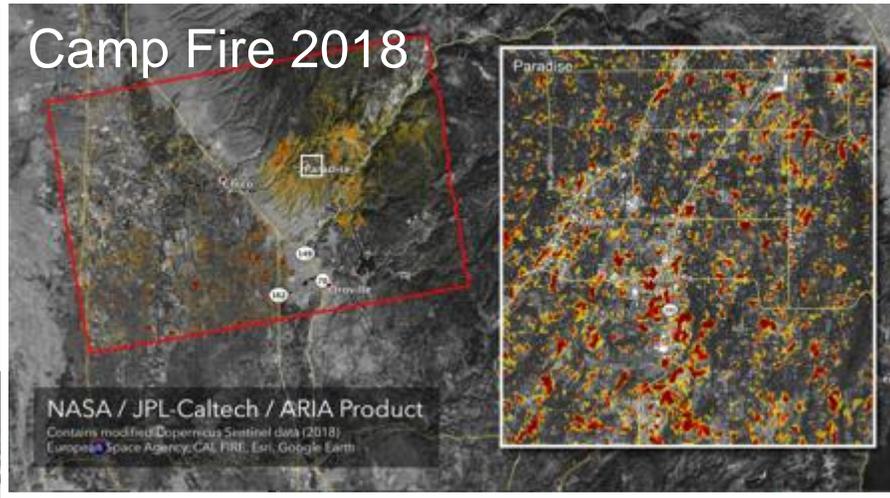
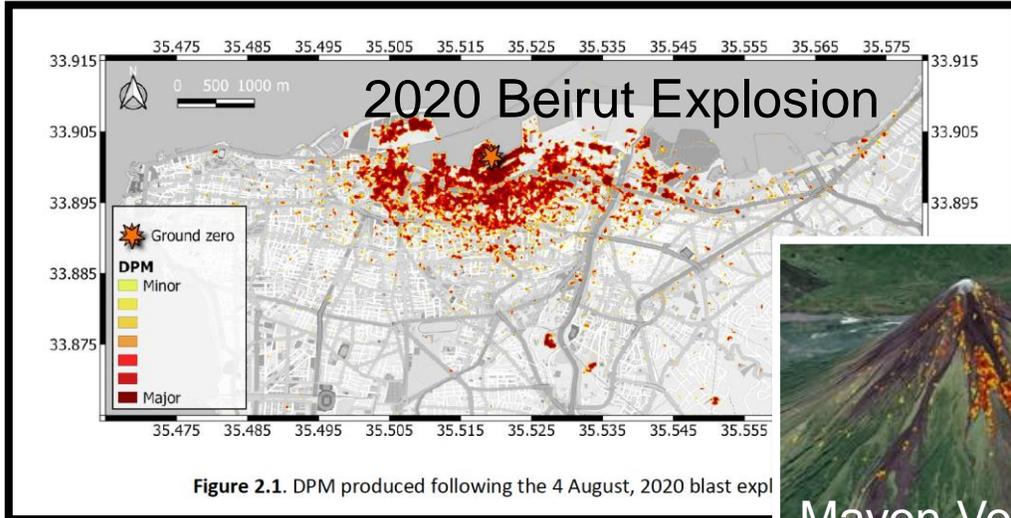


Mag/Loc      ShakeMap      PAGER      Reporting      Imagery

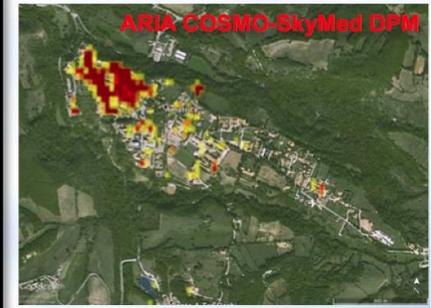
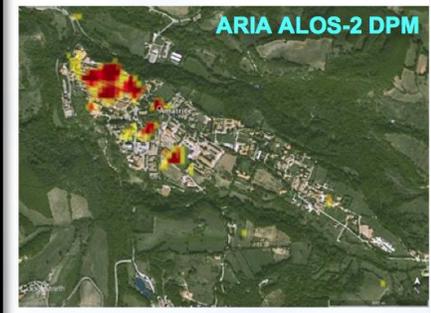
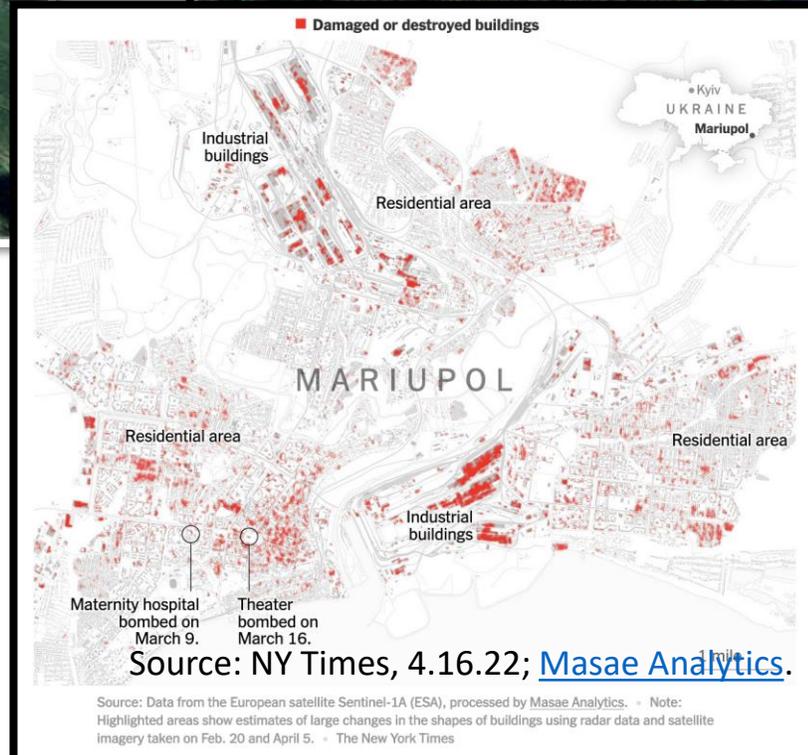
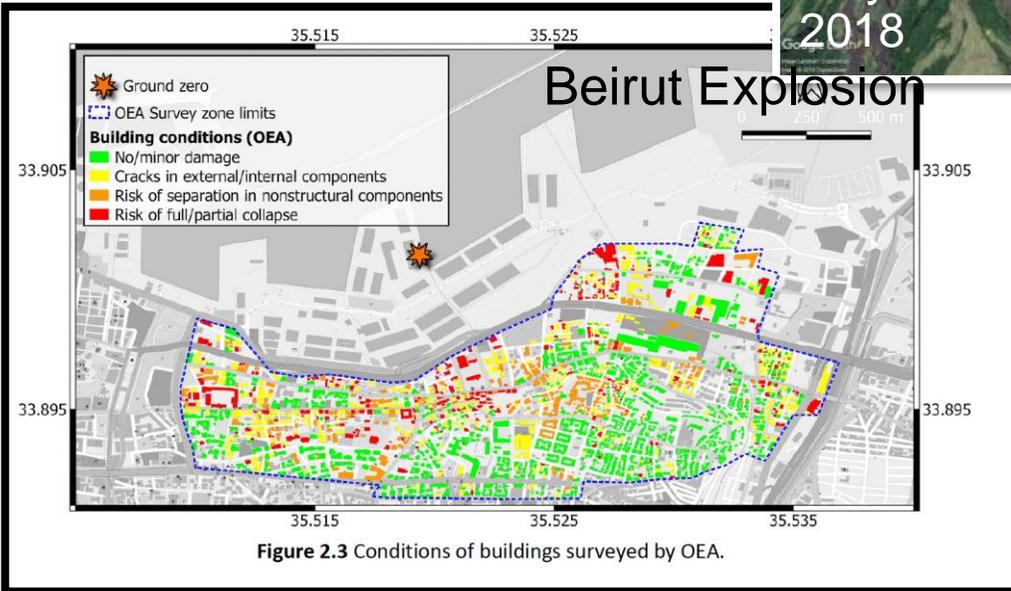
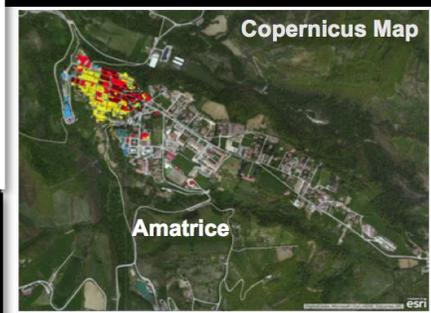


DYFI?      Ground Failure      ShakeCast      Finite Fault

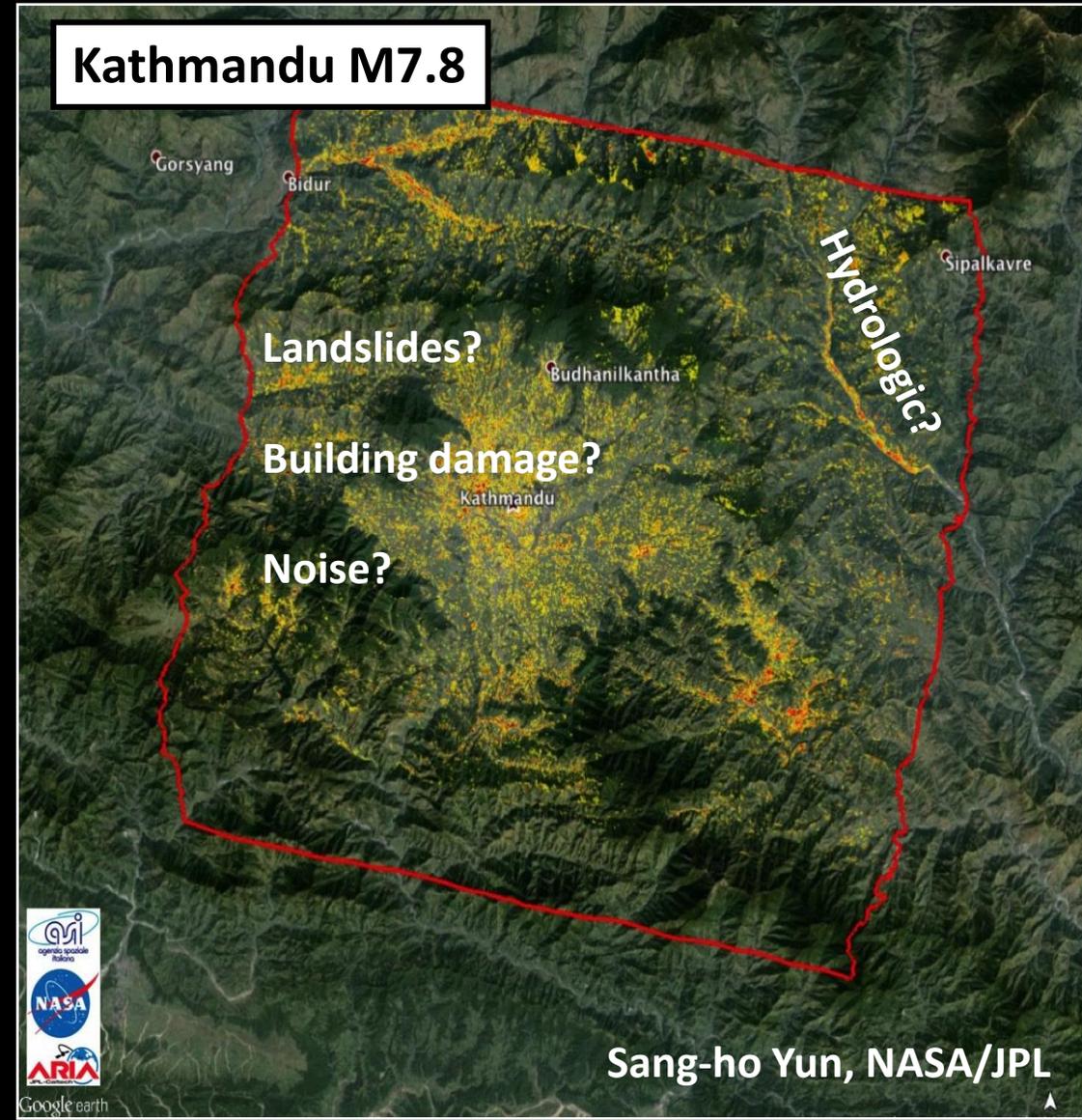
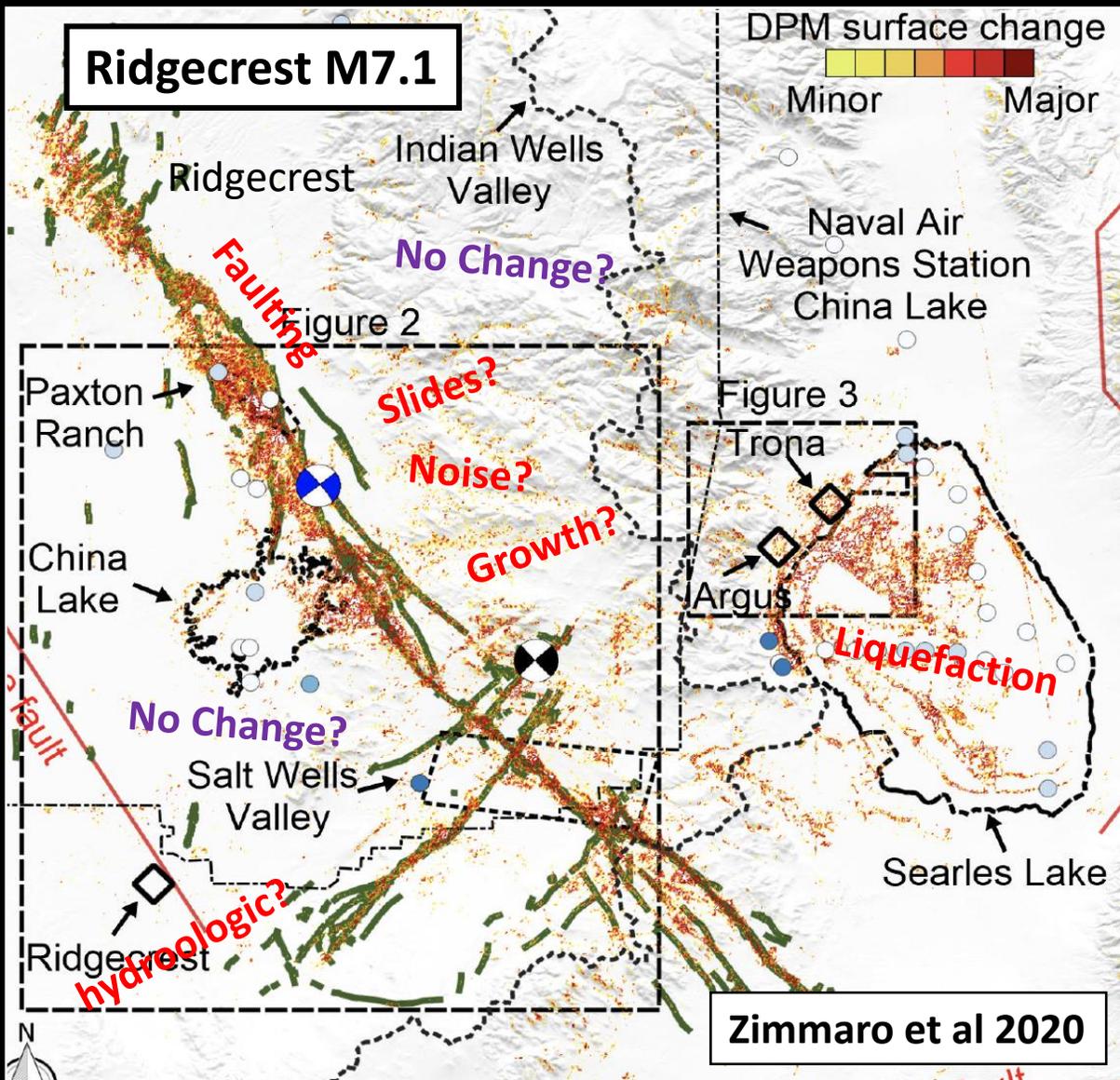
# NASA/JPL Damage Proxy Map (DPM) & other examples



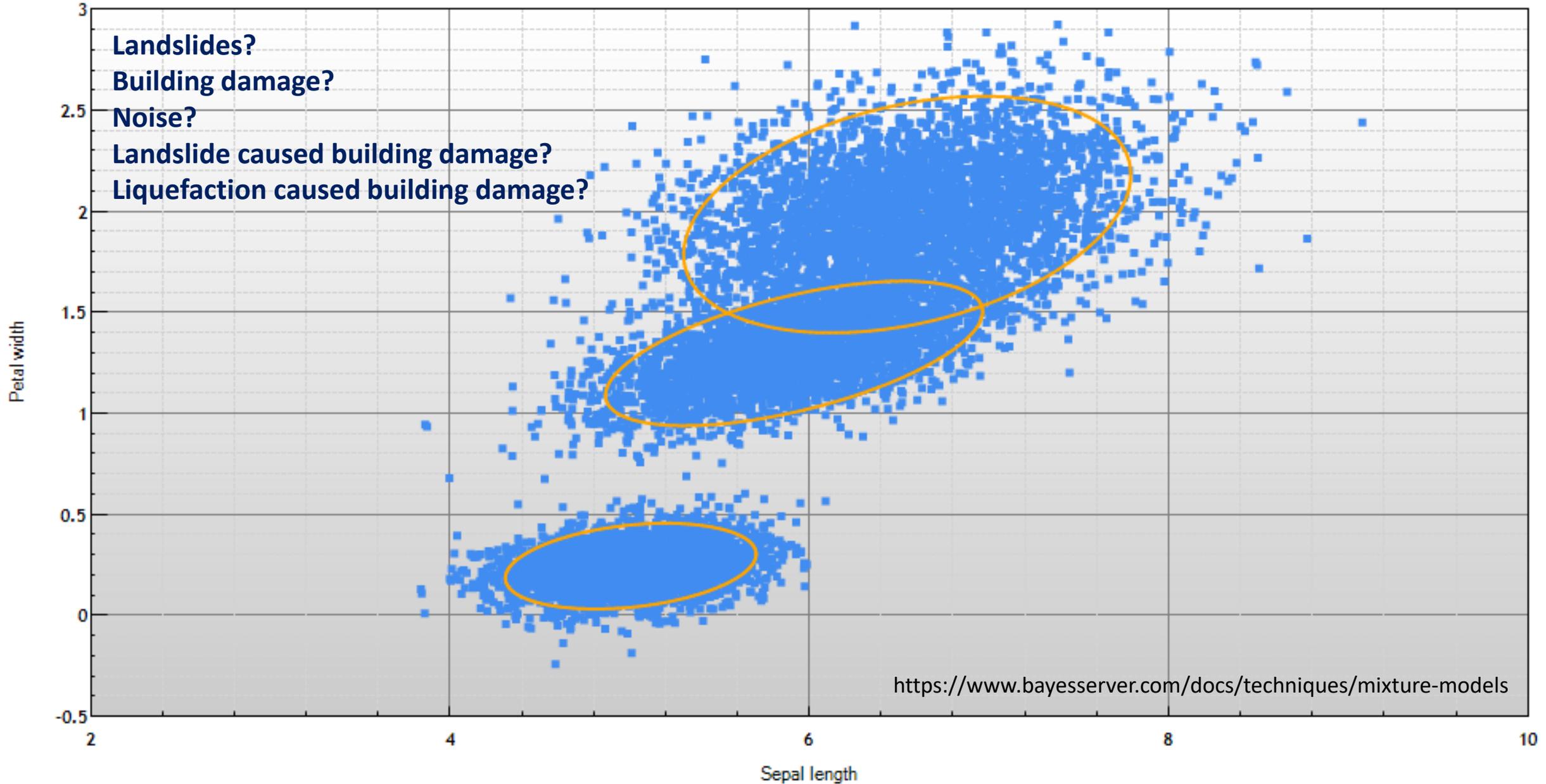
## 2016 Amatrice Earthquake



# InSAR "Damage Proxy Maps" (DPMs): Pre-post event changes in image correlation

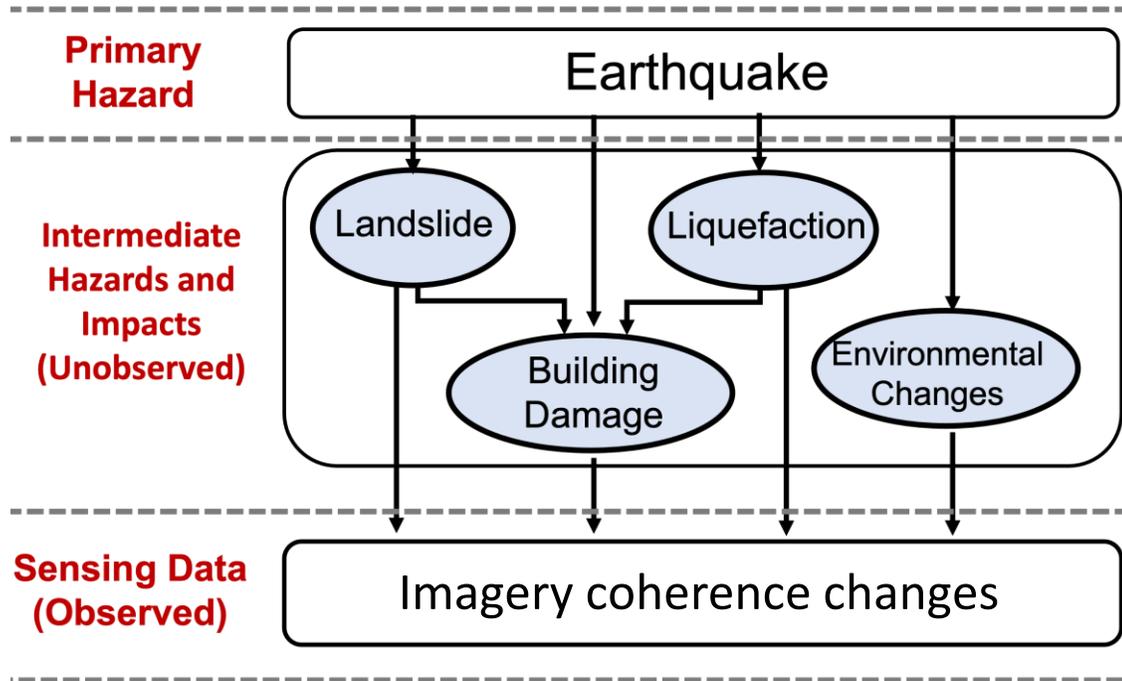


# A mixture model - a collection of multivariate gaussian distributions

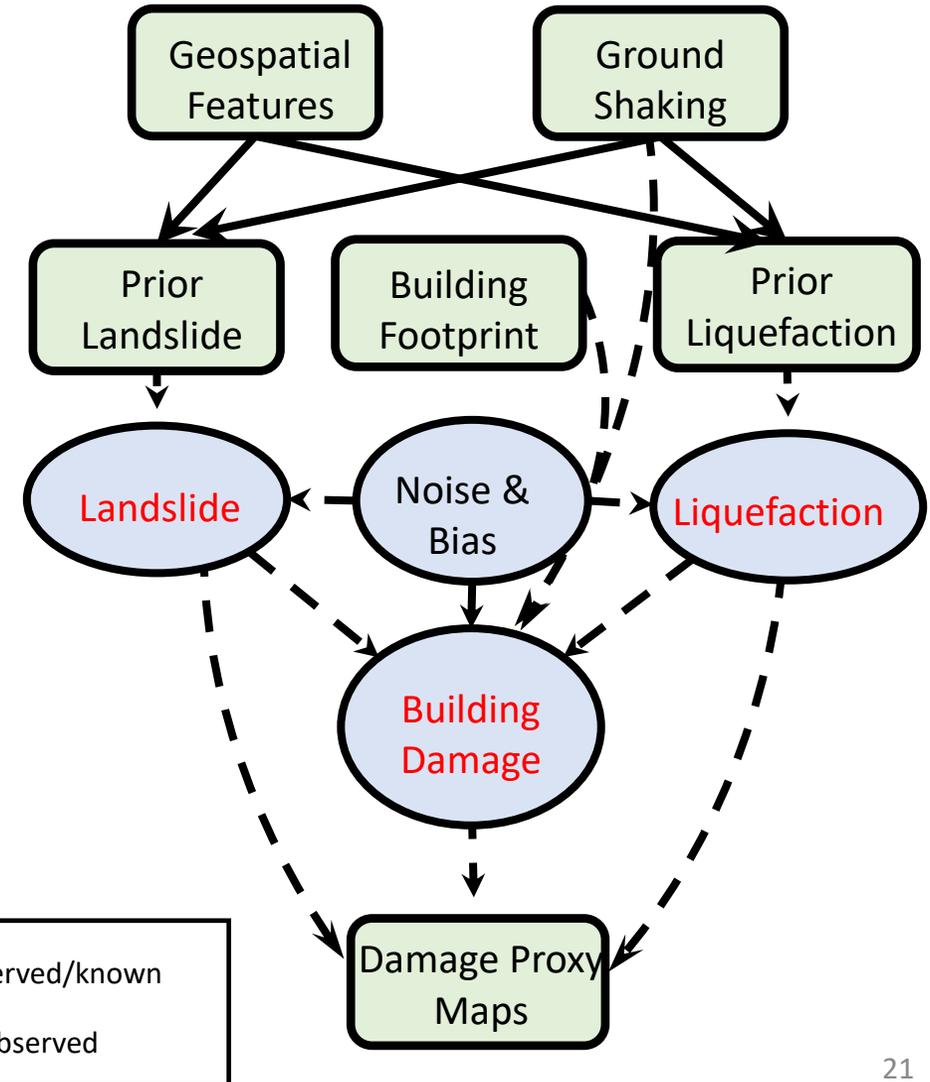


# Causal graph model to solve for complex interactions

## Conceptual Model

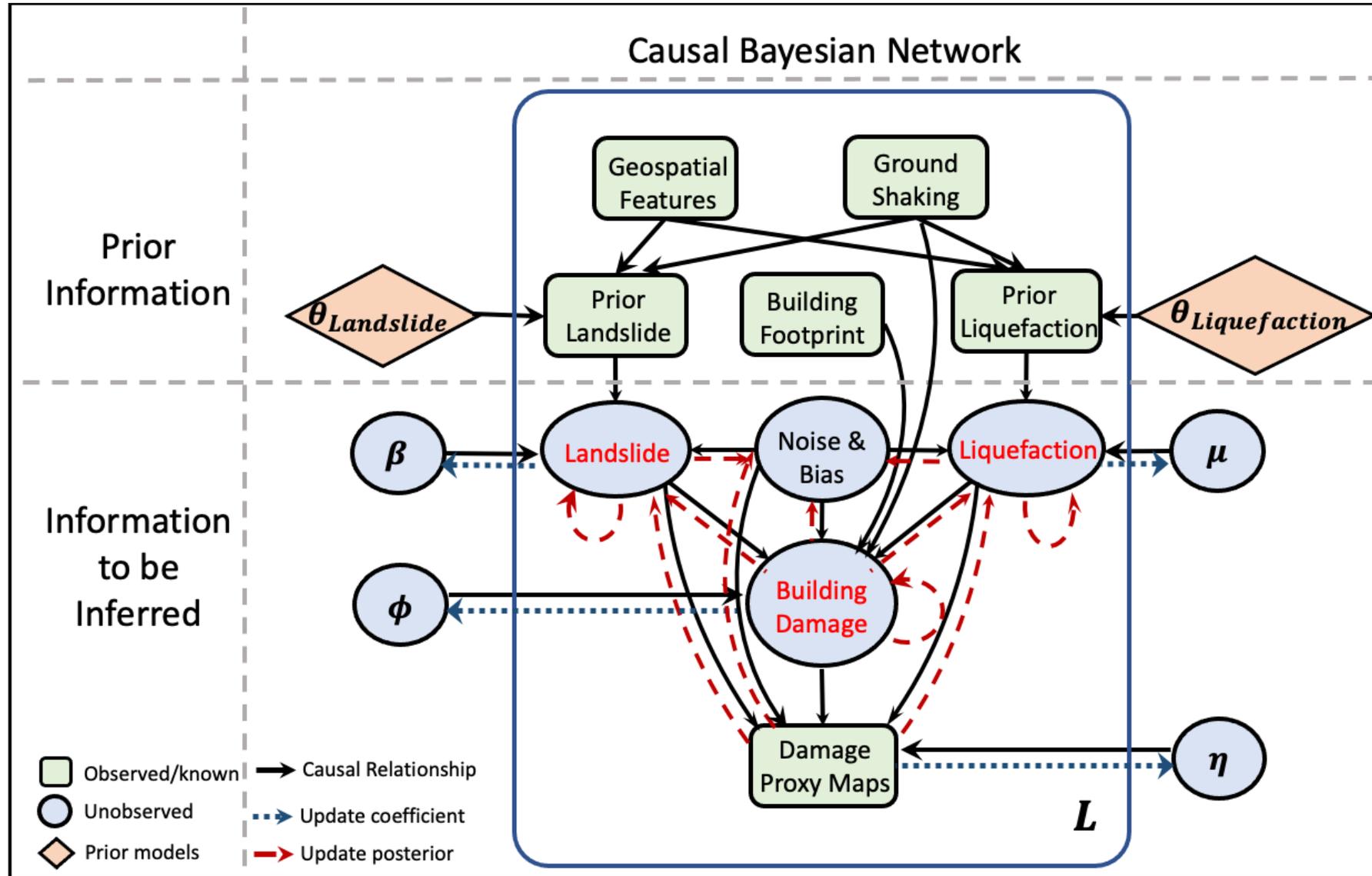


## Mathematical Model



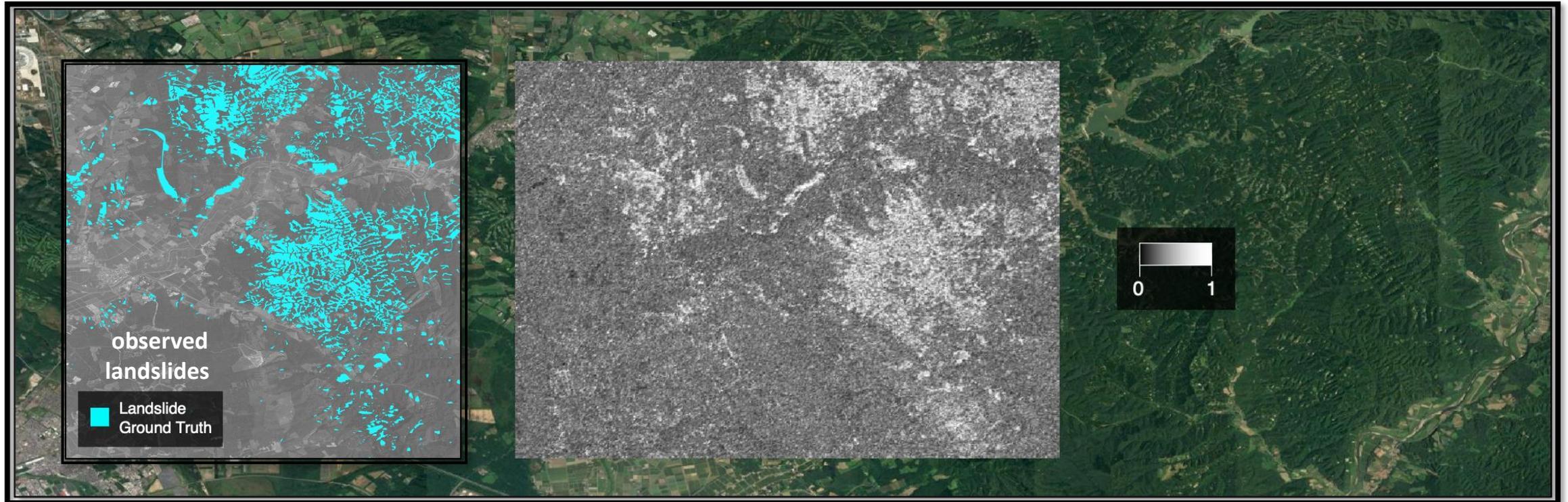
*See Susu Xu et al. this meeting (Thurs)*

# Causal graph model to approximate complex interactions



## Example Results – An easy case

The 2018 Hokkaido, Japan Earthquake of September 2018 (M6.6)

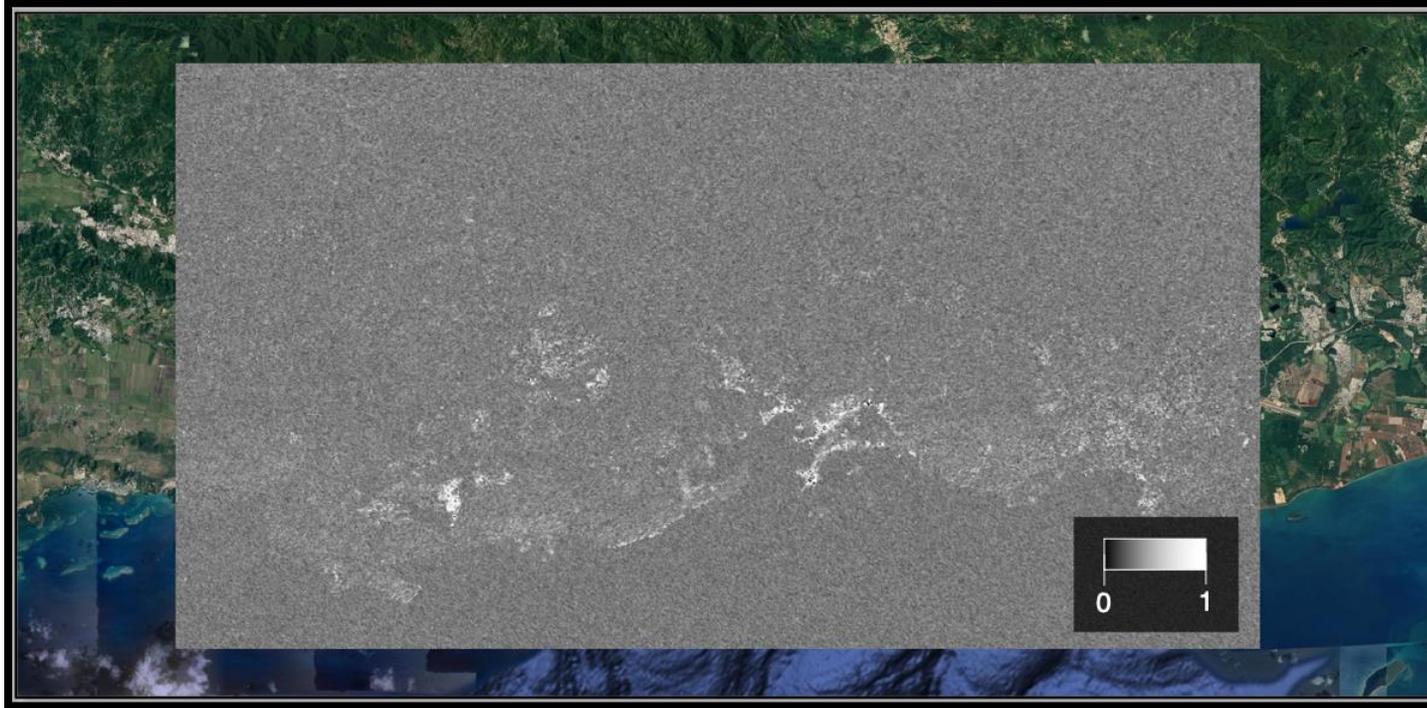


**DPM3**: 30m resolution, covered the towns of Atsuma and Abira, generated by ARIA team using the SAR images from the ALOS-2 satellites of the Japan Aerospace Exploration Agency



## Example Results – A more difficult case

The 2020 Puerto Rico earthquake struck the southwest area of Puerto Rico on January 7, 2020, at 4:24 am (AST) by a Mw 6.4 earthquake

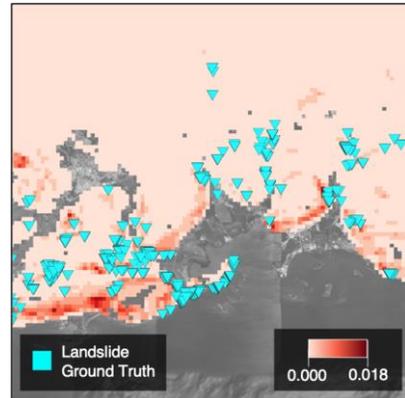


**DPM2**: 30m resolution, covered the towns of Atsuma and Abira, generated by ARIA team using the SAR images from the Copernicus Sentinel-1 satellites of the European Space Agency

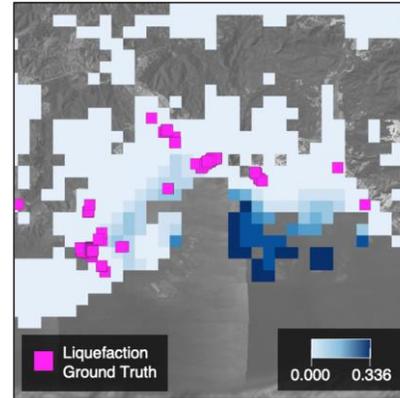
# Results

Landslide

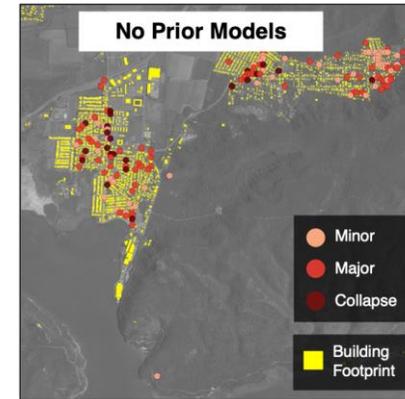
Prior



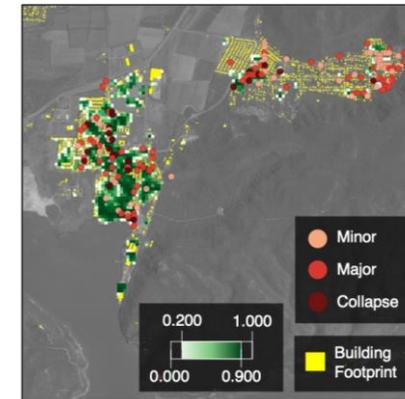
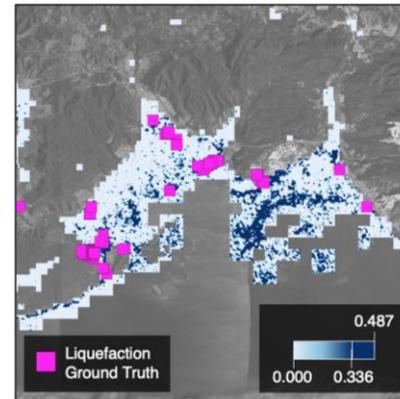
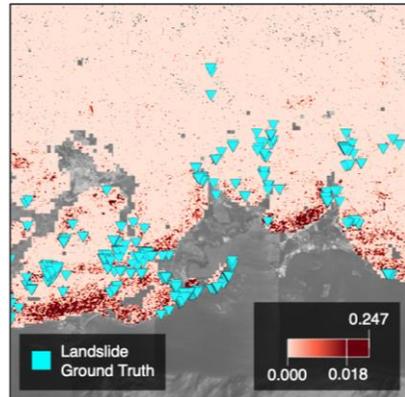
Liquefaction



Building Damage



Our model



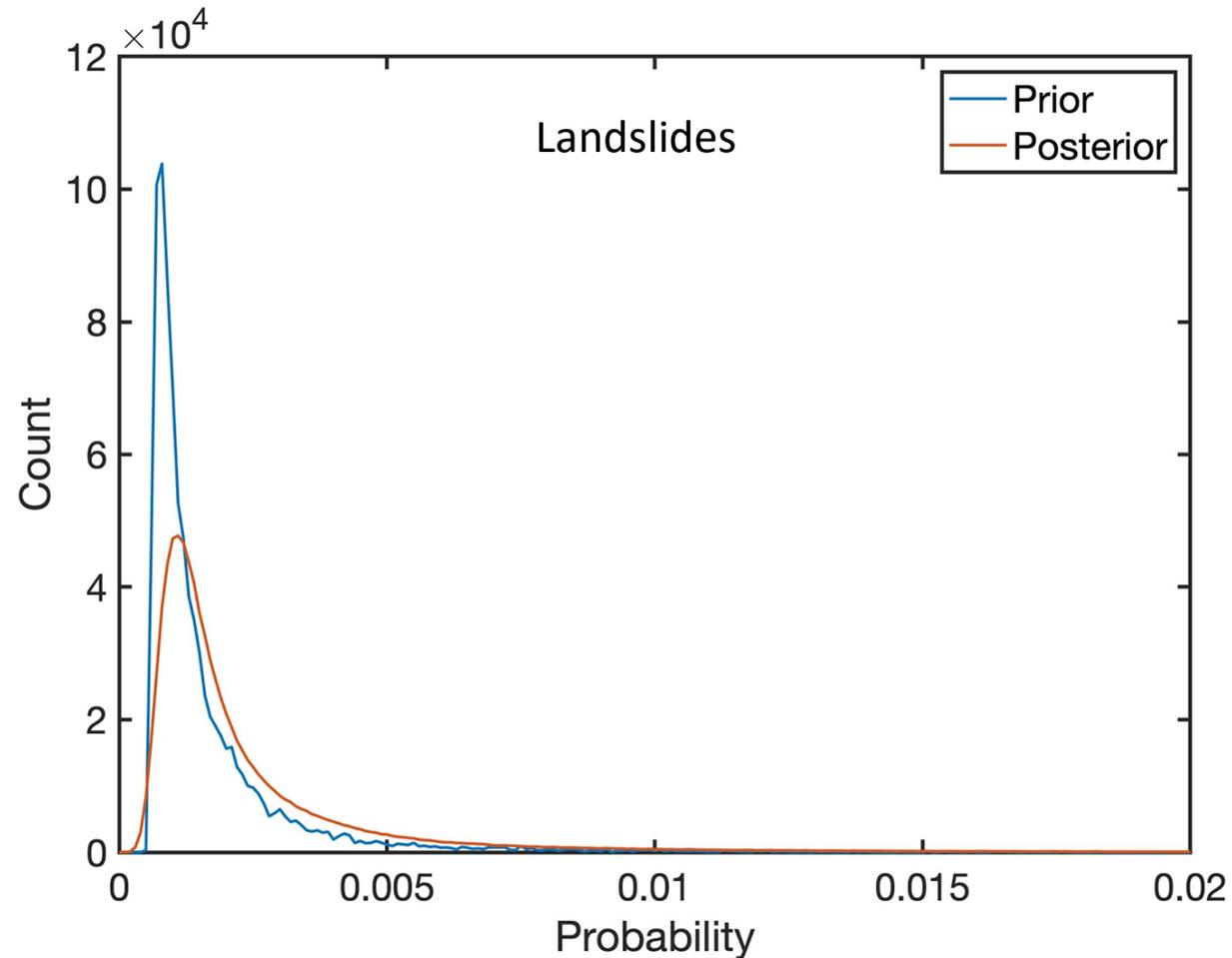
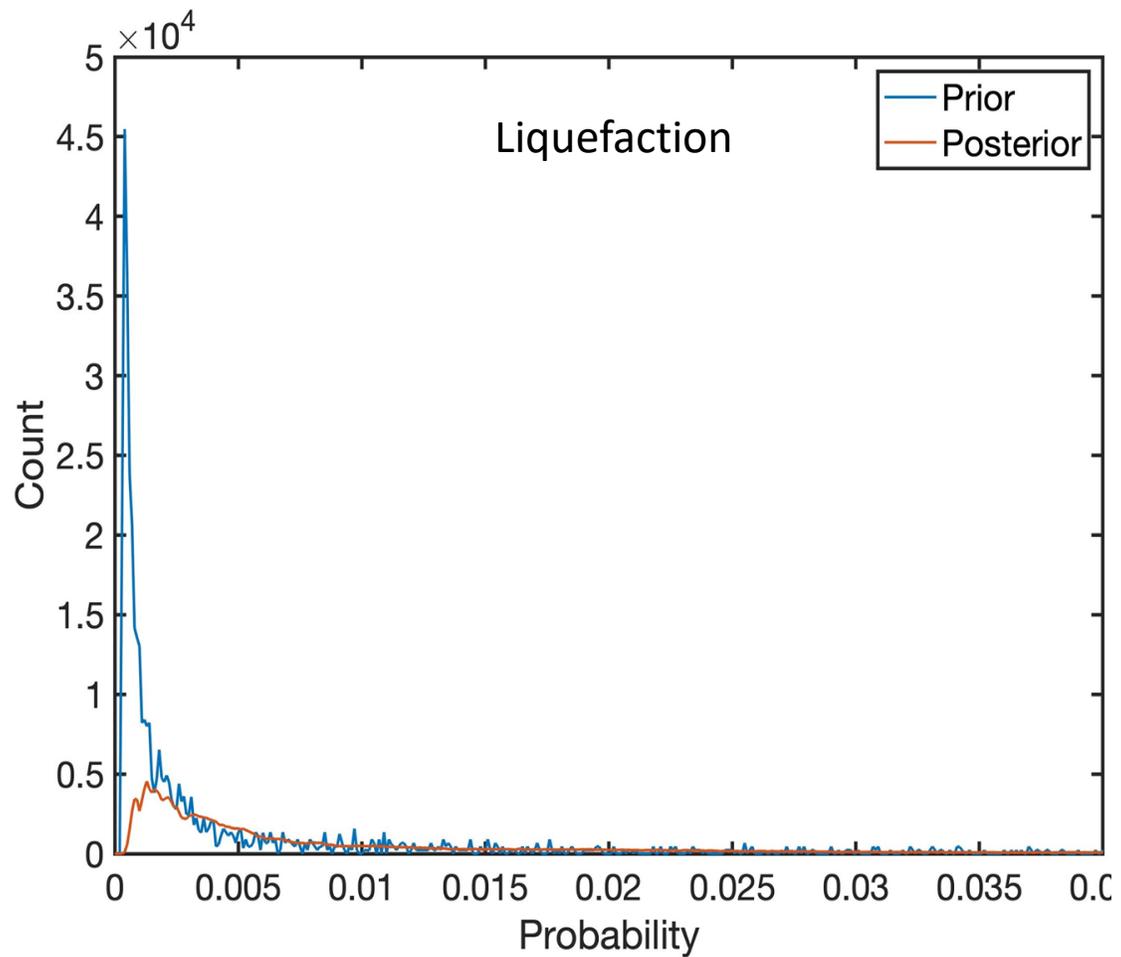
*Cross-entropy loss:*  
*Prior: 0.0238*  
*Posterior: 0.0175*  
*AUC:*  
*Prior: 90.36 %*  
*Posterior: 90.83%*

*Cross-entropy loss:*  
*Prior: 0.0301*  
*Posterior: 0.0095*  
*AUC:*  
*Prior: 82.87 %*  
*Posterior: 90.49%*

*Binary-class AUC:*  
*Prior: 69.50 %*  
*Posterior: 92.36%*

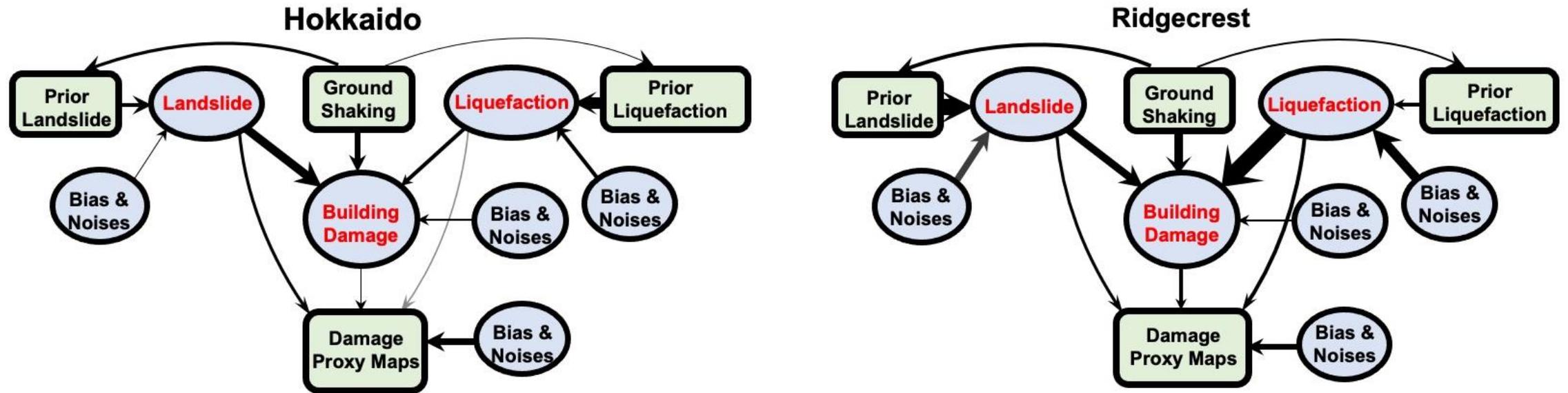
# Distribution of Posterior & Prior over the map

(posterior has fewer low-probability areas)



# Results

Causality quantification for different events to reveal the causation mechanisms



## ***Ongoing efforts ...***

- Improvements to *a priori* ground failure models (work in progress)
- Implement *a priori* building damage models (PAGER semi-empirical models)
- Testing approach on more earthquake datasets (but need: good DPM, good ShakeMap, building damage data, and digital GF datasets)
- Update the causal graphical model with incoming ground truth observations

# Quantifying & Reducing Uncertainties

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1. Improve prior models

2. Update prior models on-the-fly by adding ground truth observations

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# Civil Engineer

DEPARTMENT OF THE INTERIOR  
[Geological Survey](#)

The **USGS ShakeCast Team** is seeking app's for a Civil Engineer/ Programmer at the National Earthquake Information Center, in **Golden, Colorado**

[Summary](#)[This job is open to](#)[Duties](#)[Requirements](#)[How you will be evaluated](#)[Required documents](#)[How to Apply](#)

## Summary

### What General Information Do I Need To Know About This Position?

The **government-wide** direct hire authority for **Civil Engineer/0810** is being used to fill this position.

GS-11 Salary: \$72,995 (Step 01) to \$94,889 (Step 10);

GS-12 Salary: \$87,491 (Step 01) to \$113,7473 (Step 10)

**NOTE: First time hires to the Federal Government are typically hired at the Step 01.**

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## Overview

[Help](#)

Job closed

### Open & closing dates

🕒 06/27/2022 to 07/25/2022

### Salary

\$72,995 - \$113,743 per year

### Pay scale & grade

GS 11 - 12

### Location

📍 Golden, CO

Few vacancies

Apply at USAJobs (<https://www.usajobs.gov/job/659923500>)  
or for more information contact David Wald ([wald@usgs.gov](mailto:wald@usgs.gov))