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# How Good are Next-Day Earthquake Forecasts? A Comprehensive Evaluation of Clustered Seismicity Models in California

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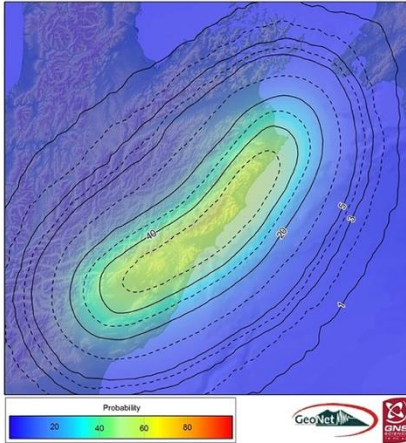
<sup>6</sup> Statewide California Earthquake Center, U.S.A.

39<sup>th</sup> General Assembly of the  
European Seismological Commission  
Corfu, September 2024

# Motivation

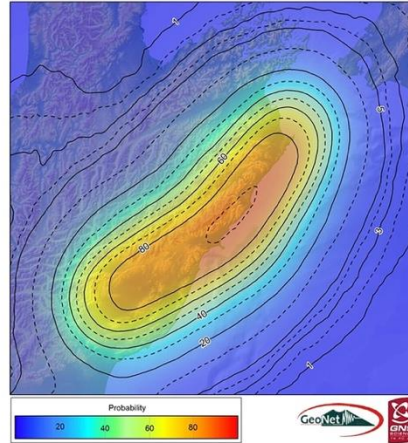
## New Zealand

Probability of damaging shaking (MM7) in the next 30 days  
As at 28/11/2016



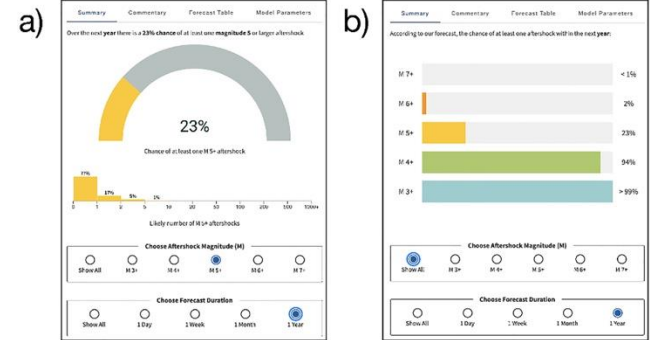
MM7 shaking corresponds with internal building damage, structural damage to a few weak buildings, and will be alarming to affected people

Probability of damaging shaking (MM7) in the next year  
As at 28/11/2016



MM7 shaking corresponds with internal building damage, structural damage to a few weak buildings, and will be alarming to affected people

## United States

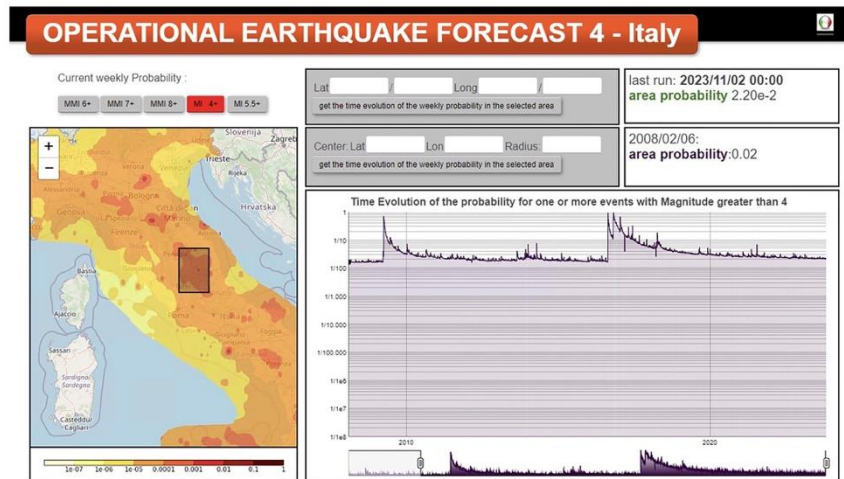


c)

| Magnitude (M) of aftershock | within 1 Day                      | within 1 Week                     | within 1 Month                 | within 1 Year                |
|-----------------------------|-----------------------------------|-----------------------------------|--------------------------------|------------------------------|
| M 7 or higher               | very low probability of 1 or more | very low probability of 1 or more | 1 in 3,000 chance of 1 or more | 1 in 500 chance of 1 or more |
| M 6 or higher               | 1 in 10,000 chance of 1 or more   | 1 in 3,000 chance of 1 or more    | 1 in 500 chance of 1 or more   | 2% chance of 1 or more       |
| M 5 or higher               | 1 in 1,000 chance of 1 or more    | 1 in 200 chance of 1 or more      | 2% chance of 1 or more         | 23% chance of 1 or more      |
| M 4 or higher               | 1% chance of 1 or more            | 7% chance of 1 or more            | 26% chance of 1 or more        | Expect about 3               |
| M 3 or higher               | 12% chance of 1 or more           | 56% chance of 1 or more           | Expect about 4                 | Expect about 43              |

The rate of aftershocks is expected to decline with time. However, the probabilities in the longer time windows are higher because the rates are being summed over a longer time period.

## Italy



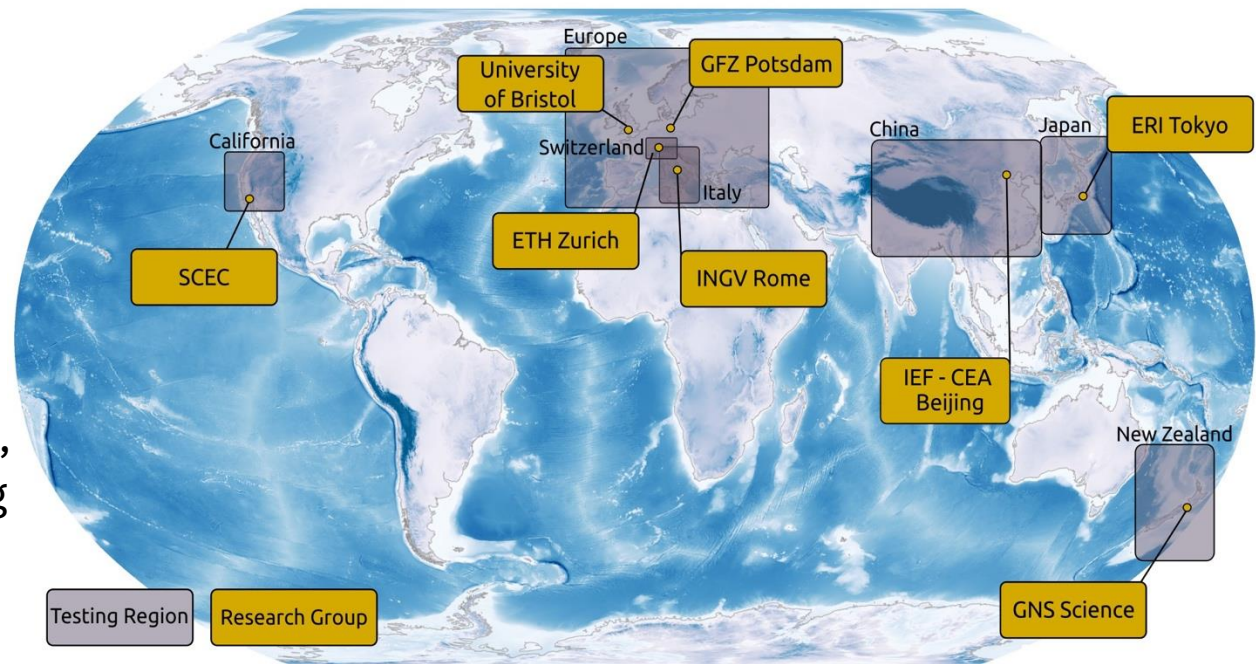
Mizrahi et al. (2024)

# CSEP experiments

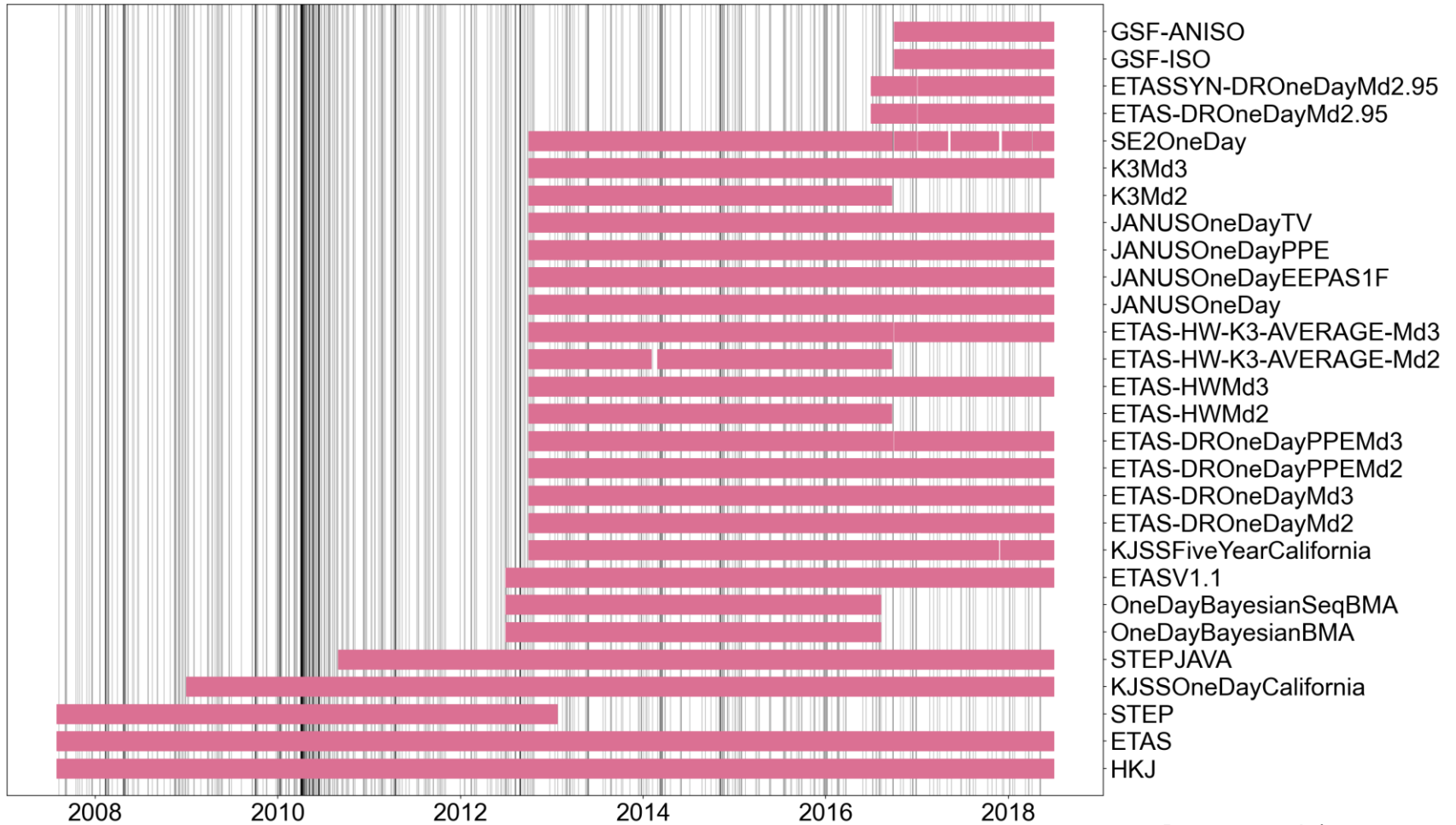
- ❖ Testing region
- ❖ Evaluation period
- ❖ Magnitude range
- ❖ Target earthquakes
- ❖ Testing methods

Starting in 2007, CSEP has managed testing centres in California, Japan, Italy, New Zealand, and China, hosting more than 440 models.

The main pillar of CSEP's approach is the prospective evaluation of seismicity models in fully reproducible and transparent forecasting experiments.



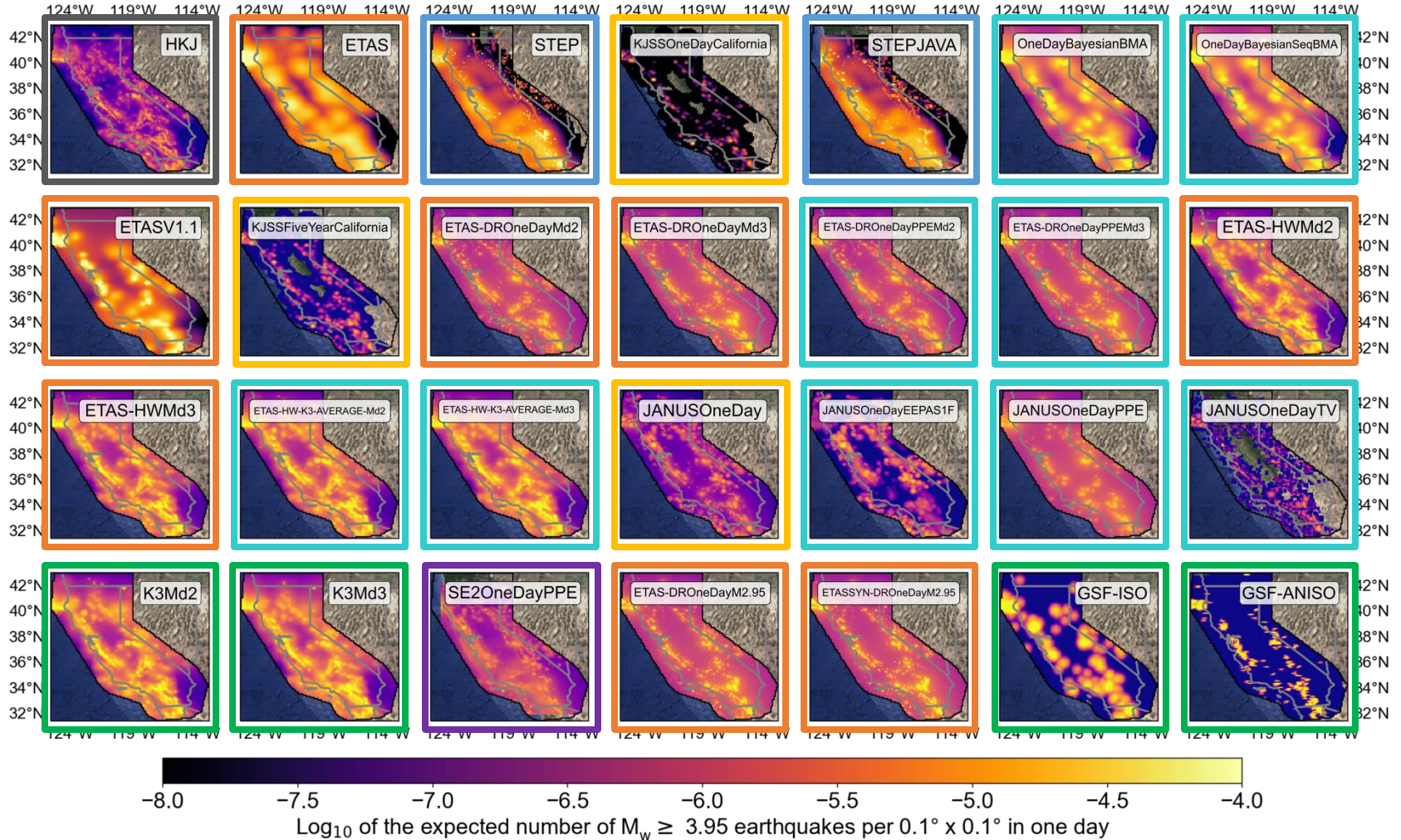
# Can we improve OEF?



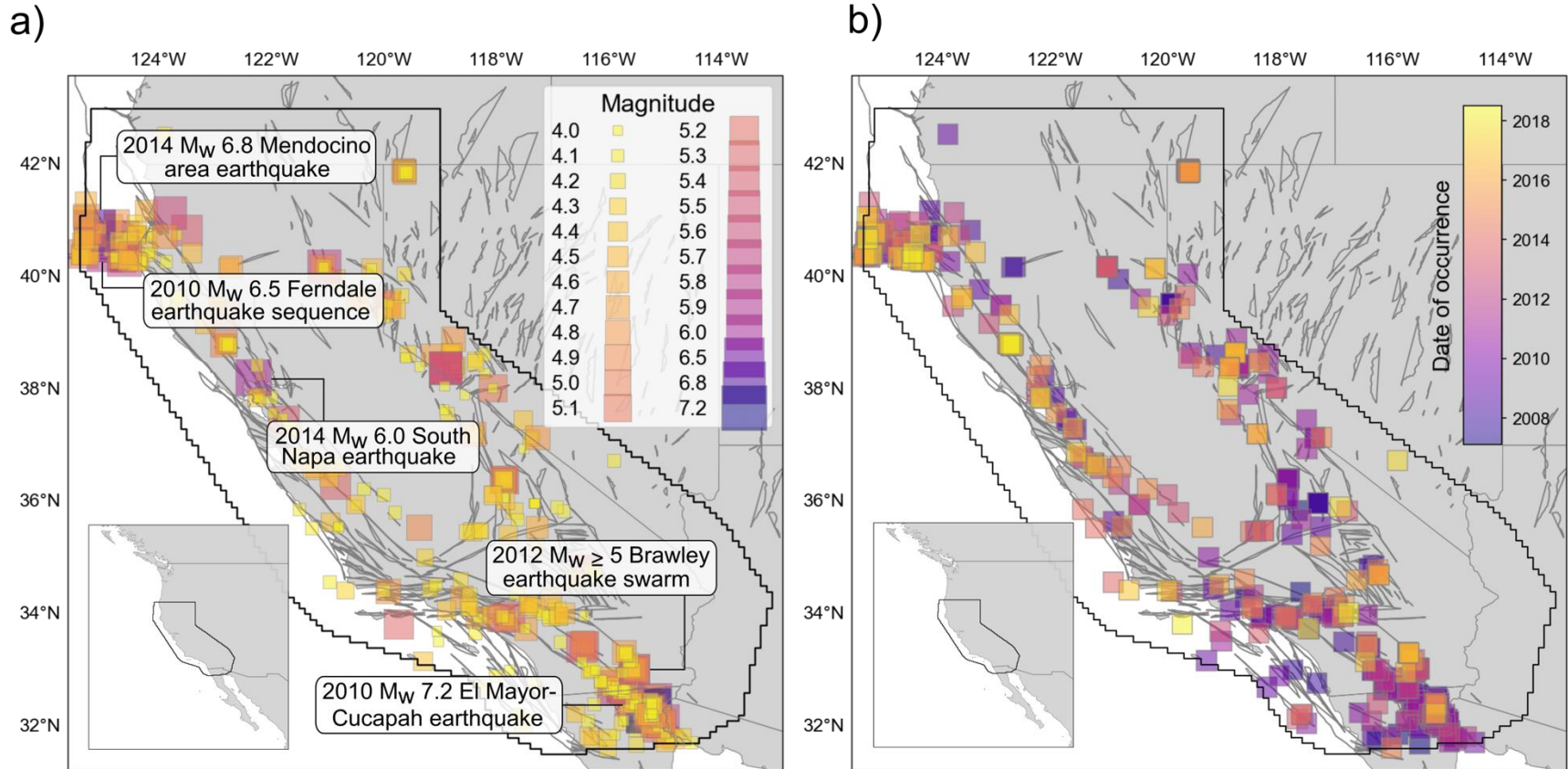
Bayona et al. in prep.



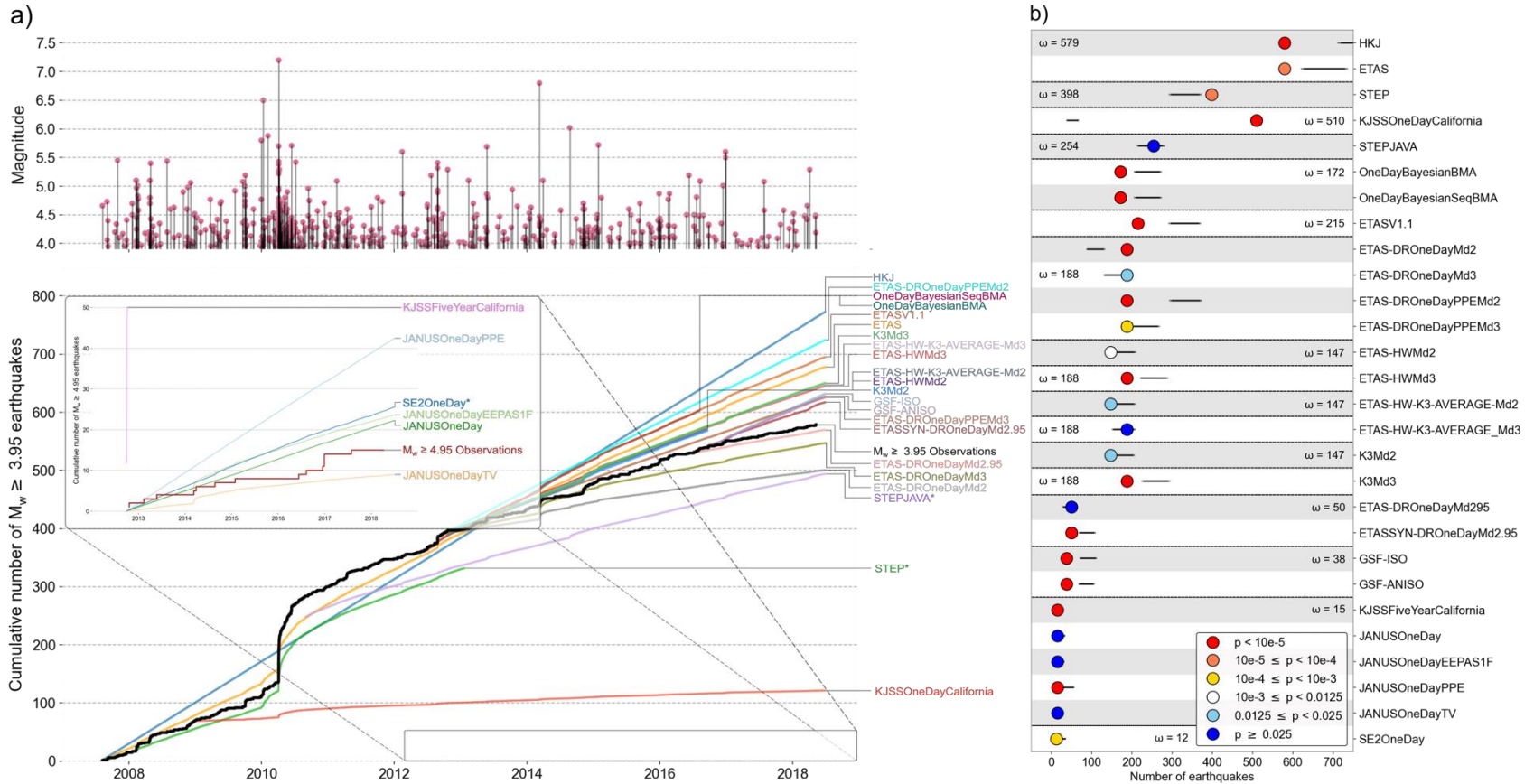
# Predictive pool of models



# Prospective dataset

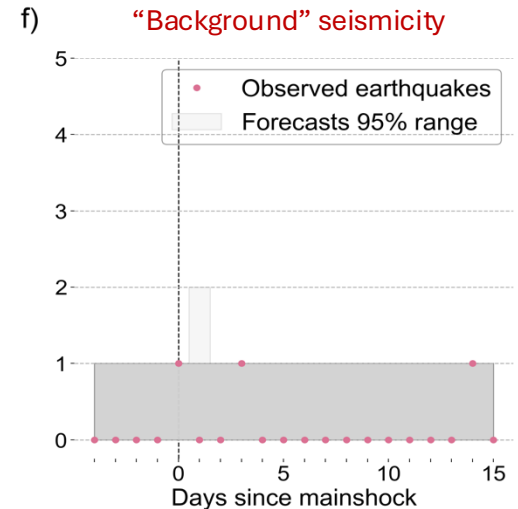
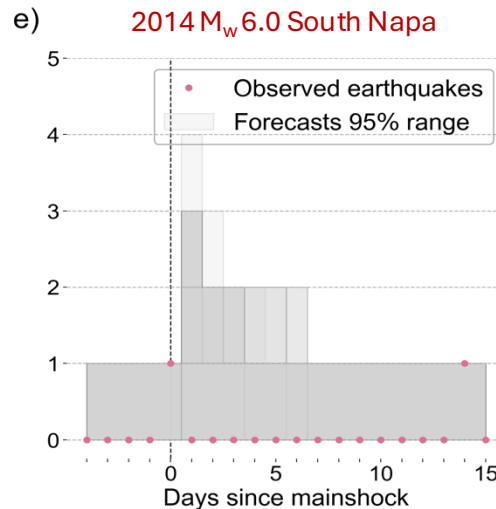
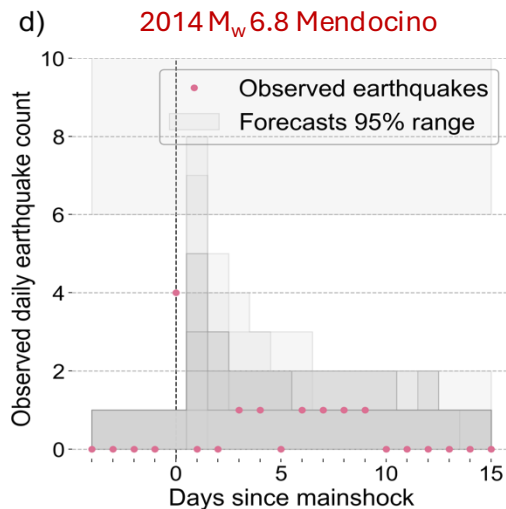
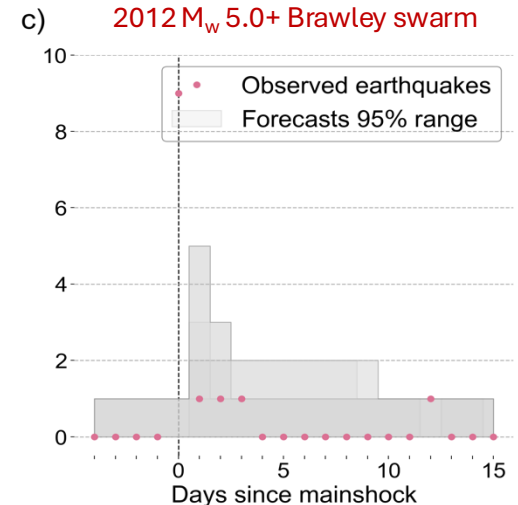
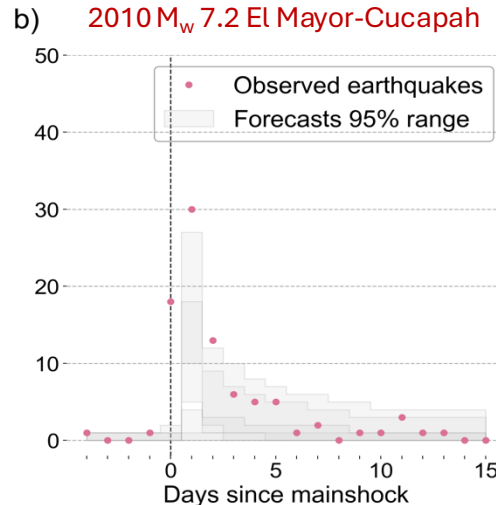
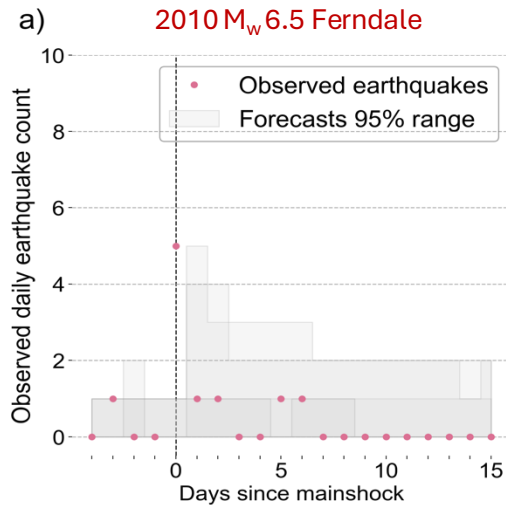


# Number test results





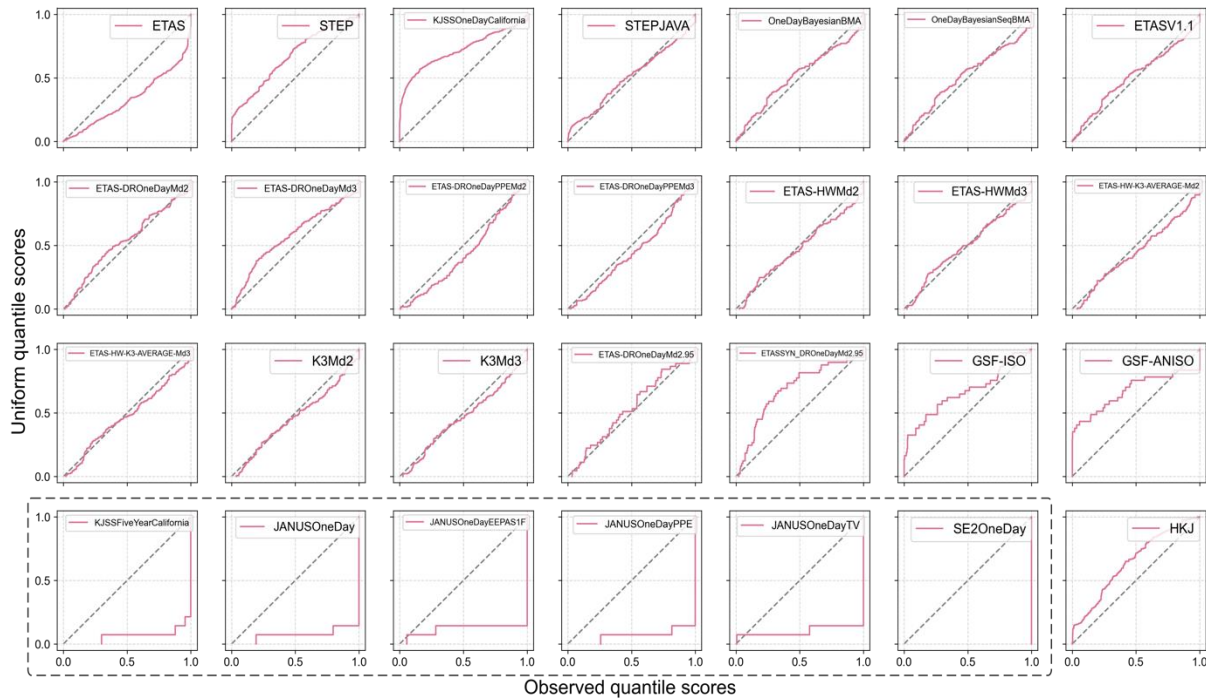
# How did the models perform daily?



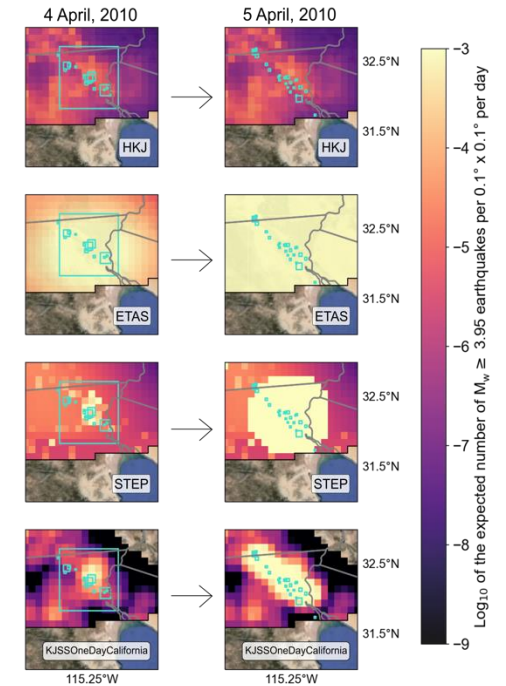


# Spatial test results

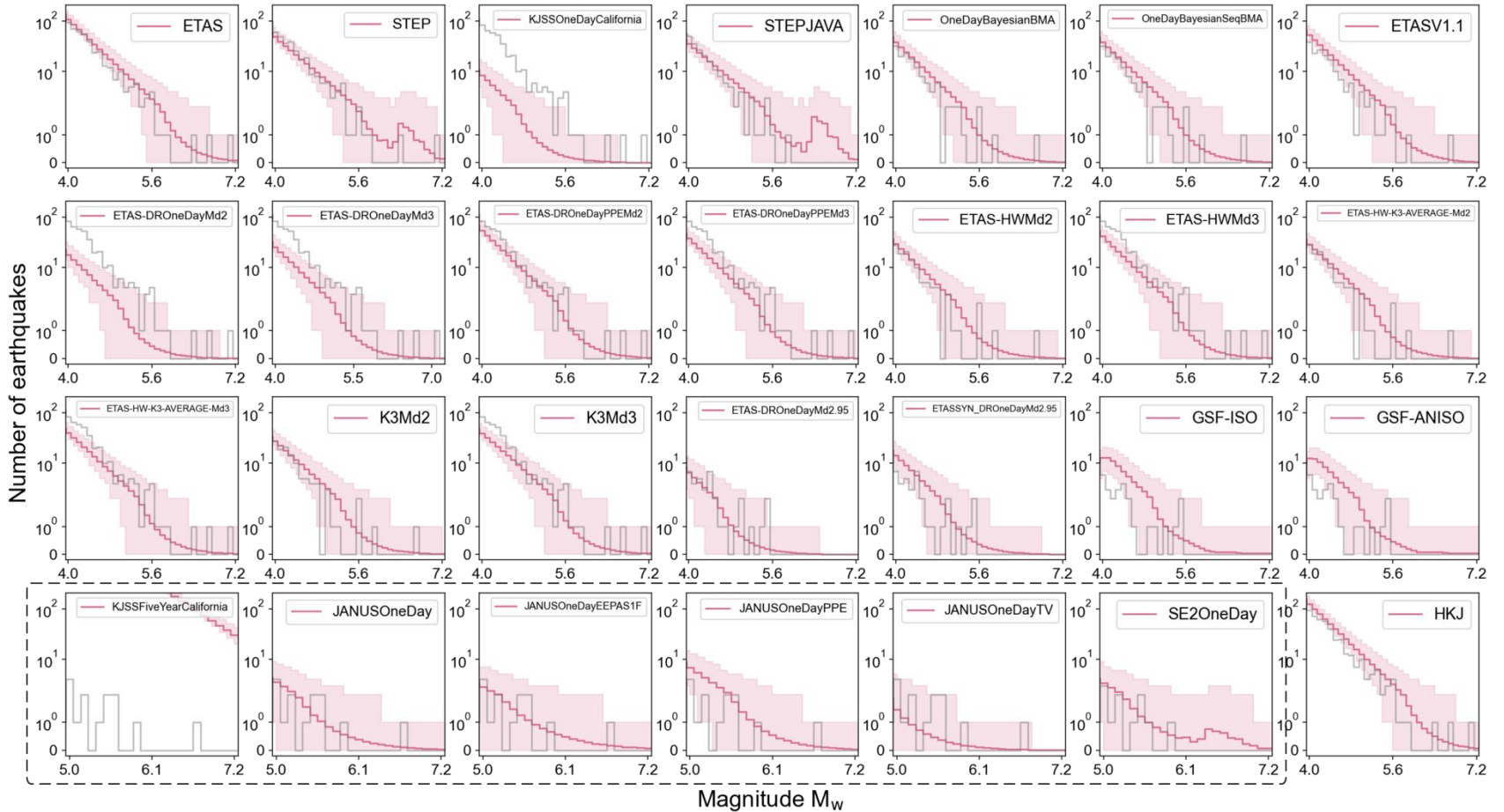
a)



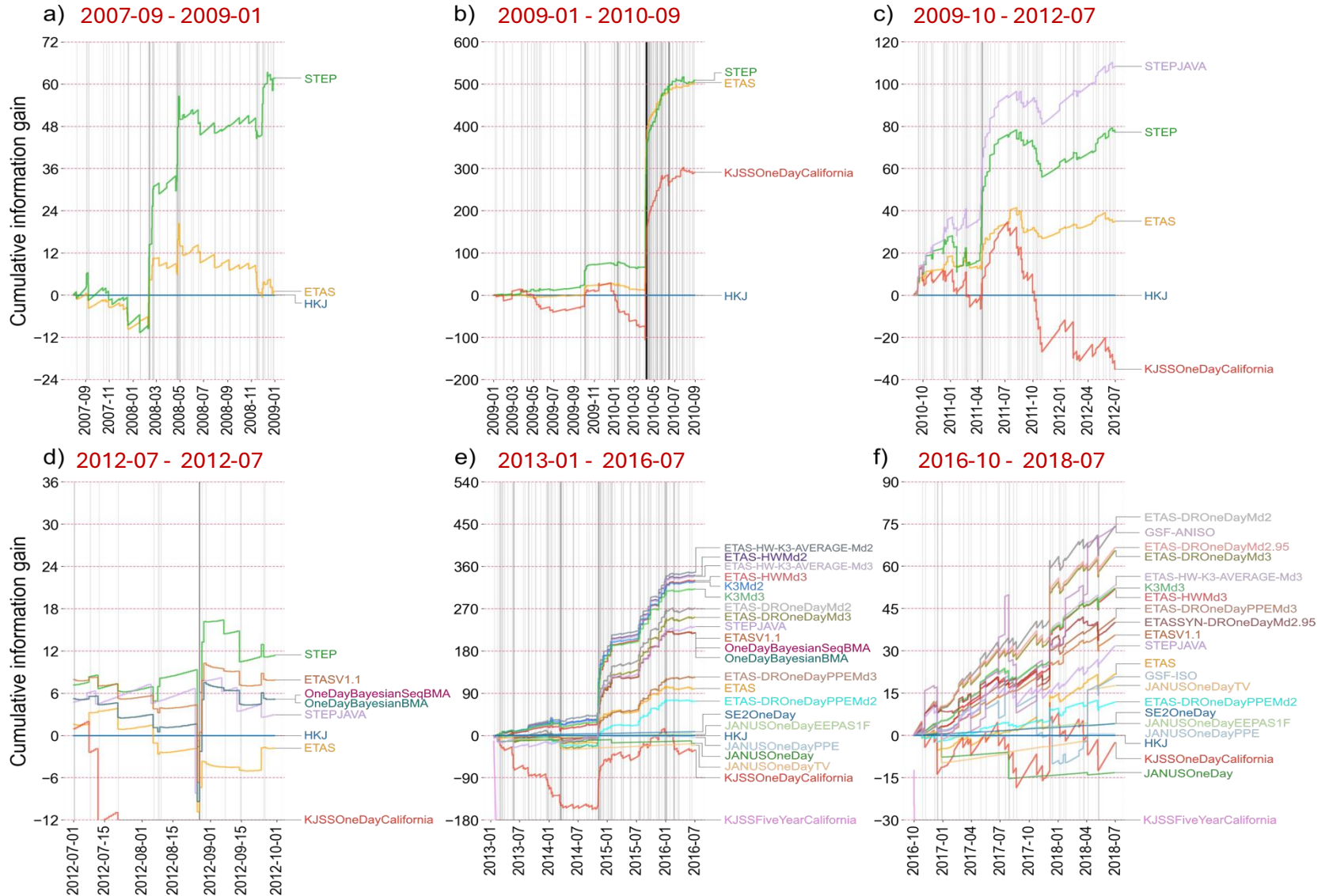
b)



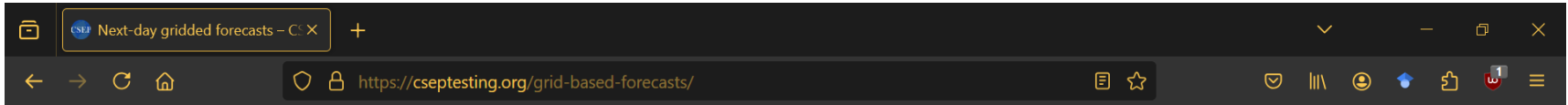
# Magnitude test results



# Comparative test results



# Data availability: cseptesting.org



## List of Models

| Model name    | Starting date   | End date        | Missing days | Min magnitude | Links   |
|---------------|-----------------|-----------------|--------------|---------------|---|
| ETAS          | 01 August 2007  | 30 August 2018  | 0            | 3.95          | 1. <a href="#">Description</a><br>2. <a href="#">Download</a> |
| STEP          | 01 August 2007  | 21 January 2013 | 0            | 3.95          | 1. <a href="#">Description</a><br>2. <a href="#">Download</a> |
| KJSSOneDay    | 01 January 2009 | 30 June 2018    | 0            | 3.95          | 1. <a href="#">Description</a><br>2. <a href="#">Download</a> |
| KJSSFiveYears | 01 October 2012 | 30 June 2018    | 15           | 4.95          | 1. <a href="#">Description</a><br>2. <a href="#">Download</a> |
| GSF_ISO       | 01 October 2016 | 30 June 2018    | 1            | 3.95          | 1. <a href="#">Description</a><br>2. <a href="#">Download</a> |
| GSF_ANISO     | 01 October 2016 | 30 June 2018    | 1            | 3.95          | 1. <a href="#">Description</a><br>2. <a href="#">Download</a> |





# Reproducibility package

Published September 16, 2022 | Version v2

Dataset Open

## Global and regional long-term M4.95+ seismicity forecasts undergoing prospective evaluation

Bayona, Jose A.<sup>1</sup>; Savran, William H.<sup>2</sup>; Iturrieta, Pablo<sup>3</sup>; Gerstenberger, Matthew C.<sup>4</sup>; Marzocchi, Warner<sup>5</sup>; Werner, Maximilian J.<sup>1</sup>

Show affiliations

Contains a stationary M5.95+ seismicity forecast derived from the Global Earthquake Activity Rate (GEAR1) model of Bird et al. (2015) and nineteen time-invariant M4.95+ earthquake forecasts participating in forecast experiments conducted by the Collaboratory for the Study of Earthquake Predictability (CSEP) in California, New Zealand, and Italy. Ten additional forecast files are included to properly perform comparative tests.

Earthquake rates are expressed as number of M4.95+ earthquakes per 0.1° cell per year. Forecasts are stored in tab separated values files with the following fields (the first row is shown as an example):

| lon_min | lon_max | lat_min | lat_1 | depth_0 | depth_1 | mag_0 | mag_1 | rate       | flag |
|---------|---------|---------|-------|---------|---------|-------|-------|------------|------|
| -125.4  | -125.3  | 40.1    | 40.2  | 0.0     | 30.0    | 4.95  | 5.05  | 5.8499e-04 | 1    |

The data, forecasts, and tests are described in detail in the following publications and the references contained therein:

Bayona, J.A., Savran, W.H., Iturrieta, P., Gerstenberger, M.C., Marzocchi, W., Schorlemmer, D., and Werner, M.J., Are Regionally Calibrated Seismicity Models more Informative than Global Models? Insights from California, New Zealand, and Italy. *in review*.

Bayona, J.A., Savran, W.H., Rhoades, D.A. and Werner, M.J., 2022. Prospective evaluation of multiplicative hybrid earthquake forecasting models in California. *Geophysical Journal International*, 229(3), pp.1736-1753.

Bird, P., Jackson, D.D., Kagan, Y.Y., Kreemer, C. and Stein, R.S., 2015. GEAR1: A Global Earthquake Activity Rate Model Constructed from Geodetic Strain Rates and Smoothed Seismicity. *Bulletin of the Seismological Society of America*, 105(5), pp.2538-2554.

Marzocchi W, Schorlemmer D, Wiemer S. Preface. *Ann. Geophys. [Internet]*. 2010 Nov;5 [cited 2022 Sep 16];53(3):III-VIII. Available from: <https://www.annalsofgeophysics.eu/index.php/annals/article/view/4851>

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Version v2 10.5281/zenodo.7116221 Sep 16, 2022

Version v1 10.5281/zenodo.7086053 Sep 16, 2022

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# Take-home messages

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Most models provide **cumulative earthquake counts** that are **nearly consistent** with the observations.

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Most models provide **spatial forecasts** that are **consistent** with the spatial distribution of epicenters.

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Most models provide **frequency-magnitude** distributions that are **nearly consistent** with the observations.

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Models that use more **small earthquakes** are more **informative**.

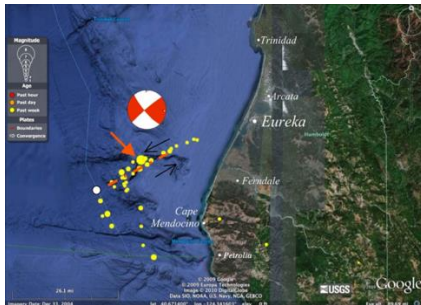
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**Newer models** display **better performance** with time.

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These test results may be useful to **advance OEF** in California and other seismically active regions.

# What did we learn about the earthquakes?



Storesund et al. (2011; GEER report)

M 6.8 - 77 km WNW of Indianola, California

2014-03-10 05:18:13 (UTC) | 40.827°N 125.134°W | 16.4 km depth

Moment Tensor

View all moment-tensor products (6 total)

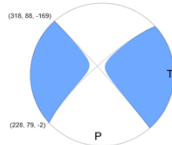
Contributed by NC<sup>1</sup> last updated 2017-03-03 10:14:05 (UTC)

<sup>1</sup> The data below are the most preferred data available

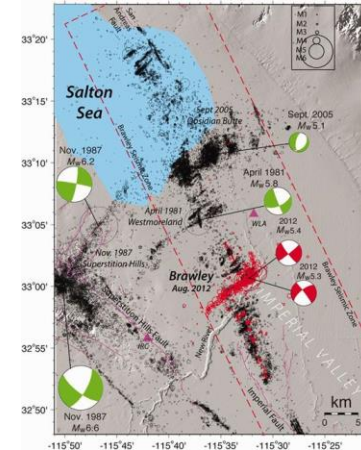
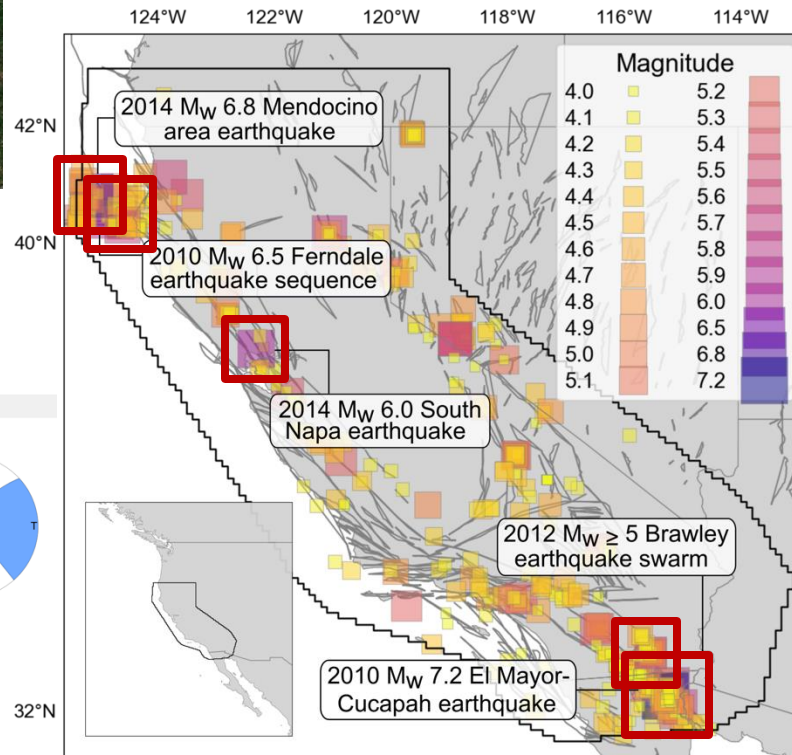
<sup>2</sup> The data below have been reviewed by a scientist

Moment Tensor (Mw)

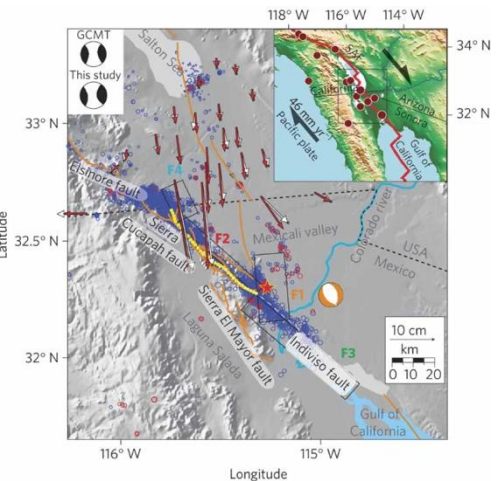
|               |               |
|---------------|---------------|
| Moment        | 1.999e+13 N·m |
| Magnitude     | 6.80 Mw       |
| Depth         | 16.0 km       |
| Percent DC    | 95%           |
| Half Duration | -             |
| Catalog       | NC            |



USGS

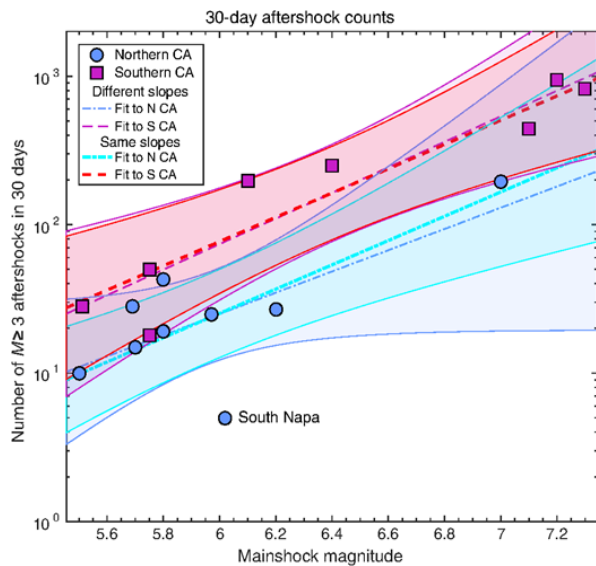


Hauksson et al. (2011; SRL)

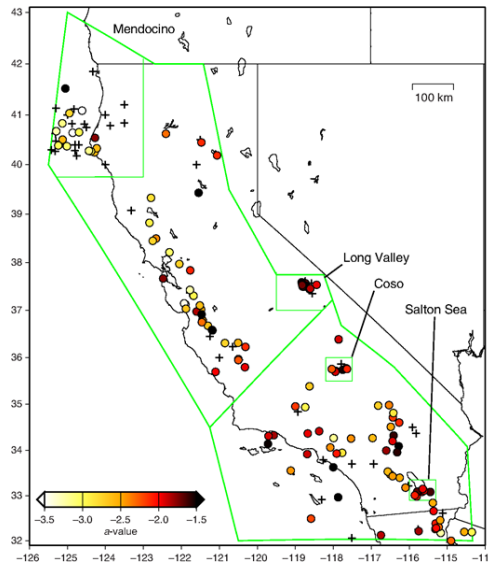


Wei et al. (2011; Nat. Geos.)

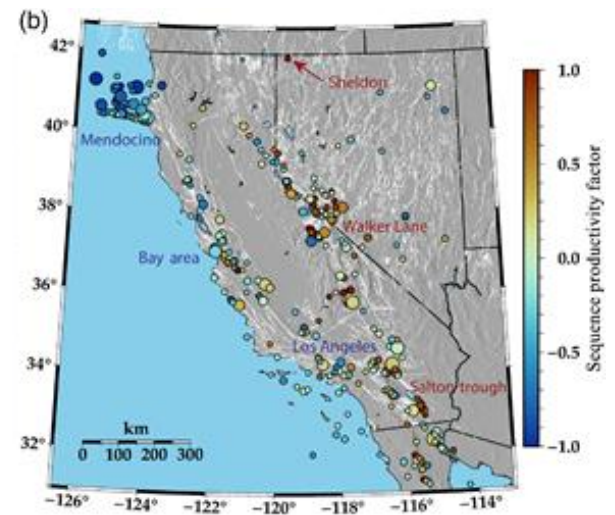
# What did we learn about the earthquakes?



Llenos & Michael (2017; SRL)



Hardebeck et al. (2017; SRL)



Trugman & Ben-Zion (2023; TSR)



# Testing methods



$$\Lambda_1 = \{1,4,3,2\} \rightarrow \{0.1, 0.5, 0.8, 1.0\}$$

$$\Lambda_2 = \{2,1,3,4\} \rightarrow \{0.2, 0.3, 0.6, 1.0\}$$

