

https://doi.org/10.1038/s43247-024-01460-1

# Reduced seismic activity after mega earthquakes

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Yongwen Zhang 🕲 <sup>1,2,3,4</sup> 🖂, Maor Elbaz 🕲 <sup>2,4</sup>, Shlomo Havlin 🕲 <sup>2</sup> & Yosef Ashkenazy 🕲 <sup>3</sup>

Mainshocks are often followed by increased earthquake activity (aftershocks). According to the Omori-Utsu law, the rate of aftershocks decays as a power law over time. While aftershocks typically occur in the vicinity of the mainshock, previous studies have suggested that mainshocks can also trigger earthquakes in remote locations, beyond the range of aftershocks. Here we analyze the rate of earthquakes that occurred after mega-earthquakes (with a magnitude of 7.5 or higher) and show that there is a significantly higher occurrence of mega-earthquakes that are followed by reduced activity beyond a certain distance from the epicenter compared to the expected frequency; the results are based on statistical tests we developed. However, the remote earthquake rate after the strongest earthquakes (magnitude  $\geq$ 8) can also be significantly higher than the expected rate. Comparing our findings to the global Epidemic-Type Aftershock Sequence model, we find that the model does not capture the above findings, hinting at a potential missing mechanism. We suggest that the reduced earthquake rate is due to the release of global energy/tension after substantial mainshock events. This conjecture holds the potential to enhance our comprehension of the intricacies governing postseismic activity.

Earthquakes pose a significant and perilous threat to humanity, given their highly destructive nature. While they are complex spatiotemporal phenomena, several empirical laws govern their behavior. Notable among them are the Gutenberg-Richter law<sup>1</sup>, which describes the exponential decay of earthquake magnitude distribution, and the Omori-Utsu law<sup>2,3</sup>, which elucidates the power-law decay of aftershock rates over time. Additionally, various scaling and power laws have been established concerning the distribution of waiting times between earthquakes<sup>4–8</sup>. Extensive research has been conducted on these laws, providing insights into earthquake activity models such as the Epidemic-Type Aftershock Sequence (ETAS) model<sup>9</sup>.

Researchers have been unable to identify definitive precursors that can be utilized to forecast the occurrence of large earthquakes in advance<sup>10</sup>. However, the clustering of aftershocks suggests that earthquake timing is not entirely random<sup>3,11</sup>. Moreover, a previous study demonstrated that consecutive interevent earthquake intervals exhibit correlated behavior rather than randomness. Specifically, shorter (longer) interevent intervals have a higher likelihood of being followed by shorter (longer) interevent intervals<sup>12</sup>. Furthermore, the application of the Detrended Fluctuation Analysis (DFA) to interevent interval time series has revealed the presence of long-range (power-law) correlations and other memory measures within earthquake catalogs<sup>13,14</sup>. In their research, refs. 7,8 studied the lagged interevent times and distances and found that there are significant correlations for short-time lags, but weaker correlations for longer time lags. From a different perspective, previous studies have indicated that the occurrence rate of seismic events (foreshocks) tends to increase prior to a mainshock<sup>15-22</sup>, following the so-called "inverse Omori law" although this observation is not as robust as the Omori-Utsu law.

Another crucial aspect of earthquakes pertains to the mechanisms underlying their spatial propagation. Strong earthquakes often trigger a series of subsequent aftershocks in their vicinity due to increased static Coulomb stress<sup>23–25</sup>. However, the phenomenon of remote triggering, where seismic waves from a mainshock trigger earthquakes thousands of kilometers away, has been observed and explained by dynamic stress triggering <sup>26–28</sup>. For instance, following the 8.6 Mw East Indian Ocean mainshock on April 11, 2012 (accompanied by a powerful 8.2 Mw aftershock), there was a significant global increase in the rate of earthquakes in remote areas<sup>29</sup>. Nevertheless, other studies have found no evidence supporting such remote triggering<sup>30,31</sup>. Moreover, a different study noted a decrease in earthquake activity in remote locations a few hours after a mainshock, attributing this decline to reduced detection capabilities caused by seismic waves<sup>32</sup>. From a physical standpoint, the global occurrence rate beyond the immediate aftershock zone could decrease following large

<sup>1</sup>Data Science Research Center, Faculty of Science, Kunming University of Science and Technology, Kunming, China. <sup>2</sup>Physics Department, Bar-Ilan University, Ramat-Gan, Israel. <sup>3</sup>Department of Environmental Physics, Ben-Gurion University of the Negev, BIDR, Midreshet Ben-Gurion 8499000, Israel. <sup>4</sup>These authors contributed equally: Yongwen Zhang, Maor Elbaz. — e-mail: zhangyongwen77@gmail.com

earthquakes due to energy and stress release. This relaxation effect can be likened to the suppression of short waiting times observed in the Abelian sandpile model during a massive avalanche<sup>33</sup>.

The objective of this study is to examine how the earthquake rate varies as a function of distance and time following mega-earthquakes. In order to achieve our objective, we have developed a statistical approach that enables us to measure the real occurrence of earthquakes after a mega-shock in comparison to a distribution of earthquake rates starting from randomly selected times. This is done while taking into account the same location, time window, and distance from the epicenter as the mega-earthquake. We statistically find that the earthquake rate proceeding mega-earthquakes and beyond a critical distance of about 100 km from the epicenter is significantly lower than the mean rate at the location of the mega-earthquakes. We propose that this critical distance can serve as a measure for determining the extent of aftershocks. We also find that the strongest mega-earthquakes are followed by reduced remote earthquake activity or by enhanced remote earthquake activity.

#### Results

We utilized the comprehensive global earthquake catalog, between May 1979 and May 2023, setting a minimum magnitude threshold at 5.1 (for this value, the catalog can be regarded as complete; for details, see the Methods section). The distribution of earthquake magnitudes closely conforms to the Gutenberg-Richter law, exhibiting a slope of  $-1.068 \pm 0.017$  (Supplementary Fig. S1). The spatial distribution of the events included in the catalog is depicted in Fig. 1a. Seismic events primarily occur along the boundaries of tectonic plates, influenced by the movements and compression of the Earth's lithospheric plates.

We next consider earthquakes of exceptional magnitude, above or equal to 7.5, the common definition of mega-earthquakes<sup>34</sup>. Figure 1b depicts the geographical distribution of these mega-earthquakes, with prominent active regions including South America, Indonesia, and Japan. We demonstrate our analysis using the Chiapas earthquake, an 8.2 megaearthquake, which occurred on September 7, 2017; Fig. 1c shows its location. We analyzed the global earthquake occurrences (with magnitude  $m \ge 5.1$ ) subsequent to this mega-earthquake within a 5-day temporal window denoted as *T*, while excluding earthquakes within a radius (*R*) of 500 km from the mega-earthquake's epicenter. We find a total of eight such earthquakes that followed the Chiapas mega-earthquake; see Fig. 1c.

We next study whether the earthquake rate after this mega-earthquake is larger, smaller, or equal to the mean earthquake rate associated with the mega-earthquake's location. We show the results in Fig. 1d, which depicts the Probability Density Function (PDF) of the number of earthquakes that occurred farther than 500 km from the epicenter of the 8.2 Chiapas megaearthquake and within a time window of 5 days from randomly selected times. This PDF is utilized to create a null hypothesis concerning the rate observed after a mega-earthquake. If the observed rate falls within the PDF's confidence interval, typically between the 10% and 90% quantiles, then the null hypothesis is not rejected, and the rate is considered "normal." However, if the observed rate falls outside the confidence intervals, it is classified as either a low or high rate; see the Methods Section. Figure 1d depicts the 10% and 90% quantiles (the dashed black vertical lines), as well as the observed rate (the solid red vertical line), indicating that the observed subsequent rate of the 2017 Chiapas mega-earthquake is low, below the 10% quantile.

We next consider all the mega-earthquakes and study the earthquake rate that follows them. Figure 2a depicts, for each mega-earthquake, the actual count of ensuing earthquakes spanning a 5-day window (T) and exceeding a distance of 500 km (R) from the epicenter. Also plotted is the 10–90% interval, based on the surrogate data (Fig. 1d). Notably, certain mega-earthquakes exhibit counts falling below the 10% quantile, indicating reduced activity, while others surpass the 90% quantile, denoting increased activity (Fig. 2a).

The spatial distribution of these statistically significant megaearthquakes is displayed in Fig. 2b. It is apparent that the majority of these significant events are concentrated in the vicinity of active seismic zones. Additionally, mega-earthquakes followed by reduced activity outnumber those followed by increased activity. Quantitatively, the ratio, *r*, of mega-earthquakes followed by reduced activity is r = 0.194 (with uncertainty between 0.176 and 0.212 defined in Methods), while those followed by increased activity hold a ratio of r = 0.078 (with uncertainty between 0.077 and 0.079). Within the context of the null hypothesis, we would anticipate a ratio close to 0.1, as predicted by our chosen 10% and 90% quantiles. The discernible departure from this expected ratio highlights the statistical significance of the ratio pertaining to reduced activity.

Following the above, we study the dependence of the magnitude of the mega-earthquake on the corresponding ratio, *r*. Our analysis

Fig. 1 | Demonstration of the proposed statistical method. a Spatial distribution of global earthquakes with a magnitude larger than or equal to 5.1 between May 1979 and May 2023. b Same as (a) but for only mega-earthquakes with a magnitude larger than or equal to 7.5. c An example of the 2017 Chiapas earthquake with a magnitude 8.2 (red triangle) and its following events (circles) above a certain distance (i.e., 500 km, marked by the shaded dashed circle) and within a time window of 5 days. d Probability Density Function (PDF) of the number of events at distances >500 km from the location of the Chiapas earthquake and within 5 days for 104 realizations of the surrogate data (i.e., 104 realizations of randomly selected initial times). The dashed black vertical lines represent the 10% and 90% quantiles. The red line shows the observed number of earthquakes following the real 2017 Chiapas earthquake, which is below the 10% quantile. The solid black vertical line represents the median.



Fig. 2 | Significance of mega-earthquakes ( $m \ge 7.5$ ) and their spatial distribution. a The number of earthquakes n(T, R) in a time window of T = 5 days and beyond the distance R = 500 kilometers from the epicenter, following mega-earthquakes (colors represent their magnitudes). The gray shading indicates the 10% to 90% interval of the PDF of the number of events for the surrogate data (see Fig. 1d). **b** The spatial distribution of the mega-earthquakes shown in (**a**) that fall below the 10% quantile (red triangle) and above the 90% quantile (blue triangle).



#### Table 1 | The significant mega-earthquakes with magnitudes $m \ge 8.0$

Region/location	Date (dd/mm/yyyy)	Magnitude	Activity	n(T, R)	Percentile	
Kuril Islands	04/10/1994	8.3	Reduced*	10	9.2% (14.0%)	
Antofagasta	30/07/1995	8.0	Reduced	9	5.7% (9.3%)	
Colima-Jalisco	09/10/1995	8.0	Reduced	9	5.1% (8.7%)	
New Ireland	16/11/2000	8.0	Reduced 7		2.1% (4.0%)	
Solomon Islands	06/02/2013	8.0	Reduced 8		3.2% (5.6%)	
Illapel, Chile	16/09/2015	8.3	Reduced	7	1.5% (3.0%)	
Chiapas, Mexico	08/09/2017	8.2	Reduced	8	3.4% (5.4%)	
Peru	05/26/2019	8.0	Reduced	9	4.9% (8.6%)	
Bolivia	09/06/1994	8.2	Increased	29	93.6% (94.6%)	
Tokachi	25/09/2003	8.2	Increased	29	94.6% (95.2%)	
Tasman Sea	23/12/2004	8.1	Increased	176	100% (100%)	
Sumatra, Andaman	26/12/2004	9.1	Increased	123	100% (100%)	
Kuril Islands	15/11/2006	8.3	Increased*	25	89.2% (90.8%)	
Peru	15/08/2007	8.0	Increased	28	93.1% (94.1%)	
Fiji	19/08/2018	8.2	Increased	35	97.4% (97.7%)	
Kermadec Islands	04/03/2021	8.1	Increased	30	94.9% (95.6%)	

For a time window of T = 5 days and distance from the epicenter farther than R = 500 km. The last column shows the percentile of the number of events for the surrogate data smaller (smaller and equal) than the real number.

'\*' indicates marginal counts.

(Supplementary Fig. S2) reveals that no definitive correlation exists between the mega-earthquake's magnitude and the resultant ratio. For most magnitudes, the earthquake rate after mega-earthquakes is reduced, i.e., the ratio of mega earthquakes that fall below the 10% quantile is significantly >0.1, while the ratio of mega-earthquakes that fall above the 90% quantile is significantly <0.1. Yet, the strongest mega-earthquakes ( $m \ge 8.0$ ) result in both ratios being significantly larger than the expected 0.1 ratio (Supplementary Fig. S2), suggesting that such mega-earthquakes can either trigger long-distance worldwide earthquakes or lead to reduced worldwide seismic activity; see Table 1 for details regarding mega-earthquakes that were followed either by significantly reduced earthquake activity or by significantly increased earthquake activity. The limited number of mega earthquakes with magnitude  $m \ge 8.0$  (i.e., the full circles under the dashed line in Supplementary Fig. S1) can increase the uncertainty of the reported results.

Next, we explore the dependence of the ratio of mega-earthquakes that fall below (above) the 10% (90%) quantile as a function of both the distance from the epicenter R (from 10 to 8000 km) and the time window T (from 3 to 60 days). We first show these ratios as a function of the distance from the epicenter R of the mega-earthquakes for different time windows T (Fig. 3a–d). The effect of aftershocks is noticeable close to the mega-

earthquakes' epicenters ( $R \leq 250$ ) km, where the ratio is well off the expected 0.1 ratio, indicating significantly increased earthquake activity after the mega-earthquakes; i.e., the ratio of mega-earthquakes that fall below (above) the 10% (90%) quantile is much larger (smaller) than 0.1. For distances R > 500 km, the ratios are more or less stable, indicating reduced earthquake activity after mega-earthquakes (ratio of ~0.15 for ratios that fall below the 10% quantile in comparison to the expected 0.1 ratio). Notably, the ratio of mega-earthquakes that fall below the 10% quantile (red symbols in Fig. 3a–d) is more significant in comparison to the ratio of mega-earthquakes that fall above the 90% quantile (blue symbols in Fig. 3a–d).

The ratios of mega-earthquakes that fall below the 10% quantile and above the 90% quantile as a function of the distance, R, from the epicenter and time window T are presented in Fig. 3e, f respectively. It is noticeable from Fig. 3e that the ratio of mega-earthquakes that fall below the 10% quantile is not so sensitive to the time window T—this ratio is <0.1 for distances smaller than ~100 km and >0.1 otherwise, indicating enhanced earthquake activity after mega-earthquakes close to their epicenters (after-shocks) and reduced earthquake activity at farther distances. Notably, for time windows spanning 10–20 days, the ratio appears relatively smaller compared to both shorter and longer time windows, as depicted in Fig. 3e.

Fig. 3 | The ratio of mega-earthquakes that fall below the 10% quantile (red) and above the 90% quantile (blue) as a function of the distance from the epicenter, *R*, and time window *T*. a T = 3 days, b T = 5 days, c T = 25 days, and d T = 60 days. The dashed black horizontal line represents the ratio of the null hypothesis 0.1 and its uncertainty (gray shaded area). The dashed red vertical line indicates the approximate transition distance of 500 km. The error bars are related to the uncertainty of the ratio as described in the Methods Section. The ratio of mega-earthquakes that e fall below the 10% quantile and (f) above the 90% quantile as a function of the distance from the epicenter, *R* and time window *T*. The black contoured line represents the ratio 0.1.



Fig. 3f depicts the ratio of mega-earthquakes that fall above the 90% quantile. Here the ratio is far above the expected 0.1 ratio for close distances ( $R \leq 300$  km) and short time windows ( $T \leq 30$  days), indicating aftershock activity which decays with distance and time<sup>11,15</sup>. For large distances (R > 1000 km), the ratio drops below the expected 0.1 ratio, indicating reduced earthquake activity after mega-earthquakes for distances greater than ~1000 km. The transition across the 0.1 ratio is different for Fig. 3e (~100 km) and Fig. 3f (~1000 km), suggesting an aftershock extent for mega-earthquakes of 100–1000 km.

To strengthen the robustness of our findings, we repeat the analysis based on the 5% and 95% quantiles (in addition to the analysis of the 10% and 90% quantiles) and obtained similar results; see Supplementary Fig. S3 in comparison to Fig. 3. We also explore alternative metrics such as the median, average, and multiples of the average, as detailed in Supplementary Figs. S4–S7. Notably, all analyses consistently indicate a reduced earthquake activity after the occurrence of mega-earthquakes. Moreover, the results for different magnitude thresholds, 5.0 and 5.2, also show similar behavior in Supplementary Figs. S8 and S9.

The global ETAS model<sup>9,11,35,36</sup> was proposed to model the statistical properties (the spatiotemporal clustering) of the global earthquake catalog; see the Methods Section. We next compare the results described above, which are based on the real global catalog, to the synthetic catalog of the ETAS model. As expected, the spatial distribution of earthquakes generated by the ETAS model is similar to the spatial distribution of the observed earthquakes (Supplementary Fig. S10)—the earthquakes are mainly distributed along the

plates' boundaries. The ETAS model reproduces the generation of a sequence of aftershocks following a major seismic event, which serves as the foundation for interlinking earthquakes in the model. Notably, from a mechanistic standpoint, the ETAS model lacks any intrinsic processes that model instances of reduced seismic activity. In Fig. 4a and c (Fig. 4b and d), we juxtapose the ratio of mega-earthquakes that fall below (above) the 10% (90%) quantile, for the real global earthquake catalog and for the synthetic global ETAS model catalogs. As seen, the global ETAS model does not reproduce the reduced earthquake rate after mega-earthquakes for distances beyond several hundreds of km; see Fig. 4. This disparity arises due to the ETAS model's inability to replicate long-distance suppression of earthquake activity. However, for distances <500 km, the results based on the ETAS model synthetic catalogs align more closely with the results based on the real global catalog, attributed to the ETAS model's proficiency in representing aftershock clustering dynamics. The ETAS model's ratio of megaearthquakes that fall above the 90% quantile slightly surpasses the 0.1 ratio for distances greater than several hundreds of km, particularly for T = 5 days. This discrepancy arises due to the possibility of long-distance triggering in the ETAS model as outlined in Eq. (4) in the Methods Section; see<sup>9,11,3</sup>

We quantify the fraction of ETAS model realizations with a ratio exceeding that of the real data in a spatiotemporal context, as depicted in Fig. 4e and f. This ratio should be around 0.5 when the ETAS model results are comparable to the results of the real earthquake catalog. At short distances, nearly 90% of the ETAS realizations exhibit a ratio of reduced activity after mega-earthquakes, surpassing that of the real data (Fig. 4e). This discrepancy Fig. 4 | Comparison of the ratio based on the real global earthquake catalog and the synthetic ETAS model catalogs. The ratio of mega-earthquakes that fall below the 10% quantile for  $\mathbf{a}T = 5$  days and cT = 25 days as a function of distance from the epicenter R, for the real catalog (red symbols) and for the ETAS model synthetic catalog (cyan symbols). The ratio of mega-earthquakes that fall above the 90% quantile for (**b**) T = 5 days and  $\mathbf{d}T = 25$  days as a function of distance from the epicenter *R*. The dashed black horizontal line represents the ratio of the null hypothesis 0.1. The dashed red vertical line indicates the distance of 500 km. The ratio of the ETAS model is averaged over 50 independent realizations, and the shading indicates the standard deviation. The fraction of ETAS model realizations with a ratio exceeding that of the real data for the ratio of (e) mega-earthquakes that fall below the 10% quantile and f above the 90% quantile as a function of the distance from the epicenter, R, and time window T. A value of 0.5 indicates the similarity of the ETAS model to the real catalog---it is apparent that the ratios based on the ETAS model catalog are different than those of the real catalog, for the vast majority of R and T.



signifies that the ETAS model underestimates the rate of aftershocks in the proximity of the mega-earthquakes' epicenter. However, this underestimation does not significantly impact the results at greater distances. For extended distances, the fraction below 10% in Fig. 4e underscores the substantial difference in the ratio of reduced activity between the real data and the ETAS model. In contrast, the ratio of mega-earthquakes that fall above the 90% quantile for real data is considerably lower than the corresponding ratio from the ETAS model, as shown in Fig. 4f. Following the above, it is evident that the ETAS model fails to replicate the finding of reduced seismic activity following mega-earthquakes; this is since the model (Eq. (1)) does not include any mechanism of reduced activity after mega-earthquakes. It is possible that some discrepancies in the background rate (seismic activity in the absence of aftershocks) could be used to modify the ETAS model to better capture the observed reduced seismic activity following mega-earthquakes (see Supplementary Fig. S11).

#### Discussion

In this present study, we investigated the earthquake rate after the occurrence of mega-earthquakes (with a magnitude larger than or equal to 7.5). We developed several statistical methods to investigate whether mega-earthquakes are followed by reduced earthquake activity beyond a few hundred kilometers from the epicenter. Our analyses showed that there are significantly more such cases than expected. For smaller distances, increased earthquake activity is

observed after the occurrence of mega-earthquakes and is attributed to aftershocks. The transition distance of 100-1000 km is suggested to be a length scale of aftershocks following mega-earthquakes with a magnitude larger than or equal to 7.5. We compare the results based on the observed global catalog to the results obtained based on the global ETAS model artificial catalogs and find that the ETAS model fails to reproduce the results based on the observed earthquake catalog. Our results are different for magnitudes above 8.0 (for which we observed both increased and decreased activity after the earthquakes) and below 8.0 (for which we find significantly more mega-earthquakes that are followed by reduced activity). This should be verified more thoroughly as the total number of such mega-earthquakes ( $\geq$ 8.0) is not large (37 events).

The stress of faults could be transferred to remote areas along tectonic plate boundaries or fault systems after a mega-earthquake occurs<sup>37</sup>. We conjecture that the stress transfer can change the stress state of remote faults, either promoting or inhibiting seismic activity in remote areas. These areas may experience a period of seismic quiescence, characterized by reduced seismic activity, following a mega-earthquake. This quiescent period can be a natural response to the redistribution of stress. Our findings provide researchers with an opportunity to study the geological processes between remote areas responsible for stress accumulation and release in greater detail. This can enhance our understanding of seismic hazards and improve earthquake forecasting models.

	$\mu_0$ (day <sup>-1</sup> )	Α	α	р	c (days)	q	<i>D</i> (km)	γm
Parameters	2.8	1.38	1.70	1.06	0.0083	2.03	9.2	0.50

## Methods

#### Data

We analyzed seismic events with a magnitude of 5.1 or higher (Mw, Mb, and Ms) from May 1979 to May 2023 (44 years), using the United States Geological Survey (USGS) catalog<sup>38</sup>. There were 57,085 earthquakes within a depth range of 0-700 km, with 193 events having a magnitude of 7.5 or higher, and 37 events with a magnitude of 8 or higher. An earthquake catalog is considered to be complete when the histogram of the magnitudes of the earthquakes within the catalog follows closely the Gutenberg-Richter law. According to this law, the number of events with a magnitude greater than or equal to the magnitude threshold  $M_0$  is proportional to  $10^{bM_0}$ , where *b* is ~1. Figure S1 illustrates the Gutenberg-Richter law for magnitude threshold  $M_0$  of 5.0 and 5.1. The results affirm the catalog's completeness for both magnitude thresholds, 5.0 and 5.1 (see also ref. 39). To strengthen the results, our investigation is based on events with a magnitude equal to or >5.1.

#### Significance test

It is widely recognized that mega-earthquakes have the potential to initiate a cascade of aftershocks within a condensed temporal window and spatial region. Here we examined post-mega-earthquake seismic activity, focusing specifically on regions located beyond a defined distance from the epicenter, and within a designated time interval. The metric utilized is the count of earthquakes, denoted as n(T, R), occurring within a time window of T days and at a distance exceeding R km from the epicenter. Notably, earthquakes occurring within the spatial confines of the immediate aftershock region are disregarded.

The null hypothesis posits that the count n(T, R) and the timing of the mega-earthquake are statistically independent. Consequently, surrogate data is generated under the framework of this null hypothesis. For each mega-earthquake, a random initial time is selected from within the time span of the global catalog, while the geographical coordinates remain as for the original mega-earthquake; the latter constraint is aimed at avoiding possible spatial biases and geographic biases. The random selection of times is repeated many (10<sup>4</sup>) times, yielding the surrogate earthquake count denoted as n'(T, R). We then construct the PDF characterizing the distribution of n'(T, R). Using this PDF, we establish the significance levels at 10% for the lower bound and 90% for the upper bound. Should the actual count n(T, R) fall below (above) the 10% (90%) quantile, the mega-earthquake is considered to be a significant event, signifying that it was followed either by reduced or increased seismic activity, respectively.

#### The ratio of significant events

In the context of a sequence of mega-earthquakes, we determine the ratio  $r = N_s/N_{m\nu}$  where  $N_s$  corresponds to the count of significant mega-earthquakes (i.e., mega-earthquakes that fall below/above the 10%/90% quantile), and  $N_m$  denotes the overall count of mega-earthquakes. Notably, the quantile values of 10% and 90% may not be integral, necessitating the utilization of either the floor or ceiling integer values of these quantiles for comparison with the actual counts. Consequently, the count  $N_s$  may exhibit variability when these floor or ceiling integers are applied, thus introducing uncertainty into the derived ratio. This uncertainty is especially large for short time windows that result in a low number of counts after the mega-earthquakes. To mitigate this uncertainty, we adopt the average of the counts obtained using both the floor and ceiling integers for the calculation of the ratio. The associated error bar is established as the difference between these two counts.

#### The global ETAS model

The ETAS model, a space-time stochastic point process, is employed to simulate synthetic earthquake catalogs<sup>9,11</sup>. This model simulates seismic activities based on a rate function  $\lambda$ , defined at a location (*x*, *y*) and time *t*,

conditioned on the prior history *H<sub>t</sub>*:

$$\lambda(x, y, t | H_t) = \mu(x, y) + \sum_{t_i < t} k(M_i)g(t - t_i)f(x - x_i, y - y_i, M_i).$$
(1)

Here,  $t_i$  indicates the time of past events, and  $M_i$  represents their magnitude. The magnitude of each event ( $\geq M_0$  where  $M_0 = 5.0$  is the magnitude threshold of the catalog; the catalog can be truncated to get the higher magnitude threshold) is generated independently following the Gutenberg–Richter distribution with a magnitude-frequency parameter of b = 1. The background intensity  $\mu(x, y) = \mu_0 u(x, y)$  at location (x, y) is governed by the spatial PDF of background events denoted by u, estimated using the approach outlined in refs. 35,36.  $\mu_0$  stands for the background rate of seismic events on a global scale. We employ the thinning method of point process, as proposed by ref. 40, to generate the synthetic ETAS catalogs. By construction, the occurrence times of background events follow a Poisson process with the mean rate  $\mu_0$ . Their spatial locations are independently sampled according to the spatial PDF  $u(x, y)^{40}$ .

The magnitude-dependent triggering capability is formulated as

$$k(M_i) = A \exp(\alpha (M_i - M_0)), \qquad (2)$$

where *A* represents the rate of earthquakes at zero time lag, and  $\alpha$  denotes the productivity parameter. The temporal decay of triggered events is described by the Omori law,

$$g(t-t_i) = \left(1 + \frac{t-t_i}{c}\right)^{-p},\tag{3}$$

where *c* and *p* are Omori law parameters. Spatial clustering of aftershocks is introduced through the spatial kernel function  $f(x - x_b y - y_b M_i)^{36}$ ,

$$f(x - x_i, y - y_i, M_i) = \frac{q - 1}{\pi \zeta^2} \left( 1 + \frac{(x - x_i)^2 + (y - y_i)^2}{\zeta^2} \right)^{-q}.$$
 (4)

Here,  $\zeta = D \exp[\gamma_m(M_i - M_0)]$  signifies that the distances between triggering and triggered events depend on the magnitudes of the triggering events. Parameters q, D, and  $\gamma_m$  are estimated parameters. We note that the ETAS model exhibits minimal long-range spatial correlation ( $\gg D$ ). The parameter values are estimated through the expectation-maximization algorithm, as detailed in refs. 39,41 and summarized in Table 2.

#### Data availability

The global earthquake catalog can be downloaded from the United States Geological Survey (USGS) (https://earthquake.usgs.gov/earthquakes/search/).

#### Code availability

The code is available on request from the authors.

Received: 10 November 2023; Accepted: 22 May 2024; Published online: 04 June 2024

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### Acknowledgements

We are grateful for the financial support provided by the National Natural Science Foundation of China (grant no. 12305044), the Israel Ministry of Energy, the EU H2020 project RISE, the Israel Science Foundation (grant no. 189/19), DTRA, the Pazy Foundation, the joint China-Israel Science Foundation (grant no. 3132/19) and the BIU Center for Research in Applied Cryptography and Cyber Security. We thank Golan Bel for the helpful discussions.

## **Author contributions**

Y.Z., M.E., S.H. and Y.A. conceptualized the research. Y.Z., M.E. and Y.A. analyzed the data. Y.Z. and M.E. wrote the original manuscript draft and supplementary material. All authors supported the investigation, writing, reviewing, and editing process.

## **Competing interests**

The authors declare no competing interests.

## Additional information

**Supplementary information** The online version contains supplementary material available at https://doi.org/10.1038/s43247-024-01460-1.

**Correspondence** and requests for materials should be addressed to Yongwen Zhang.

**Peer review information** *Communications Earth & Environment* thanks the anonymous reviewers for their contribution to the peer review of this work. Primary Handling Editors: Luca Dal Zilio and Joe Aslin. A peer review file is available.

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