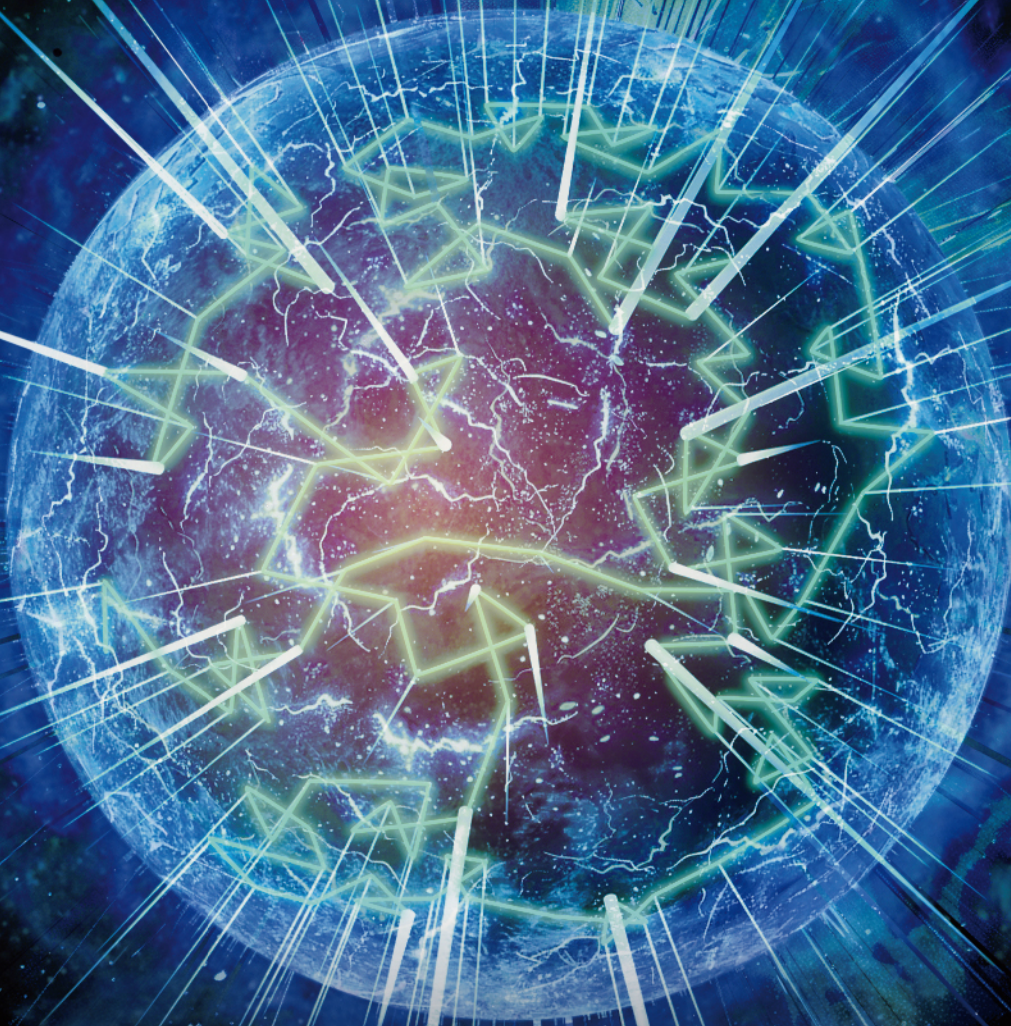


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## Article

# The arrival time and energy of FRBs traverse the time-energy bivariate space like a Brownian motion

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## ABSTRACT

The origin of fast radio bursts (FRBs), the brightest cosmic explosion in radio bands, remains unknown. We introduce here a novel method for a comprehensive analysis of active FRBs' behaviors in the time-energy domain. Using "Pincus Index" and "Maximum Lyapunov Exponent", we were able to quantify the randomness and chaoticity, respectively, of the bursting events and put FRBs in the context of common transient physical phenomena, such as pulsar, earthquakes, and solar flares. In the bivariate time-energy domain, repeated FRB bursts' behaviors deviate significantly (more random, less chaotic) from pulsars, earthquakes, and solar flares. The waiting times between FRB bursts and the corresponding energy changes exhibit no correlation and remain unpredictable, suggesting that the emission of FRBs does not exhibit the time and energy clustering observed in seismic events. The pronounced stochasticity may arise from a singular source with high entropy or the combination of diverse emission mechanisms/sites. Consequently, our methodology serves as a pragmatic tool for illustrating the congruities and distinctions among diverse physical processes.

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## 1. Introduction

Fast radio bursts (FRBs) are intense pulses of radio emission that last just a few milliseconds. First discovered in 2007 [1], FRBs have since been observed by a variety of radio telescopes around the world. Despite their ubiquity, however, the origin of these mysterious signals remains unknown. FRBs have a wealth of observational parameters carrying information about the sources and the propagation paths, including arrival time, energy, duration, bandwidth, polarization, dispersion, scintillation, scattering, etc. Recent studies on the polarization of FRBs suggest that FRBs are located in complex magnetized environments [2–5]. These studies demon-

strate information about the propagation paths of FRBs. Time and energy are two observational parameters directly related to the radiation nature of FRBs. The observation of FRB 20121102A with the Five-hundred-meter Aperture Spherical radio Telescope (FAST) for the first time revealed a bimodal distribution of FRB energy, suggesting that there may be different radiation mechanisms for FRBs [6,7].

The study of time and energy sequences of repeating FRB bursts enables a deeper understanding of the origin of FRBs, which is difficult to achieve with non-repeating bursts because their only burst is just a point in time-energy phase space. Here, we use two active repeating FRBs as our analysis objects, which are the only two FRBs known to have associated compact persistent radio sources (PRs) [8–10], namely FRB 20121102A and FRB 20190520B. Both have gone through highly active episodes over a substantial dynamic range of time scales (milliseconds to

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months), as detected by FAST [6,10]. Due to the high sensitivity and high cadence coverage of FAST's observations of these two FRBs, we can obtain more complete event series than other telescopes. We report here a first systematic examination of the FRB behaviors in the time-energy bivariate domain.

## 2. Data

FRB 20121102A was the first FRB found to be repeating and to be precisely localized [8,11,12]. In one extremely active epoch, FAST detected 1652 pulses from FRB 20121102A between August 29 and October 29, 2019 [6]. Since then, we have been carrying out regular monitoring of FRB 20121102A once every one or two months. On August 17 and 23, 2020, FAST caught another 12 bursts. Since then, no more burst has been detected. FRB 20190520B is the first repeating FRB discovered by FAST during the Commensal Radio Astronomy FAST Survey (CRAFTS) [13], which has been accurately located with a PRS [10]. Since its discovery on May 20th, 2019, more than 200 pulses have been detected by FAST and Parkes [5]. Fig. 1 shows the observation coverage and the detected bursts of FRB 20121102A and FRB 20190520B.

## 3. Time domain analysis and results

We employed the Lomb-Scargle Periodogram (LSP) [14,15] to search for periods of FRB 20121102A and FRB 20190520B, yet no statistically significant period signals were identified within the range of 1 ms to 1000 s. To quantify the significance (signal-to-noise ratio, S/N) of signals at different periods, we compared the power differences between randomly generated time series and the time series of FRB bursts in the LSP. For FRB 20121102A, we generated a time series with the same number as the FRB bursts between the time of the first and last burst's arrival time, drawn from a uniform distribution. Subsequently, we applied the LSP to this randomly generated sequence. We repeated this process 100 times, resulting in a distribution of periodogram powers for random signals at different periods. We conducted the same procedure for FRB 20190520B. Within the range of 1 ms to 1000 s, no significant periodic signals for both FRBs surpassed  $5\sigma$  of the distribution of periodogram powers from the random time series (Fig. 2). Thus we have significantly constrained the possibility of periodic signal existence. Several effects, including variable emission altitudes/sites, may complicate the inference of a magnetar's spin period from the arrival times of FRB bursts [16]. An alternative interpretation could be that the period of the magnetar powering FRB is much longer than that of Galactic magnetars, so there is no short-timescale periodicity in the FRB data [17]. Regardless of the specific cause, the absence of a detected periodic signal still highlights the inherent randomness in the emission of FRBs.

We now look into the more fundamental aspects of FRBs' time-domain behaviors through analysis of waiting times. The waiting time between two events is  $\delta = t_{i+1} - t_i$ , where  $t_{i+1}$  and  $t_i$  are the arrival times for the  $(i+1)_{\text{th}}$  and  $i_{\text{th}}$  events, respectively.

Since the discovery of FRB 20200428, the origin of FRBs being from magnetars has gradually gained popularity [18,19]. As a possible source model for FRBs, the production of FRBs by magnetars relies on some trigger mechanisms [20], including crust cracking at the neutron star surface [7,21,22], sudden magnetic reconnection events in the magnetosphere [23], or triggers from external events [24,25]. Motivated by this, we compared FRBs with earthquake and solar flare with similar but not identical mechanisms.

The seismic data are from the Southern California Earthquake Data Center [26], which contains information such as the occurrence time, latitude, longitude, and magnitude of the earthquake since 1932. For earthquake, we selected events within a region of

$2^\circ \times 2^\circ$  as a continuous seismic sequence. The magnitudes of all earthquakes are converted into energy (erg) through an empirical relation [27]. Solar flare data are from the Hinode Flare Catalogue [28]. We simulated a 100-step Brownian motion. In mathematics, Brownian motion is described by the Wiener process, a stochastic process  $W(t)$  concerning time  $t$ . According to the definition of Brownian motion, for time  $t$  and  $s$ , the increments of Brownian motion  $W(t) - W(s)$  follow a normal distribution  $\mathcal{N}(0, t - s)$ . Therefore, our simulation proceeded as follows: Firstly, we sampled the waiting time  $\delta t$  for each step of the Brownian motion from the exponential distribution  $P(t) = \lambda e^{-\lambda t}$ , where  $\lambda = 1$ , corresponding to a Poisson process with an event rate of 1. Subsequently, based on each step's waiting time, we sampled the step size from the normal distribution  $\mathcal{N}(0, \delta t)$ .

The waiting time distributions of these phenomena are presented in Fig. 3a–e. We defined an average time as  $\bar{T} = \sum T_i / \sum N_i$ , where  $T_i$  and  $N_i$  are the length and event count of the observation session. All waiting times are normalized by corresponding  $\bar{T}$ . For fitting the waiting time distribution, we employed the `EMCEE` package to perform maximum likelihood estimation on the fitting parameters. We define the likelihood function as

$$L(\theta|t) = \sum_i \log f(t, \theta), \quad (1)$$

where  $t$  is the waiting times,  $f(t, \theta)$  is the model for waiting time distribution, and  $\theta$  is the free parameter(s) for the model.  $f(t, \theta)$  could be

- Weibull distribution

$f(t, \theta) = f(t, k, \lambda) = \frac{k}{\lambda} \left(\frac{t}{\lambda}\right)^{k-1} e^{-(t/\lambda)^k}$ , where  $\theta$  represents the shape parameter  $k$  and the scale parameter  $\lambda$ .

- Log-normal distribution

$f(t, \theta) = f(t, \mu, \sigma) = \frac{1}{x\sigma\sqrt{2\pi}} \exp\left[-\frac{(\ln x - \mu)^2}{2\sigma^2}\right]$ , where  $\theta$  represents the expected value  $\mu$  and standard deviation  $\sigma$  of the variable's natural logarithm.

- Exponential distribution

$f(t, \theta) = f(t, \lambda) = \lambda e^{-\lambda t}$ , where  $\theta$  represents the event rate  $\lambda$ .

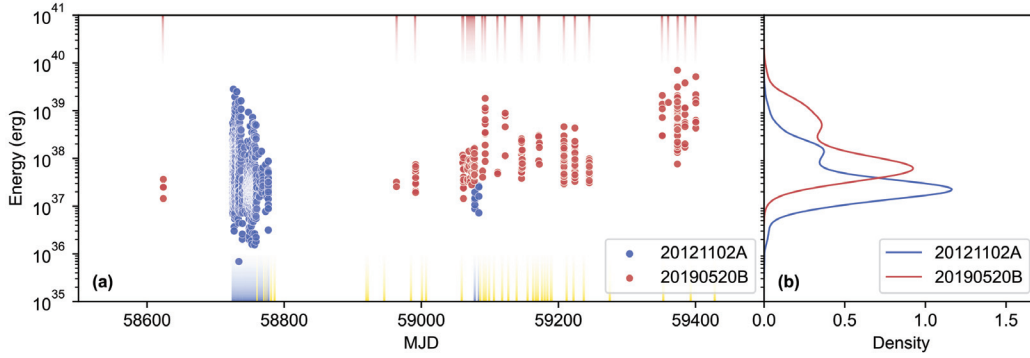
- Mixture of two exponential distributions

$f(t, \theta) = f(t, \lambda_1, \lambda_2, p) = p e^{-\lambda_1 t} + (1 - p/\lambda_1) \lambda_2 e^{-\lambda_2 t}$ , where  $\theta$  representing two event rates  $\lambda_{1,2}$  and a proportionality factor  $p$ .

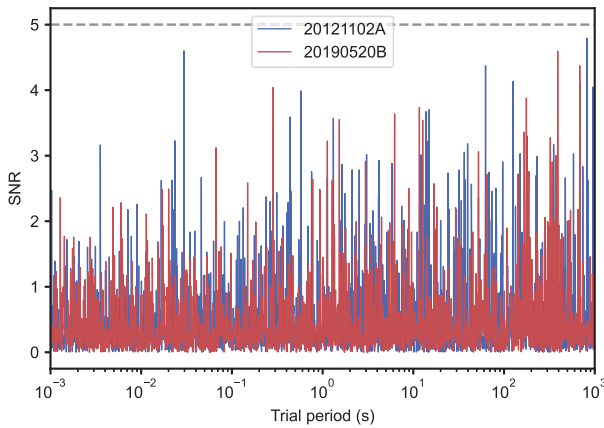
The waiting time distribution for a Poisson process follows an exponential distribution. The waiting time distribution of the earthquake deviates from the exponential distribution and can be better described by a Weibull distribution. This means that earthquake events with shorter waiting times occur more frequently than expected from a simple Poisson process, i.e., clustering in time. The waiting time distribution of solar flare can be fitted by a log-normal function, which means the event rate of solar flare changes randomly.

Regarding the waiting time of FRBs, the earlier assumption was a non-stationary Poisson process or a Weibull distribution [29,30], albeit influenced by the sparse sampling of early burst events. As depicted in Fig. 3, the bimodal waiting time distribution of FRBs evidently differs from a single Weibull distribution, which can be well applied to earthquake events. There are also diverse models used to describe the distribution of waiting times for FRBs, including LogNormal distribution [31], Weibull [32], time-dependent Poisson processes [33,34].

For comparative analysis, using FRB 20121102A as an example, we selected waiting times exceeding 1 s. Fitting was undertaken with exponential (corresponding to a Poisson process), Weibull, and lognormal functions. The goodness of fit was assessed using



**Fig. 1.** The detected bursts with energy from FRB 20121102A and FRB 20190520B. (a) The blue dots and red dots show the energy and arrival time of bursts from the two FRBs. The blue and red bars are the observation session of the two FRBs with detection, and the yellow bars are the observation session without detection. (b) The kernel density estimate (KDE) energy distribution of the two FRBs.



**Fig. 2.** The periodogram of FRB 20121102A and FRB 20190520B.

adjusted R-squared, which provides a refined assessment of the model's fitting effectiveness by accounting for the number of independent variables utilized. The parameter counts for exponential, Weibull, and lognormal are 1, 2, and 2, respectively. The calculated adjusted R-squared values were 0.920, 0.917, and 0.906 for these three functions. While all three functions appear adept at modeling FRB waiting times, we lean toward the simplest model, the exponential (Poisson process) function, for describing the distribution of FRB waiting times. The time-dependent Poisson process, which is the sum of multiple Poisson processes, entails a greater number of parameters and evidently excels in fitting residuals compared with models with fewer parameters. Nevertheless, under the simplest conditions, our results indicate the effectiveness of a single Poisson process. Consequently, in this context, we opt for employing two Poisson processes to fit the entire distribution of FRB waiting times.

We also explored the distribution of waiting times under different energy thresholds. Taking FRB 20121102A as an example, we set a series of energy thresholds, calculated the waiting time distribution for each, and employed an exponential function to fit the two peaks of waiting times. For exponentially distributed waiting times,  $P(t) = \lambda e^{-\lambda t} dt = \lambda e^{-\lambda t} t d \log t$ , the peak corresponds to the position where the derivative is zero  $P'(t) = 0 \Rightarrow t = 1/\lambda$ . Thus, the exponential distribution provides the typical waiting time corresponding to the peak. In Fig. 3g, h, we present the characteristic times corresponding to the two peaks of waiting time under different energy thresholds. The left peak (short timescale waiting times) is insensitive to the choice of energy threshold, implying an intrinsic correlation with the radiation mechanism. The right

peak (long timescale waiting times) strongly depends on the energy threshold or the detected event number. As the energy threshold increases, it leads to a decrease in the detected bursts, resulting in longer waiting times. In panel H, two inflection points correspond to the two peaks in the energy distribution. After normalizing the right peak's waiting time using the detected number of bursts under different energy thresholds and observation duration, we can see that all the normalized right peaks hover around 1, indicating that the right peak is a stochastic process relying on sampling (event rate). When the waiting time of FRBs can be described by stochastic processes, it further disfavors the prospect of (quasi)-periodicity in FRBs.

The distinct characteristics of the waiting time distribution underscore that the emission of FRBs is not like seismic events. A recent study has proposed a semblance of aftershock characteristics between FRBs and earthquakes through a custom correlation function [35]. However, the similarity in the “correlation function” between earthquakes and FRBs arises from the bias of waiting time distributions from one Poisson process. Here, we show that despite both earthquakes and FRBs deviating from a Poisson process in terms of waiting times, the manner of deviation differs. Therefore, it is hard to conclude that FRBs exhibit seismic aftershock characteristics. This assertion is further substantiated in our subsequent analysis of energy distribution.

#### 4. Energy domain analysis and results

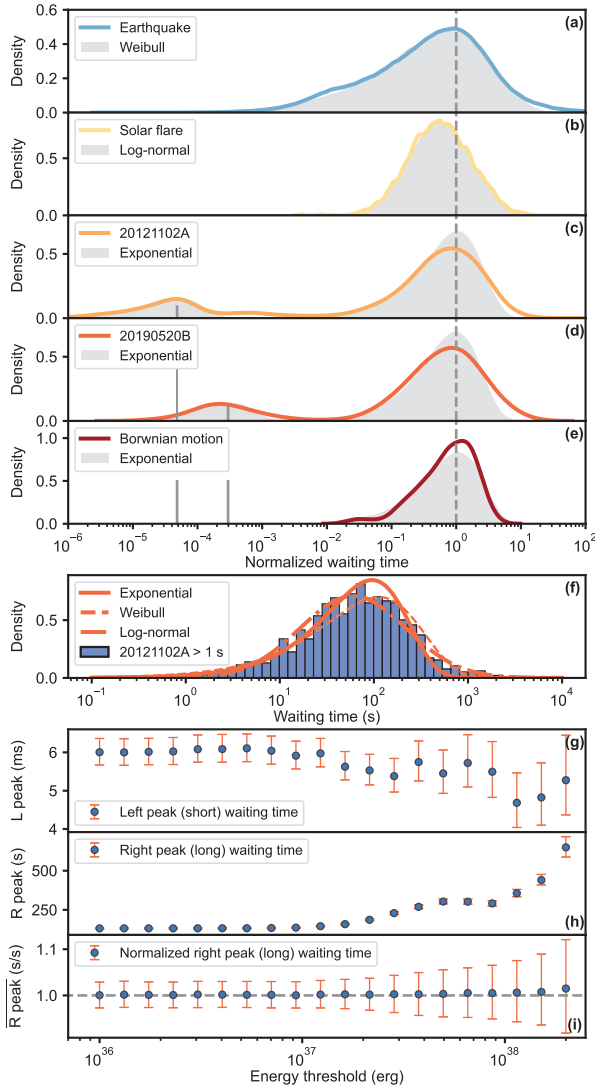
Despite the common perception of randomly occurring earthquakes, seismic events cluster in time and magnitude [36–38]. The deviation of earthquakes from randomness origins from its nonlinear dynamical systems [36,39]. Assuming in an event series, the subsequent event often possesses lower energy than its predecessor. After shuffling, the probability of subsequent energy being lower than the predecessor will decrease. Based on this fact, we adopted the analysis method used in ref. [38] for earthquakes.

Consider conditional probability

$$P(\Delta m_i < m_0 | \Delta t_i < t_0) = \frac{N(\Delta m_i < m_0, \Delta t_i < t_0)}{N(\Delta t_i < t_0)}, \quad (2)$$

where  $\Delta t_i = t_{i+1} - t_i$  and  $\Delta m_i = m_{i+1} - m_i$  are the temporal and magnitude difference between subsequent events,  $N(\dots)$  is the number of pairs of subsequent events satisfying the conditions specified in parentheses.

With fixed  $m_0$  and  $t_0$ , the quantity  $P(\Delta m_i^* < m_0 | \Delta t_i < t_0)$  for independent reshuffled series are calculated, where  $\Delta m_i^* = m_{i+1}^* - m_i^*$  is the magnitude difference between subsequent events of reshuffled series. We employed `NUMPY.RANDOM.SHUFFLE` to



**Fig. 3.** The normalized waiting time distribution of earthquake, solar flare, two FRBs, and Brownian motion. Colored lines in (a–e) are the KDEs of waiting times for these phenomena, which are normalized by  $\bar{T}$  of 3435.1, 25810.4, 88.4, 123.3, and 190.4 s, respectively. Gray regions in (a–e) indicate the fitting of waiting times with Weibull function, LogNormal function, and Exponential function (Poisson process). The gray solid lines denote the short characteristic waiting time of the two FRBs, which are  $\sim 4$  ms for FRB 20121102A and  $\sim 36$  ms for FRB 20190520B. (f) The distribution of waiting times longer than 1 s for FRB 20121102A. The solid line, dashed line, and dash-dot line denote the fitting results of the exponential function, Weibull function, and lognormal function, respectively. (g–i) The left peak, right peak, and normalized right peak of waiting time under different energy thresholds.

rearrange our event series, which is based on the Fisher-Yates shuffle algorithm to produce an unbiased permutation. The central limit theorem makes the quantity  $P(\Delta m_i^* < m_0 | \Delta t_i < t_0)$  a Gaussian distribution with mean value  $\mu(m_0, t_0)$  and standard deviation  $\sigma(m_0, t_0)$ . The biases between  $\mu(m_0, t_0)$  and  $P(\Delta m_i < m_0 | \Delta t_i < t_0)$  for earthquake, FRB 20121102A and FRB 20190520B are  $5.65\sigma$ ,  $0.79\sigma$  and  $0.40\sigma$  (Fig. 4a–c), respectively. Generally, the detection of earthquakes is more complete than that of FRBs. Here, we conducted a test related to earthquake magnitude thresholds. For FRB 20121102A, the burst with the highest energy differs by a factor of 4000 from the one with the lowest energy, and for FRB 20190520B, the factor is 500. In the earthquake data, the highest magnitude is 7.5. By progressively increasing the energy threshold, we made the lowest-energy earthquake event reach 1/500 of the highest-energy event. Throughout this process, we

calculated the S/N of the hypothesis “the energy of the subsequent event is lower than that of the preceding event” for different thresholds. In Fig. 4d, we can see that even when compressing the dynamic range of earthquake energies to 1/500, the S/N still exceeds 2, far surpassing the two FRBs. This indicates that no clustering in the energy of FRB bursts. Simply put, there is no excess number of bursts following a bright one, while there are more after-quakes following a major event than pre-quakes.

## 5. Stochasticity and chaos

In dynamical studies, chaos and stochasticity are two distinct concepts. Chaos is characterized by unpredictability that increases with time, whereas stochasticity’s unpredictability remains stable over time. We use “Pincus Index” ( $\mathcal{PI}$ ) and “Maximum Lyapunov exponent” ( $\mathcal{MLE}$ ), respectively, to quantify the stochasticity and chaos of event sequences.

The  $\mathcal{PI}$  is used to describe the degree of stochasticity based on the Max Approximate Entropy ( $\mathcal{MAE}$ ) [40,41], by measuring the change in information entropy before and after shuffling a sequence.  $\mathcal{PI}$  is zero for completely ordered systems and one for totally random systems. For an event series  $\{e_i\}_{i=1,\dots,N}$ , the  $\mathcal{MAE}$  [40,41] can be defined as

$$\mathcal{MAE} = \max_r \left( -\frac{1}{N-m} \sum_{i=1}^{N-m} \log \frac{\sum_{j=1}^{N-m} \text{dist}(x_j, x_i) < r}{N-m} \right)_m^{m+1}, \quad (3)$$

where  $X = \{x_i\}_{i=1,\dots,N-m} = \{\{e_1, \dots, e_{1+m}\}, \dots, \{e_{N-m}, \dots, e_N\}\}$  is the reorganized sequence of the initial event series,  $N$  is the length of the initial event series,  $\text{dist}(x_j, x_i)$  is the distance between each pair of the reorganized sequence  $X$ , and  $r$  is the distance threshold.  $\mathcal{MAE}$  quantifies the greatest difference in information between the segments of length  $m$  and  $m+1$ , which needs to obtain a max entropy of the recombination sequence by changing different thresholds  $r$ . For making the  $\mathcal{MAE}$  comparable between series, the  $\mathcal{PI}$  was defined as

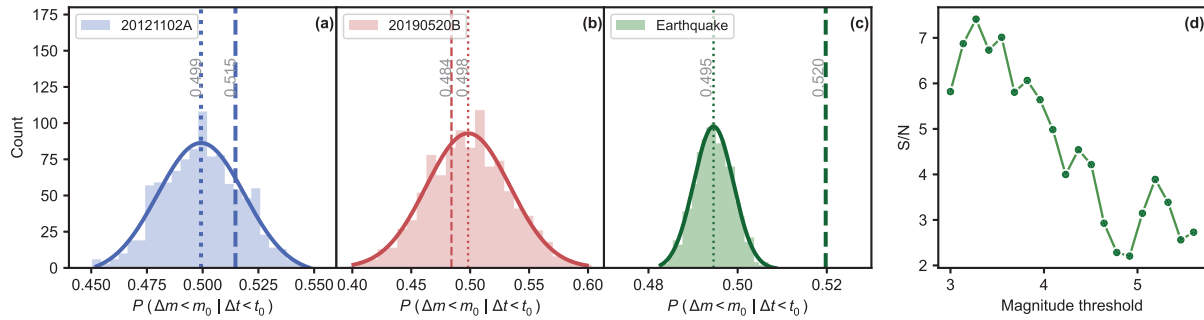
$$\mathcal{PI} = \frac{\mathcal{MAE}_{\text{initial}}}{\mathcal{MAE}_{\text{shuffled}}}. \quad (4)$$

After calculating the  $\mathcal{MAE}$  or called  $\mathcal{MAE}_{\text{initial}}$  for initial event series, we randomly reshuffled the series and calculated  $\mathcal{MAE}$  for 100 times. The median value is  $\mathcal{MAE}_{\text{shuffled}}$ , the standard deviation value is used to define the error of  $\mathcal{PI}$ . In the calculation of the  $\mathcal{PI}$ , the distance metric used is the Euclidean distance. To preserve the original sequence information as much as possible and minimize the introduction of artificial bias, we linearly mapped both the time and energy sequences to the range of 0 to 1 simply.

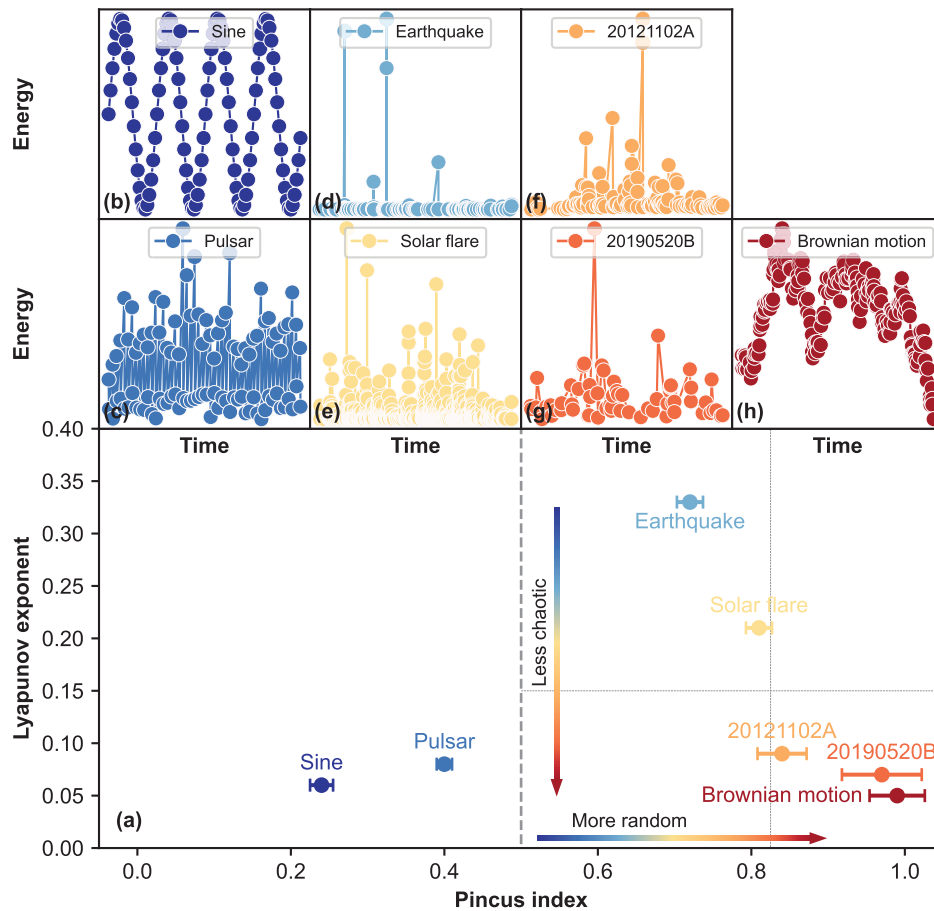
The  $\mathcal{MLE}$  represents the degree of dispersion of trajectories in phase space and is a numerical characteristic used to identify chaotic behavior in a nonlinear system [42].  $\mathcal{MLE}$  less than 0 corresponds to a periodic motion or a stable system that is static in time-energy space.  $\mathcal{MLE}$  greater than 0 indicates the existence of chaos. We use NOLDS [43] method for  $\mathcal{MLE}$  calculation. As the  $\mathcal{MLE}$  is the maximum value of the whole spectrum of Lyapunov exponents, it is difficult to define an error.

The  $\mathcal{PI}$  and  $\mathcal{MLE}$  values are shown in Fig. 5a. The pulsar data used here were a pulsar named J1840 + 2843 discovered within the CRAFTS project<sup>1</sup>. As expected, the most regular motion is a sine-wave, with small values in both, followed by pulsar with representative  $\mathcal{PI} \sim 0.4$  and  $\mathcal{MLE} \sim 0.08$ . Earthquakes are most chaotic

<sup>1</sup> [http://groups.bao.ac.cn/ism/CRAFTS/202203/t20220310\\_683697.html](http://groups.bao.ac.cn/ism/CRAFTS/202203/t20220310_683697.html).



**Fig. 4.** The probability ( $P$ ) of the hypothesis “the energy of the subsequent event is lower than that of the preceding event”. (a–c) The probability ( $P$ ) of the original event sequences (dashed lines) for FRB 20121102A (blue), FRB 20190520B (red), and earthquakes (green). The histogram and the dotted lines show the distribution and median of this probability ( $P$ ) of randomly shuffled event sequences. (d) The variation in the S/N of the probability ( $P$ ) under different earthquake magnitude thresholds.

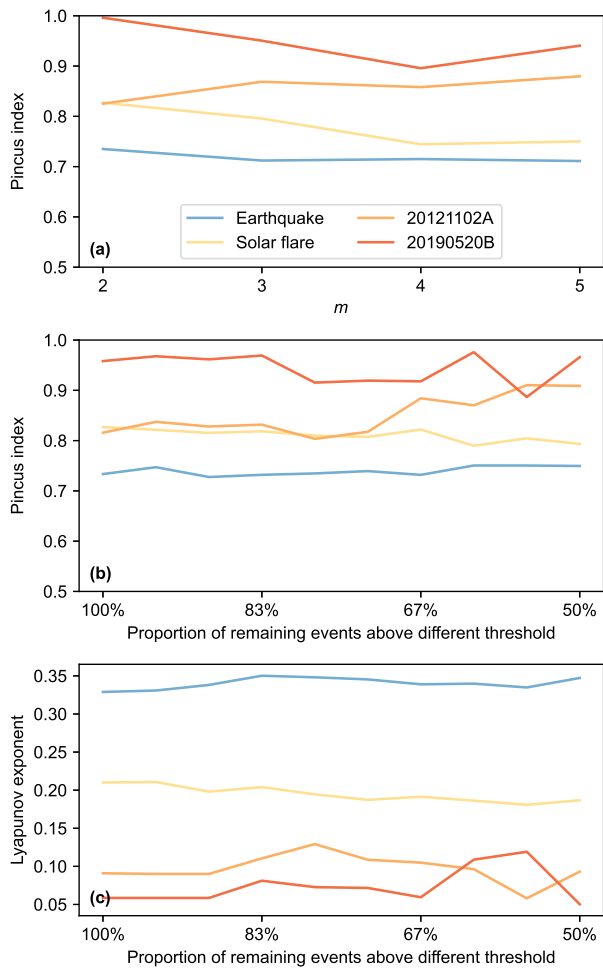


**Fig. 5.** The Pincus index vs. Lyapunov exponent of sine function, pulsar, earthquake, solar flare, FRB 20121102A, FRB 20190520B and Brownian motion. The top and middle panels present event series in time-energy space of these sources. The color changes from blue to red, implying increased stochasticity. ( $PI$ ,  $MLE$ ) value is (0.24, 0.06) for sine-wave, (0.40, 0.08) for pulsar, (0.72, 0.33) for Earthquake, (0.81, 0.21) for solar flare, (0.84, 0.09) for FRB 20121102A, (0.97, 0.07) for FRB 20190520B, and (0.99, 0.05) for Brownian motion. See the video file in [Supplementary materials](#).

with  $MLE \sim 0.33$ . Solar flares are less chaotic, but more random than earthquakes. FRBs are even more random ( $PI \sim 0.84-0.97$ ) and less chaotic ( $MLE \sim 0.07-0.09$ ) than solar flares, mimicking Brownian motion ( $PI \sim 0.99$ ) that is the most random in the bivariate time-energy space, among the systems considered here.

To ascertain the robustness of our calculations, we considered two types of tests. In the calculation of the  $PI$ , only the parameter  $m$  remains as a free variable. We conducted tests by adopting  $m \in \{2, 3, 4, 5\}$ . As depicted in Fig. 6a, the deviation of the  $PI$  did not exceed 0.1 for different values of  $m$ . Even with slight variations in the  $PI$ , the relative relationships among different physi-

cal phenomena remained unchanged when the same  $m$  was selected. Additionally, given that the detection of these physical phenomena cannot be exhaustive, we further examined the impact of sequence completeness on the results of the  $PI$  and  $MLE$  calculations. By adjusting the energy threshold, we retained different proportions of events (ranging from 100% down to 50%) and subsequently computed the  $PI$  and  $MLE$  for each case. From retaining 100% of the events to selecting only those with the top 50% energy levels, the  $PI$  and  $MLE$  exhibited remarkable stability (Fig. 6b, c), confirming the robustness of our calculations.



**Fig. 6.** The robustness test of  $PI$  and  $MLE$ . (a) The  $PI$  values using different segments of length  $m$ . (b, c) The  $PI$  and  $MLE$  under different energy thresholds.

Our analysis reveals that active repeaters congregate with Brownian motion toward highly random, yet less chaotic regions in the stochasticity-chaos phase space (Fig. 5a). This is distinct from earthquakes and solar flares, both of which are more chaotic but less random than FRBs. Additionally, as previously analyzed, earthquakes exhibit time and energy clustering behavior (Figs. 3, 4). FRBs, however, do not show clustering in neither time nor energy. The random paths of FRB events in time-energy space favor origin models based on complex processes, such as in a thermodynamic system, the movement or diffusion of molecules is akin to the phenomenon of interest.

## 6. Conclusion

In summary, using  $PI$  and  $MLE$  to quantify the stochasticity and chaos of event sequences may be an effective method for intuitively demonstrating the similarities and differences between various physical processes. Specifically, here we compare FRBs, pulsar, solar flares, earthquakes, and Brownian motion in the stochasticity-chaos phase space. The strong stochasticity, akin to Brownian motions, of active repeaters with PRS counterparts, along with the growing evidence of their multi-variate behaviors, such as their bimodal energy distribution [6,7,44,45], could be generated by a single source with high information entropy or the combination of multiple radiation mechanisms or emission sites. Either

way, it is unlikely that active repeating FRBs originate from a stably spin compact objects within a clean environment.

## Conflict of interest

The authors declare that they have no conflict of interest.

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## Author contributions

Yong-Kun Zhang and Di Li developed the concept of the manuscript. Yong-Kun Zhang conducted the data analysis and visualization. Pei Wang, Chen-Hui Niu, Shi Dai, and Yong-Kun Zhang searched the new bursts and analysed the burst properties. Yong-Kun Zhang, Di Li, Chao-Wei Tsai, Ju-Mei Yao, and Yi Feng led the discussion on the interpretation of the results and writing of the manuscript. All authors contributed to the analysis or interpretation of the data and the final version of the manuscript.

## Appendix A. Supplementary materials

Supplementary materials to this article can be found online at <https://doi.org/10.1016/j.scib.2024.02.010>.

## Data availability

Earthquake data from the Southern California Earthquake Data Center are used in this paper. The full dataset and documentation can be downloaded from <https://dx.doi.org/10.7909/C3WD3xH1>. Solar flare data from Hinode Flare Catalogue are used in this paper. The full dataset and documentation can be downloaded from

<https://doi.org/10.34515/CATALOG.HINODE-00000>. Other data and a visualization of the movement of FRB and earthquake in time-energy space can be accessed in ScienceDB <https://doi.org/10.57760/sciencedb.09716>.

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## Research Highlight

## A surprising stochastic behavior of fast radio bursts

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Fast radio bursts (FRBs) are millisecond-duration, extremely luminous, radio bursting events originating from distant galaxies in the universe. Their physical origin remains a mystery. Discovered in 2007 [1], these fascinating events have attracted great attention from the astronomical community, drawing the focus of both observers who develop advanced technology and gather data from powerful telescopes and theorists who explore various ideas and develop physical models to understand their underlying mechanism. The only FRB detected from the Milky Way galaxy was produced by a magnetar [2–4], a type of neutron star with extremely strong magnetic fields. However, it is unclear whether magnetars are powering the majority of FRBs in the universe. In general, FRBs not only carry rich physics related to their generation mechanisms, but also serve as unique astrophysical probes to study the evolution of the universe and to test fundamental physics [5].

A fraction of FRBs emit bursts repeatedly. These repeaters are ideal sources to study the FRB burst mechanisms thanks to the rich data collected from them. In particular, the statistical properties of the arrival times and burst energies of repeating FRBs may offer clues to their physical origin. In the cover article [6] of this issue of *Science Bulletin*, a team from the National Astronomical Observatories (CAS) led by Di Li and his student Yong-Kun Zhang established a novel approach to characterize the behavior of actively repeating FRBs in the time-energy two-dimensional phase space.

One smoking-gun signature of a neutron star origin of cosmological FRBs is periodicity. However, searches for periodicity on millisecond to second timescales, typical for rotation periods of known pulsars or magnetars, have so far failed (Fig. 1) [7,8]. This is likely due to the lack of a narrow emission window for FRB bursts [9]. A periodic behavior in much longer timescales has been observed in two sources ( $\sim 16$  d for FRB 20180916B [10] and  $\sim 157$  d for FRB 20121102A [11]), but these periods are likely related to other physical processes such as orbital motion or neutron star precession [12].

Another possible clue to pin down the nature of FRBs is the waiting times between subsequent bursts for active repeaters, which have been found to show a bimodal distribution, with a short-term peak around tens of milliseconds and a long-term peak

《Science Bulletin》发表FRB领域专家评述。美国内华达大学张冰教授称“这一创新方法促使理论家深入思考爆发现象的物理机制，从而进一步应用于FAST的大数据集将检验其揭示的物理规律的普适性。”

around tens to hundreds of seconds depending on the activity level of the source [13–17]. Physically, each FRB event should correspond to a triggering event, either internally from the engine or externally from the environment. Within the magnetar framework, crust cracking has been widely invoked as a mechanism to trigger FRBs. If this is the case, FRB bursts may share similar statistics as earthquakes. Some observational evidence suggesting such a connection has been proposed in Refs. [18–20]. Zhang et al. [6] took into account both waiting time and energy distributions and showed that there is a clear distinction between FRBs and earthquakes. Introducing the generalized “Pincus Index”, they showed that the FRBs’ excess probability density on shorter timescales has no dependence on burst energy. In contrast, a similar deviation from a Poisson distribution in short timescales for earthquakes tends to happen only after major quakes. Such a distinction challenges the direct analogy between FRBs and earthquakes.

With both “Pincus Index” and the “Lyapunov Exponent”, Zhang et al. [6] developed a new framework to depict transient events, such as FRBs, pulsars, earthquakes, and solar flares, on the randomness-chaos two-dimensional plane. FRBs appear significantly more random but less chaotic than earthquakes and solar flares. In particular, FRBs seem to be located in a region much closer to that of Brownian motion. In other words, FRB generation is quite random and stochastic.

The inconsistency between FRBs and earthquakes comes with a surprise, especially to theorists like myself. It is hard to imagine how a magnetar triggers bursts with huge energetics so randomly without appealing to an intrinsic mechanism such as starquakes and crust crackings. The paper of Zhang et al. [6] will certainly make theorists digest and think hard about its physical implications.

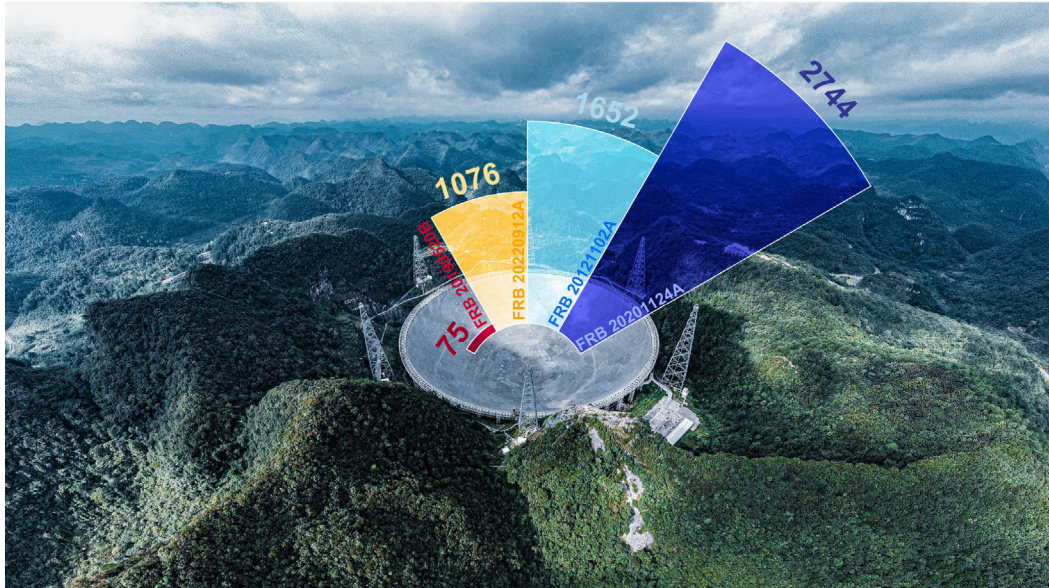
Quite a few active repeaters are regularly monitored with the Five-hundred-meter Aperture Spherical radio Telescope (FAST), mostly under the FRB Key Science Program, leading to detections of thousands of bursts. The method developed in Ref. [6] may be applied to confront this larger data set to verify whether the stochastic nature reported in Ref. [6] is universal among all repeating FRBs.

## Conflict of interest

The author declares that he has no conflict of interest.

\* Corresponding author.

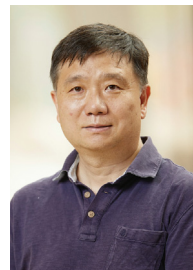
E-mail address: [bing.zhang@unlv.edu](mailto:bing.zhang@unlv.edu)



**Fig. 1.** The number of bursts detected by FAST toward four active repeating FRBs, namely FRB 20190520B [13], 20220912A [14], and 20121102A [15], 20201124A [16,17]. No short periodicity has been found in these data.

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