

1 **A Taylor's power law in the Wenchuan earthquake sequence with**
2 **fluctuation scaling**

3
4 **Peijian Shi¹, Mei Li^{2*}, Yang Li^{3*}, Jie Liu², Haixia Shi², Tao Xie², Chong Yue²**

5
6 ¹Co-Innovation Center for Sustainable Forestry in Southern China, College of Biology and the
7 Environment, Bamboo Research Institute, Nanjing Forestry University, Nanjing 210037, China

8 ²China Earthquake Networks Center, China Earthquake Administration, Beijing 100045, China

9 ³Department of Mathematics and Statistics, University of Minnesota Duluth, Duluth, MN 55812, USA

10 *Correspondence to:* mei_seis@163.com (M. Li); yangli@d.umn.edu (Y. Li)

11
12 **Abstract** Taylor's power law (TPL) describes the scaling relationship between the
13 temporal or spatial variance and mean of population densities by a simple power law.

14 TPL has been widely testified across space and time in biomedical sciences, botany,
15 ecology, economics, epidemiology, and other fields. In this paper, TPL is analytically

16 reconfirmed by testifying the variance as a function of the mean of the released
17 energy of earthquakes with different magnitudes on varying timescales during the

18 Wenchuan earthquake sequence. Estimates of the exponent of TPL are approximately
19 2, showing that there is mutual attraction among the events in the sequence. On the

20 other hand, the spatial–temporal distribution of the Wenchuan aftershocks tends to be
21 nonrandom but approximately definite and deterministic, which highly indicates a

22 stable spatial–temporal dependent energy release caused by regional stress adjustment
23 and redistribution during the fault revolution after the main shock. Effect of different

24 divisions on estimation of the intercept of TPL straight line has been checked while
25 the exponent is kept to be 2. The result shows that the intercept acts as a logarithm

26 function of the time division. It implies that the mean–variance relationship of the
27 energy release from the earthquakes can be predicted although we cannot accurately
28 know the occurrence time and locations of imminent events.

29

30 **1 Introduction**

31 The Wenchuan M_S 8.0 earthquake on May 12, 2008 was the result of the
32 intensively compressive movement between the Qinghai–Tibet Plateau and the
33 Sichuan basin. It ruptured the middle segment of the Longmenshan (LMS) thrust belt
34 (Burchfiel et al., 2008), with a total length of fault trace of approximately 400 km
35 along the edge of the Sichuan basin and the eastern margin of the Tibetan plateau, in
36 the middle of the north–south seismic belt of China. Millions of aftershocks have
37 occurred after the main event. Up to now, the focus zone tends to be quiet with only
38 small ones occurring occasionally. A complete Wenchuan earthquake sequence has
39 been attained.

40 Statistical seismology applies statistical methods to the investigation of seismic
41 activities, and stochastic point process theory promotes the development of statistical
42 seismology (Vere–Jones et al., 2005). After some improvement, most of the
43 point process theories and methods can be used to analyze spatio–temporal data of
44 earthquake occurrence and to describe active laws of aftershocks. The term
45 “aftershock” is widely used to refer to those earthquakes which follow the occurrence
46 of a large earthquake and aggregately take place in abundance within a limited
47 interval of space and time. This population of earthquakes is usually called an
48 earthquake sequence. In seismological investigations, one important subject has long

49 been the statistical properties of the aftershocks. Spatial and temporal distribution of
50 aftershocks after a destructive earthquake is usually performed in a general survey
51 (Utsu, 1969). In seismology, one of the most famous theories describing the activities
52 of aftershocks is the Gutenberg–Richter law (Gutenberg and Richter, 1956), which
53 expresses the relationship between the magnitude and the total number of earthquakes
54 with at least that magnitude in any given region and time interval. Another one is the
55 Omori's law, which was first depicted by Fusakichi Omori in 1894 (Omori, 1894) and
56 shows that the frequency of aftershocks decreases roughly with the reciprocal of time
57 after the main shock. Utsu (1969) and Utsu et al. (1995) developed this law and
58 proposed the modified Omori formula afterwards. Since the 1980s, with the
59 development of nonlinear theory, an epidemic–type aftershock sequence (ETAS)
60 model has been proposed by Ogata (1988, 1989, 1999), which is based on the
61 empirical laws of aftershocks and quantifies the dynamic forecasting of the induced
62 effects. This model has been used broadly in earthquake sequence study (Kumazawa
63 and Ogata, 2013; Console, 2010).

64 An increasing number of investigations show that there is an interaction effect for
65 the occurrence of aftershocks in a given area. Stress triggering model is usually used
66 to depict interaction between larger earthquakes by the view of physics (Haris, 1998;
67 Stein, 1999). More and more results show that obvious enhancement in Coulomb
68 stress not only promotes the occurrence of upcoming mid or strong events of an
69 earthquake sequence but also affects their spatial distribution to some degree
70 (Robinson and Zhou, 2005).

71 The goal of this paper is to introduce a different statistical method called Taylor's
72 power law into the statistical seismology field by analyzing the Wenchuan earthquake
73 sequence from the point of view of energy distribution or energy release. We aim to
74 find out whether or not the energy distribution or energy release of the Wenchuan
75 earthquake sequence complies with a specific power-law function of TPL for
76 different scaled samples, and what the spatial and temporal properties are.

77 In statistics, there are two important moments in a distribution, the mean (μ)
78 and the variance (σ^2). It is common to describe the types of the distributions using the
79 relationship between these two parameters. For instance, we have $\sigma^2 = \mu$ for a Poisson
80 distribution. In nature, however, the variance is not always equal to or proportional to
81 the mean. Mutual attraction or mutual repulsion for individuals in natural populations,
82 e.g., the intra-specific completion of plants, makes variance different from the mean.
83 After examining many sets of samples of animal and plant population spatial densities,
84 Taylor (1961) found that the variance appears to be related to the mean by a power-
85 law function: the variance is proportional to the mean raised to a certain power

$$86 \quad \sigma^2 = a\mu^b \quad (1)$$

87 or equivalently as a linear function when the mean and variance are both
88 logarithmically transformed

$$89 \quad \log_{10}(\sigma^2) = \log_{10}(a) + b \times \log_{10}(\mu) = c + b \times \log_{10}(\mu) \quad (2)$$

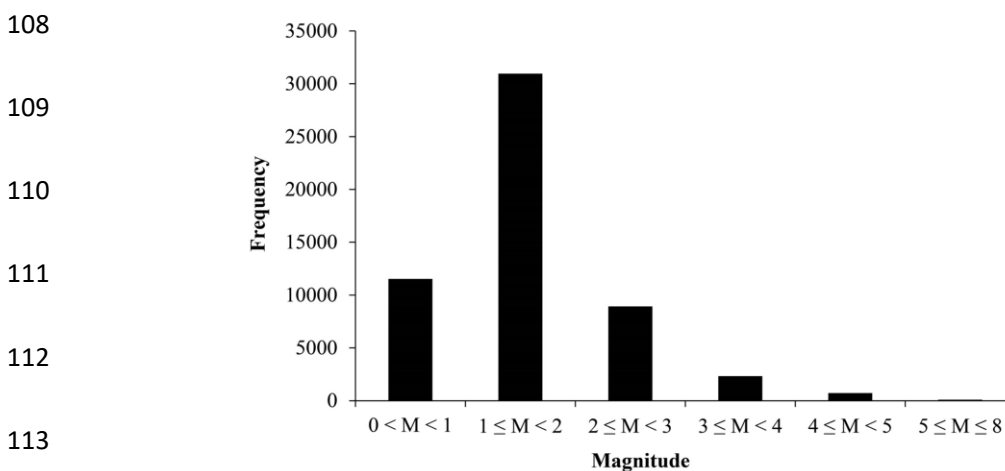
90 where a and b are constants and $c = \log_{10}(a)$. Eqs. 1 or 2 is called Taylor's power law
91 (henceforth TPL) or Taylor's power law of fluctuation scaling (Eisler et al., 2008).

92 Eqs. 1 and 2 may be exact if the mean and variance are population moments

93 calculated from certain parametric families of skewed probability distributions
94 (Cohen and Xu, 2015). TPL describes the species-specific relationship between the
95 spatial or temporal variance of populations and their mean abundances (Kilpatrick and
96 Ives, 2003). It has been verified for hundreds of biological species and abiotic
97 quantities in biomedical sciences, botany, ecology, epidemiology, biomedical sciences,
98 botany, and other fields (Taylor, 1961, 1984; Kendal, 2002; Eisler et al., 2008; Cohen
99 and Xu, 2015; Shi et al., 2016, 2017; Lin et al., 2018). Most of the scientific
100 investigations of TPL mainly focus on the power-law exponent b (or slope b in the
101 linear form), which has been believed to contain information on aggregation in space
102 or time of populations for a certain species (Horne and Schneider, 1995).

103 In this study, we also concentrate on the parameter b of TPL. We expect that b is
104 independent of the temporal block size A which is used to divide the Wenchuan
105 sequence into different temporal blocks because the aftershock area is invariable
106 during this period.

107 2 Wenchuan earthquake sequence



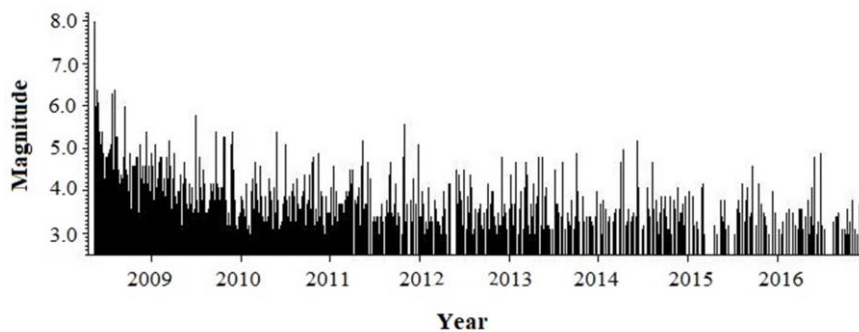
114 **Figure 1.** Histogram of earthquakes with different magnitudes of the Wenchuan sequence.

115 A large earthquake of magnitude M_S 8.0 hit Wenchuan, Sichuan province of
116 China at 14:28:01 CST (China Standard Time) on May 12, 2008 with an epicenter
117 located at 103.4 $^{\circ}$ N and 31.0 $^{\circ}$ E and a depth of 19 km.

118 According to the earthquake catalogue of the China Earthquake Networks Center
119 (CENC) (<http://www.csi.ac.cn/>), there have been 54,554 earthquakes of magnitudes
120 $M > 0$ recorded for the Wenchuan sequence by December 31, 2016. Figure 1 shows
121 the frequency of aftershocks with different magnitudes. Here, aftershocks with $M <$
122 2.0 account for 77.9% of the total sequence due to the fact that only weak ones occur
123 after a long period of time after the main shock. In addition, except for the main shock,
124 the number of aftershocks is 733 for magnitudes $4.0 \leq M < 5.0$, and 86 for $5.0 \leq M <$
125 8.0, respectively. They account for a very small percentage of the total.

126

127



131

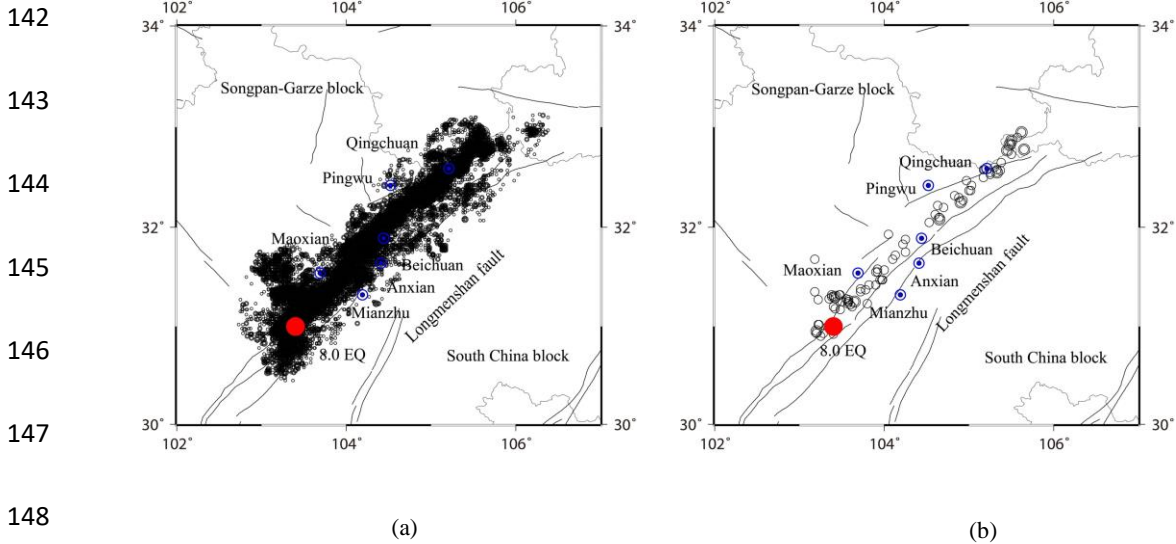
132 **Figure 2.** Series plot of the Wenchuan earthquake sequence with $M \geq 3.0$ from May 12, 2008 to
133 December 31, 2016.

134

135 Figure 2 displays the fluctuation variability of the Wenchuan earthquake
136 sequence with $M \geq 3.0$ from May 12, 2008 to December 31, 2016. The temporal
137 distribution of the magnitudes of aftershocks attenuates quickly after the main shock.

138 The three larger aftershocks all occurred in 2008 with M 6.4 on May 25, M 6.1 on
 139 August 1, and M 6.1 on August 5, respectively. Eighty-five percent of aftershocks
 140 with $M \geq 3.0$ occurred by the end of 2011, about 2.5 years after the main shock.

141



149 **Figure 3.** Spatial distribution of epicenters of the Wenchuan earthquake sequences with (a) $M > 0$ and
 150 (b) $M \geq 5.0$ from May 12, 2008 to December 31, 2016. The main shock on May 12, 2008 is labeled by a
 151 red solid circle.

152

153 Figure 3a shows the spatial distribution of epicenters of the Wenchuan
 154 earthquake sequence with $M > 0$ from May 12, 2008 to December 31, 2016. The
 155 aftershocks are distributed in the region with latitude 102°E – 107°E and longitude
 156 30°N – 34°N , mainly along the Longmenshan thrust fault, which is a junction region of
 157 Songpan–Garze block and South China block and extends along north–east–east
 158 (NEE) direction for more than 400 km. The size of the aftershocks on different scales
 159 is characterized by a population density of the events distributed in space and time
 160 after the Wenchuan M_S 8.0 earthquake but we neglect the variations of the aftershock
 161 area in the next step. The distribution of strong aftershocks is of different segment

162 characteristics. Earthquakes with magnitude $M \geq 5.0$ mainly spread in south Miaoxian
163 and Mianzhu area and north Pingwu area. There are no strong aftershocks occurring
164 in the middle areas such as Beichuan and Anxian (see Figure 3b). According to the
165 primary investigation results of the Wenchuan rupture process conducted by Chen et
166 al. (2008), the rupture of the Wenchuan 8.0 earthquake originated from Wenchuan
167 thrust fault with a little right lateral slip component and extended mainly in north–east
168 (NE) orientation. The whole process formed two areas with larger dislocations. One is
169 the south area of Miaoxian located in the bottom section in Figure 3b. The other one
170 lies near Beichuan area (the middle segment in Figure 3b) but no strong shocks
171 happened there.

172

173 **3 Data processing method**

174 For the complete Wenchuan earthquake sequence, we denote the number of all
175 earthquakes by N , i.e., $N = 54,554$, and use $q = 1, \dots, N$ to index each earthquake. For
176 each earthquake with magnitude M_q , its corresponding energy release is labeled by E_q
177 and it can be attained in the light of the following relationship (Xu and Zhou, 1982)

$$178 \quad \log_{10}(E_q) = 11.8 + 1.5M_q \quad (3)$$

179 We use t_q to index the time lag of the q -th aftershock from the main shock (in
180 days), i.e., $t_1 = 0$ for the main event. The last aftershock occurred at 18:05:57 CST
181 (China Standard Time) on December 31, 2016, and its t_q value is 3155.

182 In order to study the relationship between the variance and mean of the energy
183 sequence E_q , we first divide it into equally–spaced short temporal blocks with size A

184 (in days). For example, if $A = 10$, then the number of blocks is $N/A = 3155/10 = 315.5$
 185 which is rounded to the nearest integer. Now the complete energy sequence E_q is
 186 partitioned into $n = 316$ blocks of short energy subsequences. We use i to index each
 187 block, i.e., $i = 1, \dots, n$ and h_i to denote the number of data points in each block which
 188 is variable because earthquakes occurred stochastically in the sequence. Now we can
 189 calculate the mean (μ) and variance (σ^2) for each block using

$$190 \quad \mu_i = \frac{\sum_{j=1}^{h_i} E_{i,j}}{h_i} \quad (4)$$

$$191 \quad \sigma_i^2 = \frac{\sum_{j=1}^{h_i} (E_{i,j} - \mu_i)^2}{h_i - 1} \quad (5)$$

192 where $E_{i,j}$ denotes the energy of the j -th earthquake in the i -th block.

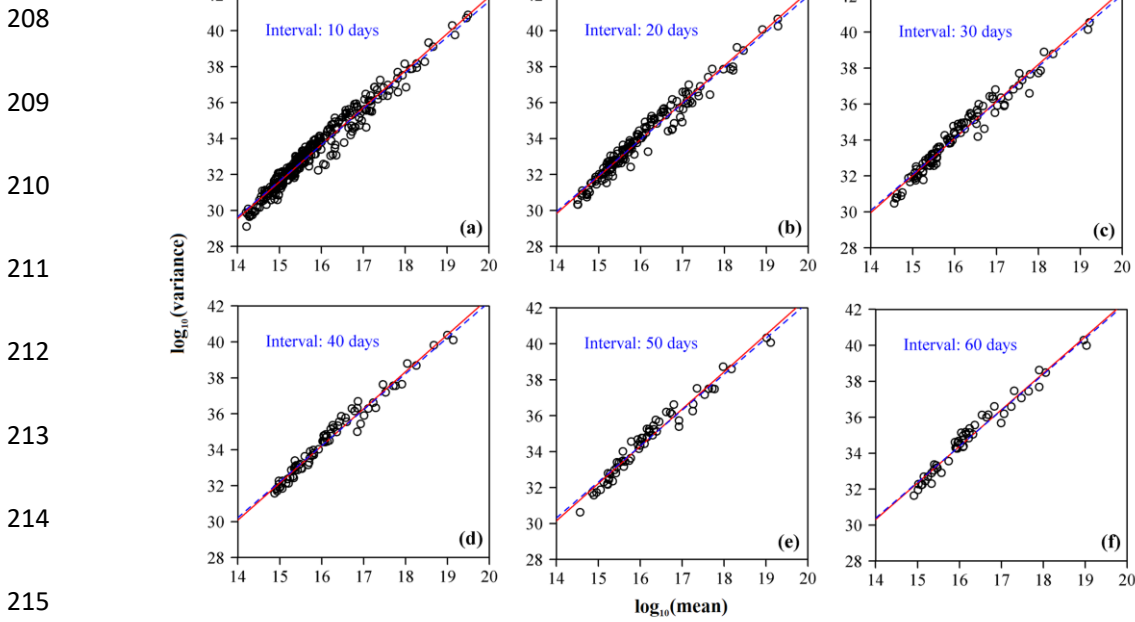
193

194 **4 Results**

195 The data processing procedure has been performed with different block size $A =$
 196 4, 5, 6, ..., 100. The number of sample points in each block decreases as the block
 197 size increases. The relationships between the mean and variance of the released
 198 energies from earthquakes in 6 representative temporal blocks are shown in Figure 4
 199 on a log-log scale. The red line stands for the fitted linear function of TPL's power
 200 law $\log_{10}(\sigma^2) = c + b \log_{10}(\mu)$ using least squares. The 95% confidence intervals (CI)
 201 of the slope and the coefficients of determination R^2 are shown in Table S1. For
 202 instance, Figure 4a shows the variance as a function of the mean for 316 time
 203 intervals when $A = 10$. The estimated intercept is 0.702 and the estimated slope is
 204 2.060 with 95% CI (1.989, 2.076), and $R^2 = 0.963$. The root-mean-square error
 205 (RMSE) was also calculated to exhibit the feasibility of using a TPL with the

206 exponent 2 to approximate that with the exponent to be estimated (unknown).

207



216 **Figure 4.** Calculated variance as a function of the observed mean of the energies from earthquakes in
217 each time interval on a log–log coordinate (open circles), for different values of A . The red straight line
218 corresponds to the fitted Taylor's power law with an unknown exponent, i.e. $\log_{10}(\sigma^2) = c + b \log_{10}(\mu)$,
219 using least squares. The blue dashed line corresponds to the fitted Taylor's power law with the
220 exponent 2, i.e. $\log_{10}(\sigma^2) = d + 2 \log_{10}(\mu)$. There are 97 different values of A in total, and only 6 are
221 shown here. (a) $A = 10$; (b) $A = 20$; (c) $A = 30$; (d) $A = 40$; (e) $A = 50$; and (f) $A = 60$.

222

223 Figure 4 and Table S1 show that there is an apparent linear relationship between
224 the common logarithm of the variance and that of the mean for all earthquakes
225 occurring within different temporal blocks, characterized by a property of aggregation
226 on different timescales. The estimated value of the intercept, c (or $\log_{10}(a)$), which is
227 mainly influenced by the number of samples, overall increases with A from 0.016 to
228 3.249 (Table S1). The estimates of slope b , on the other hand, are roughly 2 for all
229 block sizes used in the study. All R^2 values are greater than 0.96, showing a very

230 strong linear relationship. These results indicate that the energy release of aftershocks
 231 of the Wenchuan sequence complies well with a temporal TPL.

232

233

234

235

236

237

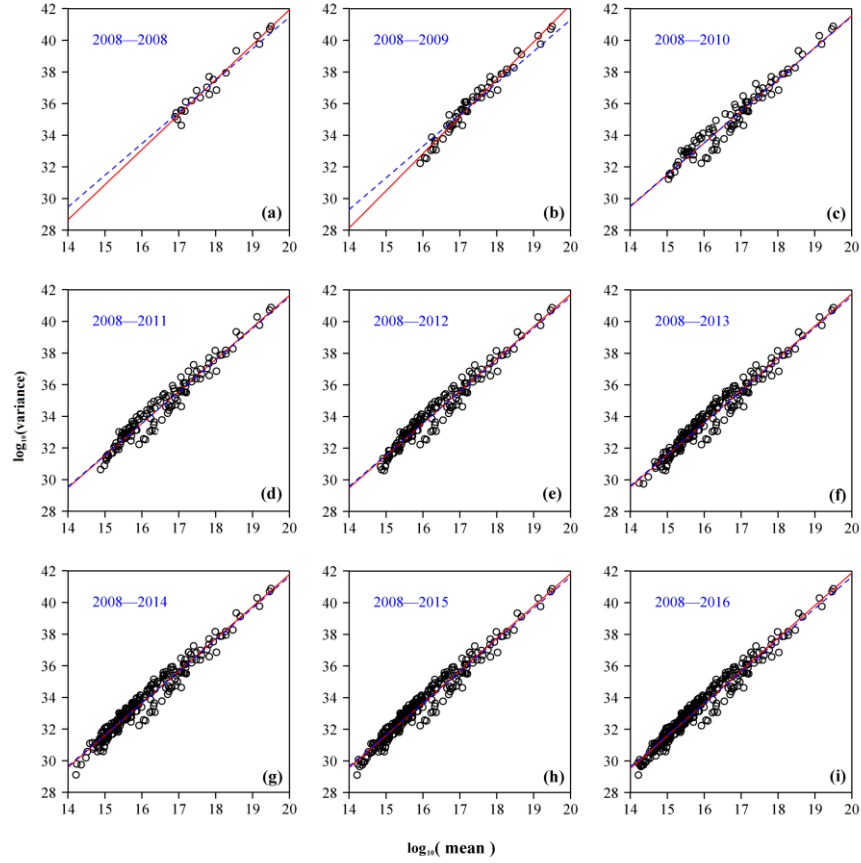
238

239

240

241

242



243

244 **Figure 5.** The calculated variance as a function of the observed mean of the energies from earthquakes
 245 in each block on a log–log scale (open circles) when A is fixed to be 10. The red straight line
 246 corresponds to the fitted Taylor's power law with an unknown exponent, i.e. $\log_{10}(\sigma^2) = c + b \log_{10}(\mu)$,
 247 using least squares. The blue dashed line corresponds to the fitted Taylor's power law with the
 248 exponent 2, i.e. $\log_{10}(\sigma^2) = d + 2 \log_{10}(\mu)$. (a) 2008–2008; (b) 2008–2009; (c) 2008–2010; (d) 2008–
 249 2011; (e) 2008–2012; (f) 2008–2013; (g) 2008–2014; (h) 2008–2015; and (i) 2008–2016.

250

251 Next, we divide the Wenchuan earthquake sequence into 9 time stages in years:
 252 2008–2008, 2008–2009, 2008–2010, 2008–2011, 2008–2012, 2008–2013, 2008–2014,
 253 2008–2015, and 2008–2016. For each stage, we follow a similar procedure leading to

254 Figure 4. That is, we first transform all earthquakes into their energy forms using the
255 relationship between earthquake magnitude M and energy E . Then the energy
256 sequence are partitioned into temporal blocks with a fixed block size $A = 10$ days. The
257 calculated variances and means are plotted on a log-log scale as shown in Figure 5.
258 Again, TPL comes into play for all time stages. The estimates of the parameters in Eq.
259 (2) for the data in different stages were listed in Table S2.

260 Figure 5 shows a strong linear relationship between the variance and mean of
261 the earthquake energy populations on a log-log scale, especially for those large
262 samples. The estimates summarized in Table S2 (red fitted lines in Figure 5) show
263 similar results as in Table S1. The intercept gradually increases as the total number of
264 samples increases but with a little more fluctuation. Meanwhile, the estimate of slope
265 b is still roughly a constant around 2.

266 Here with the exponent $b = 2$ considered, the possible relationship between the
267 estimate of the intercept (namely d) in equation $\log_{10}(\sigma^2) = d + 2 \log_{10}(\mu)$ and the
268 temporal block size A is also examined. The estimated intercepts of the Wenchuan
269 sequence as A increases from 4 days to 100 days in 1-day increments are shown in
270 Figure 6. At the same time, a logarithm function and an exponential function are
271 employed respectively to fit the data (i.e., $d = \alpha + \beta \times \log_{10}(A)$ and $d = m \times A^n$, where
272 α , β , m and n are constants), and the results show that the logarithm function has a
273 higher goodness of fit (namely a lower residual sum of squares). The estimate of
274 parameter α is equal to 0.7398 with 95% CI (0.7246, 0.7581), and the estimate of
275 parameter β is equal to 0.9121 with 95% CI (0.9004, 0.9229). Because $\log_{10}(a) = d =$

276 $\alpha + \beta \times \log_{10}(A)$, we will have:

$$277 \quad \sigma^2 = a\mu^2 = 10^\alpha A^\beta \mu^2 \quad (6)$$

278 It illustrates that the variance of energy releases from aftershocks depends on two
279 factors: (i) the mean squared, and (ii) the size of temporal block defined. Up to now,
280 we confirm that the mean–variance relationship of energy releases from an
281 earthquake sequence can be quantified although the accurate prediction of the time
282 and location of an imminent event is still not attainable.

283

284

285

286

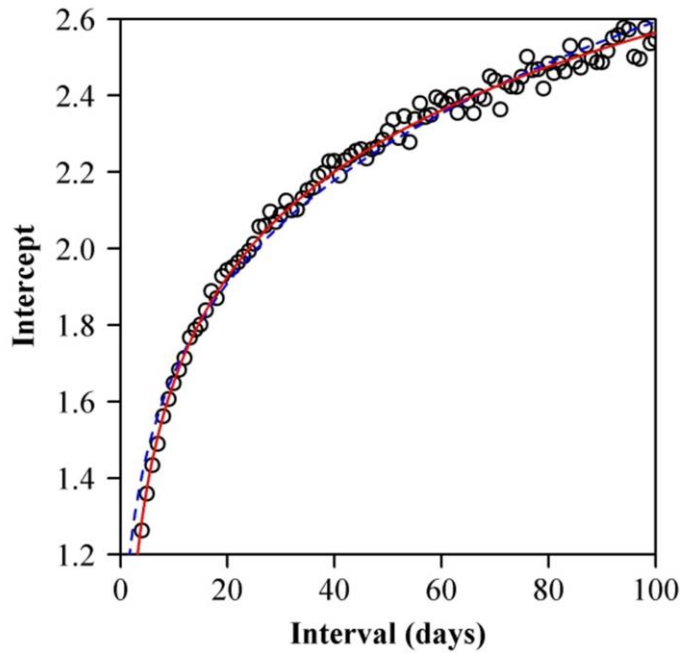
287

288

289

290

291



292

293 **Figure 6.** The effect of time division (time span) on the estimate of the intercept in the TPL with a
294 fixed exponent of 2, i.e. $\log_{10}(\sigma^2) = d + 2 \log_{10}(\mu)$, where d denotes the intercept. Two equations were
295 used to fit the data ($d = \alpha + \beta \times \log_{10}(A)$ and $d = m \times A^n$, where α , β , m and n are constants). The
296 residual sum of squares (= 0.0535) using the logarithm function (represented by the red curve) is lower
297 than that (= 0.1460) using the exponential function (represented by the blue curve).

298

299 **5 Discussion**

300 The evolutionary process of a large earthquake is characterized by some complex
301 features from stochastic to chaotic or pseudo-periodic dynamics (McCaffrey, 2011).
302 On the one hand, there is a long-term slow strain of accumulation and culminating of
303 rocks in the rigid lithosphere prior to the event with a sudden rupture and
304 displacement of blocks. On the other hand, there is another long-term slow strain of
305 redistribution and energy release with a large number of aftershock occurrences in an
306 extensive area, which generally lasts for several months, sometimes even years, after
307 the main shock.

308 It has been statistically established that in populations, if individuals distribute
309 randomly and are independent of each other, then the variance is equal to the mean,
310 i.e., $\sigma^2 = \mu$; individuals show mutual attraction if the variance is proportional to the
311 mean to a power > 1 , i.e., $\sigma^2 > \mu$; individuals mutually repel each other if the
312 variance is proportional to the mean to a power < 1 , i.e., $\sigma^2 < \mu$ (Taylor, 1961; Horne
313 and Schneider, 1995). The results obtained in this study show that the exponent of the
314 TPL is around 2 in the Wenchuan energy sequence either with different time span $A =$
315 4, 5, 6, ..., 100 days or with a fixed time span $A = 10$ days but for 9 time stages
316 between 2008 and 2016. This means earthquakes in the Wenchuan sequence are not
317 distributed at random and independent of each other but with a mutual attraction. It
318 also indicates that there are possible interactions among different magnitudes in the
319 earthquake sequence. Cohen and Xu (2015) proposed analytically that observations
320 randomly sampled in blocks from any skewed frequency distribution with four finite
321 moments give rise to TPL because the variation in the sample mean and sample

322 variance between blocks are theoretically small if every block is randomly sampled
323 from the same distribution.

324 There are various types of interpretations for the value of parameter b . Ford and
325 Andrew (2007) suggested that individuals' reproductive correlation determines the
326 size of b . While Kilpatrick and Ives (2003) proposed that interspecific competition
327 could reduce the value of b . Above all, empirically, b usually lies between 1 and 2
328 (Maurer and Taper, 2002). However, it is expected that TPL holds with $b = 2$ exactly
329 in a population with a constant coefficient of variation (CV) of population density.
330 This expectation derives from the well-known relationship: SD (standard deviation)
331 equals to square root of variance (σ^2), i.e., $SD = \sigma$ and the coefficient of variation
332 $CV = SD/\mu = k$, here k is a constant. Then we can obtain $\sigma^2 = (k\mu)^2$. The relationship
333 between $\log_{10}(\sigma^2)$ and $\log_{10}(k\mu)$ is a straight line with slope 2 on a log-log scale.

334 It is well established that there is a specific property on the population either in
335 space or in time when b equals 2. Ballantyne (2005) proposed that $b = 2$ is a
336 consequence of deterministic population growth. While Cohen (2013) showed that $b =$
337 2 arose from exponentially growing, noninteracting clones. Furthermore, using the
338 Lewontin-Cohen (LC) model of stochastic population dynamics, Cohen et al. (2013)
339 provided an explicit, exact interpretation of its parameters of TPL. They proposed that
340 the exponent of TPL will be equal to 2 if and only if the LC model is deterministic; it
341 will be greater than 2 if the model is supercritical (growing on average) and be less
342 than 2 if the model is subcritical (declining on average). This property indicates that
343 parameter $b = 2$ in our investigation on the Wenchuan earthquake sequence depends

344 exactly on its specific distribution of aftershocks. In other words, the law of
345 occurrence of all events or energy release in space and time is deterministic following
346 the main shock on May 12, 2008.

347 Although various empirical confirmations suggest that no specific biological,
348 physical, technological, or behavioral mechanism can explain all instances of TPL,
349 there has been some improvement in understanding the distribution and duration time
350 of aftershocks after the main event. Jiang et al. (2008) studied the Wenchuan
351 earthquake sequence using Gutenberg–Richter law (Gutenberg and Richter, 1956) and
352 the Omori's law (Omori, 1894). Their investigation attained a specific relationship
353 between the magnitude and the total number of earthquakes for a stable b value,
354 which indicates that the frequency of aftershocks decreases roughly with the
355 reciprocal of time after the main shock. One of the models with physical parameters is
356 the stress triggering mechanism put forward by Dieterich (1994) with Dieterich and
357 Kilgore (1996). Shen et al. (2013) achieved a good fit between the observed
358 Wenchuan aftershocks and the analytic solution of the modified Dieterich model.
359 Their results suggested that the generation of earthquakes is actually related to the
360 state of fault and can quantitatively describe the temporal evolution of the aftershock
361 decay. In this sense, the Wenchuan energy sequence satisfies TPL with slope $b = 2$,
362 indicating a stable spatial–temporal dependent energy release caused by regional
363 stress adjustment and redistribution during the fault revolution after the main shock.
364 These results are of high coherence with what has been attained by Christensen et al.
365 (2002), who proposed a unified scaling law linking together the Gutenberg–Richter

366 Law, the Omori Law of aftershocks, and the fractal dimensions of the faults. Their
367 results show that nonzero driving force in the crust of the Earth leads to an earthquake
368 as a sequence of hierarchical correlated processes and this mechanism responsible
369 for small events also is responsible for large events. In other words, a main shock and
370 an aftershock are consequences of the same process.

371 It is possible that there are some interactions among earthquakes with different
372 magnitudes in an earthquake sequence. This kind of interaction probably derives from
373 medium stress state of the focus zone where earthquakes happen. The stress field in
374 the aftershock area is in a rapidly adjusting state when a larger earthquake occurred. It
375 is probable that a light stress adjustment caused by a small earthquake most likely
376 induces an obvious event in its surroundings in the near future. This process can lead
377 to aggregation of aftershocks in space and time in extensive areas, causing TPL to
378 hold for the Wenchuan earthquake energy sequence. However, whether TPL accords
379 with all earthquake sequences and complies with specific parameters, e.g., $b = 2$,
380 needs further investigation. Up to now, one thing we can confirm is that the missing
381 events can lead to the exponent in TPL increase. For example, the estimated b is
382 approximately 2.1 to 2.2 if the events with magnitude $M > 1.0$ are used. It indicates
383 missing events can change the state of energy release from a stable (deterministic)
384 state to an unstable (supercritical) state as Cohen et al. (2013) have proposed.

385 The current study shows that the exponents of TPL for different temporal blocks
386 for the Wenchuan earthquake sequence are approximately equal to 2 universally. The
387 estimated intercept could be expressed as a linear equation of the log-transformation

388 of temporal block *A* (Figure 6). The goodness of fit of the nonlinear regression is
389 fairly high ($R^2 = 0.9940$ in Figure 6), indicating some interesting underlying
390 mechanism leading to the occurrence of the aftershocks. The distribution of the
391 energy releases from aftershocks should be a right-skewed unimodal curve that can be
392 reflected by magnitude frequency distribution as shown in Figure 1. In fact, Cohen
393 and Xu (2015) have demonstrated that the correlated sampling variation of the mean
394 and variance of skewed distributions could account for TPL under random sampling
395 and the estimated exponent of TPL was proportional to the skewness of the
396 distribution curve. For an exponential distribution, the variance equals its mean
397 squared. However, in our study, although the variance of energy releases from
398 aftershocks is similarly proportional to its mean squared, the coefficient of
399 proportionality (i.e., a in Eq. [1]) does rely on the size of the temporal block. This
400 means that the energy releases from aftershocks might follow a temporal
401 block-dependent generalized exponential distribution, which should be more complex
402 than the generalized exponential distribution (Gupta and Kundu, 2007). However, the
403 distribution function for the energy releases from aftershocks has not been well
404 defined so far. The existing functions for describing a skewed distribution of energy
405 releases or magnitudes usually belong to pure statistical models that lack clear
406 physical dynamic mechanism. Our study suggests that further studies should focus on
407 a temporal block-dependent or a sub-region-dependent distribution. However, to
408 provide a clear mathematical expression for this distribution function is beyond the
409 topic of this paper. It deserves further investigation.

410 **6 Conclusions**

411 In summary, we attempt to use a new way to investigate a spatio-temporal
412 distribution property of aftershocks of the Wenchuan earthquake sequence during
413 2008–2016. In terms of the energy release, the variance of samples in the earthquake
414 population is shown to have a simple power law relationship as a function of the mean
415 on different timescales, which gives rise to a TPL, i.e., $\sigma^2 = a\mu^b$, with $b = 2$. On the
416 one hand, the results show that the intercept of the fitted line in linear form $\log_{10}(\sigma^2)$
417 $= c + b \times \log_{10}(\mu)$ on a log–log scale, increases as the number of samples and it is
418 reconfirmed that parameter c (namely $\log_{10}(a)$) predominantly depends upon the size
419 of the sampling units (Taylor, 1961). On the other hand, if TPL holds, the estimated
420 values of parameters a and b support the conclusion that the Wenchuan aftershocks
421 mutually trigger each other and distribute in space and time not randomly but
422 determinantly and definitely. We fix the exponent of TPL to be 2, and check the
423 effects of different time divisions on the estimate of the intercept. The result shows
424 that the intercept acts as a logarithm function of the timescale. It implies that the
425 mean–variance relationship of energy releases from the earthquakes can be predicted
426 even though we cannot accurately predict the time and location of imminent events.

427

428 **Acknowledgments** The work has been funded from NSFC (National Natural Science
429 Foundation of China) under grant NO. 41774084 and National Key R&D Program of
430 China under grant NO. 2018YFC1503506. P.S. was supported by the Priority
431 Academic Program Development of Jiangsu Higher Education Institutions.

432 **References**

- 433 Ballantyne IV, F.: The upper limit for the exponent of Taylor's power law is a consequence of
434 deterministic population growth, *Evol. Ecol. Res.*, 7(8), 1213–1220, 2005.
- 435 Ballantyne IV, F., and Kerkhoff, A. J.: The observed range for temporal mean–variance scaling
436 exponents can be explained by reproductive correlation, *Oikos*, 116(1), 174–180,
437 <https://doi.org/10.1111/j.2006.0030-1299.15383.x>, 2007.
- 438 Burchfiel, B. C., Royden, L. H., van der Hilst, R. D., Hager, B. H., Chen, Z., King, R. W., Li, C., Lu, J.,
439 Yao, H., and Kirby, E.: A geological and geophysical context for the Wenchuan earthquake of 12
440 May 2008, Sichuan, People's Republic of China, *GSA Today*, 18(7), 4–11,
441 <https://doi.org/10.1130/GSATG18A.1>, 2008.
- 442 Chen, Y., Xu, L., Zhang, Y., Du, H., Feng, W., Liu, C., and Li, C.: Report on source characteristics of
443 the larger Wenchuan earthquake source on May 12, 2008, 2008,
444 <http://www.csi.ac.cn/Sichuan/chenyuntai.pdf> (In Chinese with English abstract).
- 445 Christensen, K., Danon, L., Scanlon, T., and Bak, P.: Unified scaling law for earthquakes, *Proc. Natl.*
446 *Acad. Sci. USA*, 99(suppl. 1), 2509–2513, <https://doi.org/10.1073/pnas.012581099>, 2002.
- 447 Cohen, J. E.: Taylor's power law of fluctuation scaling and the growth–rate theorem, *Theor. Popul.*
448 *Biol.*, 88, 94–100, <https://doi.org/10.1016/j.tpb.2013.04.002>, 2013.
- 449 Cohen, J. E., and Xu, M.: Random sampling of skewed distributions implies Taylor's power law of
450 fluctuation scaling, *Proc. Natl. Acad. Sci. USA*, 112(25), 7749–7754,
451 <https://doi.org/10.1073/pnas.1503824112>, 2015.
- 452 Cohen, J. E., Xu, M., and Schuster, W. S. F.: Stochastic multiplicative population growth predicts and
453 interprets Taylor's power law of fluctuation scaling, *Proc. R. Soc. B. Biol. Sci.*, 280(1757),
454 20122955, <https://doi.org/10.1098/rspb.2012.2955>, 2013.
- 455 Console, R., Jackson, D. D., and Kagan, Y. Y.: Using the ETAS model for catalog declustering and
456 seismic background assessment, *Pure Appl. Geophys.*, 167(6–7), 819–830,
457 <https://doi.org/10.1007/s00024-010-0065-5>, 2010.
- 458 Dieterich, J. H.: A constitutive law for rate of earthquake production and its application to earthquake
459 clustering, *J. Geophys. Res.*, 99(B2), 2601–2618, <https://doi.org/10.1029/93JB02581>, 1994.
- 460 Dieterich, J. H., and Kilgore, B.: Implications of fault constitutive properties for earthquake prediction,
461 *Proc. Natl. Acad. Sci. USA*, 93(9), 3787–3794, 1996.
- 462 Eisler, Z., Bartos, I., and Kertész, J.: Fluctuation scaling in complex systems: Taylor's law and beyond,
463 *Adv. Phys.*, 57(1), 89–142, <https://doi.org/10.1080/00018730801893043>, 2008.
- 464 Gupta, R.D., and Kundu, D.: Generalized exponential distribution: Existing results and some recent
465 developments, *J. Stat. Plan. Infer.*, 137, 3537–3547, <https://doi.org/10.1016/j.jspi.2007.03.030>,
466 2007.
- 467 Gutenberg, B., and Richter, C. F.: Magnitude and energy of earthquakes, *Annali di Geofisica*, 9, 1–15,
468 1956.

469 Harris, R. A.: Introduction to special section: stress triggers, stress shadows, and implications for
470 seismic hazard, *J. Geophys. Res.*, 103, 24347–24358, <https://doi.org/10.1029/98JB01576>, 1998.

471 Horne, J. K., and Schneider, D. C.: Spatial variance in ecology, *Oikos*, 74, 18–26, 1995.

472 Jiang, H. K., Li, M. X., Wu, Q., and Song, J.: Features of the May 12 *M* 8.0 Wenchuan earthquake
473 sequence and discussion on relevant problems, *Seismol. Geol.*, 30(3), 746–758, 2008 (In Chinese
474 with English abstract).

475 Kendal, W. S.: A frequency distribution for the number of hematogenous organ metastases, *J. Theor.*
476 *Biol.*, 217(2), 203–218, <https://doi.org/10.1006/jtbi.2002.3021>, 2002.

477 Kilpatrick, A. M., and Ives, A. R.: Species interactions can explain Taylor's power law for ecological
478 time series, *Nature*, 422(6927), 65–68, 2003.

479 Kumazawa, T., and Ogata, Y.: Quantitative description of induced seismic activity before and after
480 2011 Tohoku Oki–earthquake by nonstationary ETAS models, *J. Geophys. Res.*, 118(12), 6165–
481 6182, <https://doi.org/10.1002/2013JB010259>, 2013.

482 Lin, S., Shao, L., Hui, C., Sandhu, H. S., Fan, T., Zhang, L., Li, F., Ding, Y., and Shi, P.: The effect of
483 temperature on the developmental rates of seedling emergence and leaf-unfolding in two dwarf
484 bamboo species, *Trees Struct. Funct.*, 32, 751–763, <https://doi.org/10.1007/s00468-018-1669-0>,
485 2018.

486 Maurer, B. A., and Taper, M. L.: Connecting geographical distributions with population processes, *Ecol.*
487 *Let.*, 5(2), 223–231, <https://doi.org/10.1046/j.1461-0248.2002.00308.x>, 2002.

488 McCaffrey, R.: Earthquakes and crustal deformation, in: *Encyclopedia of Solid Earth Geophysics*,
489 edited by Gupta, H.K., Springer, Dordrecht, 218–225, 2011.

490 Ogata, Y.: Statistical models for earthquake occurrences and residual analysis for point processes, *J.*
491 *Am. Stat. Assoc.*, 83(401), 9–27, 1988.

492 Ogata, Y.: Statistical model for standard seismicity and detection of anomalies by residual analysis,
493 *Tectonophysics*, 169(1–3), 159–174, [https://doi.org/10.1016/0040-1951\(89\)90191-1](https://doi.org/10.1016/0040-1951(89)90191-1), 1989.

494 Ogata, Y.: Seismicity analysis through point–process modeling: A review, *Pure Appl. Geophys.*,
495 155(2–4), 471–507, <https://doi.org/10.1007/s000240050275>, 1999.

496 Omori, F.: On the aftershocks of earthquakes. *J. College Sci., Imperial Univer. Tokyo*, 7, 111–200,
497 1894.

498 Robinson, R., and Zhou, S.: Stress interactions within the Tangshan, China, earthquake sequence of
499 1976, *Bull Seism. Soc. Amer.*, 95(6), 2501–2505, <https://doi.org/10.1785/0120050091>, 2005.

500 Shen, W. H., L, B. Y., and S, B. P.: Triggering mechanism of aftershocks triggered by Wenchuan *M_w*
501 7.9 earthquake, *Acta Seismologica Sinica* (In Chinese with English abstract), 35(4), 461–476,
502 2013.

503 Shi, P. J., Sandhu, H. S., and Reddy, G.V.P.: Dispersal distance determines the exponent of the spatial
504 Taylor's power law, *Ecol. Model.*, 335, 48–53, <https://doi.org/10.1016/j.ecolmodel.2016.05.008>,
505 2016.

- 506 Shi, P. J., Ratkowsky, D. A., Wang, N. T., Li, Y., Reddy, G. V. P., Zhao, L., and Li, B. L.: Comparison
507 of five methods for parameter estimation under Taylor's power law, *Ecol. Compl.*, 32, 121–130,
508 <https://doi.org/10.1016/j.ecocom.2017.10.006>, 2017.
- 509 Stein, R. S.: The role of stress transfer in earthquake occurrence, *Nature*, 402, 605–609, 1999.
- 510 Taylor, L.R.: Aggregation, variance and the mean, *Nature*, 189, 732–735, 1961.
- 511 Taylor, L. R.: Assessing and interpreting the spatial distributions of insect populations, *Annu. Rew.*
512 *Entomol.*, 29(1), 321–357, <https://doi.org/10.1146/annurev.en.29.010184.001541>, 1984.
- 513 Utsu, T.: Aftershocks and earthquake statistics (1): some parameters which characterize an aftershock
514 sequence and their interrelations, *Journal of the Faculty of Science Hokkaido University*, 3(3),
515 129–195, 1969.
- 516 Utsu, T., Ogata, Y., Matsu'ura, R. S.: The centenary of the Omori formula for a decay law of aftershock
517 activity, *J. Phys. Earth*, 43, 1–33, <https://doi.org/10.4294/jpe1952.43.1>, 1995.
- 518 Vere–Jones, D., Ben–Zion, Y., and Zúñiga, R.: Statistical seismology, *Pure Appl. Geophys.*, 162,
519 1023–1026, <https://doi.org/10.1007/s00024-004-2659-2>, 2005.
- 520 Xu, G. M., and Zhou, H. L.: *Principle of Earthquake*, Science Publication House, p325–352, 1982.